HANDONG GLOBAL UNIVERSITY

1. Basic Concepts

h. choi

hchoi@handong.edu



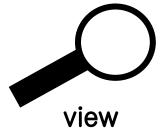
Agenda

- System life cycle
- Pointers and dynamic memory allocation
- Algorithm specification
- Recursion
- Data abstraction
- Performance analysis



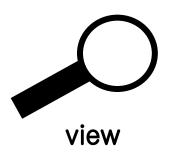
Overview

- Building a small program
 - Just do it!





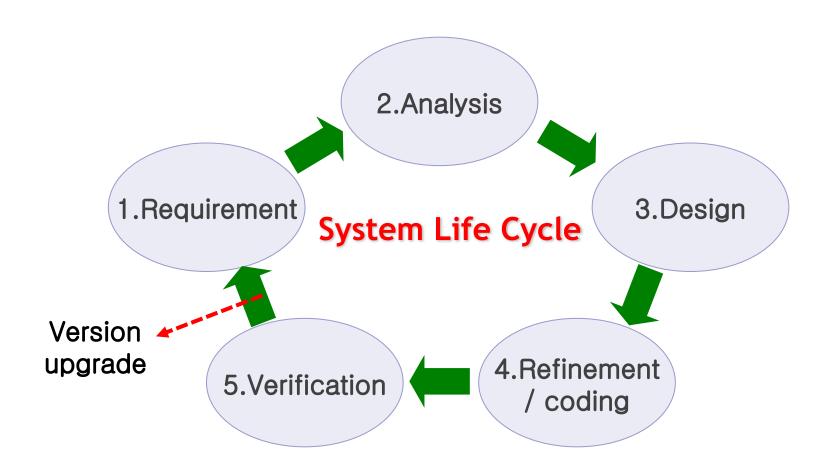
- Building a large-scale system
 - A system composed of complex interacting parts
 - Requires systematic approach and tools
 - → Objective of Data Structures



problem



System Life Cycle





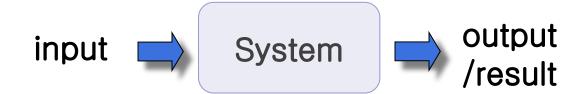
1. Requirement

Define purpose/goal of system





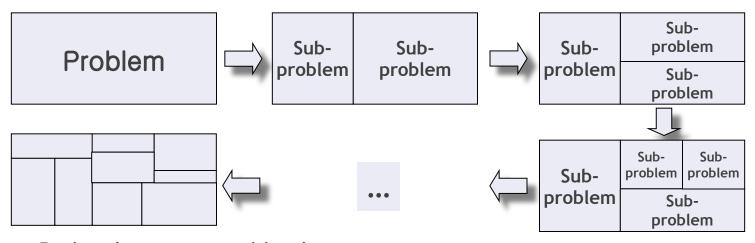
- Define input, output of system
 - Covers all cases
 - Definite/detailed description





2. Analysis

- Break down a problem into manageable pieces
 - Top-down approach: desirable
 - Purpose-driven approach



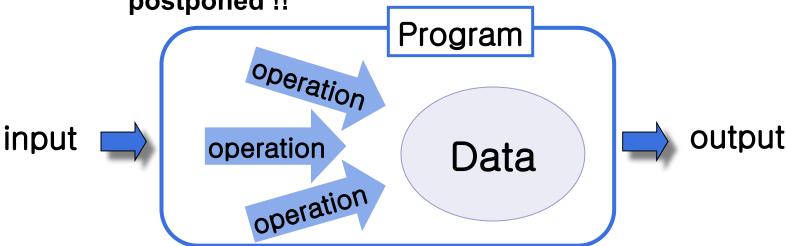
- < Broken into manageable pieces >
- cf. Bottom-up approach: old, unstructured strategy
 - Building from general walls, roof, plumbing, heating



3. Design

- Find solution from perspective of data objects and operations on them
 - Data objects: ADT (Abstract Data Type)
 - Operations: specification of algorithm
 - → If the problem is broken-down into manageable pieces, design is easy.

Note: Language dependent, implementation decisions are postponed!!





4. Refinement and Coding

- Implementation
 - Actual representations for data objects
 - Algorithms for each operation
 - → data representation first, and then algorithms
 - Refinement with data representations and algorithms
 - Coding

- Backup, and backup!
- If possible, use a version control program like github.
- Leave some comments and documentations

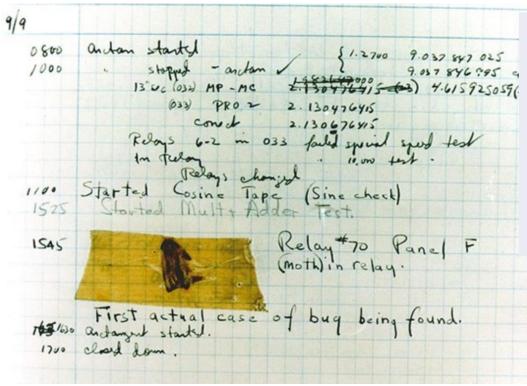


5. Verification

- Checking validity of system
 - Correctness proof (mathematical) → usually, very difficult
 - Employing proved algorithms can reduce the number of errors
 - Testing
 - with working code and well-developed test data
 - running time is another issue.
 - Error removal
 - Documentation, well-divided structure are very helpful
 - it is hard to find a tiny little thing from spaghetti
- Verification is very important for industry-strong code
 - TDD (Test-Driven Development)
 - Define test data before start to develop a system
 - A new trend of software development



"bug"



"In 1946, ... Operators traced an error in the Mark II to a moth trapped in a relay, coining the term bug.

This bug was carefully removed and taped to the log book. "

"Stemming from the first bug, today we call errors or glitches in a program a *bug*"

(from wiki)



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Memory and Variables

- Main memory
 - List of cells to store data or instruction
 - Each cell is identified by its address.

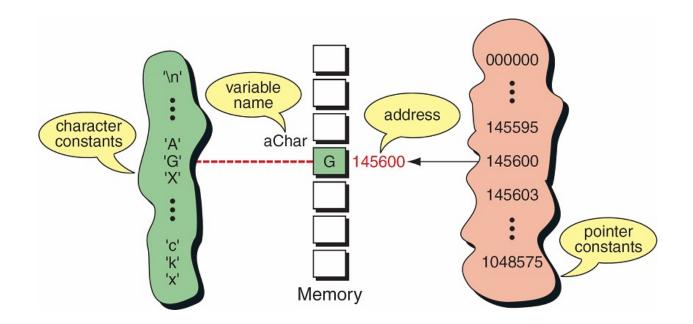
| Main memory | | | | |
|-------------|-----|--|--|-----|
| 0 | | | | ••• |
| 4 8 | | | | ••• |
| _ | | | | ••• |
| 12 | | | | ••• |
| 16 | | | | ••• |
| ••• | ••• | | | |

- Variable
 - A variable is a block of memory with a symbolic name
 Ex) int a = 100;
 - A variable has name, value(content), and address
 - A variable can store a piece of data of a particular type.



