



# Data Structures and Algorithms ( 1 )

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Higher Education Press, 2008.6 (the "Eleventh Five-Year" national planning textbook)

<https://courses.edx.org/courses/PekingX/04830050x/2T2014/>

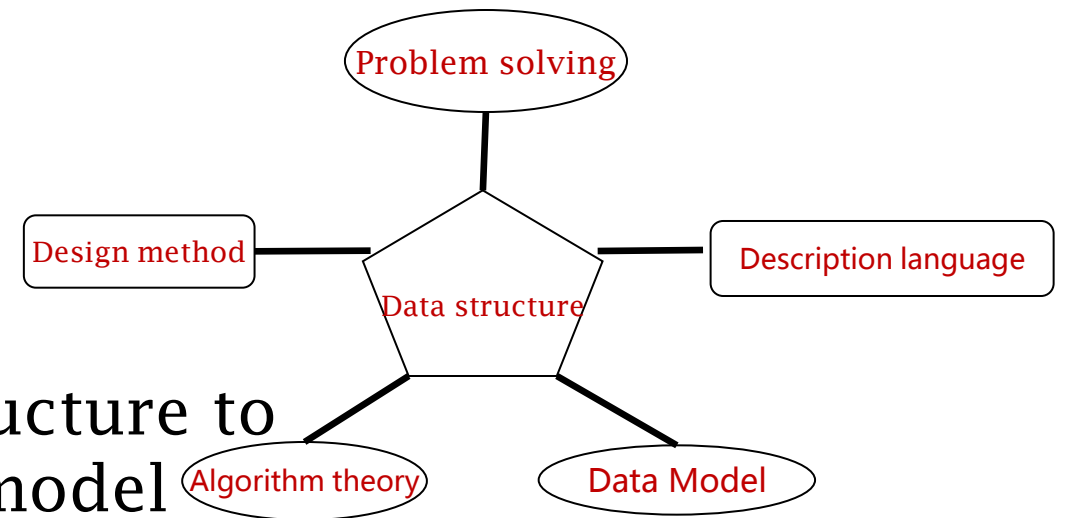


# Chapter 1 Overview

- **Problem solving**
- Data structures and abstract data types
- The properties and categories of algorithms
- Evaluating the efficiency of the algorithms

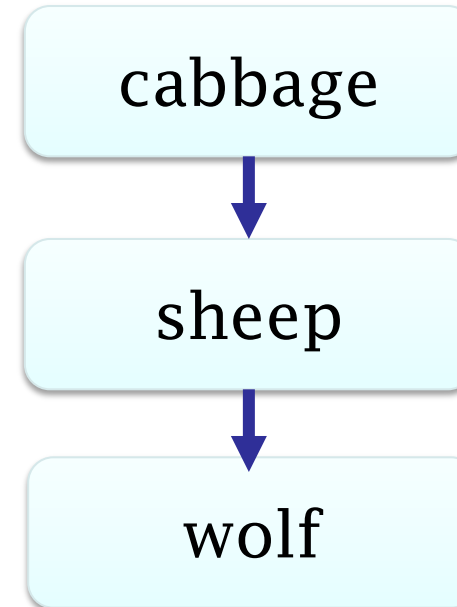
## 1.1 Problem solving

- Goal of writing computer programs ?
  - To solve practical problems
- Problem Abstraction
  - Analyze requirements and build a problem model
- Data Abstraction
  - Determine an appropriate data structure to represent a certain mathematical model
- Algorithm Abstraction
  - Design suitable algorithms for the data model
- Data structures + Algorithms  $\Rightarrow$  Programs
  - Simulate and solve practical problems



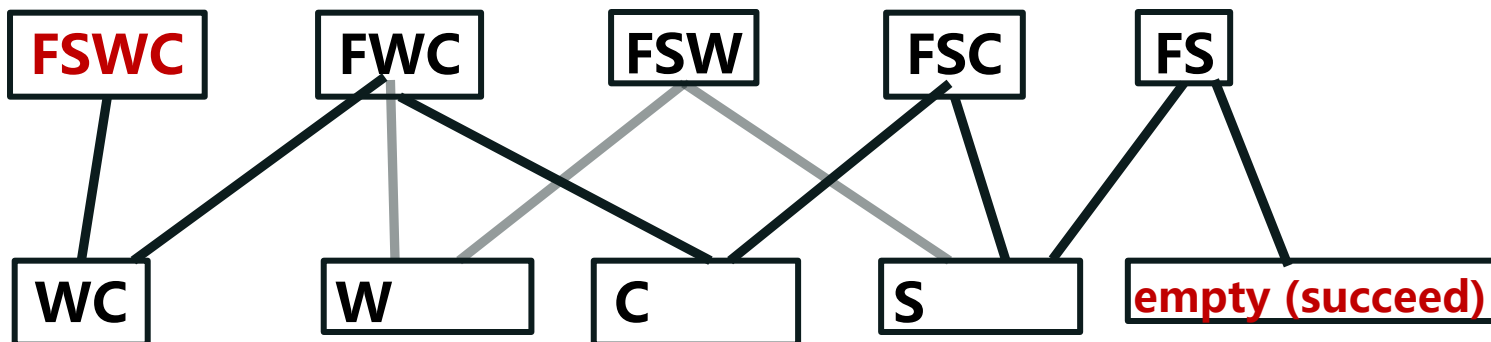
# 1.1 Problem solving

## Farmer Crosses River Puzzle

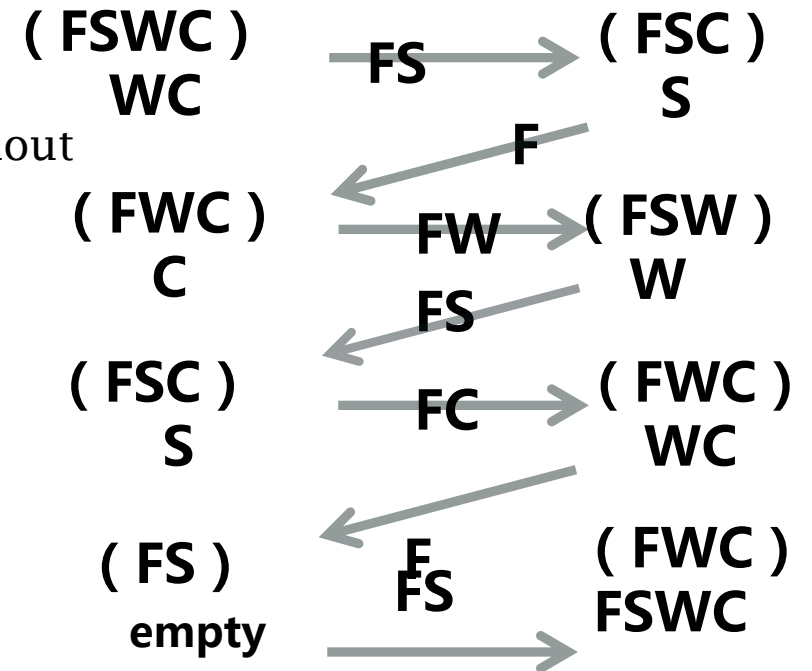


## 1.1 Problem solving

- **Problem abstraction** : FSWC crossing over the river
  - Only the farmer can row the boat
  - There are only two seats on the boat including the farmer
  - “Wolf and sheep”, “sheep and cabbages” can not stay along without the accompany of the farmer
- **Data abstraction** : graph model
  - Unreasonable state : WS、FC、SC、FW、WSC、F
  - The vertex represents the “original bank status”( 10 states, including “empty” )
  - edge : state transition as the result of a reasonable operation (cross over the river)



### Farmer Crosses River Puzzle



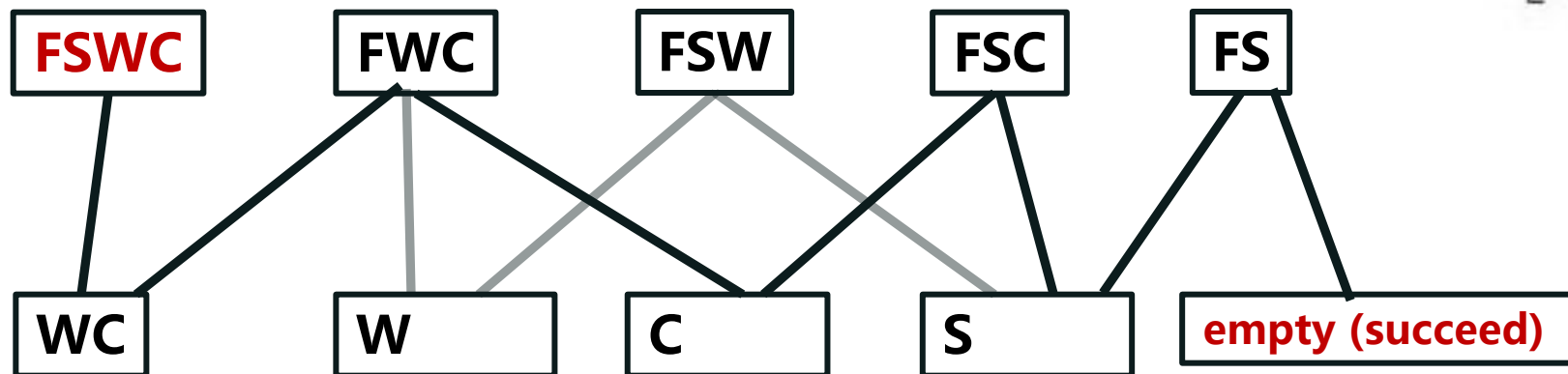
Farmer is abbreviated as F  
 Sheep is abbreviated as S  
 Wolf is abbreviated as W  
 cabbage is abbreviated as C



