

Unit 1.1 Foundations

Algorithms

EE/NTHU

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What is an Algorithm

- In short, **algorithm** refers to a method that can be used by a computer for the solution of a problem.

Definition 1.1.1. Algorithm

An **algorithm** is a finite set of instructions that, if followed, accomplishes a particular task. In addition, all algorithms must satisfy the following criteria:

1. **Input.** Zero or more quantities are externally supplied.
2. **Output.** At least one quantity is produced.
3. **Definiteness.** Each instruction is clear and unambiguous.
4. **Finiteness.** If we trace out the instructions of an algorithm, then for all cases, the algorithm terminates after a finite number of steps.
5. **Effectiveness.** Every instruction must be very basic so that it can be carried out, in principle, by a person using only pencil and paper. It is not enough that each operation be definite as in criterion 3; it also must be feasible.

- **Computational procedures** have the properties of definiteness and effectiveness.
 - Operating system of a digital computer is an example.

Objectives of Studying Algorithms

- Algorithms can be implemented in different programming languages.
 - A computer program consists of one or more algorithms.
 - An algorithm can also be referred to as a **procedure**, a **function**, or a **subroutines**.
 - Each statement of an algorithm specifies unambiguous operations.
 - Algorithm should be independent to programming languages.
- The **objectives** of studying algorithms
 1. How to devise algorithms?
 2. How to validate algorithms?
 3. How to analyze algorithms?
 4. How to test a program?
- A good algorithm should be efficient for that specific problem.
 - Efficient in both CPU time and storage space.

Pseudocode Convention

- Algorithms can be implemented in many different programming languages
 - In this class, we use pseudocode to describe algorithms
- Pseudocode is not as rigorous as a programming language
 - Easier to understand by human being but still need to satisfy algorithm's requirements (definiteness, effectiveness)
- The pseudocode adopted is based on **C** language
 - **Comments**: begin with `//` and continue until the end of a line.
 - **Statement**:
 - Simple statements followed by `;`
 - Compound statements are grouped within `{` and `}`, also called as a **block**.
 - **Identifier** convention follows **C**
 - Basic types (int, float, char, etc) are assumed.
 - `struct` (also called **record**) can also be defined.
 - Variables are not declared.
 - Pointers to **struct** variables and their access follow **C** convention.
 - **Assignment**: `variable := expression;`
 - **Boolean** values: `true` and `false` exist
 - So are logical operators: `and`, `or` and `not`
 - And relational operators: `<`, `≤`, `=`, `≥`, and `>`.

Loops in the Pseudocode

- **Arrays** postfixed by $[]$.
 - Two dimensional arrays accessed by $A[i, j]$.
 - **Array indexing starts from 1** (Thus, $A[0]$ is usually not defined).
- Loops in the pseudocode are
- **while** loop (*condition* is a boolean expression)

```
while condition do {  
    statement 1 ;  
    ⋮  
    statement n ;  
}
```

- **repeat-until** loop

```
repeat {  
    statement 1 ;  
    ⋮  
    statement n ;  
} until condition;
```

for Loop

- **for** loop

```
for variable := value1 to value2 step svalue do {  
    statement 1 ;  
    ⋮  
    statement n ;  
}
```

- Note that "**step svalue**" is optional with *svalue* default to +1
- The **for** loop above is equivalent to the **while** loop below

```
variable := value1;  
while (variable - value2) × svalue ≤ 0 do {  
    statement 1 ;  
    ⋮  
    statement n ;  
    variable := variable + svalue;  
}
```

- **return** exits from a function or an algorithm.

Conditional Statements and I/O

- A conditional statement has the following forms:

```
if condition then statement ;  
if condition then statement 1 ; else statement 2 ;
```

- Cascaded-if can be written as

```
switch (variable) {  
    case condition 1: statement 1 ;  
    :  
    case condition n: statement n ;  
    default: statement n + 1 ;  
}
```

- Input and output of an algorithm are specified by `read` and `write` statements.
 - No format is needed for either statement.
- An `error` function is included to handle exception cases (error handling).

