# **NAG Library Routine Document**

### G08AHF

Note: before using this routine, please read the Users' Note for your implementation to check the interpretation of **bold italicised** terms and other implementation-dependent details.

## 1 Purpose

G08AHF performs the Mann-Whitney U test on two independent samples of possibly unequal size.

## 2 Specification

```
SUBROUTINE GO8AHF (N1, X, N2, Y, TAIL, U, UNOR, P, TIES, RANKS, WRK, IFAIL)

INTEGER N1, N2, IFAIL
REAL (KIND=nag_wp) X(N1), Y(N2), U, UNOR, P, RANKS(N1+N2), WRK(N1+N2)
LOGICAL TIES
CHARACTER(1) TAIL
```

## 3 Description

The Mann-Whitney U test investigates the difference between two populations defined by the distribution functions F(x) and G(y) respectively. The data consist of two independent samples of size  $n_1$  and  $n_2$ , denoted by  $x_1, x_2, \ldots, x_{n_1}$  and  $y_1, y_2, \ldots, y_n$ , taken from the two populations.

The hypothesis under test,  $H_0$ , often called the null hypothesis, is that the two distributions are the same, that is F(x) = G(x), and this is to be tested against an alternative hypothesis  $H_1$  which is

 $H_1$ :  $F(x) \neq G(y)$ ; or

 $H_1$ : F(x) < G(y), i.e., the x's tend to be greater than the y's; or

 $H_1$ : F(x) > G(y), i.e., the x's tend to be less than the y's,

using a two tailed, upper tailed or lower tailed probability respectively. You select the alternative hypothesis by choosing the appropriate tail probability to be computed (see the description of argument TAIL in Section 5).

Note that when using this test to test for differences in the distributions one is primarily detecting differences in the location of the two distributions. That is to say, if we reject the null hypothesis  $H_0$  in favour of the alternative hypothesis  $H_1$ : F(x) > G(y) we have evidence to suggest that the location, of the distribution defined by F(x), is less than the location, of the distribution defined by G(y).

The Mann-Whitney U test differs from the Median test (see G08ACF) in that the ranking of the individual scores within the pooled sample is taken into account, rather than simply the position of a score relative to the median of the pooled sample. It is therefore a more powerful test if score differences are meaningful.

The test procedure involves ranking the pooled sample, average ranks being used for ties. Let  $r_{1i}$  be the rank assigned to  $x_i$ ,  $i=1,2,\ldots,n_1$  and  $r_{2j}$  the rank assigned to  $y_j$ ,  $j=1,2,\ldots,n_2$ . Then the test statistic U is defined as follows;

$$U = \sum_{i=1}^{n_1} r_{1i} - \frac{n_1(n_1+1)}{2}$$

U is also the number of times a score in the second sample precedes a score in the first sample (where we only count a half if a score in the second sample actually equals a score in the first sample).

G08AHF returns:

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- (a) The test statistic U.
- (b) The approximate Normal test statistic,

$$z = \frac{U - \operatorname{mean}(U) \pm \frac{1}{2}}{\sqrt{\operatorname{var}(U)}}$$

where

$$\operatorname{mean}(U) = \frac{n_1 n_2}{2}$$

and

$$\operatorname{var}(U) = \frac{n_1 n_2 (n_1 + n_2 + 1)}{12} - \frac{n_1 n_2}{(n_1 + n_2)(n_1 + n_2 - 1)} \times TS$$

where

$$TS = \sum_{j=1}^{\tau} \frac{(t_j)(t_j - 1)(t_j + 1)}{12}$$

 $\tau$  is the number of groups of ties in the sample and  $t_i$  is the number of ties in the jth group.

Note that if no ties are present the variance of U reduces to  $\frac{n_1n_2}{12}(n_1+n_2+1)$ .

- (c) An indicator as to whether ties were present in the pooled sample or not.
- (d) The tail probability, p, corresponding to U (adjusted to allow the complement to be used in an upper one tailed or a two tailed test), depending on the choice of TAIL, i.e., the choice of alternative hypothesis,  $H_1$ . The tail probability returned is an approximation of p is based on an approximate Normal statistic corrected for continuity according to the tail specified. If  $n_1$  and  $n_2$  are not very large an exact probability may be desired. For the calculation of the exact probability see G08AJF (no ties in the pooled sample) or G08AKF (ties in the pooled sample).

The value of p can be used to perform a significance test on the null hypothesis  $H_0$  against the alternative hypothesis  $H_1$ . Let  $\alpha$  be the size of the significance test (that is,  $\alpha$  is the probability of rejecting  $H_0$  when  $H_0$  is true). If  $p < \alpha$  then the null hypothesis is rejected. Typically  $\alpha$  might be 0.05 or 0.01.

### 4 References

Conover W J (1980) Practical Nonparametric Statistics Wiley

Neumann N (1988) Some procedures for calculating the distributions of elementary nonparametric teststatistics *Statistical Software Newsletter* **14(3)** 120–126

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

# 5 Arguments

1: N1 – INTEGER Input

On entry: the size of the first sample,  $n_1$ .

