

## NAG Library Function Document

### nag\_chi\_sq\_goodness\_of\_fit\_test (g08cgc)

## 1 Purpose

nag\_chi\_sq\_goodness\_of\_fit\_test (g08cgc) computes the test statistic for the  $\chi^2$  goodness-of-fit test for data with a chosen number of class intervals.

## 2 Specification

```
#include <nag.h>
#include <nagg08.h>
void nag_chi_sq_goodness_of_fit_test (Integer nclass, const Integer ifreq[],
                                     const double cint[], Nag_Distributions dist, const double par[],
                                     Integer npest, const double prob[], double *chisq, double *p,
                                     Integer *ndf, double eval[], double chisqi[], NagError *fail)
```

## 3 Description

The  $\chi^2$  goodness-of-fit test performed by nag\_chi\_sq\_goodness\_of\_fit\_test (g08cgc) is used to test the null hypothesis that a random sample arises from a specified distribution against the alternative hypothesis that the sample does not arise from the specified distribution.

Given a sample of size  $n$ , denoted by  $x_1, x_2, \dots, x_n$ , drawn from a random variable  $X$ , and that the data have been grouped into  $k$  classes,

$$\begin{aligned} x &\leq c_1, \\ c_{i-1} < x \leq c_i, &\quad i = 2, 3, \dots, k-1, \\ x &> c_{k-1}, \end{aligned}$$

then the  $\chi^2$  goodness-of-fit test statistic is defined by:

$$X^2 = \sum_{i=1}^k \frac{(O_i - E_i)^2}{E_i}$$

where  $O_i$  is the observed frequency of the  $i$ th class, and  $E_i$  is the expected frequency of the  $i$ th class.

The expected frequencies are computed as

$$E_i = p_i \times n,$$

where  $p_i$  is the probability that  $X$  lies in the  $i$ th class, that is

$$\begin{aligned} p_1 &= P(X \leq c_1), \\ p_i &= P(c_{i-1} < X \leq c_i), \quad i = 2, 3, \dots, k-1, \\ p_k &= P(X > c_{k-1}). \end{aligned}$$

These probabilities are either taken from a common probability distribution or are supplied by you. The available probability distributions within this function are:

Normal distribution with mean  $\mu$ , variance  $\sigma^2$ ;

uniform distribution on the interval  $[a, b]$ ;

exponential distribution with probability density function  $pdf = \lambda e^{-\lambda x}$ ;

$\chi^2$  distribution with  $f$  degrees of freedom; and

gamma distribution with  $pdf = \frac{x^{\alpha-1} e^{-x/\beta}}{\Gamma(\alpha)\beta^\alpha}$ .

You must supply the frequencies and classes. Given a set of data and classes the frequencies may be calculated using nag\_frequency\_table (g01aec).

nag\_chi\_sq\_goodness\_of\_fit\_test (g08cgc) returns the  $\chi^2$  test statistic,  $X^2$ , together with its degrees of freedom and the upper tail probability from the  $\chi^2$  distribution associated with the test statistic. Note that the use of the  $\chi^2$  distribution as an approximation to the distribution of the test statistic improves as the expected values in each class increase.

## 4 References

Conover W J (1980) *Practical Nonparametric Statistics* Wiley

Kendall M G and Stuart A (1973) *The Advanced Theory of Statistics (Volume 2)* (3rd Edition) Griffin

Siegel S (1956) *Non-parametric Statistics for the Behavioral Sciences* McGraw–Hill

## 5 Arguments

- |    |   |              |
|----|---|--------------|
| 1: | <b>nclass</b> – Integer   | <i>Input</i> |
|    | <i>On entry:</i> the number of classes, $k$ , into which the data is divided.   |              |
|    | <i>Constraint:</i> <b>nclass</b> $\geq 2$ .   |              |
| 2: | <b>ifreq[nclass]</b> – const Integer  | <i>Input</i> |
|    | <i>On entry:</i> <b>ifreq</b> [ $i - 1$ ] must specify the frequency of the $i$ th class, $O_i$ , for $i = 1, 2, \dots, k$ .        |              |
|    | <i>Constraint:</i> <b>ifreq</b> [ $i - 1$ ] $\geq 0$ , for $i = 1, 2, \dots, k$ .   |              |
| 3: | <b>cint[nclass - 1]</b> – const double  | <i>Input</i> |
|    | <i>On entry:</i> <b>cint</b> [ $i - 1$ ] must specify the upper boundary value for the $i$ th class, for $i = 1, 2, \dots, k - 1$ . |              |
|    | <i>Constraints:</i>   |              |
|    | <b>cint</b> [0] $<$ <b>cint</b> [1] $< \dots <$ <b>cint</b> [nclass - 2];   |              |
|    | For the exponential, gamma and $\chi^2$ distributions <b>cint</b> [0] $\geq 0.0$ .  |              |
| 4: | <b>dist</b> – Nag_Distributions   | <i>Input</i> |
|    | <i>On entry:</i> indicates for which distribution the test is to be carried out.  |              |
|    | <b>dist</b> = Nag_Normal  |              |
|    | The Normal distribution is used.  |              |
|    | <b>dist</b> = Nag_Uniform   |              |
|    | The uniform distribution is used.   |              |
|    | <b>dist</b> = Nag_Exponential   |              |
|    | The exponential distribution is used.   |              |
|    | <b>dist</b> = Nag_ChiSquare   |              |
|    | The $\chi^2$ distribution is used.  |              |
|    | <b>dist</b> = Nag_Gamma   |              |
|    | The gamma distribution is used.   |              |
|    | <b>dist</b> = Nag_UserProb  |              |
|    | You must supply the class probabilities in the array <b>prob</b> .  |              |
|    | <i>Constraint:</i> <b>dist</b> = Nag_Normal, Nag_Uniform, Nag_Exponential, Nag_ChiSquare, Nag_Gamma or Nag_UserProb.                |              |

