

# Chapter 15 C-implementation

$$PA = LU$$

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# OutLine

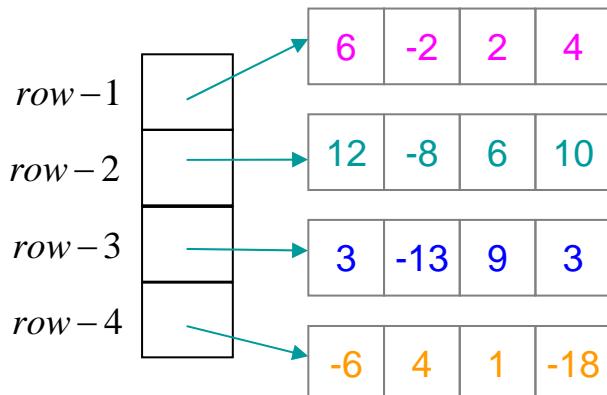
- Data structure of full matrix
- Implementation of  $PA=LU$
- Visual Studio 2005: How To
- Linux machine: How to compile

# row-major versus col-major

Logical index : 2D

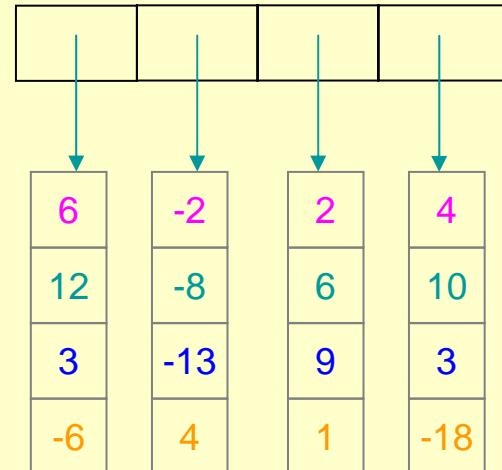
6	-2	2	4
12	-8	6	10
3	-13	9	3
-6	4	1	-18

row-major based



col-major based

*col-1*   *col-2*   *col-3*   *col-4*



We choose col-major representation

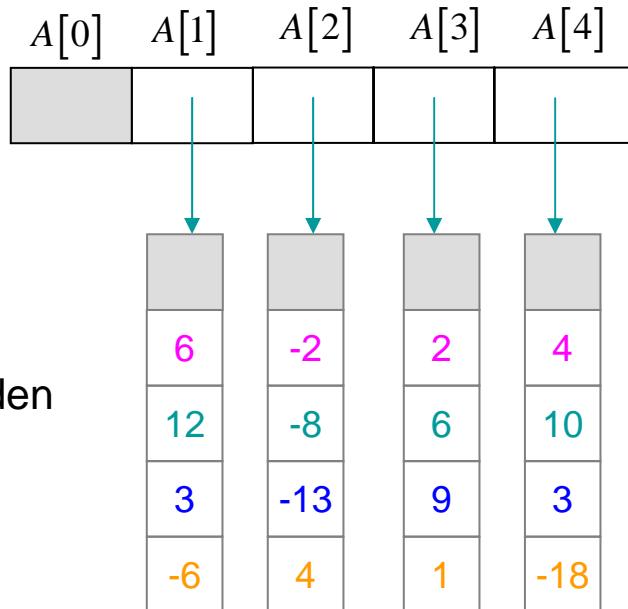
# col-major: C starts index from 0

matrix.h

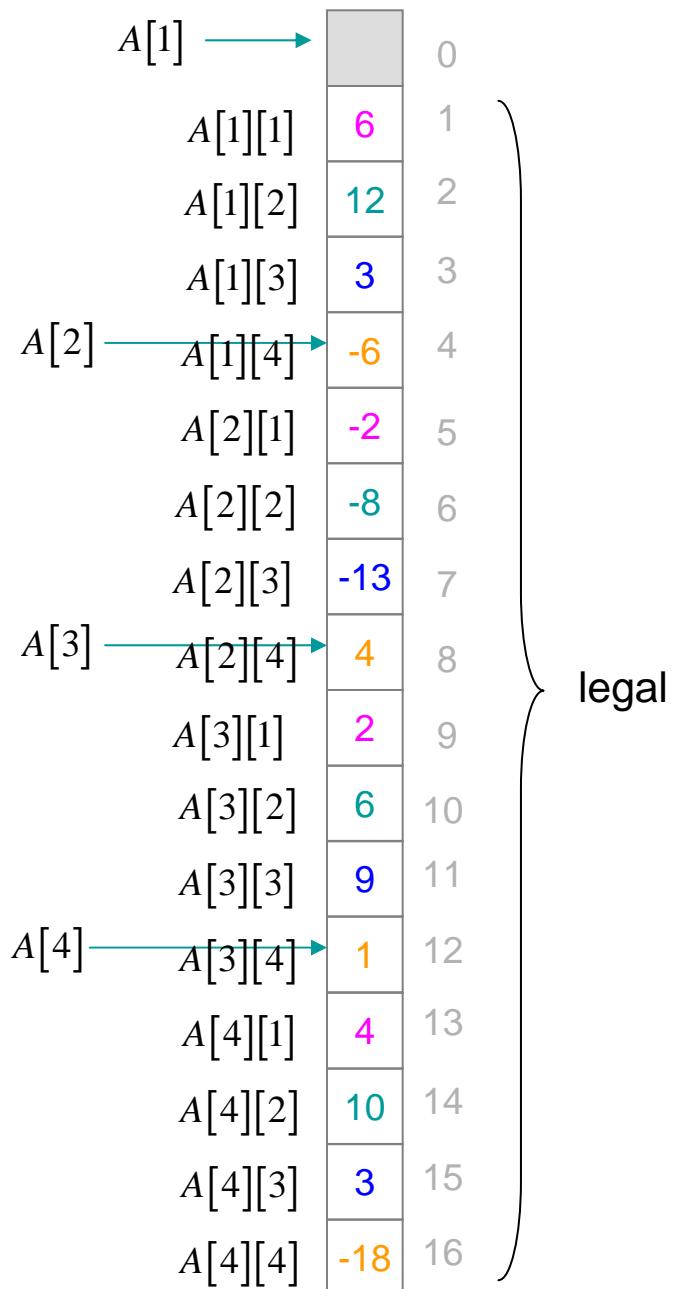
```
typedef struct matrix
{
    integer m ;
    integer n ;
    orderVar sel ; // col-major or row-major
    double real **A ;
} matrix ;

typedef matrix* matrixHandler ;
```

col-major based



- 1  $A[0]$  is useless
- 2  $A[k][0]$  is forbidden
- 3  $A[j][i] \equiv A(i, j)$



# Relaxation for high precision package

global.h

```
#ifndef GLOBAL_H

// in 32-bit machine, integer is 4 byte
// in 64-bit machine, integer is 8 byte (recommend)
typedef long int integer ; → Large 1D array, "int" is 4-byte,
                                only supports up to 2G elements

// we may use high precision representation,
// double: 16 digits
// dd (double-double): 32 digits
// qd (quadruple-double: 64 bits
// arprec (arbitrary precision): up to 1000 digits
typedef double doublereal ;

enum orderVar { ROW_MAJOR , COL_MAJOR } ; → We use col-major, however you
                                                can implement both.

// {ONE_NORM, TWO_NORM, INF_NORM} is used in function "norm"
enum matrix_keyword {
    ONE_NORM = 300 ,
    TWO_NORM = 301 ,
    INF_NORM = 302
} ;

#endif //GLOBAL_H
```

<http://crd.lbl.gov/~dhbailey/mpdist/>

- **ARPREC** (C++/Fortran-90 arbitrary precision package)  
Unix-based systems (including Apple Macintosh systems): [arprec-2.2.2.tar.gz](#) (version date 2008-07-24)  
Windows systems: [arprec-2.2.1-windll.zip](#) (version date 2008-01-23)  
Before installing either version, please see the "release notes" in the README file.
- **QD** (C++/Fortran-90 double-double and quad-double package)  
Unix-based systems (including Apple Macintosh systems): [qd-2.3.7.tar.gz](#) (version date 2008-07-22)  
Windows systems: [qd-2.3.4-windll.zip](#) (version date 2008-01-23)  
Before installing either version, please see "release notes" in the README file.

# Data structure of matrix and its method

matrix.h

```
#ifndef MATRIX_H  
  
#include "global.h"  
#include <stdio.h>  
  
typedef struct matrix  
{  
    integer m ;  
    integer n ;  
    orderVar sel ; // col-major or row-major  
    doublereal **A ;  
} matrix ;  
  
typedef matrix* matrixHandler ;  
  
typedef struct int_matrix  
{  
    integer m ;  
    integer n ;  
    orderVar sel ; // col-major or row-major  
    integer **A ;  
} int_matrix ;  
  
typedef int_matrix* int_matrixHandler ;
```

```
// matrix constructor  
matrixHandler zeros( integer m, integer n, orderVar sel ) ;  
  
int_matrixHandler int_zeros( integer m, integer n, orderVar sel ) ;  
  
// in MATLAB we don't need memory management, but in C,  
// we must take care it  
void dealloc( matrixHandler Ah ) ;  
void int_dealloc( int_matrixHandler Ah ) ;  
  
// show content of matrix in standard form  
void disp( matrixHandler Ah, FILE* fp ) ;  
void int_disp( int_matrixHandler Ah, FILE* fp ) ;  
  
// the same as "norm" in MATLAB  
doublereal norm( matrixHandler Ah, matrix_keyword p ) ;  
  
// y = A*x  
void matvec( matrixHandler Ah, matrixHandler xh, matrixHandler yh ) ;  
  
// C = A - B  
void matsub( matrixHandler Ah, matrixHandler Bh, matrixHandler Ch ) ;  
  
// copy A to A_shadow  
void duplicate( matrixHandler Ah, matrixHandler Ah_shadow ) ;  
  
#endif // MATRIX_H
```

- 1 constructor (建構子): zeros
- 2 destructor (解構子): dealloc
- 3 Index rule: we do it explicitly

- 4 Arithmetic: matvec, matsub, norm
- 5 I/O: disp

## matrix.cpp

```
#include <stdio.h>
#include <stdlib.h>
#include <assert.h>
#include <math.h>

#include "matrix.h"

// constructor: set up 0-matrix
matrixHandler zeros( integer m, integer n, orderVar sel )
{
    integer j ;
    doublereal **A ;
    doublereal *memA ; // contiguous memory block of A
    integer size ; // number of entries in matrix A

    assert( 0 < m ) ; assert( 0 < n ) ;
    // allocate an empty handler
    1 matrixHandler Ah = (matrixHandler) malloc( sizeof(matrix) ) ;
    assert( Ah ) ;

    if ( COL_MAJOR == sel ){
        // A[0] is useless, A[j] means pointer of column j
        2 A = (doublereal **) malloc( sizeof(doublereal *)*(n+1) ) ;
        assert( A ) ;
        size = m*n ;
        3 memA = (doublereal*) malloc( sizeof(doublereal)*size ) ;
        assert( memA ) ;
        for ( j=0 ; j < size ; j++ ){
            memA[j] = 0 ; // reset matrix A as zero matrix
        }
        4 for ( j=1 ; j<=n ; j++ ){
            // A[j][0] is useless, A[j][i] means A(i,j)
            A[j] = (memA - 1) + (j-1)*m ;
        }
        }else{
            printf("Error: we don't support row-major so far\n");
            exit(1) ;
        }
    // set parameter of a matrix
    5 Ah->m = m ; Ah->n = n ; Ah->sel = sel ; Ah->A = A ;
    return Ah ;
}
```

