

CSIEB0100 Data Structures

Lecture01 Basic Concepts

Shiow-yang Wu 吳秀陽

Department of Computer Science
and Information Engineering
National Dong Hwa University

Lecture material is mostly home-grown, partly adapted from slides came with the textbook originally prepared by Professor Jiun-Long Huang of NCTU.

What The Course Is About



- **Data structures** is concerned with the **representation** and **manipulation** of **data**.
- All programs manipulate data.
- So, all programs need to represent data in some way.
- All programs need data structures.
- Data manipulation requires an **algorithm**.

What The Course Is About



- We shall study **structures** to represent data and **algorithms** to manipulate these structures
- The study of data structures is **fundamental** to Computer Science & Engineering



Prerequisites

- C++
 - Most examples will be presented in C++
- Asymptotic Complexity
 - Big Oh, Theta, and Omega notations
- We will provide short reviews for both topics

Course Web Page



- <http://web.csie.ndhu.edu.tw/showyang/DS2023f/index.html>
- Handouts, syllabus, textbooks, source codes, exercises, lectures, assignments, TAs, etc.
- **Office:** Sci & Eng Building II C308



Assignments

- All assignments will be given in the class.
- **Submit** your programs and test data/result to the **TA leader**. (Detail instruction will be given in the class Web page)
- Do Assignment 0 by next week



Grades

- Assignments 35%
- Midterm Exam 35%
- Final Exam 35%

- Yes! 105% !!
- As long as you work hard, it's hard to fail in this class.

Assignment 0: Getting Started

- **Download Code::Blocks** and **install** it on your own machine by following the instructions along with the file.
- **Download** the **source code** of the textbook samples from the book's web site.
- Unfortunately, the code doesn't work out of the box.
- Assignment 0 is to **make all code** of **Chapter 1 work** correctly.
- **Submit** any one of the corrected code to the **TA**.

System Life Cycle

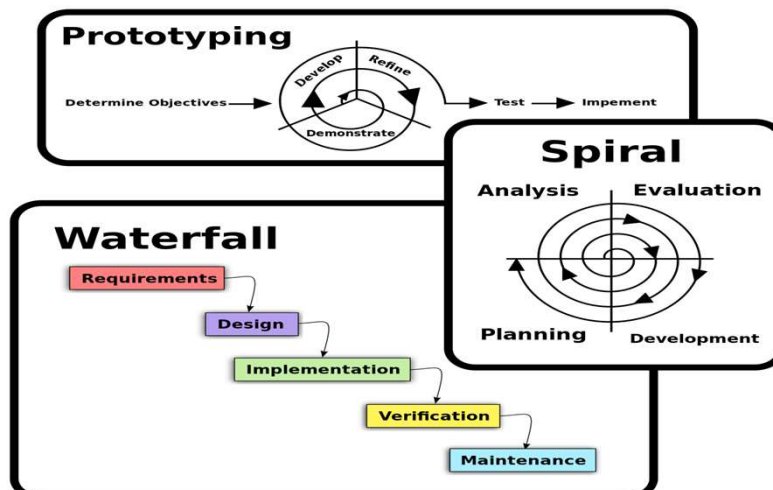


- **Large-scale programs** are considered as **systems** with many complex **interacting components**.
- The development process of such programs is known as the **system/software life cycle**.
- Different **development methodologies** lead to different software life cycles.
- The goal is to find **repeatable, predictable** processes that **improve software productivity** and **quality**.
- No de-facto standard yet!

CSIEB0100 Data Structures

Basic Concepts 9

Three Traditional Models



(<https://courses.lumenlearning.com/sanjacinto-computerapps/chapter/reading-software-development-process/>)

CSIEB0100 Data Structures

Basic Concepts 10

Waterfall Model 1/2

■ Requirements

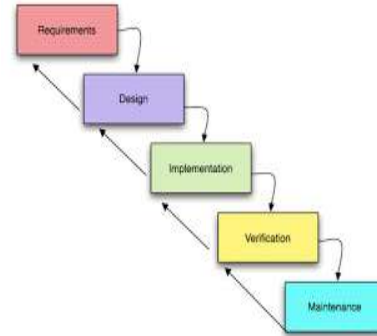
- Project goals
- Input/Output specification

■ Analysis

- Bottom-up
- Top-down

■ Design

- Data objects: abstract data types
- Operations: specification & design of algorithms



CSIEB0100 Data Structures

Basic Concepts 11

Waterfall Model 2/2

■ Refinement & Implementation

- Choose representations for data objects
- Write algorithms for operations on data objects
- Write programs that implement the algorithms

