

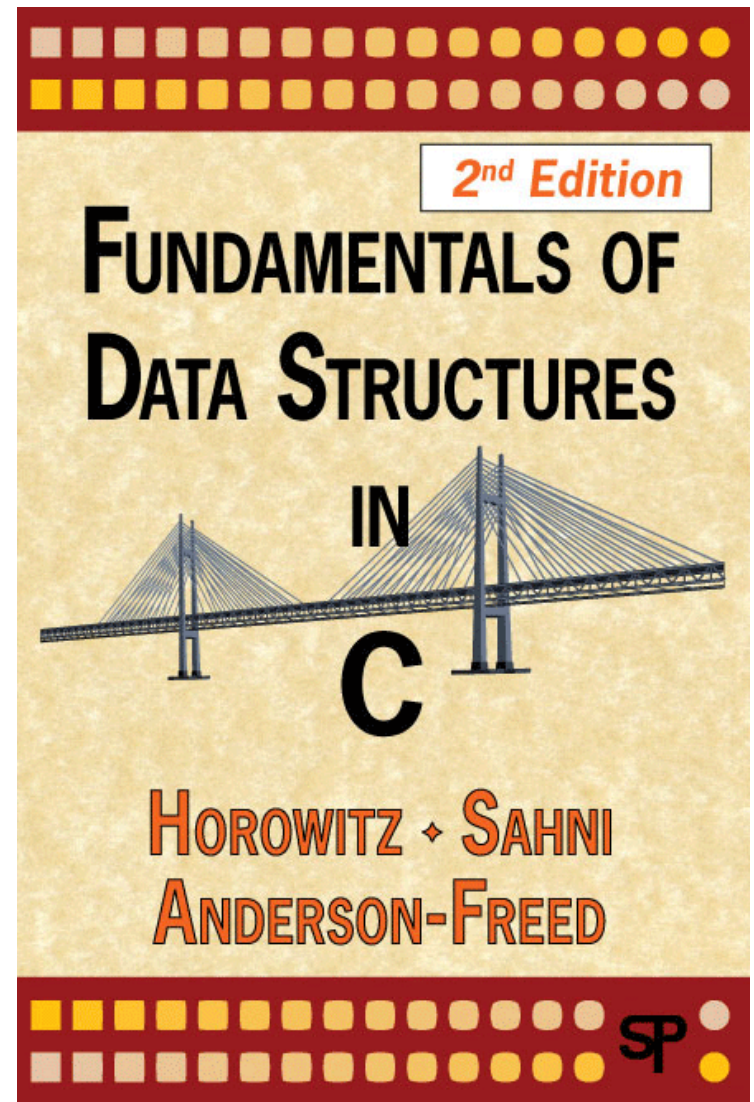


# Data Structures

# Books

Fundamentals of Data Structures in C, 2nd Edition.

(開發圖書，(02) 8242-3988)





# Administration

## Instructor:

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- (Monday)14:00~16:00;

## Grade:

- Quiz 20%
- Computer-based Test 20%
- Homework 20%
- Midterm Exam 25%
- Final Exam 25%



# Introductory

- Raise your hand is always welcome!
- No phone, walk, sleep, and late during the lecture time.
- Data structure is not the fundamental course for programming.
- Slides are not enough. To master the materials, page-by-page reading is necessary.



# Outline

- Basic Concept
- Arrays and Structures
- Stacks and Queues
- Lists
- Trees
- Graphs
- Sorting
- Hashing



## CHAPTER 1

# BASIC CONCEPT

All the programs in this file are selected from

Ellis Horowitz, Sartaj Sahni, and Susan Anderson-Freed  
“Fundamentals of Data Structures in C”,



# Algorithm

## ■ Definition

An *algorithm* is a finite set of instructions that accomplishes a particular task.

