

Data Structures: Arrays and Structures

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Introduction

Arrays

1. Array: a set of pairs, $\langle \text{index}, \text{value} \rangle$
2. Data structure
For each index, there is a value associated with that index.
3. Representation
 - An array can be implemented by using consecutive memory.
 - We may call this a **correspondence** or a **mapping**.
4. When considering an ADT we are more concerned with the operations that can be performed on an array.

ADT Array

structure *Array*

objects: A set of pairs $\langle \text{index}, \text{value} \rangle$ where for each value of index there is a value from the set item. Let *index* be a finite ordered set of one or more dimensions, for example, $\{0, \dots, n-1\}$ for one dimension, $\{(0, 0), (0, 1), (0, 2), (1, 0), (1, 1), (1, 2), (2, 0), (2, 1), (2, 2)\}$ for two dimensions, etc.

functions: for all $A \in \text{Array}$, $i \in \text{index}$, $x \in \text{Item}$, $j, \text{size} \in \text{integer}$

Array Create(j, list) ::= **return** an array of j dimensions where *list* is a j -tuple whose i th element is the size of the i th dimension.

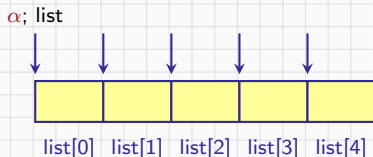
Item Retrieve(A, i) ::= **if** ($i \in \text{index}$) **return** the item associated with index value i in array A **else return** error

Array Store(A, i, x) ::= **if** ($i \in \text{index}$) **return** an array that is identical to array A except the new pair $\langle i, x \rangle$ has been insert **else return** error.

Arrays in C

```
int list[5], *plist[5];
```

- `list[5]`: five integers
list[0], list[1], list[2], list[3], list[4]
- `plist[5]`: five pointers to integers
plist[0], plist[1], plist[2], plist[3], plist[4]
- Implementation of 1-D array
 - list[0]: base address = α
 - list[1]: $\alpha + \text{sizeof}(\text{int})$
 - list[i]: $\alpha + i * \text{sizeof}(\text{int})$
- list: a pointer to list[0]
(list + i): a pointer to list[i] (i.e. &list[i])
*(list + i): list[i]



One-Dimensional Array Addressing

☞ Consider

```
int one[] = {0, 1, 2, 3, 4};
```

Goal: print out address and value

```
print1(&one[0], 5);
```

```
void print1( int *ptr, int rows)
{
    int i;
    printf("Address Contents\n");
    for( i = 0; i < rows; i++ )
        printf("%8u%5d\n", ptr+i, *(ptr+i));
    printf("\n");
}
```

Address	Contents
12344868	0
12344872	1
12344876	2
12344880	3
12344884	4

Dynamically Allocation

How Large Should the Size of Your Array Be?

- A good solution is to defer this decision to run time and allocate the array.

```
int i, n, *list;
printf("Enter the number of numbers to generate: ");
scanf("%d", &n);
if( n < 1 ){
    fprintf(stderr, "Improper value of n \n");
    exit(EXIT_FAILURE);
}
MALLOC(list, n*sizeof(int));
```


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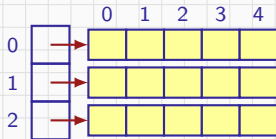
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    exit(EXIT_FAILURE);
}
MALLOC(list, n*sizeof(int));
```

```
#define MALLOC(p,s)
    if(!((p)=malloc(s) ) ){
        fprintf(stderr, "Insufficient memory");
    }
```

✗ `list[MAX_SIZE]`

Two-Dimensional Arrays

- Array of arrays representation
- Example `int x[3][5];`



- `x[i][j]`
 1. accessing the pointer in `x[i]` ➡ the [0]th element of row `i`.
 2. adding `j*sizeof(int)` ➡ the [j]th element of row `i`

Multidimensional Arrays

- Dynamically create a 2-D array

```
int** make2dArray(int rows, int cols)
{
    int **x, i;
    MALLOC( x, rows * sizeof(*x));
    for ( i = 0; i < rows; i++)
        MALLOC(x[i], cols * sizeof(**x));
    return x;
}
```

```
int **myArray;

myArray = make2dArray(5,10);

myArray[2][4] = 6;
```

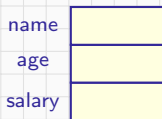
- **calloc**: allocation and initialization
- **realloc**: grows or shrinks a block of memory
- A three-dimensional array is represented as a one-dimensional array, each whose elements is a two-dimensional array.

Structures and Unions

Structures

- Arrays are collections of data of the same type.
- A **structure** is a collection of data items, where each item is identified as to its type and name.
 - 👉 This mechanism is called the **struct**.

