

# Chapter 10

## Trees

*Discrete Structures for Computing* on 27 May 2014

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Trees

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Tree Traversal

Applications of Trees

Binary Search Trees

Decision Trees

Spanning Trees

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Prim's Algorithm

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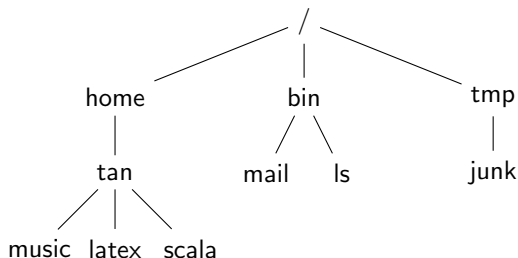
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Prim's Algorithm

Kruskal's Algorithm

# Introduction

- Very useful in computer science: search algorithm, game winning strategy, decision making, sorting, ...
- Other disciplines: chemical compounds, family trees, organizational tree, ...



# Tree

## Definition

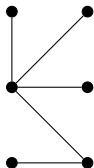
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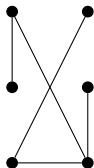
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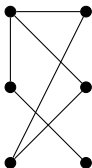
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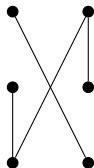
$G_1$



$G_2$



$G_3$



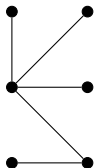
$G_4$



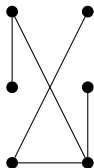
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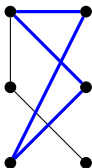
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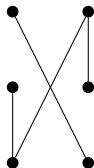
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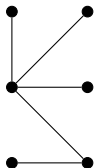
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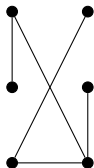
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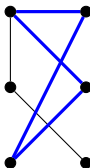
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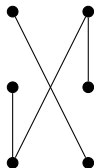


$G_2$



$G_3$

circuit exists



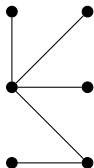
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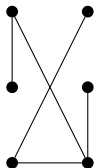
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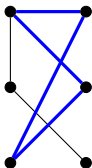
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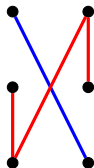
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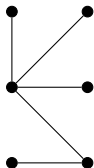




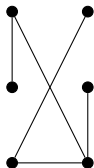
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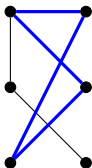
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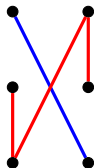
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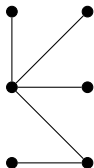
not connected



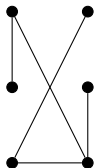
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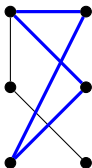
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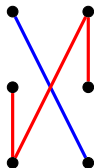
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not connected

## Definition

Graphs containing no simple circuits that are not necessarily connected is **forest** (rừng), in which each connected component is a tree.



## Definition

A **rooted tree** (*cây có gốc*) is a tree in which:

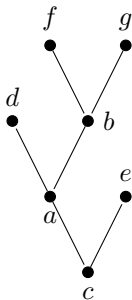
- One vertex has been designated as the root and
- Every edge is directed away from the root



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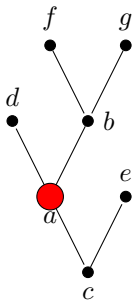
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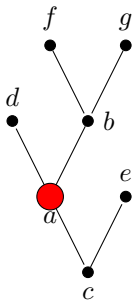




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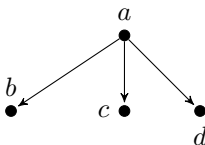
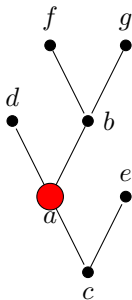
*a*

A single black dot representing a vertex, labeled with the letter 'a' above it.