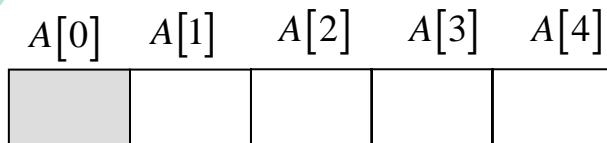
## constructor [1]

### 1 empty handler

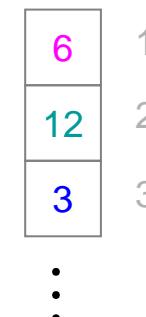
```
typedef struct matrix
{
    integer m ;
    integer n ;
    orderVar sel ;
    doublereal **A ;
} matrix ;
```

### 5 set parameter

### 2



### 3 contiguous memory block



## matrix.cpp

```
#include <stdio.h>
#include <stdlib.h>
#include <assert.h>
#include <math.h>

#include "matrix.h"

// constructor: set up 0-matrix
matrixHandler zeros( integer m, integer n, orderVar sel )
{
    integer j ;
    doublereal **A ;
    doublereal *memA ; // contiguous memory block of A
    integer size ; // number of entries in matrix A

    assert( 0 < m ) ; assert( 0 < n ) ;
    // allocate an empty handler
    matrixHandler Ah = (matrixHandler) malloc( sizeof(matrix) ) ;
    assert( Ah ) ;

    if ( COL_MAJOR == sel ){
        // A[0] is useless, A[j] means pointer of column j
        A = (doublereal **) malloc( sizeof(doublereal *)*(n+1) ) ;
        assert( A ) ;
        size = m*n ;
        memA = (doublereal*) malloc( sizeof(doublereal)*size ) ;
        assert( memA ) ;
        for ( j=0 ; j < size ; j++ ){
            memA[j] = 0 ; // reset matrix A as zero matrix
        }
        for ( j=1 ; j<=n ; j++ ){
            // A[j][0] is useless, A[j][i] means A(i,j)
            A[j] = (memA - 1) + (j-1)*m ; ← pointer arithmetic
        }
    }else{
        printf("Error: we don't support row-major so far\n");
        exit(1) ;
    }
    // set parameter of a matrix
    Ah->m = m ; Ah->n = n ; Ah->sel = sel ; Ah->A = A ;

    return Ah ;
}
```

## constructor [2]

4

low

high

A[1]	→	0
A[1][1]	→	6
A[1][2]	→	12
A[1][3]	→	3
A[2]	→	-6
A[2][1]	→	-2
A[2][2]	→	-8
A[2][3]	→	-13
A[3]	→	4
A[3][1]	→	2
A[3][2]	→	6
A[3][3]	→	9
A[4]	→	1
A[4][1]	→	4
A[4][2]	→	10
A[4][3]	→	3
A[4][4]	→	-18

pointer arithmetic

# destructor

# matrix.cpp

```
// The procedure holds for row-major or col-major
void deallocate( matrixHandler Ah )
{
// step 1: deallocate contiguous memory block
1 free( (double real*)(Ah->A[1]) + 1 ) ;

// step 2: deallocate column-index array
2 free( Ah->A ) ;

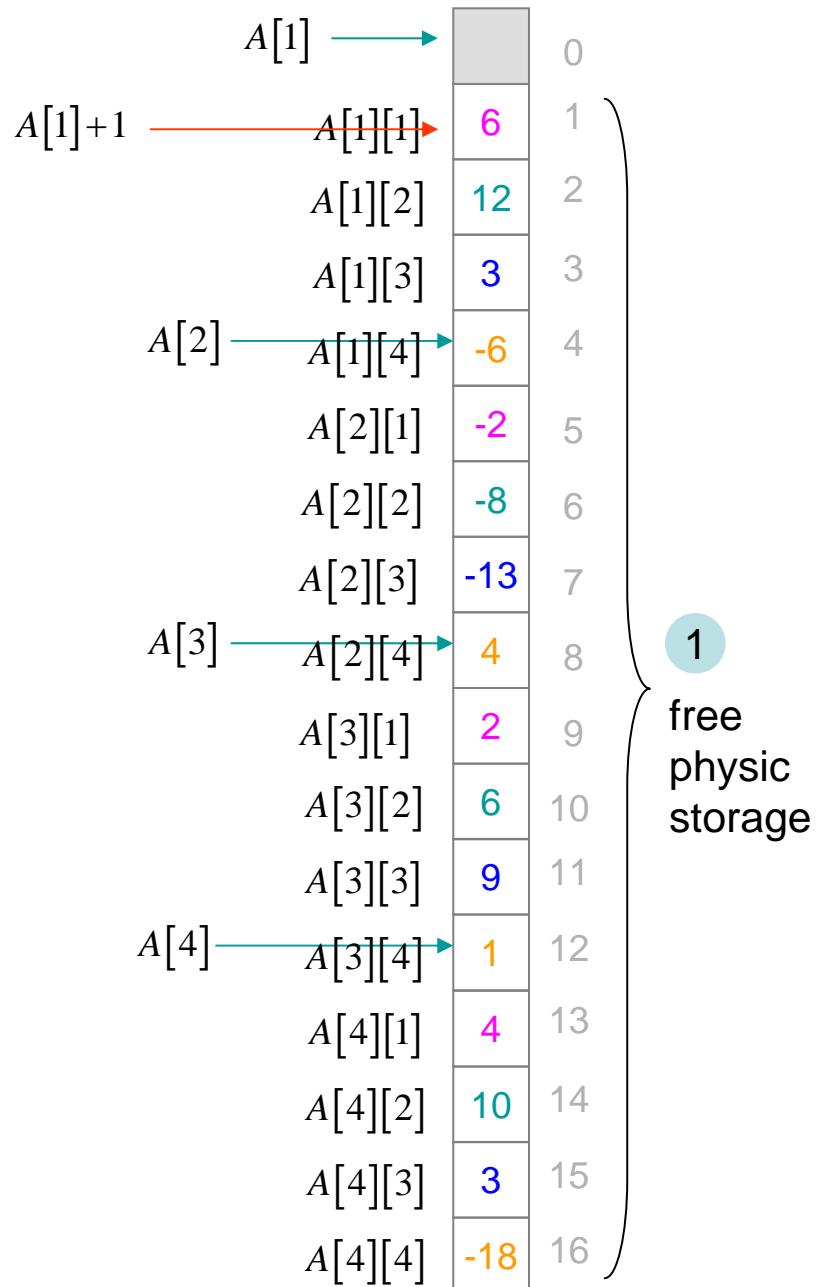
// step 3: deallocate matrix handler
3 free( Ah ) ;
}
```

- ## 2 free pointer array

$A[0]$	$A[1]$	$A[2]$	$A[3]$	$A[4]$

- ### 3 free matrix handler

```
typedef struct matrix
{
    integer m ;
    integer n ;
    orderVar sel ;
    double real **A ;
} matrix ;
```



# Input/Output

matrix.cpp

```
void disp( matrixHandler Ah, FILE* fp )
{
    int i, j ;
    doublereal **A ;

    assert( Ah ) ;
    assert( COL_MAJOR == Ah->sel ) ;

    fprintf(fp, "dimension of matrix is (%d,%d) with col-major\n",
            Ah->m, Ah->n ) ;

    A = Ah->A ;
    for( i=1 ; i <= Ah->m ; i++ ){
        for( j=1 ; j <= Ah->n ; j++ ){

            fprintf(fp, "%8.4f ", A[j][i] ) ;
        }
        fprintf(fp, "\n") ;
    }
}
```

```
typedef struct matrix
{
    integer m ;
    integer n ;
    orderVar sel ;
    doublereal **A ;
} matrix ;
```

$$A[j][i] \equiv A(i, j)$$

6	-2	2	4
12	-8	6	10
3	-13	9	3
-6	4	1	-18

→ Show in standard form: human readable

# Simple driver

main.cpp

```
#include <stdio.h>
#include "matrix.h"

void test_matrix( void ) ;

int main( int argc, char* argv[] )
{
    test_matrix() ;

    return 0 ;
}

void test_matrix( void )
{
    integer m = 4 ;
    integer n = 4 ;
    matrixHandler Ah ;
    doublereal **A ;

    Ah = zeros( m, n, COL_MAJOR ) ;
    A = Ah->A ;

    A[1][1] = 6. ; A[1][2] = 12. ; A[1][3] = 3. ; A[1][4] = -6. ;
    A[2][1] = -2. ; A[2][2] = -8. ; A[2][3] = -13. ; A[2][4] = 4. ;
    A[3][1] = 2. ; A[3][2] = 6. ; A[3][3] = 9. ; A[3][4] = 1. ;
    A[4][1] = 4. ; A[4][2] = 10. ; A[4][3] = 3. ; A[4][4] = -18. ;

    disp( Ah, stdout ) ;
    dealloc( Ah ) ;
}
```

## Execution result

```
dimension of matrix is <4,4> with col-major
 6.0000   -2.0000    2.0000    4.0000
 12.0000   -8.0000    6.0000   10.0000
  3.0000  -13.0000    9.0000    3.0000
 -6.0000    4.0000    1.0000  -18.0000
Press any key to continue.
```

$$A[j][i] \equiv A(i, j)$$

# duplicate of a matrix / vector

matrix.cpp

```
void duplicate( matrixHandler Ah, matrixHandler Ah_shadow )
{
    integer m, n ;
    integer i, j ;
    doublereal **A ;
    doublereal **A_shadow ;

    assert( Ah ) ; assert( Ah_shadow ) ;
    assert( COL_MAJOR == Ah->sel ) ;
    assert( COL_MAJOR == Ah_shadow->sel ) ;

    m = Ah->m ; n = Ah->n ;
    // check Ah_shadow has the same configuration as Ah
    assert( m == Ah_shadow->m ) ;
    assert( n == Ah_shadow->n ) ;

    A = Ah->A ;
    A_shadow = Ah_shadow->A ;
    for ( j = 1 ; j <= n ; j++ ){
        for ( i = 1 ; i <= m ; i++ ){
            A_shadow[j][i] = A[j][i] ;
        } // For each row
    } // For each col
}
```

verification

$$A[j][i] \equiv A(i, j)$$

```
typedef struct matrix
{
    integer m ;
    integer n ;
    orderVar sel ;
    doublereal **A ;
} matrix ;
```

We require matrix handler to verify configuration, this is very important for debugging.

$$y = Ax$$

## matrix.cpp

```
// y = A*x
void matvec( matrixHandler Ah, matrixHandler xh, matrixHandler yh)
{
    integer m, n, s ;
    integer i, j, k ;
    doublereal **A ;
    doublereal **x ;
    doublereal **y ;

    assert( Ah ) ; assert( xh ) ; assert( yh ) ;
    assert( COL_MAJOR == Ah->sel ) ;
    assert( COL_MAJOR == xh->sel ) ;
    assert( COL_MAJOR == yh->sel ) ;

    m = Ah->m ; n = Ah->n ; s = xh->n ;

    assert(n == xh->m) ;
    assert(m == yh->m) ; assert(s == yh->n) ;

    A = Ah->A ; x = xh->A ; y = yh->A ;
// y = x(1)*A(:,1) + sum_{j>} ( x(j)*A(:,j) )
    for ( k=1 ; k <= s ; k++){
        for ( i=1 ; i <= m ; i++ ){
            y[k][i] = A[1][i] * x[k][1] ;
        }
        for ( j=2 ; j <= n ; j++){
            for ( i=1 ; i <= m ; i++ ){
                y[k][i] += A[j][i] * x[k][j] ;
            }
        }
    }
    } // for each col-j
} // for each vector x(:,k)
}
```

$$A \in R^{m \times n}, x \in R^{n \times s}, y \in R^{m \times s}$$

$$m \left\{ \begin{array}{c} \overbrace{\quad}^n \\ A \end{array} \right. \begin{array}{c} \overbrace{\quad}^s \\ x \end{array} = \left. \begin{array}{c} \overbrace{\quad}^s \\ y \end{array} \right\} m$$