Constraint:  $N1 \ge 1$ .

2: X(N1) – REAL (KIND=nag\_wp) array Input

On entry: the first vector of observations,  $x_1, x_2, \ldots, x_{n_1}$ .

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3: N2 – INTEGER Input

On entry: the size of the second sample,  $n_2$ .

Constraint:  $N2 \ge 1$ .

4:  $Y(N2) - REAL (KIND=nag_wp) array$ 

Input

On entry: the second vector of observations.  $y_1, y_2, \ldots, y_{n_2}$ .

5: TAIL – CHARACTER(1)

Input

On entry: indicates the choice of tail probability, and hence the alternative hypothesis.

TAIL = 'T'

A two tailed probability is calculated and the alternative hypothesis is  $H_1: F(x) \neq G(y)$ .

TAIL = 'U'

An upper tailed probability is calculated and the alternative hypothesis  $H_1: F(x) < G(y)$ , i.e., the x's tend to be greater than the y's.

TAIL = 'L'

A lower tailed probability is calculated and the alternative hypothesis  $H_1: F(x) > G(y)$ , i. e., the x's tend to be less than the y's.

Constraint: TAIL = 'T', 'U' or 'L'.

6: U - REAL (KIND=nag wp)

Output

On exit: the Mann-Whitney rank sum statistic, U.

7: UNOR - REAL (KIND=nag wp)

Output

On exit: the approximate Normal test statistic, z, as described in Section 3.

8: P - REAL (KIND=nag\_wp)

Output

On exit: the tail probability, p, as specified by the argument TAIL.

9: TIES – LOGICAL

Output

On exit: indicates whether the pooled sample contained ties or not. This will be useful in checking which routine to use should one wish to calculate an exact tail probability.

TIES = .FALSE., no ties were present (use G08AJF for an exact probability).

TIES = .TRUE., ties were present (use G08AKF for an exact probability).

10: RANKS(N1 + N2) - REAL (KIND=nag wp) array

Output

On exit: contains the ranks of the pooled sample. The ranks of the first sample are contained in the first N1 elements and those of the second sample are contained in the next N2 elements.

11: WRK(N1 + N2) - REAL (KIND=nag wp) array

Workspace

12: IFAIL – INTEGER

Input/Output

On entry: IFAIL must be set to 0, -1 or 1. If you are unfamiliar with this argument you should refer to Section 3.4 in How to Use the NAG Library and its Documentation for details.

For environments where it might be inappropriate to halt program execution when an error is detected, the value -1 or 1 is recommended. If the output of error messages is undesirable, then the value 1 is recommended. Otherwise, if you are not familiar with this argument, the recommended value is 0. When the value -1 or 1 is used it is essential to test the value of IFAIL on exit.

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On exit: IFAIL = 0 unless the routine detects an error or a warning has been flagged (see Section 6).

## 6 Error Indicators and Warnings

If on entry IFAIL = 0 or -1, explanatory error messages are output on the current error message unit (as defined by X04AAF).

Errors or warnings detected by the routine:

```
\begin{aligned} \text{IFAIL} &= 1 \\ \text{On entry, N1} &< 1, \\ \text{or} & \text{N2} &< 1. \end{aligned}
```

IFAIL = 2

On entry, TAIL  $\neq$  'T', 'U' or 'L'.

IFAIL = 3

The pooled sample values are all the same, that is the variance of U = 0.0.

$$IFAIL = -99$$

An unexpected error has been triggered by this routine. Please contact NAG.

See Section 3.9 in How to Use the NAG Library and its Documentation for further information.

$$IFAIL = -399$$

Your licence key may have expired or may not have been installed correctly.

See Section 3.8 in How to Use the NAG Library and its Documentation for further information.

$$\mathsf{IFAIL} = -999$$

Dynamic memory allocation failed.

See Section 3.7 in How to Use the NAG Library and its Documentation for further information.

## 7 Accuracy

The approximate tail probability, p, returned by G08AHF is a good approximation to the exact probability for cases where  $\max(n_1, n_2) \ge 30$  and  $(n_1 + n_2) \ge 40$ . The relative error of the approximation should be less than 10%, for most cases falling in this range.

#### 8 Parallelism and Performance

G08AHF is not threaded in any implementation.

### **9** Further Comments

The time taken by G08AHF increases with  $n_1$  and  $n_2$ .

## 10 Example

This example performs the Mann-Whitney test on two independent samples of sizes 16 and 23 respectively. This is used to test the null hypothesis that the distributions of the two populations from which the samples were taken are the same against the alternative hypothesis that the distributions are different. The test statistic, the approximate Normal statistic and the approximate two tail probability

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are printed. An exact tail probability is also calculated and printed depending on whether ties were found in the pooled sample or not.

