

Chapter B15. Modeling of Data

```

SUBROUTINE fit(x,y,a,b,siga,sigb,chi2,q,sig)
USE nrtype; USE nrutil, ONLY : assert_eq
USE nr, ONLY : gammq
IMPLICIT NONE
REAL(SP), DIMENSION(:), INTENT(IN) :: x,y
REAL(SP), INTENT(OUT) :: a,b,siga,sigb,chi2,q
REAL(SP), DIMENSION(:), OPTIONAL, INTENT(IN) :: sig
    Given a set of data points in same-size arrays x and y, fit them to a straight line  $y = a + bx$ 
    by minimizing  $\chi^2$ . sig is an optional array of the same length containing the individual
    standard deviations. If it is present, then a,b are returned with their respective probable
    uncertainties siga and sigb, the chi-square chi2, and the goodness-of-fit probability q
    (that the fit would have  $\chi^2$  this large or larger). If sig is not present, then q is returned
    as 1.0 and the normalization of chi2 is to unit standard deviation on all points.
INTEGER(I4B) :: ndata
REAL(SP) :: sigdat,ss,sx,sxoss,sy,st2
REAL(SP), DIMENSION(size(x)), TARGET :: t
REAL(SP), DIMENSION(:), POINTER :: wt
if (present(sig)) then
    ndata=assert_eq(size(x),size(y),size(sig),'fit')
    wt=>t
    wt(:)=1.0_sp/(sig(:)**2)
    ss=sum(wt(:))
    sx=dot_product(wt,x)
    sy=dot_product(wt,y)
    Use temporary variable t to store weights.
    Accumulate sums with weights.
else
    ndata=assert_eq(size(x),size(y),'fit')
    ss=real(size(x),sp)
    sx=sum(x)
    sy=sum(y)
    Accumulate sums without weights.
end if
sxoss=sx/ss
t(:)=x(:)-sxoss
if (present(sig)) then
    t(:)=t(:)/sig(:)
    b=dot_product(t,sig,y)
else
    b=dot_product(t,y)
end if
st2=dot_product(t,t)
b=b/st2
a=(sy-sx*b)/ss
    Solve for a, b,  $\sigma_a$ , and  $\sigma_b$ .
siga=sqrt((1.0_sp+sx*sx/(ss*st2))/ss)
sigb=sqrt(1.0_sp/st2)
t(:)=y(:)-a-b*x(:)
q=1.0
if (present(sig)) then
    t(:)=t(:)/sig(:)
    chi2=dot_product(t,t)
    Calculate  $\chi^2$ .
    if (ndata > 2) q=gammq(0.5_sp*(size(x)-2),0.5_sp*chi2)
    Equation (15.2.12).
else
    chi2=dot_product(t,t)

```

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```

    sigdat=sqrt(chi2/(size(x)-2))
    siga=siga*sigdat
    sigb=sigb*sigdat
end if
END SUBROUTINE fit

```

For unweighted data evaluate typical sig using chi2, and adjust the standard deviations.

f90 REAL(SP), DIMENSION(:), POINTER :: wt...wt=>t When standard deviations are supplied in sig, we need to compute the weights for the least squares fit in a temporary array wt. Later in the routine, we need another temporary array, which we call t to correspond to the variable in equation (15.2.15). It would be confusing to use the same name for both arrays. In Fortran 77 the arrays could share storage with an EQUIVALENCE declaration, but that is a deprecated feature in Fortran 90. We accomplish the same thing by making wt a pointer alias to t.

