#### Chapter 1: Linear Systems

# **GMRES**

Uses the Generalized Minimal Residual Method with reverse communication to generate an approximate solution of Ax = b.

#### **Required Arguments**

*IDO*— Flag indicating task to be done. (Input/Output)

On the initial call IDO must be 0. If the routine returns with IDO = 1, then set Z = AP, where A is the matrix, and call GMRES again. If the routine returns with IDO = 2, then set Z to the solution of the system MZ = P, where M is the preconditioning matrix, and call GMRES again. If the routine returns with IDO = 3,

set  $Z = AM^{1}P$ , and call GMRES again. If the routine returns with IDO = 4, the iteration has converged, and X contains the approximate solution to the linear system.

- *X* Array of length N containing an approximate solution. (Input/Output)
   On input, X contains an initial guess of the solution. On output, X contains the approximate solution.
- *P* Array of length N. (Output) Its use is described under IDO.
- R Array of length N. (Input/Output) On initial input, it contains the right-hand side of the linear system. On output, it contains the residual, b - Ax.
- Z Array of length N. (Input)

When ID0 = 1, it contains *AP*, where *A* is the coefficient matrix. When ID0 = 2, it contains  $M^{-1}P$ . When ID0 = 3, it contains  $AM^{-1}P$ . When ID0 = 0, it is ignored.

**TOL** — Stopping tolerance. (Input/Output) The algorithm attempts to generate a solution *x* such that  $|b - Ax| \le TOL^*|b|$ . On output, TOL contains the final residual norm.

## **Optional Arguments**

N — Order of the linear system. (Input) Default: N = size (X, 1).

## FORTRAN 90 Interface

Generic:	CALL GMRES (IDO, X, P, R, Z, TOL [,])
Specific:	The specific interface names are $\ensuremath{S\_GMRES}$ and $\ensuremath{D\_GMRES}$ .

## **FORTRAN 77 Interface**

Double

	Single:	CALL GMRES (IDO, N, X, P, R, Z, TOL)
:		The double precision name is DGMRES.

## Description

The routine GMRES implements restarted GMRES with reverse communication to generate an approximate solution to Ax = b. It is based on GMRESD by Homer Walker.

There are four distinct GMRES implementations, selectable through the parameter vector INFO. The first Gram-Schmidt implementation, INFO(1) = 1, is essentially the original algorithm by Saad and Schultz (1986). The second Gram-Schmidt implementation, developed by Homer Walker and Lou Zhou, is simpler than the first implementation. The least squares probler constructed in upper-triangular form and the residual vector updating at the end of a GMRES cycle is cheaper. The first Householde implementation is algorithm 2.2 of Walker (1988), but with more efficient correction accumulation at the end of each GMRES cycle

The second Householder implementation is algorithm 3.1 of Walker (1988). The products of Householder transformations are expanded as sums, allowing most work to be formulated as large scale matrix-vector operations. Although BLAS are used where possible, extensive use of Level 2 BLAS in the second Householder implementation may yield a performance advantage on certa computing environments.

The Gram-Schmidt implementations are less expensive than the Householder, the latter requiring about twice as much arithmetibeyond the coefficient matrix/vector products. However, the Householder implementations may be more reliable near the limits c residual reduction. See Walker (1988) for details. Issues such as the cost of coefficient matrix/vector products, availability of effec preconditioners, and features of particular computing environments may serve to mitigate the extra expense of the Householder implementations.

## Comments

1. Workspace may be explicitly provided, if desired, by use of G2RES/DG2RES. The reference is:

CALL G2RES (IDO, N, X, P, R, Z, TOL, INFO, USRNPR, USRNRM, WORK)

The additional arguments are as follows:

*INFO* — Integer vector of length 10 used to change parameters of GMRES. (Input/Output).

For any components INFO(1) ... INFO(7) with value zero on input, the default value is used.

INFO(1) = IMP, the flag indicating the desired implementation.

