



# Introduction, Recursion and Complexity of Algorithms

*Data Structures and Algorithms*

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Data structures and  
Algorithms: Basic  
concepts

Algorithm  
Pseudocode  
Data structures  
Classes  
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Arrays

Recursion

Properties of recursion  
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Recursion implementation in  
C/C++

Complexity of  
Algorithms

Algorithm Efficiency  
Asymptotic Analysis  
Problems and common  
complexities  
P and NP Problems

- **L.O.1.** Determine the complexity of simple algorithms (polynomial time - nested loop - no recursive)
  - **L.O.1.1** Give definition of Big-O notation.
  - **L.O.1.2** Determine complexity of simple polynomial algorithms.



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# Overview

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## ② Recursion

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## ③ Complexity of Algorithms

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# Sources of Materials

- ① We would like to thank **Dr. The-Nhan LUONG**, a former instructor of our Department, for the composing of this document.
- ② This document also uses figure, sentences and demo source code from the following sources:
  - The old presentation for course *Data Structures and Algorithms* edited by other members in our Department
  - Book entitled **Data Structures - A Pseudocode Approach with C++ (first edition, 2001)** written by Richard F. Gilberg and Behrouz A. Forouzan

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# What is Data?



(Source:

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# What is Data?

## Data

Data is information that has been translated into a form that is more convenient to calculate, analyze.

## Example

- Numbers, words, measurements, observations or descriptions of things.
- 
- **Qualitative** data: descriptive information,
  - **Quantitative** data: numerical information (numbers).
    - **Discrete** data can only take certain values (like whole numbers)
    - **Continuous** data can take any value (within a range)

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# Data type

Class of **data objects** that have the **same properties**.

## Data type

- 1 A set of values
- 2 A set of operations on values

## Example

Type	Values	Operations
integer	$-\infty, \dots, -2, -1, 0, 1, 2, \dots, \infty$	$*, +, -, \%, /, ++, --, \dots$
floating point	$-\infty, \dots, 0.0, \dots, \infty$	$*, +, -, /, \dots$
character	$\backslash 0, \dots, 'A', 'B', \dots, 'a', 'b', \dots, \sim$	$<, >, \dots$







## What is a data structure?

- ① A combination of elements in which each is either a data type or another data structure
- ② A set of associations or relationships (structure) that holds the data together

## Example

An **array** is a number of **elements of the same type** in a **specific order**.

1	2	3	5	8	13	21	34
---	---	---	---	---	----	----	----

# Abstract data type

## The concept of abstraction:

- Users know **what** a data type **can** do.
- **How** it is done is **hidden**.

## Definition

An **abstract data type** is a data declaration packaged together with the operations that are meaningful for the data type.

- 1 Declaration of data
- 2 Declaration of operations
- 3 Encapsulation of data and operations

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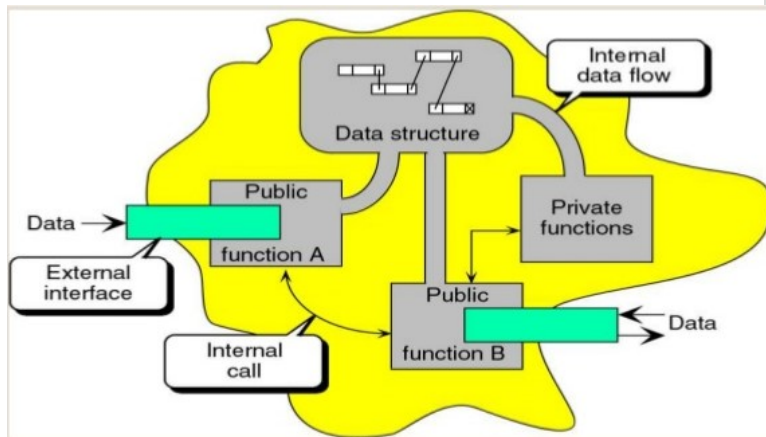
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# Abstract data type



**Figure:** Abstract data type model (source: Slideshare)

## Example: List

### Interface

- **Data:** sequence of elements of a particular data type
- **Operations:** accessing, insertion, deletion

### Implementation

- Array
- Linked list

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## What is an algorithm?

The **logical steps** to solve a problem.

## What is a program?

Program = **Data structures** + **Algorithms**  
(Niklaus Wirth)



#### Algorithm

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# Pseudocode

- The most common tool to define algorithms
- English-like representation of the algorithm logic
- Pseudocode = **English** + **code**

relaxed syntax being easy to read

instructions using basic control structures (sequential, conditional, iterative)

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# Pseudocode

## Algorithm Header

- Name
- Parameters and their types
- Purpose: what the algorithm does
- Precondition: precursor requirements for the parameters
- Postcondition: taken action and status of the parameters
- Return condition: returned value

## Algorithm Body

- Statements
- Statement numbers: decimal notation to express levels
- Variables: important data
- Algorithm analysis: comments to explain salient points
- Statement constructs: sequence, selection, iteration

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# Pseudocode: Example

## Algorithm average

**Pre** nothing

**Post** the average of the input numbers is printed

```
1 i = 0
2 sum = 0
3 while all numbers not read do
4     | i = i + 1
5     | read number
6     | sum = sum + number
7 end
8 average = sum / i
9 print average
10 End average
```

**Algorithm 1:** How to calculate the average

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Data structures can be declared in C++ using the following syntax:

```
struct [type_name] {  
    member_type1 member_name1;  
    member_type2 member_name2;  
    member_type3 member_name3;  
    ...  
} [object_names];
```

- Where `type_name` is a name for the structure type, `object_names` can be a set of valid identifiers for objects that have the type of this structure.
- Within braces `{ }`, there is a list with the data members, each one is specified with a type and a valid identifier as its name.
- **struct** requires either a `type_name` or at least one name in `object_names`, but not necessarily both.



# Data structures

## Example

```
struct car_t {  
    int year;  
    string brand;  
};  
  
car_t toyota;  
car_t mercedes, bmw;
```

## Example

```
struct {  
    int year;  
    string brand;  
} toyota, mercedes, bmw;
```

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# Data structures

A member of an object can be accessed directly by a dot (.) inserted between the object name and the member name.

## Example

```
toyota.year  
toyota.brand  
mercedes.year  
mercedes.brand  
bmw.year  
bmw.brand
```

- `toyota.year`, `mercedes.year`, and `bmw.year` are of type `int`.
- `toyota.brand`, `mercedes.brand`, and `bmw.brand` are of type `string`.

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## Example

```
// example about structures
#include <iostream>

using namespace std;

struct car_t {
    int year;
    string brand;
} mycar;

int main () {
    mycar.brand = "Audi";
    mycar.year = 2011;
    cout << "My favorite car is:" << endl;
    cout << mycar.brand << " (" << mycar.year << ") ";
    return 0;
}
```

# Data structures

## Example

```
#include <iostream>
using namespace std;

struct car_t {
    int year;
    string brand;
} mycar;

void printcar(car_t);

int main () {
    mycar.brand = "Audi";
    mycar.year = 2011;
    printcar(mycar);
    return 0;
}

void printcar(car_t c) {
    cout << "My favorite car is:" << endl;
    cout << c.brand << "(" << c.year << ")";
}
```

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## Exercise

- Define a data structure `student_t` containing a student's name, firstname and age.
- Write a code in C++ to take input your data and display it.