```

          *      *      *
SUBROUTINE fitexy(x,y,sigx,sigy,a,b,siga,sigb,chi2,q)
USE nrtype; USE nrutil, ONLY : assert_eq,swap
USE nr, ONLY : avevar,brent,fit,gammq,mnbrak,zbrent
USE chixyfit
IMPLICIT NONE
REAL(SP), DIMENSION(:), INTENT(IN) :: x,y,sigx,sigy
REAL(SP), INTENT(OUT) :: a,b,siga,sigb,chi2,q
REAL(SP), PARAMETER :: POTN=1.571000_sp,BIG=1.0e30_sp,ACC=1.0e-3_sp
Straight-line fit to input data x and y with errors in both x and y, the respective standard
deviations being the input quantities sigx and sigy. x, y, sigx, and sigy are all arrays of
the same length. Output quantities are a and b such that  $y = a + bx$  minimizes  $\chi^2$ , whose
value is returned as chi2. The  $\chi^2$  probability is returned as q, a small value indicating
a poor fit (sometimes indicating underestimated errors). Standard errors on a and b are
returned as siga and sigb. These are not meaningful if either (i) the fit is poor, or (ii) b
is so large that the data are consistent with a vertical (infinite b) line. If siga and sigb
are returned as BIG, then the data are consistent with all values of b.
INTEGER(I4B) :: j,n
REAL(SP), DIMENSION(size(x)), TARGET :: xx,yy,sx,sy,ww
REAL(SP), DIMENSION(6) :: ang,ch
REAL(SP) :: amx,amn,varx,vary,scale,bmn,bmx,d1,d2,r2,&
dum1,dum2,dum3,dum4,dum5
n=assert_eq(size(x),size(y),size(sigx),size(sigy),'fitexy')
xsp=>xx
yyp=>yy
sxp=>sx
syp=>sy
wsp=>ww
call avevar(x,dum1,varx)
call avevar(y,dum1,vary)
scale=sqrt(varx/vary)
xx(:)=x(:)
yy(:)=y(:)*scale
sx(:)=sigx(:)
sy(:)=sigy(:)*scale
ww(:)=sqrt(sx(:)**2+sy(:)**2)
call fit(xx,yy,dum1,b,dum2,dum3,dum4,dum5,ww)
offs=0.0
ang(1)=0.0
ang(2)=atan(b)
ang(4)=0.0
ang(5)=ang(2)
ang(6)=POTN
do j=4,6
ch(j)=chixy(ang(j))

```

Set up communication with function chixy through global variables in the module chixyfit.

Find the x and y variances, and scale the data.

Use both x and y weights in first trial fit. Trial fit for b.

Construct several angles for reference points. Make b an angle.

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```

end do
call mnbrak(ang(1),ang(2),ang(3),ch(1),ch(2),ch(3),chixy)
  Bracket the  $\chi^2$  minimum and then locate it with brent.
chi2=brent(ang(1),ang(2),ang(3),chixy,ACC,b)
chi2=chixy(b)
a=aa
q=gammq(0.5_sp*(n-2),0.5_sp*chi2)           Compute  $\chi^2$  probability.
r2=1.0_sp/sum(ww(:))                       Save inverse sum of weights at the minimum.
bmxBIG                                     Now, find standard errors for  $b$  as points where
bmn=BIG                                      $\Delta\chi^2 = 1$ .
offs=chi2+1.0_sp
do j=1,6                                     Go through saved values to bracket the de-
  if (ch(j) > offs) then                     sired roots. Note periodicity in slope an-
    d1=mod(abs(ang(j)-b),PI)                 gles.
    d2=PI-d1
    if (ang(j) < b) call swap(d1,d2)
    if (d1 < bmx) bmx=d1
    if (d2 < bmn) bmn=d2
  end if
end do
if (bmx < BIG) then                          Call zbrent to find the roots.
  bmx=zbrent(chixy,b,b+bmxBIG,ACC)-b
  amx=aa-a
  bmn=zbrent(chixy,b,b-bmn,ACC)-b
  amn=aa-a
  sigb=sqrt(0.5_sp*(bmxBIG**2+bmn**2))/(scale*cos(b)**2)
  siga=sqrt(0.5_sp*(amx**2+amn**2)+r2)/scale Error in  $a$  has additional piece
else                                          r2.
  sigb=BIG
  siga=BIG
end if
a=a/scale                                    Unscale the answers.
b=tan(b)/scale
END SUBROUTINE fitexy

