



# Algorithms

**Introduction to Computer**

**Yu-Ting Wu**

*(with most slides borrowed from Prof. Tian-Li Yu)*

# Outline

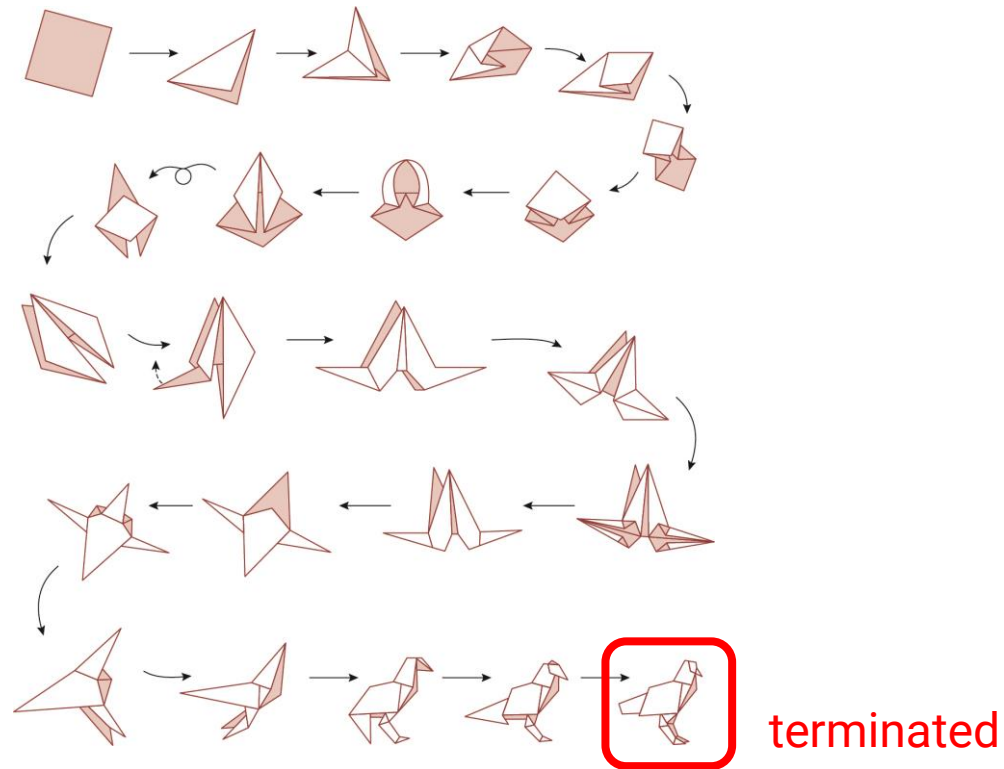
- The concept of an algorithm
- Algorithm representation
- Algorithm discovery and structures
- Efficiency and correctness

# Outline

- The concept of an algorithm
- Algorithm representation
- Algorithm discovery and structures
- Efficiency and correctness

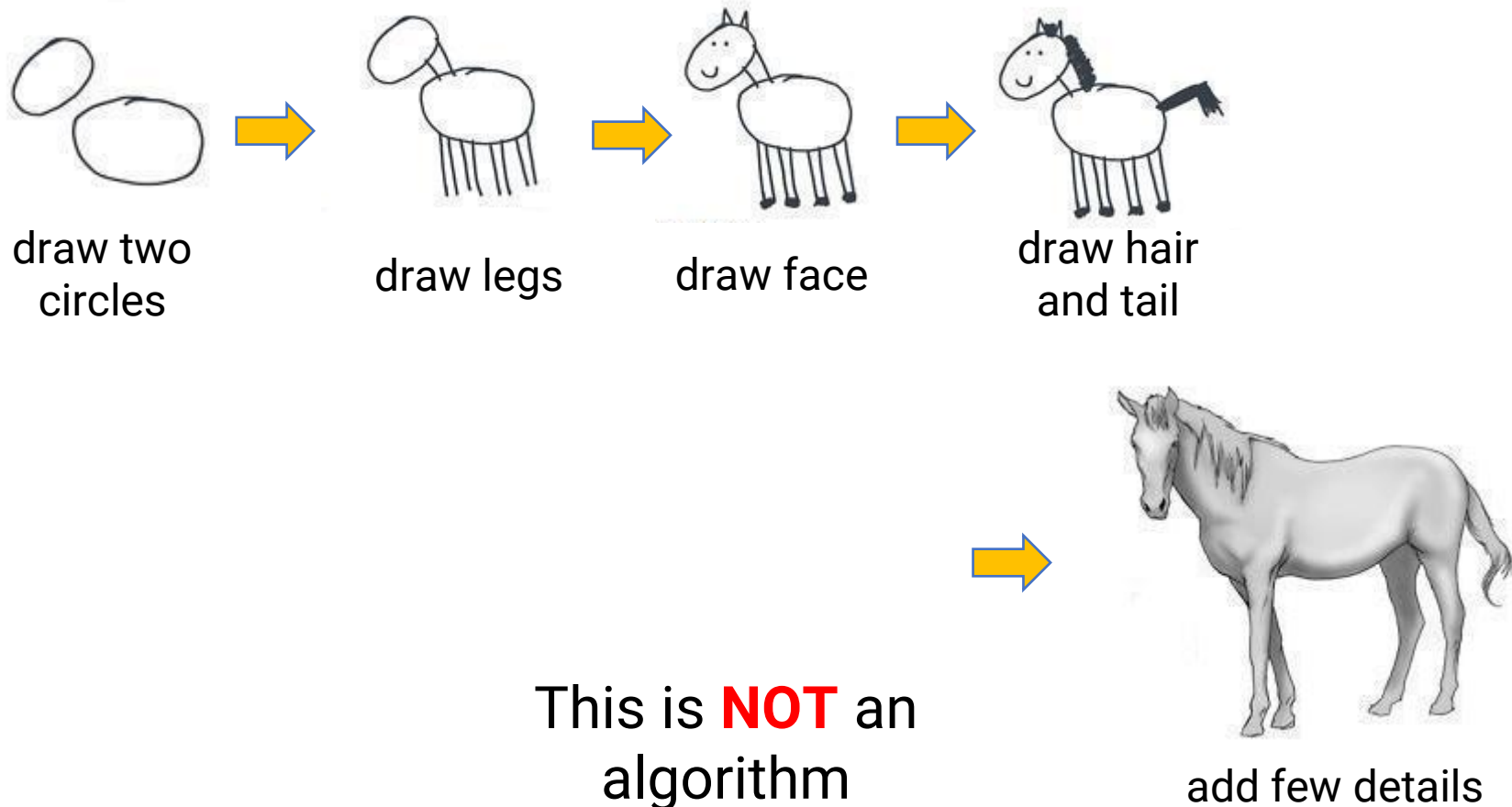
# Formal Definition of Algorithm

- An algorithm is an ordered set of **unambiguous**, **executable** steps that define a **terminating** process
- Example: an algorithm for folding a bird



# Formal Definition of Algorithm (cont.)

- How to draw a horse in five steps



# Formal Definition of Algorithm (cont.)

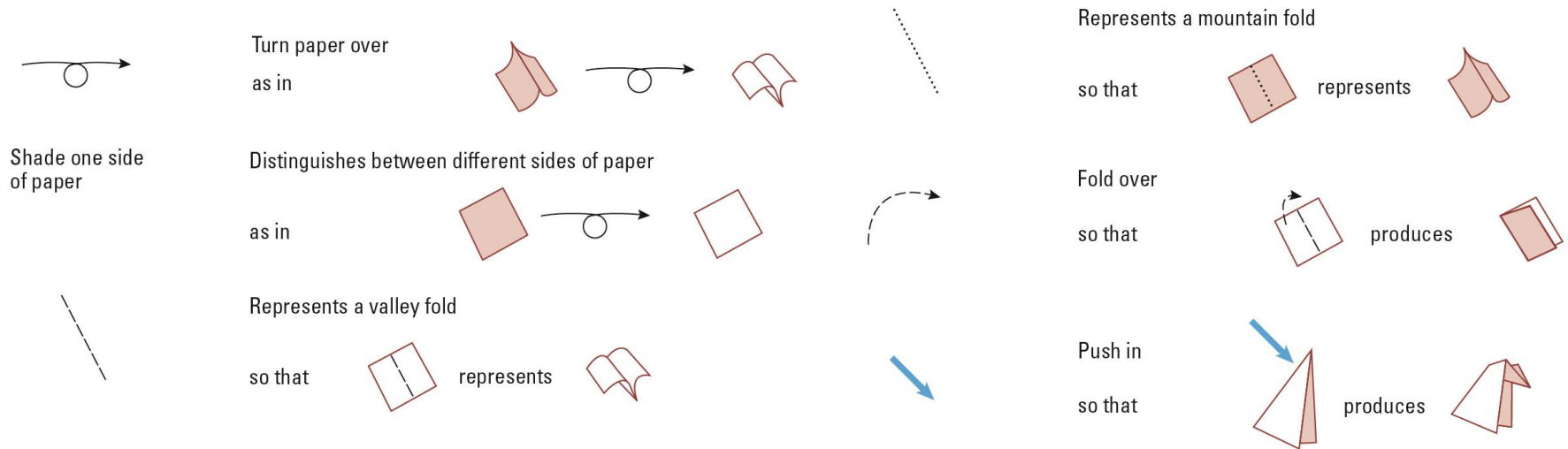
- There is a difference between an algorithm and its representation.
  - Analogy: the difference between a story and a book
- A **program** is a **representation** of an algorithm
- A **process** is the **activity of executing** an algorithm
  - **Terminating process**
    - Finish with a result
  - **Non-terminating process**
    - Do not produce an answer
    - Chapter 12: “Non-deterministic Algorithms”

# Outline

- The concept of an algorithm
- **Algorithm representation**
- Algorithm discovery and structures
- Efficiency and correctness

# Algorithm Representation (Program)

- Formally with **well-defined Primitives**

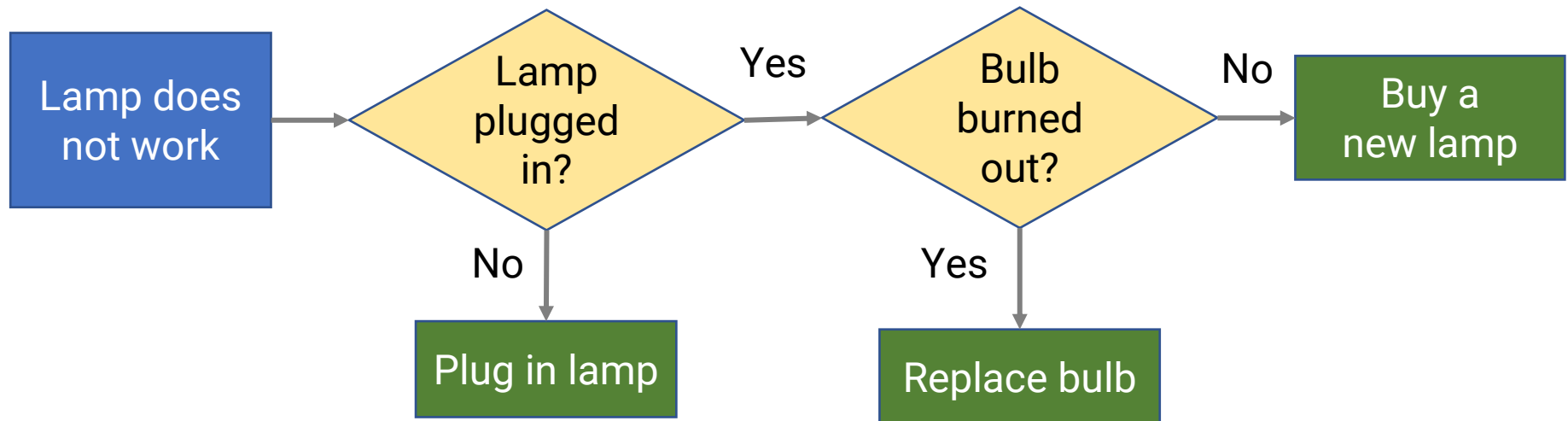


- For programs, a collection of primitives constitutes a **programming language**
  - Value assignment, conditional selection, repeated execution, ... etc.