5: **par[2]** – const double*Input*

*On entry:* **par** must contain the arguments of the distribution which is being tested. If you supply the probabilities (i.e., **dist** = Nag\_UserProb) the array **par** is not referenced.

If a Normal distribution is used then **par[0]** and **par[1]** must contain the mean,  $\mu$ , and the variance,  $\sigma^2$ , respectively.

If a uniform distribution is used then **par[0]** and **par[1]** must contain the boundaries  $a$  and  $b$  respectively.

If an exponential distribution is used then **par[0]** must contain the argument  $\lambda$ . **par[1]** is not used.

If a  $\chi^2$  distribution is used then **par[0]** must contain the number of degrees of freedom. **par[1]** is not used.

If a gamma distribution is used **par[0]** and **par[1]** must contain the arguments  $\alpha$  and  $\beta$  respectively.

*Constraints:*

```
if dist = Nag_Normal, par[1] > 0.0;
if dist = Nag_Uniform, par[0] < par[1] and par[0] ≤ cint[0];
otherwise par[1] ≥ cint(nclass - 2);
if dist = Nag_Exponential, par[0] > 0.0;
if dist = Nag_ChiSquare, par[0] > 0.0;
if dist = Nag_Gamma, par[0] and par[1] > 0.0.
```

6: **npest** – Integer*Input*

*On entry:* the number of estimated arguments of the distribution.

*Constraint:*  $0 \leq \text{npest} < \text{nclass} - 1$ .

7: **prob[nclass]** – const double*Input*

*On entry:* if you are supplying the probability distribution (i.e., **dist** = Nag\_UserProb) then **prob[i - 1]** must contain the probability that  $X$  lies in the  $i$ th class.

If **dist** ≠ Nag\_UserProb, **prob** is not referenced.

*Constraint:* if **dist** = Nag\_UserProb, **prob[i - 1]** > 0.0 and  $\sum_{i=1}^k \text{prob}[i - 1] = 1.0$ , for  $i = 1, 2, \dots, k$ .

8: **chisq** – double \**Output*

*On exit:* the test statistic,  $X^2$ , for the  $\chi^2$  goodness-of-fit test.

9: **p** – double \**Output*

*On exit:* the upper tail probability from the  $\chi^2$  distribution associated with the test statistic,  $X^2$ , and the number of degrees of freedom.

10: **ndf** – Integer \**Output*

*On exit:* contains  $(\text{nclass} - 1 - \text{npest})$ , the degrees of freedom associated with the test.

11: **eval[nclass]** – double*Output*

*On exit:* **eval[i - 1]** contains the expected frequency for the  $i$ th class,  $E_i$ , for  $i = 1, 2, \dots, k$ .

12: **chisqi[nclass]** – double*Output*

*On exit:* **chisqi[i - 1]** contains the contribution from the  $i$ th class to the test statistic, that is  $(O_i - E_i)^2/E_i$ , for  $i = 1, 2, \dots, k$ .

13: **fail** – NagError \*

*Input/Output*

The NAG error argument (see Section 3.6 in the Essential Introduction).

## 6 Error Indicators and Warnings

### **NE\_ARRAY\_CONS**

The contents of array **prob** are not valid.

Constraint: Sum of  $\text{prob}[i - 1] = 1$ , for  $i = 1, 2, \dots, \text{nclass}$ , when **dist** = Nag\_UserProb.

### **NE\_ARRAY\_INPUT**

On entry, the values provided in **par** are invalid.

### **NE\_BAD\_PARAM**

On entry, argument **dist** had an illegal value.

