# **NAG Library Routine Document**

### G02GKF

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

G02GKF calculates the estimates of the parameters of a generalized linear model for given constraints from the singular value decomposition results.

## 2 Specification

```
SUBROUTINE GO2GKF (IP, ICONST, V, LDV, C, LDC, B, S, SE, COV, WK, IFAIL)

INTEGER

IP, ICONST, LDV, LDC, IFAIL

REAL (KIND=nag_wp) V(LDV,IP+7), C(LDC,ICONST), B(IP), S, SE(IP),

COV(IP*(IP+1)/2),

WK(2*IP*IP+IP*ICONST+2*ICONST+4*ICONST)
```

## 3 Description

G02GKF computes the estimates given a set of linear constraints for a generalized linear model which is not of full rank. It is intended for use after a call to G02GAF, G02GBF, G02GCF or G02GDF.

In the case of a model not of full rank the routines use a singular value decomposition to find the parameter estimates,  $\hat{\beta}_{\text{SVd}}$ , and their variance-covariance matrix. Details of the SVD are made available in the form of the matrix  $P^*$ :

$$P^* = \begin{pmatrix} D^{-1}P_1^{\mathsf{T}} \\ P_0^{\mathsf{T}} \end{pmatrix}$$

as described by G02GAF, G02GBF, G02GCF and G02GDF. Alternative solutions can be formed by imposing constraints on the parameters. If there are p parameters and the rank of the model is k then  $n_{\rm c}=p-k$  constraints will have to be imposed to obtain a unique solution.

Let C be a p by  $n_c$  matrix of constraints, such that

$$C^{\mathrm{T}}\beta = 0$$
.

then the new parameter estimates  $\hat{\beta}_{c}$  are given by:

$$\begin{split} \hat{\beta}_{\mathrm{c}} &= A \hat{\beta}_{\mathrm{svd}} \\ &= \left( I - P_0 \left( C^{\mathrm{T}} P_0 \right)^{-1} \right) \hat{\beta}_{\mathrm{svd}}, \qquad \text{where } I \text{ is the identity matrix,} \end{split}$$

and the variance-covariance matrix is given by

$$AP_1D^{-2}P_1^{\mathsf{T}}A^{\mathsf{T}}$$

provided  $(C^{\mathsf{T}}P_0)^{-1}$  exists.

### 4 References

Golub G H and Van Loan C F (1996) *Matrix Computations* (3rd Edition) Johns Hopkins University Press, Baltimore

McCullagh P and Nelder J A (1983) Generalized Linear Models Chapman and Hall

Searle S R (1971) Linear Models Wiley

Mark 24 G02GKF.1

G02GKF NAG Library Manual

### 5 Parameters

1: IP – INTEGER Input

On entry: p, the number of terms in the linear model.

*Constraint*:  $IP \geq 1$ .

2: ICONST – INTEGER

Input

On entry: the number of constraints to be imposed on the parameters,  $n_c$ .

Constraint: 0 < ICONST < IP.

3:  $V(LDV,IP + 7) - REAL (KIND=nag_wp) array$ 

Input

On entry: the array V as returned by G02GAF, G02GBF, G02GCF or G02GDF.

4: LDV – INTEGER

Input

On entry: the first dimension of the array V as declared in the (sub)program from which G02GKF is called.

*Constraint*: LDV  $\geq$  IP.

LDV should be as supplied to G02GAF, G02GBF, G02GCF or G02GDF

5: C(LDC,ICONST) - REAL (KIND=nag\_wp) array

Input

On entry: contains the ICONST constraints stored by column, i.e., the *i*th constraint is stored in the *i*th column of C.

6: LDC – INTEGER

Input

On entry: the first dimension of the array C as declared in the (sub)program from which G02GKF is called.

*Constraint*: LDC  $\geq$  IP.

7: B(IP) - REAL (KIND=nag\_wp) array

Input/Output

On entry: the parameter estimates computed by using the singular value decomposition,  $\hat{\beta}_{svd}$ .

On exit: the parameter estimates of the parameters with the constraints imposed,  $\hat{\beta}_c$ .

8: S - REAL (KIND=nag wp)

Input

On entry: the estimate of the scale parameter.

For results from G02GAF and G02GDF then S is the scale parameter for the model.

For results from G02GBF and G02GCF then S should be set to 1.0.

Constraint: S > 0.0.

9: SE(IP) - REAL (KIND=nag\_wp) array

Output

On exit: the standard error of the parameter estimates in B.

