

# Numerical Analysis 4670: Assignment #4

Due on Monday, October 31, 2016

*Glunt 10:00am*

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## Introduction

This homework assignment's goal is to explore the various methods of solving linear systems of equations. Problem one asks to solve by the prototype method, partial pivoting with Gauss Elimination, and then with complete pivoting with Gauss Elimination. The next problem asks to create a subroutine to calculate the Choleski Factorization of a symmetric matrix to determine if it is a positive definite matrix or not. The next problem asks if the given matrix from the first problem fits the criteria of positive definite and if so what the 'G' matrix would be. Finally, the last problem asks to find a way to determine if a matrix is positive definite if it is not symmetric- thus the Choleski Factorization may not be the best method to determine the definiteness.

## Problem 1

Listing 1 shows the following program that will be referenced in problem 1.

### A

The prototype method is based on simple Gaussian Elimination techniques. The idea is to create an upper triangular matrix from the original matrix by eliminating the entries below the diagonal. At line 115 the subroutine TRIU solves the matrix A and its corresponding B by Gauss Elimination.

*Algorithm Outline TRIU:*

- Go from column 1:n.
- Go from row k+1:n.
- Store multiplier as  $a(i,k)/a(k,k)$ .
- Go from j=1,n.
- Store the result of current value minus multiplier times current  $a(k,j)$  value (effectively creating a zero entry).

After the upper triangle is found from TRIU, the values are back substituted by first starting with the last coefficient in  $A(n,n)$  and solving the value of  $X(n)$  then using that value to solve the previous coefficients in A. Line 139 shows this process as discussed in class.

*Algorithm Outline BackSolve:*

- Initial  $X(n)$  value equal to  $b(n)$  divided by  $a(n,n)$ .
- Gather next B value.
- Subtract each component's contribution to the linear equation.
- Final  $X(i)$  value is the amount left from the subtraction divided by the diagonal value in  $a(i,i)$ .

### B

The partial pivoting with Gauss Elimination involves finding the maximum number in the row at a diagonal matrix value, then switching the rows to have the maximum numbers in the diagonal. When the row swap is finished and a permutation matrix is made to reflect the row change, Gauss Elimination is done to create an upper triangular matrix and in the lower triangle, the various multipliers and permutation matrix are stored to later be used in back substitution by updating the B matrix to reflect the changes applied.

The reason for doing pivoting is for greater accuracy by limiting the need to have large multipliers because

small number are being multiplied to get rid of larger numbers. Line 166 is the start of the subroutine that uses partial pivoting.

*Algorithm Outline ParPLU:*

- Initialize Permutation matrix.
- Assume largest number is at diagonal position  $a(k,k)$ .
- Check each value in rows below current 'k' row.
- If the value at  $a(i,k)$  is larger, store value and row location. Otherwise continue.
- If the maximum value is at a future row, update permutation matrix with row information, swap rows.
- After potential row swap, continue with Gauss Elimination.

After the process of partial pivoting, a separate backwards substitution is needed with the addition of the permutation matrix. Line 204 begins the subroutine that solves the partial pivoting X matrix using B and P.

*Algorithm Outline ParPLUSol:*

- Set a dummy variable Y equal to the B matrix.
- Apply row swap information to the Y matrix to reflect row swaps in A matrix.
- Apply Gauss elimination to the Y matrix using the multipliers in  $a(i,k)$ .
- Begin with initial  $X(n)$  value like before, then subtract the matrix coefficients and solutions from earlier X values from the  $Y(i)$  value to find the  $X(i)$  (next) value.

## C

Gaussian Elimination with complete pivoting where the column and rows could switch is very similar to the partial pivoting with some minor additions for the case of a column switch as well. Although not usually used because it is  $O(n^2)$  complexity, it creates an even more accurate answer to the linear system of equations. Line 239 is the beginning of the FullPLU subroutine.

