NAG Fortran Library Routine Document E04WDF

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.

Note: this routine uses **optional parameters** to define choices in the problem specification and in the details of the algorithm. If you wish to use default settings for all of the optional parameters, you need only read Sections 1 to 9 of this document. Refer to the additional Sections 10, 11 and 12 for a detailed description of the algorithm, the specification of the optional parameters and a description of the monitoring information produced by the routine.

1 Purpose

E04WDF is designed to minimize an arbitrary smooth function subject to constraints (which may include simple bounds on the variables, linear constraints and smooth nonlinear constraints) using a sequential quadratic programming (SQP) method. As many first derivatives as possible should be supplied by the user; any unspecified derivatives are approximated by finite differences. It is not intended for large sparse problems.

E04WDF may also be used for unconstrained, bound-constrained and linearly constrained optimization.

E04WDF uses **forward communication** for evaluating the objective function, the nonlinear constraint functions, and any of their derivatives.

The initialization routine E04WCF must have been called prior to calling E04WDF.

2 Specification

```
SUBROUTINE EO4WDF (N, NCLIN, NCNLN, LDA, LDCJ, LDH, A, BL, BU, CONFUN,
                    OBJFUN, MAJITS, ISTATE, CCON, CJAC, CLAMDA, OBJF,
2
                     GRAD, HESS, X, IW, LENIW, RW, LENRW, IUSER, RUSER,
3
                     IFAIL)
 INTEGER
                     N, NCLIN, NCNLN, LDA, LDCJ, LDH, MAJITS,
                     ISTATE(nctotl), IW(LENIW), LENIW, LENRW, IUSER(*),
 double precision
                     A(LDA,*), BL(nctotl), BU(nctotl), CCON(*), CJAC(LDCJ,*),
                     CLAMDA(nctotl), OBJF, GRAD(N), HESS(LDH,*), X(N),
1
                     RW(LENRW), RUSER(*)
 EXTERNAL
                    CONFUN, OBJFUN
```

See the note at the beginning of Section 5 for a description of nctotl.

Before calling E04WDF, or any of the option setting routines E04WEF, E04WFF, E04WGF or E04WHF, routine E04WCF **must** be called. The specification for E04WCF is:

```
SUBROUTINE E04WCF (IW, LENIW, RW, LENRW, IFAIL)

INTEGER

IW(LENIW), LENIW, LENRW, IFAIL

double precision

RW(LENRW)
```

E04WCF **must** be called with LENIW and LENRW, the declared lengths of IW and RW respectively, satisfying:

```
LENIW \geq 600;
LENRW \geq 600.
```

The contents of the arrays IW and RW **must not** be altered between calls of the routines E04WCF, E04WDF, E04WGF and E04WHF.

3 Description

E04WDF is designed to solve nonlinear programming problems – the minimization of a smooth nonlinear function subject to a set of constraints on the variables. E04WDF is suitable for small dense problems. The problem is assumed to be stated in the following form:

$$\underset{x \in R^n}{\text{minimize }} F(x) \quad \text{subject to} \quad l \le \begin{pmatrix} x \\ A_L x \\ c(x) \end{pmatrix} \le u, \tag{1}$$

where F(x) (the objective function) is a nonlinear function, A_L is an n_L by n constant 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 E04WDF will usually solve (1) if there are only isolated discontinuities away from the solution.)

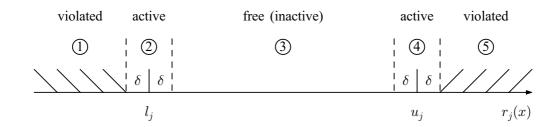
Note that although the bounds on the variables could be included in the definition of the linear constraints, we prefer to distinguish between them for reasons of computational efficiency. For the same reason, the linear constraints should **not** be included in the definition of the nonlinear constraints. Upper and lower bounds are specified for all the variables and for all the constraints. An *equality* constraint can be specified by setting $l_i = u_i$. If certain bounds are not present, the associated elements of l or u can be set to special values that will be treated as $-\infty$ or $+\infty$. (See the description of the optional parameter **Infinite Bound Size** in Section 11.2.)

A typical invocation of E04WDF would be:

```
call E04WCF (IW, LENIW, ...)
call E04WEF (ISPECS, IW, ...)
call E04WDF (N, NCLIN, NCNLN, ...)
```

where E04WEF reads a file of optional definitions.

Table 1 illustrates the feasible region for the jth pair of constraints $\ell_j \leq r_j(x) \leq u_j$. The quantity of δ is the optional parameter **Feasibility Tolerance**, which can be set by the user (see Section 11). The constraints $\ell_j \leq r_j \leq u_j$ are considered 'satisfied' if r_j lies in Regions 2, 3 or 4, and 'inactive' if r_j lies in Region 3. The constraint $r_j \geq l_j$ is considered 'active' in Region 2, and 'violated' in Region 1. Similarly, $r_j \leq u_j$ is active in Region 4, and violated in Region 5. For equality constraints ($\ell_j = u_j$), Regions 2 and 4 are the same and Region 3 is empty.



If there are no nonlinear constraints in (1) and F is linear or quadratic, then it will generally be more efficient to use one of E04MFF/E04MFA, E04NCF/E04NCA or E04NFF/E04NFA. If the problem is large and sparse and does have nonlinear constraints, then E04VHF should be used, since E04WDF treats all matrices as dense.

The user must supply an initial estimate of the solution to (1), together with subroutines that define F(x), c(x) and as many first partial derivatives as possible; unspecified derivatives are approximated by finite differences.

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The objective function is defined by subroutine OBJFUN, and the nonlinear constraints are defined by subroutine CONFUN. On every call, these subroutines must return appropriate values of the objective and nonlinear constraints. The user should also provide the available partial derivatives. Any unspecified derivatives are approximated by finite differences; see Section 11.2 for a discussion of the optional parameter **Derivative Level**. Just before either OBJFUN or CONFUN is called, each element of the current gradient array GRAD or CJAC is initialized to a special value. On exit, any element that retains the value is estimated by finite differences. Note that if there *are* any nonlinear constraints then the *first* call to CONFUN will precede the *first* call to OBJFUN.

For maximum reliability, it is preferable for the user to provide all partial derivatives (see Chapter 8 of Gill *et al.* (1981), for a detailed discussion). If all gradients cannot be provided, it is similarly advisable to provide as many as possible. While developing the subroutines OBJFUN and CONFUN, the optional parameter **Verify Level** (see Section 11.2) should be used to check the calculation of any known gradients.

The method used by E04WDF is described in detail in Section 10.

4 References

Eldersveld S K (1991) Large-scale sequential quadratic programming algorithms *PhD Thesis* Department of Operations Research, Stanford University, Stanford

Fourer R (1982) Solving staircase linear programs by the simplex method Math. Programming 23 274–313

Gill P E, Murray W and Saunders M A (1999) Users' guide for SQOPT 5.3: a Fortran package for large-scale linear and quadratic programming *Report SOL 99* Department of Operations Research, Stanford University

Gill P E, Murray W and Saunders M A (2002) SNOPT: An SQP Algorithm for Large-scale Constrained Optimization 12 979–1006 SIAM J. Optim.

Gill P E, Murray W, Saunders M A and Wright M H (1986c) Users' guide for NPSOL (Version 4.0): a Fortran package for nonlinear programming *Report SOL 86-2* Department of Operations Research, Stanford University

Gill P E, Murray W, Saunders M A and Wright M H (1992) Some theoretical properties of an augmented Lagrangian merit function *Advances in Optimization and Parallel Computing* (ed P M Pardalos) 101–128 North Holland

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

Note 1: In the following specification of E04WDF, we define r(x) as the vector of combined constraint functions

$$r(x) = \begin{pmatrix} x \\ A_L x \\ c(x) \end{pmatrix},$$

and use nctotl to denote a variable that holds its dimension N + NCLIN + NCNLN.

1: N – INTEGER Input

On entry: n, the number of variables.

Constraint: N > 0.

2: NCLIN – INTEGER Input

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

Constraint: $NCLIN \geq 0$.

3: NCNLN – INTEGER Input

On entry: n_N , the number of nonlinear constraints.

Constraint: $NCNLN \geq 0$.

4: LDA – INTEGER Input

On entry: the first dimension of the array A as declared in the (sub)program from which E04WDF is called

Constraint: LDA $\geq \max(1, \text{NCLIN})$.

5: LDCJ – INTEGER Input

On entry: the first dimension of the array CJAC as declared in the (sub)program from which E04WDF is called.

Constraint: $LDCJ \ge max(1, NCNLN)$.

6: LDH – INTEGER Input

On entry: the first dimension of the array HESS as declared in the (sub)program from which E04WDF is called.

Constraint: LDH \geq N.

7: A(LDA,*) – *double precision* 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 *i*th row of the array A must contain the *i*th row of 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 then the array A is not referenced.

8: BL(nctotl) - double precision array

Input

9: BU(nctotl) - double precision array

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 non-existent lower bound (i.e., $l_j = -\infty$), set $\mathrm{BL}(j) \leq -bigbnd$, and to specify a non-existent upper bound (i.e., $u_j = +\infty$), set $\mathrm{BU}(j) \geq bigbnd$; where bigbnd is the optional parameter **Infinite Bound Size** (see Section 11.2). 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 $j = 1, 2, \dots, nctotl$; if $\mathrm{BL}(j) = \mathrm{BU}(j) = \beta$, $|\beta| < bigbnd$.

10: CONFUN – SUBROUTINE, supplied by 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 E04WDF and CONFUN may be the dummy routine E04WDP. (E04WDP is included in the NAG Fortran Library and so need not be supplied by the user. Its name may be implementation-dependent: see the Users' Note for your implementation for details.) If there are nonlinear constraints, the first call to CONFUN will occur before the first call to OBJFUN.

If all constraint gradients (Jacobian elements) are known (i.e., **Derivative Level** = 2 or 3, any *constant* elements may be assigned to CJAC once only at the start of the optimization. An element of CJAC that is not subsequently assigned in CONFUN will retain its initial value throughout.

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Constant elements may be loaded in CJAC during the first call to CONFUN (signalled by the value of NSTATE = 1). The ability to preload constants is useful when many Jacobian elements are identically zero, in which case CJAC may be initialized to zero and non-zero elements may be reset by CONFUN.

It must be emphasized that, if **Derivative Level** < 2, unassigned elements of CJAC are *not* treated as constant; they are estimated by finite differences, at non-trivial expense.

Its specification is:

```
SUBROUTINE CONFUN (MODE, NCNLN, N, LDCJ, NEEDC, X, CCON, CJAC,

NSTATE, IUSER, RUSER)

INTEGER

MODE, NCNLN, N, LDCJ, NEEDC(*), NSTATE, IUSER(*)

double precision

X(N), CCON(*), CJAC(LDCJ,*), RUSER(*)
```

1: MODE – INTEGER

Input/Output

On entry: MODE is set by E04WDF to indicate 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:

if MODE = 0, the components of CCON corresponding to positive values in NEEDC must be set. Other components and the array CJAC are ignored;

if MODE = 1, the known components of the rows of CJAC corresponding to positive values in NEEDC must be set. Other rows of CJAC and the array CCON will be ignored;

if MODE = 2, only the elements of CCON corresponding to positive values of NEEDC need to be set (and similarly for the known components of the rows of CJAC).

On exit: MODE may be used to indicate that you are unable or unwilling to evaluate the constraint functions at the current x.

During the linesearch, the constraint functions are evaluated at points of the form $x=x_k+\alpha p_k$ after they have already been evaluated satisfactorily at x_k . At any such α , if you set MODE = -1, E04WDF will evaluate the functions at some point closer to x_k (where they are more likely to be defined).

If for some reason you wish to terminate the current problem, set MODE < -1.

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: LDCJ – INTEGER

Input

On entry: the first dimension of the array CJAC.

5: NEEDC(*) – INTEGER array

Input

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

6: X(N) – *double precision* 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: CCON(*) – *double precision* array

Output

On exit: if NEEDC(i) > 0 and MODE = 0 or 2, CCON(i) must contain the value of the ith constraint at x. The remaining elements of CCON, corresponding to the non-positive elements of NEEDC, are ignored.

8: CJAC(LDCJ,*) – *double precision* array

Input/Output

On entry: the elements of CJAC are set to special values which enable E04WDF to detect whether they are reset by CONFUN.

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

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

where $\frac{\partial c_i}{\partial x_i}$ 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 below. The remaining rows of CJAC, corresponding to non-positive elements of NEEDC, are ignored.

If all elements of the constraint Jacobian are known (i.e., **Derivative Level** = 2 or 3 (see Section 11.2)), any constant elements may be assigned to CJAC one time only at the start of the optimization. An element of CJAC that is not subsequently assigned in CONFUN will retain its initial value throughout. Constant elements may be loaded into CJAC during the first call to CONFUN (signalled by the value NSTATE = 1). The ability to preload constants is useful when many Jacobian elements are identically zero, in which case CJAC may be initialized to zero and non-zero elements may be reset by CONFUN.

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

It must be emphasized that, if **Derivative Level** = 0 or 1, unassigned elements of CJAC are not treated as constant; they are estimated by finite differences, at non-trivial expense. If the user does not supply a value for **Difference Interval** (see Section 11.2), an interval for each element of x is computed automatically at the start of the optimization. The automatic procedure can usually identify constant elements of CJAC, which are then computed once only by finite differences.

9: NSTATE – INTEGER

Input

On entry: if NSTATE = 1 then E04WDF is calling CONFUN for the first time. This parameter setting allows the user to save computation time if certain data must be read or calculated only once.

10: IUSER(*) – INTEGER array

Communication Array

11: RUSER(*) – *double precision* array

Communication Array

CONFUN is called from E04WDF with the parameters IUSER and RUSER as supplied to E04WDF. The user is free to use the arrays IUSER and RUSER to supply information to CONFUN as an alternative to using COMMON.

CONFUN must be declared as EXTERNAL in the (sub)program from which E04WDF is called. Parameters denoted as *Input* must **not** be changed by this procedure.

CONFUN should be tested separately before being used in conjunction with E04WDF. See also the optional parameter **Verify Level** in Section 11.2.

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11: OBJFUN – SUBROUTINE, supplied by the user.

External Procedure

OBJFUN must calculate the objective function F(x) and (optionally) its gradient $g(x) = \left(\frac{\partial F}{\partial x}\right)$ for a specified n element of vector x.

Its specification is:

SUBROUTINE OBJFUN (MODE, N, X, OBJF, GRAD, NSTATE, IUSER, RUSER)

1: MODE – INTEGER

Input/Output

On entry: MODE is set by E04WDF to indicate which values must be assigned during each call of OBJFUN. Only the following values need be assigned:

if MODE = 0, OBJF;

if MODE = 1, all available elements of GRAD;

if MODE = 2, OBJF and all available elements of GRAD.

On exit: MODE may be used to indicate that you are unable or unwilling to evaluate the objective function at the current x.