```
struct person {  
    char name[10];  
    int age;  
    float salary;  
};  
  
strcpy(person.name, "james");  
person.age=10;  
person.salary=35000;
```



person

•: structure member operator

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person.salary=35000;
```

name	james
age	10
salary	35000

person

•: structure member operator

Create Your Structure Data Type

```
typedef struct humanBeing {  
    char name[10];  
    int age;  
    float salary;  
} humanBeing;
```

```
humanBeing person1, person2;  
  
int humansEqual (humanBeing person1, humanBeing person2)  
{  
    if (strcmp(person1.name, person2.name))  
        return FALSE;  
    if (person1.age != person2.age)  
        return FALSE;  
    if (person1.salary != person2.salary)  
        return FALSE;  
    return TRUE;  
}
```

Embed a Structure within a Structure

```
typedef struct date {  
    int month;  
    int day;  
    int year;  
} date;  
  
typedef struct humanBeing {  
    char name[10];  
    int age;  
    float salary;  
    date dob;  
} humanBeing;  
  
humanBeing person1;  
person1.dob.month=5;  
person1.dob.day=11;  
person1.dob.year=1944;
```


Unions

- A union declaration is similar to a structure.
- The fields of a union must share their memory space.
- Only one field of the union is "active" at any given time

```
typedef struct sexType {  
    enum tagField {female, male} sex;  
    union {  
        int children;  
        int beard;  
    }u;  
} sexType;  
typedef struct humanBeing {  
    char name[10];  
    int age;  
    float salary;  
    date dob;  
    sexType sexInfo;  
} humanBeing;
```

```
humanBeing person1, person2;  
person1.sexInfo.sex = male;  
person1.sexInfo.u.beard = FALSE;  
person2.sexInfo.sex = female;  
person2.sexInfo.u.children = 4;
```

Internal Implementation of Structures

- ```
struct {int i, j; float a, b;}
struct {int i; int j; float a; float b;}
```

The fields of a structure in memory will be stored in the same way using increasing address locations in the order specified in the structure definition.

- Holes or padding may actually occur
  - Within a structure to permit two consecutive components to be properly aligned within memory
- The size of an object of a **struct** or **union** type is the amount of storage necessary to represent the largest component, including any padding that may be required.
- Structures must begin and end on the same type of memory boundary (e.g. a multiple of 4, 8, or 16 ).

## Example

```
#include "stdio.h"

union A {
 int i; // 4 bytes
 char c[6]; // 6 bytes
};

struct B {
 int n; // 4 bytes
 double m; // 8 bytes
};

int main(void) {
 union A a;
 struct B b;
 printf("Size of A is %lu\n", sizeof(a));
 printf("Size of B is %lu\n", sizeof(b));
 return 0;
}
```

Size of A is 8  
Size of B is 16

# Self-Referential Structures

One or more of its components is a pointer to itself.

```
typedef struct list{
 char data;
 struct list *link;
} list;

list item1, item2, item3;
item1.data = 'a';
item2.data = 'b';
item3.data = 'c';
item1.link = item2.link = item3.link = NULL;

item1.link = &item2;
item2.link = &item3;
```



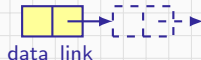
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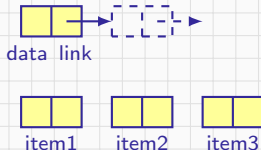
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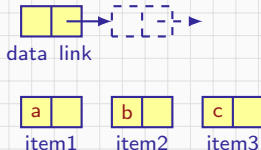
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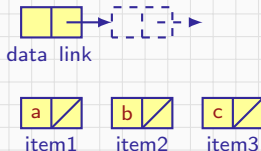
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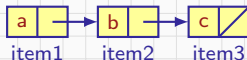
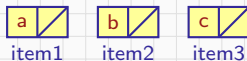
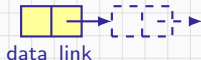
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# Polynomials

---

# Ordered Lists

Ordered (linear) list:  $(\text{item}_1, \text{item}_2, \text{item}_3, \dots, \text{item}_n)$

- (Sunday, Monday, Tuesday, Wednesday, Thursday, Friday, Saturday)
- (Ace, 2, 3, 4, 5, 6, 7, 8, 9, 10, Jack, Queen, King)
- (basement, lobby, mezzanine, first, second)
- (1941, 1942, 1943, 1944, 1945)

# Operations on Ordered Lists

- Finding the length,  $n$ , of the list.
- Reading the items from left to right (or right to left).
- Retrieving the  $i$ th element.
- Storing a new value into the  $i$ th position.
- Inserting a new element at the position  $i$ , causing elements numbered  $i, i + 1, \dots, n$  to become numbered  $i + 1, i + 2, \dots, n + 1$ .
- Deleting the element at position  $i$ , causing elements numbered  $i + 1, \dots, n$  to become numbered  $i, i + 1, \dots, n - 1$ .