## ■ Criteria

- input
- output
- definiteness: clear and unambiguous
- finiteness: terminate after a finite number of steps
- effectiveness: instruction is basic enough to be carried out



# Data Type

- Data Type

A **data type** is a collection of *objects* and a set of *operations* that act on those objects.

- Abstract Data Type (ADT)

An **ADT** is a data type that is organized in such a way that **the specification of the objects and the operations on the objects** is separated from

- the representation of the objects .
- the implementation of the operations.





# Specification vs. Implementation

- Operation specification
  - function name
  - the types of arguments
  - the type of the results
- Implementation independent

## \*Structure 1.1: Abstract data type *Natural\_Number*

structure *Natural\_Number* is

**objects:** an ordered subrange of the integers starting at zero and ending at the maximum integer (*INT\_MAX*) on the computer

**functions:**

for all  $x, y \in \text{Nat\_Number}$ ;  $\text{TRUE}, \text{FALSE} \in \text{Boolean}$   
and where  $+$ ,  $-$ ,  $<$ , and  $==$  are the usual integer operations.

*Nat\_Num* Zero ( ) ::= 0

*Boolean* Is\_Zero(x) ::= if (x) return *FALSE*  
else return *TRUE*

*Nat\_Num* Add(x, y) ::= if ((x+y) <= *INT\_MAX*) return x+y  
else return *INT\_MAX*

*Boolean* Equal(x,y) ::= if (x== y) return *TRUE*  
else return *FALSE*

*Nat\_Num* Successor(x) ::= if (x == *INT\_MAX*) return x  
else return x+1

*Nat\_Num* Subtract(x,y) ::= if (x<y) return 0  
else return x-y

end *Natural\_Number*



# Measurements

- Criteria
  - Is it correct?
  - Is it readable?
  - ...
- Performance Measurement (machine dependent)
- Performance Analysis (machine independent)
  - space complexity: storage requirement
  - time complexity: computing time

# Space Complexity

$$S(P) = C + S_P(I)$$

## ■ Fixed Space Requirements (C)

Independent of the characteristics of the inputs and outputs

- instruction space
- space for simple variables, fixed-size structured variable, constants

## ■ Variable Space Requirements ( $S_P(I)$ )

depend on the instance characteristic I

- number, size, values of inputs and outputs associated with I
- recursive stack space, formal parameters, local variables, return address

**\*Program 1.10: Simple arithmetic function**

```
float abc(float a, float b, float c)
{
    return a + b + b * c + (a + b - c) / (a + b) + 4.00;
}
```

This function has only fixed space requirements  $S_{abc}(I) = 0$

---

**\*Program 1.11: Iterative function for summing a list of numbers**

```
float sum(float list[ ], int n)
{
    float tempsum = 0;
    int i;
    for (i = 0; i < n; i++)
        tempsum += list [i];
    return tempsum;
}
```

$$S_{sum}(I) = 0$$

Recall: pass the address of the first element of the array & pass by value

**\*Program 1.12: Recursive function** for summing a list of numbers

```
float rsum(float list[ ], int n)
{
    if (n) return rsum(list, n-1) + list[n-1];
    return 0;
}
```

$$S_{\text{sum}}(I) = S_{\text{sum}}(n) = 12n$$

**Assumptions:**

**\*Figure 1.1:** Space needed for one recursive call of Program 1.12

| Type                             | Name     | Number of bytes          |
|----------------------------------|----------|--------------------------|
| parameter: array pointer         | list [ ] | 4                        |
| parameter: integer               | n        | 4                        |
| return address:(used internally) |          | 4 (unless a far address) |
| TOTAL per recursive call         |          | 12                       |

# Time Complexity

$$T(P) = C + T_P(I)$$

- C: Compile time  
independent of instance characteristics

- $T_P$ : Run (execution) time

- Definition  $T_P(n) = c_a ADD(n) + c_s SUB(n) + c_l LDA(n) + c_{st} STA(n)$

A *program step* is a syntactically or semantically meaningful program segment whose execution time is independent of the instance characteristics.