Outer-product formulation

$$y = x(1)A(:,1) + \sum_{j=2}^n x(j)A(:,j)$$

# Matrix / vector norm

matrix.cpp

```
// implement p = 1, 2 and inf
double real norm( matrixHandler Ah, matrix_keyword p )
{
    integer m, n ;
    double real sum ;
    double real sumMax ;
    double real **A ;
    int i, j ;

    assert( Ah ) ;
    assert( COL_MAJOR == Ah->sel ) ;
    m = Ah->m ; n = Ah->n ;
    A = Ah->A ;
    if ( INF_NORM == p ){
        sumMax = 0.0 ;
        for ( i = 1 ; i <= m ; i++ ){
            sum = 0.0 ;
            for ( j = 1 ; j <= n ; j++ ){
                sum += fabs( A[j][i] ) ;
            }
            if ( sum > sumMax ){
                sumMax = sum ;
            }
        } // For each row
    }else if ( ONE_NORM == p ){
        sumMax = 0.0 ;
        for ( j = 1 ; j <= n ; j++ ){
            sum = 0.0 ;
            for ( i = 1 ; i <= m ; i++ ){
                sum += fabs( A[j][i] ) ;
            }
            if ( sum > sumMax ){
                sumMax = sum ;
            }
        } // For each col
    }else{
        printf("TWO_NORM is NOT implemented\n");
        exit(1) ;
    }
    return sumMax ;
}
```

$$\|A\|_1 = \sup_{x \neq 0} \frac{\|Ax\|_1}{\|x\|_1} = \max_{1 \leq j \leq i} \sum_{i=1}^n |a_{ij}|$$

= Maximum of absolute column sum

$$\|A\|_\infty = \sup_{x \neq 0} \frac{\|Ax\|_\infty}{\|x\|_\infty} = \max_{1 \leq i \leq l} \sum_{j=1}^n |a_{ij}|$$

= Maximum of absolute row sum

$$\|A\|_2 = \sup_{x \neq 0} \frac{\|Ax\|_2}{\|x\|_2} = \sqrt{\rho(A^T A)}$$

2-norm is difficult to compute, we will discuss this later

# OutLine

- Data structure of full matrix
- Implementation of  $PA=LU$
- Visual Studio 2005: How To
- Linux machine: How to compile

## *Algorithm ( PA = LU ) [1]*

Given full matrix  $A \in R^{n \times n}$ , construct initial lower triangle matrix  $L = I$

use permutation vector  $P$  to record permutation matrix  $P^{(k)}$

verification

```
int lu_partialPivot( matrixHandler Ah, int_matrixHandler Ph, int conti_flag )
{
    integer m, n, LU_dim ;
    integer i, j, k ;
    doublereal **A ;
    integer **P ;
    integer p ;
    doublereal ksi ; // ksi = max(|A(k:m,k)|)
    doublereal tmp ; // temporary real variable
    integer int_tmp ; // temporary integer variable
    int isLU_succ = 0 ; // isLU_succ = 0, LU is done
                        // = k < m, means (PA)(k:m,k) = 0, A is singular

    assert( Ah ) ; assert( Ph ) ;
    assert( COL_MAJOR == Ah->sel ) ;
    assert( COL_MAJOR == Ph->sel ) ;

    m = Ah->m ; n = Ah->n ;

    assert( 1 == Ph->n ) ;
    assert( m <= Ph->m ) ;
```

(1) we store lower triangle matrix  $L$  into storage of matrix  $A$

(2) The reason to construct type *int\_matrix* is for permutation matrix  $P$ ,  
since we can check dimension between  $A$  and  $P$ .

## Algorithm ( PA = LU ) [2]

let  $A^{(1)} := A$ ,  $\tilde{L}^{(-1)} = L^{(0)} = I$  and  $P^{(0)} = (1, 2, 3, \dots, n)$

```

A = Ah->A ; P = Ph->A ;
for ( i = 1 ; i <= m ; i++){
    P[1][i] = i ;
}

```

```

P = 1:m ;

```

Note that  $P$  is a column vector

for  $k = 1 : n - 1$

we have compute  $P^{(k-1)}A = \tilde{L}^{(k-2)}L^{(k-1)}A^{(k)}$ ,  $P^{(k-1)} = P_{k-1}P_{k-2}\cdots P_2P_1$

$$A^{(k)} = \left( \begin{array}{ccc|ccc} a_{11}^{(1)} & \cdots & \cdots & \cdots & \cdots & a_{1n}^{(1)} \\ 0 & \ddots & & & & \\ \vdots & & a_{k-1,k-1}^{(k-1)} & \cdots & \cdots & a_{k-1,n}^{(k-1)} \\ \hline \vdots & & 0 & a_{k,k}^{(k)} & \cdots & a_{k,n}^{(k)} \\ \vdots & & \vdots & \vdots & & \vdots \\ 0 & \cdots & 0 & a_{nk}^{(k)} & \cdots & a_{nn}^{(k)} \end{array} \right)$$

update original matrix  $A$

$$\tilde{L}^{(k-2)}L^{(k-1)} = \left( \begin{array}{c|c} \overbrace{W}^{k-1} & O \\ \hline M & I \end{array} \right)^{k-1} \text{ stores in lower triangle matrix } L$$

## Algorithm ( PA = LU ) [3]

- 1 find a  $p \in \{k, k+1, \dots, n\}$  such that  $|A_{pk}^{(k)}| = \max |A_{(k:m,k)}^{(k)}|$

```
/*
 * step 1: find a p belongs to {k,k+1,...,m} such that
 *          ksi = |A_{(k)}(p,k)| = max |A_{(k)}(k:m,k)|
 */
ksi = 0.0 ;
for ( i=k ; i <= m ; i++ ){
    tmp = fabs(A[k][i]) ;
    if ( tmp > ksi ){
        ksi = tmp ;
        p = i ;
    }
}// for each row i
```

```
62 %
63 % step 1: find a p belongs to {k,k+1,...,m}
64 % such that |A_{(k)}(pk)| = max |A_{(k)}(k:m,k)|
65 %
66 [y, rel_p] = max( abs(A(k:m,k)) ) ;
67 p = rel_p + k - 1 ;
```

- 2 swap row  $A^{(k)}(k, k:n)$  and row  $A^{(k)}(p, k:n)$ , NOT efficient

```
for ( j=k ; j <= n ; j++ ){
    tmp = A[j][k] ;
    A[j][k] = A[j][p] ;
    A[j][p] = tmp ;
}
```

```
tmp_row(1:n-k+1) = A(k,k:n) ;
A(k,k:n) = A(p,k:n) ;
A(p,k:n) = tmp_row(1:n-k+1) ;
```

define permutation matrix  $P_k = (1, 2, \dots, k-1, p, k+1, \dots, p-1, k, p+1, \dots, n)$

then after swapping rows  $k, p$ , we have  $\tilde{A}^{(k)} = P_k A^{(k)}$

## Algorithm ( PA = LU ) [4]

$$\tilde{A}^{(k)} = \begin{pmatrix} \times & \times & \times \\ 0 & \xi & d^T \\ 0 & c & B \end{pmatrix} \quad \left( |\xi| \geq \max |c| \right)$$

*k-col*  
↓  
*k-row*

- 3 compute  $P^{(k)} \leftarrow P_k P^{(k-1)}$  for  $P^{(0)} = (1, 2, 3, \dots, n)$

```
/*
 * step 3: compute P_{k} = p_k * P_{k-1}
 * by swapping P_{k-1}(k) and P_{k-1}(p)
 */
int_tmp = P[1][k] ;
P[1][k] = P[1][p] ;
P[1][p] = int_tmp ;
```

```
86 %
87 % step 3: compute P_{k} = p_k * P_{k-1}
88 % by swapping P_{k-1}(k) and P_{k-1}(p)
89 %
90 temp = P(k) ;
91 P(k) = P(p) ;
92 P(p) = temp ;
```

*if*  $k > 1$  *then*

- 4 compute  $\tilde{L}^{(k-1)} \leftarrow P_k (\tilde{L}^{(k-2)} L^{(k-1)}) P_k^T$  by swapping  $L(k, 1:k-1)$  and  $L(p, 1:k-1)$   
 then  $P^{(k-1)} A = \tilde{L}^{(k-2)} L^{(k-1)} A^{(k)} \longrightarrow P^{(k)} A = \tilde{L}^{(k-1)} \tilde{A}^{(k)}$   
*endif*

## Algorithm ( PA = LU ) [5]

```

if (1 < k ){
    for ( j=1 ; j < k ; j++ ){
        tmp = A[j][k] ;
        A[j][k] = A[j][p] ;
        A[j][p] = tmp ;
    }
} // For row != 1

```

```

103 if (1 < k )
104     tmp_row(1:k-1) = L(k,1:k-1) ;
105     L(k,1:k-1) = L(p,1:k-1) ;
106     L(p,1:k-1) = tmp_row(1:k-1) ;
107 end

```

we store lower triangle matrix into storage of matrix  $A$ , this code is different from code in MATLAB.

5 decompose  $\tilde{A}^{(k)} = L^{(k)} A^{(k+1)}$

```

// update L, L(k+1:m, k) = A(k+1:m,k)/A(k,k),
// still store into L
    For ( i = k+1 ; i <= m ; i++ ){
        A[k][i] /= ksi ;
    }
// update A(k+1:m,k+1:n) =
//      A(k+1:m,k+1:n) - L(k+1:m,k) * A(k,k+1:n)
    For ( j = k+1 ; j <= n ; j++ ){
        tmp = A[j][k] ;
        For ( i = k+1 ; i <= m ; i++ ){
            A[j][i] -= A[k][i] * tmp ;
        } // For each row i
    } // For each col j

```

```

L(k+1:m, k) = A(k+1:m,k)/A(k,k) ;
A(k+1:m, k) = zero_col(m-k, 1) ;
A(k+1:m, k+1:n) = A(k+1:m, k+1:n) - L(k+1:m,k) * A(k,k+1:n) ;

```

$$A^{(k+1)} = \left( \begin{array}{c|cc} x & x & x \\ \hline 0 & \xi & d^T \\ 0 & 0 & \tilde{B} \end{array} \right), \quad \tilde{B} = B - \frac{cd^T}{\xi}$$

How to compute  $\tilde{B}$  efficiently?

