# NAG Library Routine Document

## G13DJF

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

G13DJF computes forecasts of a multivariate time series. It is assumed that a vector ARMA model has already been fitted to the appropriately differenced/transformed time series using G13DDF. The standard deviations of the forecast errors are also returned. A reference vector is set up so that, should future series values become available, the forecasts and their standard errors may be updated by calling G13DKF.

## 2 Specification

SUBROUTINE G13DJF	(K, N, Z, KMAX, TR, ID, DELTA, IP, IQ, MEAN, PAR, LPAR, QQ, V, LMAX, PREDZ, SEFZ, REF, LREF, WORK, LWORK, IWORK, LIWORK, IFAIL)	& &
INTEGER	K, N, KMAX, ID(K), IP, IQ, LPAR, LMAX, LREF, LWORK, IWORK(LIWORK), LIWORK, IFAIL	&
REAL (KIND=nag_wp)	Z(KMAX,N), DELTA(KMAX,*), PAR(LPAR), QQ(KMAX,K),	&
	V(KMAX,*), PREDZ(KMAX,LMAX), SEFZ(KMAX,LMAX),	&
	REF(LREF), WORK(LWORK)	
CHARACTER(1)	TR(K), MEAN	

## **3** Description

Let the vector  $Z_t = (z_{1t}, z_{2t}, \dots, z_{kt})^T$ , for  $t = 1, 2, \dots, n$ , denote a k-dimensional time series for which forecasts of  $Z_{n+1}, Z_{n+2}, \dots, Z_{n+l_{max}}$  are required. Let  $W_t = (w_{1t}, w_{2t}, \dots, w_{kt})^T$  be defined as follows:

$$w_{it} = \delta_i(B) z_{it}^*, \quad i = 1, 2, \dots, k,$$

where  $\delta_i(B)$  is the differencing operator applied to the *i*th series and where  $z_{it}^*$  is equal to either  $z_{it}$ ,  $\sqrt{z_{it}}$  or  $\log_e(z_{it})$  depending on whether or not a transformation was required to stabilize the variance before fitting the model.

If the order of differencing required for the *i*th series is  $d_i$ , then the differencing operator for the *i*th series is defined by  $\delta_i(B) = 1 - \delta_{i1}B - \delta_{i2}B^2 - \cdots - \delta_{id_i}B^{d_i}$  where B is the backward shift operator; that is,  $BZ_t = Z_{t-1}$ . The differencing parameters  $\delta_{ij}$ , for i = 1, 2, ..., k and  $j = 1, 2, ..., d_i$ , must be supplied by you. If the *i*th series does not require differencing, then  $d_i = 0$ .

 $W_t$  is assumed to follow a multivariate ARMA model of the form:

$$W_{t} - \mu = \phi_{1}(W_{t-1} - \mu) + \phi_{2}(W_{t-2} - \mu) + \dots + \phi_{p}(W_{t-p} - \mu) + \epsilon_{t} - \theta_{1}\epsilon_{t-1} - \dots - \theta_{q}\epsilon_{t-q}, \quad (1)$$

where  $\epsilon_t = (\epsilon_{1t}, \epsilon_{2t}, \dots, \epsilon_{kt})^T$ , for  $t = 1, 2, \dots, n$ , is a vector of k residual series assumed to be Normally distributed with zero mean and positive definite covariance matrix  $\Sigma$ . The components of  $\epsilon_t$  are assumed to be uncorrelated at non-simultaneous lags. The  $\phi_i$  and  $\theta_j$  are k by k matrices of parameters. The matrices  $\phi_i$ , for  $i = 1, 2, \dots, p$ , are the autoregressive (AR) parameter matrices, and the matrices  $\theta_i$ , for  $i = 1, 2, \dots, p$ , are the autoregressive (AR) parameters in the model are thus the p (k by k)  $\phi$ -matrices, the q (k by k)  $\theta$ -matrices, the mean vector  $\mu$  and the residual error covariance matrix  $\Sigma$ . The ARMA model (1) must be both stationary and invertible; see G13DXF for a method of checking these conditions.

