

## NAG Toolbox

### nag\_lapack\_dppsvx (f07gb)

#### 1 Purpose

nag\_lapack\_dppsvx (f07gb) uses the Cholesky factorization

$$A = U^T U \quad \text{or} \quad A = LL^T$$

to compute the solution to a real system of linear equations

$$AX = B,$$

where  $A$  is an  $n$  by  $n$  symmetric positive definite matrix stored in packed format and  $X$  and  $B$  are  $n$  by  $r$  matrices. Error bounds on the solution and a condition estimate are also provided.

#### 2 Syntax

```
[ap, AFP, EQUED, S, B, X, RCOND, FERR, BERR, INFO] = nag_lapack_dppsvx(fact,
uplo, AP, AFP, EQUED, S, B, 'N', N, 'NRHS_P', NRHS_P)
```

```
[ap, AFP, EQUED, S, B, X, RCOND, FERR, BERR, INFO] = f07gb(fact, uplo, AP, AFP,
EQUED, S, B, 'N', N, 'NRHS_P', NRHS_P)
```

#### 3 Description

nag\_lapack\_dppsvx (f07gb) performs the following steps:

1. If **fact** = 'E', real diagonal scaling factors,  $D_S$ , are computed to equilibrate the system:

$$(D_S A D_S)(D_S^{-1} X) = D_S B.$$

Whether or not the system will be equilibrated depends on the scaling of the matrix  $A$ , but if equilibration is used,  $A$  is overwritten by  $D_S A D_S$  and  $B$  by  $D_S B$ .

2. If **fact** = 'N' or 'E', the Cholesky decomposition is used to factor the matrix  $A$  (after equilibration if **fact** = 'E') as  $A = U^T U$  if **uplo** = 'U' or  $A = LL^T$  if **uplo** = 'L', where  $U$  is an upper triangular matrix and  $L$  is a lower triangular matrix.
3. If the leading  $i$  by  $i$  principal minor of  $A$  is not positive definite, then the function returns with **info** =  $i$ . Otherwise, the factored form of  $A$  is used to estimate the condition number of the matrix  $A$ . If the reciprocal of the condition number is less than *machine precision*, **info**  $\geq n + 1$  is returned as a warning, but the function still goes on to solve for  $X$  and compute error bounds as described below.
4. The system of equations is solved for  $X$  using the factored form of  $A$ .
5. Iterative refinement is applied to improve the computed solution matrix and to calculate error bounds and backward error estimates for it.
6. If equilibration was used, the matrix  $X$  is premultiplied by  $D_S$  so that it solves the original system before equilibration.

## 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 <http://www.netlib.org/lapack/lug>

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

Higham N J (2002) *Accuracy and Stability of Numerical Algorithms* (2nd Edition) SIAM, Philadelphia

## 5 Parameters

### 5.1 Compulsory Input Parameters

1: **fact** – CHARACTER(1)

Specifies whether or not the factorized form of the matrix  $A$  is supplied on entry, and if not, whether the matrix  $A$  should be equilibrated before it is factorized.

**fact** = 'F'

**afp** contains the factorized form of  $A$ . If **equed** = 'Y', the matrix  $A$  has been equilibrated with scaling factors given by **s**. **ap** and **afp** will not be modified.

**fact** = 'N'

The matrix  $A$  will be copied to **afp** and factorized.

**fact** = 'E'

The matrix  $A$  will be equilibrated if necessary, then copied to **afp** and factorized.

*Constraint:* **fact** = 'F', 'N' or 'E'.

2: **uplo** – CHARACTER(1)

If **uplo** = 'U', the upper triangle of  $A$  is stored.

If **uplo** = 'L', the lower triangle of  $A$  is stored.

*Constraint:* **uplo** = 'U' or 'L'.

