# **NAG Toolbox for MATLAB**

# f02wd

# 1 Purpose

f02wd returns the Householder QU factorization of a real rectangular m by n ( $m \ge n$ ) matrix A. Further, on request or if A is not of full rank, part or all of the singular value decomposition of A is returned.

# 2 Syntax

[a, b, svd, irank, z, sv, r, pt, work, ifail] = 
$$f02wd(a, wantb, b, tol, svd, wantr, wantpt, lwork, 'm', m, 'n', n)$$

# 3 Description

The real m by  $n \ (m \ge n)$  matrix A is first factorized as

$$A = Q \binom{U}{0},$$

where Q is an m by m orthogonal matrix and U is an n by n upper triangular matrix.

If either U is singular or **svd** is supplied as **true**, then the singular value decomposition (SVD) of U is obtained so that U is factorized as

$$U = RDP^{\mathrm{T}}$$
.

where R and P are n by n orthogonal matrices and D is the n by n diagonal matrix

$$D = \operatorname{diag}(sv_1, sv_2, \dots, sv_n),$$

with  $sv_1 \ge sv_2 \ge \cdots \ge sv_n \ge 0$ .

Note that the SVD of A is then given by

$$A = Q_1 \begin{pmatrix} D \\ 0 \end{pmatrix} P^{\mathrm{T}}$$
 where  $Q_1 = Q \begin{pmatrix} R & 0 \\ 0 & I \end{pmatrix}$ ,

the diagonal elements of D being the singular values of A.

The option to form a vector  $Q^{T}b$ , or if appropriate  $Q_{1}^{T}b$ , is also provided.

The rank of the matrix A, based upon a user-supplied parameter tol, is also returned.

The QU factorization of A is obtained by Householder transformations. To obtain the SVD of U the matrix is first reduced to bidiagonal form by means of plane rotations and then the QR algorithm is used to obtain the SVD of the bidiagonal form.

#### 4 References

Wilkinson J H 1978 Singular Value Decomposition – Basic Aspects Numerical Software – Needs and Availability (ed D A H Jacobs) Academic Press

### 5 Parameters

### 5.1 Compulsory Input Parameters

1: a(lda,n) - double array

lda, the first dimension of the array, must be at least m.

The leading m by n part of a must contain the matrix to be factorized.

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### 2: wantb - logical scalar

Must be **true** if  $Q^{T}b$  or  $Q_{1}^{T}b$  is required.

If on entry wantb = false, b is not referenced.

#### 3: b(m) – double array

If wantb is supplied as true, b must contain the m element vector b. Otherwise, b is not referenced.

#### 4: tol – double scalar

Must specify a relative tolerance to be used to determine the rank of A. **tol** should be chosen as approximately the largest relative error in the elements of A. For example, if the elements of A are correct to about 4 significant figures, **tol** should be set to about  $5 \times 10^{-4}$ . See Section 8.3 for a description of how **tol** is used to determine rank.

If **tol** is outside the range  $(\epsilon, 1.0)$ , where  $\epsilon$  is the **machine precision**, the value  $\epsilon$  is used in place of **tol**. For most problems this is unreasonably small.

### 5: svd – logical scalar

Must be **true** if the singular values are to be found even if A is of full rank.

If before entry,  $\mathbf{svd} = \mathbf{false}$  and A is determined to be of full rank, only the QU factorization of A is computed.

#### 6: wantr – logical scalar

Must be **true** if the orthogonal matrix R is required when the singular values are computed.

If on entry wantr = false, r is not referenced.

### 7: wantpt – logical scalar

Must be **true** if the orthogonal matrix  $P^{T}$  is required when the singular values are computed.

Note that if **svd** is returned as **true**, **pt** is referenced even if **wantpt** is supplied as **false**, but see parameter **pt**.

#### 8: lwork – int32 scalar

Constraint: lwork  $\geq 3 \times n$ .

## 5.2 Optional Input Parameters

### 1: m - int32 scalar

Default: The dimension of the array b.

m, the number of rows of the matrix A.

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

#### 2: n - int32 scalar

Default: The dimension of the arrays a, z, sv, pt. (An error is raised if these dimensions are not equal.)

n, the number of columns of the matrix A.

Constraint:  $1 \le \mathbf{n} \le \mathbf{m}$ .