IMP	Action		
1	first Gram-Schmidt implementation		
2	second Gram-Schmidt implementation		
3	first Householder implementation		
4	second Householder implementation		
	Default: $IMP = 1$		
	INFO(2) = KDMAX, the maximum Krylor subspace dimension, i.e., the maximum allowable number of GMRES iterations before restarting. It must satisfy $1 \le KDMAX \le N$ . Default: KDMAX = min(N, 20)		
	<pre>INFO(3) = ITMAX, the maximum number of GMRES iterations allowed. Default: ITMAX = 1000</pre>		
	<pre>INFO(4) = IRP, the flag indicating whether right preconditioning is used. If IRP = 0, no right preconditioning is performed. If IRP = 1, right preconditioning is performed. If IRP = 0, then IDO = 2 or 3 will not occur. Default: IRP = 0</pre>		
	<pre>INFO(5) = IRESUP, the flag that indicates the desired residual vector updating prior to restarting or on termination.</pre>		
IRESUP	Action		
1	update by linear combination, restarting only		
2	update by linear combination, restarting and termination		
3	update by direct evaluation, restarting only		
4	update by direct evaluation, restarting and termination		
	Updating by direct evaluation requires an otherwise unnecessary matrix-vector product. The alternative is to update by forming a linear combination of various available vectors. This may or may not be cheaper and may be less reliable if the residual vector has been greatly reduced. If IRESUP = 2 or 4, then the residual vector is returned in WORK(1),, WORK(N). This is useful in some applications but costs another unnecessary residual update. It is recommended that IRESUP = 1 or 2 be used, unless matrix-vector products		

are inexpensive or great residual reduction is required. In this case use IRESUP = 3 or 4. The meaning of "inexpensive" varies with IMP as follows:

IMP  $\leq$ (KDMAX + 1) \*N flops 1 2 N flops 3 (2 \* KDMAX + 1) \* N flops4 (2\*KDMAX + 1) \*N flops "Great residual reduction" means that TOL is only a few orders of magnitude larger than machine epsilon. Default: IRESUP = 1 INFO(6) = flag for indicating the inner product and norm used in the Gram-Schmidt implementations. If INFO(6) = 0, sdot and snrm2, from BLAS, are used. If **INFO(6)** = 1, the user must provide the routines, as specified under arguments USRNPR and USRNRM. Default: INFO(6) = 0INFO(7) = IPRINT, the print flag. If IPRINT = 0, no printing is performed. If **IPRINT** = 1, print the iteration numbers and residuals. Default: IPRINT = 0 INFO(8) = the total number of GMRES iterations on output. INFO(9) = the total number of matrix-vector products in GMRES on output. INFO(10) = the total number of right preconditioner solves in GMRES on output if IRP = 1 **USRNPR** — User-supplied FUNCTION to use as the inner product in the Gram-Schmidt implementation, if INFO(6) = 1. If INFO(6) = 0, the dummy function G8RES/DG8RES may be used. The usage is REAL FUNCTION USRNPR (N, SX, INCX, SY, INCY) N — Length of vectors X and Y. (Input) SX — Real vector of length MAX(N\*IABS(INCX), 1). (Input) INCX — Displacement between elements of SX. (Input) X(I) is defined to be SX(1+(I-1)\*INCX) if INCX is greater than 0, or SX(1+(I-N)\*INCX) if INCX is less than 0. SY — Real vector of length MAX(N\*IABS(INXY), 1). (Input) INCY — Displacement between elements of SY. (Input) Y(I) is defined to be SY(1+(I-1)\*INCY) if INCY is greater than 0, or SY(1+(I-N)\*INCY) if INCY is less than zero. USRNPR must be declared EXTERNAL in the calling program. **USRNRM** — User-supplied FUNCTION to use as the norm ||X|| in the Gram-Schmidt implementation, if INFO(6) = 1. If INFO(6) = 0, the dummy function G9RES/DG9RES may be used. The usage is REAL FUNCTION USRNRM (N, SX, INCX) N — Length of vectors X and Y. (Input) SX — Real vector of length MAX(N\*IABS(INCX), 1). (Input) INCX — Displacement between elements of SX. (Input) X(I) is defined to be SX(1+(I-1)\*INCX) if INCX is greater than 0, or SX(1+(I-N)\*INCX) if INCX is less than 0. USRNRM must be declared EXTERNAL in the calling program. **WORK** — Work array whose length is dependent on the chosen implementation. IMP length of WORK  $N^{*}(KDMAX + 2) + KDMAX^{*}2 + 3 * KDMAX + 2$ 1 N\*(KDMAX + 2) + KDMAX\*\*2 + 2 \*KDMAX + 1 2