## Implementation:

sequential mapping or non-sequential mapping.

# Polynomials

- Two polynomials are:

$$A(x) = 3x^{20} + 2x^3 \text{ and } B(x) = x^4 + 10x^3 + 3x^2 + 1$$

- Assume that we have two polynomials,

$$A(x) = \sum a_i x^i \text{ and } B(x) = \sum b_i x^i,$$

then:

$$A(x) + B(x) = \sum \left( a_i + b_i \right) x^i$$

$$A(x) \cdot B(x) = \sum \left( a_i x^i \cdot \sum \left( b_j x^j \right) \right)$$

- Similarly, we can define subtraction and division on polynomials, as well as many other operations.

# ADT Polynomial

## structure *Polynomial*

**objects:**  $p(x) = a_1x^{e_1} + a_2x^{e_2} + \dots + a_nx^{e_n}$ ; a set of ordered pairs of  $\langle e_i, a_i \rangle$  where  $a_i$  in *Coefficients* and  $e_i$  in *Exponents*,  $e_i$  are integers  $\geq 0$


**functions:** for all *poly*, *poly1*, *poly2*  $\in$  *Polynomial*,  
*coef*  $\in$  *Coefficients*, *expon*  $\in$  *Exponents*

|                                                                          |                                                                                                                                                                  |
|--------------------------------------------------------------------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| <i>Polynomial</i> Zero( )                                                | ::= return the polynomial, $p(x) = 0$                                                                                                                            |
| <i>Boolean</i> IsZero( <i>poly</i> )                                     | ::= if ( <i>poly</i> ) return FALSE else return TRUE                                                                                                             |
| <i>Coefficient</i> Coef( <i>poly</i> , <i>expon</i> )                    | ::= if ( <i>expon</i> $\in$ <i>poly</i> ) return its coefficient else return Zero                                                                                |
| <i>Exponent</i> Lead_Exp( <i>poly</i> )                                  | ::= return the largest exponent in <i>poly</i>                                                                                                                   |
| <i>Polynomial</i> Attach( <i>poly</i> , <i>coef</i> , <i>expon</i> )     | ::= if ( <i>expon</i> $\in$ <i>poly</i> ) return error else return the polynomial <i>poly</i> with the term $\langle \text{coef}, \text{expon} \rangle$ inserted |
| <i>Polynomial</i> Remove( <i>poly</i> , <i>expon</i> )                   | ::= if ( <i>expon</i> $\in$ <i>poly</i> ) return the polynomial <i>poly</i> with the term whose exponent is <i>expon</i> deleted else return error               |
| <i>Polynomial</i> SingleMult( <i>poly</i> , <i>coef</i> , <i>expon</i> ) | ::= return the polynomial $\text{poly} \cdot \text{coef} \cdot x^{\text{expon}}$                                                                                 |
| <i>Polynomial</i> Add( <i>poly1</i> , <i>poly2</i> )                     | ::= return the polynomial $\text{poly1} + \text{poly2}$                                                                                                          |
| <i>Polynomial</i> Mult( <i>poly1</i> , <i>poly2</i> )                    | ::= return the polynomial $\text{poly1} \cdot \text{poly2}$                                                                                                      |

## Initial Version of Function padd

$$D(x) = A(x) + B(x)$$

```
d = Zero();
while (!IsZero(a) && !IsZero(b)) do {
 switch COMPARE(LeadExp(a), LeadExp(b)) {
 case -1: d = Attach(d, Coef(b, LeadExp(b)), LeadExp(b));
 b = Remove(b, LeadExp(b));
 break;
 case 0: sum = Coef(a, LeadExp(a)) + Coef(b, LeadExp(b));
 if (sum)
 Attach(d, sum, LeadExp(a));
 a = Remove(a, LeadExp(a));
 b = Remove(b, LeadExp(b));
 break;
 case 1: d = Attach(d, Coef(a, LeadExp(a)), LeadExp(a));
 a = Remove(a, LeadExp(a));
 }
}
```

To simplify operations  "expon": in decreasing order

# Polynomial Representation

- Representation I

```
#define MAX_DEGREE 101
typedef struct polynomial{
 int degree;
 float coef[MAX_DEGREE];
} polynomial;
```

If  $a$  is of type **polynomial** and

$$A(x) = \sum_{i=0}^n a_i x^i$$

**a.degree** =  $n$  and

**a.coef[i]** =  $a_{n-i}$  or = 0

☞ This representation is very simple, but wastes space.