Algorithm Declaration

- An algorithm consists of a heading and a body. The heading has the form:

```
Algorithm Name(parameter list)
```

- **Name** is the name of the algorithm and *parameter list* is all the parameters.
 - Simple variables to the algorithm are **passed by value** or **reference**.
 - Arrays and structures are passed by reference.
- Body of the algorithm has one or more statements enclosed by `{` and `}`.
- A pseudocode example

Algorithm 1.1.2. Max

```
// Find the largest element in  $A[1 : n]$ .  
// Input:  $A[1 : n]$ , int  $n$   
// Output:  $\max A[i]$ ,  $1 \leq i \leq n$   
1 Algorithm Max( $A, n$ )  
2 {  
3      $Result := A[1]$ ; // Initialize Result.  
4     for  $i := 2$  to  $n$  do // Loop though all elements.  
5         if ( $A[i] > Result$ ) then  $Result := A[i]$ ; // Record the larger one.  
6     return  $Result$ ; // Done.  
7 }
```

Algorithm Example, Selection Sort

- Sorting problem as an example.
 - To sort an array $A[1 : n]$ into nondecreasing order.
 - **Approach:** From those elements that are currently unsorted, find the smallest one and place it next in the sorted list.

Algorithm 1.1.3. Selection Sort.

```
// Sort the array  $A[1 : n]$  into nondecreasing order.
// Input:  $A[1 : n]$ , int  $n$ 
// Output:  $A$ ,  $A[i] \leq A[j]$  if  $i < j$ .
1 Algorithm SelectionSort( $A, n$ )
2 {
3     for  $i := 1$  to  $n$  do { // for every  $A[i]$ 
4          $j := i$ ; // Initialize  $j$  to  $i$ 
5         for  $k := i + 1$  to  $n$  do // Search for the smallest in  $A[i + 1 : n]$ .
6             if ( $A[k] < A[j]$ ) then  $j := k$ ; // Found, remember it in  $j$ .
7          $t := A[i]$ ;  $A[i] := A[j]$ ;  $A[j] := t$ ; // Swap  $A[i]$  and  $A[j]$ .
8     }
9 }
```

Selection Sort — Correctness

Theorem 1.1.4.

Algorithm **SelectionSort**(A, n) correctly sorts a set of $n \geq 1$ elements; the result remains in $A[1 : n]$ such that $A[1] \leq A[2] \leq \dots \leq A[n]$.

Proof. For any i , $1 \leq i \leq n$, lines 4-7 select the smallest element among $A[i : n]$ and place it to $A[i]$, thus, $A[i] < A[j]$ for $j > i$.

In addition, these operations does not affect $A[1 : i - 1]$, which is already arranged in nondecreasing order with value less than or equal to $A[i]$. Thus, when $i = n$ the entire A is arranged in the nondecreasing order. \square

- Note that the upper limit of the **for** loop in line 3 can be changed to $n - 1$ without effecting the correctness of the algorithm.
- The two examples above are both **brute-force** approach algorithms.
 - Algorithm derived from the definition of the problem.
 - You should be able to write this kind of algorithm with ease.

- A **recursive function** is a function that is defined in terms of itself.
- An **algorithm** is said to be **recursive** if the algorithm is invoked in the body of the algorithm.
 - An algorithm that calls itself is **direct recursive**.
 - An algorithm \mathcal{A} is said to be **indirect recursive** if it calls another function which in turns calls \mathcal{A} .
- A recursive function operates a finite set of objects and has the following 3 elements.
 1. **Same operation** for the set (and reduced set).
 2. It needs to terminate in finite steps, thus, the successive function calls should **reduce the size** of the set.
 3. To avoid going into infinite loop, a recursive function needs a **termination condition**.
- Using recursion, computer algorithm can be developed quickly.

Recursive Algorithm Example – factorial function

- Example of recursive function:
 - Factorial function can be defined in mathematical form as
$$\begin{aligned} n! &= 1, && \text{if } n = 1, \\ &= n \times (n - 1)! && \text{otherwise.} \end{aligned}$$
- Then the brute-force approach implementation:

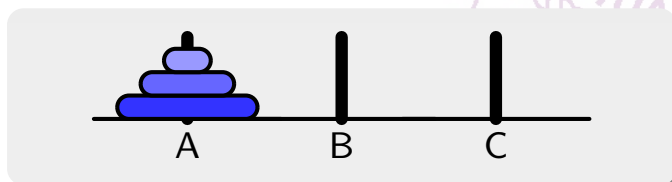
Algorithm 1.1.5. Factorial.

```
// Calculate n!.
// Input: int n ≥ 1
// Output: n!.
1 Algorithm Factorial(n)
2 {
3     if (n = 1) then return 1; // Termination check.
4     return n × Factorial(n - 1); // Recursion formula.
5 }
```

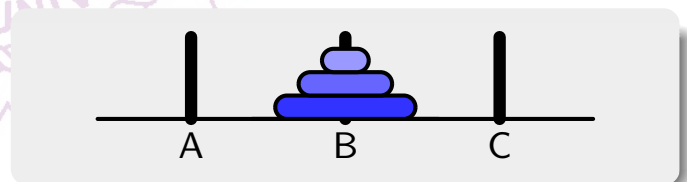
- Note that
 - **Same operation** – multiplication with result of reduced set.
 - **line 3: termination condition**,
 - **line 4: size reduction** for the next recursive call.