During the linesearch, the function is evaluated at points of the form $x=x_k+\alpha p_k$ after they have already been evaluated satisfactorily at x_k . At any such α , if you set $\mathrm{MODE}=-1$, E04WDF will evaluate the functions at some point closer to x_k (where they are more likely to be defined).

If for some reason you wish to terminate solution of the current problem, set $\mathrm{MODE} < -1$.

2: N – INTEGER Input

On entry: n, the number of variables.

3: X(N) – double precision 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.

4: OBJF – double precision

Output

On exit: if MODE = 0 or 2, OBJF must be set to the value of the objective function at x.

5: GRAD(N) - double precision array

Input/Output

On entry: GRAD is set to a special value.

On exit: if MODE = 1 or 2, GRAD must return the available elements of the gradient evaluated at x, i.e., GRAD(i) contains the partial derivative $\partial F/\partial x_i$.

6: NSTATE – INTEGER

Input

On entry: if NSTATE = 1 then E04WDF is calling OBJFUN for the first time. This parameter setting allows the user to save computation time if certain data must be read or calculated only once.

7: IUSER(*) – INTEGER array

Communication Array

8: RUSER(*) – *double precision* array

Communication Array

OBJFUN is called from E04WDF with the parameters IUSER and RUSER as supplied to E04WDF. The user is free to use the arrays IUSER and RUSER to supply information to OBJFUN as an alternative to using COMMON.

OBJFUN must be declared as EXTERNAL in the (sub)program from which E04WDF is called. Parameters denoted as *Input* must **not** be changed by this procedure.

OBJFUN should be tested separately before being used in conjunction with E04WDF. See also the optional parameter **Verify Level** in Section 11.2.

12: MAJITS – INTEGER

Output

On exit: the number of major iterations performed.

13: ISTATE(nctotl) - INTEGER array

Input/Output

On entry: is an integer array that need not be initialized if E04WDF is called with a **Cold Start** (the default option).

For a **Warm Start**, every element of ISTATE must be set. If E04WDF has just been called on a problem with the same dimensions, ISTATE already contains valid values. Otherwise, ISTATE(j) should indicate whether either of the constraints $r_i(x) \ge \ell_i$ or $r_i(x) \le u_i$ is expected to be active.

The ordering of ISTATE is the same as for BL, BU and r(x), i.e., the first N components of ISTATE refer to the upper and lower bounds on the variables, the next NCLIN refer to the bounds on $A_L x$, and the last NCNLN refer to the bounds on c(x). Possible values of ISTATE(i) follow:

- 0 Neither $r_j(x) \ge \ell_j$ nor $r_j(x) \le u_j$ is expected to be active.
- 1 $r_i(x) \approx \ell_i$ is expected to be active.
- 2 $r_i(x) \approx u_i$ is expected to be active.
- 3 This may be used if $\ell_j = u_j$. Normally an equality constraint $r_j(x) = \ell_j = u_j$ is active at a solution.

The values 1, 2 or 3 all have the same effect when BL(j) = BU(j). If necessary, E04WDF will override the user's specification of ISTATE, so that a poor choice will not cause the algorithm to fail.

On exit: describes the status of the constraints $\ell \leq r(x) \leq u$. For the jth lower or upper bound, $j=1,\ldots,nctotl$, the possible values of $\mathrm{ISTATE}(j)$ are as follows (see Table 1). δ is the appropriate feasibility tolerance.

- -2 (Region 1) The lower bound is violated by more than δ .
- -1 (Region 5) The upper bound is violated by more than δ .
- 0 (Region 3) Both bounds are satisfied by more than δ .
- 1 (Region 2) The lower bound is active (to within δ).
- 2 (Region 4) The upper bound is active (to within δ).
- 3 (Region 2 = Region 4) The bounds are equal and the equality constraint is satisfied (to within δ).

These values of ISTATE are labelled in the printed solution according to Table 2.

Region	1	2	3	4	5	$2 \equiv 4$
ISTATE(j)	-2	1	0	2	-1	3
Printed solution	1	LL	FR	UL	++	EQ

Table 2

Labels used in the printed solution for the regions in Table 1

14: CCON(*) – *double precision* array

Output

Note: the dimension of the array CCON must be at least max(1, NCNLN).

On exit: if NCNLN > 0, CCON(i) contains the value of the ith nonlinear constraint function c_i at the final iterate, for i = 1, 2, ..., NCNLN.

If NCNLN = 0 then the array CCON is not referenced.

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15: CJAC(LDCJ,*) – *double precision* array

Input/Output

Note: the second dimension of the array CJAC must be at least N if NCNLN > 0 and at least 1 otherwise.

On entry: in general, CJAC need not be initialized before the call to E04WDF. However, if **Derivative Level** = 3 (the default; see Section 11.2), any constant elements of CJAC may be initialized. Such elements need not be reassigned on subsequent calls to CONFUN.

On exit: if NCNLN > 0, CJAC contains the Jacobian matrix of the nonlinear constraint functions at the final iterate, i.e., CJAC(i,j) contains the partial derivative of the *i*th constraint function with respect to the *j*th variable, for i = 1, 2, ..., NCNLN; j = 1, 2, ..., N. (See the discussion of parameter CJAC under CONFUN.)

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

16: CLAMDA(nctotl) – double precision array

Input/Output

On entry: CLAMDA need not be set if the (default) Cold Start option is used.

If the **Warm Start** option has been chosen (see Section 11.2), CLAMDA(j) must contain a multiplier estimate for each nonlinear constraint with a sign that matches the status of the constraint specified by the ISTATE array (as above), for j = N + NCLIN + 1, N + NCLIN + 2, ..., nctotl. The remaining elements need not be set. Note that if the jth constraint is defined as 'inactive' by the initial value of the ISTATE array (i.e., ISTATE(j) = 0), CLAMDA(j) should be zero; if the jth constraint is an inequality active at its lower bound (i.e., ISTATE(j) = 1), CLAMDA(j) should be non-negative; if the jth constraint is an inequality active at its upper bound (i.e., ISTATE(j) = 2), CLAMDA(j) should be non-positive. If necessary, the routine will modify CLAMDA to match these rules.

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

17: OBJF – double precision

Output

On exit: the value of the objective function at the final iterate.

18: GRAD(N) - double precision array

Output

On exit: the gradient of the objective function at the final iterate (or its finite difference approximation).

19: HESS(LDH,*) - double precision array

Input/Output

Note: the second dimension of the array HESS must be at least N.

On entry: HESS need not be initialized if the (default) Cold Start option is used and will be set to the identity.

For a **Warm Start**, HESS provides the initial approximation of the Hessian of the Lagrangian, i.e., $\text{HESS}(i,j) \approx \frac{\partial^2 \mathcal{L}(x,\lambda)}{\partial x_i \partial x_j}$, where $\mathcal{L}(x,\lambda) = F(x) - c(x)^T \lambda$ and λ is an estimate of the Lagrange multipliers. HESS must be a positive-definite matrix.

On exit: HESS contains the Hessian of the Lagrangian at the final estimate x.

20: X(N) – double precision array

Input/Output

On entry: an initial estimate of the solution.

On exit: the final estimate of the solution.

21: IW(LENIW) – INTEGER array

Communication Array

22: LENIW - INTEGER

Input

On entry: the dimension of the array IW as declared in the (sub)program from which E04WDF is called.

Constraint: LENIW \geq 600.

23: RW(LENRW) – *double precision* array

Communication Array

24: LENRW – INTEGER

Input

On entry: the dimension of the array RW as declared in the (sub)program from which E04WDF is called.

Constraint: LENRW \geq 600.

25: IUSER(*) – INTEGER array

User Workspace

Note: the dimension of the array IUSER must be at least 1.

IUSER is not used by E04WDF, but is passed directly to routines CONFUN and OBJFUN and may be used to pass information to and from those routines.

26: RUSER(*) – *double precision* array

User Workspace

Note: the dimension of the array RUSER must be at least 1.

RUSER is not used by E04WDF, but is passed directly to routines CONFUN and OBJFUN and may be used to pass information to and from those routines.

27: IFAIL – INTEGER

Input/Output

On initial entry: IFAIL must be set to 0, -1 or 1. Users who are unfamiliar with this parameter should refer to Chapter P01 for details.

On final exit: IFAIL = 0 unless the routine detects an error (see Section 6).

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.

E04WDF returns with IFAIL = 0 if the iterates have converged to a point x that satisfies the first-order Kuhn-Tucker (see Section 12.2) conditions to the accuracy requested by the optional parameter **Major Optimality Tolerance** (see Section 11.2), i.e., the projected gradient and active constraint residuals are negligible at x.

The user should check whether the following four conditions are satisfied:

- (i) the final value of rgNorm (see Section 12.2) is significantly less than that at the starting point;
- (ii) during the final major iterations, the values of Step and Minors (see Section 12.1) are both one;
- (iii) the last few values of both rgNorm and SumInf (see Section 12.2) become small at a fast linear rate; and
- (iv) CondHz (see Section 12.1) is small.

If all these conditions hold, x is almost certainly a local minimum of (1).

One caution about 'Optimal solutions'. Some of the variables or slacks may lie outside their bounds more than desired, especially if scaling was requested. Max Primal infeas refers to the largest bound infeasibility and which variable is involved. If it is too large, consider restarting with a smaller **Minor Feasibility Tolerance** (say 10 times smaller) and perhaps **Scale Option** 0.

Similarly, Max Dual infeas indicates which variable is most likely to be at a non-optimal value. Broadly speaking, if

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Max Dual infeas/Max
$$pi = 10^{-d}$$
,

then the objective function would probably change in the dth significant digit if optimization could be continued. If d seems too large, consider restarting with a smaller **Major Optimality Tolerance**.

Finally, Nonlinear constraint violn shows the maximum infeasibility for nonlinear rows. If it seems too large, consider restarting with a smaller **Major Feasibility Tolerance**.

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

The initialization routine E04WCF has not been called or at least one of LENIW and LENRW is less than 600.

IFAIL = 2

An input parameter is invalid. The output message provides more details of the invalid argument.

IFAIL = 3

Requested accuracy could not be achieved.

A feasible solution has been found, but the requested accuracy in the dual infeasibilities could not be achieved. An abnormal termination has occurred, but E04WDF is within 10^{-2} of satisfying the **Major Optimality Tolerance**. Check that the **Major Optimality Tolerance** is not too small.

IFAIL = 4

The problem appears to be infeasible.

When the constraints are linear, this message can probably be trusted. Feasibility is measured with respect to the upper and lower bounds on the variables and slacks. Among all the points satisfying the general constraints Ax - s = 0 (see (5) and (6) in Section 10.2), there is apparently no point that satisfies the bounds on x and s. Violations as small as the **Minor Feasibility Tolerance** are ignored, but at least one component of x or s violates a bound by more than the tolerance.

When nonlinear constraints are present, infeasibility is *much* harder to recognize correctly. Even if a feasible solution exists, the current linearization of the constraints may not contain a feasible point. In an attempt to deal with this situation, when solving each QP subproblem, E04WDF is prepared to relax the bounds on the slacks associated with nonlinear rows.

If a QP subproblem proves to be infeasible or unbounded (or if the Lagrange multiplier estimates for the nonlinear constraints become large), E04WDF enters so-called 'nonlinear elastic' mode. The subproblem includes the original QP objective and the sum of the infeasibilities – suitably weighted using the **Elastic Weight** parameter. In elastic mode, some of the bounds on the nonlinear rows are 'elastic' – i.e., they are allowed to violate their specific bounds. Variables subject to elastic bounds are known as *elastic variables*. An elastic variable is free to violate one or both of its original upper or lower bounds. If the original problem has a feasible solution and the elastic weight is sufficiently large, a feasible point eventually will be obtained for the perturbed constraints, and optimization can continue on the subproblem. If the nonlinear problem has no feasible solution, E04WDF will tend to determine a 'good' infeasible point if the elastic weight is sufficiently large. (If the elastic weight were infinite, E04WDF would locally minimize the nonlinear constraint violations subject to the linear constraints and bounds.)

Unfortunately, even though E04WDF locally minimizes the nonlinear constraint violations, there may still exist other regions in which the nonlinear constraints are satisfied. Wherever possible,

nonlinear constraints should be defined in such a way that feasible points are known to exist when the constraints are linearized.

IFAIL = 5

The problem appears to be unbounded (or badly scaled).

For linear problems, unboundedness is detected by the simplex method when a nonbasic variable can apparently be increased or decreased by an arbitrary amount without causing a basic variable to violate a bound. A message will give the index of the nonbasic variable. Consider adding an upper or lower bound to the variable. Also, examine the constraints that have non-zeros in the associated column, to see if they have been formulated as intended.

Very rarely, the scaling of the problem could be so poor that numerical error will give an erroneous indication of unboundedness. Consider using the **Scale Option**.

For nonlinear problems, E04WDF monitors both the size of the current objective function and the size of the change in the variables at each step. If either of these is very large (as judged by the unbounded parameters (see Section 12.1)), the problem is terminated and declared UNBOUNDED. To avoid large function values, it may be necessary to impose bounds on some of the variables in order to keep them away from singularities in the nonlinear functions.

The message may indicate an abnormal termination while enforcing the limit on the constraint violations. This exit implies that the objective is not bounded below in the feasible region defined by expanding the bounds by the value of the **Violation Limit**.

IFAIL = 6

Iteration limit reached.

Either the Minor Iterations Limit or the Major Iterations Limit was exceeded before the required solution could be found. Check the iteration log to be sure that progress was being made. If so, restart the run using a basis file that was saved (or should have been saved) at the end of the run.

If none of the above limits have been reached, this error may mean that the problem appears to be more nonlinear than anticipated. The current set of basic and superbasic variables have been optimized as much as possible and a Price operation is necessary to continue, but it can't continue as the number of superbasic variables has already reached the limit specified by the optional parameter **Super Basics Limit**.

In general, raise the **Superbasics Limit** s by a reasonable amount.

IFAIL = 7

Numerical difficulties have been encountered and no further progress can be made.

Several circumstances could lead to this exit.

- 1. Subroutines OBJFUN or CONFUN could be returning accurate function values but inaccurate gradients (or vice versa). This is the most likely cause. Study the comments given for IFAIL = 8, and do your best to ensure that the coding is correct.
- 2. The function and gradient values could be consistent, but their precision could be too low. For example, accidental use of a *double precision* data type when *double precision* was intended would lead to a relative function precision of about 10⁻⁶ instead of something like 10⁻¹⁵. The default **Major Optimality Tolerance** of 10⁻⁶ would need to be raised to about 10⁻³ for optimality to be declared (at a rather suboptimal point). Of course, it is better to revise the function coding to obtain as much precision as economically possible.
- 3. If function values are obtained from an expensive iterative process, they may be accurate to rather few significant figures, and gradients will probably not be available. One should specify

Function Precision t

Major Optimality Tolerance \sqrt{t}

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but even then, if t is as large as 10^{-5} or 10^{-6} (only 5 or 6 significant figures), the same exit condition may occur. At present the only remedy is to increase the accuracy of the function calculation.