**a.degree** << **MAX\_DEGREE** (much less than)

- Representation II

```
#define MAX_TERMS 100
typedef struct polynomial{
 float coef;
 int expon;
} polynomial;
polynomial terms[MAX_TERMS];
int avail = 0;
```

The total terms must no more than **MAX\_DEGREE**.



# An Example of Polynomials

- Use one global array to store all polynomials  
These polynomials are stored in the array *terms*
- $A(x) = 2x^{1000} + 1$  and  $B(x) = x^4 + 10x^3 + 3x^2 + 1$

|             |               |                |               |    |                |              |   |
|-------------|---------------|----------------|---------------|----|----------------|--------------|---|
|             | <i>startA</i> | <i>finishA</i> | <i>startB</i> |    | <i>finishB</i> | <i>avail</i> |   |
|             | ↓             | ↓              | ↓             |    | ↓              | ↓            |   |
| <i>coef</i> | 2             | 1              | 1             | 10 | 3              | 1            |   |
| <i>exp</i>  | 1000          | 0              | 4             | 3  | 2              | 0            |   |
|             | 0             | 1              | 2             | 3  | 4              | 5            | 6 |

| Poly | < <i>start</i> , <i>finish</i> > |
|------|----------------------------------|
| A    | < 0, 1 >                         |
| B    | < 2, 5 >                         |

- storage requirements:  $start, finish, 2 * (finish - start + 1)$ 
  - ▶ non-sparse: twice as much as Representation I  
when all the items are nonzero

```

void padd(int startA,int finishA,int startB,int finishB,int *startD,int *finishD)
{
 float coefficient;
 *startD = avail;
 while (startA <= finishA && startB <= finishB)
 switch(COMPARE(terms[startA].expon, terms[startB].expon)) {
 case -1: attach(terms[startB].coef, terms[startB].expon);
 startB++;
 break;
 case 0: coefficient = terms[startA].coef + terms[startB].coef;
 if (coefficient)
 attach(coefficient, terms[startA].expon);
 startA++;
 startB++;
 break;
 case 1: attach(terms[startA].coef, terms[startA].expon);
 startA++;
 break;
 }
 for(; startA <= finishA; startA++)
 attach(terms[startA].coef,terms[startA].expon);
 for(; startB <= finishB; startB++)
 attach(terms[startB].coef,terms[startB].expon);
 *finishD = avail - 1;
}

```

Analysis:

$O(n + m)$  where  
 $n$  ( $m$ ) is the number of nonzeros in  
 $A$  ( $B$ ).

## Function to Add a New Term

```
void attach(float coefficient, int exponent)
{
 if (avail >= MAX_TERMS) {
 fprintf(stderr, "Too many terms in the polynomial \n");
 exit(1);
 }
 terms[avail].coef = coefficient;
 terms[avail++].expon = exponent;
}
```

**Problem:** Compaction is required when polynomials that are no longer needed.

# Sparse Matrices

---

# Matrices

- A matrix contains  $m$  rows and  $n$  columns of elements, we write  $m \times n$  to designate a matrix with  $m$  rows and  $n$  columns.

$$\begin{array}{c} r_0 \\ r_1 \\ r_2 \\ r_3 \\ r_4 \end{array} \begin{bmatrix} c_0 & c_1 & c_2 \\ -27 & 3 & 4 \\ 6 & 82 & -2 \\ 109 & -64 & 11 \\ 12 & 8 & 9 \\ 48 & 27 & 47 \end{bmatrix} 5 \times 3$$

$$\begin{array}{c} r_0 \\ r_1 \\ r_2 \\ r_3 \\ r_4 \\ r_5 \end{array} \begin{bmatrix} c_0 & c_1 & c_2 & c_3 & c_4 & c_5 \\ 15 & 0 & 0 & 22 & 0 & -15 \\ 0 & 11 & 3 & 0 & 0 & 0 \\ 0 & 0 & 0 & -6 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 \\ 91 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 28 & 0 & 0 & 0 \end{bmatrix} 6 \times 6$$

- The standard representation of a matrix is a two dimensional array defined as `a[MAX_ROWS][MAX_COLS]`.  
➡ We can locate quickly any element by writing `a[i][j]`

# Sparse Matrix

- Sparse matrix wastes space
  - We must consider alternate forms of representation.
  - Our representation of sparse matrices should store only nonzero elements.
  - Each element is characterized by  $\langle \text{row}, \text{col}, \text{value} \rangle$ .

```
#define MAX_TERMS 101
typedef struct term {
 int col;
 int row;
 int value;
} term;
term a[MAX_TERMS];
```

# ADT Sparse\_Matrix

A minimal set of operations includes matrix creation, addition, multiplication, and transpose.