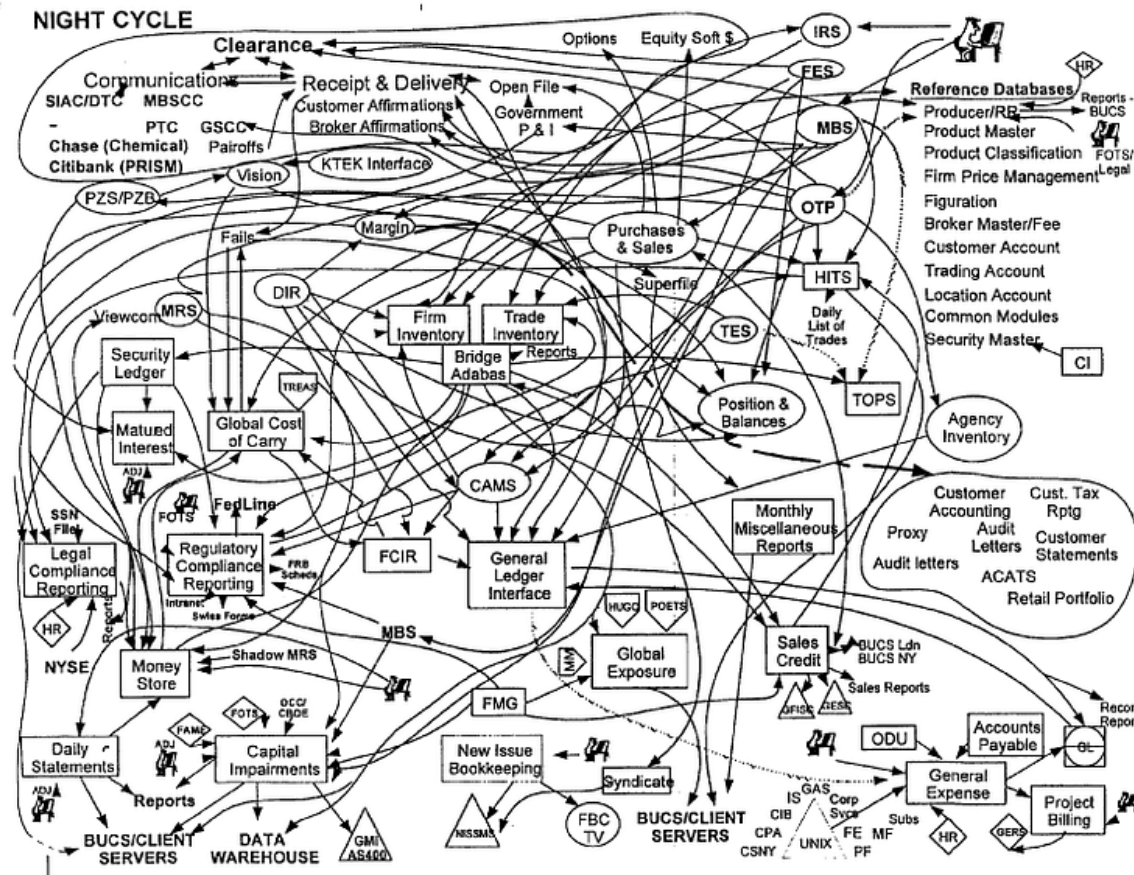
# Algorithm Representation (Program)

- Informally with **flowchart** or **pseudocode**
- **Flowchart**
  - Popular in the 50s and 60s
  - Overwhelming for complex algorithms



# Algorithm Representation (cont.)

- A very complex flowchart



# Designing a Pseudocode Language

- Informally with **flowchart** or **pseudocode**
- **Flowchart**
  - Popular in the 50s and 60s
  - Overwhelming for complex algorithms
- **Pseudocode**: a loose version of formal programming languages
  - Choose a common programming language
  - Loosen some of the syntax rules
  - Allow for some natural language
  - Use consistent, concise notation

# Pseudocode Primitives

- **Assignment**

- Name  $\leftarrow$  expression

- **Conditional selection**

- if (condition)  
then (activity)

- **Repeated execution**

- while (condition)  
do (activity)

- **Procedure**

- Procedure name

## Algorithm *Grade*

**Input:** the numeric score of each student

**Output:** a letter grade for each student

**For** (the score  $S$  of each student)

**If**  $S \geq 90$  **then**

**Return** grade A

**Endif**

**If**  $S \geq 80$  and  $S < 90$  **then**

**Return** grade B

**Else**

**Return** grade C

**Endif**

# Outline

- The concept of an algorithm
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- Algorithm discovery and structures
- Efficiency and correctness

# Polya's Problem Solving Steps

1. Understand the problem
2. Devise a plan for solving the problem
3. Carry out the plan
4. Evaluate the solution for accuracy and its potential as a tool for solving other problems



It is better to solve one problem five different ways, than to solve five problems one way.

— George Polya —

AZ QUOTES

# Problem Solving

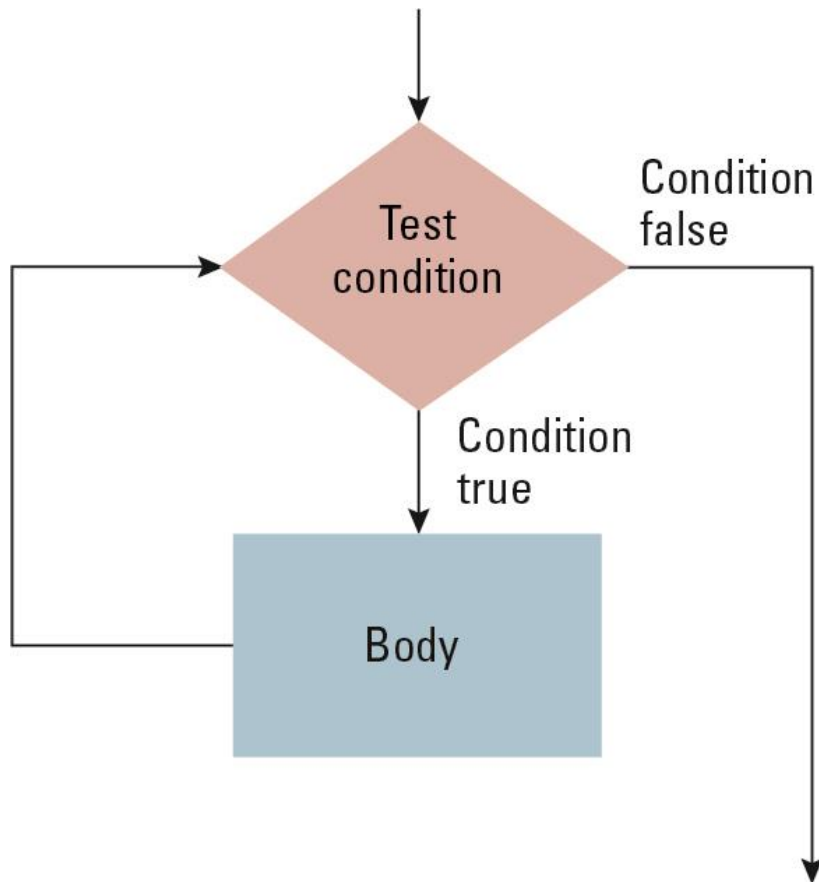
- Iterative v.s. Recursive
- Top-down v.s. Bottom-up

# Iterative Structures

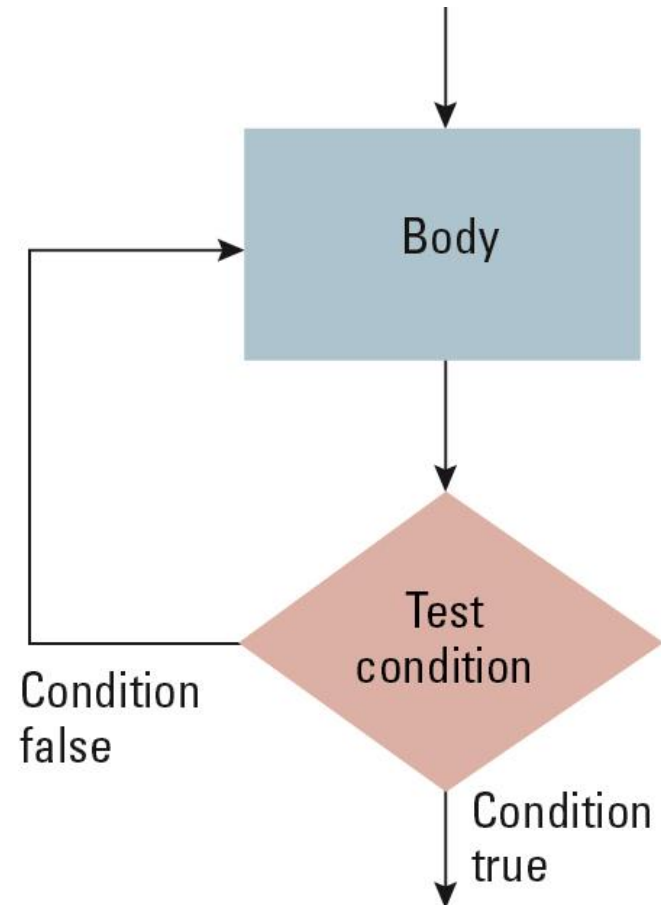
- **Loop control**
  - **Initializer**
    - Establish an initial state that will be modified toward the termination condition
  - **Test**
    - Compare the current state to the termination condition and terminate the repetition if equal
  - **Modify**
    - Change the state in such a way that it moves toward the termination condition