Tower of Hanoi

- The Tower of Hanoi consists of three rods and n disks of different radius, which can slide onto any rod. All disks are placed in a one stack in ascending order of size on one rod, the smallest at the top, originally. This entire stack is to move to another rod obeying the following rules:
 1. Only one disk can be moved at a time.
 2. Only the top disk of any stack can be moved onto another stack and placed at the top.
 3. No disk can be placed onto a smaller disk.
- Example of 3-disk Tower of Hanoi

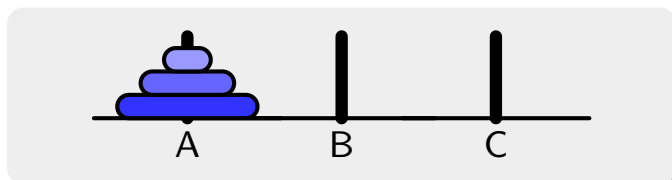


Initial condition.

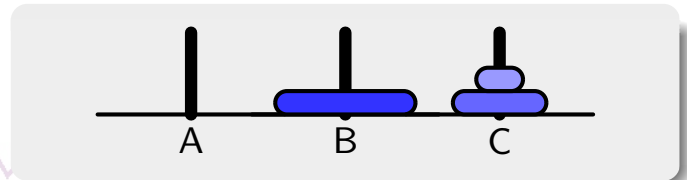


Final state.

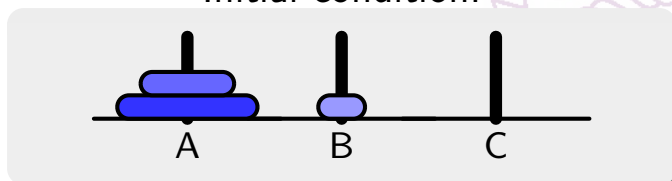
Tower of Hanoi – Solution



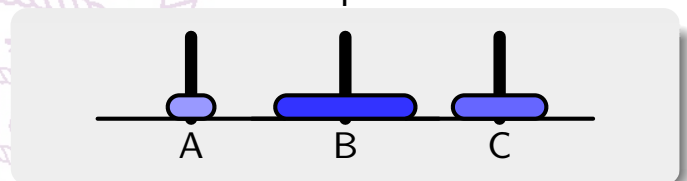
Initial condition.



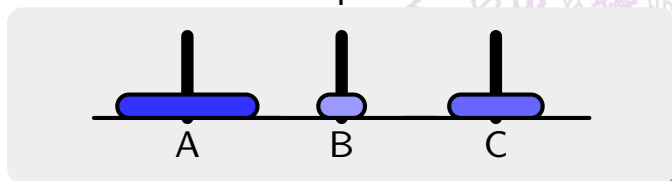
Step 4.



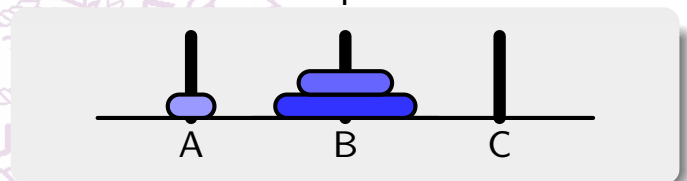
Step 1.



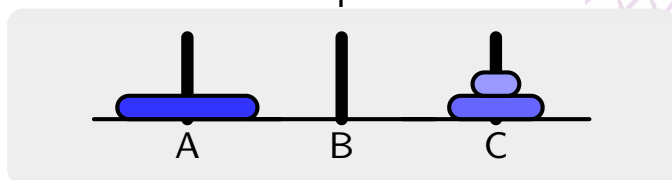
Step 5.