## Exercise

```
#include <iostream>
#include <sstream>
using namespace std;
struct student_t {
    string name;
    string firstname;
    int age;
};

void infostudent(student_t);

int main () {
    student_t sv;
    string str;
    cout << "Enter your name: ";
    getline (cin, sv.name);
    cout << "Enter your firstname: ";
    getline (cin, sv.firstname);
    cout << "Enter your age: ";
    getline (cin, str);
    stringstream(str) >> sv.age;
    infostudent(sv);
    return 0;
}

void infostudent(student_t s) {
    cout << "My name is " << s.name << " " << s.firstname << endl;
    cout << "I am " << s.age << " years old." << endl;
}
```



Classes are defined using keyword `class`, with the following syntax:

```
class class_name {  
    access_specifier_1: member1;  
    access_specifier_2: member2;  
    ...  
} object_names;
```

- Where `class_name` is a valid identifier for the class, `object_names` is an optional list of names for objects of this class.
- The body of the declaration can contain `members`, which can either be data or function declarations, and optionally `access_specifiers`.







## Example

```
class Rectangle {  
    int width, height;  
public:  
    void set_values (int,int);  
    int area (void);  
} rect;
```

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## Example

```
#include <iostream>
using namespace std;
class Rectangle {
    int width, height;
public:
    void set_values (int ,int );
    int area (void);
};

void Rectangle::set_values (int x, int y) {
    width = x;
    height = y;
}

int Rectangle::area () {
    return width*height;
}

int main () {
    Rectangle rectA, rectB;
    rectA.set_values (3,4);
    rectB.set_values (5,6);
    cout << "rectA area : " << rectA.area() << endl;
    cout << "rectB area : " << rectB.area() << endl;
    return 0;
}
```



## Constructors

- Automatically called whenever a new object of a class is created.
- Initializing member variables or allocate storage of the object.
- Declared with a name that matches the class name and without any return type; not even void.

## Example

```
class Rectangle {  
    int width, height;  
public:  
    Rectangle (int,int);  
    int area (void);  
};
```



## Example

```
#include <iostream>
using namespace std;
class Rectangle {
    int width, height;
public:
    Rectangle (int, int);
    int area (void);
};

Rectangle::Rectangle (int x, int y) {
    width = x;
    height = y;
}

int Rectangle::area () {
    return width*height;
}

int main () {
    Rectangle rectA (3,4);
    Rectangle rectB (5,6);
    cout << "rectA_□area:□" << rectA.area() << endl;
    cout << "rectB_□area:□" << rectB.area() << endl;
    return 0;
}
```



## Initialization

- Member initialization:

```
class Rectangle {  
    int width;  
    const int height;  
public:  
    Rectangle(int , int);  
    ...  
};  
Rectangle(int x, int y) : height(y) {  
    width = x;  
}  
  
int main() {  
    Rectangle rectA(3,4);  
    ...  
}
```



# Pointers

## Definition

A pointer is a variable whose value is **the address of another variable**, i.e., direct address of the memory location.

## Address-of operator (&)

The address of a variable can be obtained by preceding the name of a variable with an ampersand sign (&), known as **address-of operator**. For example:

```
p = &value;
```

## Dereference operator (\*)

To access the variable pointed to by a pointer, we precede the pointer name with the **dereference operator (\*)**.

```
value = *p;
```

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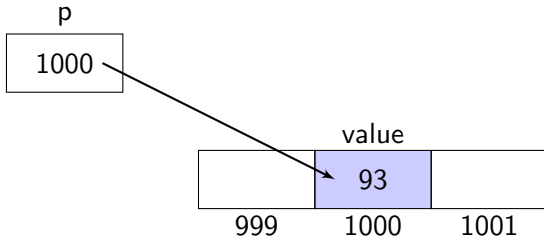
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# Pointers



```
p = &value;  
value = *p;
```

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# Pointers

## Example

```
int main ()
{
    int v1 = 5, v2 = 15;
    int * p1, * p2;
    p1 = &v1;
    p2 = &v2;
    *p1 = 10;
    *p2 = *p1;
    p1 = p2;
    *p1 = 20;
    cout << "v1_ = " << v1 << '\n';
    cout << "v2_ = " << v2 << '\n';
    return 0;
}
```

## Exercise

What is the output?

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## Exercise

```
int main ()
{
    int v1 = 5, v2 = 15;
    int * p1, * p2;
    p1 = &v1;      // p1 = address of v1, p1 points to v1
    p2 = &v2;      // p2 = address of v2, p2 points to v2
    *p1 = 10;      // value pointed to by p1 = 10, v1 = 10
    *p2 = *p1;     // value pointed to by p2 = value pointed by p1, v2 = 10
    p1 = p2;       // value of pointer is copied, p1 points to v2
    *p1 = 20;      // value pointed by p1 = 20, v2 = 20
    cout << "v1=" << v1 << '\n';
    cout << "v2=" << v2 << '\n';
    return 0;
}
```

## Output

v1 = 10

v2 = 20



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# Arrays

## Definition

An **array** is a series of elements of the same type placed in contiguous memory locations that can be individually referenced by a unique identifier with an index.

```
type var_name[number_of_elements];
```

## Example

```
int num[8];
```

0      1      2      3      4      5      6      7

num							
-----	--	--	--	--	--	--	--

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# Arrays

## Initializing arrays

```
int num[8];  
  
int num[8] = { };  
  
int num[8] = { 1, 2, 3, 5, 8, 13, 21, 34 };  
  
int num[8] = { 1, 2, 3, 5, 8 };  
  
int num[] = { 1, 2, 3, 5, 8, 13, 21, 34 };  
  
int num[] { 1, 2, 3, 5, 8, 13, 21, 34 };
```

## Exercise

For each declaration of `num`, what is the output?

```
for (int i=0; i<8; i++) {  
    cout << num[i] << endl;  
}
```

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# Pointers and arrays

The concept of **arrays** is related to that of pointers. **Arrays** work very much like **pointers** to their first elements, and, actually, an array can always be implicitly converted to the pointer of the proper type.

For example, consider these two declarations:

```
int myarray [10];  
int * mypointer;
```

The following assignment operation would be valid:

```
mypointer = myarray;
```

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# Pointers and arrays

## Example

```
#include <iostream>
using namespace std;
int main ()
{
    int num[5];
    int * p;
    p = num;    *p = 1;
    p++;    *p = 2;
    p = &num[2];    *p = 3;
    p = num + 3;    *p = 5;
    p = num;    *(p+4) = 8;
    for (int n=0; n<5; n++)
        cout << num[n] << ", ";
    return 0;
}
```

## Exercise

What is the output? Explain.