# Loops



**Pre-test** (while, for)



**Post-test** (do...while)

# Example: Insertion Sort



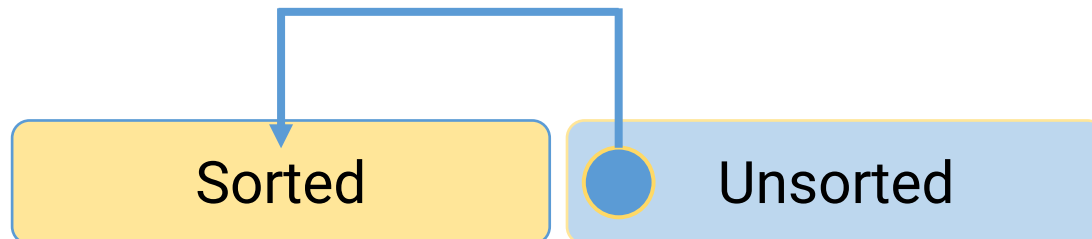
AQ**JKK**

QA**JKK**

**JQAKK**

**JQKAK**

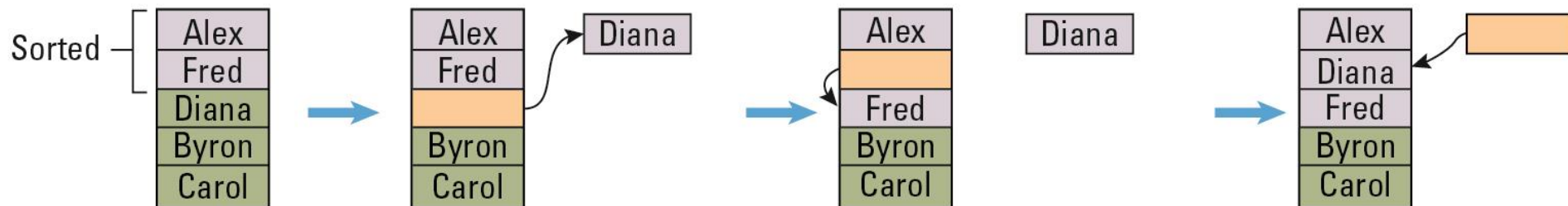
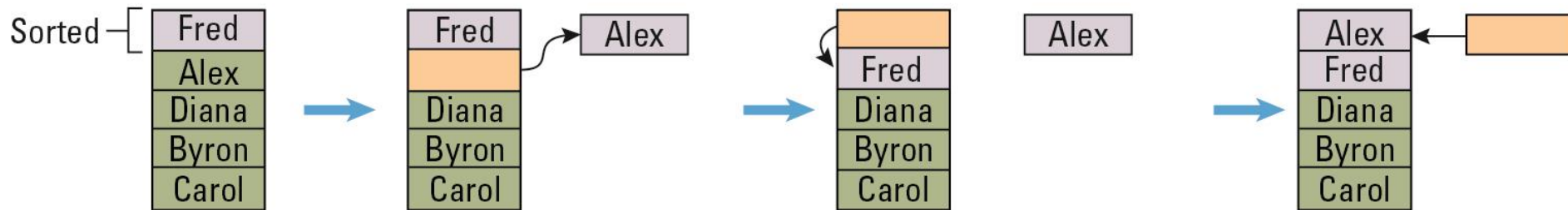
**JQKKA**



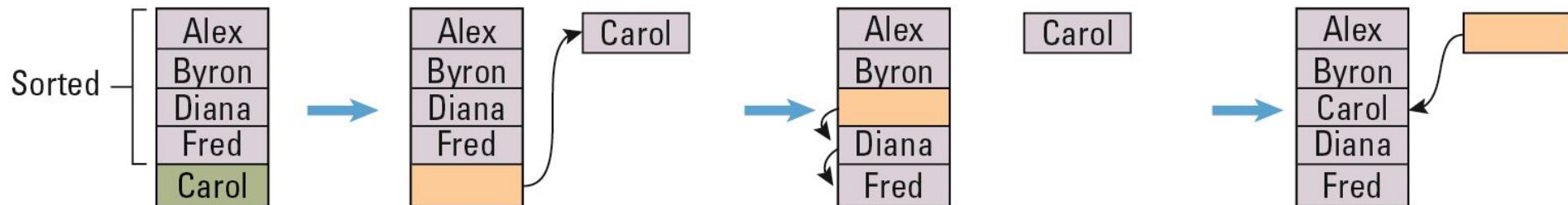
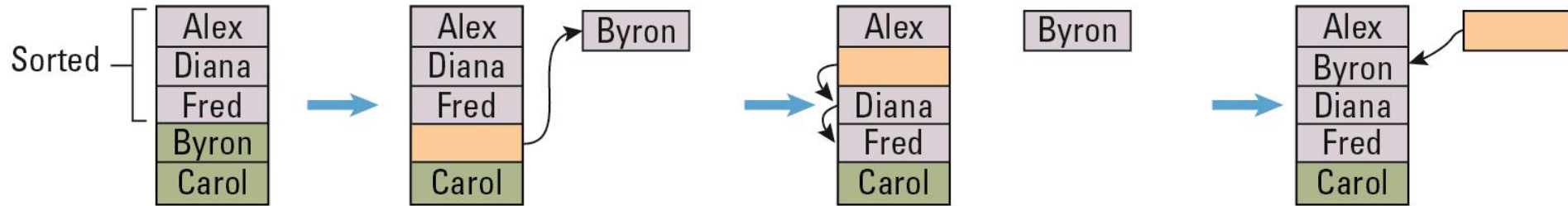
# Example: Insertion Sort (cont.)

Initial list:

Fred
Alex
Diana
Byron
Carol



# Example: Insertion Sort (cont.)



Sorted list:

Alex
Byron
Carol
Diana
Fred

## Example: Insertion Sort (cont.)

**Procedure** *InsertionSort* (*List*)

$N \leftarrow 2$

**while** (the value of  $N$  does not exceed the length of *List*) **do**

    Select the  $N$ -th entry in *List* as the pivot entry

**while** (there is a name above the hole and that name is  
        greater than the pivot) **do**

        Move the name above the hole down into the hole,  
        leaving a hole above the name

    Move the pivot entry into the hole in *List*

$N \leftarrow N + 1$

# Recursive Structures

- Repeating the set of instructions as a **subtask** of itself
- A classic example: the binary search algorithm

Is John in the array?

Original list	First sublist	Second sublist
Alice Bob Carol David Elaine Fred George Harry Irene John Kelly Larry Mary Nancy Oliver	Irene John Kelly Larry Mary Nancy Oliver	Irene John Kelly

# Binary Search Pseudo Code

**Procedure** *BinarySearch* (*List*, *TargetValue*)

**if** (*List* empty) **then**

    Report that the search failed

**else**

    Select the middle in *List* to be the *TestEntry*

    Execute the instructions below based on different cases

        case 1: *TargetValue* == *TestEntry*

            Report that the search succeeded

        case 2: *TargetValue* < *TestEntry*

            Search the portion of *List* preceding *TestEntry*

        case 3: *TargetValue* > *TestEntry*

            Search the portion of *List* succeeding *TestEntry*

**endif**

*BinarySearch*(  
    *FirstHalfList*,  
    *TargetValue*  
)

*BinarySearch*(*SecondHalfList*, *TargetValue*)

# Recursive Problem Solving

- Do not abuse recursion!
  - Calling functions takes a long time
    - Memory allocation, parameters passing ... etc.
  - Example: Factorial

```
int factorial (int x) {
    if (x == 0) return 1;
    return x * factorial(x - 1);
}
```

**recursive**

*factorial(3) =*  
*3 \* factorial(2) =*  
*3 \* 2 \* factorial(1) =*  
*3 \* 2 \* 1 \* factorial(0) =*  
*3 \* 2 \* 1 \* 1*

```
int factorial (int x) {
    int product = 1;
    for (int i = 1; i <= x ; ++i)
        product *= i;
    return product;
}
```

**iterative**



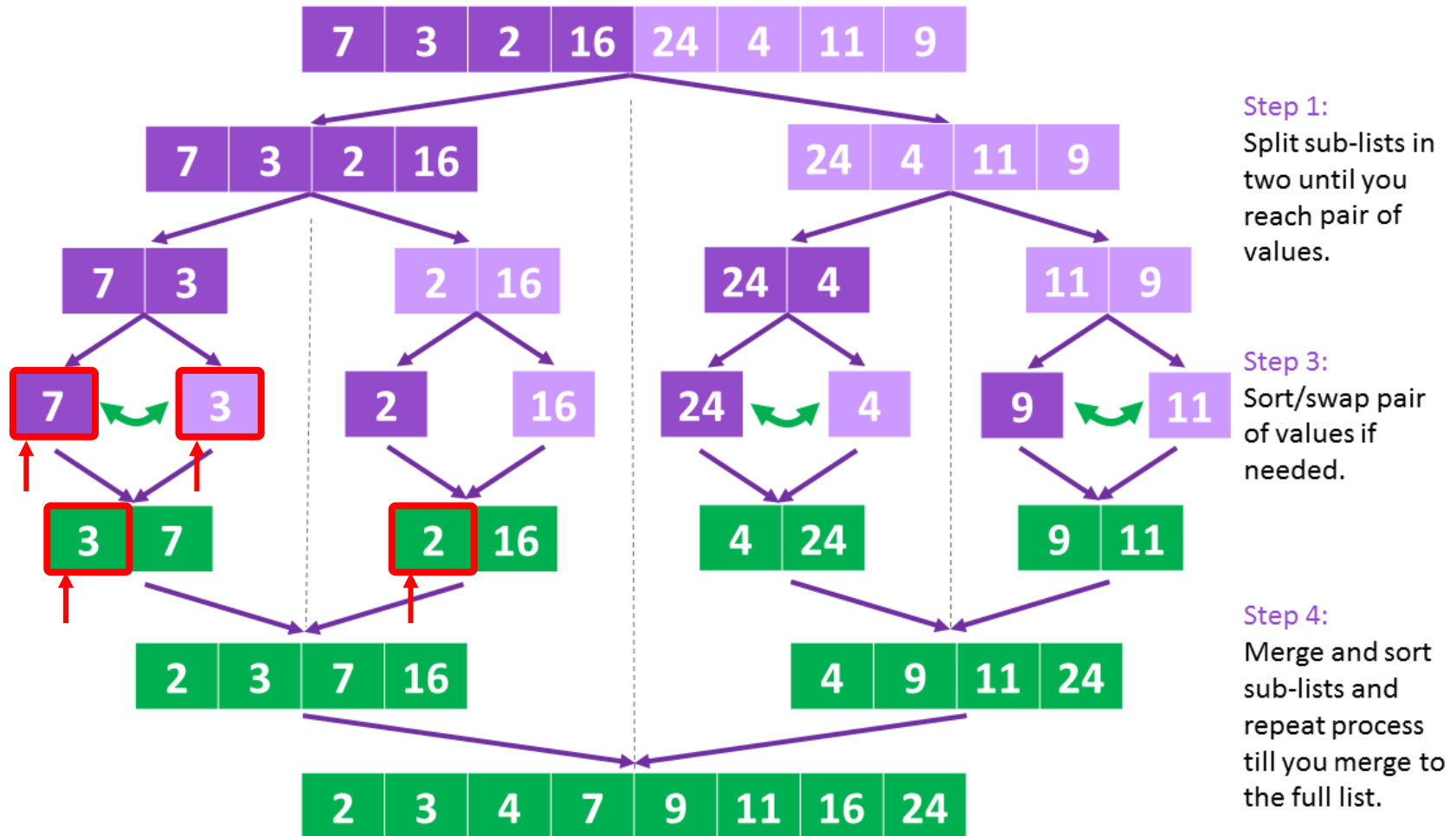
# Problem Solving (cont.)