#### 10.1 Program Text

```
Program g08ahfe
     GO8AHF Example Program Text
1
     Mark 26 Release. NAG Copyright 2016.
      .. Use Statements ..
     Use nag_library, Only: g08ahf, g08ajf, g08akf, nag_wp
      .. Implicit None Statement ..
     Implicit None
1
      .. Parameters ..
     Integer, Parameter
                                       :: nin = 5, nout = 6
!
      .. Local Scalars ..
     Real (Kind=nag_wp)
                                       :: p, pexact, u, unor
:: ifail, liwrk, lwrk, lwrk1, lwrk2,
     Integer
                                          lwrk3, mn, n1, n2, nsum
     Logical
                                       :: ties
                                       :: tail
     Character (1)
     .. Local Arrays ..
     Real (Kind=nag_wp), Allocatable :: ranks(:), wrk(:), x(:), y(:)
                                       :: iwrk(:)
     Integer, Allocatable
!
      .. Intrinsic Procedures ..
     Intrinsic
                                       :: int, max, min
!
      .. Executable Statements ..
     Write (nout,*) 'GO8AHF Example Program Results'
     Write (nout,*)
     Skip heading in data file
     Read (nin,*)
     Read in problem size
1
     Read (nin,*) n1, n2, tail
     Calculate sizes of various workspaces
     nsum = n1 + n2
     mn = min(n1,n2)
!
     Workspace for GO8AHF
     lwrk1 = nsum
     Workspace for GO8AJF
     lwrk2 = int(n1*n2/2) + 1
     Workspace for GO8AKF
     lwrk3 = mn + mn*(mn+1)*nsum - mn*(mn+1)*(2*mn+1)/3 + 1
      liwrk = 2*nsum + 2
      lwrk = max(lwrk1,lwrk2,lwrk3)
     Allocate (x(n1),y(n2),ranks(nsum),wrk(lwrk),iwrk(liwrk))
!
     Read in data
     Read (nin,*) x(1:n1)
     Read (nin,*) y(1:n2)
     Display title
     Write (nout,*) 'Mann-Whitney U test'
     Write (nout,*)
     Display input data
     Write (nout, 99999) 'Sample size of group 1 = ', n1
     Write (nout, 99999) 'Sample size of group 2 = ', n2
     Write (nout,*)
     Write (nout,*) 'Data values'
     Write (nout,*)
     Write (nout,99998) ' Group 1 ', x(1:n1)
```

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```
Write (nout,*)
      Write (nout, 99998) ' Group 2 ', y(1:n2)
      Perform test
      ifail = 0
      Call g08ahf(n1,x,n2,y,tail,u,unor,p,ties,ranks,wrk,ifail)
      Calculate exact probabilities If (.Not. ties) Then
        ifail = 0
        Call g08ajf(n1,n2,tail,u,pexact,wrk,lwrk,ifail)
      Else
        ifail = 0
        Call g08akf(n1,n2,tail,ranks,u,pexact,wrk,lwrk,iwrk,ifail)
      End If
!
      Display results
      Write (nout,*)
      Write (nout,99997) 'Test statistic = ', u
Write (nout,99997) 'Normal Statistic = ', unor
      Write (nout,99997) 'Approx. tail probability = ', p
      Write (nout,*)
      If (ties) Then
        Write (nout,*) 'There are ties in the pooled sample'
        Write (nout,*) 'There are no ties in the pooled sample'
      End If
      Write (nout,*)
      Write (nout,99997) 'Exact tail probability = ', pexact
99999 Format (1X,A,I5)
99998 Format (1X,A,8F5.1,2(/,14X,8F5.1))
99997 Format (1X,A,F10.4)
    End Program g08ahfe
10.2 Program Data
GO8AHF Example Program Data
 16 23 'L'
                                                     :: N1,N2,TAIL
 13.0 6.0 12.0 7.0 12.0 7.0 10.0 7.0 10.0 7.0 10.0 7.0 10.0 7.0 10.0 8.0 9.0 8.0 17.0 6.0 10.0 8.0 15.0 8.0 15.0 10.0
                                                      :: End of X
 15.0 10.0 14.0 10.0 14.0 11.0 14.0 11.0
 13.0 12.0 13.0 12.0 13.0 12.0 12.0
                                                     :: End if Y
10.3 Program Results
 GO8AHF Example Program Results
 Mann-Whitney U test
 Sample size of group 1 =
                                16
 Sample size of group 2 =
                                23
 Data values
                13.0 6.0 12.0 7.0 12.0 7.0 10.0 7.0 10.0 7.0 16.0 7.0 10.0 8.0 9.0 8.0
     Group 1
                17.0 6.0 10.0 8.0 15.0 8.0 15.0 10.0
     Group 2
                15.0 10.0 14.0 10.0 14.0 11.0 14.0 11.0
                13.0 12.0 13.0 12.0 13.0 12.0 12.0
 Test statistic
                            =
                                  86.0000
 Normal Statistic =
                                 -2.8039
```

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Approx. tail probability = 0.0025

There are ties in the pooled sample

Exact tail probability = 0.0020

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