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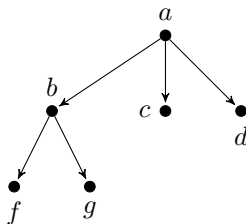
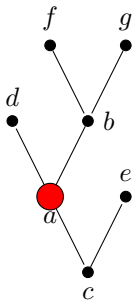
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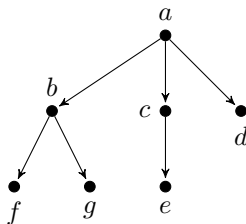
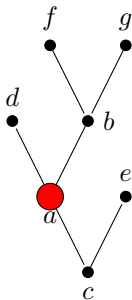




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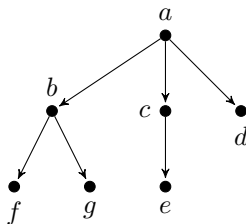
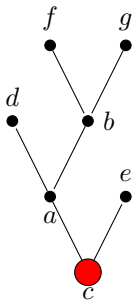
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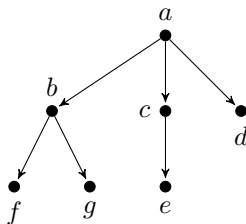
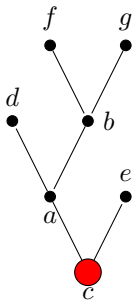
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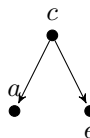
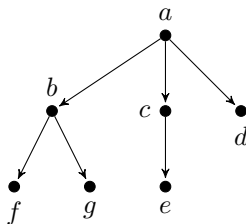
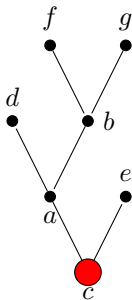
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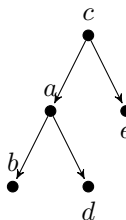
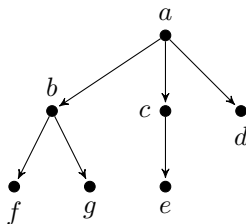
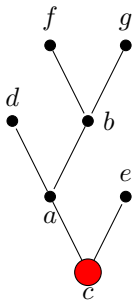
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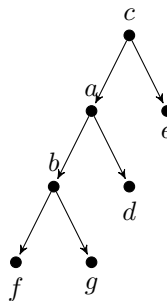
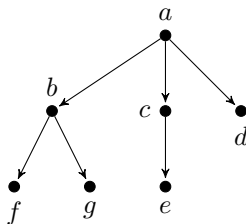
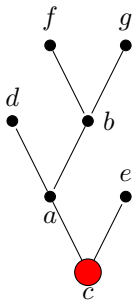


# Rooted Trees

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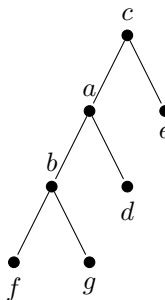
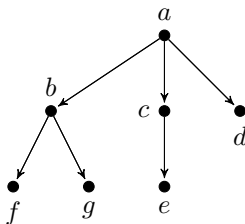
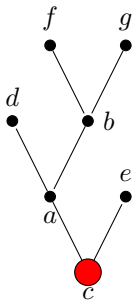


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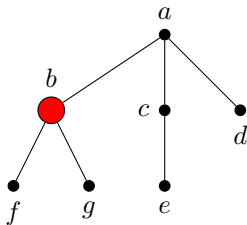
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# Terminology

## Definition

- **parent** (*cha*) of  $v$  is the unique  $u$  such that there is a directed edge from  $u$  to  $v$
- when  $u$  is the **parent** of  $v$ ,  $v$  is called a **child** (*con*) of  $u$
- vertices with the same **parent** are called **siblings** (*anh em*)
- the **ancestors** (*tổ tiên*) of a vertex are the vertices in the path from the root to this vertex (excluding the vertex itself)
- **descendants** (*con cháu*) of a vertex  $v$  are those vertices that have  $v$  as an **ancestor**

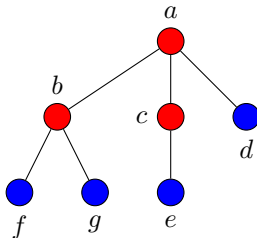






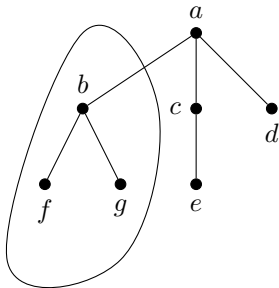
## Definition

- a vertex of a tree is called a **leaf** (*lá*) if it has no children
- vertices that have children are called **internal vertices** (*đỉnh trong*)



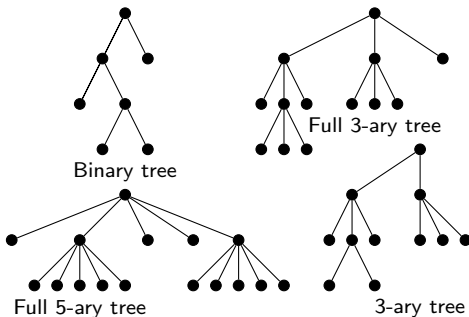
## Definition

If  $a$  is a vertex in a tree, the **subtree** (cây con) with  $a$  as its root is the subgraph of the tree consisting of  $a$  and its descendants and all edges incident to these descendants.