- Example

- $abc = a + b + b * c + (a + b - c) / (a + b) + 4.0$

- $abc = a + b + c$

Regard as the same unit  
machine independent



# Methods to compute the step count

1. Introduce variable count into programs
2. **Tabular** method
  - Determine the total number of steps contributed by each statement  
**step per execution × frequency**
  - add up the contribution of all statements



# Tabular Method

\*Figure 1.2: Step count table for Program 1.11

Iterative function to sum a list of numbers  
steps/execution

| Statement                       | s/e | Frequency | Total steps |
|---------------------------------|-----|-----------|-------------|
| float sum(float list[ ], int n) | 0   | 0         | 0           |
| {                               | 0   | 0         | 0           |
| float tempsum = 0;              | 1   | 1         | 1           |
| int i;                          | 0   | 0         | 0           |
| for(i=0; i <n; i++)             | 1   | n+1       | n+1         |
| tempsum += list[i];             | 1   | n         | n           |
| return tempsum;                 | 1   | 1         | 1           |
| }                               | 0   | 0         | 0           |
| Total                           |     |           | 2n+3        |

# Iterative summing of a list of numbers

\*Program 1.13: Program 1.11 with **count statements**

```
float sum(float list[ ], int n)
{
    float tempsum = 0; count++; /* for assignment */
    int i;
    for (i = 0; i < n; i++) {
        count++;          /*for the for loop */
        tempsum += list[i]; count++; /* for assignment */
    }
    count++;          /* last execution of for */
    count++;          /* for return */
    return tempsum;
}
```

$2n + 3$  steps

# Program 1.13

initial

$n = 3,$     $count = 0$

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

count = 1



# Program 1.13

initial

$n = 3, \quad \text{count} = 0$

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

$i = 0, \text{count} = 2$



# Program 1.13

initial

$n = 3$ ,  $count = 0$

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

$count = 3$

# Program 1.13

initial

$n = 3, \quad \text{count} = 0$

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

$i = 1, \text{count} = 4$

# Program 1.13

initial

$n = 3,$     $count = 0$

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

$count = 5$



# Program 1.13

initial

$n = 3$ ,  $count = 0$

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

$i = 2$ ,  $count = 6$





# Program 1.13

initial

$n = 3,$     $count = 0$

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

$count = 7$

# Program 1.13

initial

$n = 3, \quad \text{count} = 0$

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

$i = 3, \text{count} = 8$

# Program 1.13

initial

n = 3, count = 0

```
float sum(float list[], int n) {  
    float tempsum = 0;  
    int i;  
    for(i = 0; i < n; i++){  
        tempsum += list[i];  
    }  
    return tempsum;  
}
```

count = 9

# Program 1.13

initial

$n = 3, \quad \text{count} = 0$

```
float sum(float list[], int n) {
    float tempsum = 0;
    int i;
    for(i = 0; i < n; i++){
        tempsum += list[i];
    }
    return tempsum;
}
```

1次

$n+1$ 次

$n$ 次

+ 1次

---

$2n+3$ 次



\*Program 1.14: Simplified version of Program 1.13

```
float sum(float list[ ], int n)
{
    float tempsum = 0;
    int i;
    for (i = 0; i < n; i++)
        count += 2;
    count += 3;
    return 0;
}
```

count final value is  
 $2n + 3$

# Recursive summing of a list of numbers

\*Program 1.15: Program 1.12 with count statements added

```
float rsum(float list[ ], int n)
{
    count++;    /*for if conditional */
    if (n) {
        count++; /* for return and rsum invocation */
        return rsum(list, n-1) + list[n-1];
    }
    count++;
    return list[0];
}
```

$2n+2$



# Program 1.15

initial

$n = 3$ ,  $count = 0$

```
float rsum(int list[], int n){  
    if(n){  
        return rsum(list, n-1) + list[n-1];  
    }  
    return list[0];  
}
```