### **NE\_G08CG\_CLASS\_VAL**

This is a warning that expected values for certain classes are less than 1.0. This implies that one cannot be confident that the  $\chi^2$  distribution is a good approximation to the distribution of the test statistic.

### **NE\_G08CG\_CONV**

The solution obtained when calculating the probability for a certain class for the gamma or  $\chi^2$  distribution did not converge in 600 iterations. The solution may be an adequate approximation.

### **NE\_G08CG\_FREQ**

An expected frequency is equal to zero when the observed frequency is not.

### **NE\_INT\_2**

On entry, **npest** =  $\langle \text{value} \rangle$ , **nclass** =  $\langle \text{value} \rangle$ .

Constraint:  $0 \leq \text{npest} < \text{nclass} - 1$ .

### **NE\_INT\_ARG\_LT**

On entry, **nclass** =  $\langle \text{value} \rangle$ .

Constraint: **nclass**  $\geq 2$ .

### **NE\_INT\_ARRAY\_CONS**

On entry, **ifreq**[ $\langle \text{value} \rangle$ ] =  $\langle \text{value} \rangle$ .

Constraint: **ifreq**[ $i - 1$ ]  $\geq 0$ , for  $i = 1, 2, \dots, \text{nclass}$ .

### **NE\_INTERNAL\_ERROR**

An internal error has occurred in this function. Check the function call and any array sizes. If the call is correct then please contact NAG for assistance.

### **NE\_NOT\_STRICTLY\_INCREASING**

The sequence **cint** is not strictly increasing **cint**[ $\langle \text{value} \rangle$ ] =  $\langle \text{value} \rangle$ , **cint**[ $\langle \text{value} \rangle - 1$ ] =  $\langle \text{value} \rangle$ .

### **NE\_REAL\_ARRAY\_CONS**

On entry, **prob**[ $\langle \text{value} \rangle$ ] =  $\langle \text{value} \rangle$ .

Constraint: **prob**[ $i - 1$ ]  $> 0$ , for  $i = 1, 2, \dots, \text{nclass}$ , when **dist** = Nag\_UserProb.

**NE\_REAL\_ARRAY\_ELEM\_CONS**

On entry, **cint**[0] =  $\langle \text{value} \rangle$ .

Constraint: **cint**[0]  $\geq 0.0$ , if **dist** = Nag\_Exponential||Nag\_ChiSquare||Nag\_Gamma.

**7 Accuracy**

The computations are believed to be stable.

**8 Parallelism and Performance**

Not applicable.

**9 Further Comments**

The time taken by nag\_chi\_sq\_goodness\_of\_fit\_test (g08cgc) is dependent both on the distribution chosen and on the number of classes,  $k$ .

**10 Example**

The example program applies the  $\chi^2$  goodness-of-fit test to test whether there is evidence to suggest that a sample of 100 observations generated by nag\_rand\_uniform (g05sqc) do not arise from a uniform distribution  $U(0, 1)$ . The class intervals are calculated such that the interval (0,1) is divided into five equal classes. The frequencies for each class are calculated using nag\_frequency\_table (g01aec).

**10.1 Program Text**

```
/* nag_chi_sq_goodness_of_fit_test (g08cgc) Example Program.
*
* Copyright 2014 Numerical Algorithms Group.
*
* Mark 6, 2000.
*
* Mark 8 revised, 2004
*/
#include <stdio.h>
#include <nag.h>
#include <nag_stdlib.h>
#include <nagg01.h>
#include <nagg05.h>
#include <nagg08.h>

int main(void)
{
    /* Integer scalar and array declarations */
    Integer          exit_status = 0, i, n, nclass, ndf, npest, lstate;
    Integer          *ifreq = 0, *state = 0;

    /* NAG structures */
    Nag_ClassBoundary class;
    Nag_Distributions cdist;
    NagError          fail;

    /* Double scalar and array declarations */
    double           chisq, *chisqi = 0, *cint = 0, *eval = 0, p, *par = 0;
    double           *prob = 0, *x = 0, xmax, xmin;

    /* Character array declarations */
    char             nag_enum_arg[40];

    /* Choose the base generator */
    Nag_BaserNG      genid = Nag_Basic;
    Integer          subid = 0;
```

```

/* Set the seed */
Integer          seed[] = { 1762543 };
Integer          lseed = 1;

INIT_FAIL(fail);

printf(
    "nag_chi_sq_goodness_of_fit_test (g08cgc) Example Program Results\n");

/* Get the length of the state array */
lstate = -1;
nag_rand_init_repeatable(genid, subid, seed, lseed, state, &lstate, &fail);
if (fail.code != NE_NOERROR)
{
    printf("Error from nag_rand_init_repeatable (g05kfc).\n%s\n",
           fail.message);
    exit_status = 1;
    goto END;
}

/* Skip heading in data file */
#ifndef _WIN32
    scanf_s("%*[^\n]");
#else
    scanf("%*[^\n]");
#endif
#ifndef _WIN32
    scanf_s("%"NAG_IFMT" %"NAG_IFMT" %39s %*[^\n] ", &n, &nclass,
            nag_enum_arg, _countof(nag_enum_arg));
#else
    scanf("%"NAG_IFMT" %"NAG_IFMT" %39s %*[^\n] ", &n, &nclass,
            nag_enum_arg);
#endif

/* nag_enum_name_to_value (x04nac).
 * Converts NAG enum member name to value
 */
cdist = (Nag_Distributions) nag_enum_name_to_value(nag_enum_arg);

if (!(x = NAG_ALLOC(n, double))
|| !(state = NAG_ALLOC(lstate, Integer))
|| !(cint = NAG_ALLOC(nclass-1, double))
|| !(par = NAG_ALLOC(2, double))
|| !(ifreq = NAG_ALLOC(nclass, Integer)))
{
    printf("Allocation failure\n");
    exit_status = -1;
    goto END;
}

for (i = 1; i <= 2; ++i)
#ifndef _WIN32
    scanf_s("%lf", &par[i - 1]);
#else
    scanf("%lf", &par[i - 1]);
#endif
npest = 0;

/* Initialise the generator to a repeatable sequence */
nag_rand_init_repeatable(genid, subid, seed, lseed, state, &lstate, &fail);
if (fail.code != NE_NOERROR)
{
    printf("Error from nag_rand_init_repeatable (g05kfc).\n%s\n",
           fail.message);
    exit_status = 1;
    goto END;
}

/* Generate random numbers from a uniform distribution */
nag_rand_uniform(n, par[0], par[1], state, x, &fail);