- Iterative v.s. Recursive
- Top-down v.s. Bottom-up

# Top-down Approach

- Stepwise refinement
- **Divide and conquer (problem decomposition)**
- Examples
  - Binary search
  - Merge sort

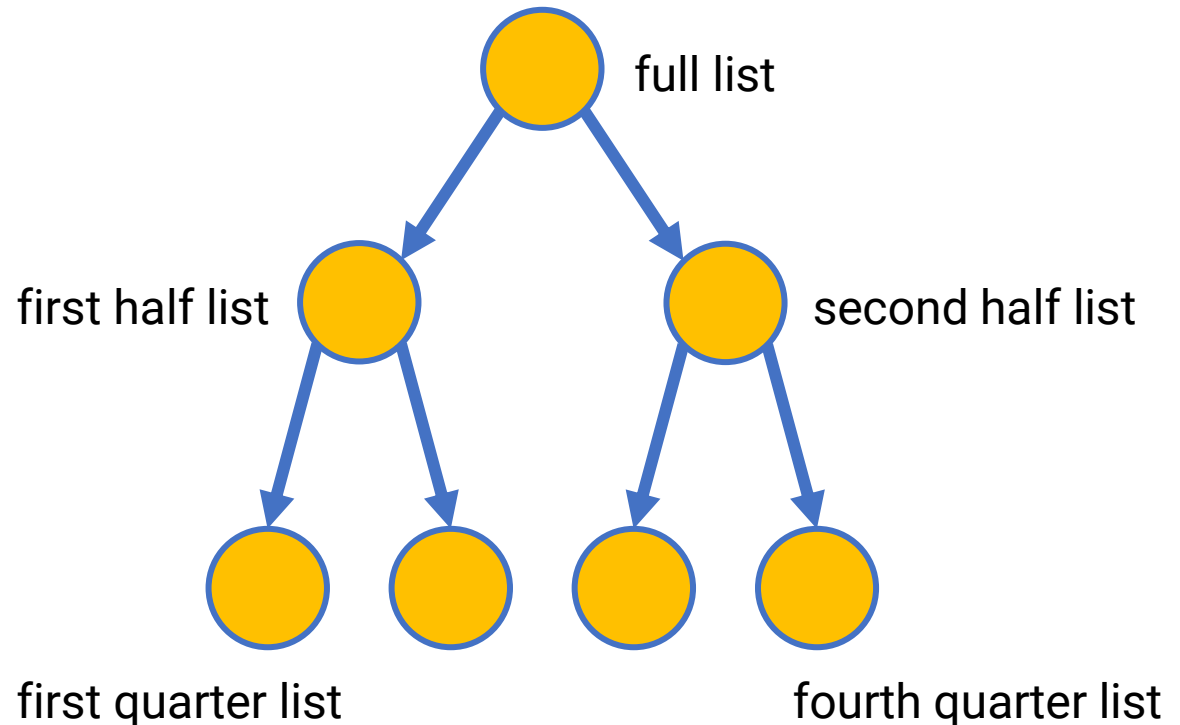
# Merge Sort



from 101 Computing.net: <https://www.101computing.net/merge-sort-algorithm/>

# Top-down Approach Review

- Stepwise refinement
- **Divide and conquer (problem decomposition)**
- Examples
  - Binary search
  - Merge sort

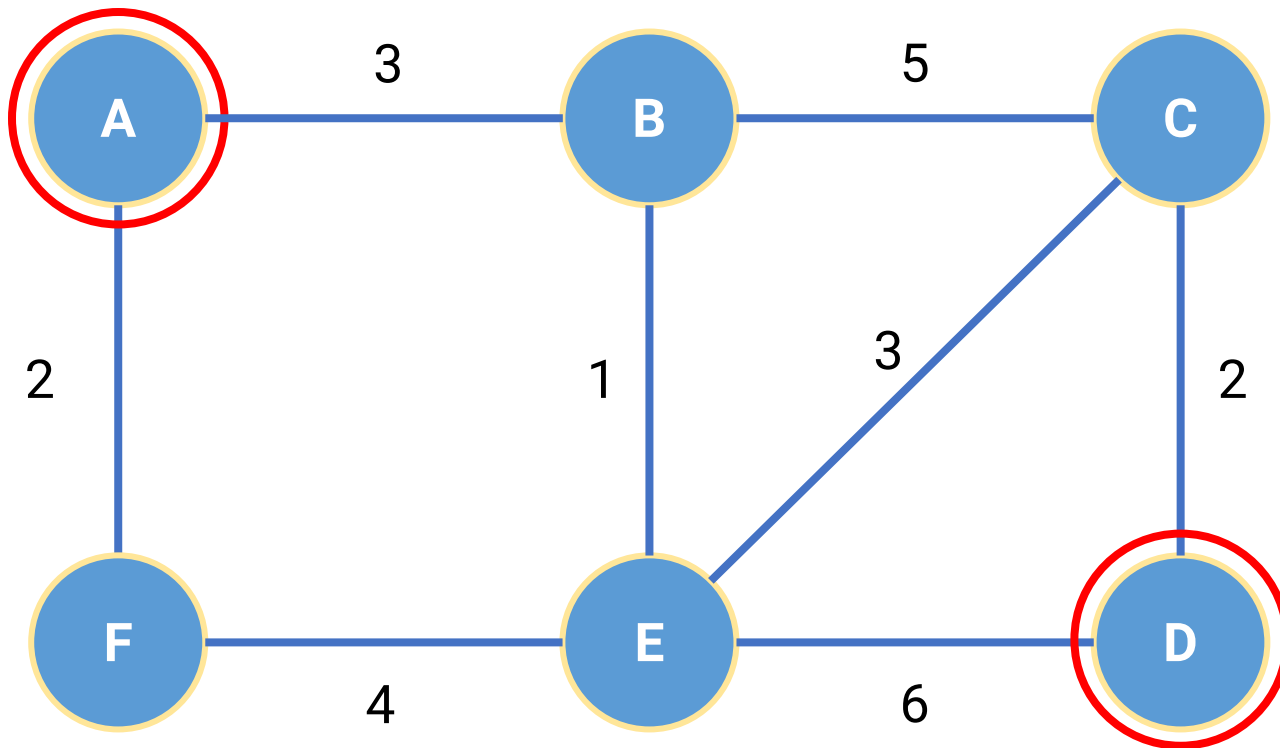


# Bottom-up Approach

- Solve pieces of the problem first
- Relax some of the problem constraints
- **Dynamic programming (DP)**
- Example
  - Shortest path

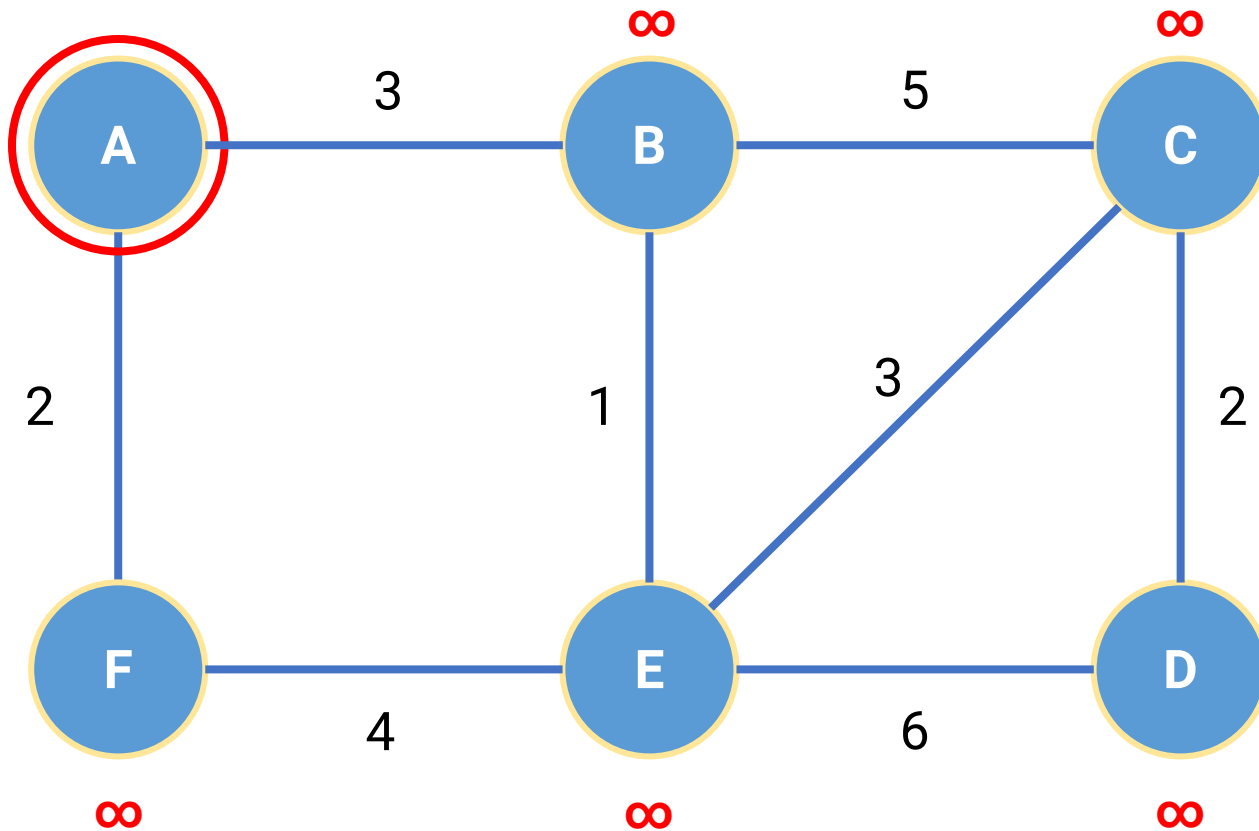
# Shortest Path

$$\text{Shortest}_{AD} = \min_{i \in \{A, B, C, D, E, F\}} (\text{Shortest}_{Ai} + \text{Shortest}_{iD})$$



# Shortest Path (cont.)

$$\text{Shortest}_{AD} = \min_{i \in \{A, B, C, D, E, F\}} (\text{Shortest}_{Ai} + \text{Shortest}_{iD})$$