3: **ap**(:) – REAL (KIND=nag\_wp) array

The dimension of the array **ap** must be at least  $\max(1, \mathbf{n} \times (\mathbf{n} + 1)/2)$

If **fact** = 'F' and **equed** = 'Y', **ap** must contain the equilibrated matrix  $D_S A D_S$ ; otherwise, **ap** must contain the  $n$  by  $n$  symmetric matrix  $A$ , packed by columns.

More precisely,

if **uplo** = 'U', the upper triangle of  $A$  must be stored with element  $A_{ij}$  in **ap**( $i + j(j - 1)/2$ ) for  $i \leq j$ ;

if **uplo** = 'L', the lower triangle of  $A$  must be stored with element  $A_{ij}$  in **ap**( $i + (2n - j)(j - 1)/2$ ) for  $i \geq j$ .

4: **afp**(:) – REAL (KIND=nag\_wp) array

The dimension of the array **afp** must be at least  $\max(1, \mathbf{n} \times (\mathbf{n} + 1)/2)$

If **fact** = 'F', **afp** contains the triangular factor  $U$  or  $L$  from the Cholesky factorization  $A = U^T U$  or  $A = L L^T$ , in the same storage format as **ap**. If **equed** = 'Y', **afp** is the factorized form of the equilibrated matrix  $D_S A D_S$ .

5: **equed** – CHARACTER(1)

If **fact** = 'N' or 'E', **equed** need not be set.

If **fact** = 'F', **equed** must specify the form of the equilibration that was performed as follows:

if **equed** = 'N', no equilibration;

if **equed** = 'Y', equilibration was performed, i.e.,  $A$  has been replaced by  $D_S A D_S$ .

*Constraint:* if **fact** = 'F', **equed** = 'N' or 'Y'.

6: **s**(:) – REAL (KIND=nag\_wp) array

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

If **fact** = 'N' or 'E', **s** need not be set.

If **fact** = 'F' and **equed** = 'Y', **s** must contain the scale factors,  $D_S$ , for  $A$ ; each element of **s** must be positive.

7: **b**(ldb,:) – REAL (KIND=nag\_wp) array

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

The second dimension of the array **b** must be at least  $\max(1, \mathbf{nrhs\_p})$ .

The  $n$  by  $r$  right-hand side matrix  $B$ .

## 5.2 Optional Input Parameters

1: **n** – INTEGER

*Default:* the first dimension of the array **b** and the dimension of the array **s**.

$n$ , the number of linear equations, i.e., the order of the matrix  $A$ .

*Constraint:*  $\mathbf{n} \geq 0$ .

2: **nrhs\_p** – INTEGER

*Default:* the second dimension of the array **b**.

$r$ , the number of right-hand sides, i.e., the number of columns of the matrix  $B$ .

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

## 5.3 Output Parameters

1: **ap**(:) – REAL (KIND=nag\_wp) array

The dimension of the array **ap** will be  $\max(1, \mathbf{n} \times (\mathbf{n} + 1)/2)$

If **fact** = 'F' or 'N', or if **fact** = 'E' and **equed** = 'N', **ap** is not modified.

If **fact** = 'E' and **equed** = 'Y', **ap** stores  $D_S A D_S$ .

2: **afp**(:) – REAL (KIND=nag\_wp) array

The dimension of the array **afp** will be  $\max(1, \mathbf{n} \times (\mathbf{n} + 1)/2)$

If **fact** = 'N' or if **fact** = 'E' and **equed** = 'N', **afp** returns the triangular factor  $U$  or  $L$  from the Cholesky factorization  $A = U^T U$  or  $A = L L^T$  of the original matrix  $A$ .

If **fact** = 'E' and **equed** = 'Y', **afp** returns the triangular factor  $U$  or  $L$  from the Cholesky factorization  $A = U^T U$  or  $A = L L^T$  of the equilibrated matrix  $A$  (see the description of **ap** for the form of the equilibrated matrix).

3: **equed** – CHARACTER(1)

If **fact** = 'F', **equed** is unchanged from entry.

Otherwise, if no constraints are violated, **equed** specifies the form of the equilibration that was performed as specified above.