## 1.1 Problem solving

## Farmer Crosses River Puzzle

- Data structure
  - Adjacency matrix
- Algorithm abstraction :
  - The shortest path

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


Farmer is abbreviated as F  
 Sheep is abbreviated as S  
 Wolf is abbreviated as W  
 cabbage is abbreviated as C



## 1.1 Problem solving

### Questions : process of problem solving

- Farmer Crosses River Puzzle —— The shortest path model
  - Problem abstraction ?
  - Data abstraction?
  - Algorithm abstraction ?
  - You may write programs to achieve it.
- Any other model ?



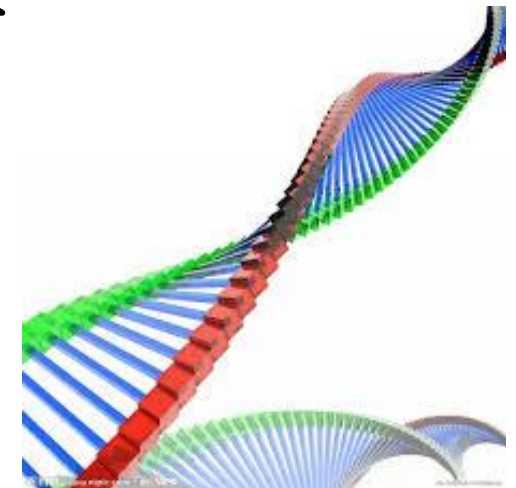
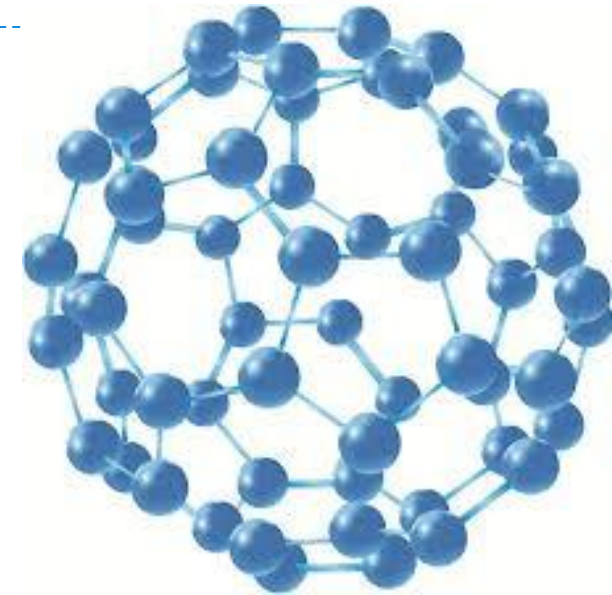
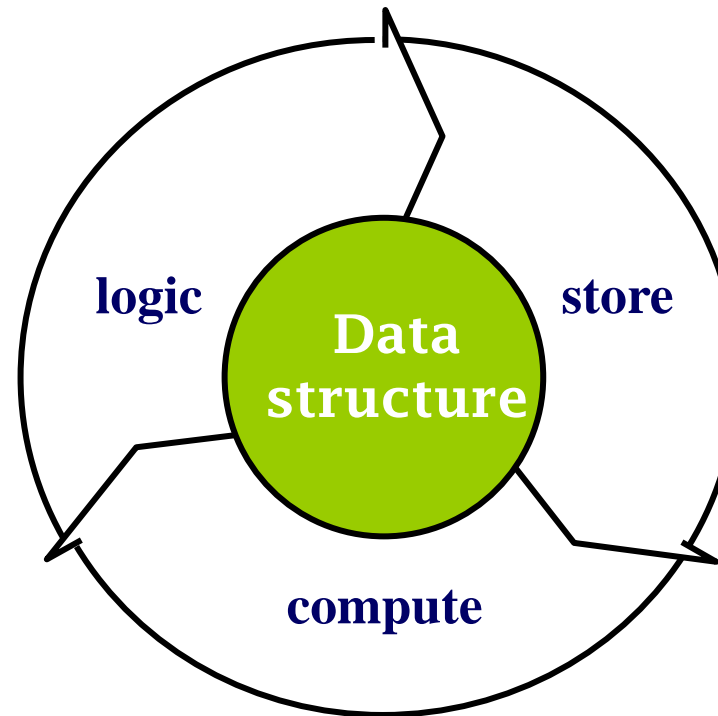
# Chapter 1 Overview

- Problem solving
- **Data structures and abstract data types**
- The properties and categories of algorithms
- Evaluating the efficiency of the algorithms



## 1.2 What is data structure

- **Structure: entity + relation**
- **Data structure :**
  - Data organized according to **logical relationship**
  - Stored in computer according to a certain **storage method**
  - A set of **operations** are defined on these data



## 1.2 What is data structure

### Logical organization of data structure

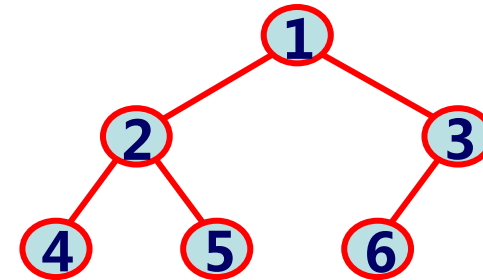
- **Linear Structure**



- Linear lists ( list , stack , queue , string, etc. )

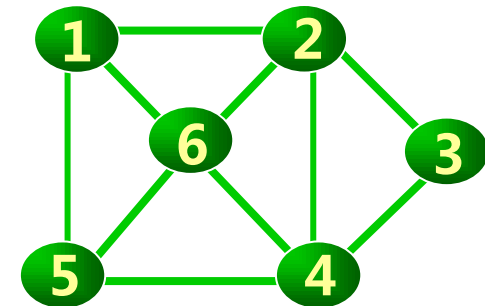
- **Nonlinear Structure**

- Trees ( binary tree , Huffman tree , binary search tree etc )



- Graphs ( directed graph , undirected graph etc )

- **Graph  $\supseteq$  tree  $\supseteq$  binary tree  $\supseteq$  linear list**