4. An LU factorization of the basis has just been obtained and used to recompute the basic variables x_B , given the present values of the superbasic and nonbasic variables. A step of 'iterative refinement' has also been applied to increase the accuracy of x_B . However, a row check has revealed that the resulting solution does not satisfy the current constraints Ax - s = 0 sufficiently well.

This probably means that the current basis is very ill-conditioned. If there are some linear constraints and variables, try **Scale Option** 1 if scaling has not yet been used.

For certain highly structured basis matrices (notably those with band structure), a systematic growth may occur in the factor U. Consult the description of Umax and Growth in Section 12.3 and set the **LU Factor Tolerance** to 2.0 (or possibly even smaller, but not less than 1.0).

5. The first factorization attempt will have found the basis to be structurally or numerically singular. (Some diagonals of the triangular matrix U were respectively zero or smaller than a certain tolerance.) The associated variables are replaced by slacks and the modified basis is refactorized, but singularity persists. This must mean that the problem is badly scaled, or the LU Factor Tolerance is too much larger than 1.0. This is highly unlikely to occur.

IFAIL = 8

Derivative appears to be incorrect.

If the message refers to the derivatives of the objective function, then a check has been made on some individual elements of the objective gradient array at the first point that satisfies the linear constraints. At least one component GRAD(j) is being set to a value that disagrees markedly with its associated forward-difference estimate $\frac{\partial F}{\partial x_j}$. (The relative difference between the computed and estimated values is 1.0 or more.) This exit is a safeguard, since E04WDF will usually fail to make progress when the computed gradients are seriously inaccurate. In the process it may expend considerable effort before terminating with IFAIL = 7.

Check the function and gradient computation *very carefully* in OBJFUN. A simple omission could explain everything. If F or a component $\frac{\partial F}{\partial x_j}$ is very large, then give serious thought to scaling the function or the nonlinear variables.

If you feel *certain* that the computed GRAD(j) is correct (and that the forward-difference estimate is therefore wrong), you can specify **Verify Level** 0 to prevent individual elements from being checked. However, the optimization procedure may have difficulty.

If the message refers to derivatives of the constraints, then at least one of the computed constraint derivatives is significantly different from an estimate obtained by forward-differencing the vector c(x). Follow the advice given above, trying to ensure that the arrays CCON and CJAC are being set correctly in CONFUN.

IFAIL = 9

Undefined user-supplied function.

The user has indicated that the problem functions are undefined by assigning the value MODE = -1 on exit from OBJFUN or CONFUN. E04WDF attempts to evaluate the problem functions closer to a point at which the functions are already known to be defined. This exit occurs if E04WDF is unable to find a point at which the functions are defined. This will occur in the case of:

- undefined functions with no recovery possible;
- undefined functions at the first point;
- undefined functions at the first feasible point; or
- undefined functions when checking derivatives.

IFAIL = 10

User requested termination.

The user has indicated the wish to terminate solution of the current problem by setting MODE to a value < -1 on exit from OBJFUN or CONFUN.

IFAIL = 11

Internal memory allocation failed when attempting to obtain the required workspace. Please contact NAG.

IFAIL = 12

Internal memory allocation was insufficient. Please contact NAG.

IFAIL = 13

An error has occurred in the basis package, perhaps indicating incorrect setup of arrays. Set the optional argument **Print File** (see Section 11.2) and examine the output carefully for further information.

IFAIL = 14

An unexpected error has occurred. Set the optional argument **Print File** (see Section 11.2) and examine the output carefully for further information.

7 Accuracy

If IFAIL = 0 on exit, then the vector returned in the array X is an estimate of the solution to an accuracy of approximately **Major Optimality Tolerance** (see Section 11.2).

8 Further Comments

This section describes the final output produced by E04WDF. Intermediate and other output are given in Section 12.

8.1 The Final Output

If **Print File** > 0, the final output, including a listing of status of every variable and constraint will be sent to the channel numbers associated with **Print File**. The following describes the output for each variable. A full stop (.) is printed for any numerical value that is zero.

Variable

gives the name (Variable) and index j, for j = 1, 2, ..., n of the variable.

State

gives the state of the variable (FR if neither bound is in the working set, EQ if a fixed variable, LL if on its lower bound, UL if on its upper bound, TF if temporarily fixed at its current value). If Value lies outside the upper or lower bounds by more than the **Feasibility Tolerance** (see Section 11.2), State will be ++ or -- respectively. (The latter situation can occur only when there is no feasible point for the bounds and linear constraints.)

A key is sometimes printed before State to give some additional information about the state of a variable.

A *Alternative optimum possible*. The variable is active at one of its bounds, but its Lagrange multiplier is essentially zero. This means that if the variable were allowed to start moving away from its bound then there would be no change to the objective function. The values of the other free variables *might* change, giving a genuine alternative solution. However, if there are any degenerate variables (labelled D), the actual change might prove to be zero,

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since one of them could encounter a bound immediately. In either case the values of the Lagrange multipliers might also change.

D Degenerate. The variable is free, but it is equal to (or very close to) one of its bounds.

I *Infeasible*. The variable is currently violating one of its bounds by more than the **Feasibility Tolerance**.

Value is the value of the variable at the final iteration.

Lower bound is the lower bound specified for the variable. None indicates that

 $BL(j) \leq -bigbnd.$

Upper bound is the upper bound specified for the variable. None indicates that $BU(j) \ge bigbnd$.

Lagr multiplies is the Lagrange multiplier for the associated bound. This will be zero if State is

FR unless $\mathrm{BL}(j) \leq -bigbnd$ and $\mathrm{BU}(j) \geq bigbnd$, in which case the entry will be blank. If x is optimal, the multiplier should be non-negative if State is LL and

non-positive if State is UL.

Slack is the difference between the variable Value and the nearer of its (finite) bounds

 $\mathrm{BL}(j)$ and $\mathrm{BU}(j)$. A blank entry indicates that the associated variable is not

bounded (i.e., $BL(j) \le -bigbnd$ and $BU(j) \ge bigbnd$).

The meaning of the output for linear and nonlinear constraints is the same as that given above for variables, with $\mathrm{BL}(j)$ and $\mathrm{BU}(j)$ replaced by $\mathrm{BL}(n+j)$ and $\mathrm{BU}(n+j)$ respectively, and with the following changes in the heading:

Linear constrnt gives the name (lincon) and index j, for $j = 1, 2, ..., n_L$ of the linear constraint.

Nonlin construct gives the name (nlncon) and index $(j-n_L)$, for $j=n_L+1, n_L+2, \ldots, n_L+n_N$

of the nonlinear constraint.

Note that movement off a constraint (as opposed to a variable moving away from its bound) can be interpreted as allowing the entry in the Slack column to become positive.

Numerical values are output with a fixed number of digits; they are not guaranteed to be accurate to this precision.

9 Example

This is based on Problem 71 in Hock and Schittkowski (1981) and involves the minimization of the nonlinear function

$$F(x) = x_1 x_4 (x_1 + x_2 + x_3) + x_3$$

subject to the bounds

$$1 \le x_1 \le 5
1 \le x_2 \le 5
1 \le x_3 \le 5
1 \le x_4 \le 5$$

to the general linear constraint

$$x_1 + x_2 + x_3 + x_4 \le 20,$$

and to the nonlinear constraints

$$x_1^2 + x_2^2 + x_3^2 + x_4^2 \le 40,$$

 $x_1 x_2 x_2 x_4 \ge 25.$

The initial point, which is infeasible, is

$$x_0 = (1, 5, 5, 1)^T,$$

and $F(x_0) = 16$.

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The optimal solution (to five figures) is

```
x^* = (1.0, 4.7430, 3.8211, 1.3794)^T,
```

and $F(x^*) = 17.014$. One bound constraint and both nonlinear constraints are active at the solution.

9.1 Program Text

Note: the listing of the example program presented below uses **bold italicised** terms to denote precision-dependent details. Please read the Users' Note for your implementation to check the interpretation of these terms. As explained in the Essential Introduction to this manual, the results produced may not be identical for all implementations.

```
E04WDF Example Program Text
Mark 21 Release. NAG Copyright 2004.
IMPLICIT
                  NONE
 .. Parameters ..
                  NIN, NOUT
INTEGER
PARAMETER
                  (NIN=5,NOUT=6)
                 NMAX, NCLMAX, NCNMAX
INTEGER
PARAMETER
                  (NMAX=10,NCLMAX=10,NCNMAX=10)
INTEGER
                 LDA, LDCJ, LDH
PARAMETER
                  (LDA=NCLMAX,LDCJ=NCNMAX,LDH=NMAX)
INTEGER
                  LENIW, LENRW
                  (LENIW=600, LENRW=600)
PARAMETER
.. Local Scalars ..
DOUBLE PRECISION OBJF
INTEGER
                  I, IFAIL, J, MAJITS, N, NCLIN, NCNLN
 .. Local Arrays ..
DOUBLE PRECISION A(LDA, NMAX), BL(NMAX+NCLMAX+NCNMAX),
                  BU(NMAX+NCLMAX+NCNMAX), CCON(NCNMAX),
                  CJAC(LDCJ, NMAX), CLAMDA(NMAX+NCLMAX+NCNMAX),
+
                  GRAD(NMAX), HESS(LDH, NMAX), RUSER(1), RW(LENRW),
                  X(NMAX)
INTEGER
                  ISTATE(NMAX+NCLMAX+NCNMAX), IUSER(1), IW(LENIW)
.. External Subroutines .. EXTERNAL CONFUN, E04WCF, E04WDF, E04WFF, E04WGF, OBJFUN
.. Executable Statements ..
WRITE (NOUT,*) 'E04WDF Example Program Results'
Skip heading in data file
READ (NIN, *)
READ (NIN, *) N, NCLIN, NCNLN
IF (N.LE.NMAX .AND. NCLIN.LE.NCLMAX .AND. NCNLN.LE.NCNMAX) THEN
    Read A, BL, BU and X from data file
    IF (NCLIN.GT.0) READ (NIN,*) ((A(I,J),J=1,N),I=1,NCLIN)
   READ (NIN,*) (BL(I),I=1,N+NCLIN+NCNLN)
   READ (NIN,*) (BU(I), I=1, N+NCLIN+NCNLN)
   READ (NIN, \star) (X(I), I=1, N)
    Call EO4WCF to initialise EO4WDF.
    IFAIL = -1
    CALL EO4WCF(IW, LENIW, RW, LENRW, IFAIL)
    By default EO4WDF does not print monitoring
    information. Set the print file unit or the summary
    file unit to get information.
    CALL EO4WGF('Print file', NOUT, IW, RW, IFAIL)
    Solve the problem.
    IFAIL = -1
    CALL EO4WDF(N,NCLIN,NCNLN,LDA,LDCJ,LDH,A,BL,BU,CONFUN,OBJFUN,
                MAJITS, ISTATE, CCON, CJAC, CLAMDA, OBJF, GRAD, HESS, X, IW,
                LENIW, RW, LENRW, IUSER, RUSER, IFAIL)
    WRITE (NOUT, *)
    WRITE (NOUT, 99999) IFAIL
    IF (IFAIL.EQ.O) THEN
       WRITE (NOUT, 99998) OBJF
       WRITE (NOUT, 99997) (X(I), I=1, N)
   END IF
```

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```
END IF
     STOP
99999 FORMAT (1X,'On exit from EO4WDF, IFAIL = ',I5)
99998 FORMAT (1X, 'Final objective value = ',F11.3)
99997 FORMAT (1X, 'Optimal X = ',7F9.2)
     END
      SUBROUTINE OBJFUN (MODE, N, X, OBJF, GRAD, NSTATE, IUSER, RUSER)
     Routine to evaluate objective function and its 1st derivatives.
      .. Parameters ..
      DOUBLE PRECISION
                        ONE, TWO
     PARAMETER
                        (ONE=1.0D0,TWO=2.0D0)
      .. Scalar Arguments ..
     DOUBLE PRECISION OBJF
      INTEGER
                        MODE, N, NSTATE
      .. Array Arguments ..
     DOUBLE PRECISION GRAD(N), RUSER(*), X(N)
     INTEGER
                        IUSER(*)
      .. Executable Statements ..
     IF (MODE.EQ.O .OR. MODE.EQ.2) OBJF = X(1)*X(4)*(X(1)+X(2)+X(3)) +
          X(3)
      IF (MODE.EQ.1 .OR. MODE.EQ.2) THEN
         GRAD(1) = X(4) * (TWO * X(1) + X(2) + X(3))
         GRAD(2) = X(1) *X(4)
         GRAD(3) = X(1) *X(4) + ONE
         GRAD(4) = X(1) * (X(1) + X(2) + X(3))
     END IF
     RETURN
     END
     SUBROUTINE CONFUN(MODE, NCNLN, N, LDCJ, NEEDC, X, CCON, CJAC, NSTATE,
                        IUSER, RUSER)
     Routine to evaluate the nonlinear constraints and their 1st
      derivatives.
      .. Parameters ..
      DOUBLE PRECISION ZERO, TWO
     PARAMETER
                        (ZERO=0.0D0,TWO=2.0D0)
      .. Scalar Arguments ..
                        LDCJ, MODE, N, NCNLN, NSTATE
      INTEGER
      .. Array Arguments ..
     DOUBLE PRECISION CCON(*), CJAC(LDCJ,*), RUSER(*), X(N)
                        IUSER(*), NEEDC(*)
      .. Local Scalars ..
     INTEGER
                        I, J
      .. Executable Statements ..
      IF (NSTATE.EQ.1) THEN
         First call to CONFUN. Set all Jacobian elements to zero.
         Note that this will only work when 'Derivative Level = 3'
         (the default; see Section 11.2).
         DO 40 J = 1, N
            DO 20 I = 1, NCNLN
               CJAC(I,J) = ZERO
   20
            CONTINUE
        CONTINUE
   40
     END IF
      IF (NEEDC(1).GT.O) THEN
         IF (MODE.EQ.0 .OR. MODE.EQ.2) CCON(1) = X(1)**2 + X(2)**2 +
             X(3)**2 + X(4)**2
         IF (MODE.EQ.1 .OR. MODE.EQ.2) THEN
            CJAC(1,1) = TWO*X(1)
            CJAC(1,2) = TWO*X(2)
            CJAC(1,3) = TWO*X(3)
            CJAC(1,4) = TWO*X(4)
         END IF
     END IF
```