Pointers

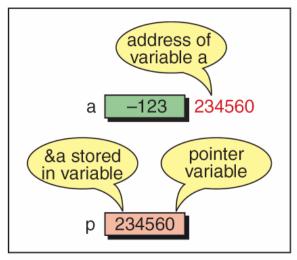
- Pointer: constant or variable that contains an address that can be used to access data
 - Range of pointer: address space of computer
 Ex) char aChar = 'G'; // assume &aChar == 1465600



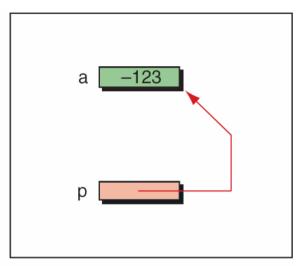


Pointer Variables

Pointer variable: a variable to store an address



Physical representation



Logical representation



Using Pointer Variables

- Declaration
 - int *pa;
- Extracting address of a variable (address operator &)
 - pa = &a;
- Dereferencing (dereferencing operator *)
 - *pa = 89;
 - c = *pa * 2;
- Address operator vs. dereferencing operator
 - & is inverse of *

```
Ex) *a \equiv a; // * and & cancel each other cf. How about &*a ?
```

- Arithmetic operations on pointers
 - addition, subtraction, multiplication, and division

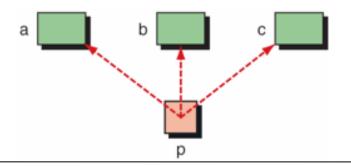


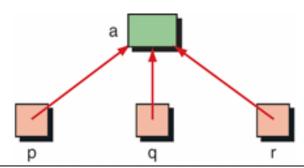
Flexibility of Pointer

Pointing different variables

Multiple pointers for a variables

p = q = r = &a;







Example



Pointers for Inter-Function Communication

Passing addresses

```
// Function Declaration
                                                           b
                                            а
void exchange (int*, int*);
                                           X7
int main (void)
  int a = 5;
 int b = 7;
 exchange (&a, &b);
 printf("%d %d\n", a, b);
  return 0;
 // main
void exchange (int* px, int* py)
                                                          &b
  int temp;
                                           px
 temp = *px;
  *px = *py;
                                          temp
  *py = temp;
  return;
 // exchange
```



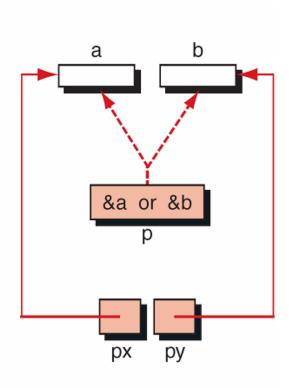
Pointers for Inter-Function Communication

Functions returning pointers

```
// Prototype Declarations
int* smaller (int* p1, int* p2);

int main (void)
...
   int a;
   int b;
   int* p;
...
   scanf ( "%d %d", &a, &b );
   p = smaller (&a, &b);
...
```

```
int* smaller (int* px, int* py)
{
  return (*px < *py ? px : py);
} // smaller</pre>
```





example

what is the output of the following code segment?
 assume that the keyboard inputs are "1 2 3 4 5"

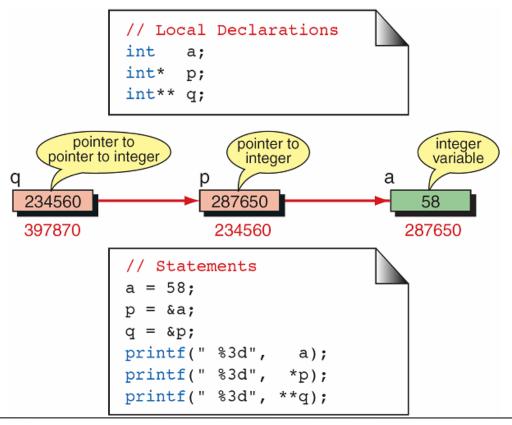
```
int main()
    int i, a[5];
    int *p=a;
    for(i=0; i<5; i++, p++)
        scanf("%d", p);
    for (i=0; i<5; i++)
        printf("a[%d]: %d\n", i, a[i]);
    return 0;
```

practice



Pointers to Pointers

- Pointer to pointer (double pointer): a pointer that points a pointer variable
 - Note! Pointer variable itself occupies memory space





Example: Double Pointers

Exchange pointer variables

```
void ExchangePointers(int **pa, int **pb){
 int *temp = *pa;
 *pa = *pb;
 *pb = temp;
int main(){
 int a = 10, b = 20;
 int *p1 = &a, *p2 = &b;
  ExchangePointers(&p1, &p2);
  printf("*p1 = %d, *p2 = %d\n", *p1, *p2);
```

practice

```
example (value, addr)

a: 10, 160 b: 20, 180

p1: 160, 240 p2: 180, 260

pa: 240, 400 pb: 260, 404
```



Pointers to Pointers

Triple pointer

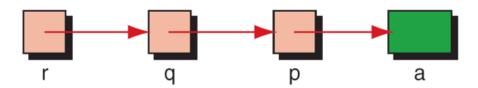
```
int a = 0;

int *p = &a; // same with int *p; p = &a;

int **q = &p;

int ***r = &q;

// Note a = *p = **q = ***r
```



Compatibility

- Pointer type compatibility
 - A pointer variable can store a pointer of the same type.

```
Ex) char c, *pc;
int a;
pc = &c; // no problem
pc = &a; // prohibited
```

- Pointer size compatibility
 - Although size of a variable vary with types, size of all pointers are the same.

```
int i, *pi;
char c, *pc;
float f, *pf;
sizeof(i) ≠ sizeof(c) ≠ sizeof(f)
sizeof(pi) = sizeof(pc) = sizeof(pf)
```



Pointer to Void

- void type pointer (void *) is just to store a generic address
 - A generic type that is not associated with a reference type
- void pointer can store any type of pointers

```
void *vp;
int a;
char c;
vp = &a;  // assigning integer pointer to vp
vp = &c;  // assigning character pointer to vp
```

- NULL pointer
 - NULL is defined by (void*)0, in stdio.h
 - Frequently used to initialize pointer variables