■ Verification

- Correctness proofs: selecting proved algorithms
- Testing: correctness & efficiency
- Error removal (debugging): much easier with well-designed and well-documented code

■ Maintenance

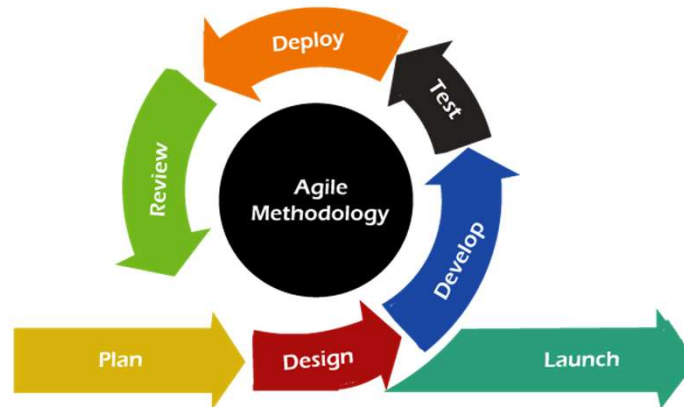
- Modification to correct faults, improve performance or other attributes.

CSIEB0100 Data Structures

Basic Concepts 12

Agile Model

- Flexible and responsive software development for fast adaptation to **changes**.



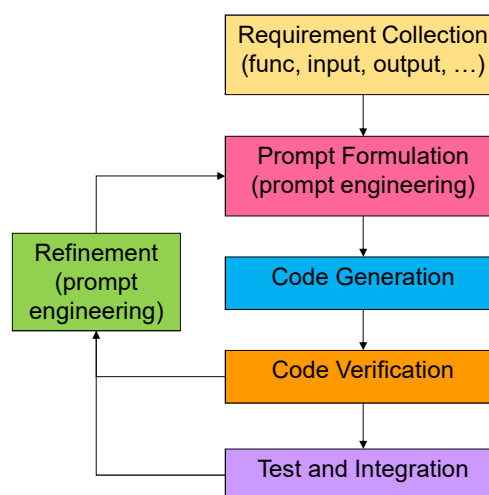
(<https://www.javatpoint.com/agile-vs-waterfall-model>)

CSIEB0100 Data Structures

Basic Concepts 13

S/W Development with AI

- AI-assisted **development** is a widespread trend.
- No proven and well-accepted model yet.
- Use cases** and **best practices** are accumulating.
- Very popular for generating **code snippets**.



CSIEB0100 Data Structures

Basic Concepts 14

Quality Evaluation

- Meet the original requirement specification?
- Work correctly?
- Document?
- Use functions to create logical units?
- Code readable?
- Use storage efficiently?
- Running time acceptable?



Data Abstraction & Encapsulation

- **Data encapsulation** or **information hiding** is the concealing of the implementation details of a data object from the outside world
- **Data abstraction** is the separation between the **specification** of a data object and its **implementation**
- A **data type** is a collection of **objects** and a set of **operations** that act on those objects

Specification vs Implementation

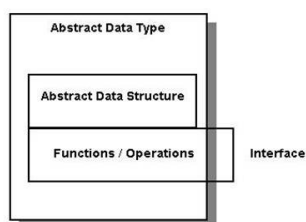
- **Specification**: Description of data or function without representation or implementation details.
- **Representation**: Detail description of how data should be represented in a computer program.
 - E.g., char 1 byte, int 4 bytes
- **Implementation**: Detail description of how to realize the specification of data or function with computer programs.
- **Separation** of specification and implementation is the key to the systematic study of data structures.
- It is possible to have **different implementations** of the **same specification**.

CSIEB0100 Data Structures

Basic Concepts 17

Abstract Data Type (ADT)

- An **abstract data type (ADT)** is a data type that is organized such that
 - the **specification** of the objects & operations
 - is **separated** from the **representation** of the objects and the **implementation** of the operations
- ADT is **implementation-independent**



CSIEB0100 Data Structures

Basic Concepts 18

Abstract data type NaturalNumber (p.9)

ADT NaturalNumber 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.