```
IF (NEEDC(2).GT.0) THEN
    IF (MODE.EQ.0 .OR. MODE.EQ.2) CCON(2) = X(1)*X(2)*X(3)*X(4)
    IF (MODE.EQ.1 .OR. MODE.EQ.2) THEN
        CJAC(2,1) = X(2)*X(3)*X(4)
        CJAC(2,2) = X(1)*X(3)*X(4)
        CJAC(2,3) = X(1)*X(2)*X(4)
        CJAC(2,4) = X(1)*X(2)*X(3)
        END IF
    END IF
    END IF
    RETURN
    END
```

9.2 Program Data

E04WDF	Examp]	le Prog	gram D	ata			
4 1	_ 2						: N, NCLIN and NCNLN
1.0	1.0	1.0	1.0				: Matrix A
1.0	1.0	1.0	1.0	-1.0E+25	-1.0E+25	25.0	: Lower bounds BL
5.0	5.0	5.0	5.0	20.0	40.0	1.0E+25	: Upper bounds BU
1.0	5.0	5.0	1.0				: Initial vector X

9.3 Program Results

E04WDF Example Program Results

Parameters ======

=======			
Files			
Solution file	0	Old basis file	0
Insert file (Summary file)	0	New basis file	0
Punch file	0	Backup basis file Dump file	0
Frequencies			
Print frequency Save new basis map	100 100	Check frequency	60
Summary frequency Expand frequency	100	Factorization frequency	50
QP subproblems			
QPsolver Cholesky Scale tolerance	0.900	Minor feasibility tol	1.00E-06
Iteration limit Scale option	10000	Minor optimality tol	1.00E-06
Minor print level Crash tolerance	1 0.100	Pivot tolerance	1.11E-15
Partial price Crash option	1 3	Elastic weight	1.00E+04
Prtl price section (A)	4	New superbasics	99
Prtl price section (-I)	3	-	
The SQP Method			
Minimize Proximal Point method	1	Cold start	
Nonlinear objectiv vars Function precision 1	4	Major optimality tol	2.00E-06
Unbounded step size		Superbasics limit	4
Unbounded objective		Hessian dimension	4
Major step limit		Derivative lir	nesearch

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Derivative option Major iterations limit. Verify level Minor iterations limit. Major Print Level	3 1000 0 500	Linesearch tole		0.90000 0.00E+00
1 1	99999 99999	Hessian update	s	9999999
Nonlinear constraints Nonlinear constraints Violation limit 1.00 Nonlinear Jacobian vars	2 DE+06 4	Major feasibil	ity tol	1.00E-06
Miscellaneous LU factor tolerance Timing level LU update tolerance Debug level LU partial pivoting System information	1.10 0 1.10 0 No	LU singularity LU swap tolera eps (machine p	nce	1.05E-08 1.03E-04 1.11E-16
	Linear cons Linear variations Descrive variations Total variations	Lables 0 variables 4 dbles 4 constraint g:		
Cheap test of user-supplied The constraint gradients see > The largest discrepancy The objective gradients see	em to be OK. 7 was 1.84E-07	in constraint	6	
Gradient projected in one de Difference approximation	4.99993	3303560E+00		
Itns Major Minors Storm BSwap	1 1.7E+ 00 2 1.3E- 00 3 3.7E- 00 4 2.2E- 00 5 1.5E- 00 6 (3.3E- 00 7 (4.2E-	00 2.8E+00 1.001 3.2E-01 1.002 1.7E-01 1.002 1.1E-02 1.004 6.0E-04 1.007) 2.3E-05 1.000	7014017E+01	L+U 7 8 7 7 7 7 7
E04WDF INFO 1 optimaling Problem name No. of iterations	ty conditions sat: NLP 9 Object 6 Linea	stive value ar objective near objective	1.701401728 0.000000000 1.701401728	7E+01 0E+00 7E+01

No. of calls to the control of superback to the control of the con	asics ate steps		No. of calls to f No. of basic nonl Percentage Max pi Max Dual infeas		8 2 0.00 2 5.5E-01 3 4.8E-08
Variable multiplier	State Slack	Value	Lower bound	Upper	bound Lagr
variable	1	LL 1.00000	0 1.000	000	5.000000
1.087871 variable 2 0.2570	· 2 FR	4.743000	1.000000	5.000000	
variable 3	3 FR	3.821150	1.000000	5.000000	•
1.179 variable 0.3794	4 FR	1.379408	1.000000	5.000000	
Linear construmultiplier		Value	Lower bound	Upper	bound Lagr
lincon 9.056	1 FR	10.94356	None	20.00000	
Nonlin construmultiplier	nt State Slack	Value	Lower bound	Upper	bound Lagr
nlncon 0.1614686	1 UL -0.2700	40.00000 E-08	None	40.	00000 -
nlncon 0.5522937	2 -0.2215	LL 25.000 E-08	00 25.0	00000	None
On exit from E Final objectiv Optimal X =	ve value =	17.014	1.38		

Note: the remainder of this document is intended for more advanced users. Section 10 contains a detailed description of the algorithm which may be needed in order to understand Sections 11 and 12. Section 11 describes the optional parameters which may be set by calls to E04WFF, E04WGF and/or E04WHF. Section 12 describes the quantities which can be requested to monitor the course of the computation.

10 Algorithmic Details

Here we summarize the main features of the SQP algorithm used in E04WDF and introduce some terminology used in the description of the subroutine and its arguments. The SQP algorithm is fully described in Gill *et al.* (2002).

10.1 Constraints and Slack Variables

The upper and lower bounds on the m components of c(x) and $A_L x$ are said to define the *general constraints* of the problem. E04WDF converts the general constraints to equalities by introducing a set of slack variables $s=(s_1,s_2,\ldots,s_m)^T$. For example, the linear constraint $5\leq 3x_1+3x_2\leq +\infty$ is replaced by $2x_1+3x_2-s_1=0$ together with the bounded slack $5\leq s_1\leq +\infty$. The minimization problem (1) can therefore be written in the equivalent form

The general constraints become the equalities $c(x) - s_N = 0$ and $A_L x - s_L = 0$, where s_L and s_N are known as the *linear* and *nonlinear* slacks.

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10.2 Major Iterations

The basic structure of the SQP algorithm involves *major* and *minor* iterations. The major iterations generate a sequence of iterates $\{x_k\}$ that satisfy the linear constraints and converge to a point that satisfies the first-order conditions for optimality. At each iterate a QP subproblem is used to generate a search direction towards the next iterate x_{k+1} . The constraints of the subproblem are formed from the linear constraints $A_L x - s_L = 0$ and the nonlinear constraint linearization

$$c(x_k) + c'(x_k)(x - x_k) - s_N = 0, (3)$$

where $c'(x_k)$ denotes the *Jacobian matrix*, whose elements are the first derivatives of c(x) evaluated at x_k . The QP constraints therefore comprise the m linear constraints

$$c'(x_k)x - s_N = -c(x_k) + c'(x_k)x_k, A_L x - s_L = 0,$$
(4)

where x and s are bounded above and below by u and l as before. If the m by n matrix A and m-vector b are defined as

$$A = \begin{pmatrix} c'(x_k) \\ A_L \end{pmatrix} \quad \text{and} \quad b = \begin{pmatrix} -c(x_k) + c'(x_k)x_k \\ 0 \end{pmatrix}, \tag{5}$$

then the QP subproblem can be written as

minimize
$$q(x)$$
 subject to $Ax - s = b$, $l \le {x \choose s} \le u$, (6)

where q(x) is a quadratic approximation to a modified Lagrangian function (see Gill et al. (2002)).

10.3 Minor Iterations

Solving the QP subproblem is itself an iterative procedure. The iterations of the QP solver are the *minor* iterations of the SQP method. At each minor iteration, the constraints Ax - s = b are (conceptually) partitioned into the form

$$Bx_B + Sx_S + Nx_N = b, (7)$$

where the *basic matrix B* is square and nonsingular. The elements of x_B , x_S and x_N are called the *basic*, superbasic and nonbasic variables respectively; they are a permutation of the elements of x and s. At a QP subproblem, the basic and superbasic variables will lie somewhere between their bounds, while the nonbasic variables will normally be equal to one of their bounds. At each iteration, x_S is regarded as a set of independent variables that are free to move in any desired direction, namely one that will improve the value of the QP objective (or the sum of infeasibilities). The basic variables are then adjusted in order to ensure that (x,s) continues to satisfy Ax - s = b. The number of superbasic variables (n_S, say) therefore indicates the number of degrees of freedom remaining after the constraints have been satisfied. In broad terms, n_S is a measure of how nonlinear the problem is. In particular, n_S will always be zero for LP problems.

If it appears that no improvement can be made with the current definition of B, S and N, a nonbasic variable is selected to be added to S, and the process is repeated with the value of n_S increased by one. At all stages, if a basic or superbasic variable encounters one of its bounds, the variable is made nonbasic and the value of n_S is decreased by one.

Associated with each of the m equality constraints Ax-s=b are the dual variables π . Similarly, each variable in (x,s) has an associated reduced gradient d_j . The reduced gradients for the variables x are the quantities $g-A^T\pi$, where g is the gradient of the QP objective, and the reduced gradients for the slacks are the dual variables π . The QP subproblem is optimal if $d_j \geq 0$ for all nonbasic variables at their lower bounds, $d_j \leq 0$ for all nonbasic variables at their upper bounds, and $d_j = 0$ for other variables, including superbasics. In practice, an approximate QP solution $(\hat{x}_k, \hat{s}_k, \hat{\pi}_k)$ is found by relaxing these conditions.

10.4 The Merit Function

After a QP subproblem has been solved, new estimates of the solution are computed using a line search on the augmented Lagrangian merit function

$$\mathcal{M}(x, s, \pi) = F(x) - \pi^{T}(c(x) - s_{N}) + \frac{1}{2}(c(x) - s_{N})^{T}D(c(x) - s_{N}), \tag{8}$$

where D is a diagonal matrix of penalty parameters $(D_{ii} \geq 0)$. If (x_k, s_k, π_k) denotes the current solution estimate and $(\hat{x}_k, \hat{s}_k, \hat{\pi}_k)$ denotes the QP solution, the line search determines a step α_k $(0 < \alpha_k \leq 1)$ such that the new point

$$\begin{pmatrix} x_{k+1} \\ s_{k+1} \\ \pi_{k+1} \end{pmatrix} = \begin{pmatrix} x_k \\ s_k \\ \pi_k \end{pmatrix} + \alpha_k \begin{pmatrix} \hat{x}_k - x_k \\ \hat{s}_k - s_k \\ \hat{\pi}_k - \pi_k \end{pmatrix}$$
(9)

gives a *sufficient decrease* in the merit function (see (8)). When necessary, the penalties in D are increased by the minimum-norm perturbation that ensures descent for \mathcal{M} (see Gill *et al.* (1992)). s_N is adjusted to minimize the merit function as a function of s prior to the solution of the QP subproblem (see Gill *et al.* (1986c) and Eldersveld (1991)).

10.5 Treatment of Constraint Infeasibilities

E04WDF makes explicit allowance for infeasible constraints. First, infeasible *linear* constraints are detected by solving the linear program

$$\underset{x,v,w}{\text{minimize}} \ e^T(v+w) \quad \text{subject to } l \le \left(\begin{array}{c} x \\ A_L x - v + w \end{array} \right) \le u, \quad u \ge 0, \quad w \ge 0, \tag{10}$$

where e is a vector of ones, and the nonlinear constraint bounds are temporarily excluded from l and u. This is equivalent to minimizing the sum of the general linear constraint violations subject to the bounds on x. (The sum is the ℓ_1 -norm of the linear constraint violations. In the linear programming literature, the approach is called *elastic programming*.)

The linear constraints are infeasible if the optimal solution of (10) has $v \neq 0$ or $w \neq 0$. E04WDF then terminates without computing the nonlinear functions.

Otherwise, all subsequent iterates satisfy the linear constraints. (Such a strategy allows linear constraints to be used to define a region in which the functions can be safely evaluated.) E04WDF proceeds to solve nonlinear problems as given, using search directions obtained from the sequence of QP subproblems (see (6)).

If a QP subproblem proves to be infeasible or unbounded (or if the dual variable π for the nonlinear constraints become large), E04WDF enters 'elastic' mode and thereafter solves the problem

$$\underset{x,v,w}{\text{minimize}} \ F(x) + \gamma e^T(v+w) \quad \text{subject to } l \leq \begin{pmatrix} x \\ c(x) - v + w \\ A_L x \end{pmatrix} \leq u, \quad v \geq 0, \quad w \geq 0, \quad (11)$$

where γ is a nonnegative parameter (the *elastic weight*), and $F(x) + \gamma e^{T}(v + w)$ is called a *composite objective* (the ℓ_1 penalty function for the nonlinear constraints).

The value of γ may increase automatically by multiples of 10 if the optimal u and w continue to be non-zero. If γ is sufficiently large, this is equivalent to minimizing the sum of the nonlinear constraint violations subject to the linear constraints and bounds.

The initial value of γ is controlled by the optional parameters **Elastic Mode** and **Elastic Weight**.

11 Optional Parameters

Several optional parameters in E04WDF define choices in the problem specification or the algorithm logic. In order to reduce the number of formal parameters of E04WDF these optional parameters have associated *default values* that are appropriate for most problems. Therefore, the user need only specify those optional parameters whose values are to be different from their default values.

The remainder of this section can be skipped by users who wish to use the default values for all optional parameters. A complete list of optional parameters and their default values is given in Section 11.1.

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Optional parameters may be specified by calling one, or more, of the routines E04WEF, E04WFF and E04WGF prior to a call to E04WDF.

E04WEF reads options from an external options file, with Begin and End as the first and last lines respectively and each intermediate line defining a single optional parameter. For example,