## Algorithm ( PA = LU ) [6]

$$\left( \begin{array}{c|ccccc}
 a_{kk} & a_{k,k+1} & \cdots & \overset{j-th}{\circlearrowleft} a_{k,j} & \cdots & a_{k,n} \\
 \hline
 L_{k+1,k} & a_{k+1,k+1} & \cdots & & & a_{k+1,n} \\
 \vdots & \vdots & \ddots & \cdots & \cdots & \vdots \\
 \overset{i-th}{\circlearrowleft} L_{i,k} & & & \overset{i-th}{\circlearrowright} a_{i,j} & \cdots & a_{i,n} \\
 \vdots & & \vdots & \vdots & & \vdots \\
 L_{m,k} & \cdots & & a_{m,j} & \cdots & a_{m,n}
 \end{array} \right)$$

component-wise update :  $a_{i,j} = a_{i,j} - L_{i,k} a_{k,j}$

**Observation:** we implement with column-major form, column-wise update is good

$$A(k+1:m, j) - = A_{k,j} \times L(k+1:m, k)$$

$$\left( \begin{array}{c|ccccc}
 a_{kk} & a_{k,k+1} & \cdots & \overset{j-th}{\circlearrowleft} a_{k,j} & \cdots & a_{k,n} \\
 \hline
 L_{k+1,k} & a_{k+1,k+1} & \cdots & & & a_{k+1,n} \\
 \vdots & \vdots & \ddots & \cdots & \cdots & \vdots \\
 L_{i,k} & & & a_{i,j} & \cdots & a_{i,n} \\
 \vdots & & \vdots & \vdots & & \vdots \\
 L_{m,k} & \cdots & & a_{m,j} & \cdots & a_{m,n}
 \end{array} \right)$$

$$\begin{matrix}
 \textcolor{red}{\boxed{\text{green}}} & - = & \textcolor{blue}{\circlearrowleft} & \times & \textcolor{red}{\boxed{\text{light blue}}}
 \end{matrix}$$

## Algorithm ( PA = LU ) [7]

where

$$L^{(k)} = \begin{pmatrix} I & & \\ \hline 0 & 1 & \\ \hline 0 & c/\xi & I \end{pmatrix} \leftarrow k\text{-row} \quad \text{by updating } L(k+1:n, k) \leftarrow c/\xi$$

$k\text{-col}$   
↓

$$A^{(k+1)} = \begin{pmatrix} \times & \times & \times \\ \hline 0 & \xi & d^T \\ \hline 0 & 0 & \tilde{B} \end{pmatrix}, \quad \tilde{B} = B - \frac{cd^T}{\xi} \quad \text{by updating matrix } A(k+1:n, k+1:n) - = \frac{cd^T}{\xi}$$

then  $P^{(k-1)}A = \tilde{L}^{(k-2)}L^{(k-1)}A^{(k)} \longrightarrow P^{(k)}A = \tilde{L}^{(k-1)}L^{(k)}A^{(k+1)}$  (recursion is done)

*endfor*

## Algorithm ( PA = LU ) [8]

$$A = \begin{pmatrix} 6 & -2 & 2 & 4 \\ 12 & -8 & 6 & 10 \\ 3 & -13 & 9 & 3 \\ -6 & 4 & 1 & -18 \end{pmatrix}$$

$$P = (2, 3, 1, 4)$$

$$L = \begin{pmatrix} 1 & & & \\ 0.25 & 1 & & \\ -0.5 & 0 & 1 & \\ 0.5 & -2/11 & 1/11 & 1 \end{pmatrix}$$

$$U = \begin{pmatrix} 12 & -8 & 6 & 10 \\ -11 & 7.5 & 0.5 & \\ 4 & -13 & \\ 3/11 & \end{pmatrix}$$

Store  $L$  and  $U$  into original  $A$

```
PA = LU : store L and U into A:
dimension of matrix is <4,4> with col-major
12.0000   -8.0000    6.0000   10.0000
 0.2500   -11.0000   7.5000   0.5000
 -0.5000    0.0000   4.0000  -13.0000
 0.5000   -0.1818   0.0909   0.2727
```

```
permutation matrix P:
dimension of matrix is <4,1> with col-major
 2
 3
 4
 1
```

**Question 1:** how to write down a test driver

**Question 2:** how to do backward and forward

## Test driver [1]

main.cpp

```
void test_PA_LU( void )
{
    integer m = 4 ;
    integer n = 4 ;
    matrixHandler Ah ;
    int_matrixHandler Ph ;
    matrixHandler bh ;
    matrixHandler xh ; // x = inv(A)*b
    matrixHandler Ah_dup ;
    matrixHandler bh_hat ; // b_hat = A*x
    matrixHandler rh ; // residual r = b - Ax
    doublereal r_supnorm ;
    int conti_flag = 1 ;
    int end_flag ;
    doublereal **A ;
    doublereal **b ;

1 // step 1: set up a matrix A
    Ah = zeros( m, n, COL_MAJOR ) ;
    A = Ah->A ;
    A[1][1] = 6. ; A[1][2] = 12. ; A[1][3] = 3. ; A[1][4] = -6. ;
    A[2][1] = -2. ; A[2][2] = -8. ; A[2][3] = -13. ; A[2][4] = 4. ;
    A[3][1] = 2. ; A[3][2] = 6. ; A[3][3] = 9. ; A[3][4] = 1. ;
    A[4][1] = 4. ; A[4][2] = 10. ; A[4][3] = 3. ; A[4][4] = -18. ;

    printf("matrix A = \n");
    disp( Ah, stdout ) ;
// duplicate A since L,U reuse storage of A
    Ah_dup = zeros( m, n, COL_MAJOR ) ;
    duplicate( Ah, Ah_dup ) ;
```

$$A = \begin{pmatrix} 6 & -2 & 2 & 4 \\ 12 & -8 & 6 & 10 \\ 3 & -13 & 9 & 3 \\ -6 & 4 & 1 & -18 \end{pmatrix}$$

$$A[j][i] \equiv A(i, j)$$

Remember to duplicate matrix  $A$  since  $A$  is modified when execute  $LU$  decomposition.

## Test driver [2]

```

2   Ph = int_zeros( m, 1, COL_MAJOR ) ;
// step 2: factorization, PA = LU
end_flag = lu_partialPivot( Ah, Ph, conti_flag ) ;

printf("\nPA = LU : store L and U into A:\n");
disp( Ah, stdout ) ;
printf("\npermutation matrix P:\n");
int_disp( Ph, stdout ) ;

3 // step 3: generate right hand side vector b
bh = zeros( m, 1, COL_MAJOR ) ;
b = bh->A ;
b[1][1] = 5. ; b[1][2] = 6. ; b[1][3] = 7. ; b[1][4] = 8. ;
printf("\nright hand side vector b:\n");
disp( bh, stdout ) ;

xh = zeros( m, 1, COL_MAJOR ) ;
4 // step 4: solve x = inv(A)*b
lu_partialPivot_lin_sol( Ah, Ph, bh, xh ) ;

printf("\nsolution x = inv(A)*b\n");
disp( xh, stdout ) ;

5 // step 5: verify residual r = b - A*x
bh_hat = zeros( m, 1, COL_MAJOR ) ;
rh     = zeros( m, 1, COL_MAJOR ) ;

matvec( Ah_dup, xh, bh_hat ) ; // b_hat = A*x
matsub( bh, bh_hat, rh) ; // r = b - A*x
r_supnorm = norm( rh, INF_NORM ) ;
printf("\nsupnorm(r = b - A*x) = %6.2E\n", r_supnorm);

dealloc( Ah ) ;
int_dealloc( Ph ) ;
dealloc( bh ) ;
dealloc( xh ) ;
dealloc( Ah_dup ) ;
dealloc( bh_hat ) ;
dealloc( rh ) ;
}

```

$$b = \begin{pmatrix} 5 \\ 6 \\ 7 \\ 8 \end{pmatrix}$$

Linear solver: do backward and forward

$$x = A^{-1}b = \begin{pmatrix} -6.9306 \\ 17.9583 \\ 26.5833 \\ 7.3333 \end{pmatrix}$$

## Exercise

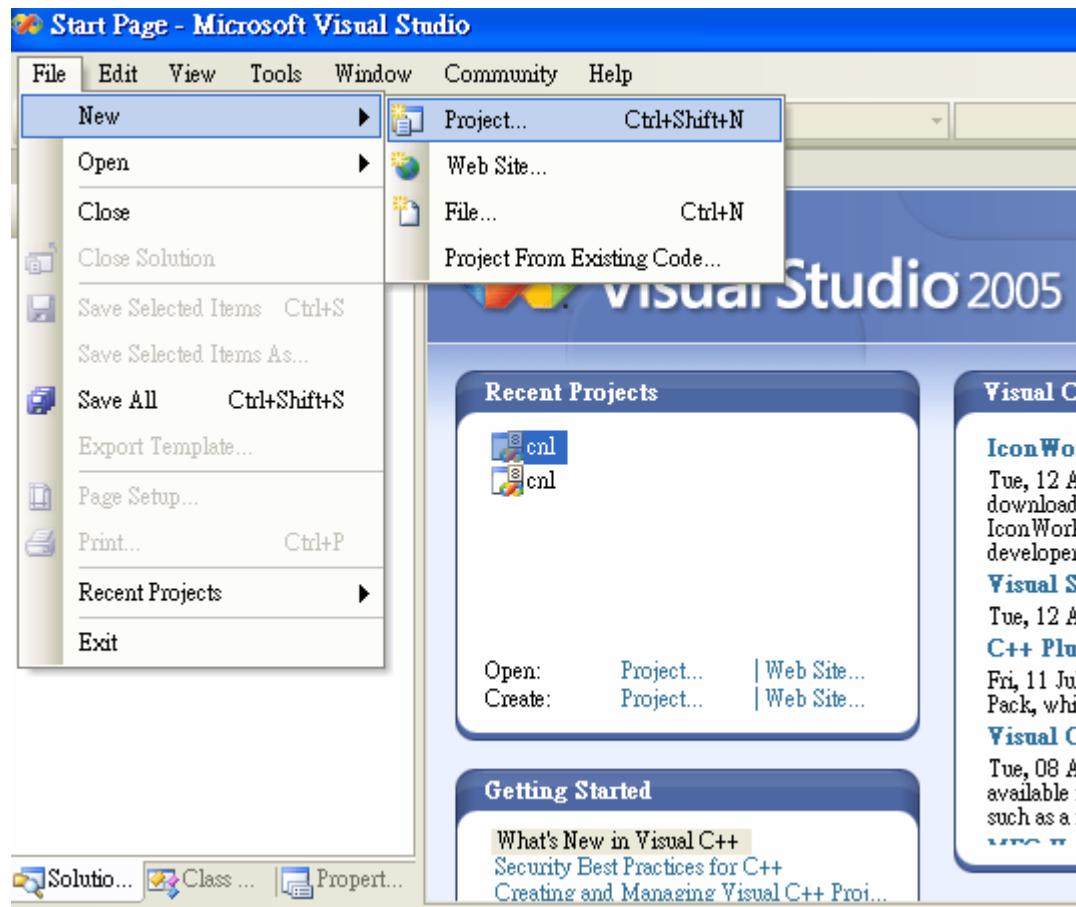
- Implement  $PA = LU$ .
- Implement forward and backward.
- Write a driver to test your linear solver.
- Any other implementation for full matrix?

