NAG Library Routine Document

E05USF

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

E05USF is designed to find the global minimum of an arbitrary smooth sum of squares function subject to constraints (which may include simple bounds on the variables, linear constraints and smooth nonlinear constraints) by generating a number of different starting points and performing a local search from each using sequential quadratic programming.

2 Specification

```
SUBROUTINE EO5USF (M, N, NCLIN, NCNLN, A, LDA, BL, BU, Y, CONFUN, OBJFUN,
                   NPTS, X, LDX, START, REPEAT1, NB, OBJF, F, FJAC, LDFJAC,
                   SDFJAC, ITER, C, LDC, CJAC, LDCJAC, SDCJAC, CLAMDA,
                   LDCLDA, ISTATE, LISTAT, IOPTS, OPTS, IUSER, RUSER, INFO,
INTEGER
                   M, N, NCLIN, NCNLN, LDA, NPTS, LDX, NB, LDFJAC, SDFJAC,
                                                                                 ۶
                   ITER(NB), LDC, LDCJAC, SDCJAC, LDCLDA,
                   ISTATE(LISTAT,*), LISTAT, IOPTS(740), IUSER(*),
                                                                                 &
                   INFO(NB), IFAIL
REAL (KIND=nag_wp) A(LDA,*), BL(N+NCLIN+NCNLN), BU(N+NCLIN+NCNLN), Y(M),
                                                                                 &
                   X(LDX,*), OBJF(NB), F(M,*), FJAC(LDFJAC,SDFJAC,*),
                                                                                 &
                   C(LDC,*), CJAC(LDCJAC,SDCJAC,*), CLAMDA(LDCLDA,*),
                   OPTS(485), RUSER(*)
LOGICAL
                   REPEAT1
EXTERNAL
                   CONFUN, OBJFUN, START
```

Before calling E05USF, the optional parameter arrays IOPTS and OPTS **must** be initialized for use with E05USF by calling E05ZKF with OPTSTR set to 'Initialize = e05usf'. Optional parameters may subsequently be specified by calling E05ZKF before the call to E05USF.

3 Description

The local minimization method is E04USA. The problem is assumed to be stated in the following form:

$$\underset{x \in R^n}{\text{minimize}} \ F(x) = \frac{1}{2} \sum_{i=1}^m (y_i - f_i(x))^2 \qquad \text{subject to} \qquad l \le \begin{pmatrix} x \\ A_L x \\ c(x) \end{pmatrix} \le u, \tag{1}$$

where F(x) (the objective function) is a nonlinear function which can be represented as the sum of squares of m subfunctions $(y_1 - f_1(x)), (y_2 - f_2(x)), \dots, (y_m - f_m(x))$, the y_i are constant, A_L is an n_L by n constant linear constraint matrix, and c(x) is an n_N element vector of nonlinear constraint functions. (The matrix A_L and the vector c(x) may be empty.) The objective function and the constraint functions are assumed to be smooth, i.e., at least twice-continuously differentiable. (The method of E04USA will usually solve (1) if any isolated discontinuities are away from the solution.)

E05USF solves a user-specified number of local optimization problems with different starting points. You may specify the starting points via the subroutine START. If a random number generator is used to generate the starting points then the parameter REPEAT1 allows you to specify whether a repeatable set of points are generated or whether different starting points are generated on different calls. The resulting local minima are ordered and the best NB results returned in order of ascending values of the resulting objective function values at the minima. Thus the value returned in position 1 will be the best result obtained. If a sufficiently high number of different points are chosen then this is likely to be the global minimum.

4 References

Gill P E, Murray W and Wright M H (1981) Practical Optimization Academic Press

Hock W and Schittkowski K (1981) Test Examples for Nonlinear Programming Codes. Lecture Notes in Economics and Mathematical Systems 187 Springer-Verlag

5 Parameters

1: M – INTEGER Input

On entry: m, the number of subfunctions associated with F(x).

Constraint: M > 0.

2: N – INTEGER Input

On entry: n, the number of variables.

Constraint: N > 0.

3: NCLIN – INTEGER Input

On entry: n_L , the number of general linear constraints.

Constraint: $NCLIN \ge 0$.

4: NCNLN – INTEGER Input

On entry: n_N , the number of nonlinear constraints.

Constraint: $NCNLN \ge 0$.

5: A(LDA,*) - REAL (KIND=nag wp) array Input

Note: the second dimension of the array A must be at least N if NCLIN > 0, and at least 1 otherwise.

On entry: the matrix A_L of general linear constraints in (1). That is, the *i*th row contains the coefficients of the *i*th general linear constraint, for i = 1, 2, ..., NCLIN.

If NCLIN = 0, the array A is not referenced.

6: LDA – INTEGER Input

On entry: the first dimension of the array A as declared in the (sub)program from which E05USF is called.

Constraint: LDA \geq NCLIN.

7: BL(N + NCLIN + NCNLN) - REAL (KIND=nag_wp) array
8: BU(N + NCLIN + NCNLN) - REAL (KIND=nag_wp) array

Input

Input

On entry: BL must contain the lower bounds and BU the upper bounds for all the constraints in the following order. The first n elements of each array must contain the bounds on the variables, the next n_L elements the bounds for the general linear constraints (if any) and the next n_N elements the bounds for the general nonlinear constraints (if any). To specify a nonexistent lower bound (i.e., $l_j = -\infty$), set $\mathrm{BL}(j) \leq -bigbnd$, and to specify a nonexistent upper bound (i.e., $u_j = +\infty$), set $\mathrm{BU}(j) \geq bigbnd$; the default value of bigbnd is 10^{20} , but this may be changed by the optional parameter **Infinite Bound Size**. To specify the jth constraint as an equality, set $\mathrm{BL}(j) = \mathrm{BU}(j) = \beta$, say, where $|\beta| < bigbnd$.