The ARMA model (1) may be rewritten as

$$\phi(B)\big(\delta(B)Z_t^* - \mu\big) = \theta(B)\epsilon_t,$$

where  $\phi(B)$  and  $\theta(B)$  are the autoregressive and moving average polynomials and  $\delta(B)$  denotes the k by k diagonal matrix whose *i*th diagonal elements is  $\delta_i(B)$  and  $Z_t^* = (z_{1t}^*, z_{2t}^* \dots z_{kt}^*)^{\mathrm{T}}$ .

This may be rewritten as

$$\phi(B)\delta(B)Z_t^* = \phi(B)\mu + \theta(B)\epsilon_t$$

or

$$Z_t^* = \tau + \psi(B)\epsilon_t = \tau + \epsilon_t + \psi_1\epsilon_{t-1} + \psi_2\epsilon_{t-2} + \cdots$$

where  $\psi(B) = \delta^{-1}(B)\phi^{-1}(B)\theta(B)$  and  $\tau = \delta^{-1}(B)\mu$  is a vector of length k.

Forecasts are computed using a multivariate version of the procedure described in Box and Jenkins (1976). If  $\hat{Z}_n^*(l)$  denotes the forecast of  $Z_{n+l}^*$ , then  $\hat{Z}_n^*(l)$  is taken to be that linear function of  $Z_n^*, Z_{n-1}^*, \ldots$  which minimizes the elements of  $E\{e_n(l)e_n'(l)\}$  where  $e_n(l) = Z_{n+l}^* - \hat{Z}_n^*(l)$  is the forecast error.  $\hat{Z}_n^*(l)$  is referred to as the linear minimum mean square error forecast of  $Z_{n+l}^*$ .

The linear predictor which minimizes the mean square error may be expressed as

$$\hat{Z}_n^*(l) = \tau + \psi_l \epsilon_n + \psi_{l+1} \epsilon_{n-1} + \psi_{l+2} \epsilon_{n-2} + \cdots$$

The forecast error at t for lead l is then

$$e_n(l) = Z_{n+l}^* - \hat{Z}_n^*(l) = \epsilon_{n+l} + \psi_1 \epsilon_{n+l-1} + \psi_2 \epsilon_{n+l-2} + \dots + \psi_{l-1} \epsilon_{n+1}$$

Let  $d = \max(d_i)$ , for i = 1, 2, ..., k. Unless q = 0 the routine requires estimates of  $\epsilon_i$ , for  $t = d + 1, \ldots, n$ , which are obtainable from G13DDF. The terms  $\epsilon_t$  are assumed to be zero, for  $t = n + 1, \ldots, n + l_{\text{max}}$ . You may use G13DKF to update these  $l_{\text{max}}$  forecasts should further observations,  $Z_{n+1}, Z_{n+2}, \ldots$ , become available. Note that when  $l_{max}$  or more further observations are available then G13DJF must be used to produce new forecasts for  $Z_{n+l_{max}+1}, Z_{n+l_{max}+2}, \ldots$ , should they be required.

When a transformation has been used the forecasts and their standard errors are suitably modified to give results in terms of the original series,  $Z_t$ ; see Granger and Newbold (1976).

#### 4 References

Box G E P and Jenkins G M (1976) Time Series Analysis: Forecasting and Control (Revised Edition) Holden-Day

Granger C W J and Newbold P (1976) Forecasting transformed series J. Roy. Statist. Soc. Ser. B 38 189-203

Wei W W S (1990) Time Series Analysis: Univariate and Multivariate Methods Addison-Wesley

#### 5 **Parameters**

The quantities K, N, KMAX, IP, IQ, PAR, NPAR, QQ and V from G13DDF are suitable for input to G13DJF.

1: K - INTEGER

On entry: k, the dimension of the multivariate time series.

Constraint:  $K \ge 1$ .

#### N – INTEGER 2:

On entry: n, the number of observations in the series,  $Z_t$ , prior to differencing. *Constraint*:  $N \ge 3$ .

The total number of observations must exceed the total number of parameters in the model; that is

Input

$$\begin{split} \text{if MEAN} &= \text{'Z', N} \times K > (\text{IP} + \text{IQ}) \times K \times K + K \times (K+1)/2; \\ \text{if MEAN} &= \text{'M', N} \times K > (\text{IP} + \text{IQ}) \times K \times K + K + K \times (K+1)/2, \end{split}$$

(see the parameters IP, IQ and MEAN).