3 N\*(KDMAX + 2) + 3 \*KDMAX + 2
 4 N\*(KDMAX+2) + KDMAX\*\*2 + 2 \*KDMAX + 2

## Example 1

This is a simple example of GMRES usage. A solution to a small linear system is found. The coefficient matrix *A* is stored as a fu matrix, and no preconditioning is used. Typically, preconditioning is required to achieve convergence in a reasonable number of iterations.

```
USE IMSL_LIBRARIES
!
                    Declare variables
      INTEGER
                 LDA, N
      PARAMETER (N=3, LDA=N)
                                    Specifications for local variables
1
      INTEGER
                 IDO, NOUT
      REAL
                 P(N), TOL, X(N), Z(N)
      REAL
                 A(LDA,N), R(N)
      SAVE
                 A, R
                                    Specifications for intrinsics
ļ
      INTRINSIC SQRT
      REAL
                 SQRT
ļ
                                    (33.0 16.0 72.0)
ļ
                                A = (-24.0 - 10.0 - 57.0)
                                                  7.0)
1
                                    ( 18.0 -11.0
1
                                B = (129.0 - 96.0)
                                                  8.5)
1
1
      DATA A/33.0, -24.0, 18.0, 16.0, -10.0, -11.0, 72.0, -57.0, 7.0/
     DATA R/129.0, -96.0, 8.5/
i
     CALL UMACH (2, NOUT)
L
                                    Initial guess = (0 \dots 0)
1
1
     X = 0.0E0
                                    Set stopping tolerance to
1
                                    square root of machine epsilon
1
      TOL = AMACH(4)
      TOL = SQRT(TOL)
      IDO = 0
  10 CONTINUE
      CALL GMRES (IDO, X, P, R, Z, TOL)
      IF (IDO .EQ. 1) THEN
1
                                    Set z = A^*p
        CALL MURRV (A, P, Z)
         GO TO 10
     END IF
i
     CALL WRRRN ('Solution', X, 1, N, 1)
     WRITE (NOUT, '(A11, E15.5)') 'Residual = ', TOL
      END
```

## Output

Solution 1 2 3 1.000 1.500 1.000 Residual = 0.29746E-05

## Additional Examples

## Example 2

ļ

ļ

I

ļ

i

i

ļ

T

I

L

I

ļ

!

ļ

1

1

1

!

ļ

This example solves a linear system with a coefficient matrix stored in coordinate form, the same problem as in the document example for <u>LSLXG</u>. Jacobi preconditioning is used, i.e. the preconditioning matrix *M* is the diagonal matrix with  $M_{ii} = A_{ii}$ , for *i* 1, ..., *n*.

```
USE IMSL_LIBRARIES
              N, NZ
   INTEGER
  PARAMETER (N=6, NZ=15)
                                Specifications for local variables
   INTEGER
              IDO, INFO(10), NOUT
   REAL
              P(N), TOL, WORK(1000), X(N), Z(N)
   REAL
              DIAGIN(N), R(N)
                                Specifications for intrinsics
   INTRINSIC SQRT
   REAL
              SQRT
                                Specifications for subroutines
   EXTERNAL
             AMULTP
                                Specifications for functions
   EXTERNAL
              G8RES, G9RES
   DATA DIAGIN/0.1, 0.1, 0.06666667, 0.1, 1.0, 0.166666667/
  DATA R/10.0, 7.0, 45.0, 33.0, -34.0, 31.0/
  CALL UMACH (2, NOUT)
                                Initial guess = (1 \dots 1)
  X = 1.0E0
                                Set up the options vector INFO
                                to use preconditioning
   INFO = 0
   INFO(4) = 1
                                Set stopping tolerance to
                                square root of machine epsilon
  TOL = AMACH(4)
  TOL = SQRT(TOL)
  IDO = 0
10 CONTINUE
  CALL G2RES (IDO, N, X, P, R, Z, TOL, INFO, G8RES, G9RES, WORK)
   IF (IDO .EQ. 1) THEN
                                Set z = A^*p
      CALL AMULTP (P, Z)
      GO TO 10
   ELSE IF (IDO .EQ. 2) THEN
                                Set z = inv(M)*p
                                The diagonal of inv(M) is stored
                                in DIAGIN
      CALL SHPROD (N, DIAGIN, 1, P, 1, Z, 1)
      GO TO 10
  ELSE IF (IDO .EQ. 3) THEN
                                Set z = A*inv(M)*p
      CALL SHPROD (N, DIAGIN, 1, P, 1, Z, 1)
      P = Z
      CALL AMULTP (P, Z)
      GO TO 10
  END IF
   CALL WRRRN ('Solution', X)
```

!