Constraints:

```
\mathrm{BL}(j) \leq \mathrm{BU}(j), for j = 1, 2, \ldots, \mathrm{N} + \mathrm{NCLIN} + \mathrm{NCNLN}; if \mathrm{BL}(j) = \mathrm{BU}(j) = \beta, |\beta| < bigbnd.
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9: Y(M) - REAL (KIND=nag_wp) array

Input

&

δ

On entry: the coefficients of the constant vector y of the objective function.

10: CONFUN – SUBROUTINE, supplied by the NAG Library or the user. External Procedure CONFUN must calculate the vector c(x) of nonlinear constraint functions and (optionally) its Jacobian ($=\frac{\partial c}{\partial x}$) for a specified n-element vector x. If there are no nonlinear constraints (i.e., NCNLN = 0), CONFUN will never be called by E05USF and CONFUN may be the dummy routine E04UDM. (E04UDM is included in the NAG Library.) If there are nonlinear constraints, the first call to CONFUN will occur before the first call to OBJFUN.

The specification of CONFUN is:

SUBROUTINE CONFUN (MODE, NCNLN, N, LDCJSL, NEEDC, X, C, CJSL,

NSTATE, IUSER, RUSER)

INTEGER MODE, NCNLN, N, LDCJSL, NEEDC(NCNLN), NSTATE,

IUSER(*)

REAL (KIND=nag_wp) X(N), C(NCNLN), CJSL(LDCJSL,*), RUSER(*)

1: MODE – INTEGER

Input/Output

On entry: indicates which values must be assigned during each call of CONFUN. Only the following values need be assigned, for each value of i such that NEEDC(i) > 0:

MODE = 0

C(i), the *i*th nonlinear constraint.

MODE = 1

All available elements in the ith row of CJSL.

MODE = 2

C(i) and all available elements in the *i*th row of CJSL.

On exit: may be set to a negative value if you wish to abandon the solution to the current local minimization problem. In this case E05USF will move to the next local minimization problem.

2: NCNLN - INTEGER

Input

On entry: n_N , the number of nonlinear constraints.

3: N – INTEGER Input

On entry: n, the number of variables.

4: LDCJSL – INTEGER

Input

On entry: LDCJSL is the first dimension of the array CJSL.

5: NEEDC(NCNLN) – INTEGER array

Input

On entry: the indices of the elements of C and/or CJSL that must be evaluated by CONFUN. If NEEDC(i) > 0, C(i) and/or the available elements of the *i*th row of CJSL (see parameter MODE) must be evaluated at x.

6: X(N) - REAL (KIND=nag wp) array

Input

On entry: x, the vector of variables at which the constraint functions and/or the available elements of the constraint Jacobian are to be evaluated.

7: C(NCNLN) – REAL (KIND=nag wp) array

Output

On exit: if NEEDC(i) > 0 and MODE = 0 or 2, C(i) must contain the value of $c_i(x)$. The remaining elements of C, corresponding to the non-positive elements of NEEDC, need not be set.

8: CJSL(LDCJSL,*) – REAL (KIND=nag_wp) array

Input/Output

CJSL may be regarded as a two-dimensional 'slice' of the three-dimensional array CJAC of E05USF.

On entry: unless **Derivative Level** = 2 or 3, the elements of CJSL are set to special values which enable E05USF to detect whether they are changed by CONFUN.

On exit: if NEEDC(i) > 0 and MODE = 1 or 2, the ith row of CJSL must contain the available elements of the vector ∇c_i given by

$$\nabla c_i = \left(\frac{\partial c_i}{\partial x_1}, \frac{\partial c_i}{\partial x_2}, \dots, \frac{\partial c_i}{\partial x_n}\right)^{\mathrm{T}},$$

where $\frac{\partial c_i}{\partial x_j}$ is the partial derivative of the *i*th constraint with respect to the *j*th variable, evaluated at the point x. See also the parameter NSTATE. The remaining rows of CJSL,

corresponding to non-positive elements of NEEDC, need not be set.

If all elements of the constraint Jacobian are known (i.e., **Derivative Level** = 2 or 3; note the default is **Derivative Level** = 3), any constant elements may be assigned to CJSL one time only at the start of each local optimization. An element of CJSL that is not subsequently assigned in CONFUN will retain its initial value throughout the local optimization. Constant elements may be loaded into CJSL during the first call to CONFUN for the local optimization (signalled by the value NSTATE = 1). The ability to preload constants is useful when many Jacobian elements are identically zero, in which case CJSL may be initialized to zero and nonzero elements may be reset by CONFUN.

Note that constant nonzero elements do affect the values of the constraints. Thus, if $\mathrm{CJSL}(i,j)$ is set to a constant value, it need not be reset in subsequent calls to CONFUN, but the value $\mathrm{CJSL}(i,j) \times \mathrm{X}(j)$ must nonetheless be added to $\mathrm{C}(i)$. For example, if $\mathrm{CJSL}(1,1) = 2$ and $\mathrm{CJSL}(1,2) = -5$ then the term $2 \times \mathrm{X}(1) - 5 \times \mathrm{X}(2)$ must be included in the definition of $\mathrm{C}(1)$.

It must be emphasized that, if **Derivative Level** = 0 or 1, unassigned elements of CJSL are not treated as constant; they are estimated by finite differences, at nontrivial expense. If you do not supply a value for the optional parameter **Difference Interval**, an interval for each element of x is computed automatically at the start of each local optimization. The automatic procedure can usually identify constant elements of CJSL, which are then computed once only by finite differences.

9: NSTATE – INTEGER

Input

On entry: if NSTATE = 1 then E05USF is calling CONFUN for the first time on the current local optimization problem. This parameter setting allows you to save computation time if certain data must be read or calculated only once.

10: IUSER(*) – INTEGER array

User Workspace

11: RUSER(*) – REAL (KIND=nag_wp) array

User Workspace

CONFUN is called with the parameters IUSER and RUSER as supplied to E05USF. You are free to use the arrays IUSER and RUSER to supply information to CONFUN as an alternative to using COMMON global variables.

CONFUN must either be a module subprogram USEd by, or declared as EXTERNAL in, the (sub)program from which E05USF is called. Parameters denoted as *Input* must **not** be changed by this procedure.

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CONFUN should be tested separately before being used in conjunction with E05USF. See also the description of the optional parameter **Verify**.

11: OBJFUN – SUBROUTINE, supplied by the user.

External Procedure

OBJFUN must calculate either the *i*th element of the vector $f(x) = (f_1(x), f_2(x), \dots, f_m(x))^T$ or all m elements of f(x) and (optionally) its Jacobian ($=\frac{\partial f}{\partial x}$) for a specified n-element vector x.

The specification of OBJFUN is:

```
SUBROUTINE OBJFUN (MODE, M, N, LDFJSL, NEEDFI, X, F, FJSL, NSTATE, IUSER, RUSER)
```

: MODE – INTEGER

Input/Output

On entry: indicates which values must be assigned during each call of OBJFUN. Only the following values need be assigned:

MODE = 0 and NEEDFI =
$$i$$
, where $i > 0$
F(i).

$$MODE = 0 \ and \ NEEDFI < 0$$

F.

MODE = 1 and NEEDFI < 0

All available elements of FJSL.

 $MODE = 2 \ and \ NEEDFI < 0$

F and all available elements of FJSL.

On exit: may be set to a negative value if you wish to abandon the solution to the current local minimization problem. In this case E05USF will move to the next local minimization problem.

2: M – INTEGER

Input

On entry: m, the number of subfunctions.

3: N − INTEGER

Input

On entry: n, the number of variables.

4: LDFJSL – INTEGER

Input

On entry: LDFJSL is the first dimension of the array FJSL.

5: NEEDFI – INTEGER

Input

On entry: if NEEDFI = i > 0, only the ith element of f(x) needs to be evaluated at x; the remaining elements need not be set. This can result in significant computational savings when $m \gg n$.

6: X(N) - REAL (KIND=nag wp) array

Input

On entry: x, the vector of variables at which the objective function and/or all available elements of its gradient are to be evaluated.

7: F(M) - REAL (KIND=nag wp) array

Output

On exit: if MODE = 0 and NEEDFI = i > 0, F(i) must contain the value of f_i at x.

If MODE = 0 or 2 and NEEDFI < 0, F(i) must contain the value of f_i at x, for i = 1, 2, ..., m.

8: FJSL(LDFJSL,*) – REAL (KIND=nag wp) array

Input/Output

FJSL may be regarded as a two-dimensional 'slice' of the three-dimensional array FJAC of E05USF.

On entry: is set to a special value.

On exit: if MODE = 1 or 2 and NEEDFI < 0, the *i*th row of FJSL must contain the available elements of the vector ∇f_i given by

$$\nabla f_i = (\partial f_i / \partial x_1, \partial f_i / \partial x_2, \dots, \partial f_i / \partial x_n)^{\mathrm{T}},$$

evaluated at the point x. See also the parameter NSTATE.

9: NSTATE – INTEGER

Input

On entry: if NSTATE = 1 then E05USF is calling OBJFUN for the first time on the current local optimization problem. This parameter setting allows you to save computation time if certain data must be read or calculated only once.

10: IUSER(*) – INTEGER array

User Workspace

11: RUSER(*) – REAL (KIND=nag wp) array

User Workspace

OBJFUN is called with the parameters IUSER and RUSER as supplied to E05USF. You are free to use the arrays IUSER and RUSER to supply information to OBJFUN as an alternative to using COMMON global variables.

OBJFUN must either be a module subprogram USEd by, or declared as EXTERNAL in, the (sub)program from which E05USF is called. Parameters denoted as *Input* must **not** be changed by this procedure.

OBJFUN should be tested separately before being used in conjunction with E05USF. See also the description of the optional parameter **Verify**.

12: NPTS – INTEGER

Input

On entry: the number of different starting points to be generated and used. The more points used, the more likely that the best returned solution will be a global minimum.

Constraint: $1 \le NB \le NPTS$.

13: X(LDX,*) - REAL (KIND=nag wp) array

Output

Note: the second dimension of the array X must be at least NB.

On exit: X(j,i) contains the final estimate of the ith solution, for $j=1,2,\ldots,N$.

14: LDX – INTEGER

Input

On entry: the first dimension of the array X as declared in the (sub)program from which E05USF is called.

Constraint: LDX \geq N.

15: START – SUBROUTINE, supplied by the NAG Library or the user.

External Procedure

START must calculate the NPTS starting points to be used by the local optimizer. If you do not wish to write a routine specific to your problem then E05UCZ may be used as the actual argument. E05UCZ is supplied in the NAG Library and uses the NAG quasi-random number generators to distribute starting points uniformly across the domain. It is affected by the value of REPEAT1.

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The specification of START is:

SUBROUTINE START (NPTS, QUAS, N, REPEAT1, BL, BU, IUSER, RUSER,

MODE)

INTEGER NPTS, N, IUSER(*), MODE

REAL (KIND=nag_wp) QUAS(N,NPTS), BL(N), BU(N), RUSER(*)

LOGICAL REPEAT1

1: NPTS - INTEGER

Input

On entry: indicates the number of starting points.

2: QUAS(N,NPTS) - REAL (KIND=nag wp) array

Input/Output

On entry: all elements of QUAS will have been set to zero, so only nonzero values need be set subsequently.

On exit: must contain the starting points for the NPTS local minimizations, i.e., QUAS(j,i) must contain the jth component of the ith starting point.

3: N – INTEGER Input

On entry: the number of variables.

4: REPEAT1 – LOGICAL

Input

On entry: specifies whether a repeatable or non-repeatable sequence of points are to be generated.

5: BL(N) - REAL (KIND=nag wp) array

Input

On entry: the lower bounds on the variables. These may be used to ensure that the starting points generated in some sense 'cover' the region, but there is no requirement that a starting point be feasible.

6: BU(N) - REAL (KIND=nag wp) array

Input

On entry: the upper bounds on the variables. (See BL.)

7: IUSER(*) - INTEGER array

User Workspace

8: RUSER(*) – REAL (KIND=nag_wp) array

User Workspace

START is called with the parameters IUSER and RUSER as supplied to E05USF. You are free to use the arrays IUSER and RUSER to supply information to START as an alternative to using COMMON global variables.

9: MODE – INTEGER

Input/Output

On entry: MODE will contain 0.

On exit: if you set MODE to a negative value then E05USF will terminate immediately with IFAIL = 9.

START must either be a module subprogram USEd by, or declared as EXTERNAL in, the (sub)program from which E05USF is called. Parameters denoted as *Input* must **not** be changed by this procedure.

16: REPEAT1 – LOGICAL

Input

On entry: is passed as an argument to START and may be used to initialize a random number generator to a repeatable, or non-repeatable, sequence. See Section 8 for more detail.

17: NB – INTEGER Input

On entry: the number of solutions to be returned. The routine saves up to NB local minima ordered by increasing value of the final objective function. If the defining criterion for 'best solution' is only that the value of the objective function is as small as possible then NB should be set to 1. However, if you want to look at other solutions that may have desirable properties then setting NB > 1 will produce NB local minima, ordered by increasing value of their objective functions at the minima.

Constraint: $1 \le NB \le NPTS$.

18: OBJF(NB) – REAL (KIND=nag wp) array

Output

On exit: OBJF(i) contains the value of the objective function at the final iterate for the ith solution.

19: F(M,*) - REAL (KIND=nag wp) array

Output

Note: the second dimension of the array F must be at least NB.

On exit: F(j,i) contains the value of the jth function f_j at the final iterate, for $j=1,2,\ldots,M$, for the jth solution, for $i=1,2,\ldots,NB$.

20: FJAC(LDFJAC,SDFJAC,*) - REAL (KIND=nag wp) array

Output

Note: the last dimension of the array FJAC must be at least NB.