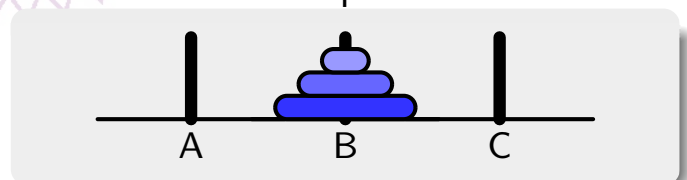
Step 2.



Step 6.



Step 3.



Step 7.

Tower of Hanoi – Algorithm

- The solution, move sequence, shown in the preceding page, is complicated to code.
- Using **recursive function** Tower of Hanoi problem can be solved easily.
- Assuming n disks to be moved.
- x , y , and z are three rods.

Algorithm 1.1.6. Tower of Hanoi.

```
// Move  $n$  disks from rod  $x$  to rod  $y$  using rod  $z$ .
// Input:  $n$  disks; rods:  $x$ ,  $y$ ,  $z$ 
// Output: Legal move sequence.
1 Algorithm TowerOfHanoi( $n, x, y, z$ )
2 {
3     if ( $n \geq 1$ ) then { // If there are disks to be moved.
4         TowerOfHanoi( $n - 1, x, z, y$ ); // move  $n - 1$  disks from  $x$  to  $z$  using  $y$ .
5         write (" Move disk",  $n$ , " from rod",  $x$ , " to rod",  $y$ );
6         TowerOfHanoi( $n - 1, z, y, x$ ); // move  $n - 1$  disks from  $z$  to  $y$  using  $x$ .
7     }
8 }
```

Tower of Hanoi – Execution

- Execution sequence of moving 3 disks.
- **TowerOfHanoi**(3, x , y , z) called from **main** function

```
TowerOfHanoi(2,  $x$ ,  $z$ ,  $y$ );
  TowerOfHanoi(1,  $x$ ,  $y$ ,  $z$ );
    TowerOfHanoi(0,  $x$ ,  $z$ ,  $y$ );
    Move disk 1 from rod  $x$  to  $y$ ;
    TowerOfHanoi(0,  $z$ ,  $y$ ,  $x$ );
    Move disk 2 from rod  $x$  to  $z$ ;
    TowerOfHanoi(1,  $y$ ,  $z$ ,  $x$ );
      TowerOfHanoi(0,  $y$ ,  $x$ ,  $z$ );
      Move disk 1 from rod  $y$  to  $z$ ;
      TowerOfHanoi(0,  $x$ ,  $z$ ,  $y$ );
      Move disk 3 from rod  $x$  to  $y$ ;
    TowerOfHanoi(2,  $z$ ,  $y$ ,  $x$ );
      TowerOfHanoi(1,  $z$ ,  $x$ ,  $y$ );
        TowerOfHanoi(0,  $z$ ,  $y$ ,  $x$ );
        Move disk 1 from rod  $z$  to  $x$ ;
        TowerOfHanoi(0,  $y$ ,  $x$ ,  $z$ );
        Move disk 2 from rod  $z$  to  $y$ ;
      TowerOfHanoi(1,  $x$ ,  $y$ ,  $z$ );
        TowerOfHanoi(0,  $x$ ,  $z$ ,  $y$ );
        Move disk 1 from rod  $x$  to  $y$ ;
      TowerOfHanoi(0,  $z$ ,  $y$ ,  $x$ );
```

- Total number of **TowerOfHanoi** calls is 15.
- Can be reduced to 7.
- Disks moved 7 times.
- Recursion depth is 4.
- Maximum number of copies of **TowerOfHanoi** function residing in the memory.

Tower of Hanoi – Description

- For the 3-disk case, as shown in the preceding figure,
 - At the end of **line 4**, disks are shown as Step 3,
 - Step 4 corresponds to **line 5**,
 - And **line 6** calls itself recursively to reach Step 7.
- Note the elements of recursion
 1. Same operation: to move bottom disk from x and y after removing the reduced set,
 2. Size reduction: must move $n - 1$ disks to z first, and then move them to y after disk n is in place,
 3. Termination condition: $n = 0$, no disk to move, no recursive call.
- To prove the correctness of Algorithm 1.1.6 note that
 1. Only one disk is moved in **line 5**.
 2. Only top disk is moved in **line 5** since all smaller disks have been moved to rod z in **line 4**.
 3. No disk is placed onto a smaller disk, since all smaller disks are moved to rod z .
 4. At the end of the algorithm, **line 6**, entire stack is moved to rod y .
- It can also be proved using induction.