3: Z(KMAX, N) - REAL (KIND=nag\_wp) array

On entry: Z(i, t) must contain,  $z_{it}$ , the *i*th component of  $Z_t$ , for i = 1, 2, ..., k and t = 1, 2, ..., n. Constraints:

if TR(i) = 'L', Z(i, t) > 0.0; if TR(i) = 'S',  $Z(i, t) \ge 0.0$ , for i = 1, 2, ..., k and t = 1, 2, ..., n.

4: KMAX – INTEGER

*On entry*: the first dimension of the arrays Z, DELTA, QQ, V, PREDZ and SEFZ as declared in the (sub)program from which G13DJF is called.

Constraint:  $KMAX \ge K$ .

5: TR(K) – CHARACTER(1) array

On entry: TR(i) indicates whether the *i*th time series is to be transformed, for i = 1, 2, ..., k. TR(i) = 'N'

No transformation is used.

TR(i) = 'L'

A log transformation is used.

TR(i) = 'S'

A square root transformation is used.

Constraint: TR(i) = 'N', 'L' or 'S', for i = 1, 2, ..., k.

### 6: ID(K) - INTEGER array

On entry: ID(i) must specify,  $d_i$ , the order of differencing required for the *i*th series.

Constraint:  $0 \leq ID(i) < N - max(IP, IQ)$ , for i = 1, 2, ..., k.

7: DELTA(KMAX, \*) – REAL (KIND=nag wp) array

Note: the second dimension of the array DELTA must be at least  $\max(1, d)$ , where  $d = \max(\text{ID}(i))$ .

On entry: if ID(i) > 0, then DELTA(i, j) must be set equal to  $\delta_{ij}$ , for  $j = 1, 2, ..., d_i$  and i = 1, 2, ..., k.

If d = 0, DELTA is not referenced.

8: IP – INTEGER

On entry: p, the number of AR parameter matrices. Constraint: IP  $\geq 0$ .

## 9: IQ - INTEGER

*On entry*: q, the number of MA parameter matrices. *Constraint*: IQ  $\geq 0$ . Input

Input

Input

Input

Input

Input

Input

Input

#### 10: MEAN - CHARACTER(1)

On entry: MEAN = 'M', if components of  $\mu$  have been estimated and MEAN = 'Z', if all elements of  $\mu$  are to be taken as zero.

Constraint: MEAN = 'M' or 'Z'.

#### 11: PAR(LPAR) – REAL (KIND=nag\_wp) array

On entry: must contain the parameter estimates read in row by row in the order  $\phi_1, \phi_2, \ldots, \phi_p$ ,  $\theta_1, \theta_2, \ldots, \theta_q, \mu$ .

Thus,

if IP > 0, PAR( $(l-1) \times k \times k + (i-1) \times k + j$ ) must be set equal to an estimate of the (i, j)th element of  $\phi_l$ , for l = 1, 2, ..., p, i = 1, 2, ..., k and j = 1, 2, ..., k;

if IQ > 0, PAR $(p \times k \times k + (l-1) \times k \times k + (i-1) \times k + j)$  must be set equal to an estimate of the (i, j)th element of  $\theta_l$ , for l = 1, 2, ..., q, i = 1, 2, ..., k and j = 1, 2, ..., k; if MEAN = 'M', PAR $((p+q) \times k \times k + i)$  must be set equal to an estimate of the *i*th

component of  $\mu$ , for  $i = 1, 2, \ldots, k$ .

*Constraint*: the first IP  $\times$  K  $\times$  K elements of PAR must satisfy the stationarity condition and the next IQ  $\times$  K  $\times$  K elements of PAR must satisfy the invertibility condition.

#### 12: LPAR – INTEGER

On entry: the dimension of the array PAR as declared in the (sub)program from which G13DJF is called.

Constraints:

if MEAN = 'Z', LPAR  $\geq \max(1, (IP + IQ) \times K \times K)$ ; if MEAN = 'M', LPAR  $\geq (IP + IQ) \times K \times K + K$ .

#### 13: QQ(KMAX,K) – REAL (KIND=nag\_wp) array

On entry: QQ(i, j) must contain an estimate of the (i, j)th element of  $\Sigma$ . The lower triangle only is needed.

Constraint: QQ must be positive definite.

