

# EE3980 Algorithms

演算法

EE/NTHU

Mar. 3, 2020

## Algorithms

- An example
  - Brute-force approach
  - Improving the performance
  - Taking advantage of input sparsity
  - Improving worst-case performance
  - Average-case performance
- Course information

- Programming uses computer (or any mechanism) to solve problems:  
Given a set of input, perform necessary processing to find the right output.
- An example
  - **Problem**: find the number of 1s in a bit string.
  - **Input**:  $n$  bit binary string,  $B = b_n b_{n-1} \cdots b_2 b_1$ ,  $b_i \in \{0, 1\}$ ,  $1 \leq i \leq n$ .
  - **Output**:  $c$  is the number of 1s in  $B$ .
  - **Example**: an instance of the problem is
    - Input:  $n = 8$ ,  $B = 11010001$ .
    - Output:  $c = 4$ .
  - A brute-force approach can be used to solve this problem.

## Brute-force Approach – CountOne\_A

### Algorithm 0.0.1.

```
// Count the number of 1s in a bit string  $B$ .  
// Input:  $B = b_n b_{n-1} \cdots b_2 b_1$ , int  $n > 0$   
// Output:  $c$ , number of 1s in  $B$ .  
1 Algorithm CountOne_A( $B, n$ )  
2 {  
3      $c := 0$ ; // Init  $c$  to 0  
4     for  $i := 1$  to  $n$  step 1 do  
5          $c := c + b_i$ ; // Count every bit.  
6     return  $c$ ;  
7 }
```

- Lines 4-5, loop is executed  $n$  times
  - Loop body consists of 1 operation: addition
  - Addition is executed  $n$  times.
- A straightforward brute force approach.
  - Efficiency can be improved.

# Modified Approach – CountOne\_B

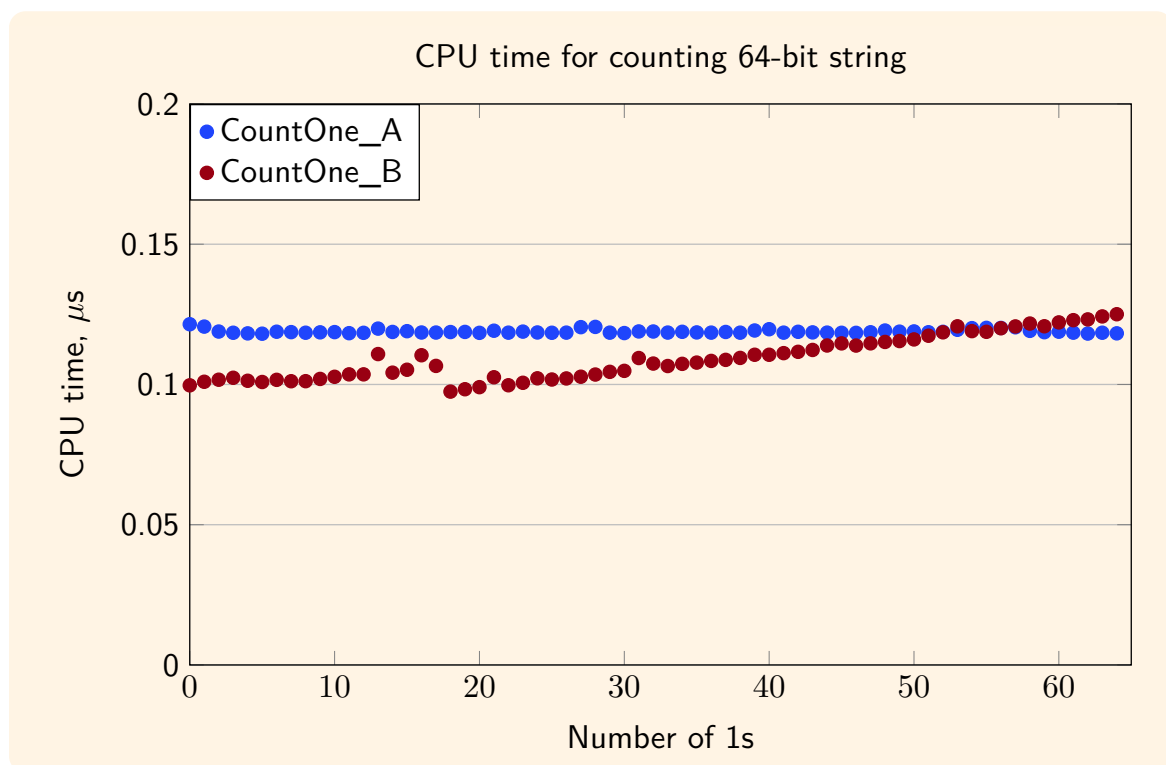
- The preceding algorithm can be modified as the following.