$n=3$ ,  $count = 1$

# Program 1.15

initial

$n = 3$ ,  $count = 0$

```
float rsum(int list[], int n){
    if(n){
        return rsum(list, n-1) + list[n-1];
    }
    return list[0];
}
```

$n=3$ ,  $count = 2$





# Program 1.15

initial

$n = 3$ ,  $\text{count} = 0$

```
float rsum(int list[], int n){  
    if(n){  
        return rsum(list, n-1) + list[n-1];  
    }  
    return list[0];  
}
```

$n=2$ ,  $\text{count} = 3$



# Program 1.15

initial

$n = 3$ ,  $count = 0$

```
float rsum(int list[], int n){  
    if(n){  
        return rsum(list, n-1) + list[n-1];  
    }  
    return list[0];  
}
```

$n=2$ ,  $count = 4$



# Program 1.15

initial  
 $n = 3, \quad \text{count} = 0$

```
float rsum(int list[], int n){  
    if(n){  
        return rsum(list, n-1) + list[n-1];  
    }  
    return list[0];  
}
```

$n=1, \text{count} = 5$



# Program 1.15

initial

$n = 3$ ,  $count = 0$

```
float rsum(int list[], int n){  
    if(n){  
        return rsum(list, n-1) + list[n-1];  
    }  
    return list[0];  
}
```

$n=1$ ,  $count = 6$



# Program 1.15

initial

$n = 3$ ,  $count = 0$

```
float rsum(int list[], int n){  
    if(n){  
        return rsum(list, n-1) + list[n-1];  
    }  
    return list[0];  
}
```

$n=0$ ,  $count = 7$

# Program 1.15

initial

$n = 3$ ,  $count = 0$

```
float rsum(int list[], int n){
    if(n){
        return rsum(list, n-1) + list[n-1];
    }
    return list[0];
}
```

$n=0$ ,  $count = 8$

# Program 1.15

initial  
 $n = 3, \quad \text{count} = 0$

```
float rsum(int list[], int n){
    if(n){
        return rsum(list, n-1) + list[n-1];
    }
    return list[0];
}
```

$n+1$ 次

$n$ 次

+ 1次

---

$2n+2$ 次

# Recursive Function to sum of a list of numbers

**\*Figure 1.3:** Step count table for recursive summing function

| Statement                         | s/e | Frequency | Total steps |
|-----------------------------------|-----|-----------|-------------|
| float rsum(float list[ ], int n)  | 0   | 0         | 0           |
| {                                 | 0   | 0         | 0           |
| if (n)                            | 1   | n+1       | n+1         |
| return rsum(list, n-1)+list[n-1]; | 1   | n         | n           |
| return list[0];                   | 1   | 1         | 1           |
| }                                 | 0   | 0         | 0           |
| Total                             |     |           | 2n+2        |



# Matrix addition

## \*Program 1.16: Matrix addition

```
void add(int a[ ][MAX_SIZE], int b[ ][MAX_SIZE],
         int c[ ][MAX_SIZE], int rows, int cols)
{
    int i, j;
    for (i = 0; i < rows; i++)
        for (j = 0; j < cols; j++)
            c[i][j] = a[i][j] + b[i][j];
}
```

rows \* cols

# Matrix Addition

\*Figure 1.4: Step count table for matrix addition

| Statement                            | s/e | Frequency       | Total steps          |
|--------------------------------------|-----|-----------------|----------------------|
| Void add (int a[ ][MAX_SIZE] · · · ) | 0   | 0               | 0                    |
| {                                    | 0   | 0               | 0                    |
| int i, j;                            | 0   | 0               | 0                    |
| for (i = 0; i < row; i++)            | 1   | rows+1          | rows+1               |
| for (j=0; j< cols; j++)              | 1   | rows · (cols+1) | rows · cols+rows     |
| c[i][j] = a[i][j] + b[i][j];         | 1   | rows · cols     | rows · cols          |
| }                                    | 0   | 0               | 0                    |
| Total                                |     |                 | 2rows · cols+2rows+1 |