*Algorithm Outline FullPLU:*

- Initialize Permutation matrix.
- Assume largest number is at diagonal position  $a(k,k)$ .
- Check each value in rows below current 'k' row.
- If the value at  $a(i,k)$  is larger, store value and row location. Otherwise continue.
- If the maximum value is at a future row, update permutation matrix with row information, swap rows.
- Reinitialize the max value variable and check the column values for the largest value after the potential row swap, store the largest column.
- If the maximum value is at a future column, swap column. (no permutation matrix is needed unless to check that LU equals A).
- After potential row and column swap, continue with Gauss Elimination.

After the complete pivoting is used, the same function for partial pivoting solutions is used since the same basic idea applies in both pivot strategies.

## Comparison

RESULT:

A after TRIU call:

7.000000	5.000000	17.000000	10.000000
0.000000	0.428571	-0.142857	-0.142857
0.000000	0.000000	4.666667	-0.333333
0.000000	0.000000	0.000000	0.642857

X Values:

3.777778 -2.111111 -0.222222 -1.111111

Matrix for the PLU:

```
17.000000 12.000000 46.000000 24.000000
 0.294118  0.470588 -1.529412 -0.058824
 0.411765  0.125000 -3.250000  0.875000
 0.588235 -0.125000  0.538462 -0.346154
```

X Values from PLU:

3.777778 -2.111111 -0.222222 -1.111111

Matrix for the FPLU:

46.000000	24.000000	17.000000	12.000000
0.260870	0.739130	0.565217	0.869565
0.369565	1.529412	-0.764706	-2.176471
0.521739	3.352941	0.192308	-0.346154

X Values from FPLU:

-0.222222 -1.111111 3.777778 -2.111111

The answers were the same out to six decimal places, past that the complete pivoting was seemingly more accurate but usually only four to six decimal places is sufficient for solutions. The complete pivoting is also not in the same order since there was not a permutation matrix applied to account for the column switching since the B matrix is only one column.

Listing 1: FORTRAN(F95) Script for Problem 1(a-c)

```

1  !Michael Timbes
2  !Numerical Analysis
3  !Assignment-4
4  PROGRAM A4
5  IMPLICIT NONE
6  DOUBLE PRECISION, ALLOCATABLE, DIMENSION(:) :: B,BCOP,X,XPLU,XFLU
7  DOUBLE PRECISION, ALLOCATABLE, DIMENSION(:, :) :: A,ACOP,ATRI,APAR,AFUL
8  INTEGER, ALLOCATABLE, DIMENSION(:) :: P,Q
9  INTEGER :: N=0,R,I,J,FILENUM,IOSTATUS
10
11  //////////////////////////////////////

```

```

!This fortran script contains a few subroutines to find solutions of a !
!matrix through various methods.(1) Through standard Gauss elimination !
!through upper triangularization.(2) ParPLU Factorization using matrix !
15 !'P' that stores the row pivoting. (3) PLU Factorization that also !
!uses a 'P' matrix for row pivoting but also includes code for column !
!pivoting."OPS' is used to measure the operations needed,result in out.!

20 open(7, file='mdata2.txt')

do
  read(7,*,iostat=iostat)
  if(iostat/=0) THEN !Logic Check-EOF
25     exit
  else
    n=n+1
  end if
end do
!Allocate Storage Needed (based on number of lines in data file)
print*, "Size of matrix:"
!read*,n

n=n-1
35 print*,n

allocate (a(n,n),b(n),x(n),p(n),q(n),xflu(n))
allocate (xplu(n),acop(n,n),bcop(n),atri(n,n),apar(n,n),aful(n,n))

40 !Return to BOF
REWIND 7

do i=1,n
  read(7,*) (a(i,j),j=1,n)
45 end do
print*,A

read(7,*)b

50 close(7)

print*, "Enter the B:"
!read*,b !Reads the last values of each row
print*,b

55 ACOP=A
BCOP=B
call TRIU(n,a,b)
ATRI=A
call BackSolve(n,a,b,x)
60 A=ACOP
B=BCOP
call ParPLU(n,a,p)
APAR=A
call ParPLUSol(n,a,b,p,xplu)