## Algorithm 0.0.2.

```
// Count the number of 1s in a bit string  $B$ .  
// Input:  $B = b_n b_{n-1} \cdots b_2 b_1$ ,  $\text{int } n > 0$   
// Output:  $c$ , number of 1s in  $B$ .  
1 Algorithm CountOne_B( $B, n$ )  
2 {  
3      $c := 0$ ; // Init  $c$  to 0  
4     for  $i := 1$  to  $n$  step 1 do  
5         if ( $b_i = 1$ )  $c := c + 1$ ; // Add only necessary.  
6     return  $c$ ;  
7 }
```

- Lines 4-5, loop is still executed  $n$  times
  - Loop body consists of 2 operations: equality check and addition.
  - Equality check executed  $n$  times and addition  $c$  times.
  - If addition takes more time than equality check, then CPU time can be reduced.
- This is still a brute-force approach.

## Comparing Two Approaches



- CountOne\_B is, indeed, faster for smaller  $c$ .
  - But for large  $c$ , it can be slower – worst-case scenario.

# A Better Approach – CountOne\_C

- A more efficient approach

## Algorithm 0.0.3.

```
// Count the number of 1s in a bit string  $B$ .  
// Input:  $B = b_n b_{n-1} \cdots b_2 b_1$ , int  $n > 0$   
// Output:  $c$ , number of 1s in  $B$ .  
1 Algorithm CountOne_C( $B, n$ )  
2 {  
3      $c := 0$ ; // Init  $c$  to 0  
4     while ( $B \neq 0$ ) do {  
5          $c := c + 1$ ;  
6          $B := B \& (B - 1)$ ; // Remove one 1 in  $B$ ; & is bit-wise AND  
7     }  
8     return  $c$ ;  
9 }
```

- Lines 4-7, loop is executed  $c$  times,  $c \leq n$ .
  - Loop body consists of 3 operations
    - 1 addition, 1 subtraction, 1 bitwise AND
  - If  $B$  is sparse, few 1s, then this algorithm is very efficient.
  - If  $B$  is mostly ones, then it might be slower than the preceding algorithms.