On exit: for the *i*th returned solution, the Jacobian matrix of the functions f_1, f_2, \ldots, f_m at the final iterate, i.e., FJAC(k, j, i) contains the partial derivative of the *k*th function with respect to the *j*th variable, for $k = 1, 2, \ldots, M$, $j = 1, 2, \ldots, N$ and $i = 1, 2, \ldots, NB$. (See also the discussion of parameter FJSL under OBJFUN.)

21: LDFJAC – INTEGER

Input

On entry: the first dimension of the array FJAC as declared in the (sub)program from which E05USF is called.

Constraint: LDFJAC \geq M.

22: SDFJAC – INTEGER

Input

On entry: the second dimension of the array FJAC as declared in the (sub)program from which E05USF is called.

Constraint: SDFJAC > N.

23: ITER(NB) – INTEGER array

Output

On exit: ITER(i) contains the number of major iterations performed to obtain the ith solution. If less than NB solutions are returned then ITER(NB) contains the number of starting points that have resulted in a converged solution. If this is close to NPTS then this might be indicative that fewer than NB local minima exist.

24: C(LDC,*) – REAL (KIND=nag wp) array

Output

Note: the second dimension of the array C must be at least NB.

On exit: if NCNLN > 0, C(j, i) contains the value of the jth nonlinear constraint function c_j at the final iterate, for the ith solution, for j = 1, 2, ..., NCNLN.

If NCNLN = 0, the array C is not referenced.

25: LDC – INTEGER

Input

On entry: the first dimension of the array C as declared in the (sub)program from which E05USF is called.

Constraint: LDC > NCNLN.

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26: CJAC(LDCJAC,SDCJAC,*) - REAL (KIND=nag_wp) array

Output

Note: the last dimension of the array CJAC must be at least NB.

On exit: if NCNLN > 0, CJAC contains the Jacobian matrices of the nonlinear constraint functions at the final iterate for each of the returned solutions, i.e., CJAC(k, j, i) contains the partial derivative of the kth constraint function with respect to the jth variable, for k = 1, 2, ..., NCNLN and j = 1, 2, ..., N, for the ith solution. (See the discussion of parameter CJSL under CONFUN.)

If NCNLN = 0, the array CJAC is not referenced.

27: LDCJAC – INTEGER

Input

On entry: the first dimension of the array CJAC as declared in the (sub)program from which E05USF is called.

Constraint: LDCJAC > NCNLN.

28: SDCJAC – INTEGER

Input

On entry: the second dimension of the array CJAC as declared in the (sub)program from which E05USF is called.

Constraint: if NCNLN > 0, SDCJAC $\ge N$.

29: CLAMDA(LDCLDA,*) - REAL (KIND=nag_wp) array

Output

Note: the second dimension of the array CLAMDA must be at least NB.

On exit: the values of the QP multipliers from the last QP subproblem solved for the ith solution. CLAMDA(j, i) should be non-negative if ISTATE(j, i) = 1 and non-positive if ISTATE(j, i) = 2.

30: LDCLDA – INTEGER

Innu

On entry: the first dimension of the array CLAMDA as declared in the (sub)program from which E05USF is called.

Constraint: LDCLDA \geq N + NCLIN + NCNLN.

31: ISTATE(LISTAT,*) – INTEGER array

Output

Note: the second dimension of the array ISTATE must be at least NB.

On exit: ISTATE(j,i) contains the status of the constraints in the QP working set for the ith solution. The significance of each possible value of ISTATE(j,i) is as follows:

ISTATE(j, i) Meaning

- The constraint is satisfied to within the feasibility tolerance, but is not in the QP working set.
- This inequality constraint is included in the QP working set at its lower bound.
- This inequality constraint is included in the QP working set at its upper bound.
- This constraint is included in the QP working set as an equality. This value of ISTATE can occur only when BL(j) = BU(j).

32: LISTAT – INTEGER

Input

On entry: the first dimension of the array ISTATE as declared in the (sub)program from which E05USF is called.

Constraint: LISTAT $\geq N + NCLIN + NCNLN$.

33: IOPTS(740) – INTEGER array

Communication Array

34: OPTS(485) - REAL (KIND=nag_wp) array

Communication Array

The arrays IOPTS and OPTS **must not** be altered between calls to any of the routines E05USF and E05ZKF.

35: IUSER(*) - INTEGER array

User Workspace

36: RUSER(*) – REAL (KIND=nag wp) array

User Workspace

IUSER and RUSER are not used by E05USF, but are passed directly to CONFUN, OBJFUN and START and may be used to pass information to these routines as an alternative to using COMMON global variables.

With SMP-enabled versions of E05USF the arrays IUSER and RUSER provided are classified as OpenMP shared memory. Use of IUSER and RUSER has to take account of this in order to preserve thread safety whenever information is written back to either of these arrays.

37: INFO(NB) – INTEGER array

Output

On exit: if IFAIL > 0, INFO(i) contains an error value returned by E04USF/E04USA; in which case please refer to that routine document for a detailed explanation.

If IFAIL = 8 on exit, then not all NB solutions have been found, and INFO(NB) contains the number of solutions actually found.

38: 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, because for this routine the values of the output parameters may be useful even if IFAIL $\neq 0$ on exit, the recommended value is -1. 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).

Note: E05USF may return useful information for one or more of the following detected errors or warnings.

Errors or warnings detected by the routine:

IFAIL = 1

An input value is incorrect. One or more of the following requirements are violated:

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On entry, BL(i) > BU(i): i = \langle value \rangle.
Constraint: BL(i) \leq BU(i), for all i.
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On entry, LDA = $\langle value \rangle$ and NCLIN = $\langle value \rangle$.

Constraint: LDA \geq NCLIN.

On entry, LDC = $\langle value \rangle$ and NCNLN = $\langle value \rangle$.

Constraint: LDC \geq NCNLN.

On entry, LDCJAC = $\langle value \rangle$ and NCNLN = $\langle value \rangle$.

Constraint: LDCJAC \geq NCNLN.

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On entry, LDCLDA = \langle value \rangle, N = \langle value \rangle, NCLIN = \langle value \rangle and NCNLN = \langle value \rangle.
Constraint: LDCLDA > N + NCLIN + NCNLN.
On entry, LDFJAC = \langle value \rangle and M = \langle value \rangle.
Constraint: LDFJAC \geq M.
On entry, LDX = \langle value \rangle and N = \langle value \rangle.
Constraint: LDX > N.
On entry, LISTAT = \langle value \rangle, N = \langle value \rangle, NCLIN = \langle value \rangle and NCNLN = \langle value \rangle.
Constraint: LISTAT > N + NCLIN + NCNLN.
On entry, M = \langle value \rangle.
Constraint: M > 0.
On entry, N = \langle value \rangle.
Constraint: N > 0.
On entry, NB = \langle value \rangle and NPTS = \langle value \rangle.
Constraint: 1 \le NB \le NPTS.
On entry, NCLIN = \langle value \rangle.
Constraint: NCLIN \ge 0.
On entry, NCNLN = \langle value \rangle.
Constraint: NCNLN > 0.
On entry, NCNLN > 0, SDCJAC = \langle value \rangle and N = \langle value \rangle.
Constraint: if NCNLN > 0, SDCJAC > N.
On entry, SDFJAC = \langle value \rangle and N = \langle value \rangle.
Constraint: SDFJAC > N.
```