On exit: if IFAIL  $\neq 1$ , then the upper triangle is set equal to the lower triangle.

14: V(KMAX, \*) – REAL (KIND=nag\_wp) array

Note: the second dimension of the array V must be at least  $\max(1, N - d)$ , where  $d = \max(\text{ID}(i))$ . On entry: V(i, t) must contain an estimate of the *i*th component of  $\epsilon_{t+d}$ , for i = 1, 2, ..., k and t = 1, 2, ..., n - d.

If q = 0, V is not used.

```
15: LMAX – INTEGER
```

On entry: the number,  $l_{\text{max}}$ , of forecasts required. Constraint: LMAX  $\geq 1$ .

## 16: PREDZ(KMAX, LMAX) – REAL (KIND=nag\_wp) array Output On exit: PREDZ(i, l) contains the forecast of $z_{i,n+l}$ , for i = 1, 2, ..., k and $l = 1, 2, ..., l_{max}$ .

### 17: SEFZ(KMAX,LMAX) – REAL (KIND=nag\_wp) array

On exit: SEFZ(i, l) contains an estimate of the standard error of the forecast of  $z_{i,n+l}$ , for i = 1, 2, ..., k and  $l = 1, 2, ..., l_{max}$ .

Output

Input/Output

Input

Input

18: REF(LREF) – REAL (KIND=nag\_wp) array

On exit: the reference vector which may be used to update forecasts using G13DKF. The first  $(LMAX - 1) \times K \times K$  elements contain the  $\psi$  weight matrices,  $\psi_1, \psi_2, \ldots, \psi_{l_{max}-1}$ . The next  $K \times LMAX$  elements contain the forecasts of the transformed series  $\hat{Z}_{n+1}^*, \hat{Z}_{n+2}^*, \ldots, \hat{Z}_{n+l_{max}}^*$  and the next  $K \times LMAX$  contain the variances of the forecasts of the transformed variables. The last K elements are used to store the transformations for the series.

#### 19: LREF – INTEGER

On entry: the dimension of the array REF as declared in the (sub)program from which G13DJF is called.

*Constraint*: LREF  $\geq$  (LMAX – 1) × K × K + 2 × K × LMAX + K.

21: LWORK – INTEGER

On entry: the dimension of the array WORK as declared in the (sub)program from which G13DJF is called.

C on straint: if  $r = \max(\text{IP}, \text{IQ})$  and  $d = \max(\text{ID}(i))$ , for i = 1, 2, ..., k, LWORK  $\geq \max\{\text{Kr}(\text{Kr}+2), (\text{IP}+d+2)\text{K}^2 + (\text{N}+\text{LMAX})\text{K}\}.$ 

- 22: IWORK(LIWORK) INTEGER array
- 23: LIWORK INTEGER

On entry: the dimension of the array IWORK as declared in the (sub)program from which G13DJF is called.

*Constraint*: LIWORK  $\geq$  K × max(IP, IQ).

#### 24: IFAIL – INTEGER

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

On entry, K < 1, or N < 3, or KMAX < K, or ID(i) < 0 for some i = 1, 2, ..., k, or ID(i)  $\geq$  N - max(IP, IQ) for some i = 1, 2, ..., k, or IP < 0, or IQ < 0, or MEAN  $\neq$  'M' or 'Z', Output

Input/Output

Workspace

Input

Input

Workspace

or	$LPAR < (IP + IQ) \times K \times K + K$ , and $MEAN = 'M'$ ,
or	$LPAR < (IP + IQ) \times K \times K$ and $MEAN = 'Z'$ ,
or	$N \times K \leq (IP + IQ) \times K \times K + K + K(K + 1)/2$ , and $MEAN = 'M'$ ,
or	$N \times K \leq (IP + IQ) \times K \times K + K(K + 1)/2$ and $MEAN = 'Z'$ ,
or	LMAX < 1,
or	$LREF < (LMAX - 1) \times K \times K + 2 \times K \times LMAX + K,$
or	LWORK is too small,
or	LIWORK is too small.

#### IFAIL = 2

On entry, at least one of the first k elements of TR is not equal to 'N', 'L' or 'S'.

#### IFAIL = 3

On entry, one or more of the transformations requested cannot be computed; that is, you may be trying to log or square-root a series, some of whose values are negative.