## \*Program 1.17: Matrix addition with count statements

```
void add(int a[ ][MAX_SIZE], int b[ ][MAX_SIZE],
        int c[ ][MAX_SIZE], int row, int cols )
{
    int i, j;
    for (i = 0; i < rows; i++){
        count++; /* for i for loop */
        for (j = 0; j < cols; j++) {
            count++; /* for j for loop */
            c[i][j] = a[i][j] + b[i][j];
            count++; /* for assignment statement */
        }
        count++; /* last time of j for loop */
    }
    count++; /* last time of i for loop */
}
```

$2 * \text{rows} * \text{cols} + 2 \text{ rows} + 1$

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

i = 0, count = 1



# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

j = 0, count = 2

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

count = 3

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

j = 1, count = 4



# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

count = 5



# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

j = 2, count = 6

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

count = 7

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

j = 3, count = 8

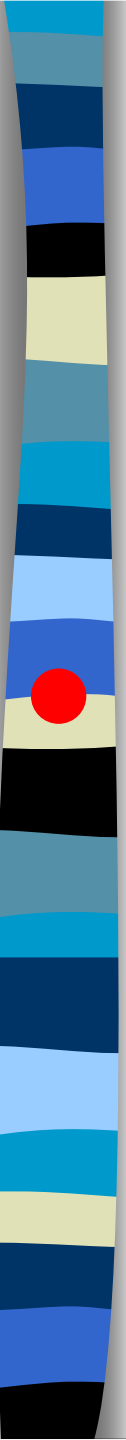
# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

i = 1, count = 9





# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

j = 0, count = 10

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

count = 11

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

j = 1, count = 12

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

count = 13



# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

j = 2, count = 14

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

count = 15

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

j = 3, count = 16

# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++) {
        for(j = 0; j < cols; j++) {
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

*i = 2, count = 17*



# Program 1.17

initial

rows=2, cols=3, count = 0

```
void add(int a[][MAX_SIZE], b[][MAX_SIZE],
         c[][MAX_SIZE], int rows, int cols) {
    int i, j;
    for(i = 0; i < rows; i++){
        for(j = 0; j < cols; j++){
            c[i][j] = a[i][j] + b[i][j];
        }
    }
}
```

rows+1 次

rows\*(cols+1) 次

+ rows\*cols 次

---

2rows\*cols+2rows+1 次

# Exercise 1

## \*Program 1.19: Printing out a matrix

```
void print_matrix(int matrix[ ][MAX_SIZE], int rows, int cols)
{
    int i, j;
    for (i = 0; i < row; i++) {          /* row +1*/
        for (j = 0; j < cols; j++)      /* row * (col +1) */
            printf("%d", matrix[i][j]); /* row * col */
        printf( "\n");                  /* row */
    }
}
```

$2*row*col + 2 row + row + 1$



# Asymptotic Notation

## Definition

- **Big-Oh ( $\mathcal{O}$ )**

$f(n) = \mathcal{O}(g(n))$  iff there exist positive constants  $c$  and  $n_0$  such that  $f(n) \leq cg(n)$ , for all  $n, n \geq n_0$ .

- **Big-Omega ( $\mathcal{\Omega}$ )**

$f(n) = \mathcal{\Omega}(g(n))$  iff there exist positive constants  $c$  and  $n_0$  such that  $f(n) \geq cg(n)$ , for all  $n, n \geq n_0$ .

- **Big-Theta ( $\mathcal{\Theta}$ )**

$f(n) = \mathcal{\Theta}(g(n))$  iff there exist positive constants  $c_1, c_2$  and  $n_0$  such that

# Asymptotic Notation (O)

## ■ Definition

$f(n) = O(g(n))$  iff there exist positive constants  $c$  and  $n_0$  such that  $f(n) \leq cg(n)$  for all  $n$ ,  $n \geq n_0$ .