```

```

65  A=ACOP
    B=BCOP
    call FullPLU(n,a,p,q)
    AFUL=A
    call ParPLUSol(n,a,b,p,xflu)
70  filenum=9
    open( unit=filenum, file='results.txt', status='replace')

    write(filenum,*) "RESULT:"
    write(filenum,*) "A after TRIU call:"
75  do i=1,n
    write(filenum,'(10f10.6)') ATRI(i,1:n)
    enddo
    write(filenum,*)
    write(filenum,*)
80  write(filenum,*) "X Values:"
    write(filenum,'(10f10.6)') x(1:n)
    write(filenum,*)
    write(filenum,*) "Matrix for the PLU:"
    do i=1,n
85  write(filenum,'(10f10.6)') APAR(i,1:n)
    enddo
    write(filenum,*)
    write(filenum,*)
    write(filenum,*) "X Values from PLU:"
90  write(filenum,'(10f10.6)') xplu(1:n)
    write(filenum,*)
    write(filenum,*) "Matrix for the FPLU:"
    do i=1,n
    write(filenum,'(10f10.6)') AFUL(i,1:n)
95  enddo
    write(filenum,*)
    write(filenum,*)
    write(filenum,*) "X Values from FPLU:"
    write(filenum,'(10f10.6)') xflu(1:n)
100 write(filenum,*)

    close(filenum)

105  !Deallocate matrices
    deallocate (a,b,x,p,q,xplu,xflu,acop,bcop)

    END PROGRAM A4

110

    !Upper triangular using Gauss elimination and multipliers are stored within the
    !A matrix zero entries
115 Subroutine TRIU(N,A,B)
    implicit none
    integer:: n,i,j,k

```

```

double precision:: a(n,n), b(n), mult
!A is the coefficient matrix, B are the given solutions to the equations
120 !mult is the multiplier variable
do k=1,n-1 !Need to have the n-1 since there are no zeros in the last column

    do i=k+1,n !Go along the i th row values

125         mult = a(i,k)/a(k,k)
        do j=1,n
            a(i,j)= a(i,j)-(mult*a(k,j)) !Subtract off multiplier
        end do
        b(i) = b(i) - mult*b(k) !Also subtract off in the solutions
130     end do

end do
return
end

135 !Using the upper triangular matrix stored in the coefficient matrix,
!solve backwards for the X variables which are stored in X in main
Subroutine BackSolve(N,A,B,X)
implicit none
integer:: n,i,j
double precision :: a(n,n), b(n), x(n), sub

!Initialize first X value-make sure divide by zero doesn't happen
if (a(n,n) .NE. 0) THEN
145 x(n) = b(n)/a(n,n)
else
    print*, "A(n,n) = 0 not allowed."
    stop
end if

150 !Going from the next to last element in matrix A
do i=n-1,1,-1
    sub= b(i) !sub is the intermediate variable to help solve X(i)
    do j = i+1,n
        sub = sub-a(i,j)*x(j)
155    end do
    x(i) = sub/a(i,i)
end do
return
end

160

!Subroutine for partial pivoting using the matrix A, the size (n),
!and the permutation matrix P
165 Subroutine ParPLU(n,a,p)
implicit none
double precision :: a(n,n), mul, maxv, temp(n)
integer :: n,i,j,k,p(n), maxr

170

```



```

!Initialize the permutation matrix
do i=1,n
    p(i) = i
end do
175 !Begin to find the max value in the matrix
do k= 1,n-1
    maxv= abs(a(k,k))
    maxr= k
    do i = k+1,n
180        if (abs(a(i,k)) > maxv) THEN
            maxr=i
            maxv= abs(a(i,k))
        end if
    end do
185    !Condition for row swap is when the row with the maximum
    !value is not the current row in the loop
    if (maxr.GT.k) THEN
        p(k) = maxr
        temp(k:n) = a(maxr,k:n)
190        a(maxr,k:n) = a(k,k:n)
        a(k,k:n) = temp(k:n)
    end if
    !Compute the multipliers
    a(k+1:n,k) = a(k+1:n,k)/a(k,k)
195    !Elimination process with multiplier from above
    do i = k+1,n
        a(i,k+1:n) = a(i,k+1:n) - a(i,k)*a(k,k+1:n)
    end do
end do
200 return
end

!Finishes the back substitution for the ParPLU
Subroutine ParPLUSol(n,a,b,p,x)
205 implicit none
double precision :: a(n,n),b(n),x(n),s,y(n)
integer :: n,i,j,k,p(n)

y=b !Mutator matrix
210 do k= 1,n-1
    if (p(k) > k) THEN
        s=y(k)
        y(k) = y(p(k))
215        y(p(k)) = s
    end if
    do i = k+1,n
        y(i) = y(i) - a(i,k)*y(k) !Gauss elimination done to the B
    end do
220 end do
!Solve for coefficients
x(n) = y(n) / a(n,n)
do i= n-1,1,-1