# OutLine

- Data structure of full matrix
- Implementation of  $PA=LU$
- Visual Studio 2005: How To
- Linux machine: How to compile

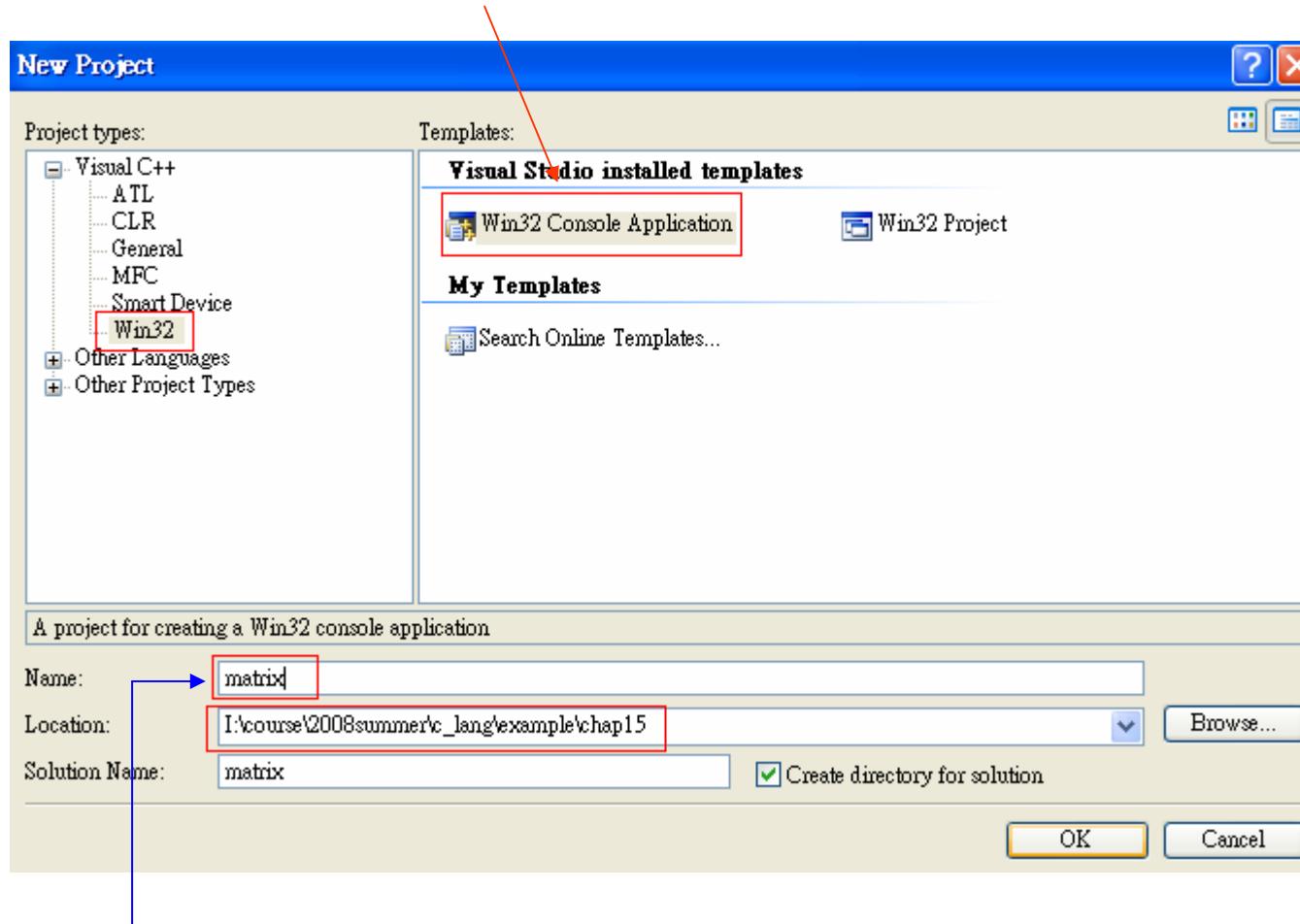
# Visual Studio 2005: How To [1]

Create a new project: File → Project



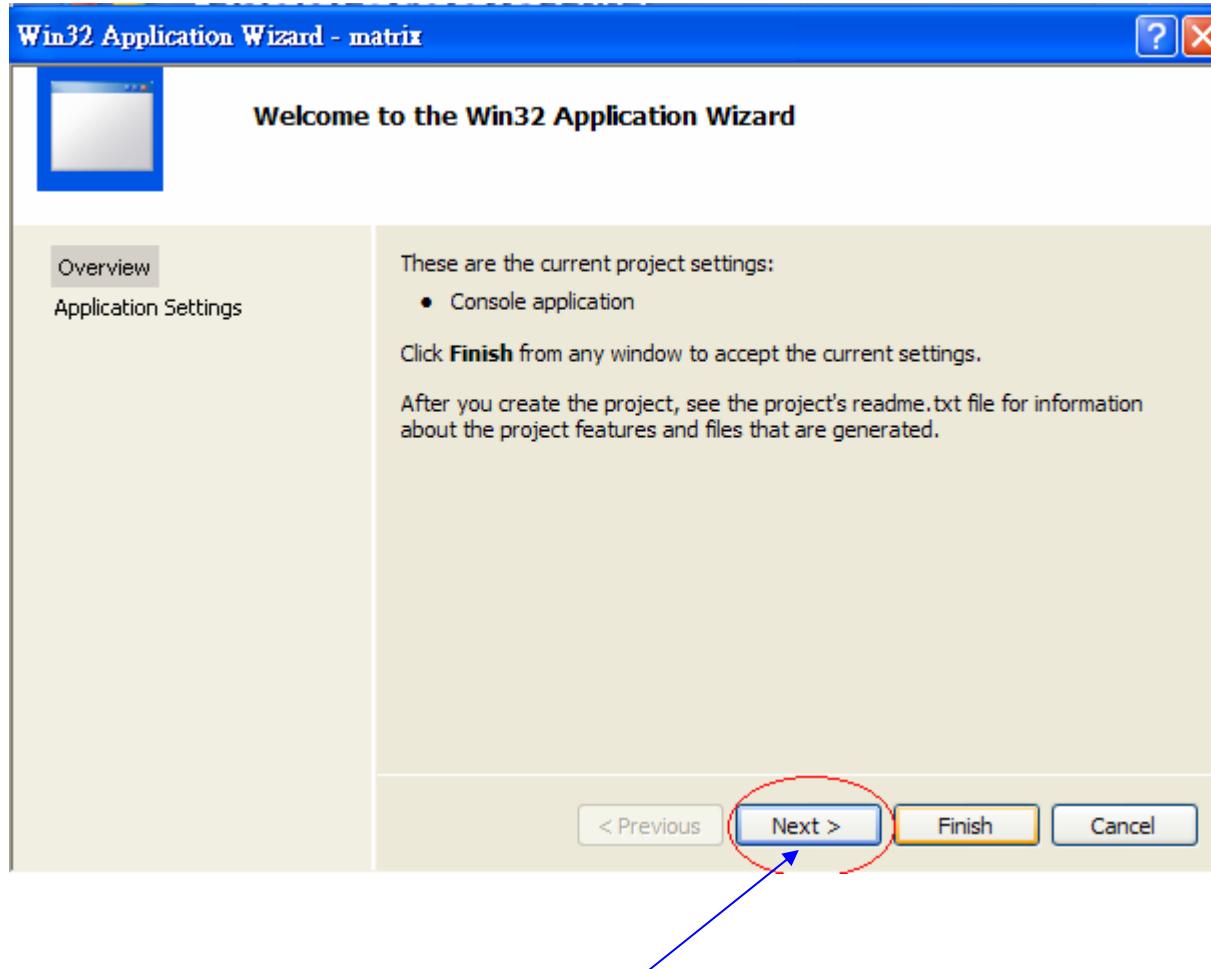
## Visual Studio 2005: How To [2]

Choose Win32 console application, this is the same as what we do in VC 6.0



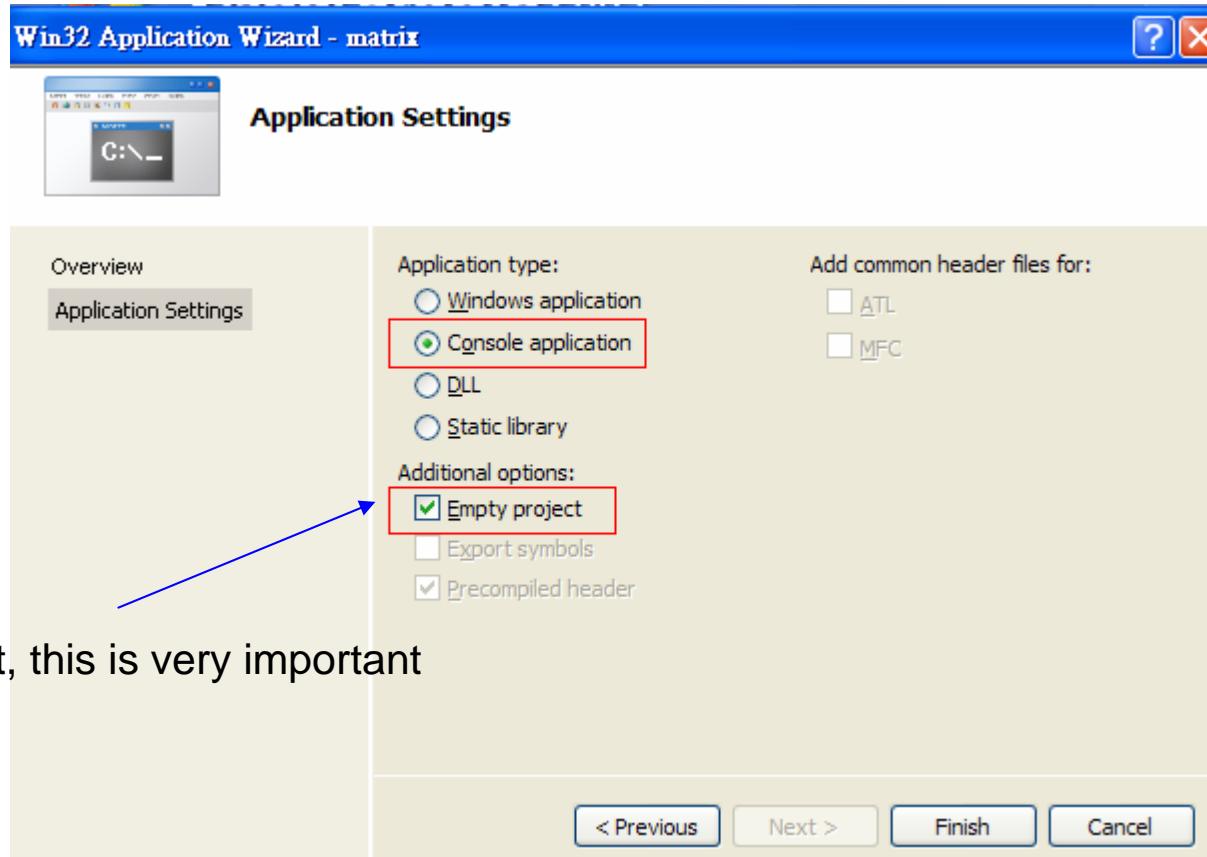
Project name: vc 2005 will create a directory, the same name as project name

## Visual Studio 2005: How To [3]



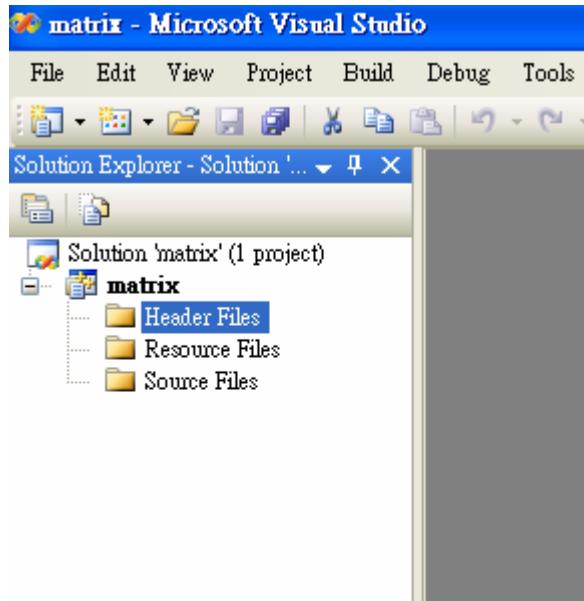
We choose “next” bottom to set an **empty** project, DO NOT press Finish bottom.