```

```

if (fail.code != NE_NOERROR)
{
    printf("Error from nag_rand_uniform (g05sqc).\n%s\n",
           fail.message);
    return 1;
}

class = Nag_ClassBoundaryComp;
/* Determine suitable intervals */
if (cdist == Nag_Uniform)
{
    class = Nag_ClassBoundaryUser;
    cint[0] = par[0] + (par[1] - par[0]) / nclass;
    for (i = 2; i <= nclass - 1; ++i)
        cint[i - 1] = cint[i - 2] + (par[1] - par[0]) / nclass;
}

/* nag_frequency_table (g01aec).
 * Frequency table from raw data
 */
nag_frequency_table(n, x, nclass, class, cint, ifreq, &xmin, &xmax,
                     &fail);
if (fail.code != NE_NOERROR)
{
    printf("Error from nag_frequency_table (g01aec).\n%s\n",
           fail.message);
    return 1;
}

if (!(chisqi = NAG_ALLOC(nclass, double))
    || !(eval = NAG_ALLOC(nclass, double))
    || !(prob = NAG_ALLOC(nclass, double)))
{
    printf("Allocation failure\n");
    exit_status = -1;
    goto END;
}
/* nag_chi_sq_goodness_of_fit_test (g08cgc).
 * Performs the chi^2 goodness of fit test, for standard
 * continuous distributions
 */
nag_chi_sq_goodness_of_fit_test(nclass, ifreq, cint, cdist, par, npest,
                                 prob, &chisq, &p, &ndf, eval, chisqi, &fail);
if (fail.code != NE_NOERROR)
{
    printf(
        "Error from nag_chi_sq_goodness_of_fit_test (g08cgc).\n%s\n",
        fail.message);
    exit_status = 1;
    goto END;
}
printf("\n");
printf("%s%10.4f\n", "Chi-squared test statistic = ", chisq);
printf("%s%5"NAG_IFMT"\n", "Degrees of freedom.          = ", ndf);
printf("%s%10.4f\n", "Significance level       = ", p);
printf("\n");
printf("%s\n", "The contributions to the test statistic are :-");
for (i = 1; i <= nclass; ++i)
    printf("%10.4f\n", chisqi[i - 1]);
END:
NAG_FREE(x);
NAG_FREE(cint);
NAG_FREE(par);
NAG_FREE(ifreq);
NAG_FREE(chisqi);
NAG_FREE(eval);
NAG_FREE(prob);
NAG_FREE(state);
return exit_status;
}

```

## 10.2 Program Data

```
nag_chi_sq_goodness_of_fit_test (g08cgc) Example Program Data
100 5 Nag_Uniform      :n  nclass cdist
0.0 1.0                :par[0] par[2]
```

## 10.3 Program Results

```
nag_chi_sq_goodness_of_fit_test (g08cgc) Example Program Results
```

```
Chi-squared test statistic    =     4.0000
Degrees of freedom.          =      4
Significance level           =   0.4060
```

```
The contributions to the test statistic are :-
```

```
1.8000
1.2500
0.4500
0.0500
0.4500
```

---