```

```

225         s=y(i)
           do j = i+1,n
               s= s-a(i,j)*x(j)
           end do
           x(i) = s/a(i,i)
       end do
230 return
end

!Subroutine for complete pivoting using the matrix A, the size (n),
!and the permutation matrix P.
235 !Note that this algorithm is  $n^2+n$  since two max functions are being used
!as a result, the matrix values are being compared n times for the row,
!then n times for the column, then the Gauss elimination is being done.

Subroutine FullPLU(n,a,p,q)
240 implicit none
double precision :: a(n,n),mul,maxv,temp(n)
integer :: n,i,j,k,p(n),q(n), maxr,maxc

!Initialize the permutation matrix
245 do i=1,n
       p(i) = i
   end do
!Begin to find the max value in the matrix
do k= 1,n-1
250     maxv= abs(a(k,k))
       maxr= k
       maxc= k
       !Find max row index
       do i = k+1,n
255           if (abs(a(i,k)) >maxv) THEN
               maxr=i
               maxv= abs(a(i,k))
           end if
       end do

260
       !If the current row is not the max value
       if (maxr.GT.k) THEN
265           p(k) = maxr !Store change in the P matrix
           temp(k:n) = a(maxr,k:n)
           a(maxr,k:n) = a(k,k:n)
           a(k,k:n) = temp(k:n)

       end if

270       !Find max column index
       maxv=abs(a(1,k)) !Reset Max
       do i = k+1,n
           if (abs(a(1,i)) >maxv) THEN
275               maxc=i
               maxv= abs(a(1,i))
           end if

```

```
                end do

                !If the current column is not the max value
280         if (maxc.GT.k) THEN
                    q(k) = maxc !Store change in the Q matrix (not really needed)
                    temp(1:n) = a(1:n,maxc)
                    a(1:n,maxc) = a(1:n,k)
                    a(1:n,k) = temp(1:n)
285         end if

                !Compute the multipliers
                a(k+1:n,k) = a(k+1:n,k)/a(k,k)
                !Elimination process with multiplier from above
290         do i = k+1,n
                    a(i,k+1:n) = a(i,k+1:n) - a(i,k)*a(k,k+1:n)
                end do
        end do
        return
295 end
```

## Problem 2

Problem 2 in this report will also cover problems 3 and 4 as well for readability.

### 2

This problem asks to create a subroutine that computes the Choleski factorization of a given *symmetric* matrix. The problem I chose was worked out and found to have the same matrix 'G' which represents the Choleski factorization matrix.

In order to find if a matrix is positive definite it must have a certain set of characteristics a few key characteristics are outlined below (can be found chapter 6.6 pgs.415-416 of the textbook).

- $x^t A x > 0$
- $\det(A) > 0$
- For  $i=1, n$   $A(i, i) > 0$  (diagonal must be positive)

The characteristics above lead to a method of decomposition that is faster than an LU decomposition to solve a system of equations. With positive definitive matrices the identity  $A = GG^t$  is used to help speed up finding solutions to a linear system.

In order for the identity to be true the sum of the components of G and its transpose must be result to the original matrix A which is slightly reminiscent of squaring a square root of the components down the diagonal and then to balance the factored matrix 'G', a variation of the Gauss elimination is performed with multipliers which also results in zeros in the upper triangle of G. Line 78 begins the *CHOF* subroutine to find the factorization of A matrix.

