## NAG Toolbox for MATLAB

### f08kc

# 1 Purpose

f08kc computes the minimum norm solution to a real linear least-squares problem

$$\min_{x} \|b - Ax\|_2.$$

# 2 Syntax

```
[a, b, s, rank, info] = f08kc(a, b, rcond, 'm', m, 'n', n, 'nrhs_p',
nrhs_p, 'lwork', lwork)
```

# 3 Description

f08kc uses the singular value decomposition (SVD) of A, where A is an m by n matrix which may be rank-deficient.

Several right-hand side vectors b and solution vectors x can be handled in a single call; they are stored as the columns of the b0 t1 right-hand side matrix t2 and the t2 solution matrix t3.

The problem is solved in three steps:

- 1. reduce the coefficient matrix A to bidiagonal form with Householder transformations, reducing the original problem into a 'bidiagonal least-squares problem' (BLS);
- 2. solve the BLS using a divide-and-conquer approach;
- 3. apply back all the Householder transformations to solve the original least-squares problem.

The effective rank of A is determined by treating as zero those singular values which are less than **rcond** times the largest singular value.

### 4 References

Anderson E, Bai Z, Bischof C, Blackford S, Demmel J, Dongarra J J, Du Croz J J, Greenbaum A, Hammarling S, McKenney A and Sorensen D 1999 *LAPACK Users' Guide* (3rd Edition) SIAM, Philadelphia URL: http://www.netlib.org/lapack/lug

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

### 5 Parameters

### 5.1 Compulsory Input Parameters

## 1: a(lda,\*) - double array

The first dimension of the array  $\mathbf{a}$  must be at least max(1,  $\mathbf{m}$ )

The second dimension of the array must be at least  $max(1, \mathbf{n})$ 

The m by n matrix A.

#### 2: b(ldb,\*) - double array

The first dimension of the array **b** must be at least  $max(1, max(\mathbf{m}, \mathbf{n}))$ 

The second dimension of the array must be at least max(1, nrhs p)

The m by r right-hand side matrix B.

[NP3663/21] f08kc.1

f08kc NAG Toolbox Manual

#### 3: rcond – double scalar

Used to determine the effective rank of A. Singular values  $\mathbf{s}(i) \leq \mathbf{rcond} \times \mathbf{s}(1)$  are treated as zero. If  $\mathbf{rcond} < 0$ , *machine precision* is used instead.

## 5.2 Optional Input Parameters

#### 1: m - int32 scalar

Default: The first dimension of the array a.

m, the number of rows of the matrix A.

Constraint:  $\mathbf{m} \geq 0$ .

#### 2: n - int32 scalar

Default: The second dimension of the array a.

n, the number of columns of the matrix A.

Constraint:  $\mathbf{n} > 0$ .

## 3: nrhs\_p - int32 scalar

Default: The second dimension of the array b.

r, the number of right-hand sides, i.e., the number of columns of the matrices B and X.

Constraint: **nrhs**  $\mathbf{p} \geq 0$ .

#### 4: lwork – int32 scalar

Default: The dimension of the array.

The exact minimum amount of workspace needed depends on **m**, **n** and **nrhs\_p**. As long as **lwork** is at least

$$12r + 2r \times smlsiz + 8r \times nlvl + r \times nrhs p + (smlsiz + 1)^2$$
,

where smlsiz is equal to the maximum size of the subproblems at the bottom of the computation tree (usually about 25),  $nlvl = \max(0, \inf(\log_2(\min(\mathbf{m}, \mathbf{n})/(smlsiz+1)))+1)$  and  $r = \min(\mathbf{m}, \mathbf{n})$ , the code will execute correctly.

If  $\mathbf{lwork} = -1$ , a workspace query is assumed; the function only calculates the optimal size of the **work** array and the minimum size of the **iwork** array, and returns these values as the first entries of the **work** and **iwork** arrays, and no error message related to **lwork** is issued.

Suggested value: for optimal performance, **lwork** should generally be larger than the minimum required as set out above. Consider increasing **lwork** by at least  $nb \times \min(\mathbf{m}, \mathbf{n})$ , where nb is the optimal **block size**.