**structure** *Sparse\_Matrix*

**objects:** a set of triples,  $\langle \text{row}, \text{column}, \text{value} \rangle$ , where *row* and *column* are integers and form a unique combination, and *value* comes from the set item.

**functions:** for all  $a, b \in \text{Sparse\_Matrix}$ ,  $x \in \text{item}$ ,  $i, j, \text{max\_col}, \text{max\_row} \in \text{index}$

*Sparse\_Matrix* Create(*max\_row*, *max\_col*) ::= **return** a sparse matrix that can hold up to  $\text{max\_items} = \text{max\_row} \times \text{max\_col}$  and whose maximum row size is *max\_row* and whose maximum column size is *max\_col*.

*Sparse\_Matrix* Transpose(*a*) ::= **return** the matrix produced by interchanging the row and column value of every triple.

*Sparse\_Matrix* Add(*a*, *b*) ::= **if** the dimensions of *a* and *b* are the same **return** the matrix produced by adding corresponding items, namely those with identical *row* and *column* values **else return** error

*Sparse\_Matrix* Multiply(*a*, *b*) ::= **if** number of columns in *a* equals number of rows in *b* **return** the matrix *d* produced by multiplying *a* and *b* according to the formula  $d[i][j] = \sum (a[i][k] \cdot b[k][j])$  **else return** error

# Transpose

|             | <i>row</i> | <i>col</i> | <i>value</i> |
|-------------|------------|------------|--------------|
| <b>a[0]</b> | 6          | 6          | 8            |
| [1]         | 0          | 0          | 15           |
| [2]         | 0          | 3          | 22           |
| [3]         | 0          | 5          | -15          |
| [4]         | 1          | 1          | 11           |
| [5]         | 1          | 2          | 3            |
| [6]         | 2          | 3          | -6           |
| [7]         | 4          | 0          | 91           |
| [8]         | 5          | 2          | 28           |

- for each **row**  $i$ 
  - take element  $\langle i, j, value \rangle$  and store it as element  $\langle j, i, value \rangle$  of the transpose.
- Difficulty: where to place  $\langle j, i, value \rangle$ ?
- for all elements in **column**  $j$ ,
  - place element  $\langle i, j, value \rangle$  in element  $\langle j, i, value \rangle$



# Transpose

|             | row | col | value |
|-------------|-----|-----|-------|
| <b>a[0]</b> | 6   | 6   | 8     |
| [1]         | 0   | 0   | 15    |
| [2]         | 0   | 3   | 22    |
| [3]         | 0   | 5   | -15   |
| [4]         | 1   | 1   | 11    |
| [5]         | 1   | 2   | 3     |
| [6]         | 2   | 3   | -6    |
| [7]         | 4   | 0   | 91    |
| [8]         | 5   | 2   | 28    |

TRANSPOSE

|      | row | col | value |
|------|-----|-----|-------|
| b[0] | 6   | 6   | 8     |
| [1]  | 0   | 0   | 15    |
| [2]  | 0   | 4   | 91    |
| [3]  | 1   | 1   | 11    |
| [4]  | 2   | 1   | 3     |
| [5]  | 2   | 5   | 28    |
| [6]  | 3   | 0   | 22    |
| [7]  | 3   | 2   | -6    |
| [8]  | 5   | 0   | -15   |

- for each **row**  $i$   
take element  $\langle i, j, value \rangle$  and store it  
as element  $\langle j, i, value \rangle$  of the transpose.
- Difficulty: where to place  $\langle j, i, value \rangle$ ?
- for all elements in **column**  $j$ ,  
place element  $\langle i, j, value \rangle$  in element  $\langle j, i, value \rangle$

# Transpose a Matrix

```
void transpose (term a[], term b[])
{
 int n,i,j,currentb;
 n = a[0].value;
 b[0].row = a[0].col;
 b[0].col = a[0].row;
 b[0].value = n;
 if (n > 0)
 currentb = 1;
 for (i = 0; i < a[0].col; i++)
 for (j = 1; j<= n; j++)
 if (a[j].col == i) {
 b[currentb].row = a[j].col;
 b[currentb].col = a[j].row;
 b[currentb].value = a[j].value;
 currentb++;
 }
}
```

# Transpose a Matrix

```
void transpose (term a[], term b[])
{
 int n,i,j,currentb;
 n = a[0].value;
 b[0].row = a[0].col;
 b[0].col = a[0].row;
 b[0].value = n;
 if (n > 0)
 currentb = 1;
 for (i = 0; i < a[0].col; i++)
 for (j = 1; j <= n; j++)
 if (a[j].col == i) {
 b[currentb].row = a[j].col;
 b[currentb].col = a[j].row;
 b[currentb].value = a[j].value;
 currentb++;
 }
}
```

Scan the array "columns" times.  
The array has "elements" elements.