Pointer to Void

void pointer cannot be dereferenced as it is

```
int a = 10;
void *pVoid = &a;
*pVoid = 10; // illegal
To be dereferenced, void pointer should be casted.
```

void pointer can be dereferenced by casting

```
int a = 10;
void *pVoid = &a;
printf("*(int)pVoid = %d\n", *(int*)pVoid);
```

Arithmetic operations are not available (+, -, [], ...) why not?

```
vp = vp + 1; // error
vp[2] = 0; // error
```



- Dynamic memory allocation: acquiring memory space to store information.
 - Memory allocation using predefined allocation functions
 - Size is dynamically determined
 - Allocated from heap

```
// Local Declarations
int* x;
x = malloc(...);

Stack Heap
```



- Heap
 - Allocating memory
 - malloc() function
 - Size of memory block
 - Using memory
 - Address (pointer)
 - * or [] operator
 - Releasing memory
 - free() function
 - Address of the memory block

- Bank
 - Getting a loan
 - Loan application form
 - Amount of money
 - Using money
 - Account number
 - cash card
 - Repaying loan
 - Repayment application form
 - Borrowed money

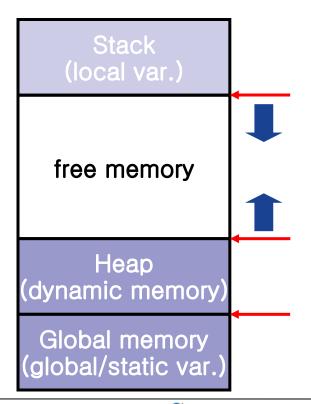


- Dynamic memory allocation: request for memory space
 - Declared in malloc.h
 - Allocation: void *malloc(size_t NBYTES);
 - Usually, size_t is defined as unsigned int
 - Deallocation: void free(void *APTR);

```
int *pi;
float *pf;
pi = (int*)malloc(sizeof(int));
pf = (float*)malloc(sizeof(float));

*pi = 1024;  // use of pi, pf
*pf = 3.14;

free(pi);
free(pf);
```





Static vs. Dynamic Memory Allocation

Singleton variable int a = 0; int *pi = &a; Singleton variable
int *pi = (int*)malloc(sizeof(int));

Array float fa[100]; float *pfa = fa; Arrayfloat *pfa =(float*)malloc(size*sizeof(float));



Static vs. Dynamic Memory Allocation

```
structure
struct Time {
    int hour, min, sec;
};

struct Time curTime;
struct Time *pCurTime =
    &curTime;

pCurTime->hour = 10;
```

```
Structure

struct Time {

int hour, min, sec;
};

struct Time *pCurTime = (struct Time*)

malloc(sizeof(struct Time));

pCurTime->hour = 10;
```



- Dynamically allocated memory can be used for any purpose.
 - Size and type should be specified properly

```
Ex) A singleton variable
    int *pi = (int*)malloc(sizeof(int));
Ex) An array
    float *pfa = (float*)malloc(size*sizeof(float));
    // similar to "float pfa[size];", but not the same
Ex) A structure variable
                                 // structure definition
    struct Time {
       int hour, min, sec;
    struct Time *pCurTime = (struct Time*)malloc(sizeof(struct Time));
                            // same with (*pCurTime).hour = 10;
    pCurTime->hour = 10;
```

Dynamically allocated memory block must be deallocated eventually



Invalid Use of Pointer

Invalid type casting

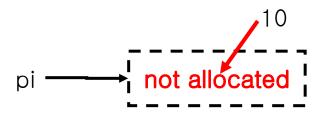
```
Ex) int i = 10;

int *pi = &i;

float *pf = (float*) pi; // semantic error
```

Unassigned pointer

```
int *pi;
// pi = (int*) malloc(sizeof(int));  // forgot
*pi = 10;  // error
```





Invalid Use of Pointer

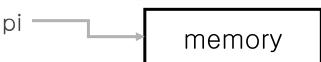
Dangling pointer a pointer that points to dynamic memory that has been deallocated int *pi = (int *)malloc(sizeof(int));

```
*pi = 10; // valid use
...
free(pi); // error: pi is already deallocated
```

Memory leak
 the loss of available memory space that occurs
 when dynamic data is allocated but never deallocated

```
int *pi;
pi = func(10);
pi[0] = 10;
...
// free(pi); // forgot
```

```
int *func(int len)
{
  int *a = malloc(len*sizeof(int));
  return a;
}
```





Safe Coding Practices

Initialize every pointer at declaration

```
Ex)
int *pi; // bad
int *pi = NULL; // good
```

Set deallocated pointer variable by NULL

```
free(pi);
pi = NULL; // free(NULL) is safe
```



string conversion

implement a function 'convert_case' to convert letter cases ex) "Hello World" → "hELLO wORLD"

```
#include <string.h>
#include <stdio.h>
                                                  practice
#include <ctype.h>
#include <stdlib.h>
#define MAX LEN 1024
char* convert case(char*);
                                           do not use any character array
int main()
                                           in convert_case()
                                           → use malloc()
    char aLine[MAX LEN];
    char *p;
    fgets (aLine, MAX LEN, stdin);
    p = convert case(aLine);
    printf("%s\n", p);
    free(p);
    return 0;
```



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- System life cycle
- Pointers and dynamic memory allocation
- Algorithm specification
- Recursion
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Algorithm Specification

- Algorithm: a finite set of instruction that accomplishes a particular task.
 - Input: zero or more quantities
 - Output: at least one quantity
 - Definiteness: clear and unambiguous instructions
 - Finiteness: for all cases, the algorithm terminates after a finite number of steps
 - Difference from program (but in this class, they are interchangeable)
 - Effectiveness: basic and feasible instructions
- Description of algorithm
 - Natural language
 - Programming language (C source code)
 - Etc.
 - Flow chart, pseudo code, ...

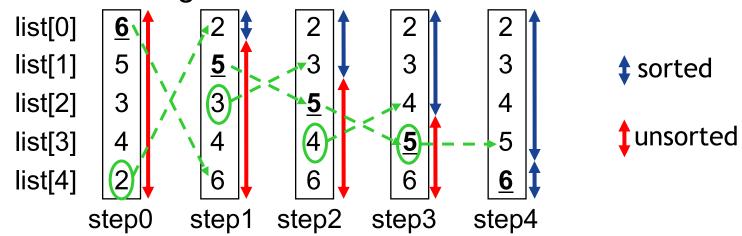


Example

- How can one put an elephant in a refrigerator?
 - Open the fridge.
 - Push the elephant into the fridge. (effective?)
 - Close the door.