Interface

```

Zero ( ):NaturalNumber      ::= 0
Is_Zero(x):Boolean          ::= if (x) return FALSE
                               else return TRUE
Add(x, y):NaturalNumber     ::= if ((x+y) <= INT_MAX)
                               return x+y
                               else return INT_MAX
Equal(x,y):Boolean          ::= if (x== y) return TRUE
                               else return FALSE
Successor(x):NaturalNumber  ::= if (x == INT_MAX)
                               return x
                               else return x+1
Subtract(x,y):NaturalNumber ::= if (x<y) return 0
                               else return x-y

```

end Natural_Number

Behavior(semantics)

CSIEB0100 Data Structures

Basic Concepts 19

Algorithm Specification

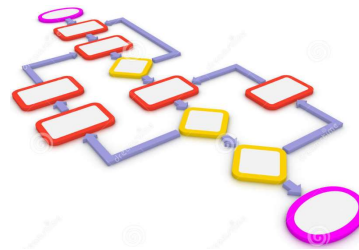
- **Definition:** An **algorithm** is a finite set of instructions that accomplishes a particular task.
- **Criteria** that **ALL** algorithms must satisfy:
 - **Input:** zero or more
 - **Output:** at least one
 - **Definiteness:** clear and unambiguous
 - **Finiteness:** terminate after a finite number of steps
 - **Effectiveness:** instruction is basic enough to be carried out

CSIEB0100 Data Structures

Basic Concepts 20

Algorithm vs Program

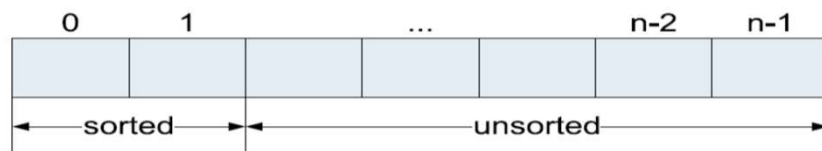
- One difference between an **algorithm** and a **program** is that the latter does not have to satisfy the fourth condition
 - Program doesn't have to be finite
 - E.g., OS scheduling



CSIEB0100 Data Structures

Basic Concepts 21

Example 1: Selection Sort



- From those integers that are currently unsorted, find the smallest and place it next in the sorted list.

```
for ( i=0; i<n; i++) {  
    Examine list[i] to list[n-1] and suppose  
    that smallest integer is list[min]  
    Interchange list[i] & list[min]  
}
```

CSIEB0100 Data Structures

Basic Concepts 22

Selection Sort

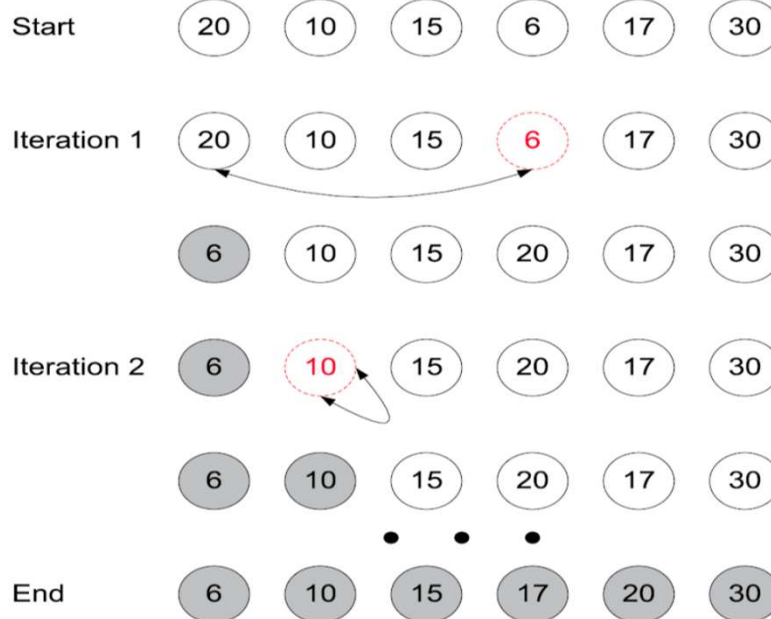
```

void sort (int *a, int n)
// sort n integers a[0] to a[n-1] into nondecreasing order
{
  for ( int i = 0; i < n; i++)
  {
    int j = i; // a[j] is the current smallest int
    // find smallest KeyType in a[i] to a[n-1]
    for (int k = i+1; k < n; k++)
      if (a[k] < a[j]) j = k; // update j to the new smallest
    int temp = a[i]; a[i] = a[j]; a[j] = temp; // swap
  }
}

```

CSIEB0100 Data Structures

Basic Concepts 23



CSIEB0100 Data Structures

Basic Concepts 24

Selection Sort Animation

- <http://liveexample.pearsoncmg.com/liang/animation/web/SelectionSort.html>
- The site:
<https://liveexample.pearsoncmg.com/liang/animation/>
- Provides many animations for other data structures and algorithms.