```

f90 USE chixyfit We need to pass arrays and other variables to chixy, but not as arguments. See §21.5 and the discussion of fminln on p. 1197 for two good ways to do this. The pointer construction here is analogous to the one used in fminln.

```

MODULE chixyfit
USE nrtyp; USE nrutil, ONLY : nrerror
REAL(SP), DIMENSION(:), POINTER :: xxp, yyp, sxp, syp, wwp
REAL(SP) :: aa, offs
CONTAINS
FUNCTION chixy(bang)
IMPLICIT NONE
REAL(SP), INTENT(IN) :: bang
REAL(SP) :: chixy
REAL(SP), PARAMETER :: BIG=1.0e30_sp
  Captive function of fitexy, returns the value of  $(\chi^2 - \text{offs})$  for the slope  $b = \tan(\text{bang})$ .
  Scaled data and offs are communicated via the module chixyfit.
REAL(SP) :: avex, avey, sumw, b
if (.not. associated(wwp)) call nrerror("chixy: bad pointers")
b=tan(bang)
wwp(:)=(b*sxp(:)**2+syp(:)**2
where (wwp(:) < 1.0/BIG)
  wwp(:)=BIG
elsewhere
  wwp(:)=1.0_sp/wwp(:)
end where

```

```

sumw=sum(wwp)
avev=dot_product(wwp,xxp)/sumw
avey=dot_product(wwp,yyp)/sumw
aa=avey-b*avex
chixy=sum(wwp(:)*(yyp(:)-aa-b*xxp(:))**2)-offs
END FUNCTION chixy
END MODULE chixyfit

```

* * *

```

SUBROUTINE lfit(x,y,sig,a,maska,covar,chisq,funcs)
USE nrtype; USE nrutil, ONLY : assert_eq,diagmult,nrerror
USE nr, ONLY : covsrt,gaussj
IMPLICIT NONE
REAL(SP), DIMENSION(:), INTENT(IN) :: x,y,sig
REAL(SP), DIMENSION(:), INTENT(INOUT) :: a
LOGICAL(LGT), DIMENSION(:), INTENT(IN) :: maska
REAL(SP), DIMENSION(:,:), INTENT(INOUT) :: covar
REAL(SP), INTENT(OUT) :: chisq
INTERFACE

```

```

  SUBROUTINE funcs(x,arr)
  USE nrtype
  IMPLICIT NONE
  REAL(SP),INTENT(IN) :: x
  REAL(SP), DIMENSION(:), INTENT(OUT) :: arr
  END SUBROUTINE funcs
END INTERFACE

```

Given a set of N data points x , y with individual standard deviations sig , all arrays of length N , use χ^2 minimization to fit for some or all of the M coefficients a of a function that depends linearly on a , $y = \sum_{i=1}^M a_i \times afunc_i(x)$. The input logical array $maska$ of length M indicates by true entries those components of a that should be fitted for, and by false entries those components that should be held fixed at their input values. The program returns values for a , $\chi^2 = chisq$, and the $M \times M$ covariance matrix $covar$. (Parameters held fixed will return zero covariances.) The user supplies a subroutine $funcs(x, afunc)$ that returns the M basis functions evaluated at $x = x$ in the array $afunc$.

```

INTEGER(I4B) :: i,j,k,l,ma,mfit,n
REAL(SP) :: sig2i,wt,ym
REAL(SP), DIMENSION(size(maska)) :: afunc
REAL(SP), DIMENSION(size(maska),1) :: beta
n=assert_eq(size(x),size(y),size(sig),'lfit: n')
ma=assert_eq(size(maska),size(a),size(covar,1),size(covar,2),'lfit: ma')
mfit=count(maska)           Number of parameters to fit for.
if (mfit == 0) call nrerror('lfit: no parameters to be fitted')
covar(1:mfit,1:mfit)=0.0    Initialize the (symmetric) matrix.
beta(1:mfit,1)=0.0
do i=1,n                    Loop over data to accumulate coefficients of
  call funcs(x(i),afunc)    the normal equations.
  ym=y(i)
  if (mfit < ma) ym=ym-sum(a(1:ma)*afunc(1:ma), mask=.not. maska)
  Subtract off dependences on known pieces of the fitting function.
  sig2i=1.0_sp/sig(i)**2
  j=0
  do l=1,ma
    if (maska(l)) then
      j=j+1
      wt=afunc(l)*sig2i
      k=count(maska(1:l))
      covar(j,1:k)=covar(j,1:k)+wt*pack(afunc(1:l),maska(1:l))
      beta(j,1)=beta(j,1)+ym*wt
    end if
  end do
end do