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# Pointers to structures

Structures can be pointed to by its own type of pointers:

```
struct car_t {  
    string brand;  
    int year;  
};
```

```
car_t mycar;  
car_t * pcar;
```

- `mycar` is an object of structure type `car_t`.
- `pcar` is a pointer to point to an object of structure type `car_t`.

The following code is valid:

```
pcar = &mycar;
```

The value of the pointer `pcar` would be assigned the address of object `mycar`.

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# Pointers to structures

## arrow operator (->)

The *arrow operator* (->) is a dereference operator that is used exclusively with pointers to objects that have members. This operator serves to access the member of an object directly from its address.

```
pcar->year
```

## Difference:

- Two expressions `pcar->year` and `(*pcar).year` are equivalent, and both access the member `year` of the data structure pointed by a pointer called `pcar`.
- Two expressions `*mycar.year` or `*(mycar.year)` are equivalent. This would access the value pointed by a hypothetical pointer member called `year` of the structure object `mycar` (which is not the case, since `year` is not a pointer type).

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# Pointers to structures

Combinations of the operators for pointers and for structure members:

Expression	Equivalent	What is evaluated
<code>a.b</code>		Member b of object a
<code>pa-&gt;b</code>	<code>(*pa).b</code>	Member b of object pointed to by pa
<code>*a.b</code>	<code>*(a.b)</code>	Value pointed to by member b of object a

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# Pointers to structures

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## Exercise

- Define a data structure `student_t` containing a student's name, firstname and age.
- Write a code in C++ using `pointers to structures` to take input your data and display it.

# Pointers to structures

## Exercise

```
#include <iostream>
#include <sstream>
using namespace std;
struct student_t {
    string name;
    string firstname;
    int age;
};
void infostudent(student_t*);

int main () {
    student_t sv;
    student_t *psv = &sv;
    string str;
    cout << "Enter your name: ";
    getline (cin, psv->name);
    cout << "Enter your firstname: ";
    getline (cin, psv->firstname);
    cout << "Enter your age: ";
    getline (cin, str);
    stringstream(str) >> psv->age;
    infostudent(psv);
    return 0;
}

void infostudent(student_t *s) {
    cout << "My name is " << s->name << " " << s->firstname << endl;
    cout << "I am " << s->age << " years old." << endl;
}
```

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# Pointers to structures

Structures can also be nested in such a way that an element of a structure is itself another structure:

## Example

```
struct car_t {  
    string brand;  
    int year;  
};  
  
struct friends_t {  
    string name;  
    string email;  
    car_t favorite_car;  
} bobby, tommy;  
  
friends_t *pfriend = &bobby;
```

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# Pointers to structures

After the previous declarations, all of the following expressions would be valid:

## Example

```
tommy.name  
tommy.email  
tommy.favorite_car.brand  
tommy.favorite_car.year
```

```
bobby.name | pfriend->name  
bobby.email | pfriend->email  
bobby.favorite_car.brand | pfriend->favorite_car.brand  
bobby.favorite_car.year | pfriend->favorite_car.year
```

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# Pointers to classes

## Example

```
#include <iostream>
using namespace std;
class Rectangle {
    int width, height;
public:
    Rectangle(int x, int y) : width(x), height(y) {}
    int area(void) { return width * height; }
};

int main () {
    Rectangle rectA (3, 4);
    Rectangle * rectB = &rectA;
    Rectangle * rectC = new Rectangle (5, 6);

    cout << "rectA_area:_" << rectA.area() << endl;
    cout << "rectB_area:_" << rectB->area() << endl;
    cout << "rectC_area:_" << rectC->area() << endl;
    delete rectB;
    delete rectC;
    return 0;
}
```

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# Recursion and the basic components of recursive algorithms

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## Definition

Recursion is a **repetitive process** in which an algorithm calls itself.

- Direct :  $A \rightarrow A$
- Indirect :  $A \rightarrow B \rightarrow A$

## Example

### Factorial

$$Factorial(n) = \begin{cases} 1 & \text{if } n = 0 \\ n \times (n - 1) \times \dots \times 2 \times 1 & \text{if } n > 0 \end{cases}$$

Using recursion:

$$Factorial(n) = \begin{cases} 1 & \text{if } n = 0 \\ n \times Factorial(n - 1) & \text{if } n > 0 \end{cases}$$



# Basic components of recursive algorithms

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## Two main components of a Recursive Algorithm

- 1 Base case (i.e. stopping case)
- 2 General case (i.e. recursive case)

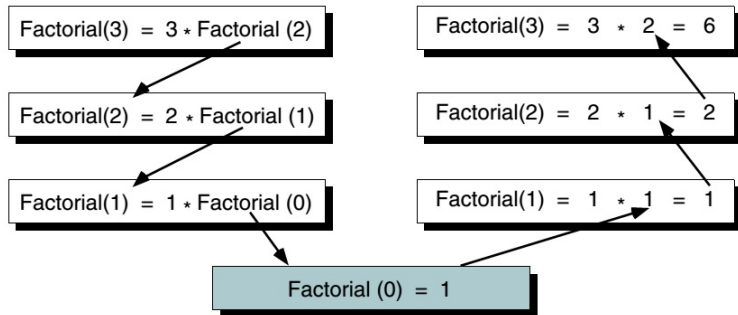
## Example

### Factorial

$$Factorial(n) = \begin{cases} 1 & \text{if } n = 0 \\ n \times Factorial(n - 1) & \text{if } n > 0 \end{cases} \quad \begin{matrix} \text{base} \\ \text{general} \end{matrix}$$



# Recursion



**Hình:** Factorial (3) Recursively  
(Source: Data Structure - A pseudocode Approach with C++)



## Factorial: Iterative Solution

```
1 Algorithm iterativeFactorial(n)
2   Calculates the factorial of a number using a loop.
3   Pre:  $n$  is the number to be raised factorially
4   Post:  $n!$  is returned - result in  $\text{factoN}$ 

5    $i = 1$ 
6    $\text{factoN} = 1$ 
7   while  $i \leq n$  do
8     |    $\text{factoN} = \text{factoN} * i$ 
9     |    $i = i + 1$ 
10  end
11  return  $\text{factoN}$ 
12 End iterativeFactorial
```

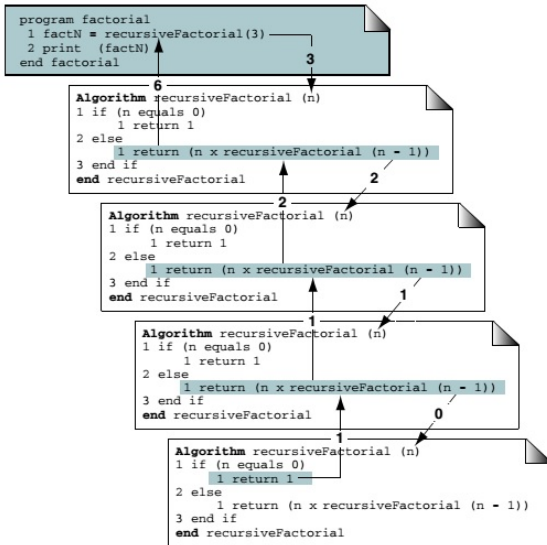




### Factorial: Recursive Solution

```
1 Algorithm recursiveFactorial(n)
2 Calculates the factorial of a number using a recursion.
3 Pre:  $n$  is the number to be raised factorially
4 Post:  $n!$  is returned
5 if  $n = 0$  then
6   |   return 1
7 else
8   |   return  $n * \text{recursiveFactorial}(n-1)$ 
9 end
10 End recursiveFactorial
```

# Recursion



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**Hình:** Calling a Recursive Algorithm (source: Data Structure - A pseudocode Approach with C++)

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# Properties of recursion

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# Properties of all recursive algorithms

- A recursive algorithm solves the large problem by using its solution to a simpler sub-problem
- Eventually the sub-problem is simple enough that it can be solved without applying the algorithm to it recursively.  
→ This is called the **base case**.