- Problem definition: sort n integers
- Simple solution
 - From those integers currently unsorted, find the smallest and place it next in the sorted list.
 - → Not clearly described.
- Selection sorting





Algorithm of selection sort

```
for(i = 0; i < n; i++){
    Examine list[i] to list[n-1] and suppose the smallest integer is at list[min];
    Exchange list[i] and list[min];
} → Each step is clearly defined.</pre>
```

Implementation of selection sort in C language

```
void sort(int list[], int n)
                                                         practice
    int i = 0, j = 0, min = 0, temp = 0;
    for (i = 0; i < n - 1; i++)
         // find the minimum of list[i] through list[n-1]
         min = i;
         for (j = i + 1; j < n; j++) {
             if(list[j] < list[min])</pre>
                  min = j;
                                                   swap(&list[i], &list[min]);
         // exchange list[i] and list[min]
         temp = list[i];
                                                   void swap(int *x, int *y)
         list[i] = list[min];
         list[min] = temp;
                                                    int temp = *x;
                                                    x = v:
                                                    *v = temp;
```



how to practice?

```
#include <stdio.h>

void sort(int [], int);
int main()
{
   int aList[] = {0, 3, 1, 5, 7, 9, 2};
   sort(aList, 7);

   for(int i=0; i<7; i++)
       printf("%d ", aList[i]);

   return 0;
}</pre>
```

practice



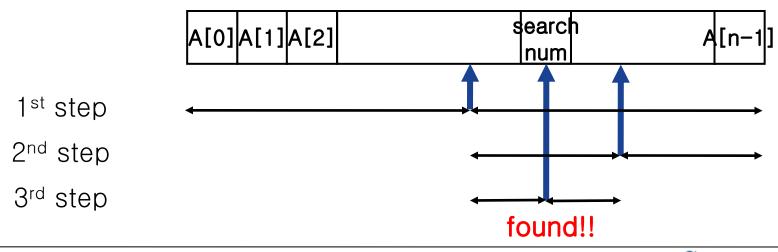
- Prove that sort(list, n) works correctly.
 - When the outer loop completes its iteration for i = q we have list[q] <= list[r], q < r < n.
 - 2. On subsequent iterations, i > q, list[0] through list[q] are unchanged.

 for any q between 0 and n-2
 - 3. So, on the last iteration of the outer loop (i=n-2), we have list[0] <= list[1] <= ... <= list[n-1].



Example: Binary Search

- Given
 - n ≥ 1 distinct integers already sorted and stored in an array A.
 - $A[0] \le A[1] \le ..., \le A[n-1]$
 - An integer to find (searchnum)
- Problem: find an index, i, such thet A[i] = searchnum.
 - If searchnum is not present, return -1.





Example: Binary Search Algorithm

- Let left and right denote the left and right ends of the list to be searched.
 - Initially, *left* = 0, *right* = n − 1
- 2. Let *middle* be the middle point of the list to be searched.
 - middle = (left + right) / 2
- 3. Compare A[middle] with searchnum
 - Case1: searchnum < A[middle]
 - If searchnum is present, it must be in the left half. [left, middle 1]
 - Therefore, set right to middle 1
 - Case2: searchnum == A[middle]
 - Searchnum is found. Return middle.
 - Case3: searchnum > A[middle]
 - If searchnum is present, it must be in the right half. [middle + 1, right]
 - Therefore, set left to middle + 1
- 4. If *left* <= *right*, go back to 2



Example: Binary Search Implementation

Binary search in C

practice

```
int binsearch(int list[], int searchnum, int left,
                                                 int right)
\{/* \text{ search list}[0] \leftarrow \text{ list}[1] \leftarrow \cdot \cdot \cdot \leftarrow \text{ list}[n-1] \text{ for }
 searchnum. Return its position if found. Otherwise
return -1 */
  int middle;
  while (left <= right) {
     middle = (left + right)/2;
     switch (COMPARE(list[middle], searchnum)) {
        case -1: left = middle + 1;
                   break;
        case 0 : return middle;
        case 1 : right = middle - 1;
  return -1;
```



Example: Binary Search Implementation

```
practice
int main()
{
    int list[] = \{1,2,3,4,5,6,7,10,11,17,20,23,25,29,31\};
                                                     // 15 items
    int target, idx;
    scanf("%d", &target);
    idx = binsearch(list, target, 0, 14);
    if (idx < 0)
        printf("there is no target\n");
    else
        printf("the target is at %d\n'', idx);
```



Example: Binary Search

COMPARE: a function to compare x and y

```
    If x < y, return -1</li>

    If x == y, return 0

    If x > y, return +1

int COMPARE(int x, int y)
   if(x < y)
    return -1;
   else if (x == y)
    return 0;
   else
    return 1;
```

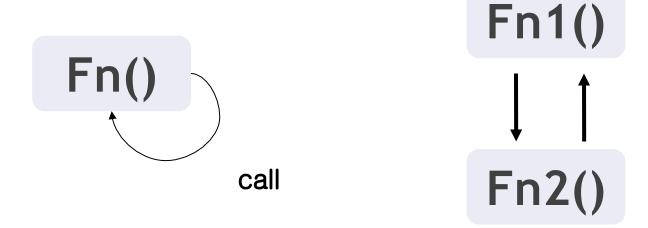
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Recursive Algorithm

Recursion: a function call to itself



< direct recursion >

- < indirect recursion >
- "Recursive definition" of recursion
 - Recursion:

see *Recursion*



Recursive Algorithm

- Why recursion?
 - Extremely powerful
 - Complex processes are often expressed in very clear terms with recursion.
- Theoretically, every iteration can be transformed to recursion and vice versa.



Recursive vs. Iterative Algorithm: Factorial

```
int Factorial(int n)
                                using a selection
{ // recursive solution
                                with less local variable.
  if (n==0) return 1;
  else
    return n*Factorial(n-1);
int Factorial(int n)
{ // iterative solution
                                using a loop
  int factor, count;
                                with more local variables.
  factor = 1;
  for(count=2;count <=n; count++)</pre>
    factor = factor * count;
  return factor;
```



Recursive Algorithm

- Problems suitable for recursion
 - Recursively defined problems: problem that can be divided into the same problem with smaller size
 - Factorial

• Factorial(x) =
$$x^*(x-1)^*(x-2)^*...*1 = x * Factorial(x-1)$$

- Fibonachi numbers
 - Fibonachi(x) = Fibonachi(x-1) + Fibonachi(x-2)
 - Fibonachi(0) = Fibonachi(1) = 1
 → termination condition
- Binomial coefficients