## Visual Studio 2005: How To [4]

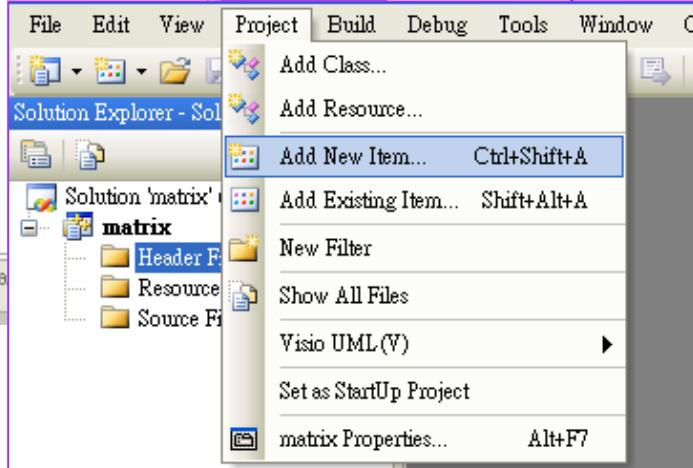
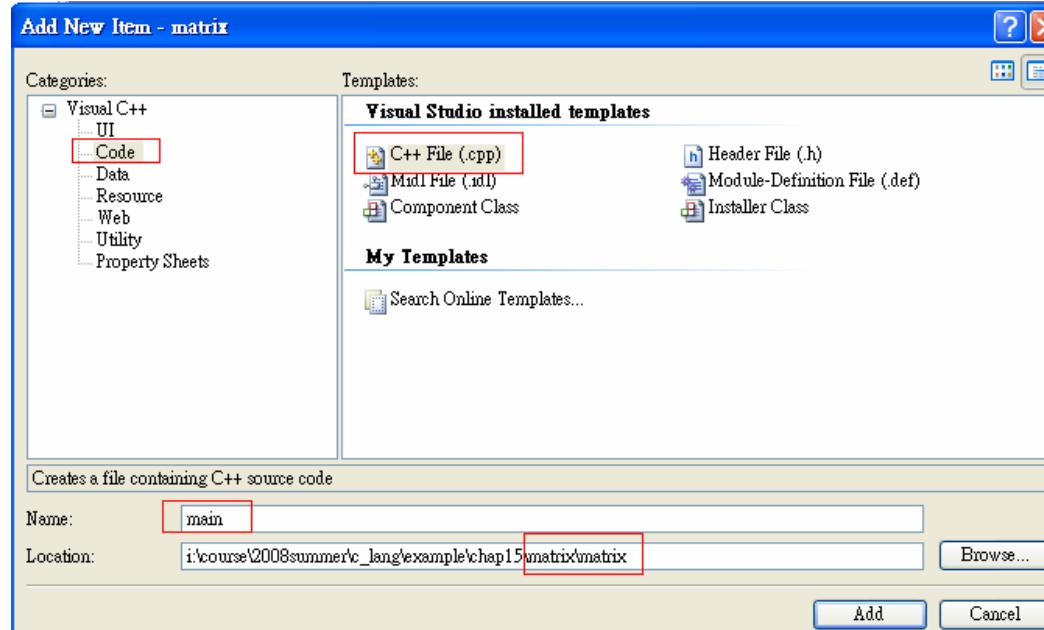


# Visual Studio 2005: How To [5]

## 1 Empty project



## 3 Add “main.cpp” to this project



## 2 Add new item (source file or header file) to this project

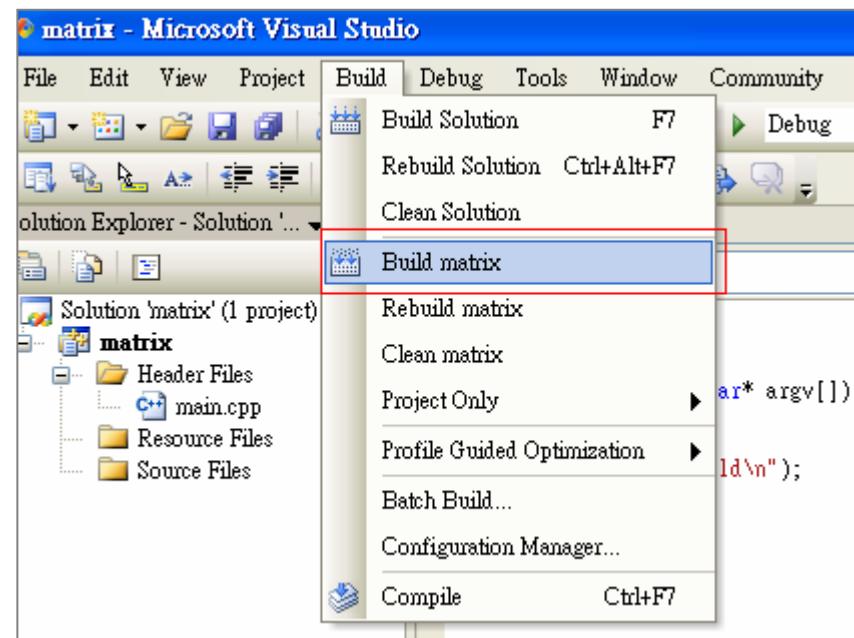
## Visual Studio 2005: How To [6]

Write source code “hello world”

The screenshot shows the Microsoft Visual Studio 2005 interface. The title bar says "matrix - Microsoft Visual Studio". The menu bar includes File, Edit, View, Project, Build, Debug, Tools, Window, Community, Help. The toolbar has various icons for file operations. The Solution Explorer window on the left shows a single project named "matrix" with one item under "Source Files": "main.cpp". The main editor window displays the following C++ code:

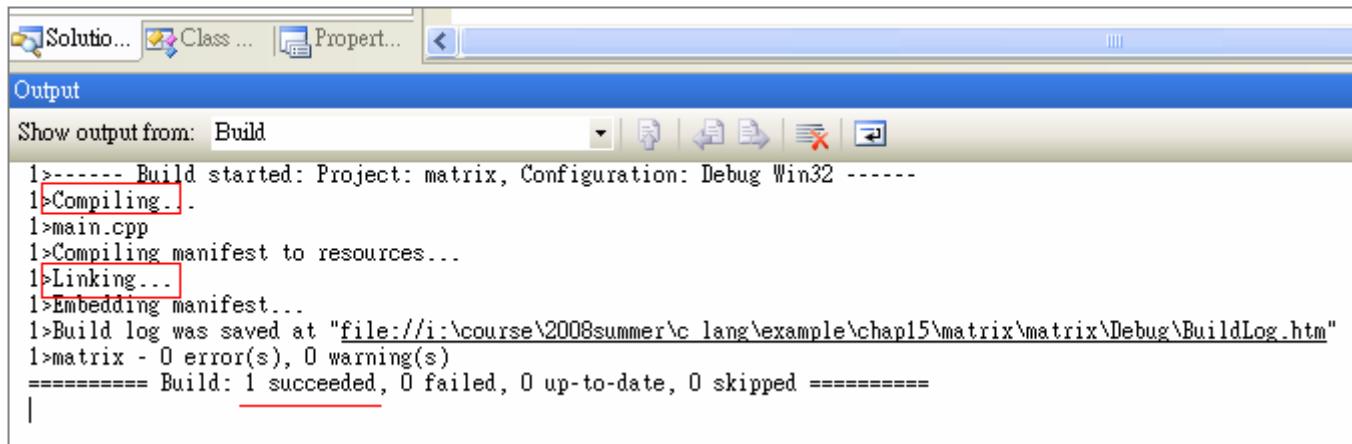
```
#include <stdio.h>
int main(int argc, char* argv[])
{
    printf("Hello world\n");
    return 0 ;
}
```

Compile: Build → Build matrix



## Visual Studio 2005: How To [7]

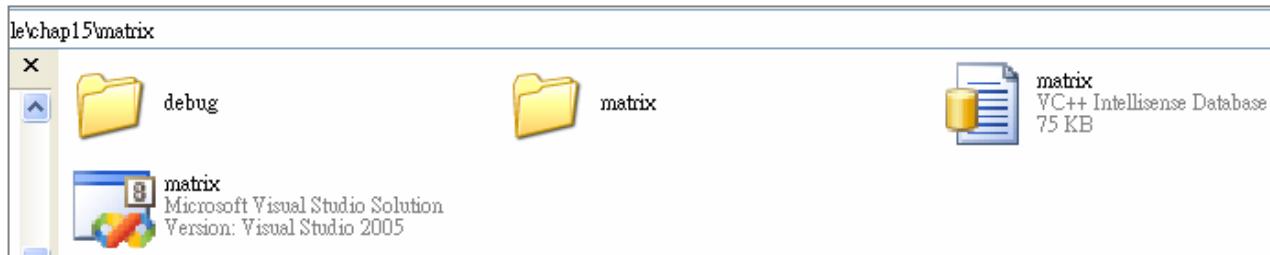
Result of compilation, including linking: success



The screenshot shows the Visual Studio Output window with the following text:

```
1>----- Build started: Project: matrix, Configuration: Debug Win32 -----
1>Compiling...
1>main.cpp
1>Compiling manifest to resources...
1>Linking...
1>Embedding manifest...
1>Build log was saved at "file:///i:/course\2008summer\c_lang\example\chap15\matrix\matrix\Debug\BuildLog.htm"
1>matrix - 0 error(s), 0 warning(s)
===== Build: 1 succeeded, 0 failed, 0 up-to-date, 0 skipped ======
```