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# Designing recursive algorithms

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# The Design Methodology

Every recursive call must either **solve a part** of the problem or **reduce the size** of the problem.

## Rules for designing a recursive algorithm

- 1 Determine the **base case** (stopping case).
- 2 Then determine the **general case** (recursive case).
- 3 **Combine** the base case and the general cases into an algorithm.

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# Limitations of Recursion

- A recursive algorithm generally runs **more slowly** than its nonrecursive implementation.
- BUT, the recursive solution **shorter** and **more understandable**.

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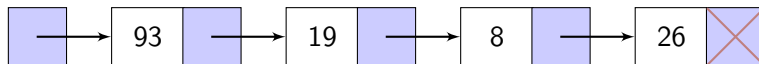
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# Print List in Reverse



26      8      19      93

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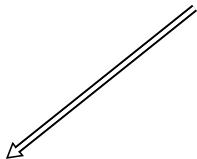
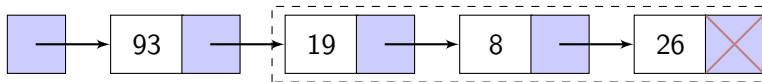
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# Print List in Reverse



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# Print List in Reverse

```
1 Algorithm printReverse(list)
2 Prints a linked list in reverse.
3 Pre: list has been built
4 Post: list printed in reverse
5 if list is null then
6   |   return
7 end
8 printReverse (list -> next)
9 print (list -> data)
10 End printReverse
```

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# Greatest Common Divisor

Basic concepts

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## Definition

$$\gcd(a, b) = \begin{cases} a & \text{if } b = 0 \\ b & \text{if } a = 0 \\ \gcd(b, a \bmod b) & \text{otherwise} \end{cases}$$

## Example

$$\gcd(12, 18) = 6$$

$$\gcd(5, 20) = 5$$

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# Greatest Common Divisor

```
1 Algorithm gcd(a, b)
2 Calculates greatest common divisor using the Euclidean
  algorithm.
3 Pre: a and b are integers
4 Post: greatest common divisor returned

5 if b = 0 then
6   | return a
7 end
8 if a = 0 then
9   | return b
10 end
11 return gcd(b, a mod b)
12 End gcd
```

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# Fibonacci Numbers

## Definition

$$Fibo(n) = \begin{cases} 0 & \text{if } n = 0 \\ 1 & \text{if } n = 1 \\ Fibo(n - 1) + Fibo(n - 2) & \text{otherwise} \end{cases}$$

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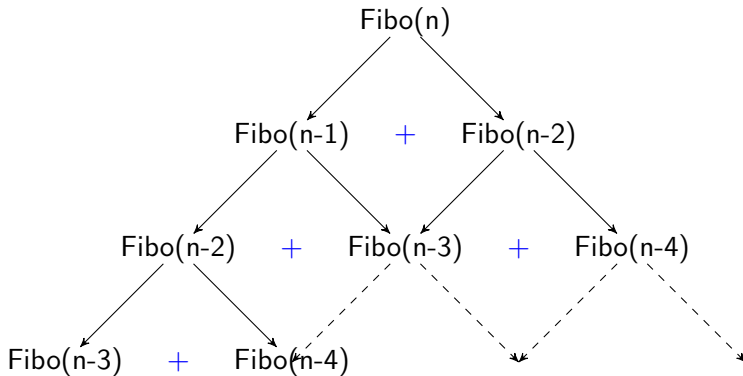
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# Fibonacci Numbers



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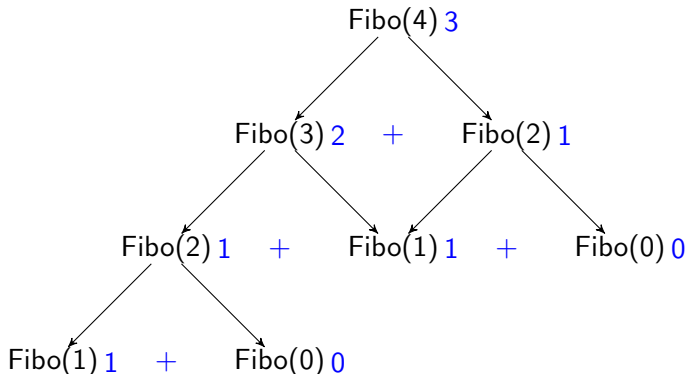
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# Fibonacci Numbers



## Result

0, 1, 1, 2, 3, 5, 8, 13, 21, 34, ...