### 5.3 Input Parameters Omitted from the MATLAB Interface

lda, ldr, ldpt

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## 5.4 Output Parameters

### 1: a(lda,n) - double array

The leading m by n part of  $\mathbf{a}$ , together with the n element vector  $\mathbf{z}$ , contains details of the Householder QU factorization.

Details of the storage of the QU factorization are given in Section 8.4.

### 2: b(m) – double array

Contains  $Q_1^T b$  if **svd** is returned as **true** and  $Q^T b$  if **svd** is returned as **false**.

#### 3: svd – logical scalar

Is returned as **false** if only the QU factorization of A has been obtained and is returned as **true** if the singular values of A have been obtained.

#### 4: irank – int32 scalar

Returns the rank of the matrix A. (It should be noted that it is possible for **irank** to be returned as n and n and n to be returned as n are n and n to be returned as n are n and n are n are n and n are n are n and n are n are

#### 5: z(n) – double array

The n element vector  $\mathbf{z}$  contains some details of the Householder transformations. See Section 8.4 for further information.

#### 6: sv(n) – double array

If svd is returned as true, sv contains the n singular values of A arranged in descending order.

### 7: r(ldr,n) - double array

The first dimension, ldr, of the array r must satisfy

```
if wantr = true, ldr \ge n; 1 otherwise.
```

The second dimension of the array must be at least  $\mathbf{n}$  if  $\mathbf{wantr} = \mathbf{true}$ , and at least 1 otherwise

If **svd** is returned as **true** and **wantr** was supplied as **true**, the leading n by n part of  $\mathbf{r}$  will contain the left-hand orthogonal matrix of the **svd** of U.

#### 8: pt(ldpt,n) – double array

If **svd** is returned as **true** and **wantpt** was supplied as **true**, the leading n by n part of **pt** contains the orthogonal matrix  $P^{T}$ .

If **svd** is returned as **true**, but **wantpt** was supplied as **false**, the leading n by n part of **pt** is used for internal workspace.

## 9: work(lwork) - double array

If **svd** is returned as **false**, **work**(1) contains the condition number  $||U||_E ||U^{-1}||_E$  of the upper triangular matrix U.

If **svd** is returned as **true**, **work**(1) will contain the total number of iterations taken by the QR algorithm.

The rest of the array is used as workspace and so contains no meaningful information.

# 10: ifail – int32 scalar

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

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# 6 Error Indicators and Warnings

Errors or warnings detected by the function:

#### ifail = 1

```
On entry, \mathbf{n} < 1,

or \mathbf{m} < \mathbf{n},

or \mathbf{lda} < \mathbf{m},

or \mathbf{ldr} < \mathbf{n} when \mathbf{wantr} = \mathbf{true},

or \mathbf{ldpt} < \mathbf{n}

or \mathbf{lwork} < 3 \times \mathbf{n}.
```

(The function only checks ldr if wantr is supplied as true.)

#### ifail > 1

The QR algorithm has failed to converge to the singular values in  $50 \times \mathbf{n}$  iterations. In this case  $\mathbf{sv}(1), \mathbf{sv}(2), \dots, \mathbf{sv}(\mathbf{ifail}-1)$  may not have been correctly found and the remaining singular values may not be the smallest singular values. The matrix A has nevertheless been factorized as  $A = Q_1 CP^T$ , where C is an upper bidiagonal matrix with  $\mathbf{sv}(1), \mathbf{sv}(2), \dots, \mathbf{sv}(n)$  as its diagonal elements and  $\mathbf{work}(2), \mathbf{work}(3), \dots, \mathbf{work}(n)$  as its superdiagonal elements.

This failure cannot occur if svd is returned as false and in any case is extremely rare.

### 7 Accuracy

The computed factors Q, U, R, D and  $P^{T}$  satisfy the relations

$$Q\left(\begin{array}{c} U\\0\end{array}\right) = A + E,$$

$$Q\begin{pmatrix} R & 0 \\ 0 & I \end{pmatrix}\begin{pmatrix} D \\ 0 \end{pmatrix}P^{\mathrm{T}} = A + F$$

where  $||E||_2 \le c_1 \epsilon ||A||_2$ ,  $||F||_2 \le c_2 \epsilon ||A||_2$ ,

 $\epsilon$  being the *machine precision* and  $c_1$  and  $c_2$  are modest functions of m and n. Note that  $||A||_2 = sv_1$ .

### **8** Further Comments

### 8.1 Timing

The time taken by f02wd to obtain the Householder QU factorization is approximately proportional to  $n^2(3m-n)$ .