## Definition

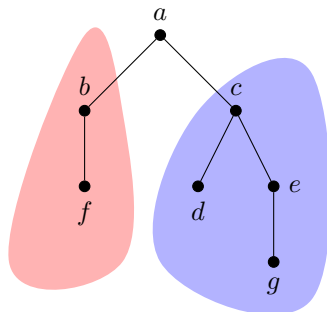
- $m$ -ary tree (cây  $m$ -phân): at most  $m$  children on each internal vertex of a rooted tree.
- full  $m$ -ary tree (cây  $m$ -phân đầy đủ): every internal vertex has exactly  $m$  children.
- An  $m$ -ary tree with  $m = 2$  is called a binary tree (cây nhị phân).



# Ordered Rooted Trees

## Definition

- An **ordered rooted tree** (*cây có gốc có thứ tự*) is a rooted tree where the children of each internal vertex are ordered (e.g. in order from left to right).



Left subtree of  $a$

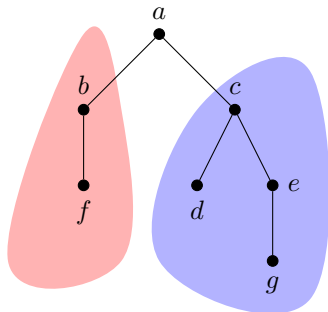
Right subtree of  $a$



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- In an **ordered binary tree** (*cây nhị phân có thứ tự*), if an internal vertex has two children, the first child is called the **left child** (*con bên trái*) and the second is called the **right child** (*con bên phải*).



Left subtree of  $a$

Right subtree of  $a$



## Theorem

*A tree with  $n$  vertices has  $n - 1$  edges.*

## Theorem

*A full  $m$ -ary tree with  $i$  internal vertices contains  $n = mi + 1$  vertices.*



## Theorem

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## Theorem

A full  $m$ -ary tree with  $i$  internal vertices contains  $n = mi + 1$  vertices.

- (i)  $n$  vertices has  $(n - 1)/m$  internal vertices and  $[(m - 1)n + 1]/m$  leaves
- (ii)  $i$  internal vertices has  $n = mi + 1$  vertices and  $(m - 1)i + 1$  leaves
- (iii)  $\ell$  leaves has  $n = (m\ell - 1)/(m - 1)$  vertices and  $(\ell - 1)/(m - 1)$  internal vertices



## Example

### Example (Chain Letter Game)

- Each person who receives the letter is asked to send it on to four other peoples.
- Some peoples do this, but others do not send any letters.
- How many people have seen the letter, including the first person, if no one receives more than one letter and if the chain letter ends after there have been 100 people who read it but did not send it out ?
- How many people sent out the letter?





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### Solution

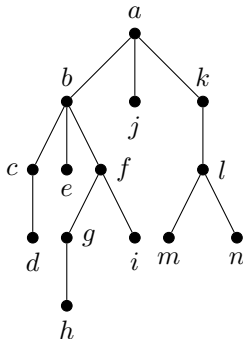
- *Using 4-ary tree with 100 leaves corresponding to 100 persons who did not send out the letter.*
- $\Rightarrow n = (ml - 1)/(m - 1) = (4 \times 100 - 1)/(4 - 1) = 133$  vertices and  $i = n - l = 133 - 100 = 33$  internal vertices.



# Level and Height

## Definition

- The **level** (*mức*) of a vertex  $v$  in a rooted tree is the length of the unique path from the root to this vertex.
- The **level** of the root is defined to be zero.
- The **height** (*độ cao*) of a rooted tree is the maximum of the levels of vertices (i.e. the length of the longest path from the root to any vertex).



## Example

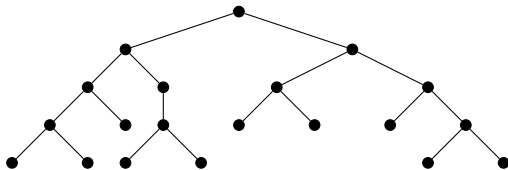
- Level of root  $a = 0$ ,  
 $b, j, k = 1$  and  
 $c, e, f, l = 2 \dots$
- Because the largest level of any vertex is 4, this tree has height 4.