## ■ Examples

- $3n+2=O(n)$       /\*  $3n+2 \leq 4n$  for  $n \geq 2$  \*/
- $3n+3=O(n)$       /\*  $3n+3 \leq 4n$  for  $n \geq 3$  \*/
- $100n+6=O(n)$     /\*  $100n+6 \leq 101n$  for  $n \geq 6$  \*/
- $10n^2+4n+2=O(n^2)$  /\*  $10n^2+4n+2 \leq 11n^2$  for  $n \geq 5$  \*/
- $6 \cdot 2^n + n^2 = O(2^n)$  /\*  $6 \cdot 2^n + n^2 \leq 7 \cdot 2^n$  for  $n \geq 4$  \*/



# Asymptotic Notation ( $\Theta$ )

## ■ Definition

$f(n) = \Theta(g(n))$  iff there exist positive constants  $c_1, c_2$  and  $n_0$  such that  $c_1g(n) \leq f(n) \leq c_2g(n)$ , for all  $n, n \geq n_0$ .

## ■ Examples

-  $3n + 2 = \Theta(n)$

$3n + 2 \geq 3n$  for all  $n \geq 2$  and  $3n + 2 \leq 4n$  for all  $n \geq 2$ ,

so  $c_1 = 3, c_2 = 4$  and  $n_0 = 2$

-  $10n^2 + 4n + 2 = \Theta(n^2)$

$10n^2 + 4n + 2 \geq 10n^2$  for all  $n \geq 5$  and  $10n^2 + 4n + 2 \leq 11n^2$  for all  $n \geq 5$ ,

so  $c_1 = 10, c_2 = 11$  and  $n_0 = 5$

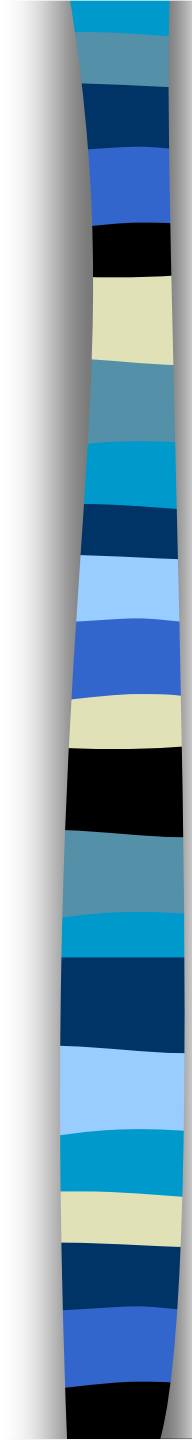
-  $6 * 2^n + n^2 = \Theta(2^n)$

$6 * 2^n + n^2 \geq 6 * 2^n$  for all  $n \geq 4$  and  $6 * 2^n + n^2 \leq 7 * 2^n$  for all  $n \geq 4$ ,

so  $c_1 = 6, c_2 = 7$  and  $n_0 = 4$

# Example

- Complexity of  $c_1n^2+c_2n$  and  $c_3n$ 
  - for sufficiently large of value,  $c_3n$  is faster than  $c_1n^2+c_2n$
  - for small values of  $n$ , either could be faster
    - $c_1=1, c_2=2, c_3=100 \rightarrow c_1n^2+c_2n \leq c_3n$  for  $n \leq 98$
    - $c_1=1, c_2=2, c_3=1000 \rightarrow c_1n^2+c_2n \leq c_3n$  for  $n \leq 998$
  - break even point
    - no matter what the values of  $c_1, c_2$ , and  $c_3$ , the  $n$  beyond which  $c_3n$  is always faster than  $c_1n^2+c_2n$