- 4: **s**(:) – REAL (KIND=nag\_wp) array  
 The dimension of the array **s** will be  $\max(1, \mathbf{n})$   
 If **fact** = 'F', **s** is unchanged from entry.  
 Otherwise, if no constraints are violated and **equed** = 'Y', **s** contains the scale factors,  $D_S$ , for  $A$ ; each element of **s** is positive.
- 5: **b**(ldb,:) – REAL (KIND=nag\_wp) array  
 The first dimension of the array **b** will be  $\max(1, \mathbf{n})$ .  
 The second dimension of the array **b** will be  $\max(1, \mathbf{nrhs\_p})$ .  
 If **equed** = 'N', **b** is not modified.  
 If **equed** = 'Y', **b** stores  $D_S B$ .
- 6: **x**(ldx,:) – REAL (KIND=nag\_wp) array  
 The first dimension of the array **x** will be  $\max(1, \mathbf{n})$ .  
 The second dimension of the array **x** will be  $\max(1, \mathbf{nrhs\_p})$ .  
 If **info** = 0 or **n** + 1, the  $n$  by  $r$  solution matrix  $X$  to the original system of equations. Note that the arrays  $A$  and  $B$  are modified on exit if **equed** = 'Y', and the solution to the equilibrated system is  $D_S^{-1} X$ .
- 7: **rcond** – REAL (KIND=nag\_wp)  
 If no constraints are violated, an estimate of the reciprocal condition number of the matrix  $A$  (after equilibration if that is performed), computed as  $\mathbf{rcond} = 1.0 / (\|A\|_1 \|A^{-1}\|_1)$ .
- 8: **ferr**(nrhs\_p) – REAL (KIND=nag\_wp) array  
 If **info** = 0 or **n** + 1, an estimate of the forward error bound for each computed solution vector, such that  $\|\hat{x}_j - x_j\|_\infty / \|x_j\|_\infty \leq \mathbf{ferr}(j)$  where  $\hat{x}_j$  is the  $j$ th column of the computed solution returned in the array **x** and  $x_j$  is the corresponding column of the exact solution  $X$ . The estimate is as reliable as the estimate for **rcond**, and is almost always a slight overestimate of the true error.
- 9: **berr**(nrhs\_p) – REAL (KIND=nag\_wp) array  
 If **info** = 0 or **n** + 1, an estimate of the component-wise relative backward error of each computed solution vector  $\hat{x}_j$  (i.e., the smallest relative change in any element of  $A$  or  $B$  that makes  $\hat{x}_j$  an exact solution).
- 10: **info** – INTEGER  
**info** = 0 unless the function detects an error (see Section 6).

## 6 Error Indicators and Warnings

### **info** < 0

If **info** =  $-i$ , argument  $i$  had an illegal value. An explanatory message is output, and execution of the program is terminated.

### **info** > 0 and **info** ≤ **n**

The leading minor of order  $\langle \text{value} \rangle$  of  $A$  is not positive definite, so the factorization could not be completed, and the solution has not been computed. **rcond** = 0.0 is returned.

**info** = **n** + 1 (*warning*)

$U$  (or  $L$ ) is nonsingular, but **rcond** is less than *machine precision*, meaning that the matrix is singular to working precision. Nevertheless, the solution and error bounds are computed because there are a number of situations where the computed solution can be more accurate than the value of **rcond** would suggest.

## 7 Accuracy

For each right-hand side vector  $b$ , the computed solution  $x$  is the exact solution of a perturbed system of equations  $(A + E)x = b$ , where

if **uplo** = 'U',  $|E| \leq c(n)\epsilon|U^T||U|$ ;

if **uplo** = 'L',  $|E| \leq c(n)\epsilon|L||L^T|$ ,

$c(n)$  is a modest linear function of  $n$ , and  $\epsilon$  is the *machine precision*. See Section 10.1 of Higham (2002) for further details.