IFAIL = 2

E05USF has terminated without finding any solutions. The majority of calls to the local optimizer have failed to find a feasible point for the linear constraints and bounds, which means that either no feasible point exists for the given value of the optional parameter **Linear Feasibility Tolerance** (default value $\sqrt{macheps}$, where macheps is the $machine\ precision$), or no feasible point could be found in the number of iterations specified by the optional parameter **Minor Iteration Limit**. You should check that there are no constraint redundancies. If the data for the constraints are accurate only to an absolute precision σ , you should ensure that the value of the optional parameter **Linear Feasibility Tolerance** is greater than σ . For example, if all elements of A_L are of order unity and are accurate to only three decimal places, **Linear Feasibility Tolerance** should be at least 10^{-3} .

No solution obtained. Linear constraints may be infeasible.

IFAIL = 3

E05USF has failed to find any solutions. The majority of local optimizations could not find a feasible point for the nonlinear constraints. The problem may have no feasible solution. This behaviour will occur if there is no feasible point for the nonlinear constraints. (However, there is no general test that can determine whether a feasible point exists for a set of nonlinear constraints.)

No solution obtained. Nonlinear constraints may be infeasible.

IFAIL = 4

E05USF has failed to find any solutions. The majority of local optimizations have failed because the limiting number of iterations have been reached.

No solution obtained. Many potential solutions reach iteration limit.

IFAIL = 7

User-supplied derivatives probably wrong. The user-supplied derivatives of the objective function and/or nonlinear constraints appear to be incorrect.