#### IFAIL = 4

On entry, either QQ is not positive definite or the autoregressive parameter matrices are extremely close to or outside the stationarity region, or the moving average parameter matrices are extremely close to or outside the invertibility region. To proceed, you must supply different parameter estimates in the arrays PAR and QQ.

#### $\mathrm{IFAIL}=5$

This is an unlikely exit brought about by an excessive number of iterations being needed to evaluate the eigenvalues of the matrices required to check for stationarity and invertibility; see G13DXF. All output parameters are undefined.

#### IFAIL = 6

This is an unlikely exit which could occur if QQ is nearly non positive definite. In this case the standard deviations of the forecast errors may be non-positive. To proceed, you must supply different parameter estimates in the array QQ.

#### IFAIL = 7

This is an unlikely exit. For one of the series, overflow will occur if the forecasts are computed. You should check whether the transformations requested in the array TR are sensible. All output parameters are undefined.

#### IFAIL = -99

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

See Section 3.8 in the Essential Introduction for further information.

#### IFAIL = -399

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

See Section 3.7 in the Essential Introduction for further information.

#### IFAIL = -999

Dynamic memory allocation failed.

See Section 3.6 in the Essential Introduction for further information.

### 7 Accuracy

The matrix computations are believed to be stable.

## 8 Parallelism and Performance

G13DJF is threaded by NAG for parallel execution in multithreaded implementations of the NAG Library.

G13DJF makes calls to BLAS and/or LAPACK routines, which may be threaded within the vendor library used by this implementation. Consult the documentation for the vendor library for further information.

Please consult the X06 Chapter Introduction for information on how to control and interrogate the OpenMP environment used within this routine. Please also consult the Users' Note for your implementation for any additional implementation-specific information.

## 9 Further Comments

The same differencing operator does not have to be applied to all the series. For example, suppose we have k = 2, and wish to apply the second order differencing operator  $\nabla^2$  to the first series and the first-order differencing operator  $\nabla$  to the second series:

$$w_{1t} = \nabla^2 z_{1t} = (1-B)^2 z_{1t} = (1-2B+B^2) Z_{1t},$$
 and  
 $w_{2t} = \nabla z_{2t} = (1-B) z_{2t}.$ 

Then  $d_1 = 2, d_2 = 1, d = \max(d_1, d_2) = 2$ , and

DELTA = 
$$\begin{bmatrix} \delta_{11} & \delta_{12} \\ \delta_{21} \end{bmatrix} = \begin{bmatrix} 2 & -1 \\ 1 & \end{bmatrix}.$$

**Note:** although differencing may already have been applied prior to the model fitting stage, the differencing parameters supplied in DELTA are part of the model definition and are still required by this routine to produce the forecasts.

G13DJF should not be used when the moving average parameters lie close to the boundary of the invertibility region. The routine does test for both invertibility and stationarity but if in doubt, you may use G13DXF, before calling this routine, to check that the VARMA model being used is invertible.

On a successful exit, the quantities K, LMAX, KMAX, REF and LREF will be suitable for input to G13DKF.

## 10 Example

This example computes forecasts of the next five values in two series each of length 48. No transformation is to be used and no differencing is to be applied to either of the series. G13DDF is first called to fit an AR(1) model to the series. The mean vector  $\mu$  is to be estimated and  $\phi_1(2, 1)$  constrained to be zero.

## 10.1 Program Text

```
G13DJF Example Program Text
1
   Mark 25 Release. NAG Copyright 2014.
!
    Module g13djfe_mod
     G13DJF Example Program Module:
1
             Parameters and User-defined Routines
1
      .. Use Statements ..
1
     Use nag_library, Only: nag_wp
      .. Implicit None Statement ..
!
     Implicit None
!
      .. Accessibility Statements ..
     Private
     Public
                                            :: fprint
      .. Parameters ..
1
                                           :: iset = 1, nin = 5, nout = 6
     Integer, Parameter, Public
    Contains
```