```

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```

end do
call diagmult(covar(1:mfit,1:mfit),0.5_sp)
covar(1:mfit,1:mfit)= &      Fill in above the diagonal from symmetry.
  covar(1:mfit,1:mfit)+transpose(covar(1:mfit,1:mfit))
call gaussj(covar(1:mfit,1:mfit),beta(1:mfit,1:1))      Matrix solution.
a(1:ma)=unpack(beta(1:ma,1),maska,a(1:ma))
  Partition solution to appropriate coefficients a.
chisq=0.0      Evaluate  $\chi^2$  of the fit.
do i=1,n
  call funcs(x(i),afunc)
  chisq=chisq+((y(i)-dot_product(a(1:ma),afunc(1:ma)))/sig(i))**2
end do
call covsrt(covar,maska)      Sort covariance matrix to true order of fitting
                              coefficients.
END SUBROUTINE lfit

```

f90 if (mfit < ma) ym=ym-sum(a(1:ma)*afunc(1:ma), mask=.not. maska)
 This is the first of several uses of maska in this routine to control which elements of an array are to be used. Here we include in the sum only elements for which maska is false, i.e., elements corresponding to parameters that are not being fitted for.

covar(j,1:k)=covar(j,1:k)+wt*pack(afunc(1:1),maska(1:1)) Here maska controls which elements of afunc get packed into the covariance matrix.

call diagmult(covar(1:mfit,1:mfit),0.5_sp) See discussion of diagadd after hqr on p. 1234.

a(1:ma)=unpack(beta(1:ma,1),maska,a(1:ma)) And here maska controls which elements of beta get unpacked into the appropriate slots in a. Where maska is false, corresponding elements are selected from the third argument of unpack, here a itself. The net effect is that those elements remain unchanged.

* * *

```

SUBROUTINE covsrt(covar,maska)
USE nrtype; USE nrutil, ONLY : assert_eq,swap
IMPLICIT NONE
REAL(SP), DIMENSION(:,:), INTENT(INOUT) :: covar
LOGICAL(LGT), DIMENSION(:), INTENT(IN) :: maska
  Expand in storage the covariance matrix covar, so as to take into account parameters that
  are being held fixed. (For the latter, return zero covariances.)
INTEGER(I4B) :: ma,mfit,j,k
ma=assert_eq(size(covar,1),size(covar,2),size(maska),'covsrt')
mfit=count(maska)
covar(mfit+1:ma,1:ma)=0.0
covar(1:ma,mfit+1:ma)=0.0
k=mfit
do j=ma,1,-1
  if (maska(j)) then
    call swap(covar(1:ma,k),covar(1:ma,j))
    call swap(covar(k,1:ma),covar(j,1:ma))
    k=k-1
  end if
end do
END SUBROUTINE covsrt

```

* * *

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```

SUBROUTINE svdfit(x,y,sig,a,v,w,chisq,funcs)
USE nrtype; USE nrutil, ONLY : assert_eq,vabs
USE nr, ONLY : svbksb,svdcmp
IMPLICIT NONE
REAL(SP), DIMENSION(:), INTENT(IN) :: x,y,sig
REAL(SP), DIMENSION(:), INTENT(OUT) :: a,w
REAL(SP), DIMENSION(:,.), INTENT(OUT) :: v
REAL(SP), INTENT(OUT) :: chisq
INTERFACE
  FUNCTION funcs(x,n)
    USE nrtype
    IMPLICIT NONE
    REAL(SP), INTENT(IN) :: x
    INTEGER(I4B), INTENT(IN) :: n
    REAL(SP), DIMENSION(n) :: funcs
  END FUNCTION funcs
END INTERFACE
REAL(SP), PARAMETER :: TOL=1.0e-5_sp
  Given a set of  $N$  data points  $x$ ,  $y$  with individual standard deviations  $sig$ , all arrays of length
   $N$ , use  $\chi^2$  minimization to determine the  $M$  coefficients  $a$  of a function that depends linearly
  on  $a$ ,  $y = \sum_{i=1}^M a_i \times afunc_i(x)$ . Here we solve the fitting equations using singular value
  decomposition of the  $N \times M$  matrix, as in §2.6. On output, the  $M \times M$  array  $v$  and the
  vector  $w$  of length  $M$  define part of the singular value decomposition, and can be used to
  obtain the covariance matrix. The program returns values for the  $M$  fit parameters  $a$ , and
   $\chi^2$ ,  $chisq$ . The user supplies a subroutine  $funcs(x,afunc)$  that returns the  $M$  basis
  functions evaluated at  $x = X$  in the array  $afunc$ .
INTEGER(I4B) :: i,ma,n
REAL(SP), DIMENSION(size(x)) :: b,sigi
REAL(SP), DIMENSION(size(x),size(a)) :: u,usav
n=assert_eq(size(x),size(y),size(sig),'svdfit: n')
ma=assert_eq(size(a),size(v,1),size(v,2),size(w),'svdfit: ma')
sigi=1.0_sp/sig          Accumulate coefficients of the fitting matrix in
b=y*sigi                u.
do i=1,n
  usav(i,:)=funcs(x(i),ma)
end do
u=usav*spread(sigi,dim=2,ncopies=ma)
usav=u
call svdcmp(u,w,v)      Singular value decomposition.
where (w < TOL*maxval(w)) w=0.0 Edit the singular values, given TOL from the pa-
call svbksb(u,w,v,b,a) rameter statement.
chisq=vabs(matmul(usav,a)-b)**2 Evaluate chi-square.
END SUBROUTINE svdfit