Example 2: Binary Search



```
while (there are more integers to check)
{
    middle = (left + right) / 2;
    if (searchnum < list[middle])
        right = middle - 1;
    else if (searchnum == list[middle])
        return middle;
    else
        left = middle + 1;
}
```

Binary Search in C++

```
char compare (int x, int y)
{
    if (x > y) return '>';
    else if (x < y) return '<';
    else return '=';
}
```

CSIEB0100 Data Structures

Basic Concepts 27

```
int BinarySearch (int *a, int x, const int n)
// Search the sorted array a[0], ..., a[n-1] for x
{
    for (int left = 0, right = n - 1; left <= right;) { // more elements
        int middle = (left + right)/2;
        switch (compare (x, a[middle])){
            case '>': left = middle + 1; break; // x > a[middle]
            case '<': right = middle - 1; break; // x < a[middle]
            case '=': return middle; // x == a[middle]
        } // end of switch
    } // end of for
    return -1; // not found
} // end of BinarySearch
```

CSIEB0100 Data Structures

Basic Concepts 28

Binary Search Examples

- Input
 - 1 3 7 9 13 20 31
- Search for 7 (next slide)
- Search for 16 (exercise)

CSIEB0100 Data Structures

Basic Concepts 29

Search for 7

Start	1	3	7	9	13	20	31
Iteration 1	1	3	7	9	13	20	31
	1	3	7	9	13	20	31
Iteration 2	1	3	7	9	13	20	31
	1	3	7	9	13	20	31
Got it	1	3	7	9	13	20	31

CSIEB0100 Data Structures

Basic Concepts 30

Binary Search Animation

- <http://liveexample.pearsoncmg.com/liang/animation/web/BinarySearch.html>

Binary vs Sequential Search

- Comparison between **sequential search** and **binary search**
 - Binary search is faster than sequential search
 - However, binary search requires the input to be sorted in advance
- Should we always use binary search?
 - Not necessary.



Example 3: Selection Problem

- Selection problem: select the **k-th largest** among N numbers
- Approach 1
 - Read N numbers into an **array**
 - **Sort** the array in **decreasing** order
 - Return the element in **position k**



CSIEB0100 Data Structures

Basic Concepts 33

Example 3: Selection Problem

- Approach 2
 - Read **k elements** into an **array**
 - **Sort** them in **decreasing** order
 - For each remaining elements, **read one by one**
 - **Ignored** if it is **smaller** than the k-th element
 - Otherwise, place in **correct place** and **kick one out** of the array (which one?)
 - Return the **last (kth)** element of the array after all elements have been processed

CSIEB0100 Data Structures

Basic Concepts 34

Example of Approach 2

- Input
 - 20 9 15 6 17 30
- Find the 3rd largest number
- Read three numbers and sort them in descending order
 - 20 15 9
- Read next: “6”
 - 20 15 9

Example of Approach 2

- Read next: “17”
 - 20 17 15
 - 9 is out
- Read next: “30”
 - 30 20 17
 - 15 is out
- Finish processing of all numbers.
- The third largest number is 17.

- Does it work all the time?

Comparison of Approach 1 & 2

- Which one is better?
 - Implementation difficulty
 - Efficiency
 - Time complexity analysis
- Remember that time complexity is not the only yardstick
 - Space complexity
 - Easy to implement
 - ...

CSIEB0100 Data Structures

Basic Concepts 37

Recursive Algorithms

- **Recursion** is usually used to solve a problem in a “**divided-and-conquer**” manner
- **Direct** recursion
 - Functions that call themselves
- **Indirect** recursion
 - Functions that call other functions that invoke calling function again
- $C(n,m) = n!/[m!(n-m)!]$
 - $C(n,m)=C(n-1,m)+C(n-1,m-1)$ // why?
- **Boundary condition for recursion**

CSIEB0100 Data Structures

Basic Concepts 38

Recursive Summation

- $\text{sum}(1, n) = \text{sum}(1, n-1) + n$
- $\text{sum}(1, 1) = 1$

```
int sum(int n)
{
    if (n==1)
        return (1);
    else
        return(sum(n-1)+n);
}
```

Recursive Factorial

- $n! = n \times (n-1)!$
- $\text{fact}(n) = n \times \text{fact}(n-1)$
- $0! = 1$

```
int fact(int n)
{
    if ( n== 0)
        return (1);
    else
        return (n * fact(n-1) );
}
```

