

# Package ‘intRegGOF’

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**Title** Integrated Regression Goodness of Fit

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**Description** Performs Goodness of Fit for regression models using Integrated Regression method. Works for several different fitting techniques.

**Depends** R (>= 2.5.0), graphics, stats

**License** GPL (>= 2)

**NeedsCompilation** yes

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anovarIntReg                      *Integrated Regression Goodness of Fit*

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## Description

Integrated Regression Goodness of Fit to test the adequacy of different model to represent the regression function for a given data.

**Usage**

```

anovarIntReg(objH0, ..., covars = NULL, B = 499,
             LINMOD = FALSE, INCREMENTAL = FALSE)
## S3 method for class 'anovarIntReg'
print(x,...)

```

**Arguments**

objH0	An object of class <code>lm</code> , <code>glm</code> or <code>nls</code> which will be considered as hull hypotheses model or the base reference mode when INCREMENTAL is set to TRUE.
...	One or more objects of class <code>lm</code> , <code>glm</code> or <code>nls</code>
covars	Names of continuous (numerical) variates used to compute Integrated Regression. They should be variables contained in the data frame used to compute the regression fit. When NULL it is obtained as the max. number of different covariates in all tested models. It also can be a <code>formula</code> like <code>~x1+x2+...</code>
B	Bootstrap resampling size.
LINMOD	When TRUE and if obj is an object of class <code>print.intRegGOF</code> <code>print.intRegGOF</code> <code>lm</code> Linear Model matrix fitting equations are used.
INCREMENTAL	When is FALSE all models in ... are tested against objH0, while when TRUE each of the models are checked against the next one startin in objH0.
x	An object of class <code>anovarIntReg</code> .

**Details**

This function implements the test

$$H_0 : m \in M_0 \text{ vs } H_1 : m \in M_1$$

for two different models  $M_0$ ,  $M_1$  using the Integrated Regression Goodness of Fit as os done in `intRegGOF`, but instead of the accumulation of the residual of a givem model, in this case, the accumulation of the difference in the fits is considered:

$$R_n^w(x) = n^{-1/2} \sum_{i=1}^n (\hat{y}_{0i} - \hat{y}_{1i}) I(x_i \leq x).$$

The test statistics considered are `$K_n` and `$W^2_n`.

If objH0 and objH1 are `lm`, `glm` or `nls` fits for the models in classes  $M_0$  and  $M_1$  respectively, then `anovarIntReg(objH0,objH1)` computes test  $H_0 : m \in M_0 \text{ vs } H_1 : m \notin M_1$ . When `anovarIntReg(objH0,objH1, ..., objHk)` is executed (notice that by default INCREMENTAL=FALSE) we obtain a table with the statistics  $K_n$  and  $W_n^2$  and its associated  $p$ -values for each of the tests  $H_0 : m \in M_0 \text{ vs } H_i : m \notin M_i$  being  $i = 1, \dots, k$ . On the other hand, if the parameter INCREMENTAL is set to TRUE, the command returns the results for the tests  $H_i : m \in M_i \text{ vs } H_{i+1} : m \notin M_{i+1}$  being  $i = 1, \dots, k - 1$ .

**Value**

This function returns an object of class `anovarIntReg`, a matrix like structure whose rows refers to models and columns to statistics and its  $p$ -values. It also has an attribute heading to support printing the object.

**Note**

This method requires more testing, and careful study of the effect of factors (discrete random variables) when fitting the model.

**Author(s)**

Jorge Luis Ojeda Cabrera (<jojeda@unizar.es>).

**See Also**

[lm](#), [glm](#), [nls](#), and [intRegGOF](#).