```

f90 $u=usav*spread(sigi,dim=2,ncopies=ma)$ Remember how `spread` works: the vector `sigi` is copied *along* the dimension 2, making a matrix whose columns are each a copy of `sigi`. The multiplication here is element by element, so each row of `usav` is multiplied by the corresponding element of `sigi`.

$chisq=vabs(matmul(usav,a)-b)**2$ Fortran 90's `matmul` intrinsic allows us to evaluate χ^2 from the mathematical definition in terms of matrices. `vabs` in `nrutil` returns the length of a vector (L_2 norm).

```

SUBROUTINE svdvar(v,w,cvm)
USE nrtype; USE nrutil, ONLY : assert_eq
IMPLICIT NONE
REAL(SP), DIMENSION(:,.), INTENT(IN) :: v
REAL(SP), DIMENSION(:), INTENT(IN) :: w
REAL(SP), DIMENSION(:,.), INTENT(OUT) :: cvm

```

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To evaluate the covariance matrix *cvm* of the fit for *M* parameters obtained by *svdfit*, call this routine with matrices *v*, *w* as returned from *svdfit*. The dimensions are *M* for *w* and $M \times M$ for *v* and *cvm*.

```

INTEGER(I4B) :: ma
REAL(SP), DIMENSION(size(w)) :: wti
ma=assert_eq((/size(v,1),size(v,2),size(w),size(cvm,1),size(cvm,2)/),&
'svdvar')
where (w /= 0.0)
  wti=1.0_sp/(w*w)
elsewhere
  wti=0.0
end where
cvm=v*spread(wti,dim=1,ncopies=ma)
cvm=matmul(cvm,transpose(v))      Covariance matrix is given by (15.4.20).
END SUBROUTINE svdvar

```



where (w /= 0.0)...elsewhere...end where This is the standard Fortran 90 construction for doing different things to a matrix depending on some condition. Here we want to avoid inverting elements of *w* that are zero.

*cvm=v*spread(wti,dim=1,ncopies=ma)* Each column of *v* gets multiplied by the corresponding element of *wti*. Contrast the construction *spread(...dim=2...)* in *svdfit*.

* * *

```

FUNCTION fpoly(x,n)
USE nrtype; USE nrutil, ONLY : geop
IMPLICIT NONE
REAL(SP), INTENT(IN) :: x
INTEGER(I4B), INTENT(IN) :: n
REAL(SP), DIMENSION(n) :: fpoly
  Fitting routine for a polynomial of degree n - 1, returning n coefficients in fpoly.
fpoly=geop(1.0_sp,x,n)
END FUNCTION fpoly

```

* * *

```

FUNCTION fleg(x,nl)
USE nrtype
IMPLICIT NONE
REAL(SP), INTENT(IN) :: x
INTEGER(I4B), INTENT(IN) :: nl
REAL(SP), DIMENSION(nl) :: fleg
  Fitting routine for an expansion with nl Legendre polynomials evaluated at x and returned
  in the array fleg of length nl. The evaluation uses the recurrence relation as in §5.5.
INTEGER(I4B) :: j
REAL(SP) :: d,f1,f2,twox
fleg(1)=1.0
fleg(2)=x
if (nl > 2) then
  twox=2.0_sp*x
  f2=x
  d=1.0
  do j=3,nl
    f1=d
    f2=f2+twox
    d=d+1.0_sp