ļ

ļ

1

! !

T

1

ļ

```
WRITE (NOUT, '(A11, E15.5)') 'Residual = ', TOL
  END
   SUBROUTINE AMULTP (P, Z)
   USE IMSL_LIBRARIES
   INTEGER
              ΝZ
   PARAMETER (NZ=15)
                                SPECIFICATIONS FOR ARGUMENTS
   REAL
              P(*), Z(*)
                                SPECIFICATIONS FOR PARAMETERS
   INTEGER
              Ν
   PARAMETER
              (N=6)
                                SPECIFICATIONS FOR LOCAL VARIABLES
   INTEGER
              Ι
   INTEGER
              IROW(NZ), JCOL(NZ)
              A(NZ)
   REAL
   SAVE
              A, IROW, JCOL
                                SPECIFICATIONS FOR SUBROUTINES
                                Define the matrix A
   DATA A/6.0, 10.0, 15.0, -3.0, 10.0, -1.0, -1.0, -3.0, -5.0, 1.0, &
       10.0, -1.0, -2.0, -1.0, -2.0/
   DATA IROW/6, 2, 3, 2, 4, 4, 5, 5, 5, 5, 1, 6, 6, 2, 4/
   DATA JCOL/6, 2, 3, 3, 4, 5, 1, 6, 4, 5, 1, 1, 2, 4, 1/
  CALL SSET(N, 0.0, Z, 1)
                                Accumulate the product A*p in z
   DO 10 I=1, NZ
      Z(IROW(I)) = Z(IROW(I)) + A(I)*P(JCOL(I))
10 CONTINUE
   RETURN
   END
```

## Output

So	olution	
1	1.000	
2	2.000	
3	3.000	
4	4.000	
5	5.000	
6	6.000	
Res	sidual =	0.25882E-05

## Example 3

The coefficient matrix in this example corresponds to the five-point discretization of the 2-d Poisson equation with the Dirichlet boundary condition. Assuming the natural ordering of the unknowns, and moving all boundary terms to the right hand side, we obtain the block tridiagonal matrix

$$A = \begin{bmatrix} T & -I & & \\ -I & \ddots & \ddots & \\ & \ddots & \ddots & -I \\ & & -I & T \end{bmatrix}$$

where

$$T = \begin{bmatrix} 4 & -1 & & \\ -1 & \ddots & \ddots & \\ & \ddots & \ddots & -1 \\ & & -1 & 4 \end{bmatrix}$$

and *I* is the identity matrix. Discretizing on a  $k \times k$  grid implies that *T* and *I* are both  $k \times k$ , and thus the coefficient matrix *A* is  $\times k^2$ .

The problem is solved twice, with discretization on a 50  $\times$  50 grid. During both solutions, use the second Householder implementation to take advantage of the large scale matrix/vector operations done in Level 2 BLAS. Also choose to update the residual vector by direct evaluation since the small tolerance will require large residual reduction.

The first solution uses no preconditioning. For the second solution, we construct a block diagonal preconditioning matrix

$$M = \begin{bmatrix} T & & \\ & \ddots & \\ & & T \end{bmatrix}$$

M is factored once, and these factors are used in the forward solves and back substitutions necessary when GMRES returns with ID( 2 or 3.

Timings are obtained for both solutions, and the ratio of the time for the solution with no preconditioning to the time for the solution with preconditioning is printed. Though the exact results are machine dependent, we see that the savings realized by fas convergence from using a preconditioner exceed the cost of factoring M and performing repeated forward and back solves.

```
USE IMSL_LIBRARIES
   INTEGER
              K, N
   PARAMETER (K=50, N=K*K)
                                Specifications for local variables
   INTEGER
              IDO, INFO(10), IR(20), IS(20), NOUT
   REAL
              A(2*N), B(2*N), C(2*N), G8RES, G9RES, P(2*N), R(N), &
             TNOPRE, TOL, TPRE, U(2*N), WORK(100000), X(N), &
             Y(2*N), Z(2*N)
                                Specifications for subroutines
   EXTERNAL
              AMULTP, G8RES, G9RES
                                Specifications for functions
   CALL UMACH (2, NOUT)
                                Right hand side and initial guess
                                to (1 ... 1)
   R = 1.0E0
   X = 1.0E0
                                Use the 2nd Householder
                                implementation and update the
                                residual by direct evaluation
   INFO = 0
   INFO(1) = 4
   INFO(5) = 3
   TOL
           = AMACH(4)
   TOL
           = 100.0*TOL
   IDO
           = 0
                                Time the solution with no
                                preconditioning
   TNOPRE = CPSEC()
10 CONTINUE
   CALL G2RES (IDO, N, X, P, R, Z, TOL, INFO, G8RES, G9RES, WORK)
   IF (IDO .EQ. 1) THEN
```