►  $O(\text{columns} * \text{elements})$

## $O(\text{columns} * \text{elements})$ vs. $O(\text{columns} * \text{rows})$

- The complexity  $O(\text{columns} * \text{elements})$

If the matrix is **not** sparse,  $\text{elements} \rightarrow \text{columns} * \text{rows}$

Then  $O(\text{columns} * \text{elements}) = O(\text{columns} * \text{columns} * \text{rows})$ .

It spends too much time to reduce the storage .

- Consider the 2-D array representation

```
for (j=0; j<columns; j++)
 for (i=0; i<rows; i++) ➡ $O(\text{columns} * \text{rows})$
 b[j][i] = a[i][j];
```

- Problem of **transpose**: Scan the array "columns" times.
  - ➡ Determine the number of elements in each column of the original matrix.
  - ➡ the starting positions of each row in the transpose matrix

```

void fastTranspose(term a[], term b[])
{
 int rowTerms[MAX_COL], startingPos[MAX_COL];
 int i, j, numCols = a[0].col, numTerms = a[0].value;
 b[0].row = numCols;
 b[0].col = a[0].row;
 b[0].value = numTerms;
 if (numTerms > 0){
 for (i = 0; i < numCols; i++)
 rowTerms[i] = 0;
 for (i = 1; i <= numTerms; i++)
 rowTerm[a[i].col]++;
 startingPos[0] = 1;
 for (i = 1; i < numCols; i++)
 startingPos[i] = startingPos[i-1] + rowTerms[i-1];
 for (i = 1; i <= numTerms; i++) {
 j = startingPos[a[i].col]++;
 b[j].row = a[i].col;
 b[j].col = a[i].row;
 b[j].value = a[i].value;
 }
 }
}

```

# $O(\text{columns} * \text{rows})$ vs. $O(\text{columns} + \text{elements})$

|                      | [0]      | [1]      | [2] | [3] | [4] | [5] |
|----------------------|----------|----------|-----|-----|-----|-----|
| <i>rowTerms</i> =    | <u>2</u> | 1        | 2   | 2   | 0   | 1   |
| <i>startingPos</i> = | <u>1</u> | <u>3</u> | 4   | 6   | 8   | 8   |

|              | <i>row</i> | <i>col</i> | <i>value</i> |
|--------------|------------|------------|--------------|
| <i>a</i> [0] | 6          | 6          | 8            |
| [1]          | 0          | 0          | 15           |
| [2]          | 0          | 3          | 22           |
| [3]          | 0          | 5          | -15          |
| [4]          | 1          | 1          | 11           |
| [5]          | 1          | 2          | 3            |
| [6]          | 2          | 3          | -6           |
| [7]          | 4          | 0          | 91           |
| [8]          | 5          | 2          | 28           |

- Compared with 2-D array representation  $O(\text{columns} * \text{rows})$
- $O(\text{columns} + \text{elements}) = O(\text{columns} + \text{columns} * \text{rows})$   
 $= O(\text{columns} * \text{rows})$
- Cost: Additional *rowTerms* and *startingPos* arrays are required.

# Matrix Multiplication

- Definition: Given  $A$  and  $B$  where  $A_{m \times n}$  and  $B_{n \times p}$ , the product matrix  $D$  has dimension  $m \times p$ . Its  $\langle i, j \rangle$  element is

$$d_{ij} = \sum_{k=0}^{n-1} a_{ik} b_{kj} \text{ for } 0 \leq i < m \text{ and } 0 \leq j < p.$$

- Example

$$\begin{bmatrix} 1 & 0 & 0 \\ 1 & 0 & 0 \\ 1 & 0 & 0 \end{bmatrix} \begin{bmatrix} 1 & 1 & 1 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix} = \begin{bmatrix} 1 & 1 & 1 \\ 1 & 1 & 1 \\ 1 & 1 & 1 \end{bmatrix}$$

# Sparse Matrix Multiplication

- If the triples of matrices are ordered by row and within rows by columns

**Step 1:** Pick row  $i$  of  $A$

**Step 2:** Find all elements in column  $j$  of  $B$  (by scanning)

- Avoiding to scan all of  $B$  for all elements in  $j$

👉 Compute  $B^T$  **OR**

👉 Put all column elements in consecutive order.

$$A = \begin{bmatrix} 1 & 0 & 2 \\ -1 & 4 & 6 \end{bmatrix} \quad B = \begin{bmatrix} 3 & 0 & 2 \\ -1 & 0 & 0 \\ 0 & 0 & 5 \end{bmatrix} \quad B^T = \begin{bmatrix} 3 & -1 & 0 \\ 0 & 0 & 0 \\ 2 & 0 & 5 \end{bmatrix}$$



