

# Parallel Programming (English)

(Week 4)

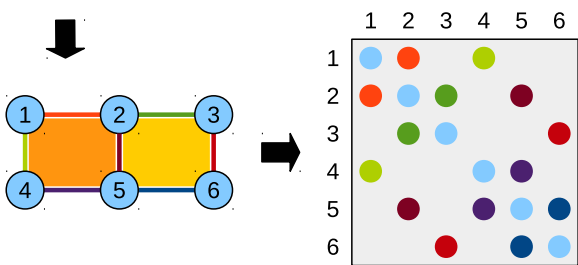
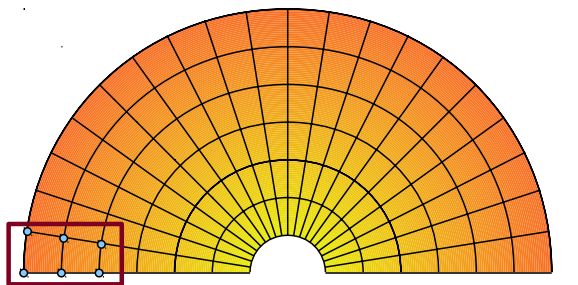
Weifeng Liu

Department of Computer Science and Technology

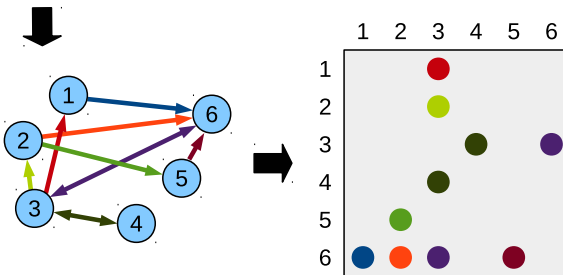
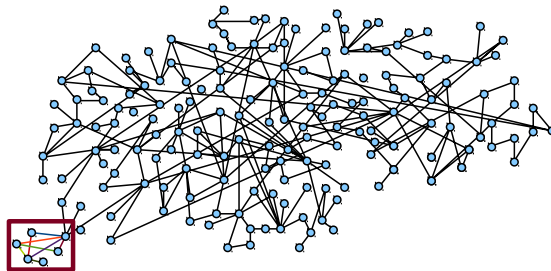
China University of Petroleum - Beijing



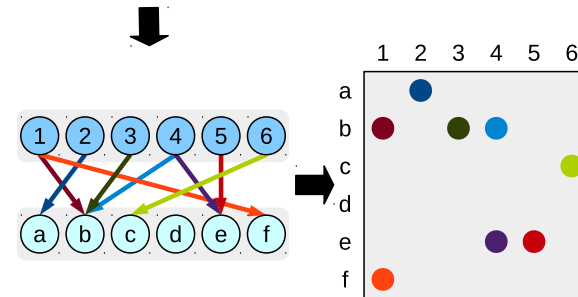
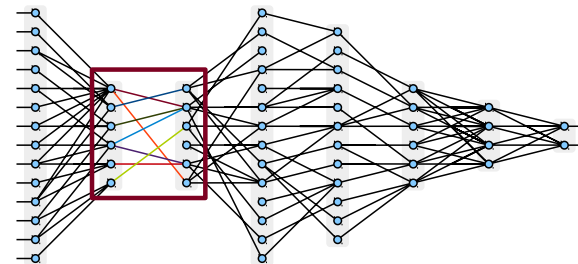
# Sparse Matrices are everywhere



Finite element mesh,  
Computational science



Social network,  
Big Data Analytics



Deep neural network,  
AI



# Sparse Matrix and its Storage Format

- If a matrix has a large amount of zeros, only storing its nonzeros may save overheads of memory space and computational resources.
- Coordinate (COO) and Compressed Sparse Row (CSR) formats can be used.

0	0	1	0
2	3	0	0
0	0	0	0
4	0	5	6

A  
(4x4)  
dense

		1	
2	3		
4		5	6

A  
(4x4)  
sparse, 6 nonzeros

row index =	0	1	1	3	3	3
column index =	2	0	1	0	2	3
value =	1	2	3	4	5	6

A (in COO)  
(4x4)  
6 nonzeros



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A  
(4x4)  
dense

		1	
2	3		
4		5	6

A  
(4x4)  
sparse, 6 nonzeros

row pointer = 

0	1	3	3	6
---	---	---	---	---

column index = 

2	0	1	0	2	3
---	---	---	---	---	---

value = 

1	2	3	4	5	6
---	---	---	---	---	---

A (in CSR)  
(4x4)  
6 nonzeros



# Sparse Matrix-Vector Multiplication (SpMV)

- Multiply a sparse matrix with multiple vectors (or say, a talk-and-skinny matrix), and get multiple vectors (or say, a talk-and-skinny matrix).