Recursive Multiplication

- $axb = ax(b-1) + a$

- $ax1 = a$

```
int mult(int a, int b)
{
    if ( b==1)
        return (a);
    else
        return( mult(a,b-1) + a);
}
```

CSIEB0100 Data Structures

Basic Concepts 41

Recursive Binary Search

```
int BinarySearch (int *a, int x, const int left, const int right)
//Search the sorted array a[left], ..., a[right] for x
{
    if (left <= right) {
        int mid = (left + right)/2;
        switch (compare (x, a[mid])){
            case '>': return BinarySearch(a, x, mid+1, right); // x > a[mid]
            case '<': return BinarySearch(a, x, left, mid-1); // x < a[mid]
            case '=': return mid; // x == a[mid]
        } // end of switch
    } // end of if
    return -1; // not found
} // end of BinarySearch
```

CSIEB0100 Data Structures

Basic Concepts 42

Recursive Permutation

- Permutation of {a, b, c}
 - (a, b, c), (a, c, b)
 - (b, a, c), (b, c, a)
 - (c, a, b), (c, b, a)
- Recursion?
 - a+Perm({b,c})
 - b+Perm({a,c})
 - c+Perm({a,b})

CSIEB0100 Data Structures

Basic Concepts 43

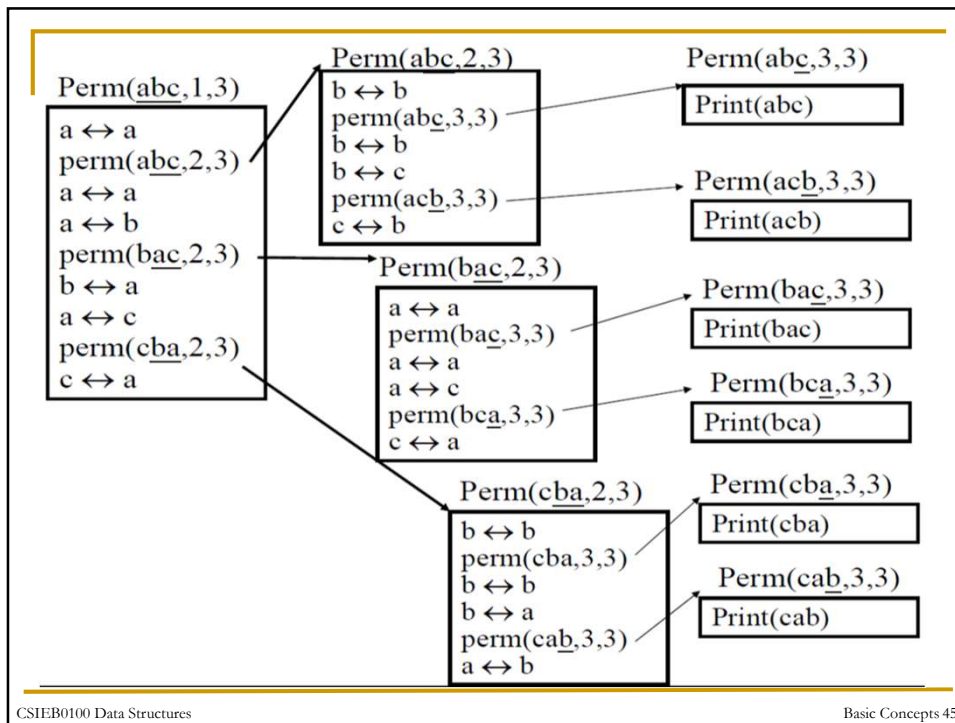
```

void perm (char *a, const int k, const int n) // n is the size of a
// Generate all the permutations of a[k], ..., a[n-1].
{
    if (k == n-1) { // output permutation
        for (int i = 0; i < n; i++) cout << a[i] << " ";
        cout << endl;
    }
    else { // a[k], ..., a[n-1] has more than one permutation.
        // Generate these recursively
        for (int i = k; i < n; i++) {
            // swap a[k] and a[i]
            char temp = a[k]; a[k] = a[i]; a[i] = temp;
            perm(a, k+1, n); // all permutations of a[k+1], ..., a[n-1]
            // swap a[k] and a[i] back to original
            temp = a[k]; a[k] = a[i]; a[i] = temp;
        }
    } // end of else
} // end of perm
// Can we improve the code above?