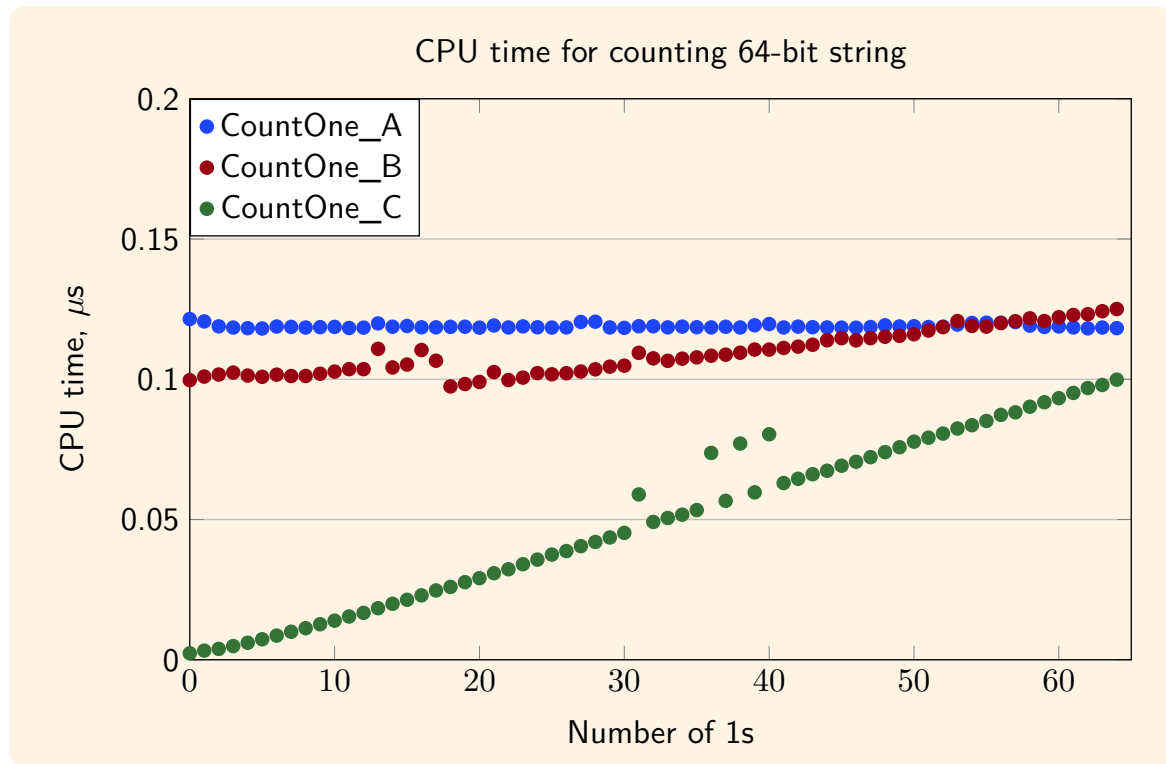
## Algorithm CountOne\_C Example

- Algorithm CountOne\_C execution example  
 $B = 1101,0001$

<b>Iteration 1</b>	<b>Iteration 3</b>
$c:$ 1	$c:$ 3
$B:$ 1101,0001	$B:$ 1100,0000
$B - 1:$ 1101,0000	$B - 1:$ 1011,1111
$B \& (B - 1):$ 1101,0000	$B \& (B - 1):$ 1000,0000
<b>Iteration 2</b>	<b>Iteration 4</b>
$c:$ 2	$c:$ 4
$B:$ 1100,0000	$B:$ 1000,0000
$B - 1:$ 1100,1111	$B - 1:$ 0111,1111
$B \& (B - 1):$ 1100,0000	$B \& (B - 1):$ 0000,0000

- Each iteration of the loop eliminates one 1 in  $B$ .

# Comparisons of First 3 Approaches



- **CountOne\_C** is shown to be the most efficient, especially for small  $c$ .
- On some computers, the worst case ( $c = n$ ) CPU time is larger than the first two approaches.