10:  $COV(IP \times (IP + 1)/2) - REAL (KIND=nag_wp)$  array

Output

On exit: the upper triangular part of the variance-covariance matrix of the IP parameter estimates given in B. They are stored packed by column, i.e., the covariance between the parameter estimate given in B(i) and the parameter estimate given in B(j),  $j \geq i$ , is stored in  $COV((j \times (j-1)/2+i))$ .

G02GKF.2 Mark 24

11:  $WK(2 \times IP \times IP + IP \times ICONST + 2 \times ICONST \times ICONST + 4 \times ICONST)$  - REAL (KIND=nag wp) array *Workspace* 

**Note:** a simple upper bound for the size of the workspace is  $5 \times IP \times IP + 4 \times IP$ .

#### 12: IFAIL - INTEGER

Input/Output

On entry: IFAIL must be set to 0, -1 or 1. If you are unfamiliar with this parameter you should refer to Section 3.3 in the Essential Introduction 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 parameter, the recommended value is 0. When the value -1 or 1 is used it is essential to test the value of IFAIL on exit.

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:

```
IFAIL = 1
```

```
\begin{array}{lll} \text{On entry, } & IP < 1. \\ \text{or} & & ICONST \geq IP, \\ \text{or} & & ICONST \leq 0, \\ \text{or} & & LDV < IP, \\ \text{or} & & LDC < IP, \\ \text{or} & & S < 0.0. \end{array}
```

IFAIL = 2

C does not give a model of full rank.

### 7 Accuracy

It should be noted that due to rounding errors a parameter that should be zero when the constraints have been imposed may be returned as a value of order *machine precision*.

#### **8 Further Comments**

G02GKF is intended for use in situations in which dummy (0-1) variables have been used such as in the analysis of designed experiments when you do not wish to change the parameters of the model to give a full rank model. The routine is not intended for situations in which the relationships between the independent variables are only approximate.

# 9 Example

A loglinear model is fitted to a 3 by 5 contingency table by G02GCF. The model consists of terms for rows and columns. The table is

```
141 67 114 79 39
131 66 143 72 35.
36 14 38 28 16
```

The constraints that the sum of row effects and the sum of column effects are zero are then read in and the parameter estimates with these constraints imposed are computed by G02GKF and printed.

Mark 24 G02GKF.3

G02GKF NAG Library Manual

#### 9.1 Program Text

```
Program g02gkfe
      G02GKF Example Program Text
!
1
      Mark 24 Release. NAG Copyright 2012.
      .. Use Statements ..
!
      Use nag_library, Only: g02gcf, g02gkf, nag_wp
!
      .. Implicit None Statement ..
      Implicit None
!
      .. Parameters ..
                                         :: nin = 5, nout = 6
      Integer, Parameter
      .. Local Scalars ..
!
                                         :: a, dev, eps, tol
      Real (Kind=nag_wp)
                                         :: i, iconst, idf, ifail, ip, iprint, irank, ldc, ldv, ldx, lwk, lwt, m,
      Integer
                                             maxit, n
     Character (1)
                                          :: link, mean, offset, weight
!
      .. Local Arrays ..
      Real (Kind=nag_wp), Allocatable :: b(:), c(:,:), cov(:), se(:), v(:,:), &
                                            wk(:), wt(:), x(:,:), y(:)
      Integer, Allocatable
                                          :: isx(:)
!
      .. Intrinsic Procedures ..
      Intrinsic
                                         :: count
      .. Executable Statements ..
      Write (nout,*) 'G02GKF Example Program Results'
      Write (nout,*)
!
      Skip heading in data file
      Read (nin,*)
      Read in the problem size
      Read (nin,*) link, mean, offset, weight, n, m
      If (weight=='W' .Or. weight=='w') Then
        lwt = n
      Else
        lwt = 0
      End If
      ldx = n
      Allocate (x(ldx,m),y(n),wt(lwt),isx(m))
!
      Read in data
      If (lwt>0) Then
       Read (nin,*)(x(i,1:m),y(i),wt(i),i=1,n)
       Read (nin,*)(x(i,1:m),y(i),i=1,n)
      End If
      Read in variable inclusion flags
      Read (nin,*) isx(1:m)
!
      Calculate IP
      ip = count(isx(1:m)>0)
      If (mean=='M' .Or. mean=='m') Then
       ip = ip + 1
      End If
      Read in power for exponential link If (link=='E' .Or. link=='e') Then
       Read (nin,*) a
      End If
      lwk = (ip*ip+3*ip+22)/2
      Allocate (b(ip), se(ip), cov(ip*(ip+1)/2), v(ldv, ip+7), wk(lwk))
      Read in the offset
      If (offset=='Y' .Or. offset=='y') Then
```