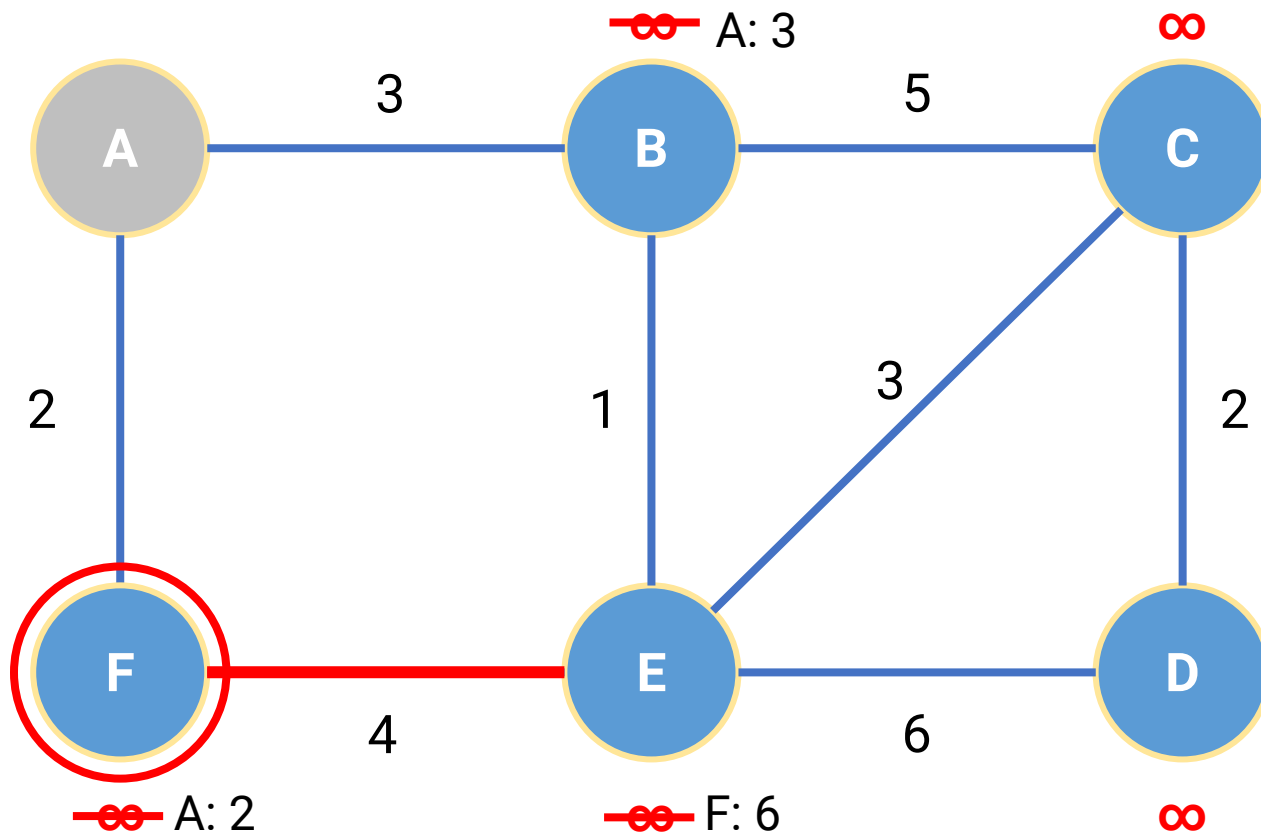






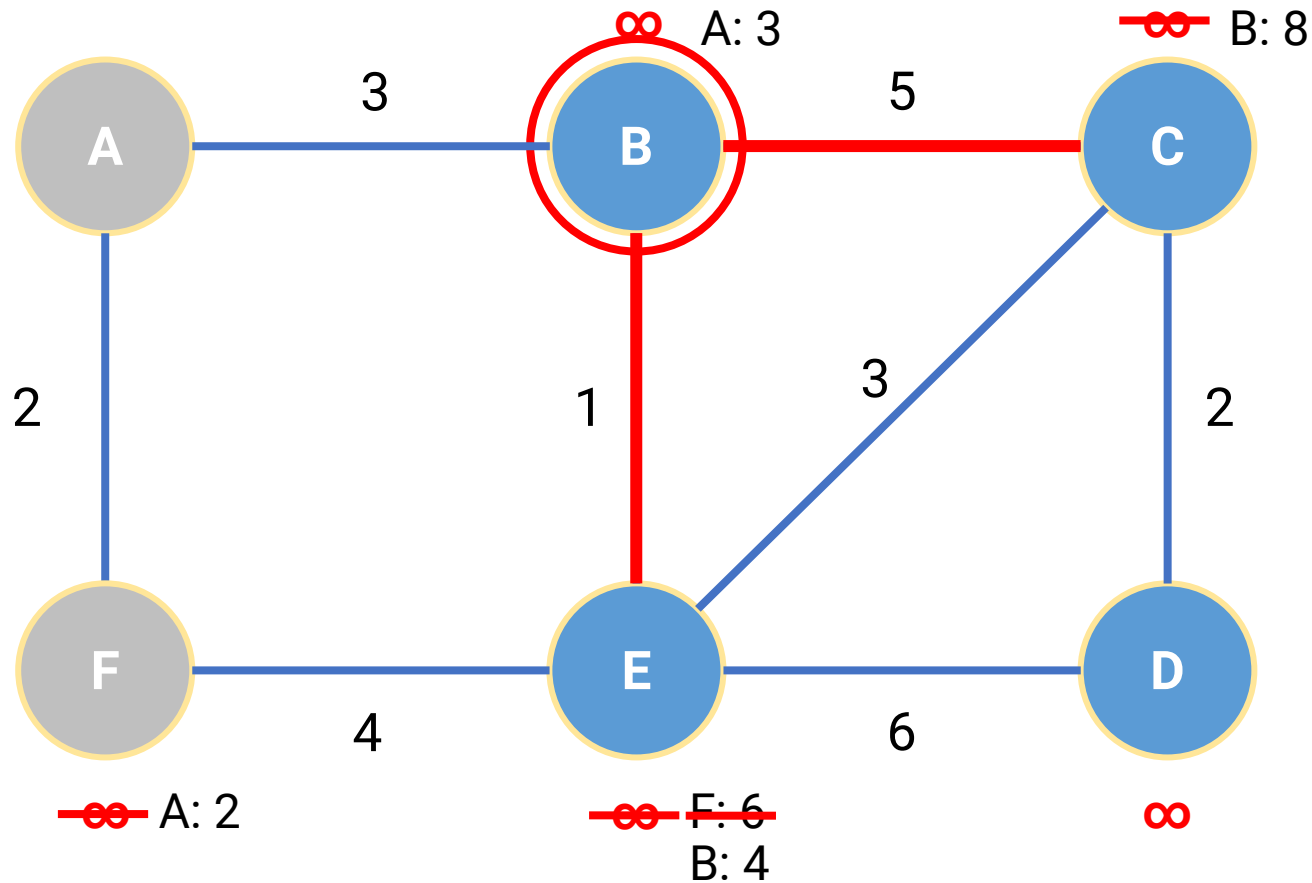
# Shortest Path (cont.)

$$\text{Shortest}_{AD} = \min_{i \in \{A, B, C, D, E, F\}} (\text{Shortest}_{Ai} + \text{Shortest}_{iD})$$