## Counting 1s in a Bit String – Algorithm D

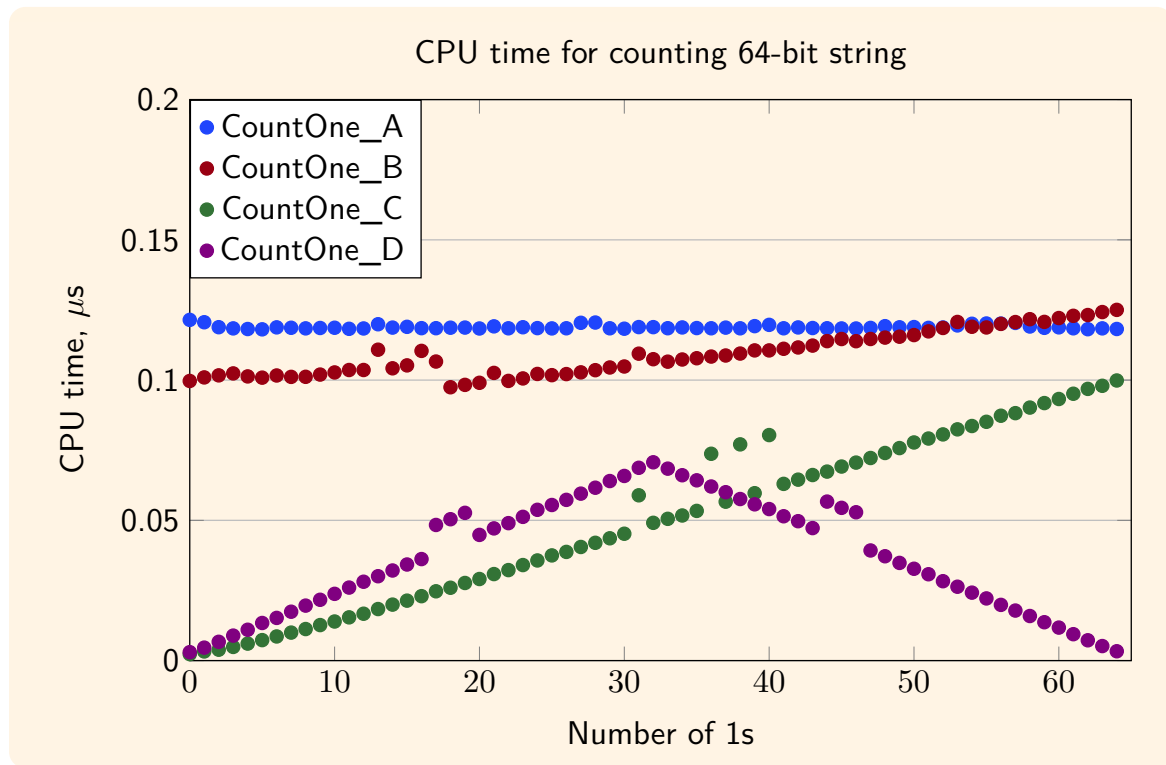
- The preceding algorithm can be modified to avoid worst-case scenario.

### Algorithm 0.0.4.

```
// Count the number of 1s in a bit string  $B$ .  
// Input:  $B = b_n b_{n-1} \cdots b_2 b_1$ , int  $n > 0$   
// Output:  $c$ , number of 1s in  $B$ .  
1 Algorithm CountOne_D( $B, n$ )  
2 {  
3    $BB := \sim B$ ; //  $BB$  is  $B$ 's complement.  
4    $c := 0$ ; // Init  $c$  to 0  
5   while ( $B \neq 0$  and  $BB \neq 0$ ) do {  
6      $c := c + 1$ ;  
7      $B := B \& (B - 1)$ ; // Remove one 1 in  $B$   
8      $BB := BB \& (BB - 1)$ ; // Remove one 1 in  $BB$   
9   }  
10  if ( $BB = 0$ )  $c = n - c$ ; // Fewer 0,  $c$  is number of 0 in  $B$   
11  return  $c$ ;  
12 }
```

- Use  $BB$  to count the number of 0s in  $B$ .
- Algorithm stops when all 1s or 0s have been counted.

# Comparisons of 4 Approaches



- `CountOne_D` appears to be the most efficient algorithm
  - Or is it?

## Analyses of `CountOne_C` and `CountOne_D`

- **Algorithm `CountOne_D`**
  - Lines 5-9, loop is executed  $\min\{c, n - c\}$  times
    - Loop body consists of 5 operations: 1 addition, 2 subtractions, 2 bit-wise ANDs
    - Maximum  $\frac{5n}{2}$  total operations
- **Algorithm `CountOne_C`**
  - Maximum  $3n$  operations
- Memory space needed
  - **Algorithm `CountOne_C`**
    - Local variable  $c$  is needed.
    - $B - 1$  needs to be stored.
  - **Algorithm `CountOne_D`**
    - Local variable  $c$  is needed.
    - $B - 1$  needs to be stored.
    - In addition,  $BB = \sim B$  and  $BB - 1$  are needed.
    - Larger memory space requirement.