Subroutine fprint(k,nm,lmax,predz,sefz,ldsefz,nout)

```
.. Scalar Arguments ..
1
       Integer, Intent (In)
                                             :: k, ldsefz, lmax, nm, nout
        .. Array Arguments ..
1
        Real (Kind=nag_wp), Intent (In)
                                            :: predz(ldsefz,lmax),
                                                                                &
                                                sefz(ldsefz,lmax)
1
        .. Local Scalars ..
       Integer
                                             :: i, i2, j, l, l2, loop
1
        .. Intrinsic Procedures ..
       Intrinsic
                                             :: min, mod
        .. Executable Statements ..
1
        Write (nout,*) ' FORECAST SUMMARY TABLE'
        Write (nout,*) ' -----'
        Write (nout,*)
        Write (nout,99999) ' Forecast origin is set at t = ', nm
        Write (nout,*)
        loop = lmax/5
        If (mod(lmax, 5)/=0) Then
         loop = loop + 1
        End If
        Do j = 1, loop
          i2 = (j-1)*5
          12 = \min(i2+5, 1\max)
          Write (nout, 99998) 'Lead Time ', (i, i=i2+1, 12)
          Write (nout,*)
          i = 1
          Write (nout,99997) 'Series ', i, ' : Forecast ', &
           (predz(1,1),1=i2+1,12)
          Write (nout,99996) ' : Standard Error ', (sefz(1,1),1=i2+1,12)
          Do i = 2, k
            Write (nout,99997) 'Series ', i, ' : Forecast
                                                              ΄, &
              (predz(i,1),1=i2+1,12)
            Write (nout,99996) ' : Standard Error ', (sefz(i,1),1=i2+1,12)
          End Do
          Write (nout,*)
        End Do
        Return
99999
       Format (1X,A,I4)
99998 Format (1X,A,12X,5110)
      Format (1X,A,I2,A,5F10.2)
99997
99996
       Format (10X,A,4(F7.2,3X),F7.2)
     End Subroutine fprint
    End Module g13djfe_mod
   Program g13djfe
     G13DJF Example Main Program
1
ļ
      .. Use Statements ..
      Use nag_library, Only: g13ddf, g13djf, g13dlf, nag_wp, x04abf
      Use g13djfe_mod, Only: fprint, iset, nin, nout
1
      .. Implicit None Statement ..
     Implicit None
      .. Local Scalars ..
1
      Real (Kind=nag_wp)
                                            :: cgetol, rlogl
                                            :: d, i, ifail, ip, iprint, iq,
      Integer
                                                                                &
                                               ishow, k, kmax, ldcm, liwork,
                                                                                &
                                               lmax, lpar, lref, lwork, maxcal, &
                                              n, nadv, nd, niter, r, tddelta
     Logical
                                            :: exact, meanl
     Character (1)
                                            :: mean
1
      .. Local Arrays ..
     Real (Kind=nag_wp), Allocatable
                                           :: cm(:,:), delta(:,:), g(:),
                                                                               æ
                                                                              &
                                              par(:), predz(:,:), qq(:,:),
                                              ref(:), sefz(:,:), v(:,:),
                                                                                &
                                              w(:,:), work(:), workl(:), z(:,:)
     Integer, Allocatable
Logical, Allocatable
                                          :: id(:), iwork(:)
     Logical, Allocatable :: parhld(:)
Character (1), Allocatable :: tr(:)
```

```
G13DJF
```

```
!
      .. Intrinsic Procedures ..
     Intrinsic
                                           :: max, maxval
1
      .. Executable Statements ..
      Write (nout,*) 'G13DJF Example Program Results'
     Write (nout,*)
     Skip heading in data file
1
     Read (nin,*)
!
     Read in the problem size
     Read (nin,*) k, n
     Allocate (tr(k), id(k))
     Read in differencing
1
     Read (nin,*) id(1:k)
     d = maxval(id(1:k))
     tddelta = max(d, 1)
     nd = n - d
     kmax = k
     Allocate (delta(kmax,tddelta),w(kmax,nd),workl(k*n),z(kmax,n))
     Read in series and the transformation flag
!
     Read (nin,*)(z(i,1:n),i=1,k)
     Read (nin,*) tr(1:k)
1
     If required, read in delta
     If (d>0) Then
       Read (nin,*)(delta(i,1:id(i)),i=1,k)
     End If
     Difference and / or transform series
ŗ
     ifail = 0
     Call g13dlf(k,n,z,kmax,tr,id,delta,w,nd,workl,ifail)
1
     Read in information on the VARMA
     Read (nin,*) ip, iq, mean, lmax
     Calculate number of parameters for the VARMA
1
     lpar = (ip+iq)*k*k
     meanl = .False.
     If (mean='M' . Or. mean='m') Then
       lpar = lpar + k
       meanl = .True.
     End If
!
     Read in control parameters
     Read (nin,*) iprint, cgetol, maxcal, ishow
1
     Read in exact likelihood flag
     Read (nin,*) exact
     ldcm = lpar
     kmax = k
     Allocate (par(lpar),qq(kmax,k),v(kmax,nd),g(lpar),cm(ldcm,lpar), &
       parhld(lpar))
1
     Read in initial parameter estimates and free parameter flags
     Read (nin,*) par(1:lpar)
     Read (nin,*) parhld(1:lpar)
     Read in initial values for covariance matrix Q
1
     Read (nin,*)(qq(i,1:i),i=1,k)
     Set the advisory channel to NOUT for monitoring information
!
     If (iprint>=0 .Or. ishow/=0) Then
       nadv = nout
       Call x04abf(iset,nadv)
     End If
```

```
!
     Fit a VARMA model
      ifail = -1
     Call g13ddf(k,nd,ip,iq,meanl,par,lpar,qq,kmax,w,parhld,exact,iprint, &
       cgetol,maxcal,ishow,niter,rlogl,v,g,cm,ldcm,ifail)
      If (ifail/=0) Then
       If (ifail<4) Then
         Go To 100
       End If
     End If
     lref = (lmax-1)*k*k + 2*k*lmax + k
     r = max(ip, iq)
      lwork = max(k*r*(k*r+2),(ip+d+2)*k**2+(n+lmax)*k)
     liwork = k*max(ip,iq)
     Allocate (predz(kmax,lmax),sefz(kmax,lmax),ref(lref),work(lwork), &
        iwork(liwork))
     Perform forecast
1
     ifail = 0
     Call g13djf(k,n,z,kmax,tr,id,delta,ip,iq,mean,par,lpar,qq,v,lmax,predz, &
       sefz,ref,lref,work,lwork,iwork,liwork,ifail)
1
     Display results
     Call fprint(k,n,lmax,predz,sefz,kmax,nout)
```