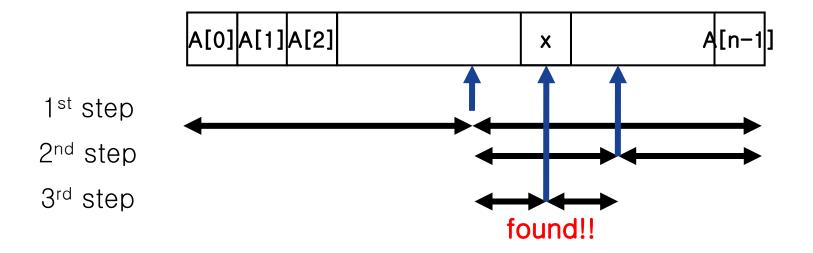
$$\left(\begin{array}{c} n \\ m \end{array}\right) = \left(\begin{array}{c} n-1 \\ m \end{array}\right) + \left(\begin{array}{c} n-1 \\ m-1 \end{array}\right)$$

$$\binom{n}{k} = \frac{n(n-1)\cdots(n-k+1)}{k(k-1)\cdots 1}$$



Example of Recursive Algorithm

- Binary search
 - Problem: find a number x from a sorted list A[]





Example of Recursive Algorithm

Recursive algorithm for binary search

```
int binsearch(int A[], int x, int left, int right)
   if(left <= right){</pre>
                                           // termination condition 1
    int mid = (left + right) / 2;
    switch(COMPARE(A[mid], x)){
      case -1: return binsearch(A, x, mid+1, right); // A[mid] < x
      case 0: return mid; // termination cond. 2, A[mid] == x
      case +1: return binsearch(A, x, left, mid-1); // A[mid] > x
   return -1;
                          practice.
```

compare this to the previous iterative version



An Example

- Given
 - An array A

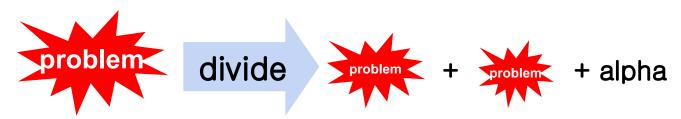
| i | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 |
|------|---|---|---|---|---|----|----|----|----|
| A[i] | 2 | 5 | 6 | 8 | 9 | 13 | 15 | 30 | 54 |

- A target number X = 8
- Procedure
 - Step1:
 - Step2:
 - Step3:



Design of Recursive Algorithm

1. Find a way to divide a problem into **<u>sub-problems whose solution</u> <u>is the same</u>** with the original problem with **<u>reduced size</u>**



- 2. Describe problem reduction algorithm with recursion
- general case

- Ex) F(n) = F(a) + F(b) + ... + some other part
 - a, b, ... should be smaller than n
- 3. Describe non-recursive solution(s) for very simple case(s) base case Ex) F(1), F(0)
 - → termination



Example: permutation generator

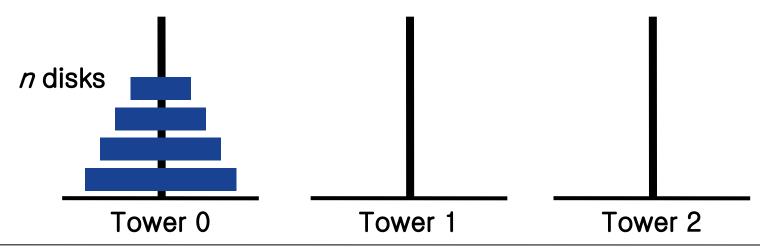
print out all possible permutations of the set (list)

```
void perm(char *list, int i, int n)
   int j, temp;
                                        - initial call
   if (i == n) {
                                        perm(list, 0, n-1);
     for (j=0; j<=n; j++)
       printf("%c", list[j]);
    printf("\n");
  else{
     for (j=i; j<=n; j++) {
       swap(&list[i], &list[j]);
       perm(list, i+1, n);
       swap(&list[j], &list[i]);
                                        practice
                                        understand how it works
```



Example: Tower of Hanoi

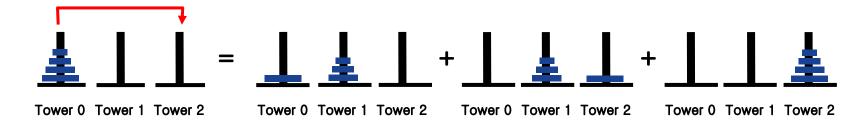
- Input
 - Three towers and *n* disks of different diameters
 - placed on the first tower in order of decreasing diameter
- Problem (mission)
 - Move all disks from the first tower to the third tower
- Restrictions
 - Only one disk can be moved at any time
 - No disk can be placed on top of a disk with a smaller diameter





Towers of Hanoi

- Non-recursive solution: difficult and complex
- Solution using recursion
 - Divide the problem into smaller problems
 - Moving n disks from tower a to tower b =
 Move n-1 disks from tower a to tower c
 - + Move 1 disk from tower a to tower b
 - + Move **n-1** disks from **tower c** to **tower b**



- Termination condition
 - If n == 1, just move a single disk from tower a to tower b



Towers of Hanoi

```
void Hanoi(int n, int begin, int aux, int end)
  if (n > 1)
    Hanoi(n-1, begin, end, aux); // from begin to aux
    Hanoi(1, begin, aux, end); // from begin to end
    Hanoi(n-1, aux, begin, end); // from aux to end
  else
   printf("move the disk in %d to %d\n", begin, end);
```

practice understand how it works



Agenda

- System life cycle
- Pointers and dynamic memory allocation
- Algorithm specification
- Recursion
- Data abstraction
- Performance analysis



Data Types

- Built-in data type of C/C++
 - Element type: char, int, float, double

```
    Collection type: array, structure, ...
        Ex) struct student {
            char last_name;
            int student_id;
            char grade;
            };
```

- Pointer type: char*, int*, void*, ...
- User defined type



Data Abstraction

- Data type: a collection of objects and a set of operations that act on those objects
 - Ex) int type
 - Object: numbers in {INT_MIN, ..., -1, 0, 1, ..., INT_MAX}
 - 16bit integer
 - INT_MIN = -32768, INT_MAX = 32767
 - 32bit integer
 - INT_MIN = -2147483648, INT_MAX = 2147483647
 - Operation: +, -, *, /, %



Data Abstraction

- ADT (Abstract Data Type): data type organized by specification of objects and specification of operation, NOT including
 - Representation of objects
 - Implementation of operation
 - Focuses on what, not how
 - Necessary for managing large, complex software projects
- Specification of operation
 - Description of what the function does.
 - names, arguments, result of each functions
 - The function call depends on the function's specification (description), not its implementation (algorithm)
 - e.g., <u>double = sqrt(double)</u>, or <u>double = pow(double, double)</u>