		1	
2	3		
4		5	6

$A$

(4x4)

sparse, 6 nonzeros

$\times$

$a$
$b$
$c$
$d$

$x$

(4x1)

dense

$=$

$1c$
$2a+3b$
0
$4a+5c+6d$

$y$

(4x1)

dense



# Sparse Matrix-Vector Multiplication (SpMV)

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0	0	1	0
2	3	0	0
0	0	0	0
4	0	5	6

$A$

(4x4)

sparse, 6 nonzeros

$\times$

$a$
$b$
$c$
$d$

$x$

(4x1)

dense

$=$

$1c$
$2a+3b$
0
$4a+5c+6d$

$y$

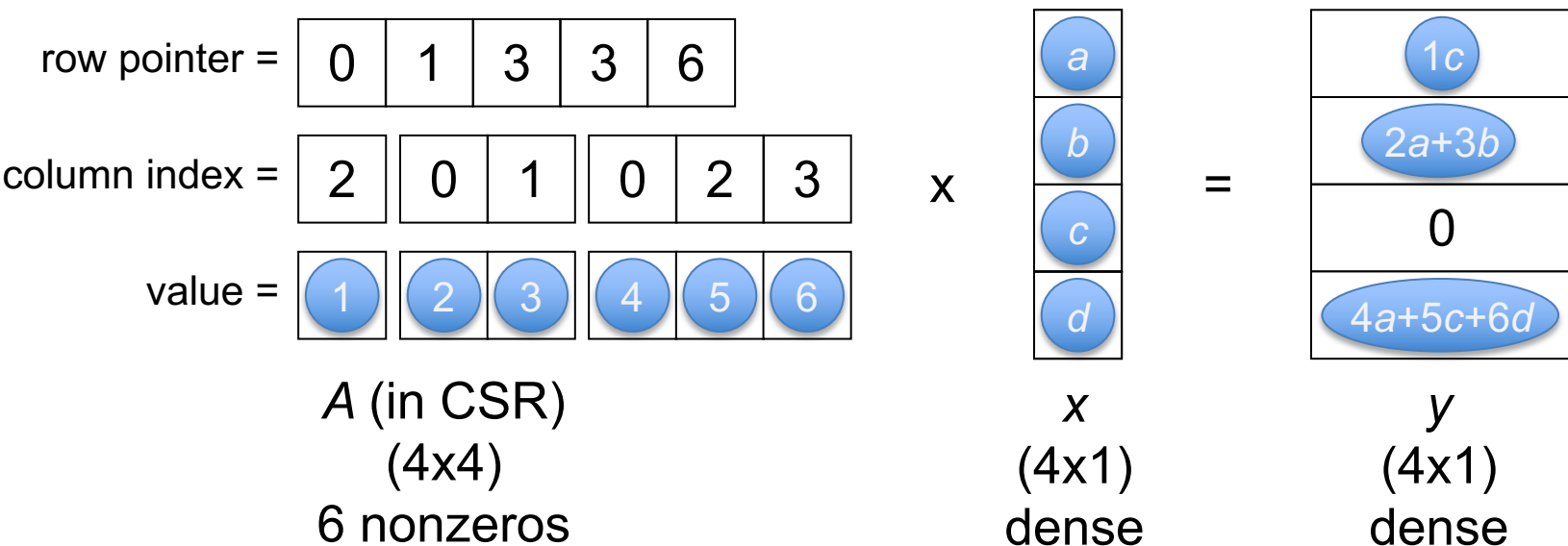
(4x1)

dense



# Sparse Matrix-Vector Multiplication (SpMV)

- Multiply a sparse matrix with multiple vectors (or say, a talk-and-skinny matrix), and get multiple vectors (or say, a talk-and-skinny matrix).