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```
1 Algorithm Fibo(n)
2   Calculates the  $n^{\text{th}}$  Fibonacci number.
3   Pre:  $n$  is positive integer
4   Post: the  $n^{\text{th}}$  Fibonacci number returned
5   if  $n = 0$  or  $n = 1$  then
6     |   return  $n$ 
7   end
8   return  $\text{Fibo}(n-1) + \text{Fibo}(n-2)$ 
9   End fib
```

# Fibonacci Numbers

No	Calls	Time	No	Calls	Time
1	1	< 1 sec.	11	287	< 1 sec.
2	3	< 1 sec.	12	465	< 1 sec.
3	5	< 1 sec.	13	753	< 1 sec.
4	9	< 1 sec.	14	1,219	< 1 sec.
5	15	< 1 sec.	15	1,973	< 1 sec.
6	25	< 1 sec.	20	21,891	< 1 sec.
7	41	< 1 sec.	25	242,785	1 sec.
8	67	< 1 sec.	30	2,692,573	7 sec.
9	109	< 1 sec.	35	29,860,703	1 min.
10	177	< 1 sec.	40	331,160,281	13 min.

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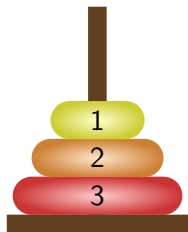
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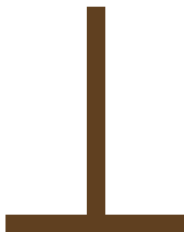
# The Towers of Hanoi

Move disks from Source to Destination using Auxiliary:

- ① Only one disk could be moved at a time.
- ② A larger disk must never be stacked above a smaller one.
- ③ Only one auxiliary needle could be used for the intermediate storage of disks.



Source



Auxiliary



Destination

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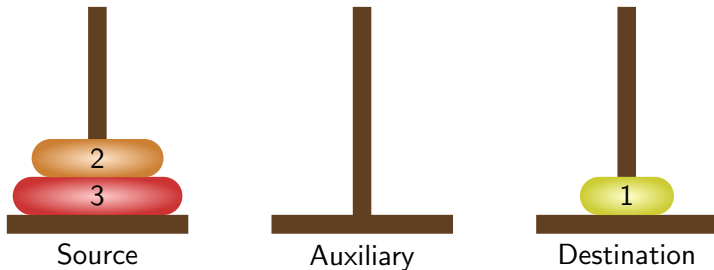
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# The Towers of Hanoi



Moved disc from pole 1 to pole 3.

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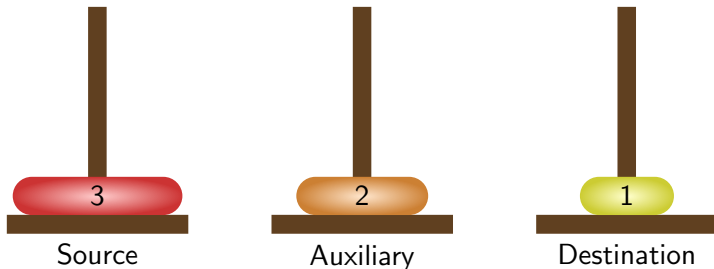
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# The Towers of Hanoi



Moved disc from pole 1 to pole 2.

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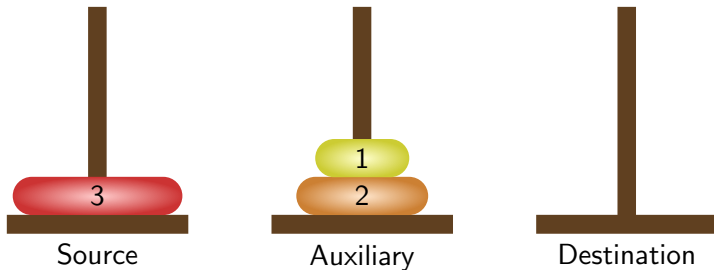
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# The Towers of Hanoi



Moved disc from pole 3 to pole 2.

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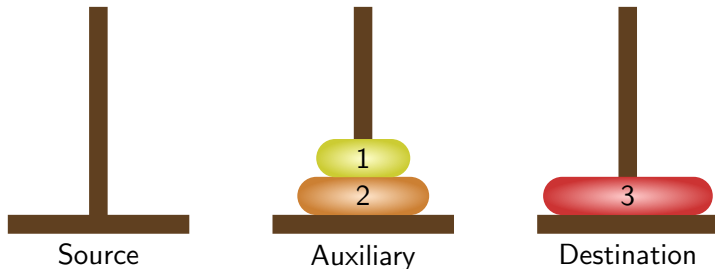
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# The Towers of Hanoi



Moved disc from pole 1 to pole 3.

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- Properties of recursion

## Designing recursive algorithms

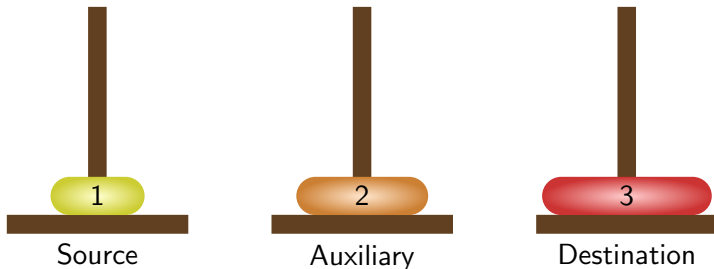
- Recursion and backtracking
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## Complexity of Algorithms

- Algorithm Efficiency
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# The Towers of Hanoi



Moved disc from pole 2 to pole 1.

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## Data structures and Algorithms: Basic concepts

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- Properties of recursion

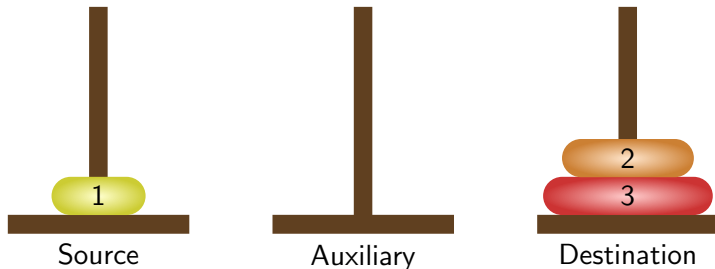
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# The Towers of Hanoi



Moved disc from pole 2 to pole 3.

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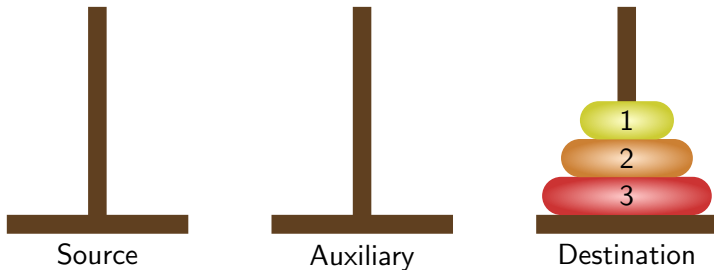
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# The Towers of Hanoi



Moved disc from pole 1 to pole 3.

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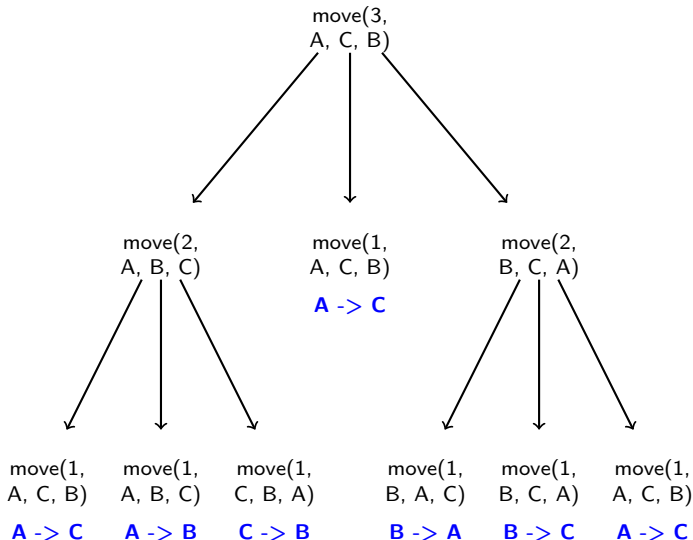
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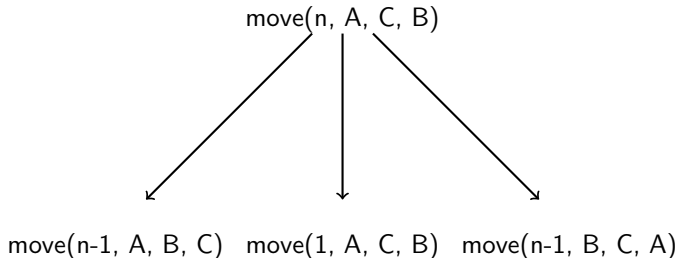
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# The Towers of Hanoi : General



## Complexity

$$T(n) = 1 + 2T(n - 1)$$

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# The Towers of Hanoi

## Complexity

$$T(n) = 1 + 2T(n - 1)$$

$$\Rightarrow T(n) = 1 + 2 + 2^2 + \dots + 2^{n-1}$$

$$\Rightarrow T(n) = 2^n - 1$$

$$\Rightarrow T(n) = O(2^n)$$

- With 64 disks, total number of moves:  
 $2^{64} - 1 \approx 2^4 \times 2^{60} \approx 2^4 \times 10^{18} = 1.6 \times 10^{19}$
- If one move takes 1s,  $2^{64}$  moves take about  $5 \times 10^{11}$  years (500 billions years).

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# The Towers of Hanoi