Additional directory “debug” appears

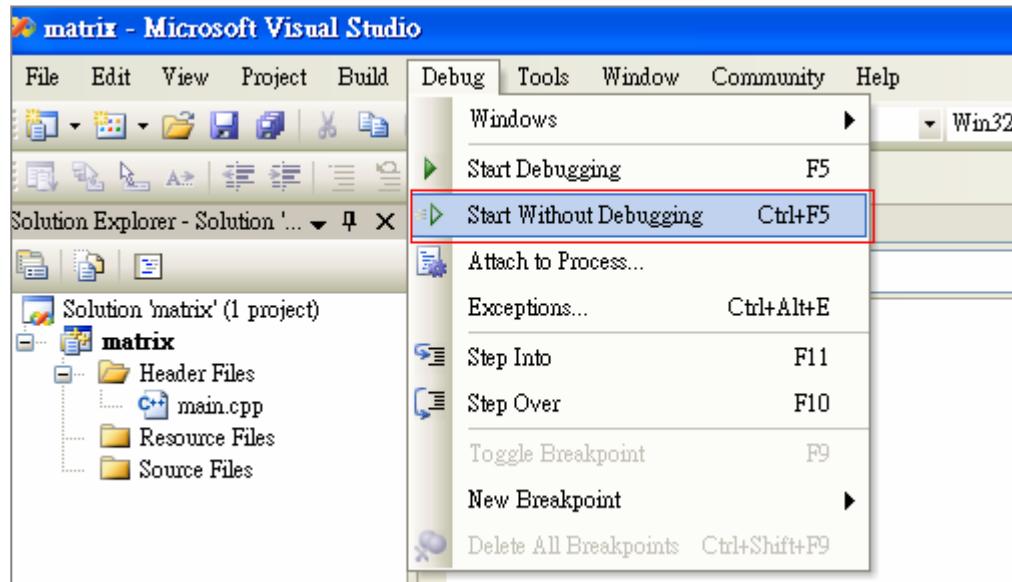


Executable file “matrix.exe” in this debug directory



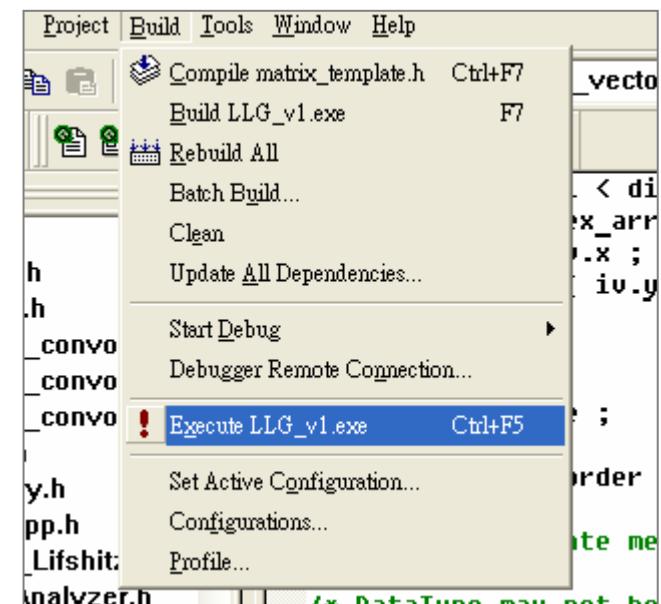
# Visual Studio 2005: How To [8]

Execute matrix.exe: Debug → Start Without Debugging



```
C:\WINDOWS\system32\cmd.exe
Hello world
請按任意鍵繼續 . . .
```

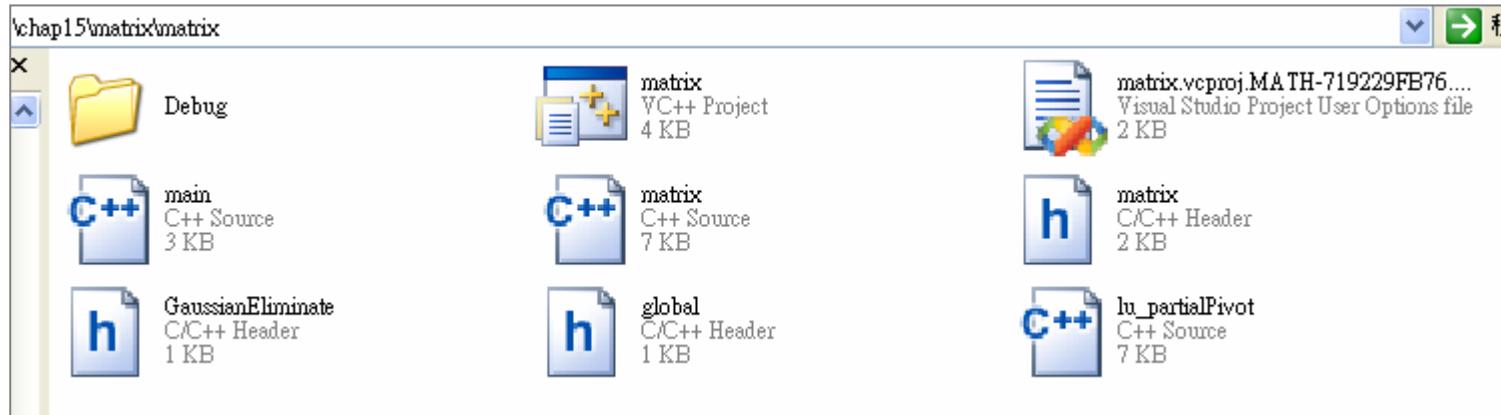
Execution in VC 6.0



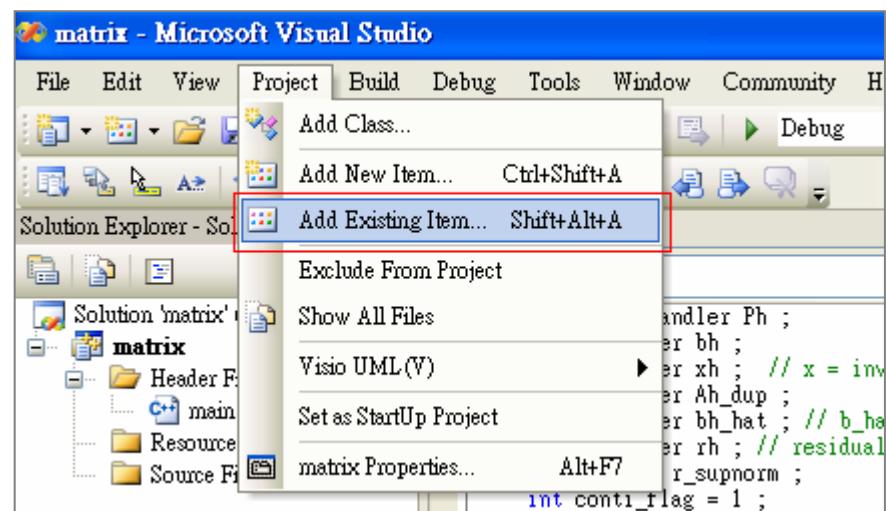
# Visual Studio 2005: How To [9]

Suppose we want to add several source files into this project.

- 1 Copy files into directory /matrix/matrix

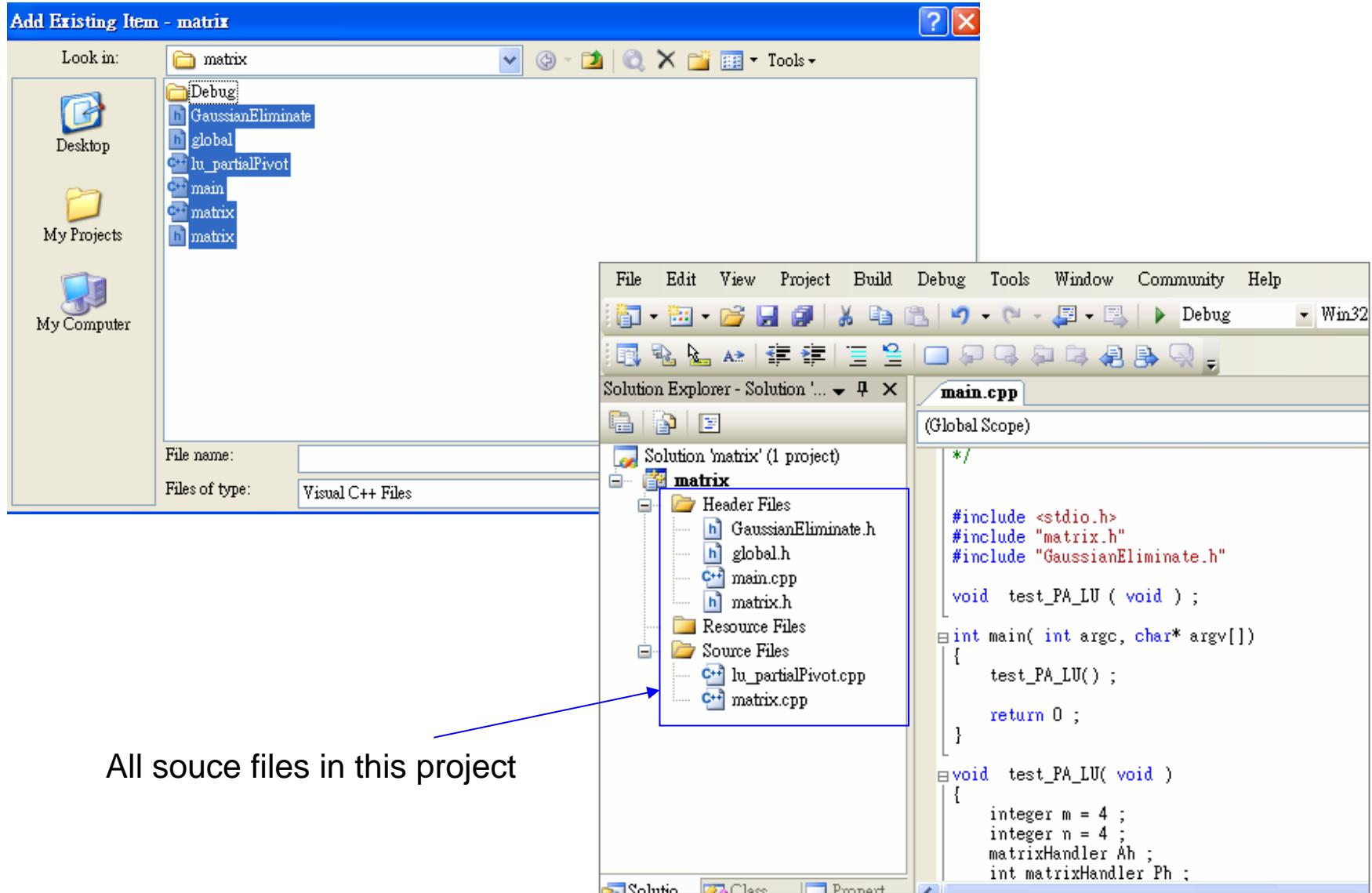


- 2 Add source files into the project by  
Project → Add Existing item



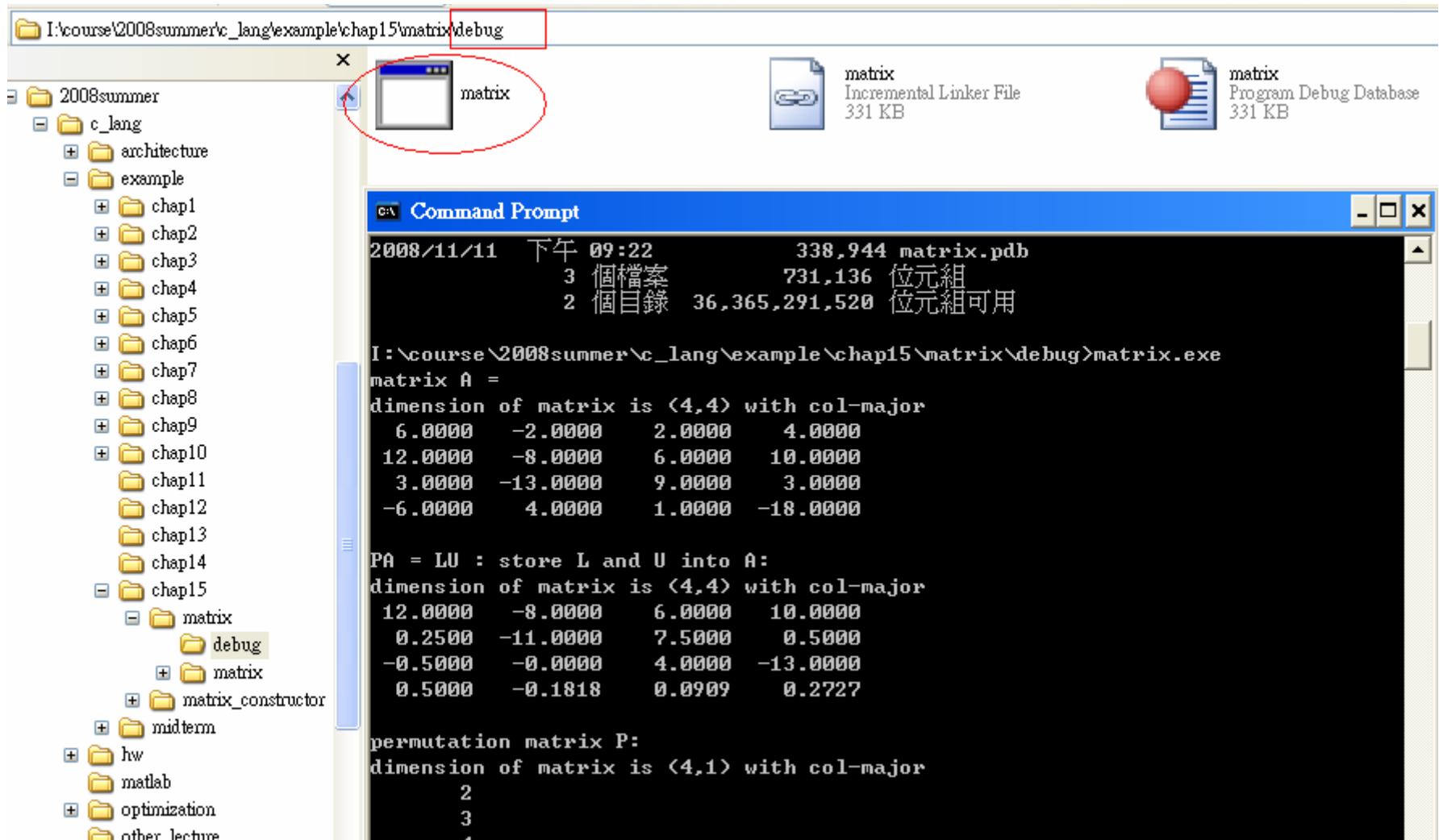
# Visual Studio 2005: How To [10]