# Serial C code for SpMV

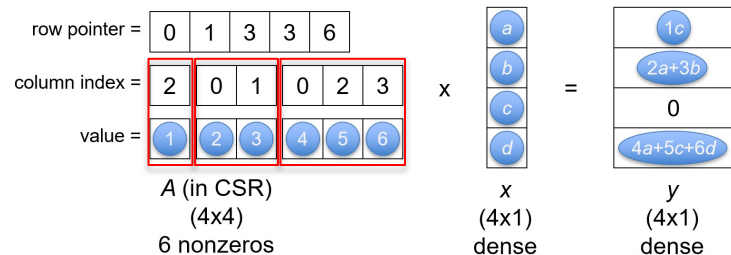
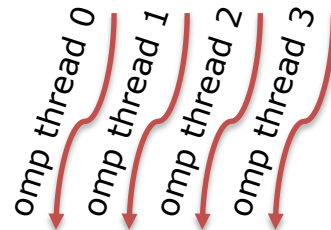
```
line 01: spmv (int n, int *row_ptr, int *col_idx, double *val, double *x, double *y)
line 02: {
line 03:
line 04:     for (int i = 0; i < n; i++)
line 05:     {
line 06:         y[i] = 0.0;
line 07:         for (int j = row_ptr[i]; j < row_ptr[i+1]; j++)
line 08:         {
line 09:             y[i] += val[j] * x[col_idx[j]];
line 10:         }
line 11:     }
line 12: }
```



# OpenMP C code for SpMV

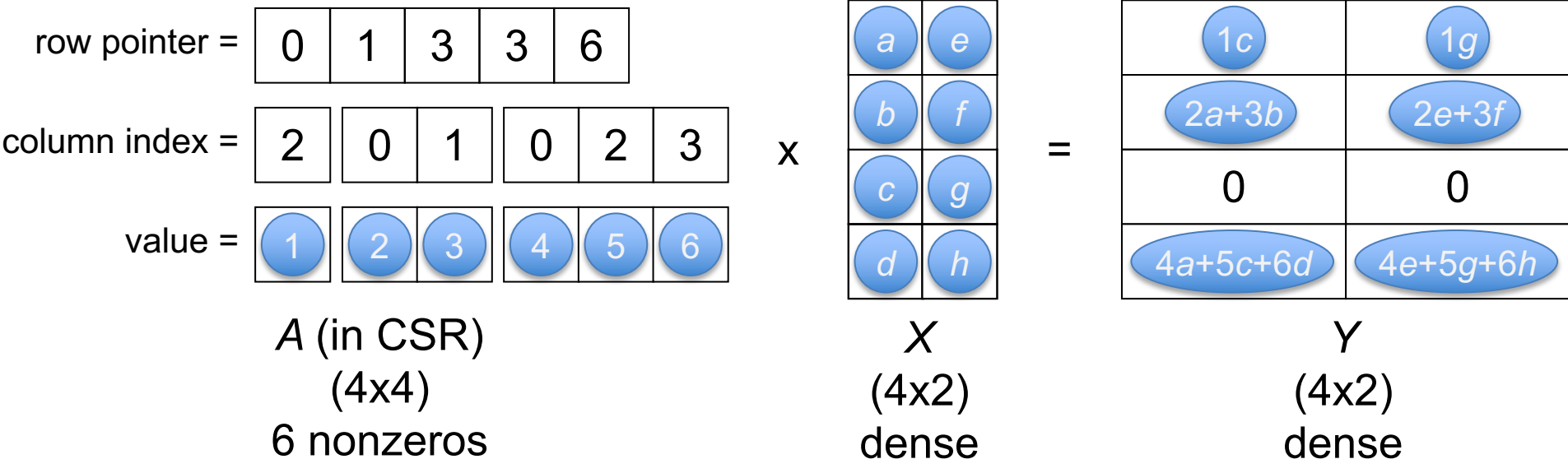
```

line 01: spmv (int n, int *row_ptr, int *col_idx, double *val, double *x, double *y)
line 02: {
line 03:     #pragma omp parallel for
line 04:     for (int i = 0; i < n; i++)
line 05:     {
line 06:         y[i] = 0.0;
line 07:         for (int j = row_ptr[i]; j < row_ptr[i+1]; j++)
line 08:         {
line 09:             y[i] += val[j] * x[col_idx[j]];
line 10:         }
line 11:     }
line 12: }
    
```



# Sparse Matrix-Multiple Vector Multiplication (SpMM)

- Multiply a sparse matrix with multiple vectors (or say, a talk-and-skinny matrix), and get multiple vectors (or say, a talk-and-skinny matrix).



Thanks!