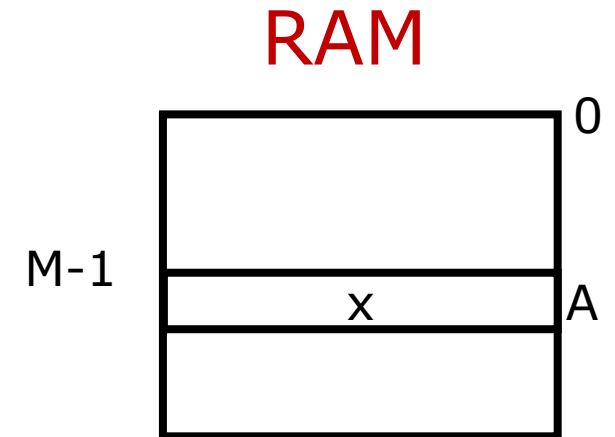
## 1.2 What is data structure

# Storage structure of data

- **Mapping** from logical structure to the physical storage space

### Main memory ( RAM )

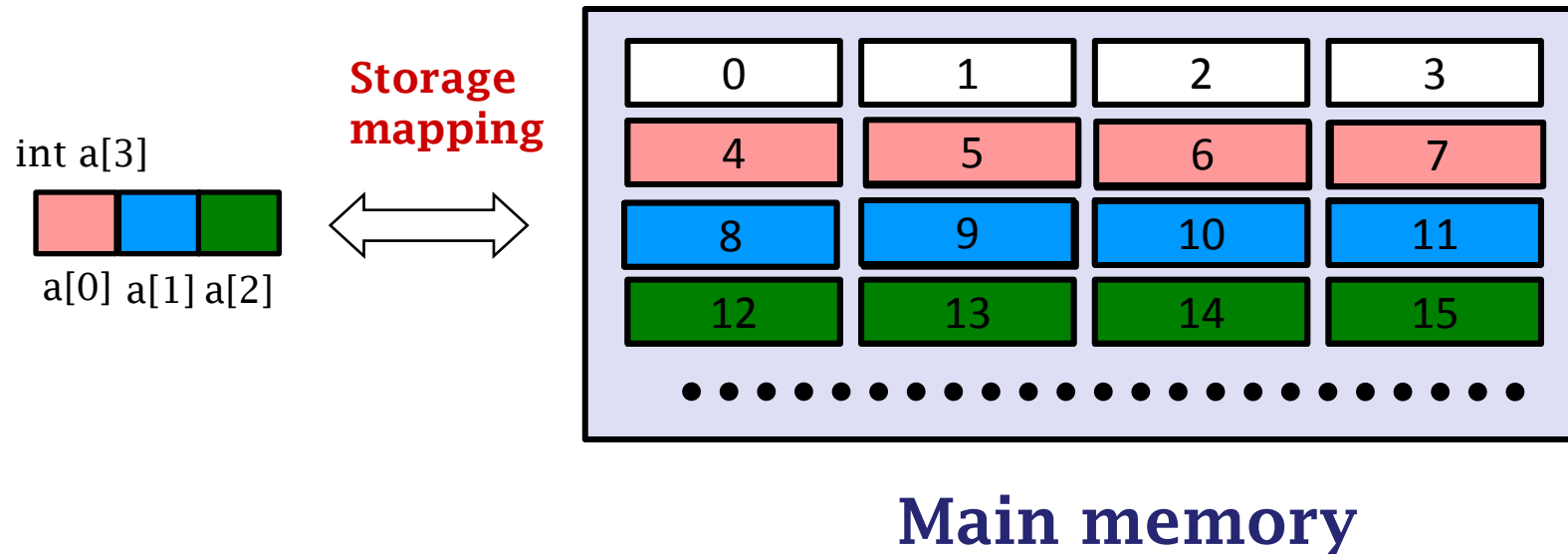
- Coded in non negative integer address , set of **adjacent unit**
- The basic unit is the byte
- The time required to access different addresses are basically the same (random access)



## 1.2 What is data structure

# Storage structure of data

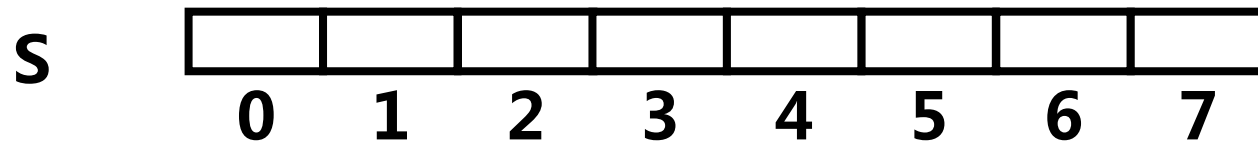
- For logical structure  $(K, r)$ , in which  $r \in \mathbb{R}$ 
  - For the node set  $K$ , establish a mapping from  $K$  to  $M$  memory unit:  $K \rightarrow M$ , for every node  $j \in K$ , it corresponds to a **unique continuous** storage area  $C$  in  $M$



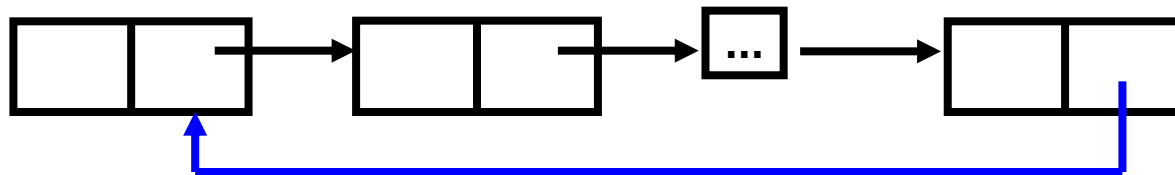
## 1.2 What is data structure

# Storage structure of data

- Relation tuple  $(j_1, j_2) \in r$   
 $(j_1, j_2 \in K \text{ are nodes})$ 
  - Sequence : storage units of data are **adjacent**



- Link: a pointer points to the storage address, referring to a certain connection

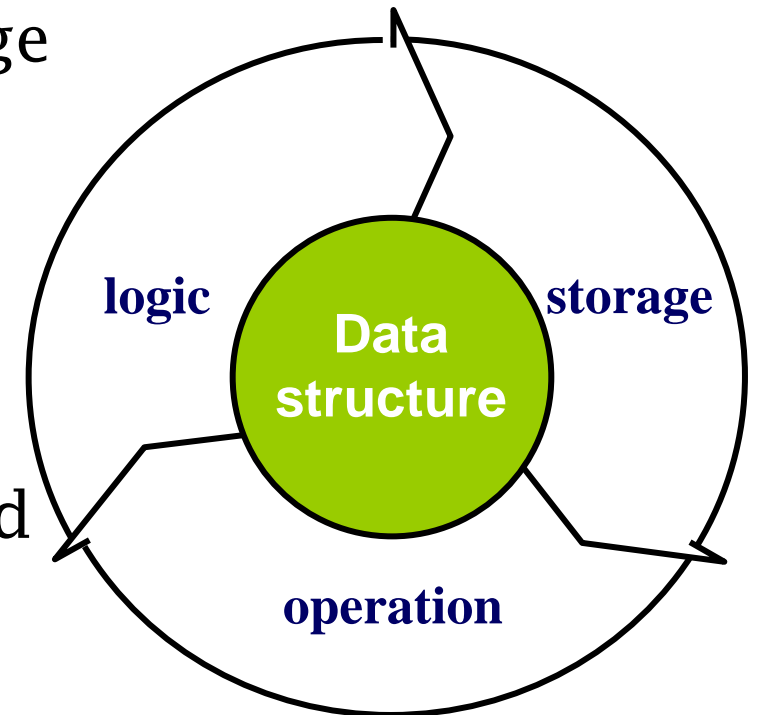


- Four kinds : **Sequence, link, index, hash**

## 1.2 What is data structure

# Abstract Data Type

- Abbreviated as **ADT** (Abstract Data Type)
  - A set of operations built upon a mathematical model
  - Has nothing to do with the physical storage structure
  - The software system is built upon the data model (object oriented)
- The development of **Modularization**
  - Hide the details of the implementation and operations of the internal data structures
  - Software reuse





## 1.2 What is data structure

### ADT do not care about storage details

——for example , brackets matching algorithm of C++ version

```
void BracketMatch(char *str) {
    Stack<char> S; int i; char ch;
    // The stack can be sequential
    // or linked, both are referenced
    // in the same way
    for(i=0; str[i]!='\0'; i++) {
        switch(str[i]) {
            case '(': case '[': case '{':
                S.Push(str[i]); break;
            case ')': case ']': case '}':
                if (S.IsEmpty( )) {
                    cout<<"Right brackets
excess!";
                    return;
                }
            else {
```

```
                ch = S.GetTop( );
                if (Match(ch,str[i]))
                    ch = S.Pop( );
                else {
                    cout << " Brackets do not match!";
                    return;
                }
            } /*else*/
        } /*switch*/
    } /*for*/
    if (S.IsEmpty( ))
        cout<<" Brackets match!";
    else cout<<"Left brackets
excess!";
}
```



## 1.2 What is data structure

### Sequential stack brackets matching algorithm of C version (different from the linked stack)

```

void BracketMatch(char *str) {
    SeqStack S; int i; char ch;
    InitStack(&S);
    for(i=0; str[i]!='\0'; i++) {
        switch(str[i]) {
            case '(': case '[': case '{':
                Push(&S, str[i]); break;
            case ')': case ']': case '}':
                if (IsEmpty(&S)) {
                    printf("\nRight brackets
excess!");
                    return;
                }
            else {

```

```

                GetTop (&S, &ch);
                if (Match(ch, str[i]))
                    Pop(&S, &ch);
                else {
                    printf("\nBrackets don't
match!");
                    return;
                }
            } /*else*/
        } /*switch*/
    } /*for*/
    if (IsEmpty(&S))
        printf("\nBrackets match!")
    else printf("\nLeft brackets
excess" );}

```





## 1.2 What is data structure

### Linked stack brackets matching algorithm of C version (different from the sequential stack)

```

void BracketMatch(char *str) {
    LinkStack S; int i; char ch;
    InitStack(/*&*/S);
    for(i=0; str[i]!='\0'; i++) {
        switch(str[i]) {
            case '(': case '[': case '{':
                Push(/*&*/S, str[i]);
                break;
            case ')': case ']': case '}':
                if (IsEmpty(S)) {
                    printf("\nRight brackets
excess!");
                    return;
                }
            else {