Tower of Hanoi – Analysis

- The algorithm description is simple, the execution can be lengthy.
- How many times the function **TowerOfHanoi** needs to be executed?
 - Let the disks be numbered from 1 to n . Disk n is the largest disk.
 - Disk n needs to be moved only once.
 - But in order to move disk n , disk $n - 1$ needs to be moved twice.
 - Thus, disk $n - 2$ needs to be moved four times.
 - The total number of movements for n -disk problem is

$$\sum_{i=0}^{n-1} 2^i = 2^n - 1. \quad (1.1)$$

- The legend has it that when 64-disk Tower of Hanoi is solved, the world would end.
 - Do we need to worry this problem?

Permutations

- Given a set, A , of n distinct elements, then there are $n!$ permutations.
- For example, given the set $\{1, 2, 3\}$ all possible permutations are:
 - $\langle 1, 2, 3 \rangle$, $\langle 1, 3, 2 \rangle$, $\langle 2, 1, 3 \rangle$, $\langle 2, 3, 1 \rangle$, $\langle 3, 1, 2 \rangle$, $\langle 3, 2, 1 \rangle$.
- Using recursive function, all permutation can be generated easily.

Algorithm 1.1.7. Permutation.

```
// Given array  $A[1 : n]$  of distinct elements, generate all permutations.
// Input:  $A[1 : n]$ , int  $n > 0$ 
// Output: All permutations of  $A$ .
1 Algorithm Permutation( $A, k, n$ )
2 {
3     if ( $k = n$ ) then write ( $A[1 : n]$ ); // output one permutation.
4     else //  $A[k : n]$  has more permutation, generate them recursively.
5         for  $i := k$  to  $n$  do {
6              $t := A[k]$ ;  $A[k] := A[i]$ ;  $A[i] := t$ ; // Swap  $A[i]$  with  $A[k]$ .
7             Permutation( $A, k + 1, n$ ); // All permutations of  $a[k + 1, n]$ 
8              $t := A[k]$ ;  $A[k] := A[i]$ ;  $A[i] := t$ ; // Swap back  $A[i]$  and  $A[k]$ .
9         }
10 }
```

Permutation – Analysis

- A call of **Permutation**($A, 1, n$) will generate all permutations.
- Note that recursion elements
 1. Same operation: swap elements in line 6.
 2. Reduction in size: permute $k + 1$ to n subarray, in line 7.
 3. Termination condition in line 3.
- Number of operations for **Permutation**($A, 1, n$)
 - The recursion depth is n .
 $\text{Permutation}(A, 1, n) \rightarrow \text{Permutation}(A, 2, n) \rightarrow \dots \rightarrow \text{Permutation}(A, n, n)$
 - For **Permutation**($A, 1, n$), the loop on lines 5-9 is executed $(n - k + 1)$ times.
 - Thus, the total number of operation is $n \times (n - 1) \times (n - 2) \times \dots \times 1 = n!$.
- Note that none of the swap operation exchange the same elements, thus no repeated permutation is generated.

Loops vs. Recursion

- Simple loops can be viewed as
 - Performing the same operation on a finite set.
 - Each iteration reduces the size of the set.
 - When the condition is met, the loop terminates.
- Thus, simple loops can be easily converted to a recursive function.
- Example

```
// Simple loop to get array sum.  
// Input: array A; Output:  $sum = \sum A[i]$   
1  sum := 0; // init sum to 0.  
2  for i := 1 to n do  
3      sum := sum + A[i];
```

```
// Recursive function to get array sum.  
// Input: array A; Output:  $sum = \sum A[i]$   
1 Algorithm ArraySum(A, n)  
2 {  
3     if (n = 1) return A[1];  
4     else return A[n] + ArraySum(A, n - 1);  
5 }
```

- But a recursive function has a larger execution overhead.

Recursive Algorithm Overhead

- A recursive function call need to store the following information in stack space
 - Function arguments and return address,
 - All local variables.
- If the recursion depth is R , then there are R copies of information stored.
- Thus, a recursive function has a larger execution overhead.
- Keeping the overhead in mind, recursive functions are powerful and elegant.
- Good recursive algorithms tend to
 - Short in coding
 - Easier to understand
- A good tool to solve a large number of problems.

- What is an algorithm?
- Objectives of studying algorithms
- Pseudocode conventions
- Brute force approach
 - Selection sort
 - Proof of correctness
- Recursive algorithms
 - The first method to develop an algorithm
 - Factorial function
 - Tower of Hanoi
 - Permutations