**Examples**

```
n <- 50
d <- data.frame( X1=runif(n),X2=runif(n))
d$Y <- 1 - 2*d$X1 - 5*d$X2 + rnorm(n,sd=.125)
a0 <- lm(Y~1,d)
a1 <- lm(Y~X1,d)
a2 <- lm(Y~X1+X2,d)
anovarIntReg(a0,a1,a2,B=50)
anovarIntReg(a0,a1,a2,B=50,INCREMENTAL=TRUE)
```

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Core Functions

*Utility functions for Integrated Regression Goodness of Fit*

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**Description**

Core functions for the computation of the Integrated Regression Goodness of Fit

**Usage**

```
compIntRegProc(y, xord, weig = rep(1, length(y)))
compBootSamp(obj, datLT, B = 999, LINMOD = FALSE)
plotIntRegProc(y, x, weig = rep(1, length(y)), ADD = FALSE, ...)
getModelFrame(obj)
getResiduals(obj, type)
```

**Arguments**

<code>y</code>	vector, values to add to compute the Integrated Regression.
<code>xord</code>	list of list with the index of covariate points that are <i>less than</i> covariate data. This tells how to cumulate according to covariates,
<code>weig</code>	vector of weights, specifically used to fit and compute test statistics when data is selection biased.
<code>obj</code>	An object of class <a href="#">lm</a> , <a href="#">glm</a> or <a href="#">nls</a> .
<code>datLT</code>	structure as <code>xord</code> telling how to cumulate according to covariates.

B	Bootstrap resampling size.
LINMOD	When TRUE and if obj is an object of class <code>lm</code> Linear Model matrix fitting equations are used.
x	vector with covarates to plot
ADD	If TRUE the plot is added to existing plot.
type	Type of residual.
...	Further parameters to plot.

### Details

...*TODO*: Each of them computes what in which way

### Note

Surely they can better implemented.

### Author(s)

Jorge Luis Ojeda Cabrera (<jojeda@unizar.es>).

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intRegGOF

*Integrated Regression Goodness of Fit*


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### Description

Integrated Regression Goodness of Fit to test if a given model is suitable to represent the regression function for a given data.

### Usage

```
intRegGOF(obj, covars = NULL, B = 499, LINMOD = FALSE)
## S3 method for class 'intRegGOF'
print(x,...)
```

### Arguments

obj	An object of class <code>lm</code> , <code>glm</code> or <code>nls</code> .
covars	Names of continuous (numerical) variates used to compute Integrated Regression. They should be variables contained in the data frame used to compute the regression fit.
B	Bootstrap resampling size.
LINMOD	When TRUE and if obj is an object of class <code>lm</code> Linear Model matrix fitting equations are used.
x	An object of class <code>intRegGOF</code> .
...	Further parameters for print command.

## Details

The Integrated Regression Goodness of Fit technique is introduced in Stute(1997). The main idea is to study the process that results from the cumulation of the residuals up to a given value of the covariates. Once this process is built, different functionals over it can be considered to measure the discrepancy between the true regression function and its estimation.

The tests that implement this function are

$$H_0 : m \in M \text{ vs } H_1 : m \notin M$$

being  $m$  the regression function, and  $M$  a given class of functions. The statistics considered are

$$K_n = \sup_{x \in R^d} |R_n^w(x)|$$

$$W_n^2 = \int_{R^d} R_n^w(z)^2 dF(z).$$

where  $R_n^w(z)$  is the cumulated residual process:

$$R_n^w(x) = n^{-1/2} \sum_{i=1}^n (y_i - \hat{y}_i) I(x_i \leq x).$$

As the stochastic behaviour of this cumulated residual process is quite complex, the implementation of the technique is based on resampling techniques. In particular the chosen implementation is based on Wild Bootstrap methods.

The method also handles selection biased data by means of compensation, by means of the weights used to fit the regression function when computing the cumulated residual process.

At the moment only 'response' type of residuals are considered, jointly with wild bootstrap resampling technique and the result for discrete responses might not be proper.

## Value

This function returns an object of class `intRegGOF`, a list which contains following objects:

<code>call</code>	The call to the function
<code>regObj</code>	String with the <code>lm</code> , <code>glm</code> or <code>nls</code> object whose fit is checked
<code>regModel</code>	<code>lm</code> , <code>glm</code> or <code>nls</code> object call.
<code>p.value</code>	$p$ -values for $K_n$ and $W_n^2$ statistics.
<code>datStat</code>	value of $K_n$ and $W_n^2$ statistics.
<code>covars</code>	continuous (numerical) variates used to compute Integrated Regression.
<code>intErr</code>	cumulated residual process at the values of <code>covars</code> in data.
<code>xLT</code>	structure with the order of <code>covars</code> summation.
<code>bootSamp</code>	Bootstrap samples for $K_n$ and $W_n^2$ .