# Sparse Matrix Multiplication

- If the triples of matrices are ordered by row and within rows by columns

**Step 1:** Pick row  $i$  of  $A$

**Step 2:** Find all elements in column  $j$  of  $B$  (by scanning)

- Avoiding to scan all of  $B$  for all elements in  $j$

☞ Compute  $B^T$  OR

☞ Put all column elements in consecutive order.

$$A = \begin{bmatrix} 1 & 0 & 2 \\ -1 & 4 & 6 \end{bmatrix} \quad B = \begin{bmatrix} 3 & 0 & 2 \\ -1 & 0 & 0 \\ 0 & 0 & 5 \end{bmatrix} \quad B^T = \begin{bmatrix} 3 & -1 & 0 \\ 0 & 0 & 0 \\ 2 & 0 & 5 \end{bmatrix}$$

| $B$  |   |   |    |
|------|---|---|----|
| b[0] | 3 | 3 | 4  |
| b[1] | 0 | 0 | 3  |
| b[2] | 0 | 2 | 2  |
| b[3] | 1 | 0 | -1 |
| b[4] | 2 | 2 | 5  |

| $B^T$ |   |   |    |
|-------|---|---|----|
| b[0]  | 3 | 3 | 4  |
| b'[1] | 0 | 0 | 3  |
| b'[2] | 0 | 1 | -1 |
| b'[3] | 2 | 0 | 2  |
| b'[4] | 2 | 2 | 5  |

```

void mmult(term a[], term b[], term d[])
.....
 fastTranspose(b,newB);
 a[totalA+1].row = rowsA;
 newB[totalB+1].row = colsB;
 newB[totalB+1].col = 0;
 for (i = 1; i <= totalA;) {
 column = newB[1].row;
 for (j = 1; j <= totalB+1;) {
 if (a[i].row != row) {
 storeSum(d,&totalD,row,column,&sum);
 i = rowBegin;
 for (;newB[j].row == column; j++)
 ;
 column = newB[j].row;
 };
 else if (newB[j].row != column) {
 storeSum(d,&totalD,row,column,&sum);
 i = rowBegin;
 column = newB[j].row;
 }
 else switch (COMPARE(a[i].col, newB[j].col)) {
 case -1:
 i++; break;
 case 0:
 sum += (a[i++].value * newB[j++].value);
 break;
 case 1:
 j++;
 }
 }
 i++;
 }

}

```

```
void mmult(term a[], term b[], term d[])
.....
```

```
 fastTranspose(b,newB);
 a[totalA+1].row = rowsA;
 newB[totalB+1].row = colsB;
 newB[totalB+1].col = 0;
 for (i = 1; i <= totalA;) {
 column = newB[1].row;
 for (j = 1; j <= totalB+1;) {
 if (a[i].row != row) {
 storeSum(d,&totalD,row,column,&sum);
 i = rowBegin;
 for (;newB[j].row == column; j++)
 ;
 column = newB[j].row;
 };
 else if (newB[j].row != column) {
 storeSum(d,&totalD,row,column,&sum);
 i = rowBegin;
 column = newB[j].row;
 }
 else switch (COMPARE(a[i].col, newB[j].col)) {
 case -1:
 i++; break;
 case 0:
 sum += (a[i++].value * newB[j++].value);
 break;
 case 1:
 j++;
 }
 }
 }

}
```

$$O(\sum_{rows} (colsB \cdot termsRow + totalB))$$

$$= O(colsB \cdot totalA + rowsA \cdot totalB)$$

# Matrix Multiplication Using Arrays

```
for (i =0; i < rowsA; i++){
 for(j=0; j < colsB; j++) {
 sum =0;
 for(k=0; k < colsA; k++){
 sum += (a[i][k] *b[k][j]);
 d[i][j] =sum;
 }
 }
}
```

➡  $O(\text{rowsA} \cdot \text{colsA} \cdot \text{colsB})$

- If  $\text{totalA} = \text{colsA} \cdot \text{rowsA}$  and  $\text{totalB} = \text{colsB} \cdot \text{rowsB}$   
⇒ **mmult** is slower
- If  $\text{totalA} \ll \text{colsA} \cdot \text{rowsA}$  and  $\text{totalB} \ll \text{colsB} \cdot \text{rowsB}$   
⇒ **mmult** is faster

# Representation of Two-Dimensional Arrays

- Represent multidimensional arrays:  
    row major order and column major order  
    👉 Row major order stores multidimensional arrays by rows.
- $A[u_0][u_1]$  as  $u_0$  rows  
    ➡  $row_0, row_1, \dots, row_{u_0-1}$  and  
    each row containing  $u_1$  elements.