The **additional** time taken to obtain the singular value decomposition is approximately proportional to  $n^3$ , where the constant of proportionality depends upon whether or not the orthogonal matrices R and  $P^{T}$  are required.

#### 8.2 General Remarks

Singular vectors associated with a zero or multiple singular value, are not uniquely determined, even in exact arithmetic, and very different results may be obtained if they are computed on different machines.

This function is called by the least-squares function f04jg.

#### 8.3 Determining the Rank of A

Following the QU factorization of A, if **svd** is supplied as **false**, then the condition number of U given by

$$C(U) = ||U||_F ||U^{-1}||_F$$

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is found, where  $\|.\|_F$  denotes the Frobenius norm, and if C(U) is such that

$$C(U) \times \mathbf{tol} > 1.0$$

then U is regarded as singular and the singular values of A are computed. If this test is not satisfied, then the rank of A is set to n. Note that if **svd** is supplied as **true** then this test is omitted.

When the singular values are computed, then the rank of A, r, is returned as the largest integer such that

$$sv_r > \mathbf{tol} \times sv_1$$

unless  $sv_1 = 0$  in which case r is returned as zero. That is, singular values which satisfy  $sv_i \le \mathbf{tol} \times sv_1$  are regarded as negligible because relative perturbations of order **tol** can make such singular values zero.

# 8.4 Storage Details of the QU Factorization

The kth Householder transformation matrix,  $T_k$ , used in the QU factorization is chosen to introduce the zeros into the kth column and has the form

$$T_k = I - 2 \begin{pmatrix} 0 \\ u \end{pmatrix} (0 \quad u^{\mathrm{T}}), \qquad u^{\mathrm{T}} u = 1,$$

where u is an (m - k + 1) element vector.

In place of u the function actually computes the vector z given by

$$z=2u_1u$$
.

The first element of z is stored in  $\mathbf{z}(k)$  and the remaining elements of z are overwritten on the subdiagonal elements of the kth column of  $\mathbf{a}$ . The upper triangular matrix U is overwritten on the n by n upper triangular part of  $\mathbf{a}$ .

## 9 Example

```
a = [22.25, 31.75, -38.25, 65.5;
     20, 26.75, 28.5, -26.5;
     -15.25, 24.25, 27.75, 18.5;
     27.25, 10, 3, 2;
-17.25, -30.75, 11.25, 7.5;
17.25, 30.75, -11.25, -7.5];
wantb = false;
b = [0;
     0;
     0;
     0;
     0;
     0];
tol = 0.0005;
svd = true;
wantr = true;
wantpt = true;
lwork = int32(24);
[aOut, bOut, svdOut, irank, z, sv, r, pt, work, ifail] = ...
    f02wd(a, wantb, b, tol, svd, wantr, wantpt, lwork)
aOut =
  -49.6519
            -44.4092
                         20.3542
                                   -8.8818
                         -9.5887
            -48.2767
    0.4028
                                   -20.3761
   -0.3071
             0.8369
                         52.9270
                                   -48.8806
              -0.3907
    0.5488
                         -0.8364
                                   -50.6742
   -0.3474
             -0.2585
                         -0.1851
                                    0.6321
    0.3474
             0.2585
                          0.1851
                                    -0.6321
bOut =
     0
     0
```

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```
0
     0
    0
svdOut =
    1
irank =
z =
   1.4481
    1.1153
    1.4817
   1.4482
sv =
   91.0000
  68.2500
  45.5000
  22.7500
r =
                       0.4229
  -0.5639
             0.6344
                                 0.3172
   -0.3512
             0.3951
                      -0.6791
                                -0.5093
   -0.6403
            -0.5692
                      0.3095
                                -0.4126
   -0.3855
            -0.3427
                      -0.5140
                                 0.6854
pt =
   0.3077
                      -0.4615
                                 0.6923
            0.4615
   -0.4615
            -0.6923
                      -0.3077
                                0.4615
            0.3077
                      0.6923
                                0.4615
  -0.4615
   -0.6923
             0.4615
                      -0.4615
                                -0.3077
work =
   7.0000
  -0.0000
   0.0000
   -0.0000
    1.0000
    2.0000
    4.0000
    4.0000
         0
    0.0131
    0.0000
    0.0000
         0
         0
         0
         0
         0
         0
         0
         0
         0
         0
         0
ifail =
           0
```

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