100 Continue

End Program g13djfe

#### 10.2 Program Data

```
G13DJF Example Program Data
2 48
                                                     :: K,N
0 0
                                                     :: ID
-1.490 -1.620 5.200 6.230 6.210 5.860 4.090
3.180 2.620 1.490 1.170 0.850 -0.350 0.240
2.4402.5802.0400.4002.2603.3405.0905.0004.7804.1103.4501.6501.2904.0906.3207.5003.8901.5805.2105.2504.930
7.380 5.870 5.810 9.680 9.070 7.290 7.840
7.550 7.320 7.970 7.760 7.000 8.350 7.340
6.350 6.960 8.540
                      6.620 4.970 4.550
                                            4.810
 4.750 4.760 10.880 10.010 11.620 10.360 6.400
6.240 7.930 4.040 3.730 5.600 5.350 6.810
8.270 7.680 6.650 6.080 10.250 9.140 17.750
13.300 9.630 6.800 4.080 5.060 4.940 6.650
7.940 10.760 11.890 5.850 9.010 7.500 10.020
10.380 8.150 8.370 10.730 12.140
                                                     :: End of Z
'N' 'N'
                                                     :: TR
1 0 'M' 5
                                                     :: IP, IQ, MEAN, LMAX
                                                     :: IPRINT, CGETOL, MAXCAL, ISHOW
-1 0.0001 3000 0
                                                     :: EXACT
T
0.0 0.0 0.0 0.0 0.0 0.0
                                                     :: PAR
F
            F F F
                                                     :: PARHLD
    F
       Т
0.0
0.0 0.0
                                                     :: QQ
10.3 Program Results
G13DJF Example Program Results
  FORECAST SUMMARY TABLE
  _____
```

2

1

3

4

```
Forecast origin is set at t = 48
```

5

## G13 – Time Series Analysis

Series	1 : Forecast	7.82	7.28	6.77	6.33	5.95
	: Standard Error	1.72	2.23	2.51	2.68	2.79
Series	2 : Forecast	10.31	9.25	8.65	8.30	8.10
	: Standard Error	2.32	2.68	2.78	2.82	2.83