I

ļ

ļ

I

i

!

ļ

I

I

1

!

ļ

!

I

L

!

! !

ļ

! !

1

!

T

ļ

ļ

ļ

```
Set z = A^*p
      CALL AMULTP (K, P, Z)
      GO TO 10
   END IF
  TNOPRE = CPSEC() - TNOPRE
  WRITE (NOUT, '(A32, I4)') 'Iterations, no preconditioner = ', &
                           INFO(8)
                                 Solve again using the diagonal blocks
                                 of A as the preconditioning matrix M
  R = 1.0E0
  X = 1.0E0
                                 Define M
  CALL SSET (N-1, -1.0, B, 1)
  CALL SSET (N-1, -1.0, C, 1)
  CALL SSET (N, 4.0, A, 1)
  INFO(4) = 1
   TOL
          = AMACH(4)
   TOL
           = 100.0*TOL
  IDO
           = 0
   TPRE
           = CPSEC()
                                 Compute the LDU factorization of M
   CALL LSLCR (C, A, B, Y, U, IR, IS, IJOB=6)
20 CONTINUE
  CALL G2RES (IDO, N, X, P, R, Z, TOL, INFO, G8RES, G9RES, WORK)
      IF (IDO .EQ. 1) THEN
                                 Set z = A^*p
      CALL AMULTP (K, P, Z)
      GO TO 20
  ELSE IF (IDO .EQ. 2) THEN
                                 Set z = inv(M)*p
     CALL SCOPY (N, P, 1, Z, 1)
CALL LSLCR (C, A, B, Z, U, IR, IS, IJOB=5)
      GO TO 20
  ELSE IF (IDO .EQ. 3) THEN
                                 Set z = A^{inv}(M)^{p}
      CALL LSLCR (C, A, B, P, U, IR, IS, IJOB=5)
      CALL AMULTP (K, P, Z)
      GO TO 20
  END IF
  TPRE = CPSEC() - TPRE
  WRITE (NOUT, '(A35, I4)') 'Iterations, with preconditioning = ',&
                           INFO(8)
  WRITE (NOUT, '(A45, F10.5)') '(Precondition time)/(No '// &
                               'precondition time) = ', TPRE/TNOPRE
  END
   SUBROUTINE AMULTP (K, P, Z)
  USE IMSL_LIBRARIES
                                 Specifications for arguments
   INTEGER
              Κ
              P(*), Z(*)
   REAL
```

```
Specifications for local variables
INTEGER
           I, N
N = K^*K
                             Multiply by diagonal blocks
CALL SVCAL (N, 4.0, P, 1, Z, 1)
CALL SAXPY (N-1, -1.0, P(2:(N)), 1, Z, 1)
CALL SAXPY (N-1, -1.0, P, 1, Z(2:(N)), 1)
                             Correct for terms not properly in
                             block diagonal
DO 10 I=K, N - K, K
   Z(I) = Z(I) + P(I+1)
   Z(I+1) = Z(I+1) + P(I)
10 CONTINUE
                             Do the super and subdiagonal blocks,
                             the -I's
CALL SAXPY (N-K, -1.0, P((K+1):(N)), 1, Z, 1)
CALL SAXPY (N-K, -1.0, P, 1, Z((K+1):(N)), 1)
RETURN
END
```

## Output

1

1

ļ

ļ

! !

ļ

1

! !

ļ

Iterations, no preconditioner = 329	
Iterations, with preconditioning = 192	
(Precondition time)/(No precondition time) =	0.66278

Visual Numerics, Inc. Visual Numerics - Developers of IMSL and PV-WAVE <u>http://www.vni.com/</u> PHONE: 713.784.3131 FAX:713.781.9260