Large errors were found in the derivatives of the objective function and/or nonlinear constraints. This value of IFAIL will occur if the verification process indicated that at least one gradient or Jacobian element had no correct figures. You should refer to or enable the printed output to determine which elements are suspected to be in error.

As a first-step, you should check that the code for the objective and constraint values is correct – for example, by computing the function at a point where the correct value is known. However, care should be taken that the chosen point fully tests the evaluation of the function. It is remarkable how often the values x=0 or x=1 are used to test function evaluation procedures, and how often the special properties of these numbers make the test meaningless.

Gradient checking will be ineffective if the objective function uses information computed by the constraints, since they are not necessarily computed before each function evaluation.

Errors in programming the function may be quite subtle in that the function value is 'almost' correct. For example, the function may not be accurate to full precision because of the inaccurate calculation of a subsidiary quantity, or the limited accuracy of data upon which the function depends. A common error on machines where numerical calculations are usually performed in double precision is to include even one single precision constant in the calculation of the function; since some compilers do not convert such constants to double precision, half the correct figures may be lost by such a seemingly trivial error.

IFAIL = 8

Only \(\forall value \rangle \) solutions obtained.

Not all NB solutions have been found. INFO(NB) contains the number actually found.

IFAIL = 9

User terminated computation from START procedure: $MODE = \langle value \rangle$.

If E05UCZ has been used as an actual argument for START then the message displayed, when IFAIL = 0 or -1 on entry to E05USF, will have the following meaning:

998 failure to allocate space, a smaller value of NPTS should be tried.

997 an internal error has occurred. Please contact NAG for assistance.

IFAIL = 10

Failed to initialize optional parameter arrays.

IFAIL = -999

Dynamic memory allocation failed.

7 Accuracy

If IFAIL = 0 on exit and the value of INFO(i) = 0, then the vector returned in the array X for solution i is an estimate of the solution to an accuracy of approximately **Optimality Tolerance**.

8 Further Comments

You should be wary of requesting much intermediate output from the local optimizer, since large volumes may be produced if NPTS is large.

The auxiliary routine E05UCZ makes use of the NAG quasi-random Sobol generator (G05YLF and G05YMF). If E05UCZ is used as the actual argument for START (see the description of START) and REPEAT1 = .FALSE. then a randomly chosen value for ISKIP is used, otherwise ISKIP is set to 100. If REPEAT1 is set to .FALSE. and the program is executed several times, each time producing the same best answer, then there is increased probability that this answer is a global minimum. However, if it is important that identical results be obtained on successive runs, then REPEAT1 should be set to .TRUE..

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8.1 Description of the Printed Output

See Section 8.1 in E04USF/E04USA.

9 Example

This example is based on Problem 57 in Hock and Schittkowski (1981) and involves the minimization of the sum of squares function

$$F(x) = \frac{1}{2} \sum_{i=1}^{44} (y_i - f_i(x))^2,$$

where

$$f_i(x) = x_1 + (0.49 - x_1)e^{-x_2(a_i - 8)}$$

and

8 23 0.41 0.49 22 0.49 8 24 0.40 0.48 10 25 0.42 4 0.47 10 26 0.40 0.48 10 27 0.40 0.47 10 28 0.41 0.46 12 0.40 0.46 12 30 0.41 26 0.45 12 31 0.41 10 0.43 12 32 0.40 11 0.45 14 33 0.4030 12 0.43 14 0.40 13 0.43 14 35 0.38 30 14 0.44 16 0.41 15 0.43 16 37 0.40 16 0.43 16 38 0.40 18 39 17 18 0.4518 40 0.38 36 19 0.42 20 41 0.40 20 0.42 20 42 0.40 38 21 0.43 20 43 0.39 40

subject to the bounds

$$x_1 \ge 0.4$$

$$x_2 \ge -4.0$$

to the general linear constraint

$$x_1 + x_2 \ge 1.0$$

and to the nonlinear constraint

$$0.49x_2 - x_1x_2 \ge 0.09.$$

The optimal solution (to five figures) is

$$x^* = (0.41995, 1.28484)^{\mathrm{T}},$$

and $F(x^*) = 0.01423$. The nonlinear constraint is active at the solution.

The document for E04UQF/E04UQA includes an example program to solve the same problem using some of the optional parameters described in Section 11.