*Algorithm Outline CHOF:*

- Start from  $j : 1, n$ .
- Test if there is a negative or a zero at  $A(j, j)$ .
- If the evaluation is false, take the square root of  $A(j, j)$ , store in  $G(j, j)$ .
- Do from  $i : j + 1, n$ .
- Store the multiplier of  $A(i, j)$  divided by  $g(j, j)$ .
- Do from  $k : j + 1, n$
- Gauss elimination at  $A(i, k) = A(i, k) - (G(i, j) \text{ times } G(k, j))$

To check the answer simply take the transpose and then multiply the two to see if the original matrix is the result (done at subroutine 'TPOSE').

RESULT:

A:

9.000000	-3.000000	3.000000	9.000000
-3.000000	17.000000	-1.000000	-7.000000
3.000000	-1.000000	17.000000	15.000000
9.000000	-7.000000	15.000000	44.000000

G:

3.0000000000	0.0000000000	0.0000000000	0.0000000000
-1.0000000000	4.0000000000	0.0000000000	0.0000000000

```

1.0000000000    0.0000000000    4.0000000000    0.0000000000
3.0000000000   -1.0000000000    3.0000000000    5.0000000000

```

G<sup>T</sup>:

```

3.0000000000   -1.0000000000    1.0000000000    3.0000000000
0.0000000000    4.0000000000    0.0000000000   -1.0000000000
0.0000000000    0.0000000000    4.0000000000    3.0000000000
0.0000000000    0.0000000000    0.0000000000    5.0000000000

```

G\*G<sup>T</sup>:

```

9.0000000000   -3.0000000000    3.0000000000    9.0000000000
-3.0000000000  17.0000000000   -1.0000000000   -7.0000000000
3.0000000000   -1.0000000000   17.0000000000   15.0000000000
9.0000000000   -7.0000000000   15.0000000000   44.0000000000

```

Positive Definite?

T

### 3

The same functions were used to find if the given matrix A is positive definite and what the resulting factorization is.

RESULT:

A:

```

7.000000    5.000000    17.000000    10.000000
5.000000    4.000000    12.000000    7.000000
17.000000   12.000000   46.000000   24.000000
10.000000    7.000000   24.000000   15.000000

```

G:

```

2.6457513111    0.0000000000    0.0000000000    0.0000000000
1.8898223650    0.6546536707    0.0000000000    0.0000000000
6.4253960412   -0.2182178902    2.1602468995    0.0000000000
3.7796447301   -0.2182178902   -0.1543033500    0.8017837257

```

G<sup>T</sup>:

```

2.6457513111    1.8898223650    6.4253960412    3.7796447301
0.0000000000    0.6546536707   -0.2182178902   -0.2182178902
0.0000000000    0.0000000000    2.1602468995   -0.1543033500
0.0000000000    0.0000000000    0.0000000000    0.8017837257

```

G\*G<sup>T</sup>:

```

7.0000000000    5.0000000000   17.0000000000   10.0000000000
5.0000000000    4.0000000000   12.0000000000    7.0000000000
17.0000000000   12.0000000000   46.0000000000   24.0000000000
10.0000000000    7.0000000000   24.0000000000   15.0000000000

```

Positive Definite?

T

#### 4

This problem asks to write a subroutine that finds if a matrix that is unsymmetrical is positive definite. Using the characteristic that the diagonal can not have negatives, the subroutine 'PDEF' at line 127 checks only the diagonal of the matrix to see if there are numbers less than zero. The following is the example from problem 3 but with a negative down the diagonal. Even though I wrote a separate function to test the condition, the earlier call to CHO\_F checks the same condition and outputs an error to the terminal.

```
mtimbess@mtimbess-VirtualBox:~/CompSci$ ./a.out
```

Size of matrix:

4

```
9.000000 -3.000000 3.000000 9.000000
-3.000000 -17.000000 -1.000000 -7.000000
3.000000 -1.000000 17.000000 15.000000
9.000000 -7.000000 15.000000 44.000000
```

ERROR- SQRT OF A(J,J) NOT POSITIVE DEFINITE. END OF PROGRAM.