```

```

                GetTop (/*&*/S,&ch);
                if (Match(ch,str[i]))
                    Pop(/*&*/S,&ch);
                else {
                    printf("\nBrackets don't
match!");
                    return;
                }
            } /*else*/
        } /*switch*/
    } /*for*/
    if (IsEmpty(/*&*/S))
        printf("\nBrackets match!")
    else printf("\nLeft brackets excess");}

```



## 1.2 What is data structure

# Abstract Data Type

- Two-tuples of abstract data structure  
    <**Data object D** , **data operation P**>
- Firstly, defines logical structure; then data operations
  - **Logical structure** : relationship between data objects
  - **Operations** : algorithms running on the data

## 1.2 What is data structure

### Example : abstract data type of stack

- Logical structure : linear list
- Operation : **Restricted access**
  - Only allow for the insert, delete operation at the top of the stack
  - push 、 pop、 top 、 isEmpty

```
template <class T>           // Element type of stack is T
```

```
class Stack {
```

```
public:
```

```
    // Stack operation set
```

```
    void clear();           // Turned into an empty stack
```

```
    bool push(const T item); // Push item into the stack , return true if succeed, otherwise false
```

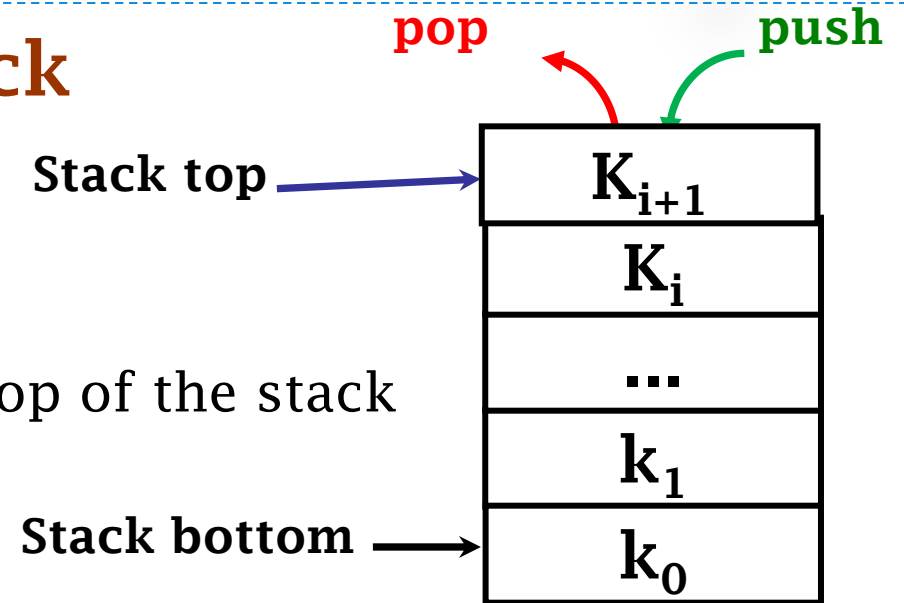
```
    bool pop(T & item); // Pop item out of the stack , return true if succeed, otherwise false
```

```
    bool top(T& item); // Read item at the top of the stack, return true if succeed, otherwise false
```

```
    bool isEmpty();       // If the stack is empty return true
```

```
    bool isFull();       // If the stack is full return true
```

```
};
```





## 1.2 What is data structure

### Questions about abstract data type

- How to present a logical structure in an ADT ?
- Is abstract data type equivalent to the class definition ?
- Can you define a ADT without templates ?



# Chapter 1 Overview

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## 1.3 Algorithm

# Problem—Algorithm—Program

## Goal : problem solving

- **Problem** (a function)
  - A mapping from input to output.
- **Algorithm** (a method)
  - The description for specific problem solving process is a finite sequence of instructions
- **Program**
  - It is the algorithm implemented using a computer programming language.

## 1.3 Algorithm

# The properties of algorithms

- **Generality**
  - Solve problems with parametric input
  - Ensure the correctness of the computation results
- **Effectiveness**
  - Algorithm is a sequence of finite instructions
  - It is made up of a series of concrete steps
- **Certainty**
  - In the algorithm description, which step will to be performed must be clear
- **Finiteness**
  - The execution of the algorithm must be ended in a finite number of steps
  - In other words, the algorithm cannot contain an endless loop

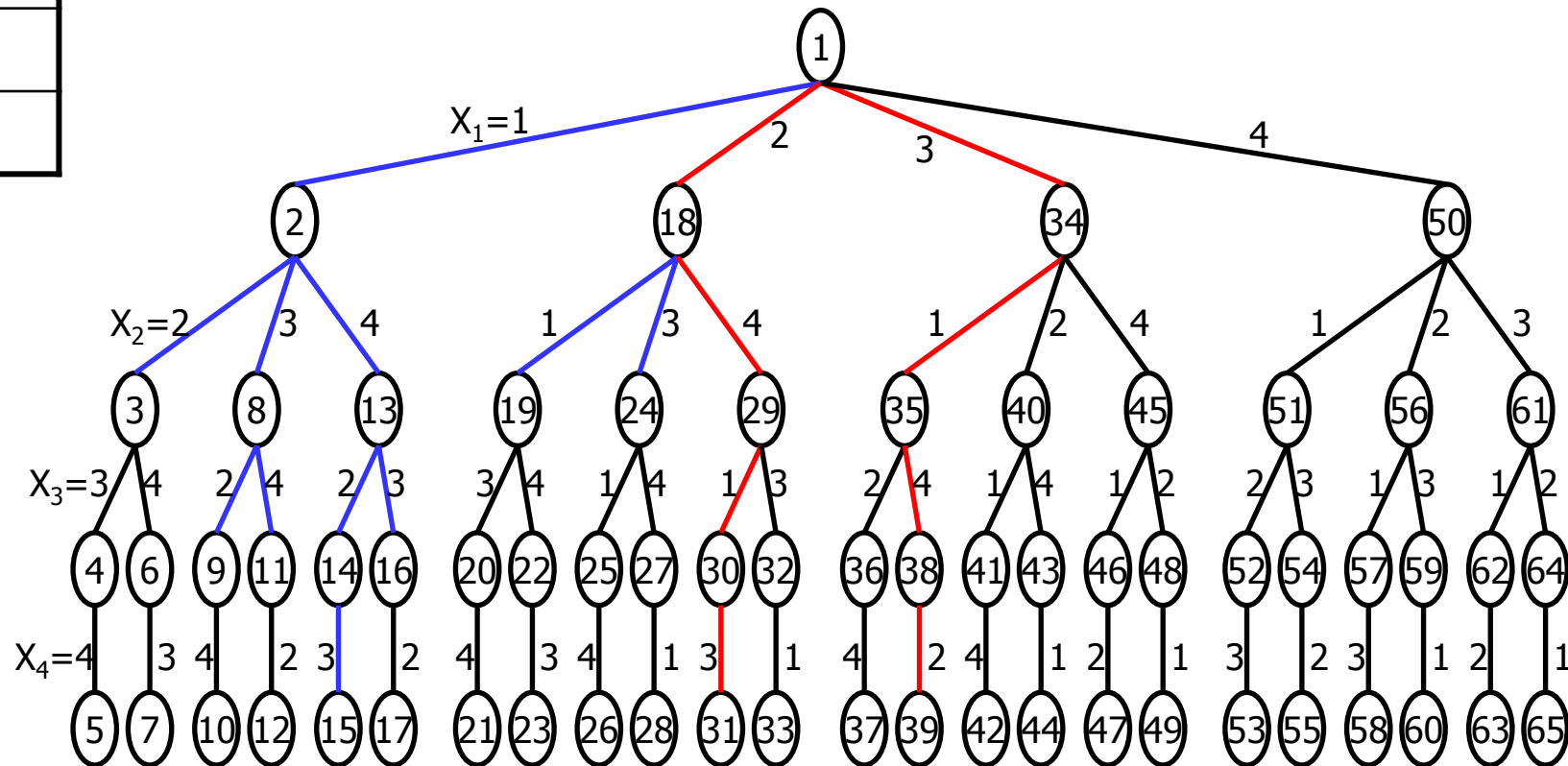
	Q		
			Q
Q			
		Q	

## 1.3 Algorithm

### Queen problem ( Four Queens )

	Q		
			Q
Q			
		Q	

- **Solution**  $\langle x_1, x_2, x_3, x_4 \rangle$  ( Place the column number )
- **Search space** : quadtree