```

```

        fleg(j)=(f2*fleg(j-1)-f1*fleg(j-2))/d
    end do
end if
END FUNCTION fleg

```

* * *

```

SUBROUTINE mrqmin(x,y,sig,a,maska,covar,alpha,chisq,funcs,alamda)
USE nrtype; USE nrutil, ONLY : assert_eq,diagmult
USE nr, ONLY : covsrt,gaussj
IMPLICIT NONE
REAL(SP), DIMENSION(:), INTENT(IN) :: x,y,sig
REAL(SP), DIMENSION(:), INTENT(INOUT) :: a
REAL(SP), DIMENSION(:,,:), INTENT(OUT) :: covar,alpha
REAL(SP), INTENT(OUT) :: chisq
REAL(SP), INTENT(INOUT) :: alamda
LOGICAL(LGT), DIMENSION(:), INTENT(IN) :: maska
INTERFACE
    SUBROUTINE funcs(x,a,yfit,dyda)
    USE nrtype
    REAL(SP), DIMENSION(:), INTENT(IN) :: x,a
    REAL(SP), DIMENSION(:), INTENT(OUT) :: yfit
    REAL(SP), DIMENSION(:,,:), INTENT(OUT) :: dyda
    END SUBROUTINE funcs
END INTERFACE

```

Levenberg-Marquardt method, attempting to reduce the value χ^2 of a fit between a set of N data points x , y with individual standard deviations sig , and a nonlinear function dependent on M coefficients a . The input logical array maska of length M indicates by true entries those components of a that should be fitted for, and by false entries those components that should be held fixed at their input values. The program returns current best-fit values for the parameters a , and $\chi^2 = \text{chisq}$. The $M \times M$ arrays covar and α are used as working space during most iterations. Supply a subroutine $\text{funcs}(x,a,yfit,dyda)$ that evaluates the fitting function $yfit$, and its derivatives $dyda$ with respect to the fitting parameters a at x . On the first call provide an initial guess for the parameters a , and set $\text{alamda} < 0$ for initialization (which then sets $\text{alamda} = .001$). If a step succeeds chisq becomes smaller and alamda decreases by a factor of 10. If a step fails alamda grows by a factor of 10. You must call this routine repeatedly until convergence is achieved. Then, make one final call with $\text{alamda} = 0$, so that covar returns the covariance matrix, and α the curvature matrix. (Parameters held fixed will return zero covariances.)

```

INTEGER(I4B) :: ma,ndata
INTEGER(I4B), SAVE :: mfit
call mrqmin_private
CONTAINS
SUBROUTINE mrqmin_private
REAL(SP), SAVE :: ochisq
REAL(SP), DIMENSION(:), ALLOCATABLE, SAVE :: atry,beta
REAL(SP), DIMENSION(:,,:), ALLOCATABLE, SAVE :: da
ndata=assert_eq(size(x),size(y),size(sig),'mrqmin: ndata')
ma=assert_eq((/size(a),size(maska),size(covar,1),size(covar,2),&
    size(alpha,1),size(alpha,2)/),'mrqmin: ma')
mfit=count(maska)
if (alamda < 0.0) then
    allocate(atriy(ma),beta(ma),da(ma,1))
    alamda=0.001_sp
    call mrqcof(a,alpha,beta)
    ochisq=chisq
    atry=a
end if
covar(1:mfit,1:mfit)=alpha(1:mfit,1:mfit)
call diagmult(covar(1:mfit,1:mfit),1.0_sp/alamda)