```

CSIEB0100 Data Structures

Basic Concepts 44



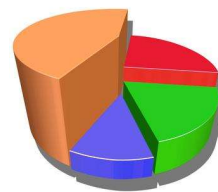
Performance Evaluation

- Criteria
 - Is it correct?
 - Is it efficient?
 - Is it readable?
- Performance analysis
 - Machine independent
- Performance measurement
 - Machine dependent



Performance Analysis

- Complexity theory
- **Space** complexity
 - Amount of memory
- **Time** complexity
 - Amount of computing time



CSIEB0100 Data Structures

Basic Concepts 47

Space Complexity

- $S(P) = c + S_p(I)$
 - **c**: fixed space (instruction, simple variables, constants)
 - $S_p(I)$: depends on characteristics of instance I
 - Characteristics: number, size, values of I/O associated with I
- If n is the only characteristic, $S_p(I) = S_p(n)$

CSIEB0100 Data Structures

Basic Concepts 48

Space Complexity Examples

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

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

```
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

CSIEB0100 Data Structures

Basic Concepts 49

Space Complexity Examples

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

$$S_{sum}(I) = S_{sum}(n) = 6n$$

Assumptions:

Space needed for one recursive call of the program

Type	Name	Number of bytes
Parameter: float	list[]	2
Parameter: integer	n	2
Return address: (used internally)		2 (unless a far address)
Total		6

CSIEB0100 Data Structures

Basic Concepts 50

Time Complexity

- $T(P) = c + T_p(I)$
 - c : compile time
 - $T_p(I)$: program execution time
 - Depends on characteristics of instance I
- Predict the growth in run time as the instance characteristics change

CSIEB0100 Data Structures

Basic Concepts 51

Time Complexity

- Compile time (c)
 - Independent of instance characteristics
- Run (execution) time T_p
- A **program step** is a syntactically or semantically meaningful program segment whose execution time is **independent** of the instance characteristics.
- Time complexity can be measured by **counting** the total number of **steps** required.

CSIEB0100 Data Structures

Basic Concepts 52

Methods to Compute Step Count

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

CSIEB0100 Data Structures

Basic Concepts 53

Step Count with count Variable