If  $\hat{x}$  is the true solution, then the computed solution  $x$  satisfies a forward error bound of the form

$$\frac{\|x - \hat{x}\|_\infty}{\|\hat{x}\|_\infty} \leq w_c \text{cond}(A, \hat{x}, b),$$

where  $\text{cond}(A, \hat{x}, b) = \frac{\| |A^{-1}|(|A||\hat{x}| + |b|) \|_\infty}{\|\hat{x}\|_\infty} \leq \text{cond}(A) = \| |A^{-1}| |A| \|_\infty \leq \kappa_\infty(A)$ . If  $\hat{x}$  is the  $j$ th column of  $X$ , then  $w_c$  is returned in **berr**( $j$ ) and a bound on  $\|x - \hat{x}\|_\infty / \|\hat{x}\|_\infty$  is returned in **ferr**( $j$ ). See Section 4.4 of Anderson *et al.* (1999) for further details.

## 8 Further Comments

The factorization of  $A$  requires approximately  $\frac{1}{3}n^3$  floating-point operations.

For each right-hand side, computation of the backward error involves a minimum of  $4n^2$  floating-point operations. Each step of iterative refinement involves an additional  $6n^2$  operations. At most five steps of iterative refinement are performed, but usually only one or two steps are required. Estimating the forward error involves solving a number of systems of equations of the form  $Ax = b$ ; the number is usually 4 or 5 and never more than 11. Each solution involves approximately  $2n^2$  operations.

The complex analogue of this function is nag\_lapack\_zppsvx (f07gp).

## 9 Example

This example solves the equations

$$AX = B,$$

where  $A$  is the symmetric positive definite matrix

$$A = \begin{pmatrix} 4.16 & -3.12 & 0.56 & -0.10 \\ -3.12 & 5.03 & -0.83 & 1.18 \\ 0.56 & -0.83 & 0.76 & 0.34 \\ -0.10 & 1.18 & 0.34 & 1.18 \end{pmatrix}$$

and

$$B = \begin{pmatrix} 8.70 & 8.30 \\ -13.35 & 2.13 \\ 1.89 & 1.61 \\ -4.14 & 5.00 \end{pmatrix}.$$

Error estimates for the solutions, information on equilibration and an estimate of the reciprocal of the condition number of the scaled matrix  $A$  are also output.

## 9.1 Program Text

```
function f07gb_example

fprintf('f07gb example results\n\n');

% Symmetric matrix A, upper triangular part packed in ap
uplo = 'U';
n = 4;
ap = [4.16   ...
      -3.12  5.03   ...
        0.56 -0.83  0.76   ...
      -0.10  1.18  0.34  1.18];

% Rhs
b = [ 8.70, 8.30;
     -13.35, 2.13;
        1.89, 1.61;
     -4.14, 5.00];

% Input parameters
fact = 'Equilibration';
uplo = 'U';
afp  = ap;
equed = ' ';
s     = zeros(n,1);

% Solve
[ap, afp, equed, s, b, x, rcond, ferr, berr, info] = ...
    f07gb( ...
        fact, uplo, ap, afp, equed, s, b);

disp('Solution(s)');
disp(x);
disp('Backward errors (machine-dependent)');
fprintf('%10.1e',berr);
fprintf('\n');
disp('Estimated forward error bounds (machine-dependent)');
fprintf('%10.1e',ferr);
fprintf('\n\n');
disp('Estimate of reciprocal condition number');
fprintf('%10.1e\n\n',rcond);

if equed=='N'
    fprintf('A has not been equilibrated\n');
else
    fprintf('A has been equilibrated\n');
end
```

## 9.2 Program Results

```
f07gb example results

Solution(s)
  1.0000    4.0000
 -1.0000    3.0000
  2.0000    2.0000
 -3.0000    1.0000

Backward errors (machine-dependent)
  6.7e-17    8.1e-17
Estimated forward error bounds (machine-dependent)
  2.3e-14    2.3e-14

Estimate of reciprocal condition number
  1.0e-02

A has not been equilibrated
```

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