```

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```

Alter linearized fitting matrix, by augmenting diagonal elements.
da(1:mfit,1)=beta(1:mfit)
call gaussj(covar(1:mfit,1:mfit),da(1:mfit,1:1))  Matrix solution.
if (alamda == 0.0) then  Once converged, evaluate covariance ma-
    call covsrt(covar,maska)  trix.
    call covsrt(alpha,maska)  Spread out alpha to its full size too.
    deallocate(atry,beta,da)
    RETURN
end if
atry=a+unpack(da(1:mfit,1),maska,0.0_sp)  Did the trial succeed?
call mrqcof(atry,covar,da(1:mfit,1))
if (chisq < ochisq) then  Success, accept the new solution.
    alamda=0.1_sp*alamda
    ochisq=chisq
    alpha(1:mfit,1:mfit)=covar(1:mfit,1:mfit)
    beta(1:mfit)=da(1:mfit,1)
    atry=
else  Failure, increase alamda and return.
    alamda=10.0_sp*alamda
    chisq=ochisq
end if
END SUBROUTINE mrqmin_private

SUBROUTINE mrqcof(a,alpha,beta)
REAL(SP), DIMENSION(:), INTENT(IN) :: a
REAL(SP), DIMENSION(:), INTENT(OUT) :: beta
REAL(SP), DIMENSION(:,,:), INTENT(OUT) :: alpha
    Used by mrqmin to evaluate the linearized fitting matrix alpha, and vector beta as in
    (15.5.8), and calculate  $\chi^2$ .
INTEGER(I4B) :: j,k,l,m
REAL(SP), DIMENSION(size(x),size(a)) :: dyda
REAL(SP), DIMENSION(size(x)) :: dy,sig2i,wt,ymod
call funcs(x,a,ymod,dyda)  Loop over all the data.
sig2i=1.0_sp/(sig**2)
dy=y-ymod
j=0
do l=1,ma
    if (maska(l)) then
        j=j+1
        wt=dyda(:,l)*sig2i
        k=0
        do m=1,l
            if (maska(m)) then
                k=k+1
                alpha(j,k)=dot_product(wt,dyda(:,m))
                alpha(k,j)=alpha(j,k)  Fill in the symmetric side.
            end if
        end do
        beta(j)=dot_product(dy,wt)
    end if
end do
chisq=dot_product(dy**2,sig2i)  Find  $\chi^2$ .
END SUBROUTINE mrqcof
END SUBROUTINE mrqmin

```

f90 The organization of this routine is similar to that of `amoeba`, discussed on p. 1209. We want to keep the argument list of `mrqcof` to a minimum, but we want to make clear what global variables it accesses, and protect `mrqmin_private`'s name space.

`REAL(SP), DIMENSION(:), ALLOCATABLE, SAVE :: atry,beta` These arrays, as well as `da`, are allocated with the correct dimensions on the first call to `mrqmin`.

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They need to retain their values between calls, so they are declared with the SAVE attribute. They get deallocated only on the final call when `alamda=0`.

`call diagmult(...)` See discussion of `diagadd` after `hqr` on p. 1234.

`atry=a+unpack(da(1:mfit,1),maska,0.0_sp)` `maska` controls which elements of `a` get incremented by `da` and which by 0.

* * *

```

SUBROUTINE fgauss(x,a,y,dyda)
USE nrtype; USE nrutil, ONLY : assert_eq
IMPLICIT NONE
REAL(SP), DIMENSION(:), INTENT(IN) :: x,a
REAL(SP), DIMENSION(:), INTENT(OUT) :: y
REAL(SP), DIMENSION(:,), INTENT(OUT) :: dyda
  y(x;a) is the sum of N/3 Gaussians (15.5.16). Here N is the length of the vectors x, y
  and a, while dyda is an N x N matrix. The amplitude, center, and width of the Gaussians
  are stored in consecutive locations of a: a(i) = Bk, a(i+1) = Ek, a(i+2) = Gk,
  k = 1,...,N/3.
INTEGER(I4B) :: i,na,nx
REAL(SP), DIMENSION(size(x)) :: arg,ex,fac
nx=assert_eq(size(x),size(y),size(dyda,1),'fgauss: nx')
na=assert_eq(size(a),size(dyda,2),'fgauss: na')
y(:)=0.0
do i=1,na-1,3
  arg(:)=(x(:)-a(i+1))/a(i+2)
  ex(:)=exp(-arg(:)**2)
  fac(:)=a(i)*ex(:)*2.0_sp*arg(:)
  y(:)=y(:)+a(i)*ex(:)
  dyda(:,i)=ex(:)
  dyda(:,i+1)=fac(:)/a(i+2)
  dyda(:,i+2)=fac(:)*arg(:)/a(i+2)
end do
END SUBROUTINE fgauss

```

* * *