- 
- $O(1)$ : constant
  - $O(n)$ : linear
  - $O(n^2)$ : quadratic
  - $O(n^3)$ : cubic
  - $O(2^n)$ : exponential
  - $O(\log n)$
  - $O(n \log n)$

## \*Figure 1.7:Function values

|            |             | Instance characteristic $n$ |   |    |       |                |                        |  |
|------------|-------------|-----------------------------|---|----|-------|----------------|------------------------|--|
| Time       | Name        | 1                           | 2 | 4  | 8     | 16             | 32                     |  |
| 1          | Constant    | 1                           | 1 | 1  | 1     | 1              | 1                      |  |
| $\log n$   | Logarithmic | 0                           | 1 | 2  | 3     | 4              | 5                      |  |
| $n$        | Linear      | 1                           | 2 | 4  | 8     | 16             | 32                     |  |
| $n \log n$ | Log linear  | 0                           | 2 | 8  | 24    | 64             | 160                    |  |
| $n^2$      | Quadratic   | 1                           | 4 | 16 | 64    | 256            | 1024                   |  |
| $n^3$      | Cubic       | 1                           | 8 | 64 | 512   | 4096           | 32768                  |  |
| $2^n$      | Exponential | 2                           | 4 | 16 | 256   | 65536          | 4294967296             |  |
| $n!$       | Factorial   | 1                           | 2 | 24 | 40326 | 20922789888000 | $26313 \times 10^{33}$ |  |