```
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 */
    return tempsum;
    count++;     /* for return */ 2n+3 steps
}
```

CSIEB0100 Data Structures

Basic Concepts 54

Step Count with count Variable

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

$$\begin{aligned}
 T(n) &= 2 + T(n-1) \\
 &= 2 + 2 + T(n-2) \\
 &\dots \\
 &= 2n + T(0) \\
 &= 2n + 2
 \end{aligned}$$

CSIEB0100 Data Structures

Basic Concepts 55

Tabular Method

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

s/e: steps per execution

CSIEB0100 Data Structures

Basic Concepts 56

Time Complexity

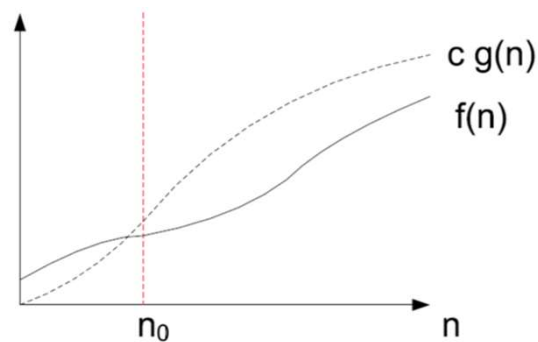
- Cases
 - Worst case
 - Best case
 - Average case
- Worst case and average case analysis is much more useful in practice

Time Complexity

- Difficult to determine the exact step counts
- What a step stands for is inexact
 - e.g. $x := y$ v.s. $x := y + z + (x/y) + \dots$
- Exact step count is not useful for comparison
- Step count doesn't tell how much time a step takes
- **Just consider the growth in run time as the instance characteristics change**

Asymptotic Notation – Big O

- $f(n) = O(g(n))$ iff
 - ∃ a real constant $c > 0$ and an integer constant $n_0 \geq 1$, $\exists f(n) \leq cg(n) \forall n, n \geq n_0$



CSIEB0100 Data Structures

Basic Concepts 59

Big O Examples

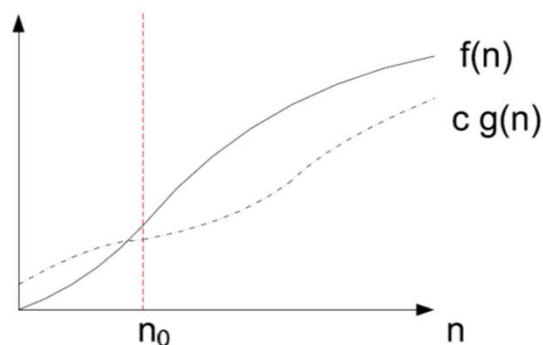
- Examples
 - $3n+2 = O(n)$
 $3n+2 \leq 4n$ for all $n \geq 2$
 - $10n^2+4n+2 = O(n^2)$
 $10n^2+4n+2 \leq 11n^2$ for all $n \geq 10$
 - $3n+2 = O(n^2)$
 $3n+2 \leq n^2$ for all $n \geq 4$ (Not tight enough!)
- $g(n)$ should be a **least upper bound**

CSIEB0100 Data Structures

Basic Concepts 60

Asymptotic Notation – Big Ω

- $f(n) = \Omega(g(n))$ iff
 - \exists a real constant $c > 0$ and an integer constant $n_0 \geq 1$, $\exists f(n) \geq cg(n) \forall n, n \geq n_0$



CSIEB0100 Data Structures

Basic Concepts 61

Big Ω Examples

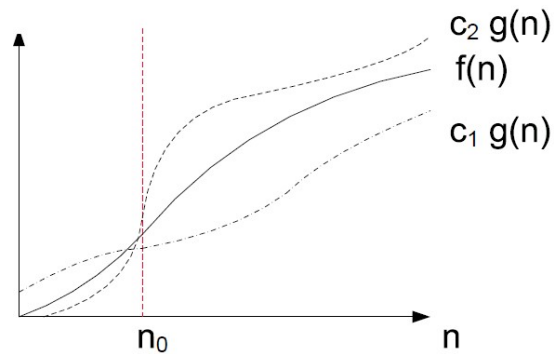
- Examples
 - $3n+3 = \Omega(n)$
 $3n+3 \geq 3n$ for all $n \geq 1$
 - $6 \cdot 2^n + n^2 = \Omega(2^n)$
 $6 \cdot 2^n + n^2 \geq 2^n$ for all $n \geq 1$
 - $3n+3 = \Omega(1)$
 $3n+3 \geq 3$ for all $n \geq 1$ (Not tight enough!)
- $g(n)$ should be a **greatest lower bound**

CSIEB0100 Data Structures

Basic Concepts 62

Asymptotic Notation – Big Θ

- $f(n) = \Theta(g(n))$ iff
- \exists two positive real constants $c_1, c_2 > 0$, and an integer constant $n_0 \geq 1$, $\exists c_1 g(n) \leq f(n) \leq c_2 g(n)$, $\forall n, n \geq n_0$



CSIEB0100 Data Structures

Basic Concepts 63

Big Θ Examples

- Examples
 - $3n+2 = \Theta(n)$
 $3n \leq 3n+2 \leq 4n$, for all $n \geq 2$
 - $10n^2+4n+2 = \Theta(n^2)$
 $10n^2 \leq 10n^2+4n+2 \leq 11n^2$, for all $n \geq 5$
- $g(n)$ should be both lower bound & upper bound

CSIEB0100 Data Structures

Basic Concepts 64

Some Rules

- **Rule 1:**

If $T_1(N)=O(f(N))$ and $T_2(N)=O(g(N))$ Then

(a) $T_1(N)+T_2(N) = \max (O(f(N)), O(g(N)))$

(b) $T_1(N)\times T_2(N) = O(f(N)\times g(N))$

- **Rule 2:**

If $T(N)$ is a polynomial of degree k , then

$T(N)= \Theta(N^k)$

Running Time Calculation

- For loop

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

```
{
```

```
    x++;
```

```
    y++;
```

```
    z++;
```

```
}
```

- $n\times 3=O(n)$

Running Time Calculation

- Nested for loops
for (i=0; i <n; i++)
for (j=0; j<n; j++)
k++;
- $n \times n = O(n^2)$

Running Time Calculation

- Consecutive statements
for (i=0; i<n; i++)
A[i]=0;
for (i=0; i<n; i++)
for (j=0; j<n; j++)
A[i]+=A[j]+i+j
- $\max(1 \times n, 1 \times n \times n) = 1 \times n \times n = O(n^2)$

Running Time Calculation

- If/Else


```
if (i>0) {
    i++;
    j++;
}
else {
    for (j=0; j<n; j++)
        k++;
}
```
- $\max(2, 1 \times n) = n$

CSIEB0100 Data Structures

Basic Concepts 69

Running Time Calculation – Recursion