Example of ADT

etc

- Natural number (Nat_No)
 - Objects: integers from zero to INT_MAX
 - Functions (or operations)

```
Nat_No Zero() ::= return 0
Boolean Is_Zero(x) ::= if (x) return FALSE, else return TRUE
Nat_No Add(x, y) ::= if(x+y <= INT_MAX) return x+y else return INT_MAX</li>
Nat_No Subtract(x, y) ::= if(x < y) return 0; else return x - y;</li>
Nat_No Power(x, y) ::= if (x<sup>y</sup> < INT_MAX) return x<sup>y</sup> else return INT_MAX
```



ADT

- Why ADT?
 - Implementation-independent
- ADT frequently includes
 - Creator/constructor: create new instance
 - Transformers: create new instance from one or more other instances
 - Observers/reporters: provides information about instance
 - Destructor: discard instance of ADT (optional)
- we will discuss the specification first, then implementation



Agenda

- System life cycle
- Pointers and dynamic memory allocation
- Algorithm specification
- Recursion
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- Performance analysis



Performance Analysis

- Criteria to evaluate a program
 - Does it meet specification of the task?
 - Does it work correctly?
 - Does it contain documentation about how to use and how it works?
 - Does it effectively use functions to create local units?
 - Is the code readable?
 - Does it efficiently use primary/secondary storage?Is the running time acceptable?
 - Performance issues



Performance Evaluation

- Performance analysis
 - Mathematical analysis of algorithm
 - Complexity theory
 - Machine independent
- Performance measurement
 - Execution time on a specific computer
 - Machine-dependent



Complexities

- Space complexity of a program:
 - the amount of memory that it needs to run to completion
- Time complexity of a program:
 - the amount of computer time that it needs to run to completion



Space Complexity

- Fixed space requirements
 - Space requirement independent from number and size of input/output
 - Composed of instruction space, simple var., structures, constants
- Variable space requirements
 - Space requirement dependent on a particular instance I
 - S_p(I) Variable space requirement of a program P working on an instance I
 - $S_p(I)$ is usually a function of **characteristics** of I
 - the number, size, values of input and output
 Ex) input is an array whose size is n: instance characteristic
 - $S_p(I)$ can be replaced by $S_p(n)$ when $S_p(I)$ depends on only n
- Total space requirement $S(P) = c + S_p(I)$



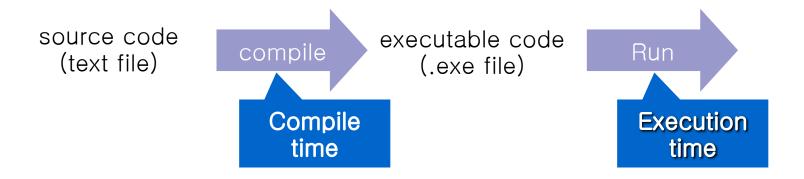
Examples

Fixed space requirement float abc(float a, float b, float c) return a+b+b*c + (a+b-c)/(a+b) + 4.00; $S_{abc}(I) = 0$ Variable space requirement float sum(float list[], int n) float tempsum = 0; int i; for(i = 0; i < n; i++)pass by value tempsum += list[i]; pass by reference return tempsum $S_{sum}(I) = S_{sum}(n) = (n \text{ in some languages like Pascal}) (0 \text{ in } C)$



Time Complexity

- Total time taken by a program P
 - T(P) = compile time + run time (execution time)
 - Compile time is not very important
 - Independent from instance characteristics
 - After development is finished, no need for recompile.
 - Run time (T_p)
 - Major target of complexity analysis





Time Complexity

However, T_p does not depend only on P

Ex)
$$T_p(n) = c_a ADD(n) + c_s SUB(n) + c_l LDA(n) + c_{st} STA(n)$$

- c_a, c_s, c_l, c_{st}: constants
- Requires knowledge about compiler and H/W

For more details, computer architecture class

- Rarely worthy
- Program step: alternative unit to measure execution time
 - Syntactically or semantically meaningful program segment,
 - whose execute time is independent of the instance characteristics

Ex) Assignment, comparison, addition, ...

$$a = 2$$

$$a = 2*b+3*c/d-e+f/g/a/b/c$$

Both assignments are just one step



Measuring # of Steps Using Step Count Variable

 Iterative summing of 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;
}</pre>
```

 Iterative version with count statements

Number of executed steps: 2n + 3





Measuring # of Steps Using Step Count Variable

Recursive version with count statements

- Number of executed steps: 2n + 2
- However, recursive version is usually slower than iterative version because of function-call overhead.



Measuring # of Steps Using Step Count Variable

Matix Addition

```
void add mat (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++){ // rows + 1
    // count++;
    for(j=0; j < cols; j++){ // rows × (cols + 1)
      // count ++;
      c[i][j] = a[i][j] + b[i][j]; // rows * cols
      // count ++;
    // count ++;
   // count ++;
// Total = 2 \times rows \times cols + 2 \times rows + 1
```



Measuring # of Steps Using Tabular Method

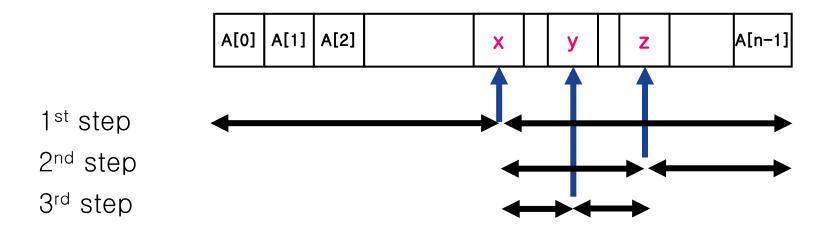
- 1. Determine **step count** for each statement (steps/execution or s/e)
- 2. Figure out number of times each statement is executed (**frequency**)
- 3. Multiply s/e by frequency to get total steps of each statement
- 4. Sum total steps of all statements

| <pre>void add_mat (int a[] [MAX_SIZE], int b[][MAX_SIZE], int c[][MAX_SIZE], int rows, int cols)</pre> | s/e | Frequency | Total Step |
|--|-----|---------------|---------------|
| { | | | |
| int i,j; | 0 | 0 | 0 |
| for (i=0; i < rows; i++) | 1 | rows+1 | rows+1 |
| for(j=0; j < cols; j++) | 1 | rows*(cols+1) | rows*(cols+1) |
| c[l][j] = a[l][j] + b[l][j]; | 1 | rows*cols | rows*cols |
| } | 0 | 0 | 0 |



Three Kinds of Steps Counts

Ex) Step count of binarysearch depends on values of search target and contents of sorted list



- Step count should be estimated for three cases
 - Best case: minimum number of steps for execution
 - Worst case: maximum number of steps for execution
 - Average case: average number of steps for execution



Limits of Step Count

- Problems of step count for performance analysis
 - Increasingly difficult
 - Exact step count is not very necessary.
 - Step count itself is not exact
- Comparing programs
 - We can say 3n+3 is faster than 100n+10.
 - But, it is difficult to compare 80n +10 to 85n or 75n +20.
- So, we need asymptotic notations



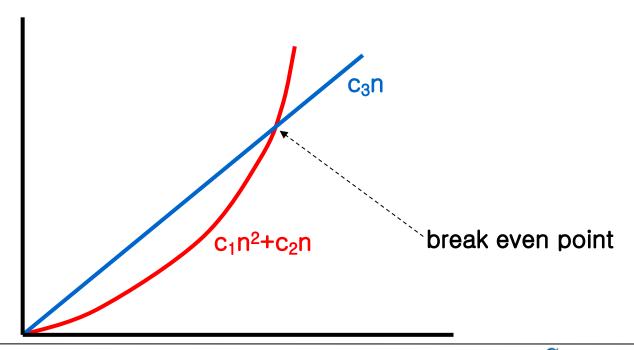
- More adequate method than step count
 - $c_1 n^2 \le T_p(n) \le c_2 n^2$ or $T_q(n,m) = c_1 n + c_2 m$
 - c₁, c₂ are non-negative constants
- We can compare c₁n²+c₂n with c₃n for sufficiently large n.
 - No mater how much c₃ is bigger than c₁ and c₂, c₁n²+c₂n > c₃n if n is very large

Ex)
$$c_1 = 1$$
, $c_2 = 2$, $c_3 = 100$

- for $n \le 98$, $c_1 n^2 + c_2 n < c_3 n$
- for n > 98, $c_1 n^2 + c_2 n > c_3 n$



- Break even point: a value of n, beyond which c₃n is always faster than c₁n²+c₂n, regardless of c₁, c₂, and c₃
 - Exact estimation of break even point is difficult and little advantage
 - Knowing whether a break even point exists is sufficient





Order of Complexities

 If the size of data is large, the order of complexity dominates the constant coefficient.

Order of complexities