**Figure 1.7** Function values

## \*Figure 1.8: Plot of function values

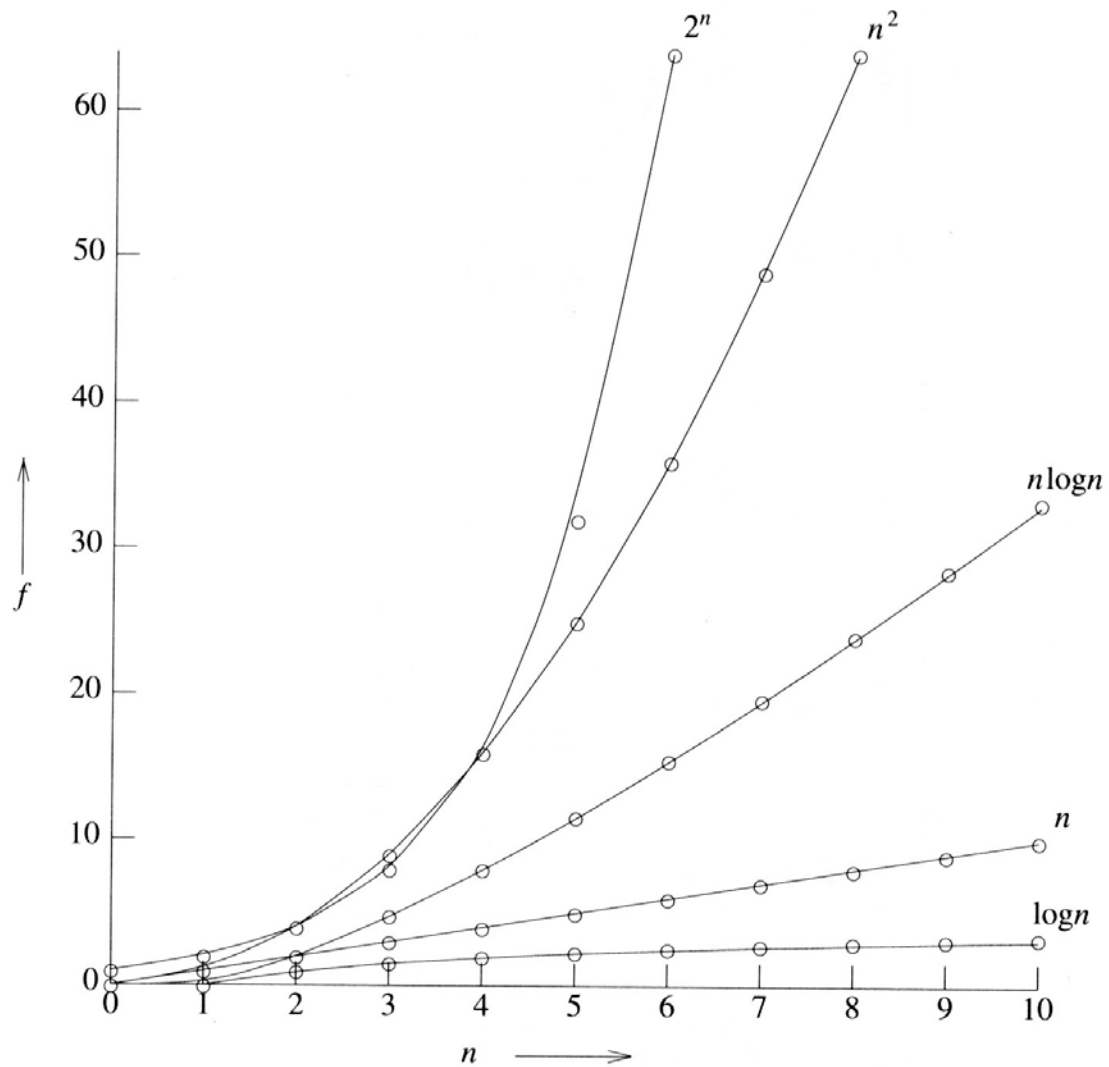


Figure 1.8 Plot of function values

**\*Figure 1.9: Times on a 1 billion instruction per second computer**

| $n$    | $f(n)$      |              |             |             |                     |                        |                       |
|--------|-------------|--------------|-------------|-------------|---------------------|------------------------|-----------------------|
|        | $n$         | $n \log_2 n$ | $n^2$       | $n^3$       | $n^4$               | $n^{10}$               | $2^n$                 |
| 10     | .01 $\mu$ s | .03 $\mu$ s  | .1 $\mu$ s  | 1 $\mu$ s   | 10 $\mu$ s          | 10s                    | 1 $\mu$ s             |
| 20     | .02 $\mu$ s | .09 $\mu$ s  | .4 $\mu$ s  | 8 $\mu$ s   | 160 $\mu$ s         | 2.84h                  | 1ms                   |
| 30     | .03 $\mu$ s | .15 $\mu$ s  | .9 $\mu$ s  | 27 $\mu$ s  | 810 $\mu$ s         | 6.83d                  | 1s                    |
| 40     | .04 $\mu$ s | .21 $\mu$ s  | 1.6 $\mu$ s | 64 $\mu$ s  | 2.56ms              | 121d                   | 18m                   |
| 50     | .05 $\mu$ s | .28 $\mu$ s  | 2.5 $\mu$ s | 125 $\mu$ s | 6.25ms              | 3.1y                   | 13d                   |
| 100    | .10 $\mu$ s | .66 $\mu$ s  | 10 $\mu$ s  | 1ms         | 100ms               | 3171y                  | $4 \cdot 10^{13}$ y   |
| $10^3$ | 1 $\mu$ s   | 9.96 $\mu$ s | 1 ms        | 1s          | 16.67m              | $3.17 \cdot 10^{13}$ y | $32 \cdot 10^{283}$ y |
| $10^4$ | 10 $\mu$ s  | 130 $\mu$ s  | 100 ms      | 16.67m      | 115.7d              | $3.17 \cdot 10^{23}$ y |                       |
| $10^5$ | 100 $\mu$ s | 1.66 ms      | 10s         | 11.57d      | 3171y               | $3.17 \cdot 10^{33}$ y |                       |
| $10^6$ | 1ms         | 19.92ms      | 16.67m      | 31.71y      | $3.17 \cdot 10^7$ y | $3.17 \cdot 10^{43}$ y |                       |