```
Begin
  Print Level = 5
End
```

The call

```
CALL EO4WEF (IOPTNS, IW, RW, IFAIL)
```

can then be used to read the file on unit IOPTNS. IFAIL will be zero on successful exit. E04WEF should be consulted for a full description of this method of supplying optional parameters.

E04WFF, E04WGF or E04WHF can be called to supply options directly, one call being necessary for each optional parameter. E04WFF, E04WGF or E04WHF should be consulted for a full description of this method of supplying optional parameters.

All optional parameters not specified by the user are set to their default values. Optional parameters specified by the user are unaltered by E04WDF (unless they define invalid values) and so remain in effect for subsequent calls to E04WDF, unless altered by the user.

11.1 Optional parameter checklist and default values

The following list gives the valid options. For each option, we give the keyword, any essential optional qualifiers and the default value. A definition for each option can be found in Section 11.2. The minimum abbreviation of each keyword is underlined. If no characters of an optional qualifier are underlined, the qualifier may be omitted. The letter a denotes a phrase (character string) that qualifies an option. The letters i and r denote INTEGER and **double precision** values required with certain options. The number ϵ is a generic notation for **machine precision** (see X02AJF), and ϵ_R denotes the relative precision of the objective function (the optional parameter **Function Precision**; see below).

Optional Parameters	Default Values
Backup Basis File	Default = 0
Central Difference Interval	Default = $\epsilon^{4/15}$
Check Frequency	Default $= 60$
Cold Start	Default = Cold Start
Crash Option	Default = 3
Crash Tolerance	Default $= 0.1$
Derivative Level	Default $= 3$
Defaults	
Derivative Linesearch	Default
<u>Difference</u> Interval	Default $= \epsilon^{0.4}$
Dump File	Default = 0
Elastic Mode	Default = No
Elastic Weight	$Default = 10^4$
Expand Frequency	Default = 10000
Factorisation Frequency	Default $= 50$
Feasibility Tolerance	Default = 1.0D - 6
Feasible Point	
Function Precision	Default $= \epsilon^{0.8}$
Hessian Full Memory	Default = Full if $n_1 \le 75$
Hessian Limited Memory	
Hessian Frequency	Default = 999999999
Hessian Updates	Default = 999999999
<u>Insert File</u>	Default = 0
Infinite Bound Size	$Default = 10^{20}$
Line search Tolerance	Default $= 0.9$
List	Default = Nolist

Default = $\epsilon^{4/15}$

T 1 TO	D C 1, 0
Load File	Default = 0
LU Complete Pivoting	D C 1, 0 C
LU Density Tolerance	Default $= 0.6$
LU Factor Tolerance	Default $= 1.01$
LU Partial Pivoting	Default
LU Rook Pivoting	_
<u>LU</u> Singularity Tolerance	Default $=\sqrt{\epsilon}$
<u>LU</u> <u>U</u> pdate Tolerance	Default = 1.01
Major Feasibility Tolerance	Default = 1.0D - 6
Major Iterations Limit	$Default = \max\{1000, m\}$
Major Optimality Tolerance	Default = 2.0D - 6
Major Print Level	Default = 00001
Major Step Limit	Default = 2.0
Maximize	
Minimize	Default
Minor Feasibility Tolerance	Default = 1.0D - 6
Minor Iterations Limit	Default = 500
Minor Print Level	Default = 1
New Basis File	Default = 0
New Superbasics Limit	Default = 99
Nolist	
Nonderivative Linesearch	
Old Basis File	Default = 0
Partial Price	Default = 1
Pivot Tolerance	$Default = 10 \times \epsilon$
Print File	Default = 0
Print Frequency	Default = 100
Proximal Point Method	Default = 1
Punch File	Default = 0
Save Frequency	Default = 100
Scale Option	Default = 0
Scale Tolerance	Default $= 0.9$
Solution File	Default = 0
Start Constraint Check At Variable	Default = 1
Start Objective Check At Variable	Default = 1
Stop Constraint Check At Variable	Default = n
Stop Objective Check At Variable	Default = n
Summary File	Default = 0
Summary Frequency	Default = 100
Superbasics Limit	$Default = min(500, n_1 + 1)$
Suppress Parameters	
Timing Level	Default = 0
Unbounded Objective	Default = 1.0D + 15
Unbounded Step Size	Default = 1.0D + 20
Verify Level	Default = 0
Violation Limit	Default = 1.0D + 6

11.2 Description of the optional parameters

Warm Start

Central Difference Interval

When **Derivative Level** < 3, the central-difference interval r is used near an optimal solution to obtain more accurate (but more expensive) estimates of gradients. Twice as many function evaluations are required compared to forward differencing. The interval used for the jth variable $h_j = r(1 + |x_j|)$. The resulting derivative estimates should be accurate to $O(r^2)$, unless the functions are badly scaled.

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Check Frequency i Default = 60

Every ith minor iteration after the most recent basis factorization, a numerical test is made to see if the current solution x satisfies the general linear constraints (the linear constraints and the linearized nonlinear constraints, if any). The constraints are of the form Ax - s = b, where s is the set of slack variables. To perform the numerical test, the residual vector r = b - Ax + s is computed. If the largest component of r is judged to be too large, the current basis is refactorized and the basic variables are recomputed to satisfy the general constraints more accurately.

Check Frequency 1 is useful for debugging purposes, but otherwise this option should not be needed.

Cold Start Warm Start Default = Cold Start

This option controls the specification of the initial working set in both the procedure for finding a feasible point for the linear constraints and bounds and in the first QP subproblem thereafter. With a **Cold Start**, the first working set is chosen by E04WDF based on the values of the variables and constraints at the initial point. Broadly speaking, the initial working set will include equality constraints and bounds or inequality constraints that violate or 'nearly' satisfy their bounds (to within **Crash Tolerance**; see below).

With a **Warm Start**, the user must set the ISTATE array and define CLAMDA and HESS as discussed in Section 5. ISTATE values associated with bounds and linear constraints determine the initial working set of the procedure to find a feasible point with respect to the bounds and linear constraints. ISTATE values associated with nonlinear constraints determine the initial working set of the first QP subproblem after such a feasible point has been found. E04WDF will override the user's specification of ISTATE if necessary, so that a poor choice of the working set will not cause a fatal error. For instance, any elements of ISTATE which are set to -2, -1 or 4 will be reset to zero, as will any elements which are set to 3 when the corresponding elements of BL and BU are not equal. A warm start will be advantageous if a good estimate of the initial working set is available – for example, when E04WDF is called repeatedly to solve related problems.

If optional **Cold Start**, an internal Crash procedure is used to select an initial basis from certain rows and columns of the constraint matrix (A - I). The **Crash Option** i determines which rows and columns of A are eligible initially, and how many times the Crash procedure is called. Columns of -I are used to pad the basis where necessary.

i Meaning

- The initial basis contains only slack variables: B = I.
- 1 The Crash procedure is called once, looking for a triangular basis in all rows and columns of the matrix A.
- 2 The Crash procedure is called twice (if there are nonlinear constraints). The first call looks for a triangular basis in linear rows, and the iteration proceeds with simplex iterations until the linear constraints are satisfied. The Jacobian is then evaluated for the first major iteration and the Crash procedure is called again to find a triangular basis in the nonlinear rows (retaining the current basis for linear rows).
- 3 The Crash procedure is called up to three times (if there are nonlinear constraints). The first two calls treat *linear equalities* and *linear inequalities* separately. As before, the last call treats nonlinear rows before the first major iteration.

If $i \ge 1$, certain slacks on inequality rows are selected for the basis first. (If $i \ge 2$, numerical values are used to exclude slacks that are close to a bound). The Crash procedure then makes several passes through the columns of A, searching for a basis matrix that is essentially triangular. A column is assigned to 'pivot' on a particular row if the column contains a suitably large element in a row that has not yet been assigned. (The pivot elements ultimately form the diagonals of the triangular basis.) For remaining unassigned rows, slack variables are inserted to complete the basis.

The Crash Tolerance r allows the starting Crash procedure to ignore certain 'small' non-zeros in each column of A. If a_{\max} is the largest element in column j, other non-zeros of a_{ij} in the columns are ignored if $|a_{ij}| \le a_{\max} \times r$. (To be meaningful, r should be in the range $0 \le r < 1$.)

When r > 0.0, the basis obtained by the Crash procedure may not be strictly triangular, but it is likely to be nonsingular and almost triangular. The intention is to obtain a starting basis containing more columns of A and fewer (arbitrary) slacks. A feasible solution may be reached sooner on some problems.

Defaults

This special keyword may be used to reset all optional parameters to their default values.

Derivative Level i Default = 3

Derivative Level specifies which nonlinear function gradients are known analytically and will be supplied to E04WDF by the user subroutines OBJFUN and CONFUN.

i Meaning

- 3 All objective constraint gradients are known.
- 2 All constraint gradients are known, but some or all components of the objective gradient are unknown.
- 1 The objective gradient is known, but some or all of the constraint gradients are unknown.
- O Some components of the objective gradient are unknown and some of the constraint gradients are unknown.

The value i = 3 should be used whenever possible. It is the most reliable and will usually be the most efficient.

If i = 0 or 2, E04WDF will *estimate* the missing components of the objective gradient, using finite differences. This may simplify the coding of subroutine OBJFUN. However, it could increase the total run-time substantially (since a special call to OBJFUN is required for each missing element), and there is less assurance that an acceptable solution will be located. If the nonlinear variables are not well scaled, it may be necessary to specify a nonstandard **Difference Interval** (see below).

If i=0 or 1, E04WDF will estimate missing elements of the Jacobian. For each column of the Jacobian, one call to CONFUN is needed to estimate all missing elements in that column, if any. If the sparsity pattern of the Jacobian happens to be

where * indicates known gradients and ? indicates unknown elements, E04WDF will use one call to CONFUN to estimate the missing element in column 2, and another call to estimate both missing elements in column 3. No calls are needed for columns 1 and 4.

At times, central differences are used rather than forward differences. Twice as many calls to OBJFUN and CONFUN are needed. (This is not under the user's control.)

<u>Derivative Linesearch</u> Nonderivative Linesearch

Default

At each major iteration a line search is used to improve the merit function. A **Derivative Linesearch** uses safeguarded cubic interpolation and requires both function and gradient values to compute estimates of the step α_k . If some analytic derivatives are not provided, or a **Nonderivative Linesearch** is specified, E04WDF employs a line search based upon safeguarded quadratic interpolation, which does not require gradient evaluations.

A nonderivative line search can be slightly less robust on difficult problems, and it is recommended that the default be used if the functions and derivatives can be computed at approximately the same cost. If the gradients are very expensive relative to the functions, a nonderivative line search may give a significant decrease in computation time.

Difference Interval r Default $= \epsilon^{0.4}$

This alters the interval r that is used to estimate gradients by forward differences in the following circumstances:

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in the interval ('cheap') phase of verifying the problem derivatives;

for verifying the problem derivatives;

for estimating missing derivatives.

In all cases, a derivative with respect to x_j is estimated by perturbing that component of x to the value $x_j + r(1 + |x_j|)$, and then evaluating F(x) or c(x) at the perturbed point. The resulting gradient estimates should be accurate to O(r) unless the functions are badly scaled. Judicious alteration of r may sometimes lead to greater accuracy.

Dump File and **Load File** are similar to **Punch File** and **Insert File**, but they record solution information in a manner that is more direct and more easily modified. A full description of information recorded in **Dump File** and **Load File** is given in Gill *et al.* (1999).

If $i_1 > 0$, the last solution obtained will be output to the file with unit number i_1 .

If $i_2 > 0$, the **Load File** containing basis information will be read. The file will usually have been output previously as a **Dump File**. The file will not be accessed if an **Old Basis File** or an **Insert File** is specified.

Elastic Mode Default = No

Normally E04WDF initiates elastic mode only when it seems necessary. Option Yes causes elastic mode to be entered from the beginning.

Elastic Weight r Default = 10^4

This keyword determines the intial weight γ associated with the problem (11) (see Section 10.5).

At major iteration k, if elastic mode has not yet started, a scale factor $\sigma_k = 1 + \|g(x_k)\|_{\infty}$ is defined from the current objective gradient. Elastic mode is then started if the QP subproblem is infeasible, or the QP dual variables are larger in magnitude than $\sigma_k r$. The QP is re-solved in elastic mode with $\gamma = \sigma_k r$.

Thereafter, major iterations continue in elastic mode until they converge to a point that is optimal for (11) (see Section 10.5). If the point is feasible for (v=w=0), it is declared locally optimal. Otherwise, γ is increased by a factor of 10 and major iterations continue.

Expand Frequency i Default = 10000

This option is part of the anti-cycling procedure designed to make progress even on highly degenerate problems.

For linear models, the strategy is to force a positive step at every iteration, at the expense of violating the bounds on the variables by a small amount. Suppose that the **Minor Feasibility Tolerance** is δ . Over a period of i iterations, the tolerance actually used by E04WDF increases from 0.5δ to δ (in steps of $0.5\delta/i$).

For nonlinear models, the same procedure is used for iterations in which there is only one superbasic variable. (Cycling can occur only when the current solution is at a vertex of the feasible region.) Thus, zero steps are allowed if there is more than one superbasic variable, but otherwise positive steps are enforced.

Increasing i helps reduce the number of slightly infeasible nonbasic basic variables (most of which are eliminated during a resetting procedure). However, it also diminishes the freedom to choose a large pivot element (see **Pivot Tolerance**).

Factorisation Frequency i Default = 50

At most i basis changes will occur between factorizations of the basis matrix.

With linear programs, the basis factors are usually updated every iteration. The default i is reasonable for typical problems. Higher values up to i = 100 (say) may be more efficient on well scaled problems.

When the objective function is nonlinear, fewer basis updates will occur as an optimum is approached. The number of iterations between basis factorizations will therefore increase. During these iterations a test is made regularly (according to the **Check Frequency**) to ensure that the general constraints are satisfied. If necessary the basis will be refactorized before the limit of i updates is reached.

Feasibility Tolerance i Default = 1.0D - 6

See Minor Feasiblity Tolerance.

Function Precision r Default $= \epsilon^{0.8}$

The relative function precision ϵ_r is intended to be a measure of the relative accuracy with which the functions can be computed. For example, if F(x) is computed as 1000.56789 for some relevant x and if the first 6 significant digits are known to be correct, the appropriate value for ϵ_r would be 1.0D-6.

(Ideally the functions F(x) or $c_i(x)$ should have magnitude of order 1. If all functions are substantially less than 1 in magnitude, ϵ_r should be the absolute precision. For example, if F(x) = 1.23456789D - 4 at some point and if the first 6 significant digits are known to be correct, the appropriate value for ϵ_r would be 1.0D - 10.)

The default value of ϵ_r is appropriate for simple analytic functions.

In some cases the function values will be the result of extensive computation, possibly involving a costly iterative procedure that can provide few digits of precision. Specifying an appropriate **Function Precision** may lead to savings, by allowing the line search procedure to terminate when the difference between function values along the search direction becomes as small as the absolute error in the values.

Hessian Full Memory Hessian Limited Memory Default = Full if $n_1 \le 75$

These options select the method for storing and updating the approximate Hessian. (E04WDF uses a quasi-Newton approximation to the Hessian of the Lagrangian. A BFGS update is applied after each major iteration.)

If **Hessian Full Memory** is specified, the approximate Hessian is treated as a dense matrix and the BFGS updates are applied explicitly. This option is most efficient when the number of nonlinear variables n_1 is not too large (say, less than 75). In this case, the storage requirement is fixed and one can expect 1-step Q-superlinear convergence to the solution.

Hessian Limited Memory should be used on problems where n_1 is very large. In this case a limited-memory procedure is used to update a diagonal Hessian approximation H_r a limited number of times. (Updates are accumulated as a list of vector pairs. They are discarded at regular intervals after H_r has been reset to their diagonal.)

Hessian Frequency i Default = 99999999

If **Hessian Full Memory** is selected and *i* BFGS updates have already been carried out, the Hessian approximation is reset to the identity matrix. (For certain problems, occasional resets may improve convergence, but in general they should not be necessary.)

Hessian Full Memory and Hessian Frequency = 20 have a similar effect to Hessian Limited Memory and Hessian Updates = 20 (except that the latter retains the current diagonal during resets).

Hessian Updates i Default = 999999999

If **Hessian Limited Memory** is selected and i BFGS updates have already been carried out, all but the diagonal elements of the accumulated updates are discarded and the updating process starts again.

Broadly speaking, the more updates stored, the better the quality of the approximate Hessian. However, the more vectors stored, the greater the cost of each QP iteration. The default value is likely to give a robust algorithm without significant expense, but faster convergence can sometimes be obtained with significantly fewer updates (e.g., i=5).

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Infinite Bound Size r Default = 10^{20}

If r > 0, r defines the 'infinite' bound bigbnd in the definition of the problem constraints. Any upper bound greater than or equal to bigbnd will be regarded as plus infinity (and similarly any lower bound less than or equal to -bigbnd will be regarded as minus infinity). If $r \le 0$, the default value is used.

Linesearch Tolerance r Default = 0.9

This tolerance, r, controls the accuracy with which a steplength will be located along the direction of each search iteration. At the start of each line search a target directional derivative for the merit function is identified. This parameter determines the accuracy to which this target value is approximated.

r must be a *double precision* value in the range $0.0 \le r \le 1.0$.

The default value r = 0.9 requests just moderate accuracy in the line search.

If the nonlinear functions are cheap to evaluate, a more accurate search may be appropriate; try $r=0.1,\,0.01$ or 0.001.

If the nonlinear functions are expensive to evaluate, a less accurate search may be appropriate. If all gradients are known, try r = 0.99. (The number of major iterations might increase, but the total number of function evaluations may decrease enough to compensate.)

If not all gradients are known, a moderately accurate search remains appropriate. Each search will require only 1–5 function values (typically), but many function calls will then be needed to estimate missing gradients for the next iteration.

 $\frac{List}{Nolist}$ Default = Nolist

For E04WDF, normally each optional parameter specification is printed as it is supplied. **Nolist** may be used to suppress the printing and **List** may be used to turn on printing.

LUFactor Tolerance r_1 Default = 1.01LUUpdate Tolerance r_2 Default = 1.01

The values of r_1 and r_2 affect the stability of the basis factorization B = LU, during refactorization and updates respectively. The lower triangular matrix L is a product of matrices of the form

$$\begin{pmatrix} 1 & 1 \\ \mu & 1 \end{pmatrix}$$

where the multipliers μ will satisfy $|\mu| \le r_i$. The default values of r_1 and r_2 usually strike a good compromise between stability and sparsity. They must satisfy r_1 , $r_2 \ge 1.0$.

For large and relatively dense problems, $r_1 = 10.0$ or 5.0 (say) may give a useful improvement in stability without impairing sparsity to a serious degree.

LU Partial Pivoting Default

LU Rook Pivoting

LU Complete Pivoting

The LU factorization implements a Markowitz-type search for a pivot that locally minimizes the fill-in subject to a threshhold pivoting stability criterion. The default option is to use threshhold partial pivoting. The options LU Rook Pivoting and LU Complete Pivoting are more expensive than partial pivoting but are more stable and better at revealing rank.

LU
LUDensity Tolerance r_1 Default = 0.6LUSingularity Tolerance r_2 Default = $\sqrt{\epsilon}$

The density tolerance, r_1 , is used during LU factorization of the basis matrix. Columns of L and rows of U are formed one at a time, and the remaining rows and columns of the basis are altered appropriately. At any stage, if the density of the remaining matrix exceeds r_1 , the Markowitz strategy for choosing pivots is terminated. The remaining matrix is factored by a dense LU procedure. Raising the density tolerance towards 1.0 may give slightly sparser LU factors, with a slight increase in factorization time.

The singularity tolerance, r_2 , helps guard against ill-conditioned basis matrices. When the basis is refactorized, the diagonal elements of U are tested as follows: if $|U_{jj}| \le r_2$ or $|U_{jj}| < r_2 \max_i |U_{ij}|$, the jth column of the basis is replaced by the corresponding slack variable. (This is most likely to occur after a restart, or at the start of a major iteration.)

In some cases, the Jacobian matrix may converge to values that make the basis exactly singular. (For example, a whole row of the Jacobian could be zero at an optimal solution.) Before exact singularity occurs, the basis could become very ill-conditioned and the optimization could progress very slowly (if at all). Setting a larger tolerance $r_2 = 1.0D - 5$, say, may help cause a judicious change of basis.

Major Feasibility Tolerance

r

Default = 1.0D - 6

This tolerance, r, specifies how accurately the nonlinear constraints should be satisfied. The default value is appropriate when the linear and nonlinear constraints contain data to about that accuracy.

Let *rowerr* be the maximum nonlinear constraint violation, normalized by the size of the solution. It is required to satisfy

$$rowerr = \max_{i} \ viol_i / \|x\| \le r, \tag{12}$$

where $viol_i$ is the violation of the *i*th nonlinear constraint (i = 1 : NCLIN).

In the major iteration log (see Section 12.2, *rowerr* appears as the quantity labelled 'Feasible'. If some of the problem functions are known to be of low accuracy, a larger **Major Feasibility Tolerance** may be appropriate.

Major Optimality Tolerance

r

Default = 2.0D - 6

This tolerance, r, specifies the final accuracy of the dual variables. On successful termination, E04WDF will have computed a solution (x, s, π) such that

$$maxComp = \max_{j} Comp_{j} / \|\pi\| \le r, \tag{13}$$

where $Comp_j$ is an estimate of the complementarity slackness for variable j (j=1:n+m). The values $Comp_i$ are computed from the final QP solution using the reduced gradients $d_j = g_j - \pi^T a_j$ (where g_j is the jth component of the objective gradient, a_j is the associated column of the constraint matrix (A - I), and π is the set of QP dual variables):

$$Comp_{j} = \begin{cases} d_{j}\min\{x_{j} - l_{j}, 1\} & \text{if } d_{j} \ge 0; \\ -d_{j}\min\{u_{j} - x_{j}, 1\} & \text{if } d_{j} < 0. \end{cases}$$
(14)

In the **Print File**, maxComp appears as the quantity labelled 'Optimal'.

Major Iterations Limit

i

 $Default = \max\{1000, m\}$

This is the maximum number of major iterations allowed. It is intended to guard against an excessive number of linearizations of the constraints.

Major Print Level i Default = 00001

This controls the amount of output to the **Print File** and **Summary File** at each major iteration. **Major Print Level** 0 suppresses most output, except for error messages. **Major Print Level** 1 gives normal output for linear and nonlinear problems, and **Major Print Level** 11 gives additional details of the Jacobian factorization that commences each major iteration.

In general, the value being specified may be thought of as a binary number of the form

Major Print Level JFDXbs

where each letter stands for a digit that is either 0 or 1 as follows:

- a single line that gives a summary of each major iteration. (This entry in JFDXbs is not strictly binary since the summary line is printed whenever $JFDXbs \ge 1$;
- basis statistics, i.e., information relating to the basis matrix whenever it is refactorized. (This output is always provided if $JFDXbs \ge 10$;

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- X x_k , the nonlinear variables involved in the objective function or the constraints;
- $D = \pi_k$, the dual variables for the nonlinear constraints;
- F $F(x_k)$, the values of the nonlinear constraint functions;
- $J = J(x_k)$, the Jacobian matrix.

To obtain output of any items JFDXbs, set the corresponding digit to 1, otherwise to 0.

If J=1, the Jacobian matrix will be output column-wise at the start of each major iteration. Column j will be preceded by the value of the corresponding variable x_j and a key to indicate whether the variable is basic, superbasic or nonbasic. (Hence if J=1, there is no reason to specify X=1 unless the objective contains more nonlinear variables than the Jacobian.) A typical line of output is