```
1 Algorithm move(val disks <integer>, val source  
   <character>, val destination <character>, val  
   auxiliary <character>)  
2 Move disks from source to destination.  
3 Pre: disks is the number of disks to be moved  
4 Post: steps for moves printed  
5 print("Towers: ", disks, source, destination, auxiliary)  
6 if disks = 1 then  
7   |   print ("Move from", source, "to", destination)  
8 else  
9   |   move(disks - 1, source, auxiliary, destination)  
10  |   move(1, source, destination, auxiliary)  
11  |   move(disks - 1, auxiliary, destination, source)  
12 end  
13 return  
14 End move
```

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# Recursion and backtracking

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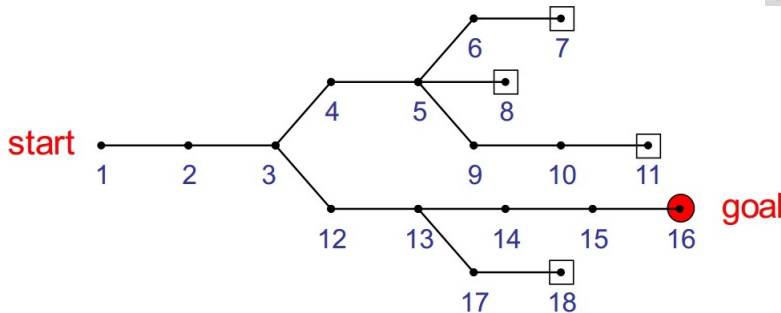
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# Backtracking

## Definition

A process to go **back to previous steps** to **try unexplored alternatives**.

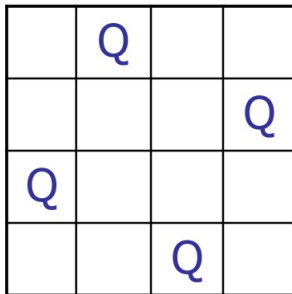
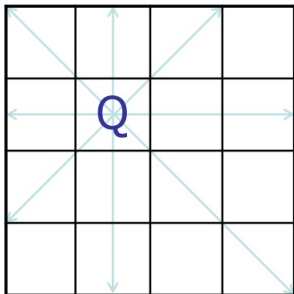


**Hình:** Goal seeking



# Eight Queens Problem

Place eight queens on the chess board in such a way that no queen can capture another.



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## Eight Queens Problem

- 1 **Algorithm** putQueen(ref board <array>, val r <integer>)
- 2 Place remaining queens safely from a row of a chess board.
- 3 **Pre:** board is nxn array representing a chess board
- 4 r is the row to place queens onwards
- 5 **Post:** all the remaining queens are safely placed on the board; or backtracking to the previous rows is required

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## Eight Queens Problem

```
1 for every column  $c$  on the same row  $r$  do
2   if cell  $r, c$  is safe then
3     place the next queen in cell  $r, c$ 
4     if  $r < n-1$  then
5       | putQueen (board,  $r + 1$ )
6     else
7       | output successful placement
8     end
9     remove the queen from cell  $r, c$ 
10  end
11 end
12 return
13 End putQueen
```

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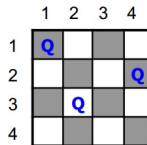
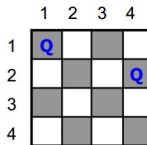
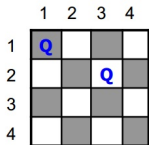
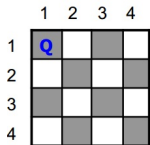
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# Eight Queens Problem



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# Recursion implementation in C/C++

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# Fibonacci Numbers

```
#include <iostream>
using namespace std;

long fib(long num);

int main () {
    int num;
    cout << "What Fibonacci number
    do you want to calculate? ";
    cin >> num;
    cout << "The " << num << "th Fibonacci number
    is: " << fib(num) << endl;
    return 0;
}

long fib(long num) {
    if (num == 0 || num == 1)
        return num;
    return fib(num-1) + fib(num-2);
}
```

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# The Towers of Hanoi

```
#include <iostream>
using namespace std;

void move(int n, char source,
          char destination, char auxiliary);

int main () {
    int numDisks;
    cout << "Please enter number of disks: ";
    cin >> numDisks;
    cout << "Start Towers of Hanoi" << endl;
    move(numDisks, 'A', 'C', 'B');
    return 0;
}
```

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# The Towers of Hanoi

```
void move(int n, char source,
          char destination, char auxiliary){
    static int step = 0;