```
long int F(int N)
{
    if (N<=1)
        return 1;
    else
        return N * F(N-1);
}
```

$$\begin{aligned}
 T(N) &= T(N-1) + c \\
 &= T(N-2) + 2c \\
 &\dots \\
 &= T(1) + (N-1)c \\
 &= cN - c + 1 \\
 &= O(N)
 \end{aligned}$$

CSIEB0100 Data Structures

Basic Concepts 70

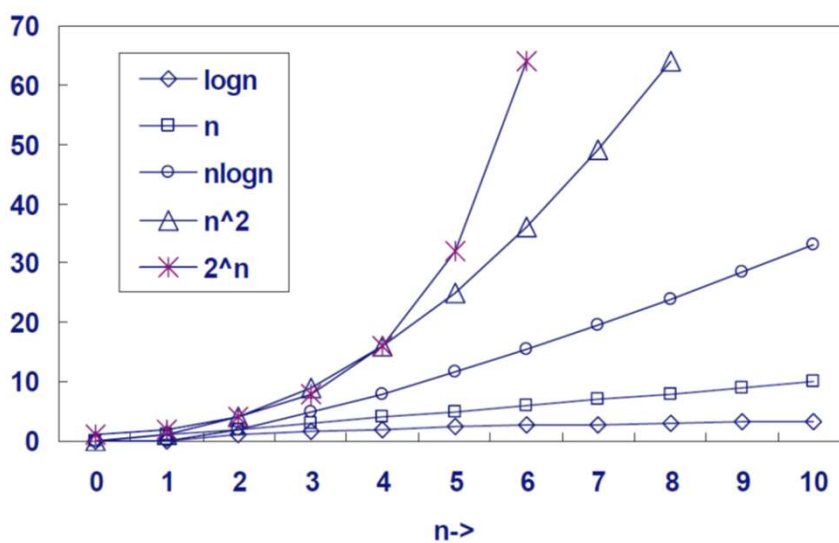
Typical Growth Rate

- c: constant
- log N: logarithmic
- $\log^2 N$: Log-squared
- N: Linear
- NlogN:
- N^2 : Quadratic
- N^3 : Cubic
- $2^N, c^N$: Exponential

CSIEB0100 Data Structures

Basic Concepts 71

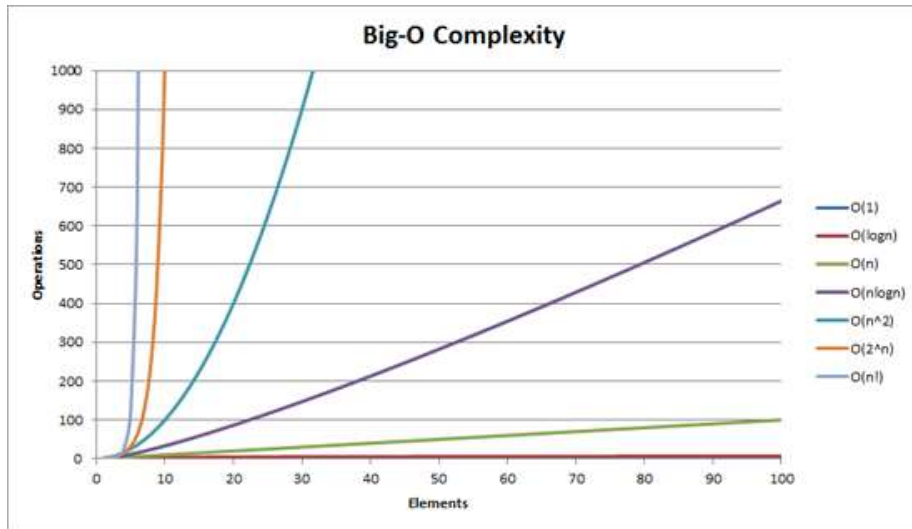
Comparison of Growth Rate



CSIEB0100 Data Structures

Basic Concepts 72

Colorful Growth Rate Comparison



CSIEB0100 Data Structures

Basic Concepts 73

Practical Complexities

10^9 instructions/second

n	n	$n \log n$	n^2	n^3
1000	1mic	10mic	1milli	1sec
10000	10mic	130mic	100milli	17min
10^6	1milli	20milli	17min	32years

CSIEB0100 Data Structures

Basic Concepts 74

Impractical Complexities

10⁹ instructions/second

n	n^4	n^{10}	2^n
1000	17min	3.2×10^{13} years	3.2×10^{283} years
10000	116 days	???	???
10^6	3×10^7 years	??????	??????

Faster Computer vs Better Algorithm



Algorithmic improvement more useful than hardware improvement.

E.g. 2^n to n^3