## Note

This method requires more testing, and careful study of the effect of factors (discrete random variables) when fitting the model.

**Author(s)**

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**References**

Stute, W. (1997). *Nonparametric model checks for regression*. Ann. Statist., 25(2), pp. 613–641.

Ojeda, J. L., W. González-Manteiga W. and Cristóbal, J. A *A bootstrap based Model Checking for Selection-Biased data* Reports in Statistics and Operations Research, U. de Santiago de Compostela. Report 07-05 [http://eio.usc.es/eipc1/BASE/BASEMASTER/FORMULARIOS-PHP-DPTO/REPORTS/447report07\\_05.pdf](http://eio.usc.es/eipc1/BASE/BASEMASTER/FORMULARIOS-PHP-DPTO/REPORTS/447report07_05.pdf)

Ojeda, J. L., Cristóbal, J. A., and Alcalá, J. T. (2008). *A bootstrap approach to model checking for linear models under length-biased data*. Ann. Inst. Statist. Math., 60(3), pp. 519–543.

**See Also**

[lm](#), [glm](#), [nls](#) and its methods [summary](#), [print](#), [plot](#), etc...

**Examples**

```
n <- 50
d <- data.frame( X1=runif(n),X2=runif(n))
d$Y <- 1 + 2*d$X1 + rnorm(n,sd=.125)
plot( d )
intRegGOF(lm(Y~X1+X2,d),B=99)
intRegGOF(a <- lm(Y~X1-1,d),B=99)
intRegGOF(a,c("X1","X2"),B=99)
intRegGOF(a,~X2+X1,B=99)
```

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plot

*Integrated Regression Goodness of Fit graphical output*

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**Description**

Methods to develop model validation and visualization of Integrated Regression Goodness of Fit technique.

**Usage**

```
plotAsIntRegGOF(obj, covar = 1, ADD = FALSE, ...)
pointsAsIntRegGOF(obj,covar=1,...)
linesAsIntRegGOF(obj,covar=1,...)
```

**Arguments**

obj	An object of class <code>lm</code> , <code>glm</code> or <code>nls</code> .
covar	Variable name, number or vector for which <code>Int. Reg.</code> is computed. If it is a number, it reference a covariate in the model frame, while if it is a name refer to data in data frame using in the fitting process.
ADD	If TRUE the plot is added to existing plot.
...	Further parameters to for <code>plotobj</code> command.

**Details**

Currently, the implementation computes the accumulated residual process against a single covariate (`covar`). When the value of `covar` is set to 0, the response is used as the variable whose residual are accumulated against.

Notice that if `covar` is a vector its length should be equal to the number of residuals.

**Note**

`lm` objects that does not have a data parameter set when the call is executed does not work presently when the `covar` parameter is different than 0.

**Author(s)**

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**See Also**

`lm`, `glm`, `nls` its associated `plot` method and `intRegGOF`.

**Examples**

```
n <- 50
d <- data.frame( X1=runif(n),X2=runif(n))
d$Y <- 1 + 2*d$X1 + rnorm(n,sd=.125)
par(ask=TRUE)
plot( d )
plotAsIntRegGOF(lm(Y~X1+X2,d),covar="X1")
plotAsIntRegGOF(a <- lm(Y~X1-1,d))
plotAsIntRegGOF(a,c("X1"))
plotAsIntRegGOF(a,0)
plotAsIntRegGOF(a,fitted(a))
par(ask=FALSE)
```

**Description**

Functions that are basic or/and useful for the computation of the Integrated Regression Goodness of Fit

**Usage**

```
getLessThan(x, d)
mvCumSum(x, ord)
mvPartOrd(x1, x2)
getContVar(df, vars = NULL)
getModelCovars(obj)
getModelWeights(obj)
rWildBoot(n)
```

**Arguments**

x, d	matrix like structure.
x1, x2	vectors with the same length.
df	a data frame.
ord	list of list structure with the ordering to add data points according to a given covariates.
obj	An object of class <code>lm</code> , <code>glm</code> or <code>nls</code> .
vars	vector with variable names in observations data frame .
n	integer, sample size.

**Details**

*...TODO: Each of them computes what in which way*

**Note**

getLessThan can be certainly better implemented.

**Author(s)**

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