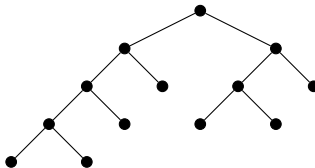
# Balanced $m$ -ary Trees

## Definition

A rooted  $m$ -ary tree of height  $h$  is **balanced** (*cân đối*) if all leaves are at levels  $h$  or  $h - 1$ .



$T_1$



$T_2$



# Balanced $m$ -ary Tree

## Theorem

*There are at most  $m^h$  leaves in an  $m$ -ary tree of height  $h$ .*



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It can be proved by using mathematical induction on the height.



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It can be proved by using mathematical induction on the height.

## Corollary

- *If an  $m$ -ary tree of height  $h$  has  $\ell$  leaves, then  $h \geq \lceil \log_m \ell \rceil$ .*
- *If the  $m$ -ary tree is full and balanced, then  $h = \lceil \log_m \ell \rceil$ .*



## Exercise

### Exercise (Chess tournament)

Suppose 1000 people enter a chess tournament. Use a rooted tree model of the tournament to determine how many games must be played to determine a champion. If a player is eliminated after one loss and games are played until only one entrant has not lost. (Assume there are no ties)

### Exercise (Isomorphic)

How many different isomers (*đồng phân*) do the following saturated hydrocarbons have ?

- $C_3H_8$
- $C_5H_{12}$
- $C_6H_{14}$





## Exercise

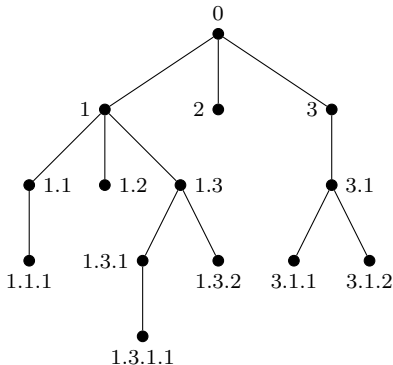
- How many vertices and how many leaves does a complete  $m$ -ary tree of height  $h$  have?
- Show that a full  $m$ -ary balanced tree (*cây  $m$ -phân hoàn hảo*) of height  $h$  has more than  $m^{h-1}$  leaves.
- How many edges are there in a forest of  $t$  trees containing a total of  $n$  vertices?



# Labeling Ordered Rooted Trees

- **Ordered rooted trees** are often used to store information.
- Need a procedure for visiting each vertex of an **ordered rooted tree** to access data.
- Ordering and labeling the vertices is important to traverse them in any procedure
- **Universal address system** (*hệ địa chỉ phổ dụng*)

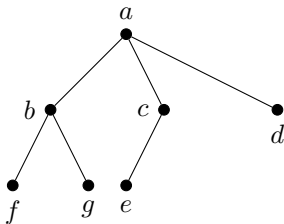
$0 < 1 < 1.1 < 1.1.1 < 1.2 < 1.3 < \dots < 2 < 3 < 3.1 < \dots$



# Traversal Algorithms (Thuật toán duyệt cây)

## Preorder Traversal (duyet tien thứ tự)

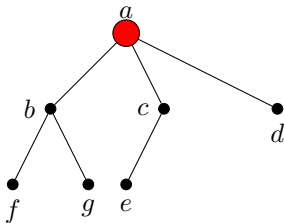
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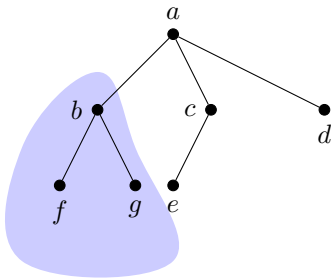
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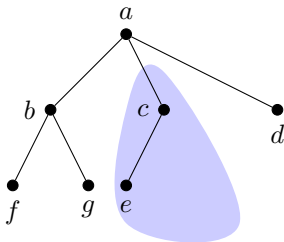
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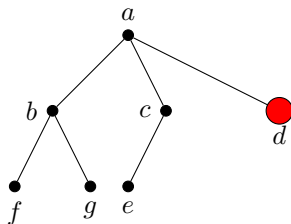
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a