G02GKF.4 Mark 24

```
Read (nin,*) v(1:n,7)
      End If
      Read in control parameters
      Read (nin,*) iprint, eps, tol, maxit
     Fit generalized linear model with Poisson errors
      ifail = -1
      Call g02gcf(link,mean,offset,weight,n,x,ldx,m,isx,ip,y,wt,a,dev,idf,b, &
       irank,se,cov,v,ldv,tol,maxit,iprint,eps,wk,ifail)
      If (ifail/=0) Then
       If (ifail<7) Then
         Go To 100
        End If
     End If
     Display initial results
     Write (nout, 99999) 'Deviance = ', dev
      Write (nout, 99998) 'Degrees of freedom = ', idf
     Write (nout,*)
      Calculate the number of constraints required
      iconst = ip - irank
     Going to reallocate workspace, so deallocate it
      Deallocate (wk)
      lwk = 2*ip*ip + ip*iconst + 2*iconst*iconst + 4*iconst
      ldc = ip
     Allocate (c(ldc,iconst),wk(lwk))
     Read in constraints
     Read (nin,*,Iostat=ifail)(c(i,1:iconst),i=1,ip)
      If (ifail/=0) Then
       Write (nout, 99996) &
          ' ** Insufficient constraints supplied, was expecting ', iconst
        Go To 100
     End If
     Re-estimate the model given the constraints
      ifail = 0
      Call g02gkf(ip,iconst,v,ldv,c,ldc,b,1.0E0_nag_wp,se,cov,wk,ifail)
     Display the constrained parameter estimates
     Write (nout,*) '
                                         Standard error'
                            Estimate
      Write (nout,*)
     Write (nout, 99997)(b(i), se(i), i=1, ip)
100
     Continue
99999 Format (1X,A,E12.4)
99998 Format (1X,A,I2)
99997 Format (1X,2F14.4)
99996 Format (1X,A,I5)
   End Program g02gkfe
```

### 9.2 Program Data

```
G02GKF Example Program Data
'L' 'M' 'N' 'U' 15 8 :: LINK, MEAN, OFFSET, WEIGHT, N, M

1.0 0.0 0.0 1.0 0.0 0.0 0.0 141.0

1.0 0.0 0.0 0.0 0.0 1.0 0.0 0.0 141.0

1.0 0.0 0.0 0.0 0.0 0.0 1.0 0.0 144.0

1.0 0.0 0.0 0.0 0.0 0.0 1.0 0.0 79.0

1.0 0.0 0.0 0.0 0.0 0.0 0.0 1.0 39.0

0.0 1.0 0.0 0.0 0.0 0.0 0.0 0.0 131.0

0.0 1.0 0.0 0.0 0.0 1.0 0.0 0.0 66.0

0.0 1.0 0.0 0.0 0.0 0.0 1.0 0.0 143.0

0.0 1.0 0.0 0.0 0.0 0.0 0.0 1.0 35.0
```

Mark 24 G02GKF.5

G02GKF NAG Library Manual

```
0.0 0.0 1.0 1.0 0.0 0.0 0.0 0.0 36.0
0.0 0.0 1.0 0.0 1.0 0.0 0.0 0.0 14.0
0.0 0.0 1.0 0.0 0.0 1.0 0.0 0.0 38.0
0.0 0.0 1.0 0.0 0.0 0.0 1.0 0.0 28.0
0.0 0.0 1.0 0.0 0.0 0.0 0.0 1.0 16.0 :: End of X,Y
1 1 1 1 1 1 1 1 1 1 1 1 :: ISX
0 1.0E-6 5.0E-5 0 :: IPRINT, EPS, TOL, MAXIT
0.0 0.0
1.0 0.0
1.0 0.0
0.0 1.0
0.0 1.0
0.0 1.0
0.0 1.0
0.0 1.0
0.0 1.0
0.0 1.0
0.0 1.0
```

## 9.3 Program Results

```
GO2GKF Example Program Results
```

Deviance = 0.9038E+01 Degrees of freedom = 8

Estimate	Standard error
3.9831 0.3961 0.4118 -0.8079 0.5112 -0.2285 0.4680 -0.0316	0.0396 0.0458 0.0457 0.0622 0.0562 0.0727 0.0569 0.0675
-0.7191	0.0887

G02GKF.6 (last)

Mark 24