Listing 2: FORTRAN(F95) Script for Problems 2-4

```

!Michael Timbes
!A4-Prob:2-4
PROGRAM A4_CFACT
IMPLICIT NONE
5  DOUBLE PRECISION, ALLOCATABLE, DIMENSION(:) :: B,BCOP,X
  DOUBLE PRECISION, ALLOCATABLE, DIMENSION(:, :) :: A,ACOP,L,GT,G
  CHARACTER :: PD='F'
  INTEGER :: N=0,I,J,FILENUM,IOSTATUS
  open(7, file='mdata2.txt')
10
  do
    read(7,*,iostat=iostat)
    if(iostat/=0) THEN !Logic Check-EOF
      exit
15    else
      n=n+1
    end if
  end do
  !Allocate Storage Needed (based on number of lines in data file)
20  print*, "Size of matrix:"
  !read*,n

  n=n-1
  print*,n
25  allocate (a(n,n),l(n,n),gt(n,n),b(n),acop(n,n),bcop(n),x(n),g(n,n))
  !Return to BOF
  REWIND 7

```

```

do i=1,n
30 read(7,*) (a(i,j),j=1,n)
end do
do i=1,n
print' (10f10.6)',A(i,1:n)
enddo
35
ACOP=A
BCOP=B
close(7)
call CHO_F(n,a,g)
40 call TPOSE(n,g,gt,1,1)
A=ACOP
call PDEF(n,a,PD)
!WRITE OUT FILE
filenum=9
45 open( unit=filenum, file='CFACTRES.txt', status='replace')

write(filenum,*) "RESULT:"
write(filenum,*) "A:"
do i=1,n
50 write(filenum,' (15f15.6)') ACOP(i,1:n)
enddo
write(filenum,*)
write(filenum,*) "G:"
do i=1,n
55 write(filenum,' (15f15.10)') G(i,1:n)
enddo
write(filenum,*)
write(filenum,*) "G^T:"
do i=1,n
60 write(filenum,' (15f15.10)') GT(i,1:n)
enddo
write(filenum,*)
write(filenum,*)
write(filenum,*) "G*G^T:"
65 do i=1,n
write(filenum,' (15f15.10)') l(i,1:n)
enddo
write(filenum,*)
write(filenum,*) "Positive Definite?"
70 write(filenum,*) PD

CLOSE(FILENUM)

75 deallocate(a,b,acop,bcop,x,g,gt,l)
end program A4_CFACT

Subroutine CHO_F(n,a,G)
IMPLICIT NONE
80 INTEGER :: N,I,K,J
DOUBLE PRECISION :: A(N,N),G(N,N)

```

```

!BEGIN THE FACTORIZATION
85 DO J=1,N
    IF (A(J,J).GT.0) THEN
        G(J,J) = SQRT(A(J,J))
    ELSE
        PRINT*, "ERROR- SQRT OF A(J,J) NOT POSITIVE DEFINITE. END OF PROGRAM."
90    STOP
    ENDIF
    !
    DO I=J+1,N
        G(I,J) = (A(I,J)/G(J,J))
95        DO K= J+1,I
            A(I,K)=A(I,K) - (G(I,J)*G(K,J))
        ENDDO
    ENDDO
ENDDO
100
RETURN
END
Subroutine TPOSE(n,G,GT,l,comm)
105 IMPLICIT NONE
INTEGER :: N,I,K,J,comm
DOUBLE PRECISION :: g(n,n),gt(n,n),l(n,n),summ=0

do i=1,n
110    gt(i,1:n)=g(1:n,i)
enddo

!If the command var=1 then do
IF (COMM.eq.1) THEN
do k=1,n
115    do i=1,n
        summ = 0
        do j=1,n
            summ = summ +( g(i,j)*gt(j,k))
        enddo
120    l(i,k)=summ
    enddo
enddo

endif
125 return
end
Subroutine PDEF(n,a,PD)
IMPLICIT NONE
INTEGER :: N,I
130 DOUBLE PRECISION :: a(n,n)
CHARACTER :: PD
do i=1,n
    if (a(i,i).LT.0) THEN
        PD='F'
    end if
end do

```



```
135         stop
        else
        PD='T'
        endif
        enddo
140 return
end
```