# Comparison, Average-Case Performance

- Worst-case scenario, `CountOne_D` is faster than `CountOne_C`
- To compare average execution time for all possible input patterns
- Example,  $n = 4$

c	Loop iterations		Total #operations		Frequency
	<code>CountOne_C</code>	<code>CountOne_D</code>	<code>CountOne_C</code>	<code>CountOne_D</code>	
0	0	0	0	0	1
1	1	1	3	5	4
2	2	2	6	10	6
3	3	1	9	5	4
4	4	0	12	0	1
Total	32	20	96	100	16
Ave.	2	1.25	6	6.25	

- Average-case execution time
  - `Algorithm CountOne_D` is a little slower than `Algorithm CountOne_C`.
- Need to consider which scenario is more important in a real application.
  - Worst-case, average-case, or best-case CPU time.

## Most Efficiency Approach – `CountOne_E`

- A faster algorithm

### Algorithm 0.0.5.

```
// Count the number of 1s in a bit string B.
// Input:  $B = b_n b_{n-1} \cdots b_2 b_1$ ; int  $n = 2^k$ 
// Output: B, number of 1s in bit string
1 Algorithm CountOne_E(B, n)
2 {
3      $D_1 := 01010101 \cdots 0101$ ; // alternative 1 and 0.
4      $D_2 := 00110011 \cdots 0011$ ; // two consecutive bits are 1s or 0s.
5      $D_4 := 00001111 \cdots 1111$ ; // four consecutive bits are 1s or 0s.
6     .....
7      $D_k := 00000000 \cdots 1111$ ; // (n/2) 1s followed by (n/2) 0s.
8     for  $i := 1$  to  $k$  step 1 do {
9          $B := (B \& D_i) + ((B \gg 2^{i-1}) \& D_i)$ ; //  $\gg$ : right shift
10    }
11    return B;
12 }
```