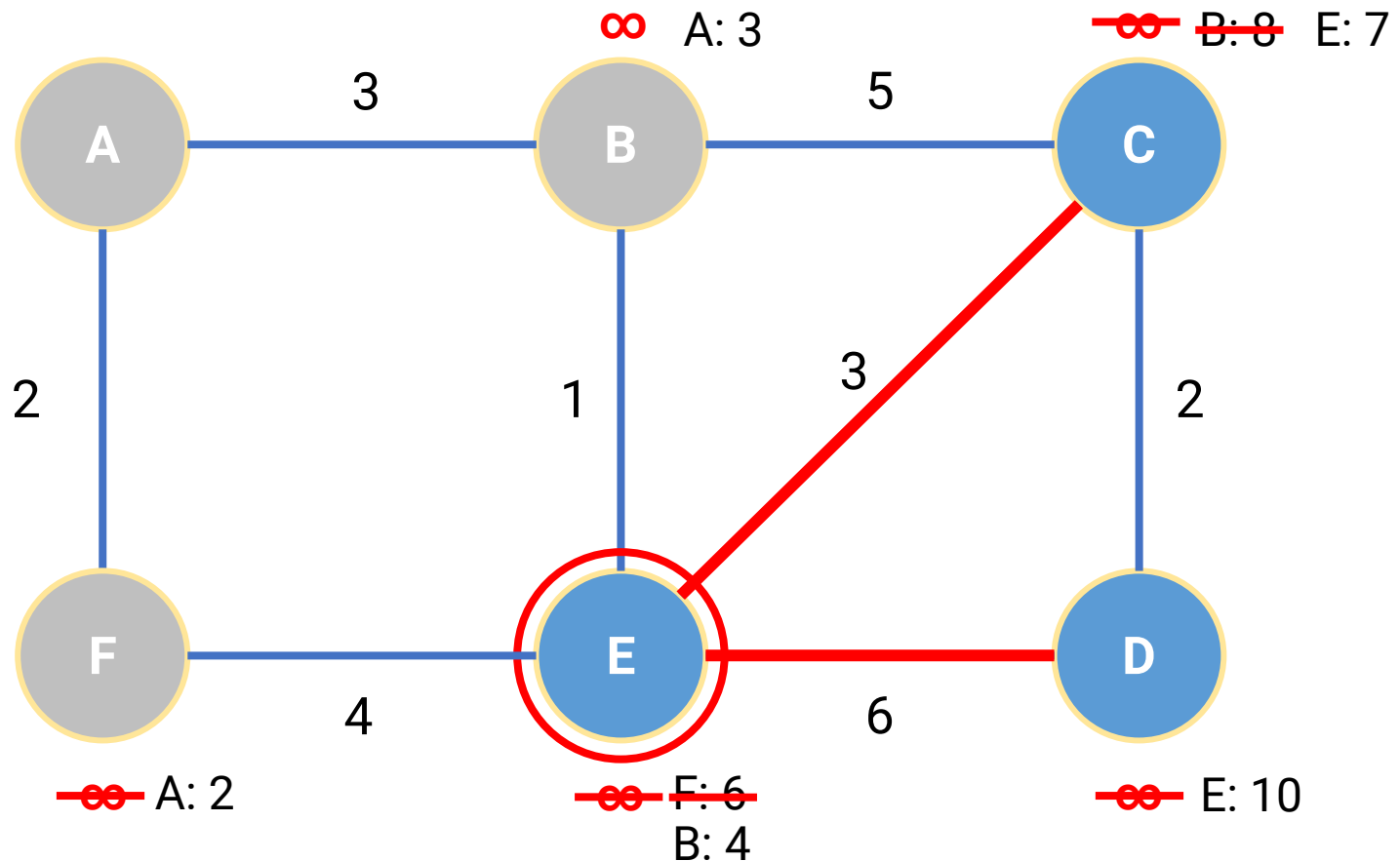
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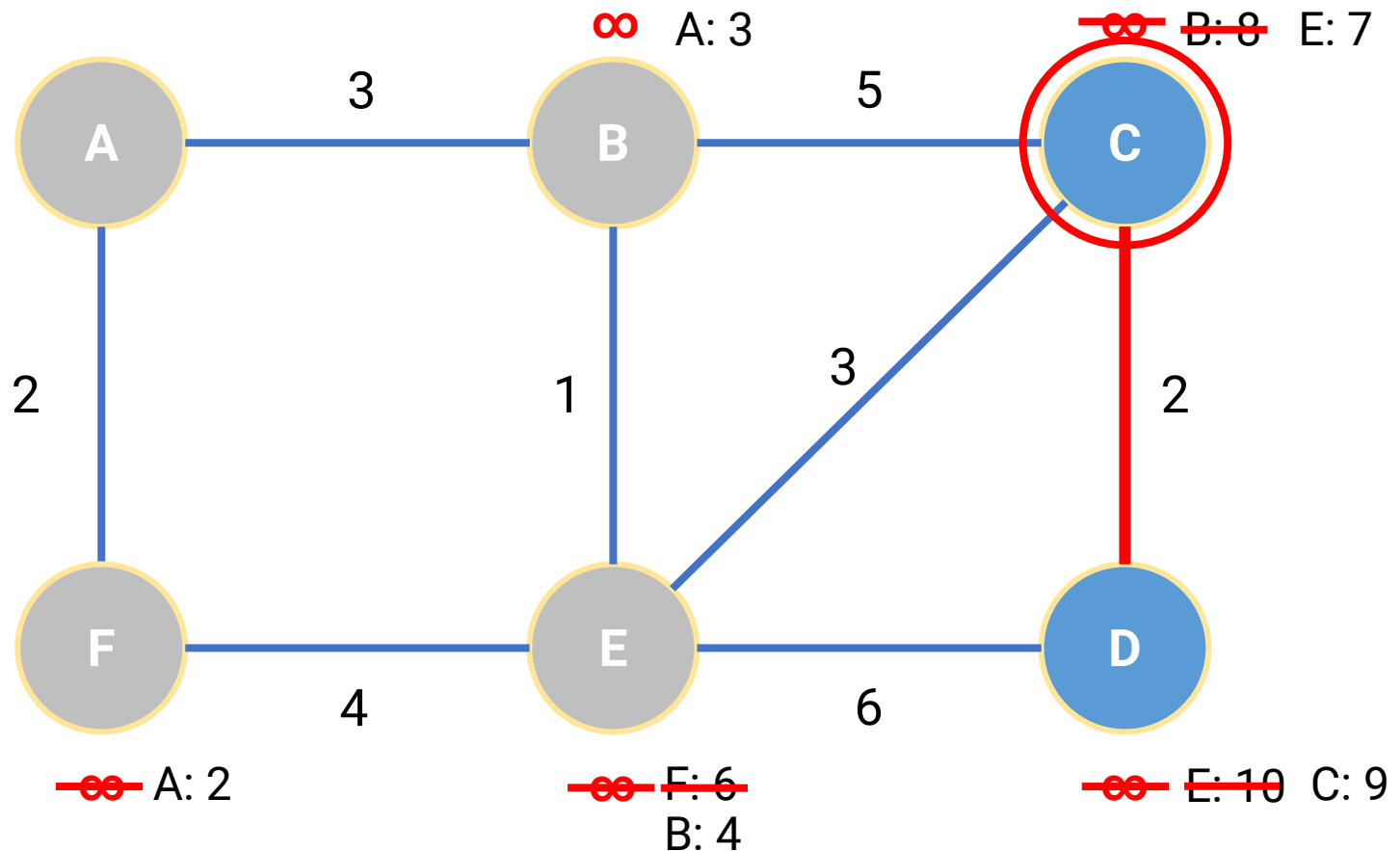
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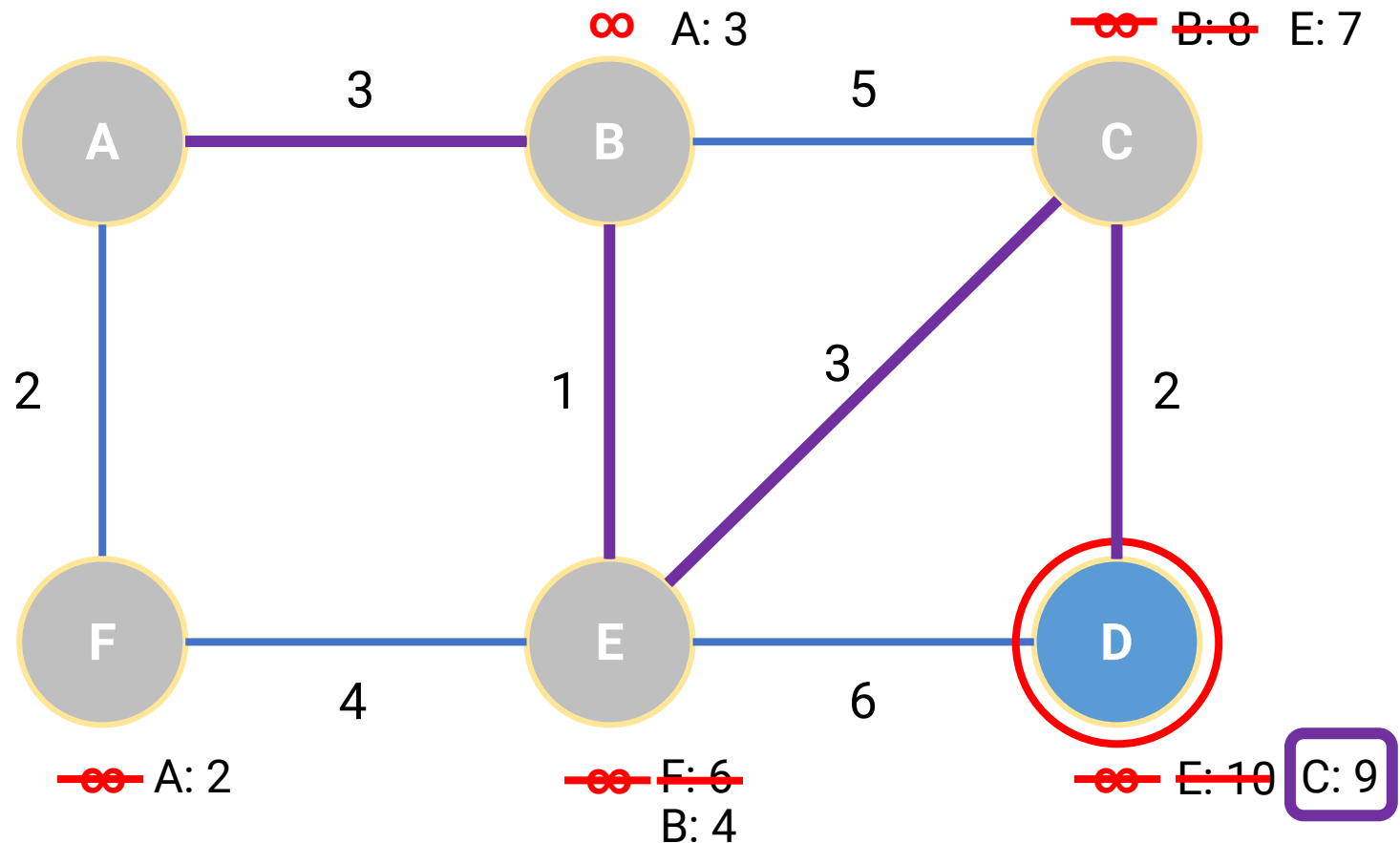
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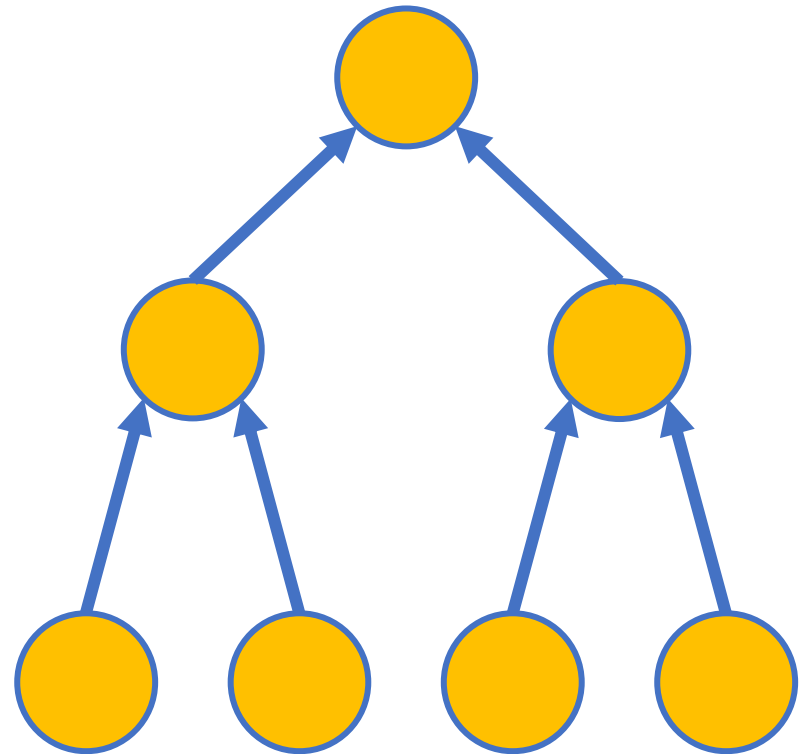
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$$\text{Shortest}_{AD} = \min_{i \in \{A, B, C, D, E, F\}} (\text{Shortest}_{Ai} + \text{Shortest}_{iD})$$



# Bottom-up Approach

- Solve pieces of the problem first
- Relax some of the problem constraints
- **Dynamic programming (DP)**
- Example
  - Shortest path



# Outline

- The concept of an algorithm
- Algorithm representation
- Algorithm discovery and structures
- Efficiency and correctness

# Efficiency

- The choice between efficient and inefficient algorithms can make the difference between a practical solution and an impractical one
- Measured as the **number of instructions** executed
  - Why not use the execution time
    - What about on different machines?

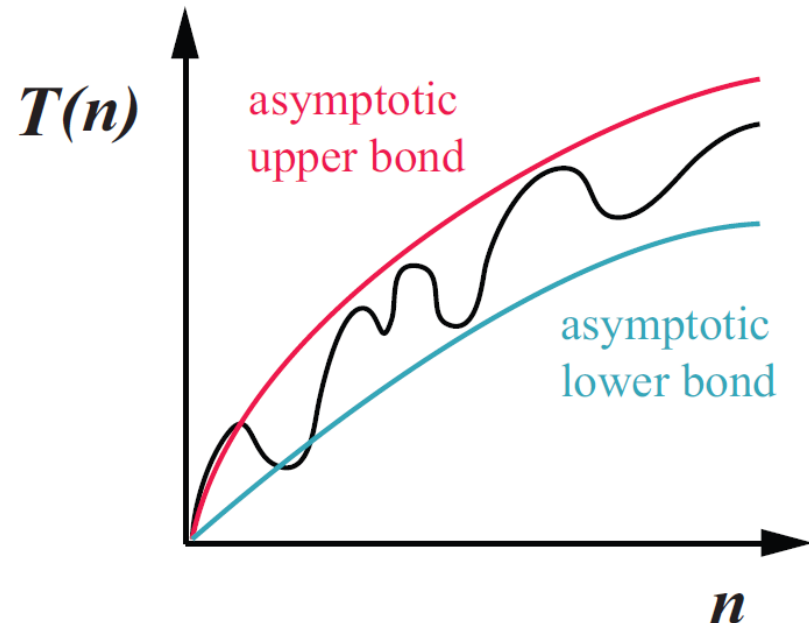


# Asymptotic Analysis

- Exact analysis is often difficult and tedious
- **Asymptotic analysis** emphasizes the behavior of the algorithm when  $n$  tends to **infinity**

- **Asymptotic**

- Upper bound ( $\mathcal{O}$ )
- Lower bound ( $\Omega$ )
- Tight bound ( $\Theta$ )