    if (n == 1)
        cout << "Step_" << ++step << ":_Move_from_"
              << source << "_to_" << destination << endl;
    else {
        move(n-1, source, auxiliary, destination);
        move(1, source, destination, auxiliary);
        move(n - 1, auxiliary, destination, source);
    }
    return;
}
```

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# Algorithm Efficiency

# Compare Algorithms

- Given 2 or more algorithms to solve the same problem, how do we select the best one?
- Some criteria for selecting an algorithm
  - Is it easy to implement, understand, modify?
  - How long does it take to run it to completion?
  - How much of computer memory does it use?
- Software engineering is primarily concerned with the first criteria
- In this course we are interested in the second and third criteria

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- **Time complexity:** the amount of time that an algorithm needs to run to completion.
- **Space complexity:** the amount of memory an algorithm needs to run.
- We will occasionally look at space complexity, but we are mostly interested in time complexity in this course.
- Thus in this course the better algorithm is the one which runs faster (has smaller time complexity).

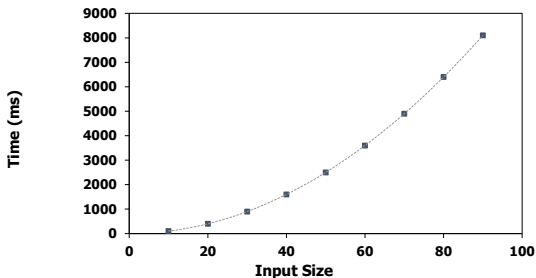


## How to Calculate Running time

- Most algorithms transform input objects into output objects.



- The running time of an algorithm typically grows with the input size  $f(n)$ .



# How to Calculate Running Time

- Even on inputs of the same size, running time can be very different.
  - Example: algorithm that searches an array containing  $n$  integers to find the one with a particular value  $K$  (assume that  $K$  appears exactly once in the array)
- Idea: analyze running time in the
  - best case
  - worst case
  - average case

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# How to Calculate Running Time

- Best case running time is usually useless
- Average case time is very useful but often difficult to determine
- We focus on the worst case running time
  - Easier to analyze
  - Crucial to applications such as games, finance and robotics

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# Evaluations of Running Time

- There are two ways to compare running time between algorithms:
  - Experimental evaluation
  - Theoretical evaluation

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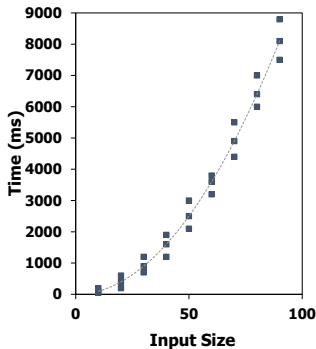
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# Experimental Evaluation of Running Time

- Write a program implementing the algorithm
- Run the program with inputs of varying size and composition
- Measure accurately the actual running time
- Plot the results



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# Limitations of Experiments

- It is necessary to implement the algorithm, which may be difficult
- Results may not be indicative of the running time on other inputs not included in the experiment
- In order to compare two algorithms, the same hardware and software environments must be used

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# Theoretical Analysis of Running Time

- Uses a pseudo-code description of the algorithm instead of an implementation
- Characterizes running time as a function of the input size,  **$n$**
- Takes into account all possible inputs
- Allows us to evaluate the speed of an algorithm independent of the hardware/software environment

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# Primitive Operations

- For theoretical analysis, we will count **primitive** or **basic** operations, which are simple computations performed by an algorithm
- Example:
  - Evaluating an expression:  $x^2 + 3x$
  - Assigning a value to a variable:  $x = y$
  - Indexing into an array:  $a[10]$
  - Calling a function:  $mySwap(a, b)$
  - Returning from a function:  $return(x)$

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# Counting Primitive Operations

- By inspecting the pseudocode, we can determine the maximum number of primitive operations executed by an algorithm, as a function of the input size

## Algorithm findMax(a, n)

```
currentMax = a[0]           //2
i = 1                       //2
while (i < n)                 //n
    if (currentMax < a[i])    //2n-2
        currentMax = a[i]    //2n-2
    i = i + 1                 //2n-2
return currentMax            //1
```



# Estimating Running Time

- Algorithm `findMax()` executes  $7n - 1$  primitive operations in the worst case. Define:
  - $a$  = Time taken by the fastest primitive operation
  - $b$  = Time taken by the slowest primitive operation
- Let  $f(n)$  be worst-case time of `arrayMax`. Then  $a(7n - 1) \leq f(n) \leq b(7n - 1)$
- Hence, the running time  $f(n)$  is bounded by two linear functions

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# Growth Rate of Running Time

- Changing the hardware/software environment
  - Affects  $f(n)$  by a constant factor, but
  - Does not alter the growth rate of  $f(n)$
- Thus we focus on the big-picture which is the growth rate of an algorithm
- The linear growth rate of the running time  $f(n)$  is an intrinsic property of algorithm `findMax()`

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# Linear Loops

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

The number of times the body of the loop is replicated is  $n$ .

$$f(n) = n$$

```
for (i = 0; i < n; i += 2)  
    application code
```

The number of times the body of the loop is replicated is  $n/2$ .

$$f(n) = n/2$$

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# Logarithmic Loops

## Multiply loops

```
i = 1
while (i <= n)
    application code
    i = i x 2
```

## Divide loops

```
i = n
while (i >= 1)
    application code
    i = i / 2
```

The number of times the body of the loop is replicated is

$$f(n) = \log_2 n$$

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# Nested Loops

Iterations = Outer loop iterations  $\times$  Inner loop iterations

## Example

```
i = 1
while (i <= n)
    j = 1
    while (j <= n)
        application code
        j = j * 2
    i = i + 1
```

The number of times the body of the loop is replicated is

$$f(n) = n \log_2 n$$

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# Quadratic Loops

## Example

```
i = 1
while (i <= n)
    j = 1
    while (j <= n)
        application code
        j = j + 1
    i = i + 1
```

The number of times the body of the loop is replicated is

$$f(n) = n^2$$

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## Data structures and Algorithms: Basic concepts

- Algorithm
- Pseudocode
- Data structures
- Classes
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- Arrays

## Recursion

- Properties of recursion
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## Complexity of Algorithms

### Algorithm Efficiency

- Asymptotic Analysis
- Problems and common complexities
- P and NP Problems

# Dependent Quadratic Loops

## Example