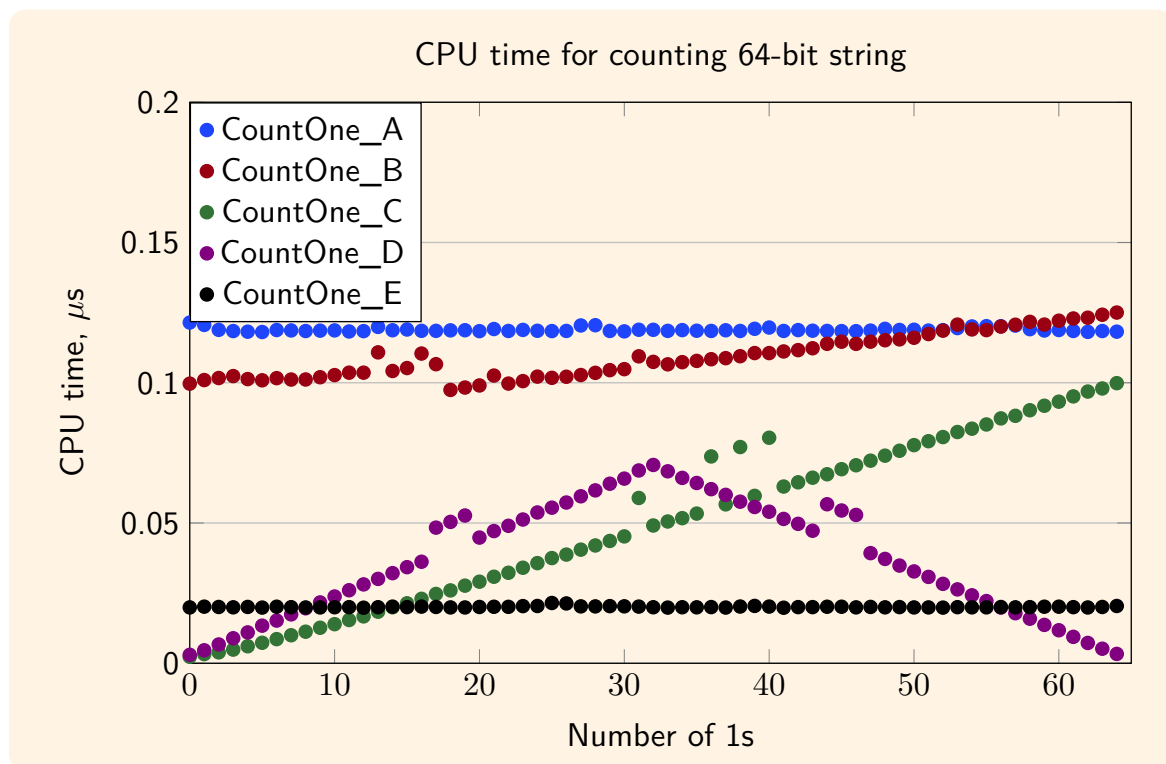


# Algorithm CountOne\_E Example

- Lines 8-10, loop is executed  $k = \lg n$  times
  - Loop body consists of 4 operations
    - 1 right-shift, 2 bitwise AND, 1 addition
- For large  $n$ , this algorithm is the most efficient
- Execution example of Algorithm CountOne\_E  
 $B = 1101,0001$

Iteration 1	1101,0001
$B \& D_1:$	0101,0001
$B \gg 1 \& D_1:$	0100,0000
$B:$	1001,0001
Iteration 2	1001,0001
$B \& D_2:$	0001,0001
$B \gg 2 \& D_2:$	0010,0000
$B:$	0011,0001
Iteration 3	0011,0001
$B \& D_3:$	0000,0001
$B \gg 4 \& D_3:$	0000,0011
$B:$	0000,0100

## Comparisons of 5 Approaches



- CountOne\_E is the most efficient and its performance is independent to the number of 1s in the bit string.



# Counting Ones in a Bit String – Summary

- Five different ways to count 1s in a bit string

Algorithm	Number of iterations	Operations per iteration	Worst-case #operations	Local memory
CountOne_A	$n$	1	$n$	$c, i$
CountOne_B	$n$	2	$n + c$	$c, i$
CountOne_C	$c$	3	$3n$	$c$
CountOne_D	$\min\{c, n - c\}$	5	$5n/2$	$c, BB$
CountOne_E	$\lg n$	4	$4 \lg n$	$i, D_1, \dots, D_k$

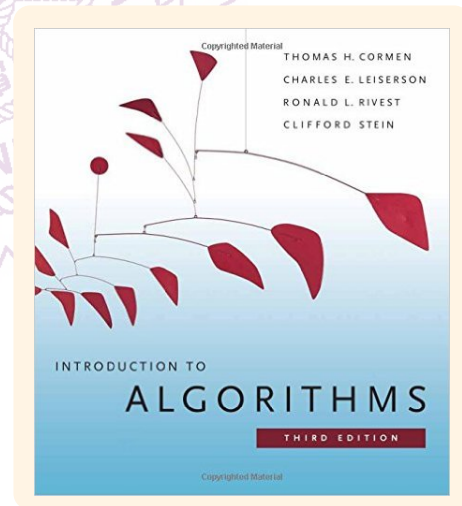
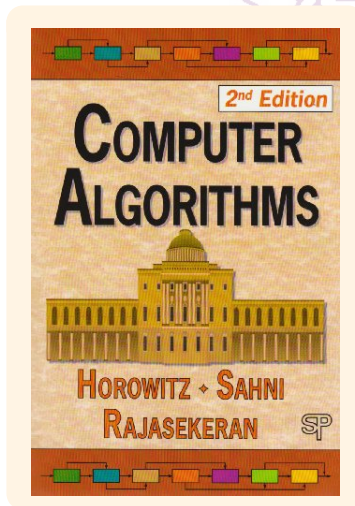
- CountOne\_D and CountOne\_E need more local memory
  - Shifted and AND results are assumed to store in registers.
- Choose the algorithm best fit for the applications.