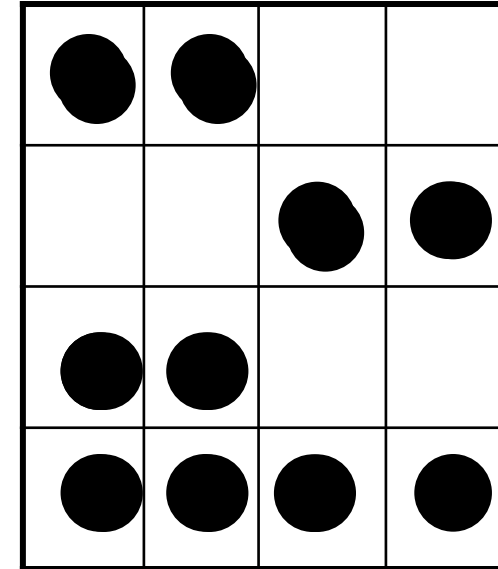




## 1.3 Algorithm

### Basic classification of algorithms

- **Enumeration**
  - Sequential search for value K
- **Backtracking, search**
  - Eight queens problem, traversal of trees and graphs
- **A recursive divide and conquer**
  - Binary search, quick sort, merge sort
- **Greedy**
  - Huffman coding tree, Dijkstra algorithm for shortest path, Prim algorithm for minimum spanning tree
- **Dynamic programming**
  - Floyd algorithm for shortest path



## 1.3 Algorithm

## Sequential Search

```
template <class Type>
```

```
class Item {
```

```
private:
```

```
    Type key;
```

```
public:
```

```
    Item(Type value):key(value) {}
```

```
    Type getKey() {return key;}
```

```
    void setKey(Type k){ key=k;}
```

```
};
```

```
vector<Item<Type>*> dataList;
```

```
template <class Type> int SeqSearch(vector<Item<Type>*>& dataList, int length, Type k) {
```

```
    int i=length;
```

```
    dataList[0]->setKey (k);
```

```
    while(dataList[i]->getKey() !=k) i--;
```

```
    return i;
```

```
}
```

0	1	2	3	4	5	6	7	8
	17	35	22	18	93	60	88	52

```
// the key field
```

```
//other fields
```

```
// get the key
```

```
// set the key
```

```
// the zero-th element is a sentinel
```

```
// return the position of the element
```



## 1.3 Algorithm

# Binary search

For sequential linear list that is in order

- $K_{mid}$ : The value of the element that is in the middle of the array
  - If  $k_{mid} = k$ , the search is successful
  - If  $k_{mid} > k$ , continue searching in the left half
  - Otherwise, if  $k_{mid} < k$ , You can ignore the part that before mid and search will go on in the right part
- Fast
  - $k_{mid} = k$ , the search ends up successfully
  - $K_{mid} \neq k$ , reduce half of the searching range at least



## 1.3 Algorithm

# Use binary search to find value K

```
template <class Type> int BinSearch (vector<Item<Type>*>& dataList,
int length, Type k){
    int low=1, high=length, mid;
    while (low<=high) {
        mid=(low+high)/2;
        if (k<dataList[mid]->getKey())
            high = mid-1; // decrease the upper bound of the search interval
        else if (k>dataList[mid]->getKey())
            low = mid+1; // decrease the lower bound of the search interval
        else return mid; // find value K and return the position
    }
    return 0; // fail to search and return 0
}
```

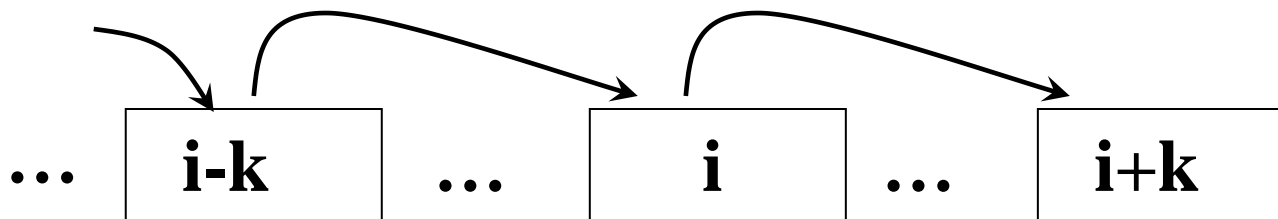


## 1.4 Algorithm complexity analysis

**Question :** The time and space restrictions for algorithms Design an algorithm that move the elements of the array  $A(0..n-1)$  to the right place by  $k$  positions circularly. The original array is supposed to be  $a_0, a_1, \dots, a_{n-2}, a_{n-1}$  ; the array that has been moved will be  $a_{n-k}, a_{n-k+1}, \dots, a_0, a_1, \dots, a_{n-k-1}$ . You are required to just use an extra space that is equivalent to an element, and the total number of moving and exchanging is only linearly correlated with  $n$ . For example ,  $n=10, k=3$

The original array : 0 1 2 3 4 5 6 7 8 9

The final array : 7 8 9 0 1 2 3 4 5 6





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# Asymptotic analysis of algorithm

$$f(n) = n^2 + 100n + \log_{10}n + 1000$$

- $f(n)$  is the growth rate as the data scale of  $n$  gradually increases
- When  $n$  increases to a certain value, the item with the highest power of  $n$  in the equation has the biggest impact
  - other items can be neglected.



## 1.4 Complexity analysis of algorithm

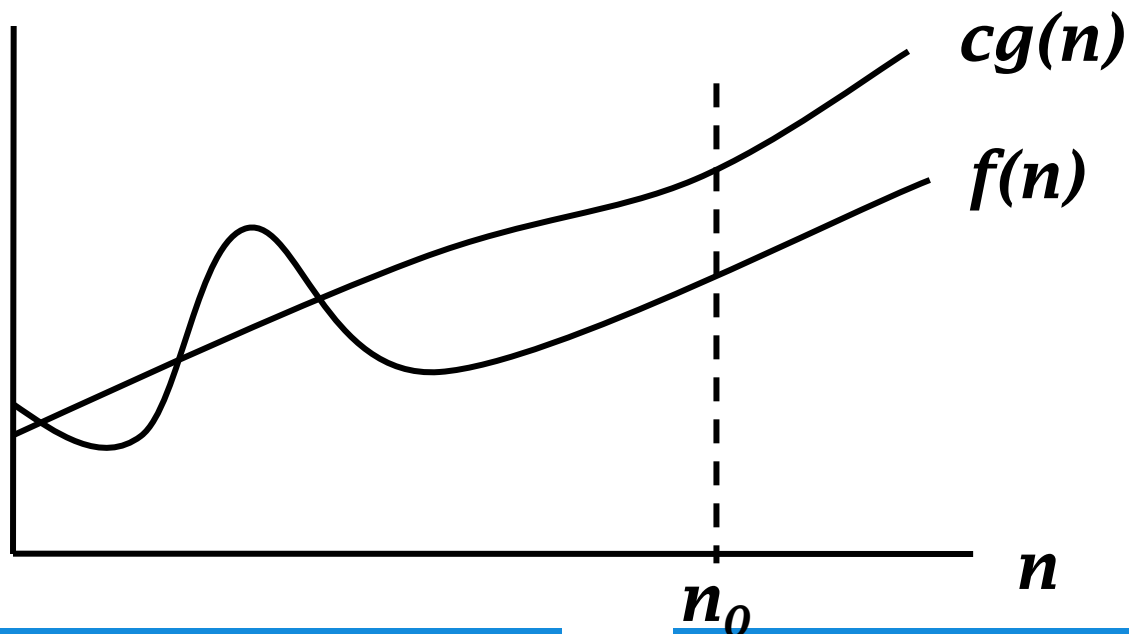
### Asymptotic analysis of algorithm : Big O notation

- The definition domain of function  $f$  and  $g$  is nature numbers , the range is non negative real numbers.
- **Definition** : If positive number  $c$  and  $n_0$  exists , which makes for any  $n \geq n_0$  ,  $f(n) \leq cg(n)$  ,
- Then  $f(n)$  is said to be in the set of  $O(g(n))$  , abbreviated as  $f(n)$  is  $O(g(n))$  , or  $f(n) = O(g(n))$
- Big O notation : it represents the upper bound of the growth rate of a function
  - There could be more than one upper bounds of the growth rate of a function
- When the upper bound and the lower bound are the same , you can use Big  $\Theta$  notation.