```

SUBROUTINE medfit(x,y,a,b,abdev)
USE nrtype; USE nrutil, ONLY : assert_eq
USE nr, ONLY : select
IMPLICIT NONE
REAL(SP), DIMENSION(:), INTENT(IN) :: x,y
REAL(SP), INTENT(OUT) :: a,b,abdev
  Fits y = a+bx by the criterion of least absolute deviations. The same-size arrays x and y are
  the input experimental points. The fitted parameters a and b are output, along with abdev,
  which is the mean absolute deviation (in y) of the experimental points from the fitted line.
INTEGER(I4B) :: ndata
REAL(SP) :: aa
call medfit_private
CONTAINS
SUBROUTINE medfit_private
IMPLICIT NONE
REAL(SP) :: b1,b2,bb,chisq,del,f,f1,f2,sigb,sx,sxx,sxy,sy
REAL(SP), DIMENSION(size(x)) :: tmp
ndata=assert_eq(size(x),size(y),'medfit')
sx=sum(x)
sy=sum(y)
sxy=dot_product(x,y)
  As a first guess for a and b, we will find the least
  squares fitting line.

```

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```

sxx=dot_product(x,x)
del=ndata*sxx-sx**2
aa=(sxx*sy-sx*sxy)/del
bb=(ndata*sxy-sx*sy)/del
tmp(:)=y(:)-(aa+bb*x(:))
chisq=dot_product(tmp,tmp)
sigb=sqrt(chisq/del)
b1=bb
f1=rofunc(b1)
b2=bb+sign(3.0_sp*sigb,f1)
f2=rofunc(b2)
if (b2 == b1) then
  a=aa
  b=bb
  RETURN
endif
do
  if (f1*f2 <= 0.0) exit
  bb=b2+1.6_sp*(b2-b1)
  b1=b2
  f1=f2
  b2=bb
  f2=rofunc(b2)
end do
sigb=0.01_sp*sigb
do
  if (abs(b2-b1) <= sigb) exit
  bb=b1+0.5_sp*(b2-b1)
  if (bb == b1 .or. bb == b2) exit
  f=rofunc(bb)
  if (f*f1 >= 0.0) then
    f1=f
    b1=bb
  else
    f2=f
    b2=bb
  end if
end do
a=aa
b=bb
abdev=abdev/ndata
END SUBROUTINE medfit_private

FUNCTION rofunc(b)
IMPLICIT NONE
REAL(SP), INTENT(IN) :: b
REAL(SP) :: rofunc
REAL(SP), PARAMETER :: EPS=epsilon(b)
  Evaluates the right-hand side of equation (15.7.16) for a given value of b.
INTEGER(I4B) :: j
REAL(SP), DIMENSION(size(x)) :: arr,d
arr(:)=y(:)-b*x(:)
if (mod(ndata,2) == 0) then
  j=ndata/2
  aa=0.5_sp*(select(j,arr)+select(j+1,arr))
else
  aa=select((ndata+1)/2,arr)
end if
d(:)=y(:)-(b*x(:)+aa)
abdev=sum(abs(d))
where (y(:) /= 0.0) d(:)=d(:)/abs(y(:))
rofunc=sum(x(:)*sign(1.0_sp,d(:)), mask=(abs(d(:)) > EPS) )
END FUNCTION rofunc
END SUBROUTINE medfit

```

Least squares solutions.

The standard deviation will give some idea of how big an iteration step to take.

Guess bracket as $3\text{-}\sigma$ away, in the downhill direction known from f_1 .

Bracketing.

Refine until error a negligible number of standard deviations.

Bisection.

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f90 The organization of this routine is similar to that of `amoeba` discussed on p. 1209. We want to keep the argument list of `rofunc` to a minimum, but we want to make clear what global variables it accesses and protect `medfit_private`'s name space. In the Fortran 77 version, we kept the only argument as `b` by passing the global variables in a common block. This required us to make copies of the arrays `x` and `y`. An alternative Fortran 90 implementation would be to use a module with pointers to the arguments of `medfit` like `x` and `y` that need to be passed to `rofunc`. We think the `medfit_private` construction is simpler.