## Study Algorithms

- Given a problem, there might be more than one way to solve it.
- Which algorithm is more efficient?
  - Time and memory space.
- Are there general methods to develop algorithms?
- Some problems have been solved, one should adopt the best approach for one's application.
- More aggressive goals
- What is the best algorithm for a particular problem?
- Can we find one, or is it possible?
- What if there is no algorithm that can solve the problem in reasonable time?

# Algorithms – Course Information

- **Class time:** T3,T4,R3: lectures and discussions.
- **Class room:** Delta 208.
- **Text books**
  - *Computer Algorithms*, by E. Horowitz, S. Sahni, and S. Rajasekeran, 2nd edition, Silicon Press, 2008.
  - *Introduction to Algorithms*, T.H. Cormen, C.E. Leiserson, R.L. Rivest, and C. Stein, 3rd edition, MIT Press, 2009.
- **Office hours:** Wednesday 10 - 11:30 AM.
  - Or by appointment (michang@ee.nthu.edu.tw).



## Algorithms – Syllabus

### Course Info

#### Unit 1. Analysis

- 1.1 Foundations
- 1.2 Analysis
- 1.3 Analysis, II
- 1.4 Mathematical backgrounds

#### Unit 2. Data structures

- 2.1 Stack and queue
- 2.2 Trees
- 2.3 Sets and graphs

#### Unit 3. Divide and conquer

- 3.1 Divide and conquer
- 3.2 Sorts
- 3.3 More on divide and conquer

#### Unit 4. Tree and graph traversal

- 4.1 Breadth first Search
- 4.2 Depth first Search

#### Unit 5. The greedy method

- 5.1 The greedy method
- 5.2 The greedy method, II
- 5.3 The greedy method, III

#### Unit 6. Dynamic programming

- 6.1 Dynamic programming
- 6.2 Dynamic programming, II
- 6.3 Dynamic programming, III

#### Unit 7. All-space searching methods

- 7.1 Backtracking
- 7.2 Branch and bound

#### Unit 8. Lower bound theory

#### Unit 9. $\mathcal{NP}$ -hard and $\mathcal{NP}$ -complete

#### Unit 10. Approximation algorithms

#### Unit 11. Randomized algorithms

#### Unit 12. Algebraic problems

- Evaluation

Category	% each	Number	Total
Homework	4	12	48
Midterm	16	2	32
Final	20	1	20
Absence	-1	-	-

- Homework:

- Could be a significant loading,
- C programming and report writing.

- Mid-term exams:

- Apr. 28,
- May 26,
- Machine tests at EECS 406

- Final exam:

- Jun. 30,
- Machine test at EECS 406

## Homework

- Homework is designed for you to practice what you have learned in class.

- Grading criteria:

- Ontime submission (20%),
  - Due on 11:59 PM of the day specified on the announcement.
- Solution correctness (50%),
- Program and report writing (30%),
  - Legibility and efficiency,
  - Clearness and logic,
  - Solution approach and comments.

- Download and submit on EE workstations.

- Discussions with classmates encouraged but no plagiarism.

- Write your own programs.

- Algorithms are solving specific problems

- They should be language independent.
- When implemented they become functions, procedures, or subroutines.
- Applicable in structure programming and object oriented programming.

- We will practice implementing algorithms in more basic C programming language.

- Programming guidelines are also the same as before.

# Handouts and Homework

- Class handouts can be found on EE workstation.
  - Download (ftp) through daisy (140.114.24.31).
  - Directory: [~ee3980/notes](#)
    - lec10.pdf,
    - lec11.pdf,
    - lec21.pdf, ...
- Homework can be found in each homework directory.
  - [~ee3980/hw01](#),
  - [~ee3980/hw02](#), ....
- Homework should be turned in on EE workstations.
- Submission command:

```
$ ~ee3980/bin/submit hw01 hw01.c hw01a.pdf
```

- To check homework or exam grades:

```
$ ~ee3980/bin/score
```