## 1.4 Complexity analysis of algorithm

# Big O notation

- $f(n) = O(g(n))$ , only when
  - There exists two parameters  $c > 0$ ,  $n_0 > 0$ , for any  $n \geq n_0$ ,  $f(n) \leq cg(n)$
- iff  $\exists c, n_0 > 0$  s.t.  $\forall n \geq n_0: 0 \leq f(n) \leq cg(n)$



$n$  is large enough  
 $g(n)$  is the upper bound of  $f(n)$



## Time unit of Big O notation

- Simple boolean or arithmetic operations
- Simple I/O
  - Input or output of a function  
For example , operations such as read data from an array
  - Files I/O operations or keyboard input are not excluded
- Return of function

## 1.4 Complexity analysis of algorithm

### Rules of operation of Big O notation

- **Rule of addition:**  $f_1(n) + f_2(n) = O(\max(f_1(n), f_2(n)))$ 
  - Sequential structure, if structure, switch structure
- **Rule of Multiplication:**  $f_1(n) f_2(n) = O(f_1(n) f_2(n))$ 
  - for, while, do-while structure

```
for (i=0; j<n; i++)
```

```
    for (j=i; j<n; j++)
```

```
        k++;
```

}  $n - i$

?

$$\sum_{i=0}^{n-1} (n - i) = \frac{n(n-1)}{2} = \frac{n^2 - n}{2} = O(n^2)$$



## 1.4 Complexity analysis of algorithm

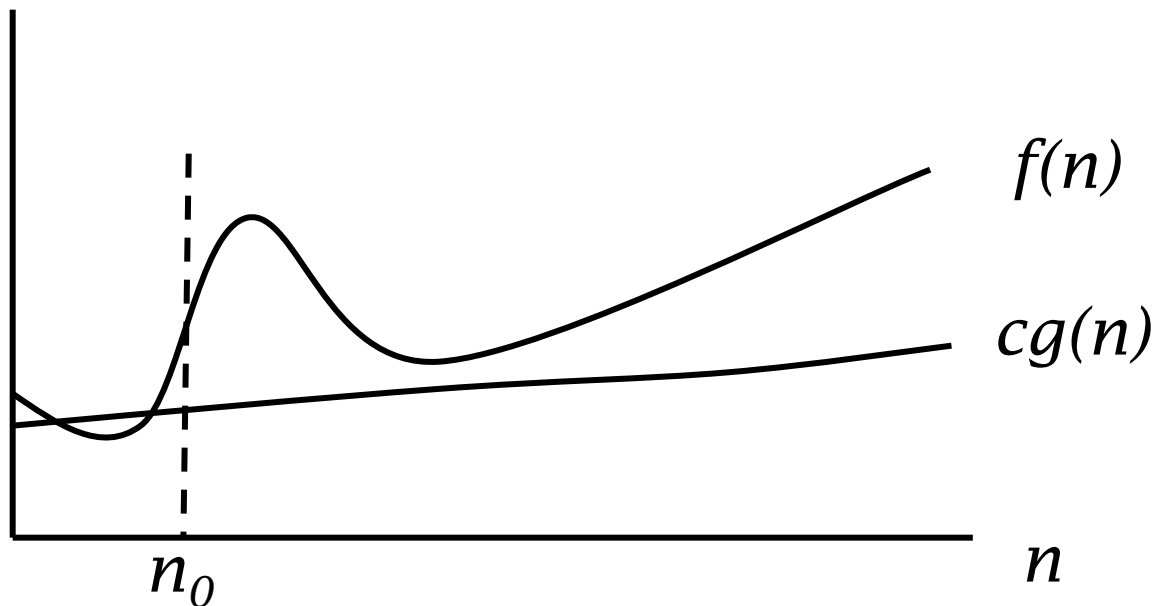
### Asymptotic analysis of algorithm : Big $\Omega$ notation

- If positive number  $c$  and  $n_0$  exists , which makes for any  $n \geq n_0$  ,  $f(n) \geq cg(n)$  ,
- Then  $f(n)$  is said to be in the set of  $O(g(n))$  , abbreviated as  $f(n)$  is  $O(g(n))$  , or  $f(n) = O(g(n))$
- The only difference of Big O notation and Big  $\Omega$  notation is the direction of inequation.
- When you adopt the  $\Omega$  notation , you'd better find the tightest (largest) lower bound of all the lower bound of the growth rate of the function.

## 1.4 Complexity analysis of algorithm

# Big $\Omega$ notation

- $f(n) = \Omega(g(n))$ 
  - iff  $\exists c, n_0 > 0$  s.t.  $\forall n \geq n_0, 0 \leq cg(n) \leq f(n)$
- The only difference with Big O notation is the direction of inequation



**$n$  is large enough  
 $g(n)$  is the lower bound of  $f(n)$**



## 1.4 Complexity analysis of algorithm

# Asymptotic analysis of algorithm : Big $\Theta$ notation

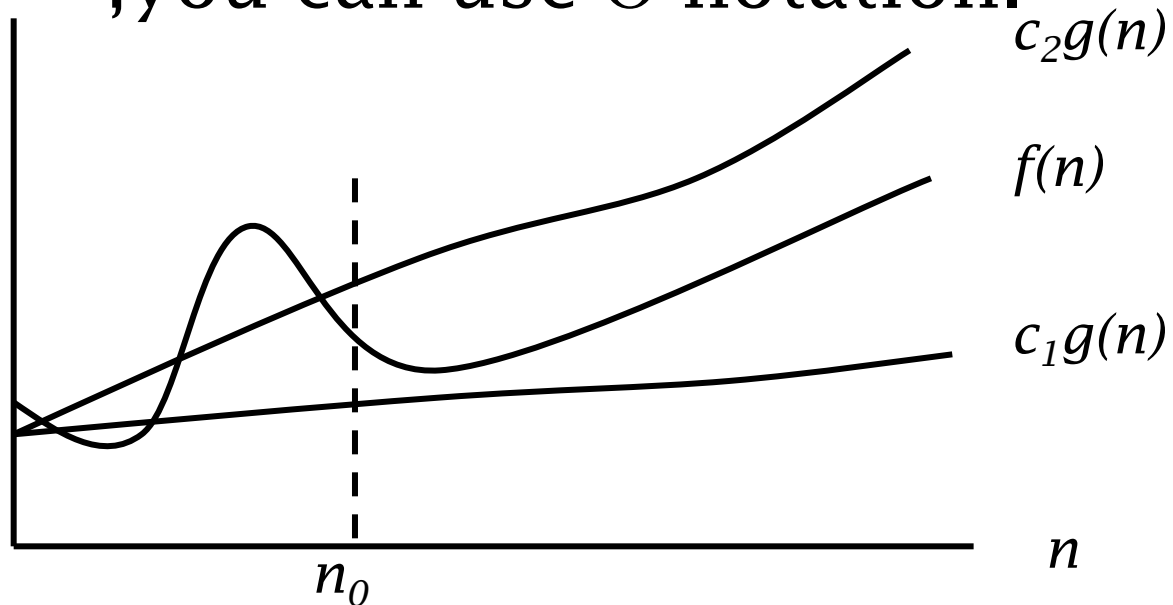
- When the upper bound and the lower bound are the same, you can use  $\Theta$  notation.
- Definition :  
If a function is in the set of  $O(g(n))$  and  $\Omega(g(n))$  , it is called  $\Theta(g(n))$ .
- In other words , When the upper bound and the lower bound are the same , you can use Big  $\Theta$  notation.
- There exist  $c_1, c_2$  , and positive integer  $n_0$  , which makes for any positive integer  $n > n_0$  , The following two inequality are correct at the same time :

$$c_1 g(n) \leq f(n) \leq c_2 g(n)$$

## 1.4 Complexity analysis of algorithm

# Big $\Theta$ notation

- $f(n) = \Theta(g(n))$ 
  - iff  $\exists c_1, c_2, n_0 > 0$  s.t.  $0 \leq c_1g(n) \leq f(n) \leq c_2g(n), \forall n \geq n_0$
- When the upper bound and the lower bound are the same, you can use  $\Theta$  notation.