```
i = 1
while (i <= n)
    j = 1
    while (j <= i)
        application code
        j = j + 1
    i = i + 1
```

The number of times the body of the loop is replicated is

$$1 + 2 + \dots + n = n(n + 1)/2$$

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- The growth rate is not affected by
  - constant factors or
  - lower-order terms
- Examples
  - $10^3n + 10^5$  is a linear function
  - $10n^2 + 10^4n$  is a quadratic function
- How do we get rid of the constant factors to focus on the essential part of the running time?



- Algorithm efficiency is considered with only **big problem sizes**.
- We are **not concerned** with an **exact measurement** of an algorithm's efficiency.
- Terms that do **not substantially change** the function's magnitude are eliminated.





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# Asymptotic Analysis

There are three common notations for asymptotic analysis:

- Big-Oh:  $O(\cdot)$
- Big-Omega:  $\Omega(\cdot)$
- Big-Theta:  $\Theta(\cdot)$





# Big-Oh notation

- The big-Oh notation is used widely to characterize running times and space bounds
- The big-Oh notation allows us to ignore constant factors and lower order terms and focus on the main components of a function which affect its growth

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- Given functions  $f(n)$  and  $g(n)$ , we say that  $f(n)$  is  $O(g(n))$  if there are positive constants  $c$  and  $n_0$  such that:  $f(n) \leq c.g(n)$  for  $n \geq n_0$
- Example:  $2n + 10$  is  $O(n)$
- Why?



# Big-Oh Rules

## Example

$$f(n) = c.n \Rightarrow f(n) = O(n)$$

$$f(n) = n(n+1)/2 = n^2/2 + n/2 \Rightarrow f(n) = O(n^2)$$

- Set the **coefficient** of the term to **one**.
- Keep the **largest term** and discard the others.

Some example of Big-O:

$1 \quad \log_2 n \quad n \quad n \log_2 n \quad n^2 \quad \dots \quad n^k \quad \dots \quad 2^n$   
 $n!$

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# Big-Oh and Growth Rate

- The big-Oh notation gives an upper bound on the growth rate of a function
- The statement “ $f(n)$  is  $O(g(n))$ ” means that the growth rate of  $f(n)$  is no more than the growth rate of  $g(n)$
- We can use the big-Oh notation to rank functions according to their growth rate

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# Standard Measures of Efficiency

Efficiency	Big-O	Iterations	Est. Time
logarithmic	$O(\log_2 n)$	14	microseconds
linear	$O(n)$	10 000	0.1 seconds
linear log	$O(n \log_2 n)$	140 000	2 seconds
quadratic	$O(n^2)$	$10000^2$	15-20 min.
polynomial	$O(n^k)$	$10000^k$	hours
exponential	$O(2^n)$	$2^{10000}$	intractable
factorial	$O(n!)$	$10000!$	intractable

Assume instruction speed of 1 microsecond and 10 instructions in loop.

$$n = 10000$$

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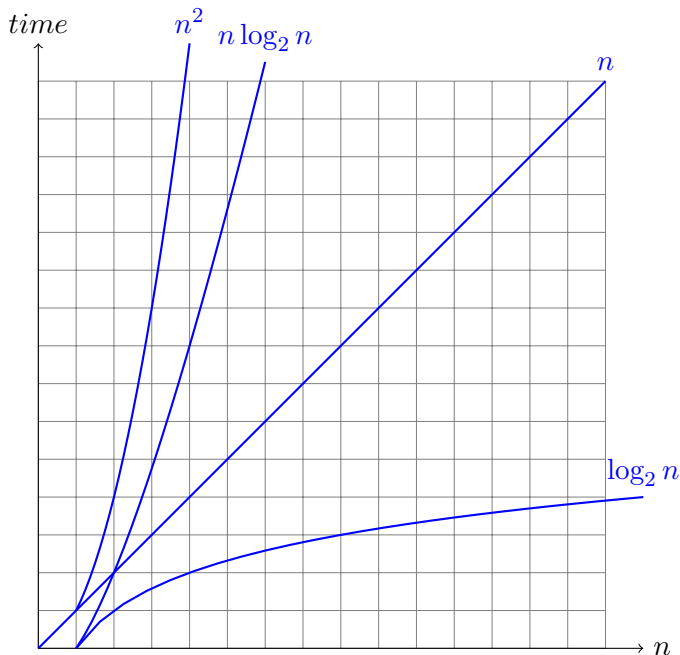
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# Standard Measures of Efficiency



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- big-Omega
  - $f(n)$  is  $\Omega(g(n))$  if there is a constant  $c > 0$  and an integer constant  $n_0 \geq 1$  such that  $f(n) \geq c.g(n)$  for  $n \geq n_0$
- big-Theta
  - $f(n)$  is  $\Theta(g(n))$  if there are constants  $c' > 0$  and  $c'' > 0$  and an integer constant  $n_0 \geq 1$  such that  $c'.g(n) \geq f(n) \geq c''.g(n)$  for  $n \geq n_0$



# Intuition for Asymptotic Notation

- Big-Oh:  $f(n)$  is  $O(g(n))$  if  $f(n)$  is asymptotically less than or equal to  $g(n)$
- Big-Omega:  $f(n)$  is  $\Omega(g(n))$  if  $f(n)$  is asymptotically greater than or equal to  $g(n)$
- Big-Theta:  $f(n)$  is  $\Theta(g(n))$  if  $f(n)$  is asymptotically equal to  $g(n)$

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# Problems and common complexities

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## Recurrence Equation (Phương trình hồi quy)

An equation or inequality that describes a **function** in terms of its value on **smaller input**.

1	2	3	5	8	13	21	34	55	89
---	---	---	---	---	----	----	----	----	----

$$T(n) = 1 + T(n/2) \Rightarrow T(n) = O(\log_2 n)$$

- **Best case**: when the number of steps is smallest.  $T(n) = O(1)$
- **Worst case**: when the number of steps is largest.  $T(n) = O(\log_2 n)$
- **Average case**: in between.  
 $T(n) = O(\log_2 n)$



# Sequential search

8	5	21	2	1	13	4	34	7	18
---	---	----	---	---	----	---	----	---	----

- Best case:  $T(n) = O(1)$
- Worst case:  $T(n) = O(n)$
- Average case:  $T(n) = \sum_{i=1}^n i \cdot p_i$   
 $p_i$  : probability for the target being at a[i]  
 $p_i = 1/n \Rightarrow T(n) = (\sum_{i=1}^n i) / n =$   
 $O(n(n+1)/2n) = O(n)$



## Quick sort

19	8	3	15	28	10	22	4	12	83
----	---	---	----	----	----	----	---	----	----

### Recurrence Equation

$$T(n) = O(n) + 2T(n/2)$$

- Best case:  $T(n) = O(n \log_2 n)$
- Worst case:  $T(n) = O(n^2)$
- Average case:  $T(n) = O(n \log_2 n)$

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## P and NP Problems

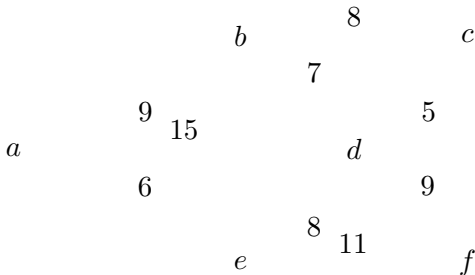
- **P**: Polynomial (can be solved in polynomial time on a **deterministic** machine).
- **NP**: Nondeterministic Polynomial (can be solved in polynomial time on a **non-deterministic** machine).



## Travelling Salesman Problem:

A salesman has a list of cities, each of which he must visit exactly once. There are direct roads between each pair of cities on the list.

Find the route the salesman should follow for the shortest possible round trip that both starts and finishes at any one of the cities.





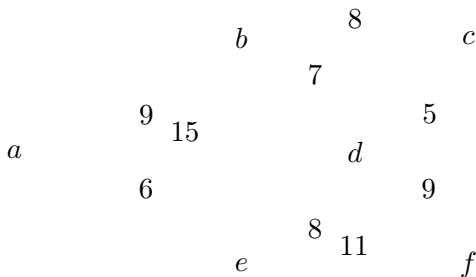
# P and NP Problems

## Travelling Salesman Problem:

Deterministic machine:

$$f(n) = n(n-1)(n-2) \dots 1 = O(n!)$$

$\Rightarrow$  NP problem



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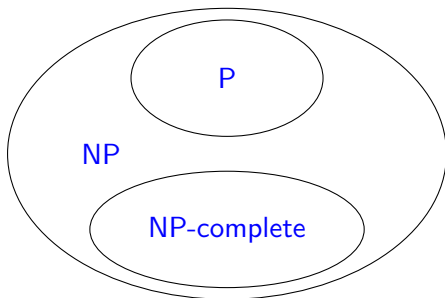
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P and NP Problems

# P and NP Problems

**NP-complete:** NP and every other problem in NP is polynomially reducible to it.



$P = NP?$



Read more on

# Data Structures and Algorithm Analysis

## Edition 3.2 (C++ Version)

### Part I, Chapter 1, Chapter 2, Chapter 3

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**P and NP Problems**