Assume that  $\alpha$  is the address of  $A[0][0]$ , denoted by  $@(A[0][0])$

$$\Rightarrow @(A[i][0]) = \alpha + i \cdot u_1 \text{ and } @(A[i][j]) = \alpha + i \cdot u_1 + j$$

|                  |     |        |                            |
|------------------|-----|--------|----------------------------|
| [0][0]           | ... | ...    | [0][ $u_1 - 1$ ]           |
| [1][0]           | ... | ...    | [1][ $u_1 - 1$ ]           |
| ...              |     | [i][j] | ...                        |
| ...              |     |        | ...                        |
| [ $u_0 - 1$ ][0] | ... | ...    | [ $u_0 - 1$ ][ $u_1 - 1$ ] |

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|                  |        |     |                            |
|------------------|--------|-----|----------------------------|
| [0][0]           | ...    | ... | [0][ $u_1 - 1$ ]           |
| [1][0]           | ...    | ... | [1][ $u_1 - 1$ ]           |
| ...              | [i][j] | ... | ...                        |
| ...              |        |     | ...                        |
| [ $u_0 - 1$ ][0] | ...    | ... | [ $u_0 - 1$ ][ $u_1 - 1$ ] |

row<sub>0</sub>

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$$\Rightarrow @(A[i][0]) = \alpha + i \cdot u_1 \text{ and } @(A[i][j]) = \alpha + i \cdot u_1 + j$$

|                |          |     |                      |
|----------------|----------|-----|----------------------|
| $[0][0]$       | ...      | ... | $[0][u_1 - 1]$       |
| $[1][0]$       | ...      | ... | $[1][u_1 - 1]$       |
| ...            | $[i][j]$ | ... | ...                  |
| ...            |          |     | ...                  |
| $[u_0 - 1][0]$ | ...      | ... | $[u_0 - 1][u_1 - 1]$ |

|                  |                  |
|------------------|------------------|
| row <sub>0</sub> | row <sub>1</sub> |
|------------------|------------------|

# Representation of Two-Dimensional Arrays

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$$\Rightarrow @(A[i][0]) = \alpha + i \cdot u_1 \text{ and } @(A[i][j]) = \alpha + i \cdot u_1 + j$$

|                  |     |        |                            |
|------------------|-----|--------|----------------------------|
| [0][0]           | ... | ...    | [0][ $u_1 - 1$ ]           |
| [1][0]           | ... | ...    | [1][ $u_1 - 1$ ]           |
| ...              |     | [i][j] | ...                        |
| ...              |     |        | ...                        |
| [ $u_0 - 1$ ][0] | ... | ...    | [ $u_0 - 1$ ][ $u_1 - 1$ ] |

|                  |                  |                  |     |                                     |
|------------------|------------------|------------------|-----|-------------------------------------|
| row <sub>0</sub> | row <sub>1</sub> | row <sub>2</sub> | ... | row <sub><math>u_0 - 1</math></sub> |
|------------------|------------------|------------------|-----|-------------------------------------|



# Representation of Multidimensional Arrays

$\alpha$ : addr of the first element

- $A[u_0][u_1][u_2] \Rightarrow u_0 (u_1 \times u_2)$  arrays.

$\Rightarrow @ (A[i][0][0]) = \alpha + i \cdot u_1 \cdot u_2$  and

$$\begin{aligned} @ (A[i][j][k]) = \alpha &+ i \cdot u_1 \cdot u_2 \\ &+ j \cdot u_2 \\ &+ k \end{aligned}$$

# Representation of Multidimensional Arrays

$\alpha$ : addr of the first element

- $A[u_0][u_1][u_2] \Rightarrow u_0$  ( $u_1 \times u_2$ ) arrays.

$\Rightarrow @ (A[i][0][0]) = \alpha + i \cdot u_1 \cdot u_2$  and

$$\begin{aligned} @ (A[i][j][k]) = \alpha &+ i \cdot u_1 \cdot u_2 \\ &+ j \cdot u_2 \\ &+ k \end{aligned}$$

- $A[u_0][u_1] \cdots [u_{n-1}]$

$\Rightarrow @ (A[i_0][0] \cdots [0]) = \alpha + i_0 \cdot u_1 \cdots u_{n-1}$  and

$$\begin{aligned} @ (A[i_0][i_1] \cdots [i_{n-1}]) = \alpha &+ i_0 \cdot u_1 \cdots u_{n-1} \\ &+ i_1 \cdot u_2 \cdots u_{n-1} \\ &+ \cdots \cdots \\ &+ i_{n-2} \cdot u_{n-1} \\ &+ i_{n-1} \end{aligned}$$