9.1 Program Text

```
E05USF Example Program Text
!
    Mark 24 Release. NAG Copyright 2012.
    Module e05usfe_mod
      E05USF Example Program Module:
              Parameters and User-defined Routines
!
!
      .. Use Statements ..
      Use nag_library, Only: nag_wp
      .. Implicit None Statement ..
      Implicit None
    Contains
      Subroutine objfun(mode,m,n,ldfjsl,needfi,x,f,fjsl,nstate,iuser,ruser)
        Evaluates the subfunctions and their 1st derivatives.
         .. Parameters ..
        Real (Kind=nag_wp), Parameter
                                                :: a(44) = (/8.\_nag\_wp, 8.\_nag\_wp, &
             10._nag_wp,10._nag_wp,10._nag_wp,10._nag_wp,12._nag_wp,12._nag_wp, &
             12._nag_wp,12._nag_wp,14._nag_wp,14._nag_wp,14._nag_wp,16._nag_wp, &
             16._nag_wp,16._nag_wp,18._nag_wp,18._nag_wp,20._nag_wp,20._nag_wp, &
             20._nag_wp,22._nag_wp,22._nag_wp,22._nag_wp,24._nag_wp,24._nag_wp, &
             24._nag_wp,26._nag_wp,26._nag_wp,26._nag_wp,28._nag_wp,28._nag_wp, &
             30._nag_wp,30._nag_wp,30._nag_wp,32._nag_wp,32._nag_wp,34._nag_wp, &
             36._nag_wp,36._nag_wp,38._nag_wp,38._nag_wp,40._nag_wp,42._nag_wp/)
        .. Scalar Arguments ..
        Integer, Intent (In)
                                               :: ldfjsl, m, n, needfi, nstate
        Integer, Intent (Inout)
.. Array Arguments ..
                                                :: mode
!
        Real (Kind=nag_wp), Intent (Out)
                                                :: f(m)
        Real (Kind=nag_wp), Intent (Inout) :: fjsl(ldfjsl,*), ruser(*)
        Real (Kind=nag_wp), Intent (In)
                                            :: x(n)
        Integer, Intent (Inout)
.. Local Scalars ..
                                                 :: iuser(*)
!
        Real (Kind=nag_wp)
                                                :: temp
        Integer
                                                 :: i
!
        .. Intrinsic Procedures ..
        Intrinsic
                                                 :: exp
         .. Executable Statements ..
        Do i = 1, m
loop:
          temp = \exp(-x(2)*(a(i)-8._naq_wp))
          If (mode==0 .Or. mode==2) Then
             f(i) = x(1) + (0.49_nag_wp-x(1))*temp
          End If
          If (needfi==i) Then
            Exit loop
          End If
          If (mode==1 .Or. mode==2) Then
             fjsl(i,1) = 1.\_nag\_wp - temp
             fjsl(i,2) = -(0.49_nag_wp-x(1))*(a(i)-8._nag_wp)*temp
          End If
        End Do loop
        Return
      End Subroutine objfun
      Subroutine confun(mode,ncnln,n,ldcjsl,needc,x,c,cjsl,nstate,iuser,ruser)
        Evaluates the nonlinear constraints and their 1st derivatives.
1
        .. Scalar Arguments ..
1
        Integer, Intent (In)
Integer, Intent (Inout)
                                                 :: ldcjsl, n, ncnln, nstate
                                                 :: mode
        .. Array Arguments ..
        Real (Kind=nag_wp), Intent (Out) :: c(ncnln)
Real (Kind=nag_wp), Intent (Inout) :: cjsl(ldcjsl,*), ruser(*)
Real (Kind=nag_wp), Intent (In) :: x(n)
```

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```
:: iuser(*)
:: needc(ncnln)
        Integer, Intent (Inout)
        Integer, Intent (In)
        .. Executable Statements ..
!
        If (nstate==1) Then
          First call to CONFUN. Set all Jacobian elements to zero.
          Note that this will only work when 'Derivative Level = 3'
1
          (the default; see Section 11.1 of the EO4USA document).
          cjsl(1:ncnln,1:n) = 0._nag_wp
        End If
        If (needc(1)>0) Then
          If (mode==0 .Or. mode==2) Then
            c(1) = -0.09_{nag_wp} - x(1)*x(2) + 0.49_{nag_wp}*x(2)
          End If
          If (mode==1 .Or. mode==2) Then
            cjsl(1,1) = -x(2)
            cjsl(1,2) = -x(1) + 0.49_nag_wp
          End If
        End If
        Return
     End Subroutine confun
     Subroutine start(npts,quas,n,repeat1,bl,bu,iuser,ruser,mode)
1
        Sets an initial point.
!
        A typical user-defined start procedure.
        .. Scalar Arguments ..
!
        Integer, Intent (Inout)
                                              :: mode
        Integer, Intent (In)
Logical, Intent (In)
                                              :: n, npts
                                              :: repeat1
        .. Array Arguments ..
!
        Integer, Intent (Inout)
                                              :: iuser(*)
!
        .. Executable Statements ..
        quas is pre-assigned to zero.
!
        quas(1,1) = 0.4_nag_wp
        quas(2,2) = 1._nag_wp
        Return
     End Subroutine start
    End Module e05usfe_mod
    Program e05usfe
     E05USF Example Main Program
1
      .. Use Statements ..
      Use nag_library, Only: dgemv, e05usf, e05zkf, nag_wp
      Use e05usfe_mod, Only: confun, objfun, start
!
      .. Implicit None Statement ..
     Implicit None
      .. Parameters ..
!
                                             :: liopts = 740, lopts = 485,
      Integer, Parameter
                                                m = 44, n = 2, nb = 1,
                                                nclin = 1, ncnln = 1, nin = 5,
                                                nout = 6, npts = 3
     Integer, Parameter
Integer, Parameter
Integer, Parameter
                                             :: sdfjac = n
                                            :: lda = nclin
                                            :: ldc = ncnln
     Integer, Parameter
                                            :: ldcjac = ncnln
     Integer, Parameter
Integer, Parameter
Integer, Parameter
                                            :: ldclda = n + nclin + ncnln
                                            :: ldfjac = m
:: ldx = n
     Integer, Parameter
                                            :: listat = n + nclin + ncnln
     Logical, Parameter
                                            :: repeat1 = .True.
      .. Local Scalars ..
      Integer
                                             :: i, ifail, j, k, l, sda, sdcjac
```