```
• 3, 100, 35000, ... \rightarrow O(1)
• 2log<sub>4</sub>(n), 6log<sub>2</sub>(n), 10log<sub>8</sub>(5n) \rightarrow O(log n)
• 30n, 65n+30, 10000n + 329858, ... \rightarrow O(n)
• 9n<sup>2</sup>, 2n<sup>2</sup>+100, 582n<sup>2</sup>+28, ... \rightarrow O(n<sup>2</sup>)
• n<sup>3</sup>+130, 9n<sup>3</sup>+20, 128n<sup>3</sup>+32, ... \rightarrow O(n<sup>3</sup>)
• 2<sup>n</sup>, 5*2<sup>n</sup>, 100*2<sup>n</sup>+n<sup>3</sup>+100, ... \rightarrow O(2<sup>n</sup>)
```



Polynomial Complexities

O(n): algorithms with single loops
 for(i = 0; i < n; i++)
 sum += list[i]; // executed n times
 O(n²): algorithms with double loops
 for(i = 0; i < n; i++)
 for(j = 0; j < n; j++)
 sum += list_2D[i][j]; // executed n² times
 O(n³): algorithms with triple loops

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

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

 for(k = 0; k < n; k++)

 sum += list 3D[i][j][k]; // executed n³ times
- O(n^m): algorithms with mth order loop



Log Complexities

Ex) Worst case complexity of binary search

| n | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | ••• | 16 | ••• | 32 | ••• |
|----------------|---|---|---|---|---|---|---|---|-----|----|-----|----|-----|
| # of comp. (T) | 1 | 2 | 2 | 3 | 3 | 3 | 3 | 4 | 4 | 5 | 5 | 6 | ••• |

- $n \approx 2^{(T-1)}$
- → $T \approx \log_2 n$

Exponential Complexities

Ex) # of possible patterns using n bits

| n | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 |
|----------------------------|---|---|---|---|----|----|----|-----|-----|-----|------|------|------|
| # of possible patterns (T) | 1 | 2 | 4 | 8 | 16 | 32 | 64 | 128 | 256 | 512 | 1024 | 2048 | 4096 |

•
$$T(n) \approx 2^n$$

Upper bound complexity

Def) Big "Oh": f(n) = O(g(n)) iff there exist positive constants c and n_0 s.t. $f(n) \le cg(n)$ for all $n, n \ge n_0$

- Examples
 - 3n+2 = O(n)
 - 3n+2 < 4n for all n > 2
 - 100n+6 = O(n)
 - $100n+6 \le 101n \text{ for } n \ge 10$
 - $10n^2 + 4n + 2 = O(n^2)$
 - $10n^2+4n+2 \le 11n^2$ for $n \ge 5$
 - $6*2^n+n^2=O(2^n)$
 - $6*2^n+n^2 \le 7*2^n$ for $n \ge 4$
 - $3n+3 = O(n^2)$
 - $3n+3 \le 3n^2$ for $n \ge 2$
 - $10n^2+4n+2 != O(n)$

Note! 3n+3=O(n) $3n+3=O(n^2)$ But, $O(n) \neq O(n^2)$



Big Oh notations

- O(1): constant
- O(n): linear
- O(n²): quadratic
- O(n³): cubic
- O(2ⁿ): exponential

Comparison

$$O(1) < O(\log n) < O(n) < O(n \log n) < O(n^2) < O(n^3) < O(2^n) < O(n!)$$

Note!
$$f(n) = O(g(n))$$
 doesn't mean $g(n) = O(f(n))$



Theorem) If $f(n) = a_m n^m + ... + a_1 n + a_0$, then $f(n) = O(n^m)$

Proof

$$f(n) \leq \Sigma^{m}_{i=0} |a_{i}| n^{i}$$

$$= n^{m} \Sigma^{m}_{0} |a_{i}| n^{i-m}$$

$$\leq n^{m} \Sigma^{m}_{0} |a_{i}|, \text{ for } n \geq 1$$

$$= c n^{m}, \text{ for } n \geq 1, \text{ where } c = \Sigma^{m}_{0} |a_{i}|.$$

So,
$$f(n) \le c n^m \rightarrow f(n) = O(n^m)$$

For polynomial functions, simply find the largest degree



Lower bound complexity

Def) Omega: $f(n) = \Omega(g(n))$ iff there exist positive constant c and n_0 s.t. $f(n) \ge cg(n)$ for all $n, n \ge n_0$

Examples

- $3n+2 = \Omega(n)$
 - $3n+2 \ge 3n$ for $n \ge 1$
- $10n^2+4n+2=\Omega(n^2)$
 - $10n^2 + 4n + 2 \ge n^2$ for $n \ge 1$
- $6*2^n+n^2 = \Omega(2^n)$
- $6*2^n+n^2 = \Omega(n)$
- $6*2^n+n^2 = \Omega(1)$
- Theorem) If $f(n) = a_m n^m + ... + a_1 n + a_0$ and $a_m > 0$, then $f(n) = \Omega(n^m)$



Lower and upper bound complexity

Def) Theta: $f(n) = \Theta(g(n))$ iff there exist positive constant c_1 , c_2 and n_0 s.t. $c_1g(n) \le f(n) \le c_2g(n)$ for all $n, n \ge n_0$