Select the files you want to add



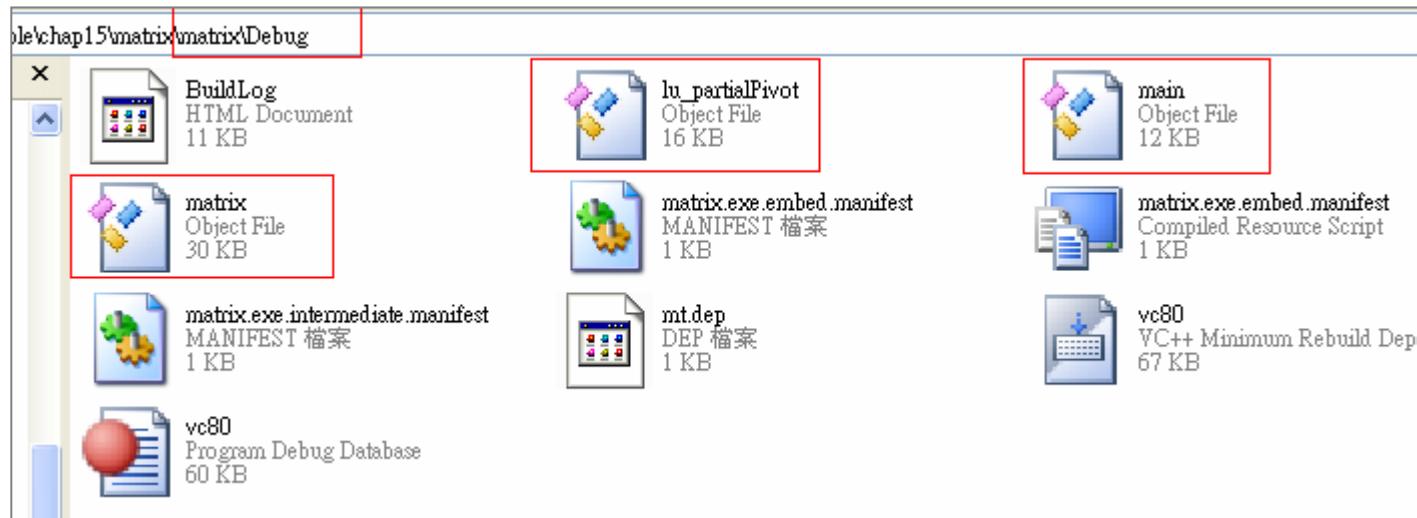
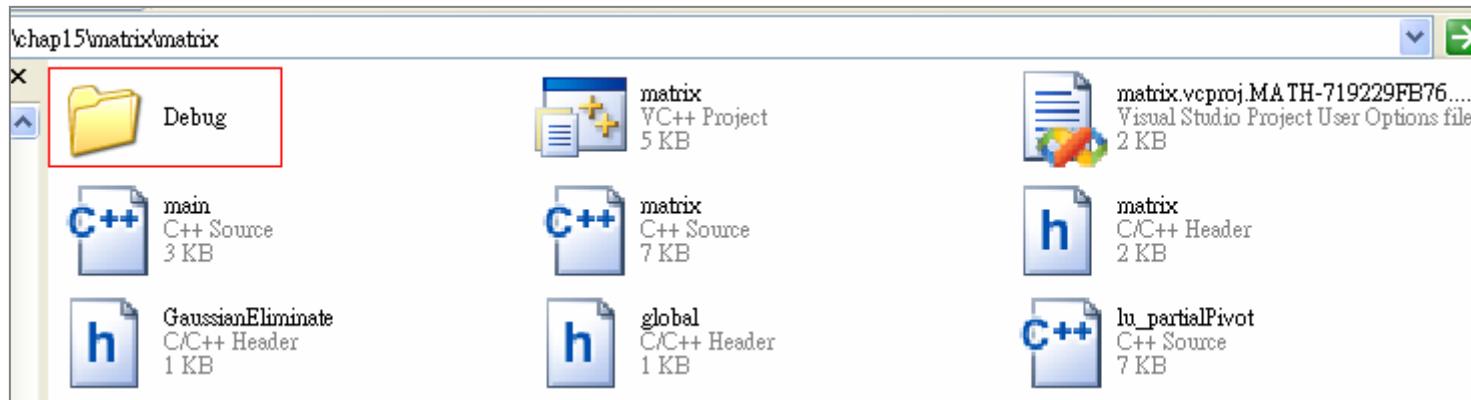
## Visual Studio 2005: How To [11]

Remember that executable file is in directory /matrix/debug, you can use command window to execute matrix.exe



## Visual Studio 2005: How To [12]

There is another “debug” directory in /matrix/matrix, this directory contains object files, no executable file



# OutLine

- Data structure of full matrix
- Implementation of  $PA=LU$
- Visual Studio 2005: How To
- Linux machine: How to compile

## *Linux machine: How to compile [1]*

- 1 Suppose we put all source file into directory ***matrix\_constructor*** and upload to workstation.

```
[macrol0d@quartet2 matrix_constructor]$ ls
Debug          lu_partialPivot.cpp  matrix_constructor.dsp  matrix_constructor.plg
GaussianEliminate.h  main.cpp        matrix_constructor.dsw
Makefile          matrix.cpp       matrix_constructor.ncb
global.h          matrix.h        matrix_constructor.opt
[macrol0d@quartet2 matrix_constructor]$
```

- 2 Remove all VC related files.

```
[macrol0d@quartet2 matrix_constructor]$
[macrol0d@quartet2 matrix_constructor]$ rm matrix_constructor.*
rm: remove regular file `matrix_constructor.dsp'? y
rm: remove regular file `matrix_constructor.dsw'? y
rm: remove regular file `matrix_constructor.ncb'? y
rm: remove regular file `matrix_constructor.opt'? y
rm: remove regular file `matrix_constructor.plg'? y
[macrol0d@quartet2 matrix_constructor]$
Debug          Makefile  lu_partialPivot.cpp  matrix.cpp
GaussianEliminate.h  global.h  main.cpp        matrix.h
[macrol0d@quartet2 matrix_constructor]$
```

- 3 use command “qmake -project” to generate project file

```
[macrol0d@quartet2 matrix_constructor]$ qmake -project
[macrol0d@quartet2 matrix_constructor]$
Debug          Makefile  lu_partialPivot.cpp  matrix.cpp  matrix_constructor.pro
GaussianEliminate.h  global.h  main.cpp        matrix.h
[macrol0d@quartet2 matrix_constructor]$
```

## *Linux machine: How to compile [2]*

- 4 use command “qmake matrix\_constructor.pro” to generate Makefile

Later on, we will introduce Makefile

```
[macrol0d@quartet2 matrix_constructor]$ qmake matrix_constructor.pro
[macrol0d@quartet2 matrix_constructor]$ ls
Debug          Makefile  lu_partialPivot.cpp  matrix.cpp  matrix_constructor.pro
GaussianEliminate.h  global.h  main.cpp      matrix.h
[macrol0d@quartet2 matrix_constructor]$ █
```

- 5 use command “make” to compile your codes and generate executable file

```
[macrol0d@quartet2 matrix_constructor]$ make
icpc -c -pipe -w -O2 -mp -DQT_NO_DEBUG -DQT_SHARED -DQT_THREAD_SUPPORT -I/opt/qt/mkspecs/default -I. -I. -I/opt/qt/include -o lu_partialPivot.o lu_partialPivot.cpp
icpc -c -pipe -w -O2 -mp -DQT_NO_DEBUG -DQT_SHARED -DQT_THREAD_SUPPORT -I/opt/qt/mkspecs/default -I. -I. -I/opt/qt/include -o main.o main.cpp
icpc -c -pipe -w -O2 -mp -DQT_NO_DEBUG -DQT_SHARED -DQT_THREAD_SUPPORT -I/opt/qt/mkspecs/default -I. -I. -I/opt/qt/include -o matrix.o matrix.cpp
matrix.cpp(72): (col. 3) remark: LOOP WAS VECTORIZED.
matrix.cpp(34): (col. 3) remark: LOOP WAS VECTORIZED.
icpc -Wl,-rpath,/opt/qt/lib -o matrix_constructor lu_partialPivot.o main.o matrix.o -L/opt/qt/lib -L/usr/X11R6/lib -lqt-mt -lXext -lX11 -lm
[macrol0d@quartet2 matrix_constructor]$ ls
Debug          lu_partialPivot.cpp  matrix.cpp      matrix_constructor.pro
GaussianEliminate.h  lu_partialPivot.o  matrix.h
Makefile        main.cpp           matrix.o
global.h          main.o            matrix_constructor
[macrol0d@quartet2 matrix_constructor]$ █
```

## *Linux machine: How to compile [3]*

- 6 Execute executable file by “./matrix\_constructor”

```
[macrolid@quartet2 matrix_constructor]$
[macrolid@quartet2 matrix_constructor]$ ./matrix_constructor
matrix A =
dimension of matrix is (4,4) with col-major
  6.0000   -2.0000    2.0000    4.0000
 12.0000   -8.0000    6.0000   10.0000
  3.0000  -13.0000    9.0000    3.0000
 -6.0000    4.0000    1.0000  -18.0000

PA = LU : store L and U into A:
dimension of matrix is (4,4) with col-major
 12.0000   -8.0000    6.0000   10.0000
  0.2500  -11.0000    7.5000    0.5000
 -0.5000   -0.0000    4.0000  -13.0000
  0.5000   -0.1818    0.0909    0.2727

permutation matrix P:
dimension of matrix is (4,1) with col-major
  2
  3
  4
  1

right hand side vector b:
dimension of matrix is (4,1) with col-major
  5.0000
  6.0000
```