```
3 1.250000D+-1 BS 1 1.00000D+00 4 2.00000D+00
```

which would mean that x_3 is basic at value 12.5, and the third column of the Jacobian has elements of 1.0 and 2.0 in rows 1 and 4.

This parameter limits the change in x during a line search. It applies to all nonlinear problems, once a 'feasible solution' or 'feasible subproblem' has been found.

- 1. A line search determines a step α over the range $0 < \alpha \le \beta$, where β is 1 if there are nonlinear constraints, or the step to the nearest upper or lower bound on x if all the constraints are linear. Normally, the first steplength tried is $\alpha_1 = \min(1, \beta)$.
- 2. In some cases, such as $f(x) = ae^{bx}$ or $f(x) = ax^b$, even a moderate change in the components of x can lead to floating-point overflow. The parameter r is therefore used to define a limit $\bar{\beta} = r(1 + ||x||)/||p||$ (where p is the search direction), and the first evaluation of f(x) is at the potentially smaller steplength $\alpha_1 = \min(1, \bar{\beta}, \beta)$.
- 3. Wherever possible, upper and lower bounds on x should be used to prevent evaluation of nonlinear functions at meaningless points. The **Major Step Limit** provides an additional safeguard. The default value r=2.0 should not affect progress on well behaved problems, but setting r=0.1 or 0.01 may be helpful when rapidly varying functions are present. A 'good' starting point may be required. An important application is to the class of nonlinear least-squares problems.
- 4. In cases where several local optima exist, specifying a small value for r may help locate an optimum near the starting point.

<u>Minimize</u> Default

Maximize Feasible Point

The keywords **Minimize** and **Maximize** specify the required direction of optimization. It applies to both linear and nonlinear terms in the objective.

The keyword **Feasible Point** means 'Ignore the objective function' while finding a feasible point for the linear and nonlinear constraints. It can be used to check that the nonlinear constraints are feasible without altering the call to E04WDF.

<u>Minor</u> <u>Feasibility Tolerance</u> r Default = 1.0D - 6

E04WDF tries to ensure that all variables eventually satisfy their upper and lower bounds to within this tolerance, r. This includes slack variables. Hence, general linear constraints should also be satisfied to within r.

Feasibility with respect to nonlinear constraints is judged by the **Major Feasibility Tolerance** (not by r).

If the bounds and linear constraints cannot be satisfied to within r, the problem is declared *infeasible*. Let sInf be the corresponding sum of infeasibilities. If sInf is quite small, it may be appropriate to raise r by a factor of 10 or 100. Otherwise, some error in the data should be suspected.

Nonlinear functions will be evaluated only at points that satisfy the bounds and linear constraints. If there are regions where a function is undefined, every attempt should be made to eliminate these regions from the problem.

For example, if $f(x) = \sqrt{x_1} + \log(x_2)$, it is essential to place lower bounds on both variables. If $r = 1.0 \, \mathrm{D} - 6$, the bounds $x_1 \ge 10^{-5}$ and $x_2 \ge 10^{-4}$ might be appropriate. (The log singularity is more serious. In general, keep x as far away from singularities as possible.)

If **Scale Option** \geq 1, feasibility is defined in terms of the *scaled* problem (since it is then more likely to be meaningful).

In reality, E04WDF uses r as a feasibility tolerance for satisfying the bounds on x and s in each QP subproblem. If the sum of infeasibilities cannot be reduced to zero, the QP subproblem is declared infeasible. E04WDF is then in *elastic mode* thereafter (with only the linearized nonlinear constraints defined to be elastic). See the **Elastic Mode** options.

Minor Iterations Limit

Default = 500

If the number of minor iterations for the optimality phase of the QP subproblem exceeds i, then all nonbasic QP variables that have not yet moved are frozen at their current values and the reduced QP is solved to optimality.

Note that more than i minor iterations may be necessary to solve the reduced QP to optimality. These extra iterations are necessary to ensure that the terminated point gives a suitable direction for the line search.

In the major iteration log (see Section 12.2) a 't' at the end of a line indicates that the corresponding QP was artificially terminated using the limit i.

Note that **Minor Iterations Limit** defines and independent *absolute* limit on the *total* number of minor iterations (summed over all QP subproblems).

This controls the amount of output to the **Print File** and **Summary File** during solution of the QP subproblems. The value of i has the following effect:

- No minor iteration output except error messages.
- ≥ 1 A single line of output at each minor iteration (controlled by **Print Frequency** and **Summary Frequency**.
- ≥ 10 Basis factorization statistics generated during the periodic refactorization of the basis (see **Factorization Frequency**). Statistics for the *first factorization* each major iteration are controlled by the **Major Print Level**.

New Basis File i_1 Default = 0Backup Basis File i_2 Default = 0Save Frequency i_3 Default = 100

New Basis File and **Backup Basis File** are sometimes referred to as basis maps. They contain the most compact representation of the state of each variable. They are intended for restarting the solution of a problem at a point that was reached by an earlier run. For non-trivial problems, it is advisable to save basis maps at the end of a run, in order to restart the run if necessary.

If $i_1 > 0$, a basis map will be saved on the file associated with unit i_1 every i_3 th iteration. The first record of the file will contain the word PROCEEDING if the run is still in progress. A basis map will also be saved at the end of a run, with some other word indicating the final solution status.

Using $i_2 > 0$, is intended as a safeguard against losing the results of a long run. Suppose that a **New Basis File** is being saved every 100 (**Save Frequency**) iterations, and that E04WDF is about to save such a basis at iteration 2000. It is conceivable that the run may be interrupted during the next few milliseconds (in the middle of the save). In this case the basis file will be corrupted and the run will have been essentially wasted.

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To eliminate this risk, both a **New Basis File** and a **Backup Basis File** may be specified. The following would be suitable for the above example:

```
Backup Basis File 11
New Basis File 12
```

The current basis will then be saved every 100 iterations, first on the file associated with unit 12 and then immediately on the file associated with unit 11. If the run is interrupted at iteration 2000 during the save on the file associated with unit 12, there will still be a usable basis on the file associated with unit 11 (corresponding to iteration 1900).

Note that a new basis will be saved in **New Basis File** at the end of a run if it terminates normally, but it will not be saved in **Backup Basis File**. In the above example, if an optimum solution is found at iteration 2050 (or if the iteration limit is 2050), the final basis on the file associated with unit 12 will correspond to iteration 2050, but the last basis saved on the file associated with unit 11 will be the one for iteration 2000.

A full description of information recorded in **New Basis File** and **Backup Basis File** is given in Gill *et al.* (1999).

New Superbasics Limit

i

Default = 99

This option causes early termination of the QP subproblems if the number of free variables has increased significantly since the first feasible point. If the number of new superbasics is greater than i the nonbasic variables that have not yet moved are frozen and the resulting smaller QP is solved to optimality.

In the major iteration log (see Section 12.1), a 'T' at the end of a line indicates that the QP was terminated early in this way.

Old Basis File i Default = 0

If i > 0, the basis maps information will be obtained from this file. A full description of information recorded in **New Basis File** and **Backup Basis File** is given in Gill *et al.* (1999). The file will usually have been output previously as a **New Basis File** or **Backup Basis File**.

The file will not be acceptable if the number of rows or columns in the problem has been altered.

Partial Price i Default = 1

This parameter is recommended for large problems that have significantly more variables than constraints. It reduces the work required for each 'pricing' operation (when a nonbasic variable is selected to become superbasic).

When i = 1, all columns of the constraint matrix (A - I) are searched.

Otherwise, A and I are partitioned to give i roughly equal segments A_j , I_j (j = 1 to i). If the previous pricing search was successful on A_j , I_j , the next search begins on the segments A_{j+1} I_{j+1} . (All subscripts here are modulo i.)

If a reduced gradient is found that is larger than some dynamic tolerance, the variable with the largest such reduced gradient (of appropriate sign) is selected to become superbasic. If nothing is found, the search continues on the next segments A_{j+2} I_{j+2} , and so on.

Partial Price r (or r/2 or r/3) may be appropriate for time-stage models having r time periods.

Pivot Tolerance r Default = $10 \times \epsilon$

During the solution of QP subproblems, the pivot tolerance is used to prevent columns entering the basis if they would cause the basis to become almost singular.

When x changes to $x + \alpha p$ for some search direction p, a 'ratio test' is used to determine which component of x reaches an upper or lower bound first. The corresponding element of p is called the pivot element

Elements of p are ignored (and therefore cannot be pivot elements) if they are smaller than the pivot tolerance r.

It is common for two or more variables to reach a bound at essentially the same time. In such cases, the **Minor Feasibility Tolerance** (say t) provides some freedom to maximize the pivot element and thereby improve numerical stability. Excessively small values of t should therefore not be specified.

To a lesser extent, the **Expand Frequency** (say f) also provides some freedom to maximize the pivot element. Excessively *large* values of f should therefore not be specified.

Print File i Default = 0

If i > 0, the following information is output to a file associated with unit i during the solution of each problem:

a listing of the optional parameters;

some statistics about the problem;

the amount of storage available for the LU factorization of the basis matrix;

notes about the initial basis resulting from a crash procedure or a Basis File;

the iteration log;

basis factorization statistics;

the exit IFAIL condition and some statistics about the solution obtained;

the printed solution, if requested.

These items are described in Sections 8 and 12. Further brief output may be directed to the **Summary File**.

Print Frequency i Default = 100

If i > 0, one line of the iteration log will be printed every ith iteration. A value such as i = 10 is suggested for those interested only in the final solution.

Proximal Point Method

i Default = 1

i=1 or 2 specifies minimization of $||x-x_0||_1$ or $\frac{1}{2}||x-x_0||_2^2$ when the starting point x_0 is changed to satisfy the linear constraints (where x_0 refers to nonlinear variables).

Punch File i_1 Default = 0Insert File i_2 Default = 0

The **Punch File** from a previous run may be used as an **Insert File** for a later run on the same problem. A full description of information recorded in **Insert File** and **Punch File** is given in Gill *et al.* (1999).

If $i_1 > 0$, the final solution obtained will be output to the file associated with unit i_2 . For linear programs, this format is compatible with various commercial systems.

If $i_2 > 0$, the **Insert File** containing basis information will be read from unit i_2 . The file will usually have been output previously as a **Punch File**. The file will not be accessed if **Old Basis File** is specified.

Three scale options are available as follows:

i Meaning

- No scaling. This is recommended if it is known that x and the constraint matrix never have very large elements (say, larger than 1000).
- The constraints and variables are scaled by an iterative procedure that attempts to make the matrix coefficients as close as possible to 1.0 (see Fourer (1982)). This will sometimes improve the performance of the solution procedures.

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The constraints and variables are scaled by the iterative procedure. Also, a certain additional scaling is performed that may be helpful if the right-hand side b or the solution x is large. This takes into account columns of $\begin{pmatrix} A & -I \end{pmatrix}$ that are fixed or have positive lower bounds or negative upper bounds.

Scale Tolerance affects how many passes might be needed through the constraint matrix. On each pass, the scaling procedure computes the ratio of the largest and smallest non-zero coefficients in each column:

$$ho_j = \max_i \ ig|a_{ij}ig|/ \min_i \ ig|a_{ij}ig| \quad ig(a_{ij}
eq 0ig).$$

If $\max \rho_j$ is less than r times its previous value, another scaling pass is performed to adjust the row and column scales. Raising r from 0.9 to 0.99 (say) usually increases the number of scaling passes through A. At most 10 passes are made.

Solution File i Default = 0

If i > 0, the final solution will be output to file i (whether optimal or not). All numbers are printed in 1pe16.6 format.

To see more significant digits in the printed solution, it will sometimes be useful to make i refer to **Print File**.

Start Objective Check At Variable	i_1	Default = 1
Stop Objective Check At Variable	i_2	Default = n
Start Constraint Check At Variable	i_3	Default = 1
Stop Constraint Check At Variable		Default = n

These keywords take effect only if **Verify Level** > 0. They may be used to control the verification of gradient elements computed by subroutine OBJFUN and/or Jacobian elements computed by subroutine CONFUN. For example, if the first 30 elements of the objective gradient appeared to be correct in an earlier run, so that only element 31 remains questionable, it is reasonable to specify **Start Objective Check At Variable** 31. If the first 30 variables appear linearly in the objective, so that the corresponding gradient elements are constant, the above choice would also be appropriate.

Summary File	i_1	Default = 0
Summary Frequency	i_2	Default = 100

If $i_1 > 0$, a brief log will be output to the file associated with unit i_1 , including one line of information every i_2 th iteration. In an interactive environment, it is useful to direct this output to the terminal, to allow a run to be monitored on-line. (If something looks wrong, the run can be manually terminated.) Further details are given in Section 12.6.

Superbasics Limit i Default = $min(500, n_1 + 1)$

This places a limit on the storage allocated for superbasic variables. Ideally, i should be set slightly larger than the 'number of degrees of freedom' expected at an optimal solution.

For linear programs, an optimum is normally a basic solution with no degrees of freedom. (The number of variables lying strictly between their bounds is no more than m, the number of general constraints.) The default value of i is therefore 1.

For nonlinear problems, the number of degrees of freedom is often called the 'number of independent variables'.

Normally, i need not be greater than $n_1 + 1$, where n_1 is the number of nonlinear variables.

For many problems, i may be considerably smaller than n_1 . This will save storage if n_1 is very large.

Suppress Parameters

Normally E04WDF prints the optional file as it is being read, and then prints a complete list of the available keywords and their final values. The **Suppress Parameters** option tells E04WDF not to print the full list.

Timing Level i Default = 0

If i > 0, some timing information will be output to the **Print File**, if it is > 0.

Unbounded Objective r_1 Default = 1.0D + 15Unbounded Step Size r_2 Default = 1.0D + 20

These parameters are intended to detect unboundedness in nonlinear problems. During a line search, F is evaluated at points of the form $x + \alpha p$, where x and p are fixed and α varies. If |F| exceeds r_1 or α exceeds r_2 , iterations are terminated with the exit message

Problem is unbounded (or badly scaled)

If singularities are present, unboundedness in F(x) may be manifested by a floating-point overflow (during the evaluation of $F(x + \alpha p)$), before the test against r_1 can be made.

Unboundedness in x is best avoided by placing finite upper and lower bounds on the variables.

Verify Level i Default = 0

This option refers to finite-difference checks on the derivatives computed by the user-provided routines. Derivatives are checked at the first point that satisfies all bounds and linear constraints.

i Meaning

- Only a 'cheap' test will be performed, requiring two calls to CONFUN.
- Individual gradients will be checked (with a more reliable test). A key of the form OK or Bad? indicates whether or not each component appears to be correct.
- 2 Individual columns of the problem Jacobian will be checked.
- 3 Options 2 and 1 will both occur (in that order).
- -1 Derivative checking is disabled.

Verify Level 3 should be specified whenever a new function routine is being developed. The **Start** and **Stop** keywords may be used to limit the number of nonlinear variables checked. Missing derivatives are not checked, so they result in no overhead.

Violation Limit r Default = 1.0D + 6

This keyword defines an absolute limit on the magnitude of the maximum constraint violation, r, after the line search. On completion of the line search, the new iterate x_{k+1} satisfies the condition

$$v_i(x_{k+1}) \le r \max\{1, v_i(x_0)\},\$$

where x_0 is the point at which the nonlinear constraints are first evaluated and $v_i(x)$ is the *i*th nonlinear constraint violation $v_i(x) = \max(0, l_i - c(x), c(x) - u_i)$.

The effect of this violation limit is to restrict the iterates to lie in an *expanded* feasible region whose size depends on the magnitude of r. This makes it possible to keep the iterates within a region where the objective is expected to be well-defined and bounded below. If the obective is bounded below for all values of the variables, then r may be any large positive value.

12 Description of Monitoring Information

E04WDF produces monitoring information, statistical information and information about the solution. Section 8.1 contains the final output information sent to **Print File**. This section contains other output information.

12.1 Major Iteration Log

This section describes the output to **Print File** if **Major Print Level** > 0. One line of information is output every kth major iteration, where k is **Print Frequency**.

Label Description

Itns is the cumulative number of minor iterations.

Major is the current major iteration number.

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Minors

is the number of iterations required by both the feasibility and optimality phases of the QP subproblem. Generally, Minors will be 1 in the later iterations, since theoretical analysis predicts that the correct active set will be identified near the solution (see Section 10).

Step

is the step length α taken along the current search direction p. The variables x have just been changed to $x+\alpha p$. On reasonably well-behaved problems, the unit step will be taken as the solution is approached.

nCon

the number of times subroutine CONFUN has been called to evaluate the nonlinear problem functions. Evaluations needed for the estimation of the derivatives by finite differences are not included. nCon is printed as a guide to the amount of work required for the line search.

Feasible

is the value of *rowerr* (see (12)), the maximum component of the scaled nonlinear constraint residual (see **Major Feasibility Tolerance**). The solution is regarded as acceptably feasible if Feasible is less than the **Major Feasibility Tolerance**. In this case, the entry is contained in parentheses.

If the constraints are linear, all iterates are feasible and this entry is not printed.

Optimal

is the value of *maxComp* (see (13), the maximum complementary gap (see **Major Optimalility Tolerance**). It is an estimate of the degree of nonoptimality of the reduced costs. Both Feasible and Optimal are small in the neighbourhood of a solution.

MeritFunction

is the value of the augmented Lagrangian merit function (see (7)). This function will decrease at each iteration unless it was necessary to increase the penalty parameters (see Section 10.4. As the solution is approached, MeritFunction will converge to the value of the objective at the solution.

In elastic mode, the merit function is a composite function involving the constraint violations weighted by the elastic weight.

If the constraints are linear, this item is labelled Objective, the value of the objective function. It will decrease monotonically to its optimal value.

L+U

is the number of non-zeros representing the basis factors L and U on completion of the QP subproblem.

If nonlinear constraints are present, the basis factorization B=LU is computed at the start of the first minor iteration. At this stage, LU=lenL+lenU, where LenL (see Section 12.3) is the number of sub-diagonal elements in the columns of a lower triangular matrix and lenU (see Section 12.3) is the number of diagonal and super-diagonal elements in the rows of an upper-triangular matrix.

As columns of B are replaced during the minor iterations, LU may fluctuate up or down but, in general, will tend to increase. As the solution is approached and the minor iterations decrease towards zero, LU will reflect the number of non-zeros in the LU factors at the start of the QP subproblem.

If the constraints are linear, refactorization is subject only to the **Factorization Frequency**, and LU will tend to increase between factorizations.

BSwap

is the number of columns of the basis matrix B that were swapped with columns of S to improve the condition of B. The swaps are determined by an LU factorization of the rectangular matrix $B_S = (B\ S)^T$ with stability being favoured more than sparsity.

nS

is the current number of superbasic variables.

CondHz

is an estimate of the condition number of R^TR , an estimate of Z^THZ , the reduced Hessian of the Lagrangian. It is the square of the ratio of the largest and smallest diagonals of the upper triangular matrix R (which is a lower bound on the condition number of R^TR). CondHz gives a rough indication of whether or not the optimization procedure is having difficulty. If ϵ is the relative *machine precision*

being used, the SQP algorithm will make slow progress if CondHz becomes as large as $\epsilon^{-1/2} \approx 10^8$, and will probably fail to find a better solution if CondHz reaches $\epsilon^{-3/4} \approx 10^{12}$.

To guard against high values of CondHz, attention should be given to the scaling of the variables and the constraints. In some cases it may be necessary to add upper or lower bounds to certain variables to keep them a reasonable distance from singularities in the nonlinear functions or their derivatives.

Penalty

is the Euclidean norm of the vector of penalty parameters used in the augmented Lagrangian merit function (not printed if there are no nonlinear constraints).

The summary line may include additional code characters that indicate what happened during the course of the major iteration.

Label	Description
С	central differences have been used to compute the unknown components of the objective and constraint gradients. A switch to central differences is made if either the line search gives a small step, or x is close to being optimal. In some cases, it may be necessary to re-solve the QP subproblem with the central difference gradient and Jacobian.
d	during the line search it was necessary to decrease the step in order to obtain a maximum constraint violation conforming to the value of Violation Limit .
1	the norm-wise change in the variables was limited by the value of the Major Step Limit . If this output occurs repeatedly during later iterations, it may be worthwhile increasing the value of Major Step Limit .
i	If E04WDF is not in elastic mode, an 'i' signifies that the QP subproblem is infeasible. This event triggers the start of nonlinear elastic mode, which remains in effect for all subsequent iterations. Once in elastic mode, the QP subproblems are associated with the elastic problem (11) (see Section 10.5).
	If E04WDF is already in elastic mode, an 'i' indicates that the minimizer of the elastic subproblem does not satisfy the linearized constraints. (In this case, a feasible point for the usual QP subproblem may or may not exist.)
М	an extra evaluation of the problem functions was needed to define an acceptable positive-definite quasi-Newton update to the Lagrangian Hessian. This modification is only done when there are nonlinear constraints.
m	this is the same as 'M' except that it was also necessary to modify the update to include an augmented Lagrangian term.
n	no positive-definite BFGS update could be found. The approximate Hessian is unchanged from the previous iteration.
R	the approximate Hessian has been reset by discarding all but the diagonal elements. This reset will be forced periodically by the Hessian Frequency and Hessian Updates keywords. However, it may also be necessary to reset an ill-conditioned Hessian from time to time.