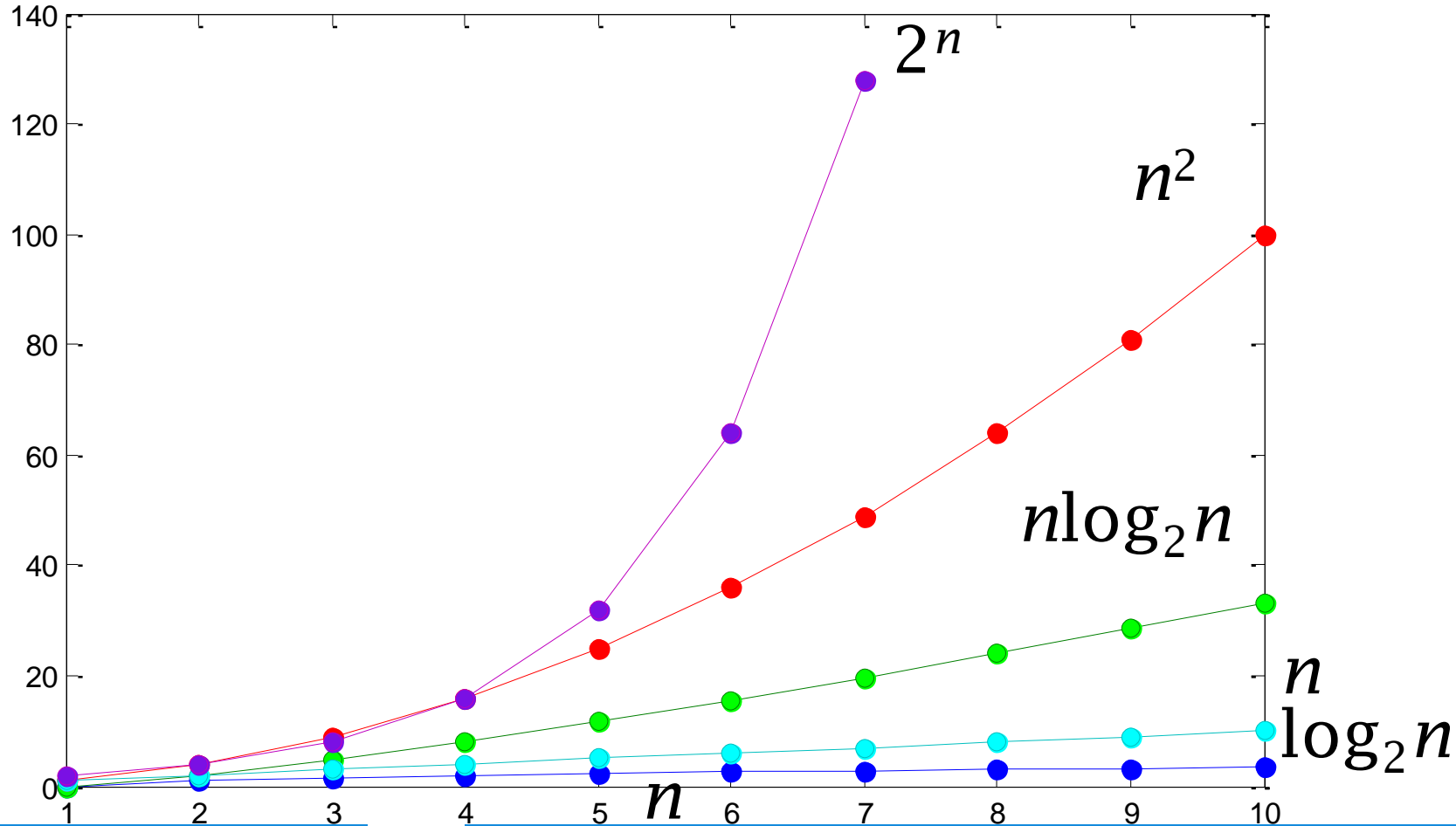
$n$  is large enough  
 $g(n)$  has the same growth rate with  $f(n)$



## 1.4 Complexity analysis of algorithm

 $f(n)$ 

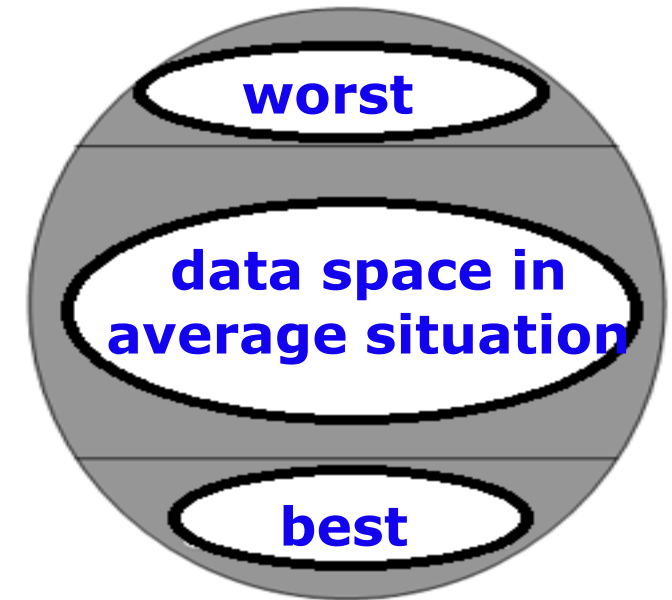
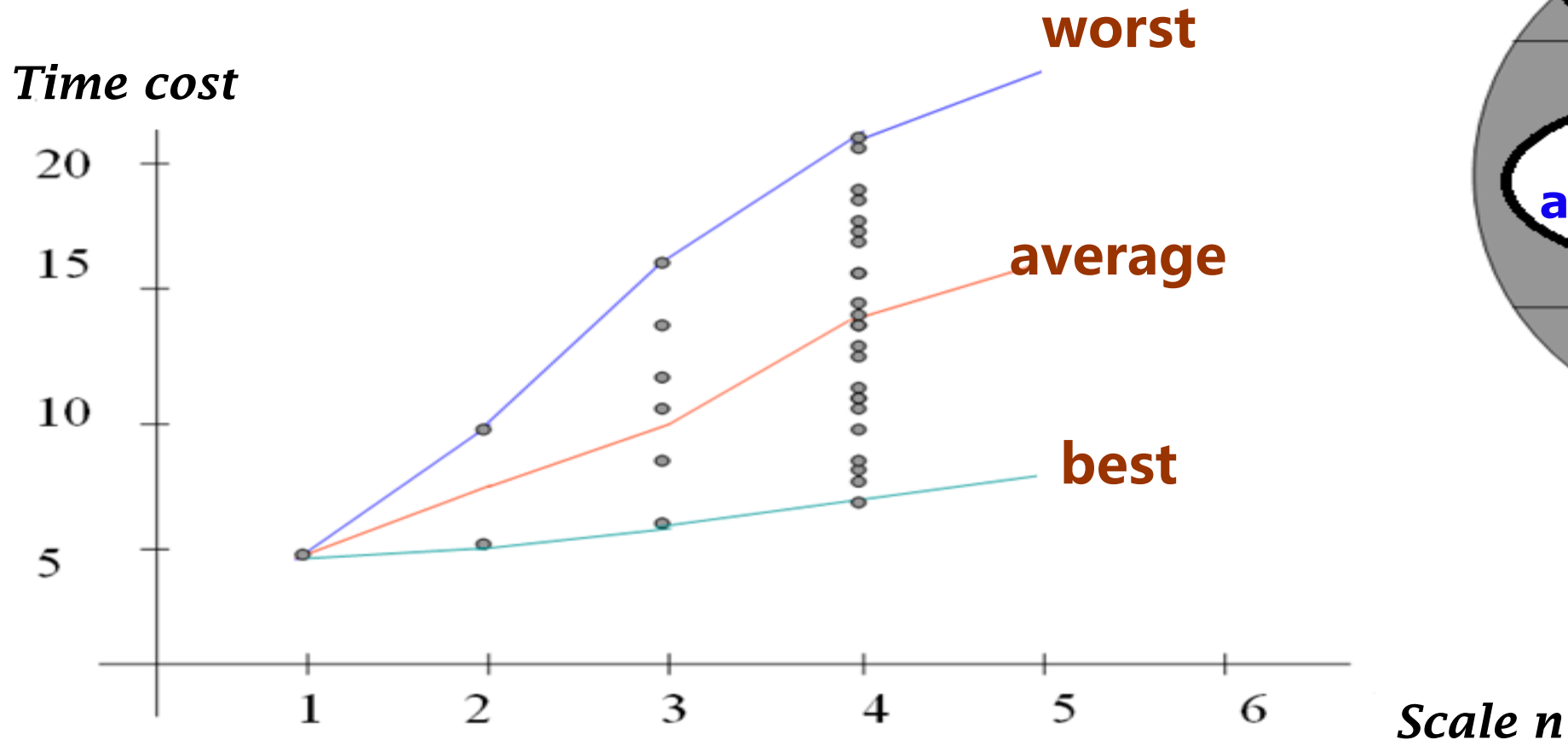
## The growth rate curve of function



## 1.4 Complexity analysis of algorithm

### Problem space vs time overhead

The input data space of problem





## 1.4 Complexity analysis of algorithm

# Sequential Search

- You are required to find a given  $K$  in an array with a scale of  $n$  sequentially
- Best situation
  - The first element of the array is  $K$
  - You only need to check one element
- Worst situation
  - $K$  is the last element of the array
  - You need to check all the  $n$  elements of the array.