```
.. Local Arrays ..
      Real (Kind=nag_wp), Allocatable
                                             :: a(:,:), bl(:), bu(:), c(:,:),
                                                cjac(:,:,:), clamda(:,:),
                                                f(:,:), fjac(:,:,:), work(:),
                                                x(:,:), y(:)
      Real (Kind=nag_wp)
                                             :: objf(nb), opts(lopts), ruser(1)
                                             :: info(nb), iopts(liopts),
  iter(nb), iuser(1)
      Integer
      Integer, Allocatable
                                             :: istate(:,:)
!
      .. Intrinsic Procedures ..
      Intrinsic
                                             :: max
      .. Executable Statements ..
!
      Write (nout,*) 'E05USF Example Program Results'
      Flush (nout)
      Skip heading in data file.
      Read (nin,*)
      If (nclin>0) Then
        sda = n
      Else
        sda = 1
      End If
      If (ncnln>0) Then
        sdcjac = n
      Else
        sdcjac = 0
      End If
      Allocate (a(lda,sda),bl(n+nclin+ncnln),bu(n+nclin+ncnln),y(m),c(ldc,nb), &
        cjac(ldcjac,sdcjac,nb),f(m,nb),fjac(ldfjac,sdfjac,nb), &
        clamda(ldclda,nb),istate(listat,nb),x(ldx,nb),work(max(1,nclin)))
      If (nclin>0) Then
        Read (nin,*)(a(i,1:sda),i=1,nclin)
      End If
      Read (nin,*) y(1:m)
Read (nin,*) bl(1:(n+nclin+ncnln))
      Read (nin,*) bu(1:(n+nclin+ncnln))
      Initialize the solver.
!
      ifail = 0
      Call e05zkf('Initialize = E05USF',iopts,liopts,opts,lopts,ifail)
      Solve the problem.
      ifail = -1
      Call e05usf(m,n,nclin,ncnln,a,lda,bl,bu,y,confun,objfun,npts,x,ldx, &
        start,repeat1,nb,objf,f,fjac,ldfjac,sdfjac,iter,c,ldc,cjac,ldcjac, &
        sdcjac,clamda,ldclda,istate,listat,iopts,opts,iuser,ruser,info,ifail)
      Select Case (ifail)
      Case (0)
        1 = nb
      Case (8)
       l = info(nb)
        Write (nout, 99999) iter(nb)
      Case Default
        Go To 100
      End Select
loop: Do i = 1, 1
        Write (nout, 99998) i
        Write (nout, 99997) info(i)
        Write (nout,99996) 'Varbl'
        Do j = 1, n
          Write (nout,99995) V', j, istate(j,i), x(j,i), clamda(j,i)
        End Do
```

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```
If (nclin>0) Then
                      Write (nout, 99996) 'L Con'
                      Below is a call to the level 2 BLAS routine DGEMV.
1
                      This performs the matrix vector multiplication A*X
                      (linear constraint values) and puts the result in
                      the first NCLIN locations of WORK.
1
                      Call dgemv('N',nclin,n,1.0_nag_wp,a,lda,x(1,i),1,0.0_nag_wp,work,1)
                      Do k = n + 1, n + nclin
                          j = k - n
                          Write (nout,99995) L', j, istate(k,i), work(j), clamda(k,i)
                      End Do
                  End If
                  If (ncnln>0) Then
                      Write (nout, 99996) 'N Con'
                      Do k = n + nclin + 1, n + nclin + ncnln
                           j = k - n - nclin
                          Write (nout, 99995) 'N', j, istate(k,i), c(j,i), clamda(k,i)
                      End Do
                  End If
                  Write (nout, 99994) objf(i)
                  Write (nout, 99993)
                  Write (nout, 99992)(clamda(k,i), k=1, n+nclin+ncnln)
                  If (l==1) Then
                     Exit loop
                  End If
                  Write (nout,*)
                  Write (nout,*) &
                                                    End Do loop
100
             Continue
99999 Format (1X,I20,'starting points converged')
99998 Format (/1X,'Solution number',I16)
99997 Format (/1X,'Local minimization exited with code', I5)
99996 Format (/1X,A,2X,'Istate',3X,'Value',9X,'Lagr Mult'/)
99995 Format (1X,A,2(1X,I3),4X,F12.4,2X,F12.4)
99994 Format (/1X,'Final objective value = ',1X,F12.4)
99993 Format (/1X,'QP multipliers')
99992 Format (1X,F12.4)
        End Program e05usfe
9.2
       Program Data
E05USF Example Program Data
                                                                                     :End of matrix A
    1.0
               1.0
    0.49 0.49 0.48 0.47 0.48 0.47 0.46 0.46 0.45 0.43 0.45
    0.43  0.43  0.44  0.43  0.43  0.46  0.45  0.42  0.42  0.43  0.41  0.41  0.40  0.42  0.40  0.40  0.41  0.40  0.41  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  0.40  
                       -4.0
                                                                0.0
                                                                                    :End of BL
                                            1.0
    1.0E+25    1.0E+25    1.0E+25    1.0E+25    :End of BU
           Program Results
  E05USF Example Program Results
  Solution number
  Local minimization exited with code
  Varbl Istate Value
                                                       Lagr Mult
```

V V	1 2	0 0	0.4200 1.2848	0.0000 0.0000	
L	Con	Istate	Value	Lagr Mult	
L	1	0	1.7048	0.0000	
N	Con	Istate	Value	Lagr Mult	
N	1	1	-0.0000	0.0334	
Fi	nal	objective	value =	0.0142	
QP multipliers 0.0000 0.0000 0.0000 0.0334					

10 Algorithmic Details

See Section 10 in E04USF/E04USA.

11 Optional Parameters

Several optional parameters in E05USF define choices in the problem specification or the algorithm logic. In order to reduce the number of formal parameters of E05USF these optional parameters have associated *default values* that are appropriate for most problems. Therefore you need only specify those optional parameters whose values are to be different from their default values.

Optional parameters may be specified by calling E05ZKF before a call to E05USF. Before calling E05USF, the optional parameter arrays IOPTS and OPTS **must** be initialized for use with E05USF by calling E05ZKF with OPTSTR set to 'Initialize = e05usf'.

All optional parameters not specified are set to their default values. Optional parameters specified are unaltered by E05USF (unless they define invalid values) and so remain in effect for subsequent calls to E05USF.

See Section 11 in E04USF/E04USA for full details.

The Warm Start option of E04USF/E04USA is not a valid option for use with E05USF.

12 Description of Monitoring Information

See Section 12 in E04USF/E04USA.

E05USF.18 (last)

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