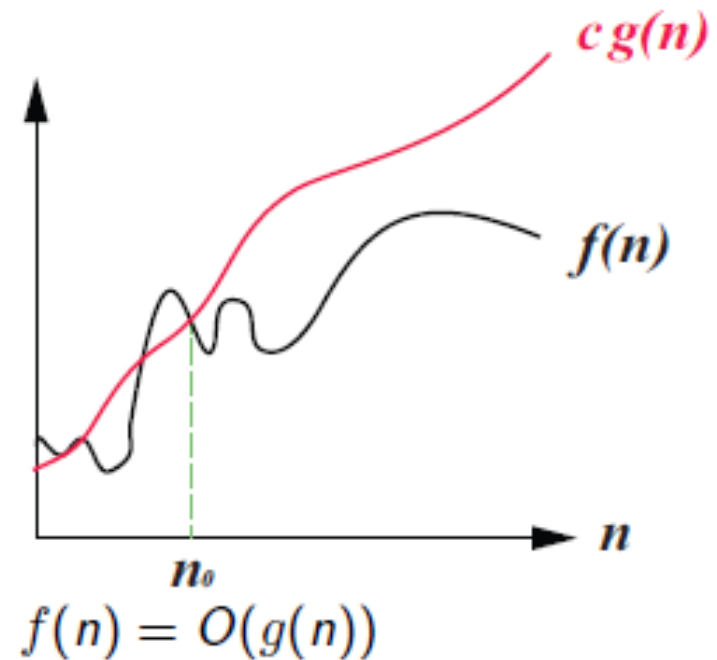
# Big-O

$$O(g(n)) = \{f(n) \mid \underbrace{\exists c > 0, n_0 > 0}_{\text{exist}} \text{ s.t. } \underbrace{\forall n \geq n_0}_{\text{such that}}, 0 \leq f(n) \leq cg(n)\}_{\text{for each}}$$

- **Asymptotic upper bound**

- Examples

- $500n = O(n^2)$
- $n^{10} = O(2^n)$
- $5n + 10000 = O(n)$



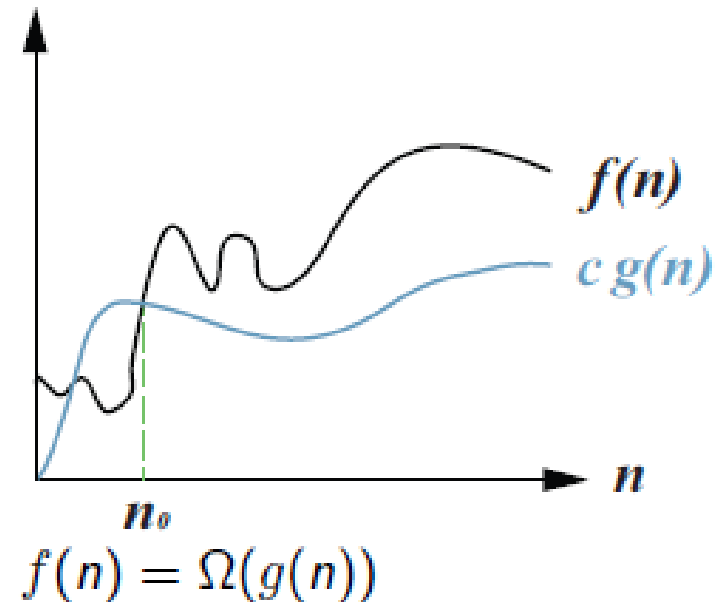
# Big-Ω

$$\Omega(g(n)) = \{f(n) \mid \underbrace{\exists c > 0}_{\text{exist}}, \underbrace{n_0 > 0}_{\text{such that}} \underbrace{\text{s.t.}}_{\text{for each}} \forall n \geq n_0, 0 \leq cg(n) \leq f(n)\}$$

- **Asymptotic lower bound**

- Examples

- $0.001n^2 = \Omega(n)$
- $2^n = \Omega(n^{10})$
- $5n + 10000 = \Omega(n)$



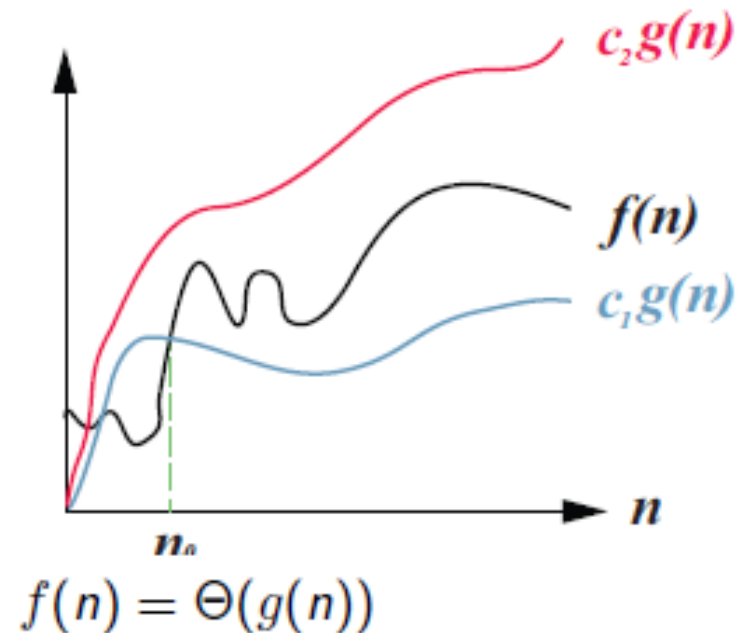
# Big-Θ

$$\Theta(g(n)) = \{f(n) \mid \underbrace{\exists c_1, c_2, n_0 > 0}_{\text{exist}} \underbrace{\text{s.t.}}_{\text{such that}} \underbrace{\forall n \geq n_0}_{\text{for each}}, 0 \leq c_1 g(n) \leq f(n) \leq c_2 g(n)\}$$

- Asymptotic tight bound**

- Examples

- $0.001n^2 = \Theta(n^2)$
- $n + \log n = \Theta(n)$
- $5n + 10000 = \Theta(n)$



# Efficiency (cont.)

- Incorporates **best**, **worst**, and **average** case analysis
- Example: worst case for insertion sort:  $O(n^2)$

Comparisons made for each pivot					
Initial list	1st pivot	2nd pivot	3rd pivot	4th pivot	Sorted list
Elaine David Carol Barbara Alfred	1 → Elaine David Carol Barbara Alfred	3 → David 2 → Elaine Carol Barbara Alfred	6 → Carol 5 → David 4 → Elaine Barbara Alfred	10 → Barbara 9 → Carol 8 → David 7 → Elaine Alfred	Alfred Barbara Carol David Elaine

Worst:  $(n^2 - n) / 2$

Best:  $(n - 1)$

Average:  $\theta(n^2)$

# Recap: Insertion Sort

**Procedure** *InsertionSort* (*List*)

$N \leftarrow 2$

**while** (the value of  $N$  does not exceed the length of *List*) **do**

    Select the  $N$ -th entry in *List* as the pivot entry

**while** (there is a name above the hole and that name is  
        greater than the pivot) **do**

        Move the name above the hole down into the hole,  
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    Move the pivot entry into the hole in *List*

$N \leftarrow N + 1$

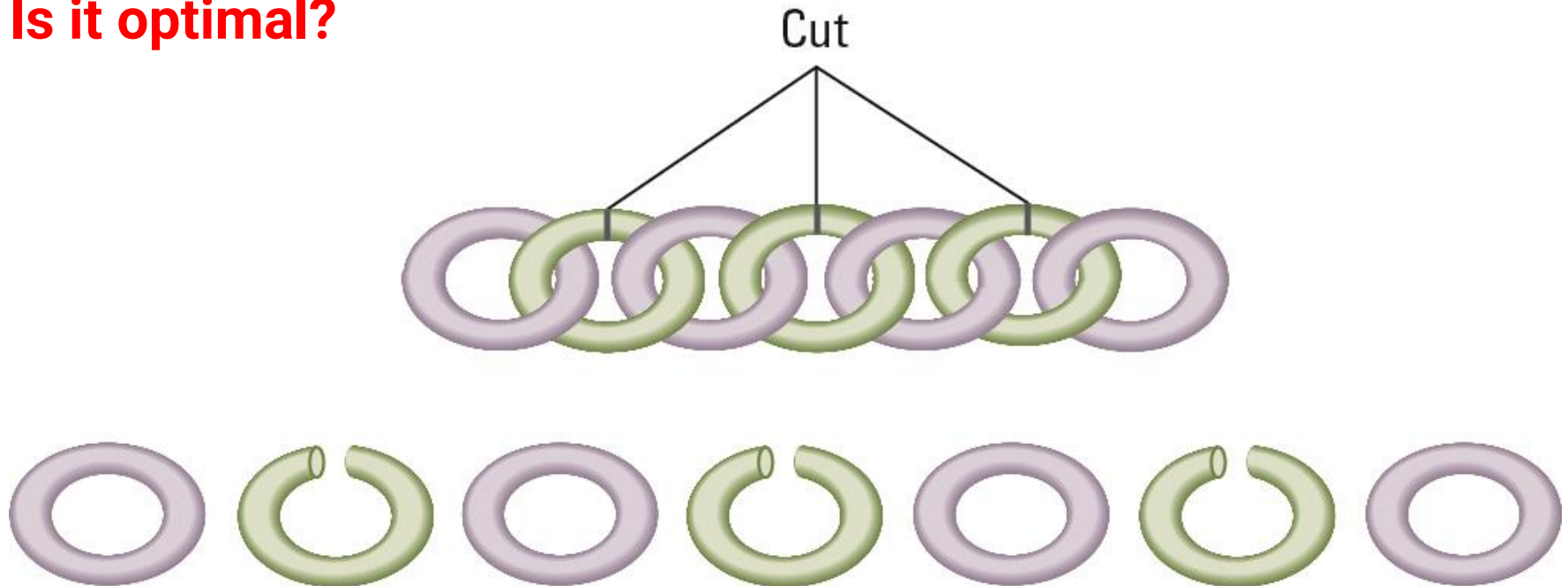
# Correctness

- The correctness of an algorithm is determined by **reasoning** formally about the algorithm, not by testing its implementation

# Traveler's Gold Chain Problem

A traveler with a gold chain of seven links must stay in an isolated hotel for seven nights. The rent each night consists of one link from the chain. What is the **fewest** number of links that must be cut so that the traveler can pay the hotel one link of the chain each morning without paying for lodging in advance?