## Find value k sequentially——the average case

- If value is distributed with equal probability
  - The probability that K occurs in every position is  $1/n$

- The average cost is  $O(n)$

$$\frac{1 + 2 + \dots + n}{n} = \frac{n + 1}{2}$$

## 1.4 Complexity analysis of algorithm

### Find value $k$ sequentially——the average case

- Distributed with different probability
  - Probability that  $K$  occurs in position 1 is  $1/2$
  - Probability that  $K$  occurs in position 2 is  $1/4$
  - Probability that  $K$  occurs in other positions are all

$$\frac{1 - 1/2 - 1/4}{n - 2} = \frac{1}{4(n - 2)}$$

- The average cost is  $O(n)$

$$\frac{1}{2} + \frac{2}{4} + \frac{3 + \dots + n}{4(n - 2)} = 1 + \frac{n(n + 1) - 6}{8(n - 2)} = 1 + \frac{n + 3}{8}$$



## 1.3 Algorithm

# Binary search

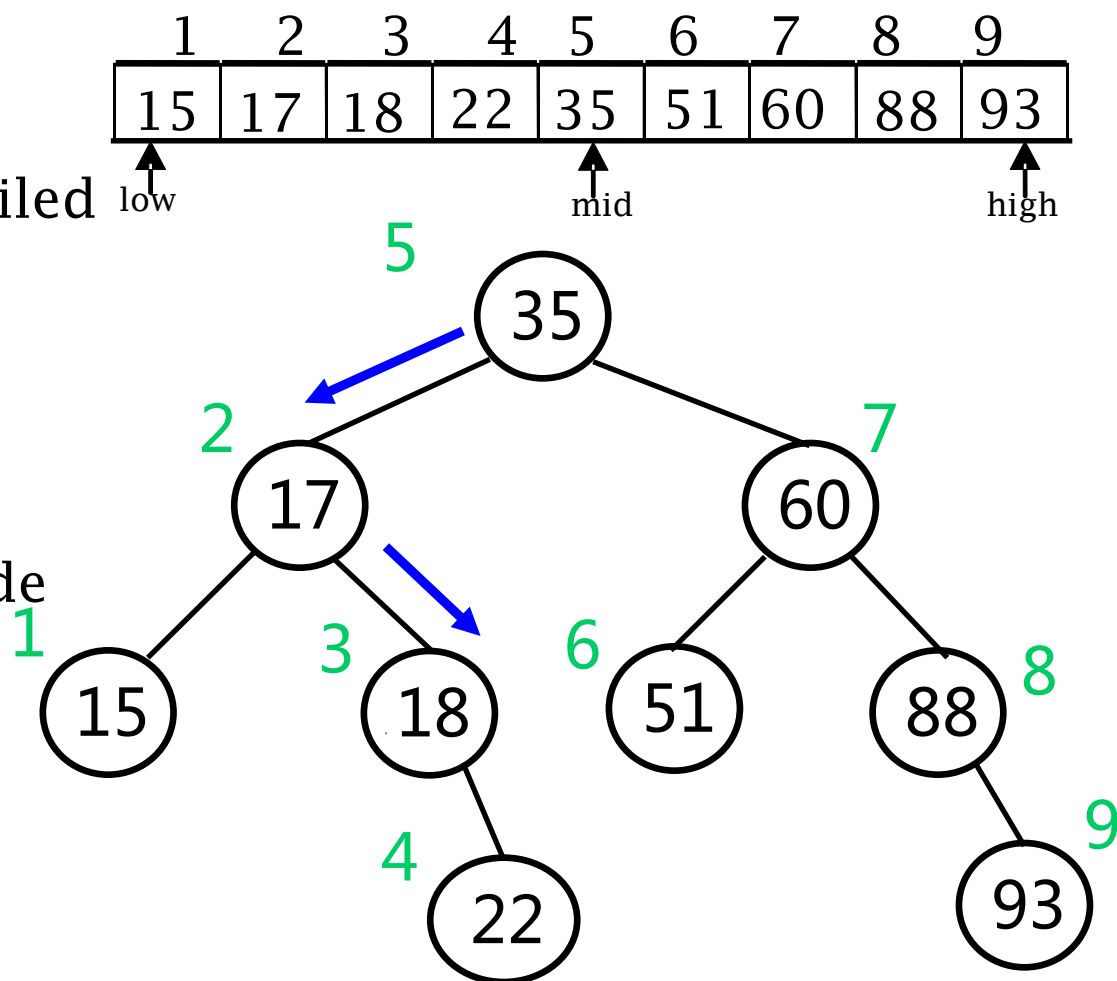
For sequential linear list that is in order

- $K_{mid}$ : The value of the element that is in the middle of the array
  - If  $k_{mid} = k$ , the search is successful
  - If  $k_{mid} > k$ , the search continues in the left half
  - Otherwise, if  $k_{mid} < k$ , You can ignore the part that before mid and search will go on in the right part
- Fast
  - $k_{mid} = k$ , search will be ended up
  - $K_{mid} \neq k$ , reduce half of the searching range at least

## 1.4 Complexity analysis of algorithm

# Performance analysis of binary search

- The largest search length  
 $\lceil \log_2 (n + 1) \rceil$
- The search length of the situation that failed is  $\lceil \log_2 (n + 1) \rceil$  or  $\lfloor \log_2 (n + 1) \rfloor$
- The average cost is  $O(\log n)$
- In complexity analysis of algorithm
  - The base of  $\log n$  is 2
  - When the base changed, the magnitude of algorithm will not change





## 1.4 Complexity analysis of algorithm

# Time/Space tradeoff

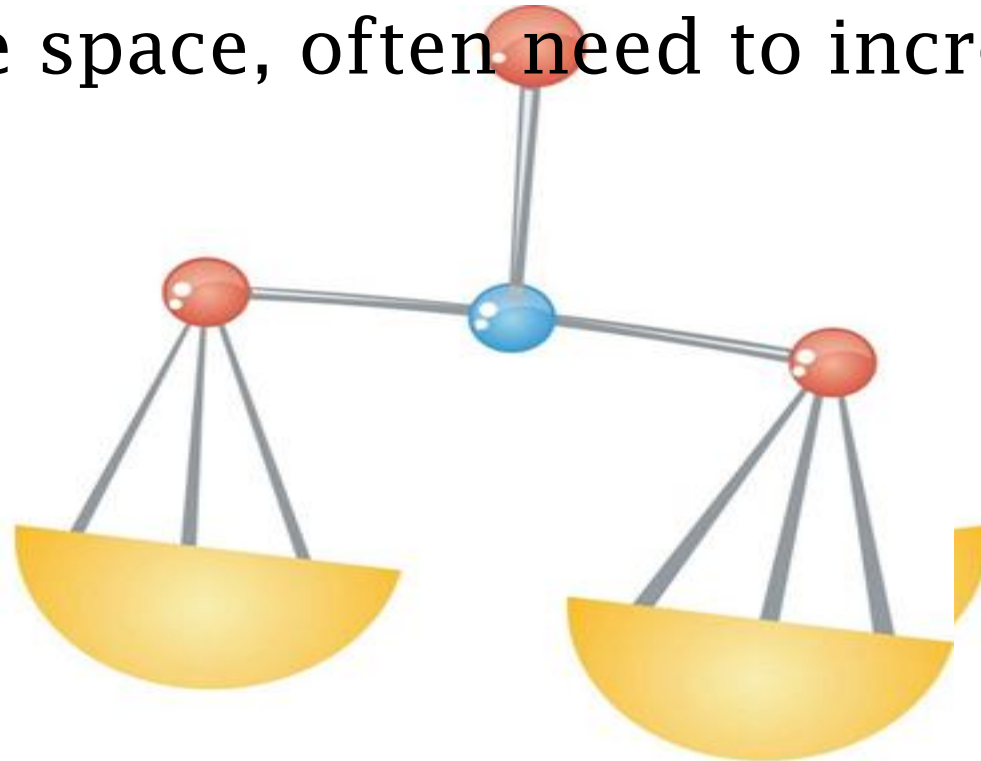
- **Data structure**
  - A certain space to store every data item
  - A certain amount of time to perform a single basic operation
- **The cost and benefit**
  - limit of time and space
  - Software engineering



## 1.4 Complexity analysis of algorithm

# The space-time tradeoffs

- Increasing the space overhead may improve the algorithm's time overhead
- To save space, often need to increase the operation time





## 1.4 Complexity analysis of algorithm

# Selecting data structure and algorithm

- You need to analyze the problem carefully
  - Especially the logic relations and data types involved in the process of solving problems—problem abstraction, data abstraction
  - Preliminary design of data structure often precede the algorithm design
- Note the data structure of scalability
  - Consider when the size of input data changes, whether data structure is able to adapt to the evolution and expansion of problem solving



## 1.4 Complexity analysis of algorithm

### Question : Selecting data structure and algorithm

- Goal of problem solving ?
- Process of choosing data structure and algorithm ?



## Question : three elements of data structure

Which of the structures below are logical structure and has nothing to do with the storage and operation().

- A. Sequential table    B. Hash table  
C. Linear list         D. Single linked list

The following terms ( \_\_\_\_\_ ) has nothing to do with the storage of data.

- A. Sequential table    B. Linked list  
C. Queue                D. Circular linked list



# Data Structures and Algorithms

Thanks

the National Elaborate Course (Only available for IPs in China)  
<http://www.jpk.pku.edu.cn/pkujpk/course/sjjg/>

Ming Zhang, Tengjiao Wang and Haiyan Zhao  
Higher Education Press, 2008.6 (awarded as the "Eleventh Five-Year" national planning textbook)