Default: 
$$64 \min(\mathbf{m}, \mathbf{n}) + \left(12r + 2r \times smlsiz + 8r \times nlvl + r \times \mathbf{nrhs} \mathbf{p} + (smlsiz + 1)^2\right)$$

Constraint:

**lwork** 
$$\geq 12r + 2r \times smlsiz + 8r \times nlvl + r \times nrhs_p + (smlsiz + 1)^2$$
 or **lwork**  $= -1$ .

## 5.3 Input Parameters Omitted from the MATLAB Interface

lda, ldb, work, iwork

### 5.4 Output Parameters

1: a(lda,\*) - double array

The first dimension of the array **a** must be at least  $max(1, \mathbf{m})$ 

f08kc.2 [NP3663/21]

The second dimension of the array must be at least  $max(1, \mathbf{n})$ 

The contents of a are destroyed.

## 2: b(ldb,\*) - double array

The first dimension of the array **b** must be at least  $max(1, max(\mathbf{m}, \mathbf{n}))$ 

The second dimension of the array must be at least max(1, nrhs p)

**b** contains the *n* by *r* solution matrix *X*. If  $m \ge n$  and  $\operatorname{rank} = n$ , the residual sum of squares for the solution in the *i*th column is given by the sum of squares of elements  $n + 1, \dots, m$  in that column.

#### 3: s(\*) – double array

**Note**: the dimension of the array **s** must be at least  $max(1, min(\mathbf{m}, \mathbf{n}))$ .

The singular values of A in decreasing order.

#### 4: rank – int32 scalar

The effective rank of A, i.e., the number of singular values which are greater than **rcond**  $\times$  s(1).

#### 5: info – int32 scalar

info = 0 unless the function detects an error (see Section 6).

## 6 Error Indicators and Warnings

Errors or warnings detected by the function:

```
info = -i
```

If info = -i, parameter i had an illegal value on entry. The parameters are numbered as follows:

1: m, 2: n, 3: nrhs\_p, 4: a, 5: lda, 6: b, 7: ldb, 8: s, 9: rcond, 10: rank, 11: work, 12: lwork, 13: iwork, 14: info.

It is possible that **info** refers to a parameter that is omitted from the MATLAB interface. This usually indicates that an error in one of the other input parameters has caused an incorrect value to be inferred.

### info > 0

The algorithm for computing the SVD failed to converge; if info = i, i off-diagonal elements of an intermediate bidiagonal form did not converge to zero.

### 7 Accuracy

See Section 4.5 of Anderson et al. 1999 for details.

#### **8 Further Comments**

The complex analogue of this function is f08kq.

## 9 Example

```
a = [-0.09, -1.56, -1.48, -1.09, 0.08, -1.59;

0.14, 0.2, -0.43, 0.84, 0.55, -0.72;

-0.46, 0.29, 0.89, 0.77, -1.13, 1.06;

0.68, 1.09, -0.71, 2.11, 0.14, 1.24;

1.29, 0.51, -0.96, -1.27, 1.74, 0.34];
```

[NP3663/21] f08kc.3

f08kc NAG Toolbox Manual

```
b = [7.4;
    4.3;
     -8.1;
     1.8;
     8.7;
0];
rcond = 0.01;
[aOut, bOut, s, rank, info] = f08kc(a, b, rcond)
aOut =
            0.5234
1.9769
                      0.4966
0.3575
                                           -0.0268
0.4290
   2.8904
                                  0.3657
                                                      0.5335
                                                    -0.1595
                                -0.6148
   -2.3501
            1.2464 -1.5225
   -0.5887
                                0.3678
                                          -0.1209
                                                    -0.2363
   -0.6738 -0.3535 -1.4945
                                2.2693
0.9654
                                                    -0.3490
-0.6641
                                          0.3032
   0.2022
            0.8123 0.5101
                                           0.0030
bOut =
   1.5938
   -0.1180
   -3.1501
   0.1554
   2.5529
   -1.6730
s =
    3.9997
   2.9962
    2.0001
    0.9988
   0.0025
rank =
           4
info =
           0
```

f08kc.4 (last) [NP3663/21]