Examples

- $3n+2 = \Theta(n)$
 - 3n+2 ≥ 3n for n ≥ 2 and 3n+2 ≤ 4n for all n ≥ 2
- $10n^2 + 4n + 2 = \Theta(n^2)$
- $6*2^n+n^2 = \Theta(2^n)$
- $6*2^n+n^2 \neq \Theta(n)$
- $6*2^n+n^2 \neq \Theta(1)$
- Theorem) If $f(n) = a_m n^m + ... + a_1 n + a_0$ and $a_m > 0$, then $f(n) = \Theta(n^m)$



Example: Complexity of matrix addition

Example: How about binsearch? log(n)



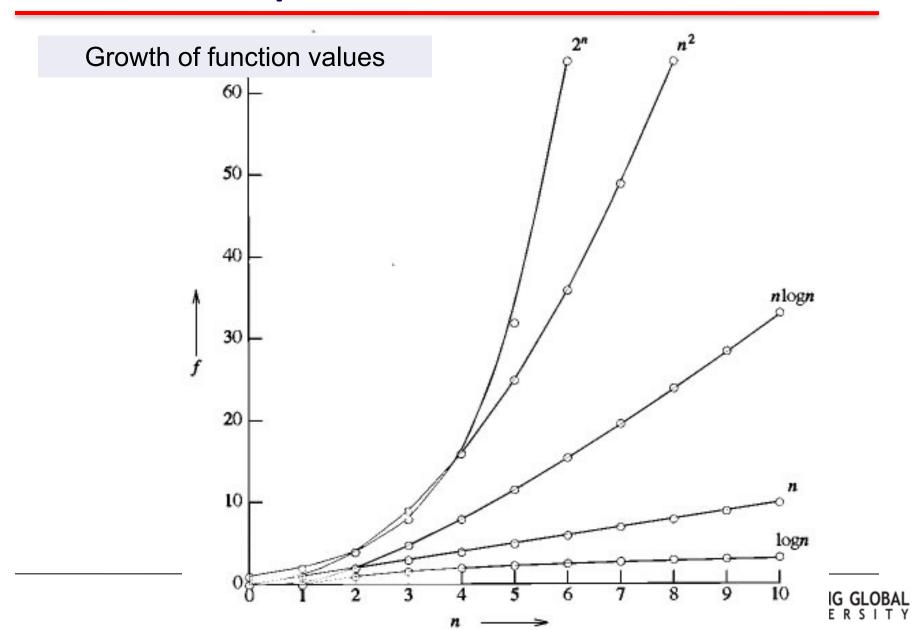
- Time complexity of a program:
 - A function of instance characteristics, e.g., f(n)
- Time complexity is useful in ...
 - Determining how the time requirements vary as the instance characteristics change
 - Comparing two programs P and Q that perform the same task
 - If P has complexity Θ (n) and Q is of complexity Θ (n²), we can assert that P is faster than Q for "sufficiently large" n



Growth of 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 | 2092278988800 | $0 26313*10^{33}$ | |





 Time needed by a 1 billion instructions per second (GIPS) computer to execute a program of complexity f(n)

| | Time for $f(n)$ instructions on a 10^9 instr/sec computer | | | | | | | | | |
|-----------|---|-------------------|------------|------------|-------------------------|--------------------------|-------------------------|--|--|--|
| n | f(n)=n | $f(n) = n \log n$ | $f(n)=n^2$ | $f(n)=n^3$ | $f(n)=n^4$ | $f(n)=n^{10}$ | $f(n)=2^n$ | | | |
| 10 | .01µs | .03µs | .lμs | 1µs | 10µs | 10sec | 1µs | | | |
| 20 | .02µs | .09µs | .4µs | 8µs | 160µs | 2.84hr | 1ms | | | |
| 30 | .03µs | .15µs | .9µs | 27μs | 810µs | 6.83d | 1sec | | | |
| 40 | .04µs | .21µs | 1.6µs | 64µs | 2.56ms | 121.36d | 18.3min | | | |
| 50 | .05µs | .28µs | 2.5µs | 125µs | 6.25ms | 3.1yr | 13d | | | |
| 100 | .10µs | .66µs | 10µs | 1ms | 100ms | 3171yr | 4*10 ¹³ yr | | | |
| 1,000 | 1.00µs | 9.96µs | 1ms | 1sec | 16.67min | 3.17*10 ¹³ yr | 32*10 ²⁸³ yr | | | |
| 10,000 | 10.00µs | 130.03µs | 100ms | 16.67min | 115.7d | 3.17*10 ²³ yr | | | | |
| 100,000 | 100.00μs | 1.66ms | 10sec | 11.57d | 3171yr | 3.17*10 ³³ yr | | | | |
| 1,000,000 | 1.00ms | 19.92ms | 16.67min | 31.71yr | 3.17*10 ⁷ yr | 3.17*10 ⁴³ yr | | | | |

Note that only programs of small complexity (such as n, n^2 , n^3) are feasible (for reasonably large n, say n > 100).



Performance Measurement

- Performance measurement: measuring execution time on an actual machine
 - Measuring time using functions in C standard library (declared in time.h)

#include <time.h>

clock(): elapsed time since the program began time(): elapsed time since Jan. 1, 1970

| | Method 1 | Method 2 |
|-------------------|---|--|
| Start timing | start = clock(); | start = time(NULL); |
| Stop timing | stop = clock(); | stop = time(NULL); |
| Type returned | clock_t | time_t |
| Result in seconds | duration = ((double)(stop- start))/CLOCKS_PER_SEC; | duration = (double)difftime(stop, start) |
| Remark | Internal processor time | Measured in second |

^{*} note: exact syntax of functions and constant varies with systems



Performance Measurement

Example: #include <time.h> int main() $clock_t start = 0, stop = 0;$ double duration = 0; start = clock(); /// ... // routines to measure execution time /// ... stop = clock(); duration = ((double) (stop – start) / CLOCKS_PER_SEC; return;



Performance Measurement

- Generating test data
 - Usually it is very difficult to generate worst-case data
 - Alternative way:
 - generate suitably large number of random test data
 - estimate the worst-case and the average-case.



questions or comments?

hchoi@handong.edu