**Is it optimal?**

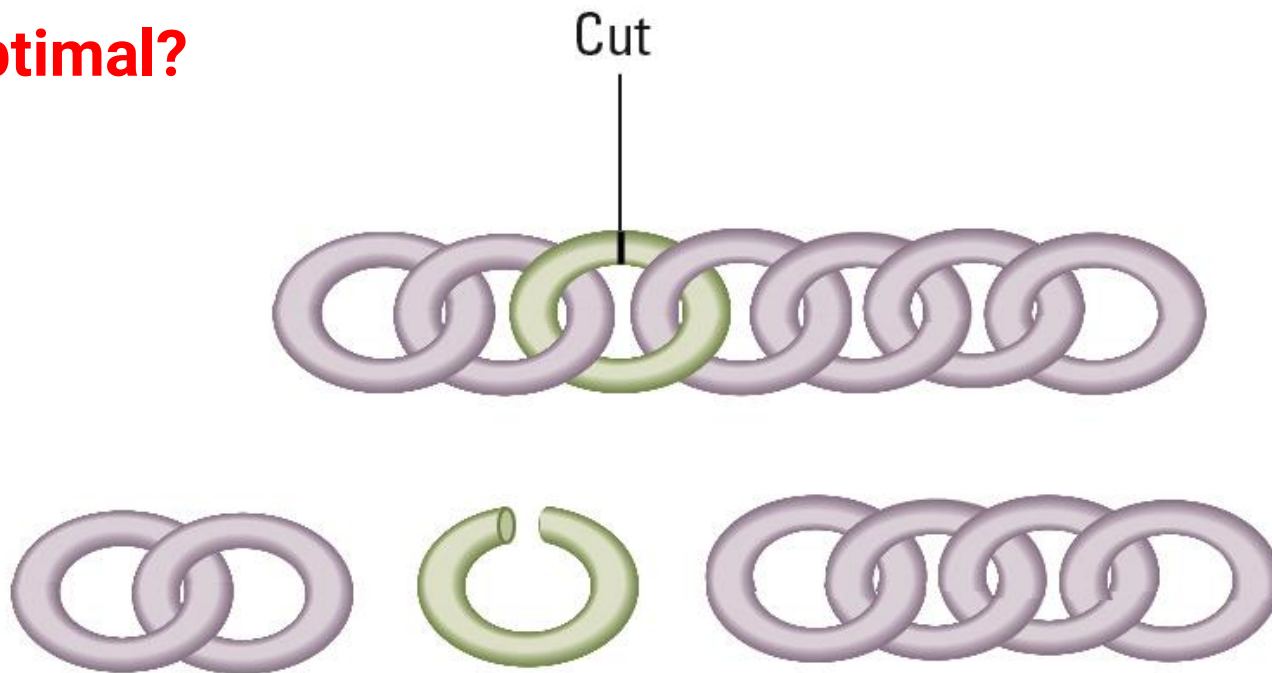




# Traveler's Gold Chain Problem (cont.)

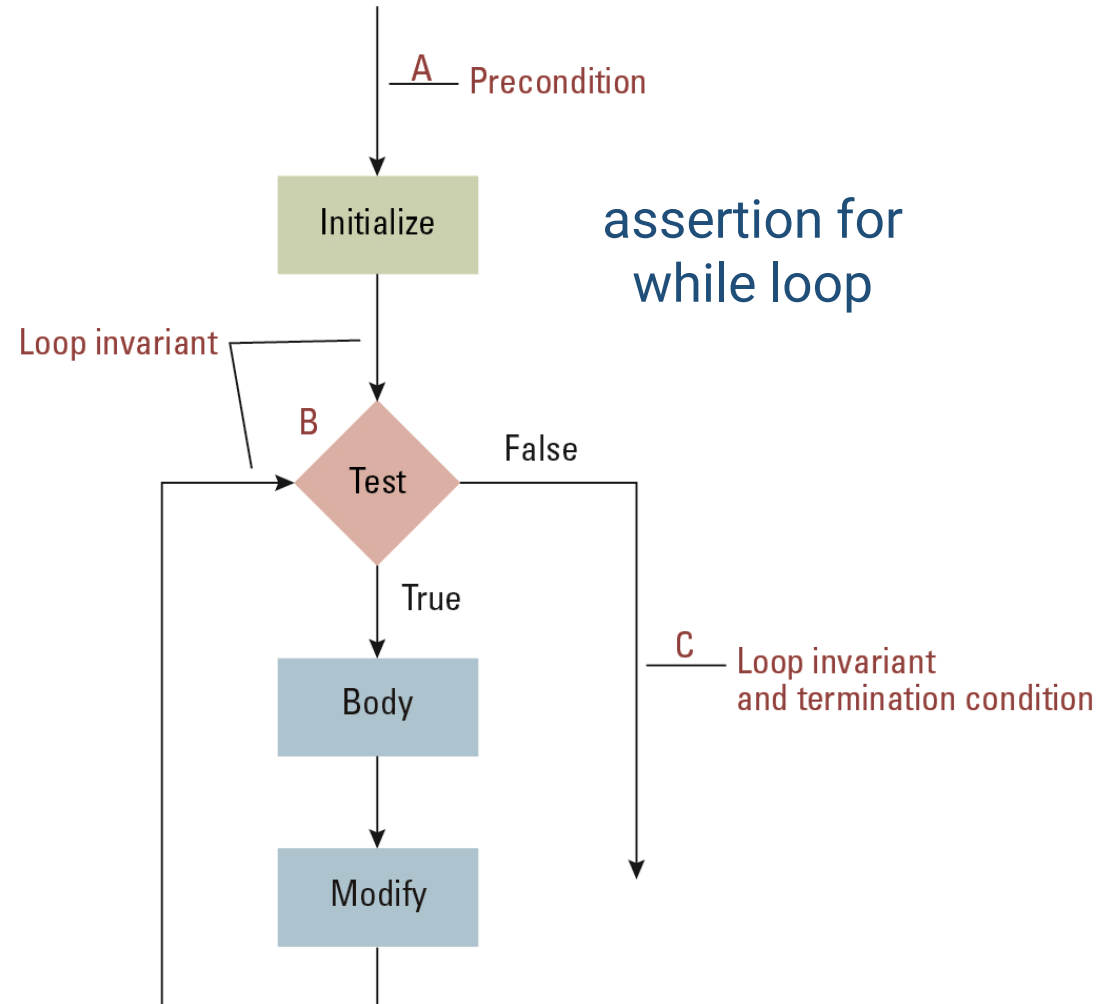
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**Is it optimal?**



# Software Verification

- Proof of correctness (with formal logic)
  - Assertions
    - **Preconditions**
    - **Loop invariants**
    - **Termination condition**



# Example for Assertion

**Procedure** *FindQuotient*

Count  $\leftarrow$  0

Remainder  $\leftarrow$  Dividend

**do**

    Remainder  $\leftarrow$  Remainder – Divisor

    Count  $\leftarrow$  Count + 1

**while** (Remainder < Divisor)

Quotient  $\leftarrow$  Count

**Correct?**  
Remainder > 0?

- **Preconditions**
  - Dividend > 0
  - Divisor > 0
  - Count = 0
  - Remainder = Dividend
- **Loop invariants**
  - Dividend > 0
  - Divisor > 0
  - Dividend = Count \* Divisor + Remainder
- **Termination condition**
  - Remainder < Divisor

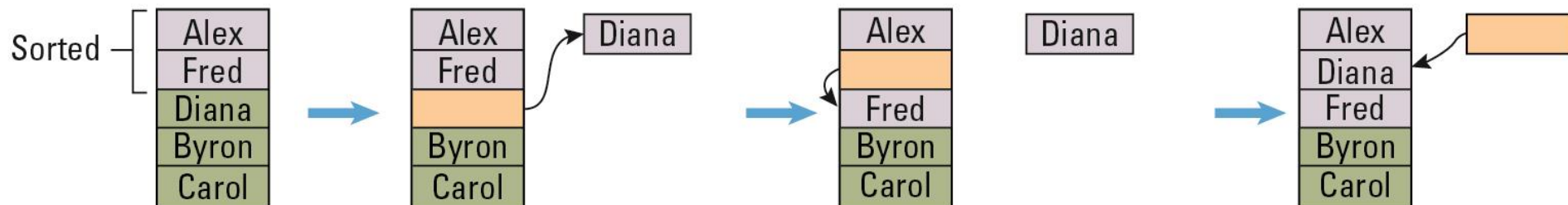
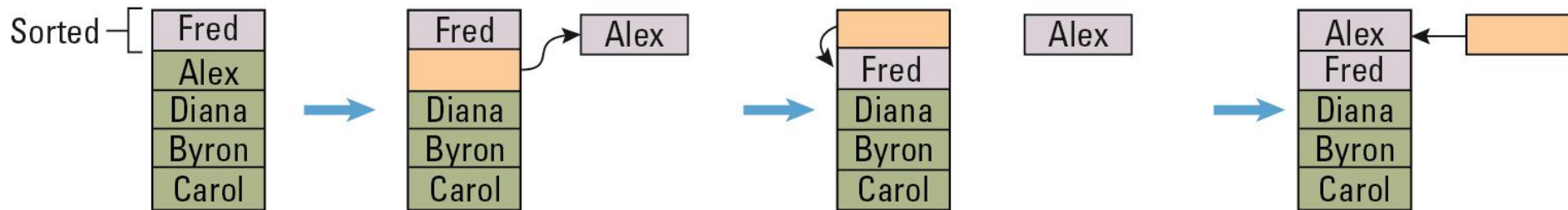
# Verification of Insertion Sort

- Loop invariant of the outer loop
  - Each time the test for termination is performed, the name preceding the **N**-th entry from a sorted list
- Termination condition
  - The value of N is greater than the length of the list
- If the loop terminates, the list is sorted

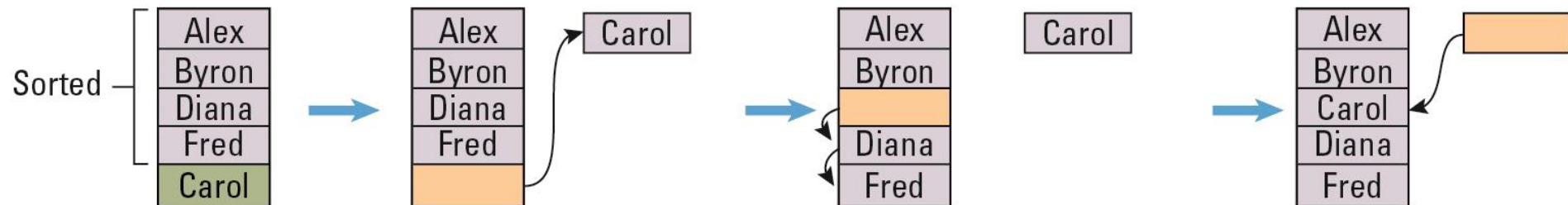
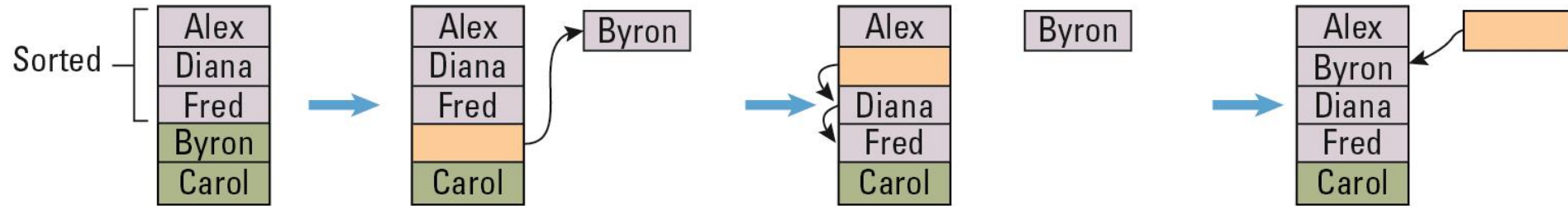
# Recap: Insertion Sort

Initial list:

Fred
Alex
Diana
Byron
Carol



# Recap: Insertion Sort (cont.)



Sorted list:

Alex
Byron
Carol
Diana
Fred

# Summary of Software Verification

- Software verification is not easy
- Can be easier with a formal programming language with better properties
- In practice, testing is more commonly used to verify software
  - However, testing only proves that the program is correct for the test cases used

**Any Questions?**