r	the approximate Hessian was reset after ten consecutive major iterations in which no BFGS update could be made. The diagonals of the approximate Hessian are retained if at least one update has been done since the last reset. Otherwise, the approximate Hessian is reset to the identity matrix.
S	a self-scaled BFGS update was performed. This update is always used when the Hessian approximation is diagonal, and hence always follows a Hessian reset.
t	the minor iterations were terminated because of the Minor Iterations Limit.
T	the minor iterations were terminated because of the New Superbasics Limit.
u	the QP subproblem was unbounded.

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a weak solution of the QP subproblem was found.

z the **Superbasics Limit** was reached.

12.2 Minor Iteration Log

If **Minor Print Level** > 0, one line of information is output to the **Print File** every kth minor iteration, where k is the specified **Print Frequency**. A heading is printed before the first such line following a basis factorization. The heading contains the items described below. In this description, a pricing operation is defined to be the process by which a nonbasic variable is selected to become superbasic (in addition to those already in the superbasic set). The selected variable is denoted by jq. Variable jq often becomes basic immediately. Otherwise it remains superbasic, unless it reaches its opposite bound and returns to the nonbasic set.

If **Partial Price** is in effect, variable jq is selected from A_{pp} or I_{pp} , the ppth segments of the constraint matrix $(A \mid -I)$.

Label	Description
-------	-------------

Itn the current iteration number.

RedCost or QPmult is the reduced cost (or reduced gradient) of the variable jq selected by the pricing

procedure at the start of the present iteration. Algebraically, dg is $d_j = g_j - \pi^T a_j$ for j = jq, where g_j is the gradient of the current objective function, π is the vector of dual variables for the QP subproblem, and a_j is the *j*th column of $(A \mid -I)$.

Note that dj is the 1-norm of the reduced-gradient vector at the start of the iteration,

just after the pricing procedure.

LPstep or QPstep α is the step length α taken along the current search direction α . The variables α have

just been changed to $x + \alpha p$. If a variable is made superbasic during the current iteration (+SBS > 0), Step will be the step to the nearest bound. During Phase 2, the step can be greater than one only if the reduced Hessian is not positive-definite.

nInf is the number of infeasibilities after the present iteration. This number will not

increase unless the iterations are in elastic mode.

SumInf If nInf > 0, this is sInf, the sum of infeasibilities after the present iteration. It

usually decreases at each non-zero Step, but if nInf decreases by 2 or more,

SumInf may occasionally increase.

In elastic mode, the heading is changed to Composite Obj, and the value printed

decreases monotonically.

rgNorm is the norm of the reduced-gradient vector at the start of the iteration. (It is the

norm of the vector with elements d_j for variables j in the superbasic set.) During

Phase 2 this norm will be approximately zero after a unit step.

(The heading is not printed if the problem is linear.)

LPobjective or QPobjective

the QP objective function after the present iteration. In elastic mode, the heading is changed to Elastic QPobj. In either case, the value printed decreases

monotonically.

+SBS is the variable jq selected by the pricing operation to be added to the superbasic set.

-SBS is the variable chosen to leave the set of superbasics.

-BS is the variable removed from the basis (if any) to become nonbasic.

Pivot if column a_q replaces the rth column of the basis B, Pivot is the rth element of a

vector y satisfying $By = a_q$. Wherever possible, Step is chosen to avoid extremely small values of Pivot (since they cause the basis to be nearly singular). In rare cases, it may be necessary to increase the **Pivot Tolerance** to exclude very small

elements of y from consideration during the computation of Step.

L + U	is the number of non-zeros representing the basis factors L and U . Immediately after a basis factorization $B=LU$, this is $\mathtt{lenL}+\mathtt{lenU}$, the number of sub-diagonal elements in the columns of a lower triangular matrix and the number of diagonal and super-diagonal elements in the rows of an upper-triangular matrix. Further non-zeros are added to L when various columns of B are later replaced. As columns of B are replaced, the matrix U is maintained explicitly (in sparse form). The value of L will steadily increase, whereas the value of U may fluctuate up or down. Thus the value of L + U may fluctuate up or down (in general, it will tend to increase).
ncp	is the number of compressions required to recover storage in the data structure for U . This includes the number of compressions needed during the previous basis factorization.
nS	is the current number of superbasic variables. (The heading is not printed if the problem is linear.)
CondHz	see the major iteration log. (The heading is not printed if the problem is linear.)

12.3 Basis Factorization Statistics

If Major Print Level ≥ 10 , the following items are output to the Print File whenever the basis B or the rectangular matrix $B_S = (B S)^T$ is factorized before solution of the next QP subproblem.

Note that B_S may be factorized at the start of just some of the major iterations. It is immediately followed by a factorization of B itself.

Gaussian elimination is used to compute a sparse LU factorization of B or B_S , where PLP^T and PUQ are lower and upper triangular matrices for some permutation matrices P and Q. Stability is ensured as described under LU Factor Tolerance.

If **Minor Print Level** \geq 10, the same items are printed during the QP solution whenever the current B is factorized.

Label	Description
Factorize	the number of factorizations since the start of the run.
Demand	a code giving the reason for the present factorization.
	 Code Meaning First LU factorization. The number of updates reached the Factorization Frequency. The non-zeros in the updated factors have increased significantly. Not enough storage to update factors. Row residuals too large (see the description of Check Frequency). Ill-conditioning has caused inconsistent results.
Itn	is the current minor iteration number.
Nonlin	is the number of nonlinear variables in the current basis B .
Linear	is the number of linear variables in B .
Slacks	is the number of slack variables in B .
B BR BS or BT facto	rize is the type of LU factorization.
	B periodic factorization of the basis B . BR more careful rank-revealing factorization of B using threshold rook pivoting. This occurs mainly at the start, if the first basis factors seem singular or ill-conditioned. Followed by a normal B factorize.
	BS B_S is factorized to choose a well-conditioned B from the current $(B S)$. Followed by a normal B factorize.
	same as BS except the current B is tried first and accepted if it appears to be not much more ill-conditioned than after the previous BS factorize.

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m is the number of rows in B or B_S .

n is the number of columns in B or B_S . Preceded by '=' or '>' respectively.

Elems is the number of non-zero elements in B or B_S .

Amax is the largest non-zero in B or B_S .

Density is the percentage non-zero density of B or B_S .

Merit is the average Markowitz merit count for the elements chosen to be the diagonals of

PUQ. Each merit count is defined to be (c-1)(r-1) where c and r are the number of non-zeros in the column and row containing the element at the time it is selected to be the next diagonal. Merit is the average of n such quantities. It gives an indication of how much work was required to preserve sparsity during the

factorization.

lenL is the number of non-zeros in L.

Cmpressns is the number of times the data structure holding the partially factored matrix

needed to be compressed to recover unused storage. Ideally this number should be zero. If it is more than 3 or 4, the amount of workspace available to E04WDF

should be increased for efficiency.

Incres is the percentage increase in the number of non-zeros in L and U relative to the

number of non-zeros in B or B_S .

Utri is the number of triangular rows of B or B_S at the top of U.

lenU the number of non-zeros in U.

Ltol is the maximum subdiagonal element allowed in L. This is the specified LU

Factor Tolerance or a smaller value that is currently being used for greater stability.

Umax the maximum non-zero element in U.

Ugrwth is the ratio Umax/Amax, which ideally should not be substantially larger than 10.0 or

100.0. If it is orders of magnitude larger, it may be advisable to reduce the LU

Factor Tolerance to 5.0, 4.0, 3.0 or 2.0, say (but bigger than 1.0).

As long as Lmax is not large (say 10.0 or less), $\max\{\text{Amax}, \text{Umax}\}/\text{DUmin}$ gives an estimate of the condition number B. If this is extremely large, the basis is nearly singular. Slacks are used to replace suspect columns of B and the modified basis is

refactored.

Ltri is the number of triangular columns of B or B_S at the left of L.

dense1 is the number of columns remaining when the density of the basis matrix being

factorized reached 0.3.

Lmax is the actual maximum sub-diagonal element in L (bounded by Lto1).

Akmax is the largest non-zero generated at any stage of the LU factorization. (Values much

larger than Amax indicate instability.)

growth is the ratio Akmax/Amax. Values much larger than 100 (say) indicate instability.

bump is the size of the 'bump' or block to be factorized nontrivially after the triangular

rows and columns of ${\cal B}$ or ${\cal B}_{\cal S}$ have been removed.

dense2 is the number of columns remaining when the density of the basis matrix being

factorized reached 0.6. (The Markowitz pivot strategy searches fewer columns at

that stage.)

DUmax is the largest diagonal of PUQ.

DUmin is the smallest diagonal of PUQ.

condU the ratio DUmax/DUmin, which estimates the condition number of U (and of B if

Ltol is less than 100, say).

12.4 Crash Statistics

If Major Print Level ≥ 10 , the following items are output to the Print File when Cold Start and no basis file is loaded. They refer to the number of columns that the Crash procedure selects during selected passes through A while searching for a triangular basis matrix.

Label	Description
Slacks	is the number of slacks selected initially.
Free cols	is the number of free columns in the basis, including those whose bounds are rather far apart.
Preferred	is the number of 'preferred' columns in the basis (i.e., $hs(j) = 3$ for some $j \le n$). It will be a subset of the columns for which $hs(j) = 3$ was specified.
Unit	is the number of unit columns in the basis.
Double	is the number of columns in the basis containing 2 non-zeros.
Triangle	is the number of triangular columns in the basis with 3 or more non-zeros.
Pad	is the number of slacks used to pad the basis (to make it a nonsingular triangle).

12.5 The Solution File

At the end of a run, the final solution may be output as a solution file, according to **Solution File**. Some header information appears first to identify the problem and the final state of the optimization procedure. A ROWS section and a COLUMNS section then follow, giving one line of information for each row and column. The format used is similar to certain commercial systems, though there is no industry standard.

In general, numerical values are output with format f16.5. The maximum record length is 111 characters, including the first (carriage-control) character.

To reduce clutter, a full stop (.) is printed for any numerical value that is exactly zero. The values ± 1 are also printed specially as 1.0 and -1.0. Infinite bounds ($\pm 10^{20}$ or larger) are printed as None.

A solution file is intended to be read from disk by a self-contained program that extracts and saves certain values as required for possible further computation. Typically, the first 14 records would be ignored. Each subsequent record may be read using

adapted to suit the occasion. The end of the ROWS section is marked by a record that starts with a 1 and is otherwise blank. If this and the next 4 records are skipped, the COLUMNS section can then be read under the same format. (There should be no need for backspace statements.)

The ROWS section

The general constraints take the form $l \leq Ax \leq u$. The ith constraint is therefore of the form

$$\alpha \leq \nu_i^T x \leq \beta$$
,

where ν_i is the *i*th row of A.

Internally, the constraints take the form Ax - s = 0, where s is the set of slack variables (which happen to satisfy the bounds $l \le s \le u$). For the ith constraint it is the slack variable s_i that is directly available, and it is sometimes convenient to refer to its state. A '.' is printed for any numerical value that is exactly zero.

Label	Description
Number	is the value of $n+i$. (This is used internally to refer to s_i in the intermediate output.)
Row	gives the name of v_i .
State	the state of vi (the state of s_i relative to the bounds α and β . The various states possible are as follows:

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LL s_i is nonbasic at its lower limit, α .

UL s_i is nonbasic at its upper limit, β .

EQ s_i is nonbasic and fixed at the value $\alpha = \beta$.

FR s_i is nonbasic and currently zero, even though it is free to take any value between its bounds α and β .

BS s_i is basic.

SBS s_i is superbasic.

A key is sometimes printed before State to give some additional information about the state of a variable. Note that unless the optional parameter **Scale Option** = 0 (see Section 11.2) is specified, the tests for assigning a key are applied to the variables of the scaled problem.

- A Alternative optimum possible. The variable is nonbasic, but its reduced gradient is essentially zero. This means that if the variable were allowed to start moving away from its bound, there would be no change in the value of the objective function. The values of the other free variables might change, giving a genuine alternative solution. However, if there are any degenerate variables (labelled D), the actual change might prove to be zero, since one of them could encounter a bound immediately. In either case, the values of the Lagrange multipliers might also change.
- D Degenerate. The variable is basic or superbasic, but it is equal to (or very close to) one of its bounds.
- I *Infeasible*. The variable is basic or superbasic and is currently violating one of its bounds by more than the value of the optional parameter **Feasibility Tolerance** (see Section 11.2).
- Not precisely optimal. The variable is nonbasic or superbasic. If the value of the reduced gradient for the variable exceeds the value of the optional parameter Major Optimality Tolerance (see Section 11.2), the solution would not be declared optimal because the reduced gradient for the variable would not be considered negligible.

Activity is the value of v_i at the final iterate (the *i*th element of $A^T x$).

Slack Activity is the value by which the row differs from its nearest bound. (For the free row (if any), it is set to Activity.)

Lower Limit is α , the lower bound specified for the variable s_i . None indicates that $\mathrm{BL}(j) \leq -bigbnd$.

Upper Bound is β , the upper bound specified for the variable s_i . None indicates that $\mathrm{BU}(j) \geq bigbnd$.

Dual Activity is the value of the dual variable π_i (the Lagrange multiplier for the *i*th constraints). The full vector π always satisfies $B^T\pi=g_B$, where B is the current basis matrix and g_B contains the associated gradients for the current objective function. For FP problems, π_i is set to zero.

gives the index i of the ith row.

i

The COLUMNS section

Let the jth component of x be the variable x_j and assume that it satisfies the bounds $\alpha \le x_j \le \beta$. A '.' is printed for any numerical value that is exactly zero.

printed for any numerical value that is exactly zero.		
Label	Description	
Number	is the column number j . (This is used internally to refer to x_j in the intermediate output.)	
Column	gives the name of x_j .	
State	the state of x_j relative to the bounds α and β . The various states possible are as follows:	
	LL x_j is nonbasic at its lower limit, α .	
	UL x_j is nonbasic at its upper limit, β .	
	EQ x_j is nonbasic and fixed at the value $\alpha = \beta$.	
	FR x_j is nonbasic and currently zero, even though it is free to take any value between its bounds α and β .	
	BS x_j is basic.	
	SBS x_j is superbasic.	
	A key is sometimes printed before State to give some additional information about the state of a variable. Note that unless the optional parameter Scale Option $= 0$ (see Section 11.2) is specified, the tests for assigning a key are applied to the variables of the scaled problem.	
	Alternative optimum possible. The variable is nonbasic, but its reduced gradient is essentially zero. This means that if the variable were allowed to start moving away from its bound, there would be no change in the value of the objective function. The values of the other free variables <i>might</i> change, giving a genuine alternative solution. However, if there are any degenerate variables (labelled D), the actual change might prove to be zero, since one of them could encounter a bound immediately. In either case, the values of the Lagrange multipliers <i>might</i> also change.	
	D Degenerate. The variable is basic or superbasic, but it is equal to (or very close to) one of its bounds.	
	I <i>Infeasible</i> . The variable is basic or superbasic and is currently violating one of its bounds by more than the value of the optional parameter Feasibility Tolerance (see Section 11.2).	
	Not precisely optimal. The variable is nonbasic or superbasic. If the value of the reduced gradient for the variable exceeds the value of the optional parameter Major Optimality Tolerance (see Section 11.2), the solution would not be declared optimal because the reduced gradient for the variable would not be considered negligible.	
Activity	is the value of x_j at the final iterate.	
Obj Gradient	is the value of g_j at the final iterate. For FP problems, g_j is set to zero.	
Lower Bound	is the lower bound specified for the variable. None indicates that $\mathrm{BL}(j) \leq -bigbnd$.	
Upper Bound	is the upper bound specified for the variable. None indicates that $\mathrm{BU}(j) \geq bigbnd$.	
Reduced Gradnt	is the value of the reduced gradient $d_j = g_j - \pi^T a_j$ where a_j is the j th column of the constraint matrix. For FP problems, d_j is set to zero.	
_		

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is the value of m+j.

m + j

12.6 The Summary File

If **Summary File** > 0, the following information is output to the unit number associated with **Summary File**. (it is a brief summary of the output directed to **Print File**):

the optional parameters supplied via the option setting routines, if any;

the basis file loaded, if any;

- a brief major iteration log (see Section 12.1);
- a brief minor iteration log (see Section 12.2);

the exit condition, IFAIL;

a summary of the final iterate.

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