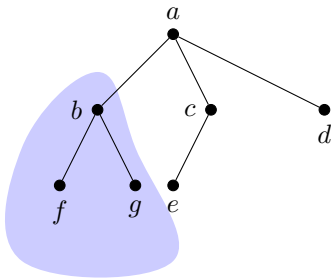
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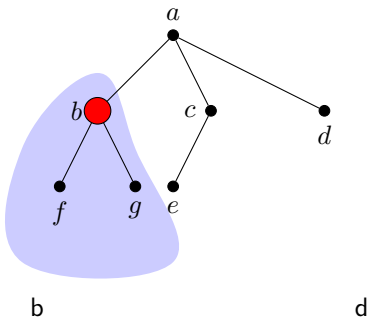
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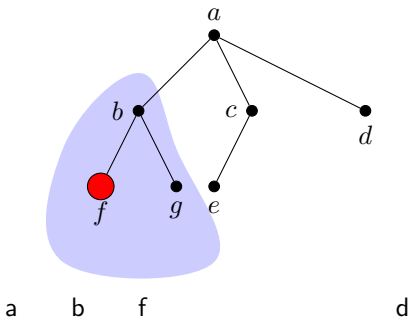




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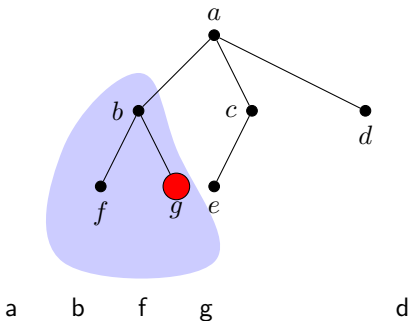
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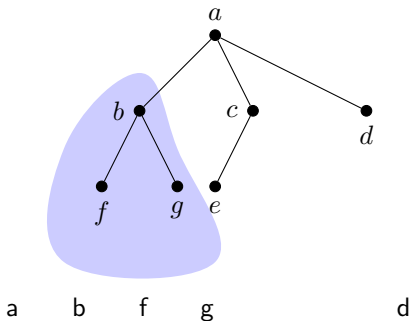
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# Traversal Algorithms (Thuật toán duyệt cây)

## Preorder Traversal (duyet tien thur tu)

```
procedure preorder( $T$ : ordered rooted tree)  
   $r := \text{root of } T$   
  print  $r$   
  for each child  $c$  of  $r$  from left to right  
     $T(c) := \text{subtree with } c \text{ as its root}$   
    preorder( $T(c)$ )
```



# Traversal Algorithms (Thuật toán duyệt cây)

## Preorder Traversal (duyet tien thur tự)

**procedure** *preorder*( $T$ : ordered rooted tree)

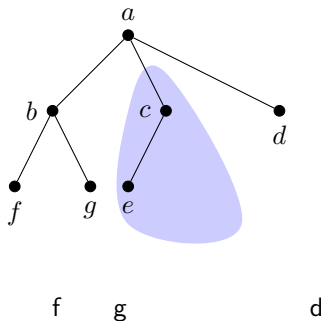
$r := \text{root of } T$

**print**  $r$

**for** each child  $c$  of  $r$  from left to right

$T(c) := \text{subtree with } c \text{ as its root}$

*preorder*( $T(c)$ )



# Traversal Algorithms (Thuật toán duyệt cây)

## Preorder Traversal (duyet tien thur tu)

**procedure** *preorder*( $T$ : ordered rooted tree)

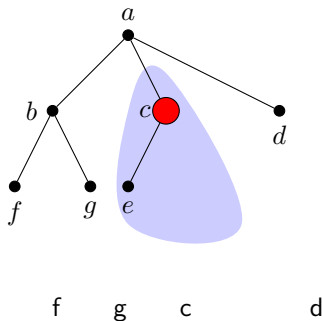
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**print**  $r$

**for** each child  $c$  of  $r$  from left to right

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**procedure** *preorder*( $T$ : ordered rooted tree)

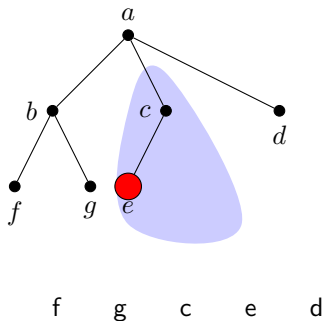
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**print**  $r$

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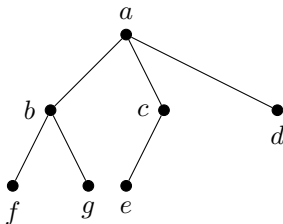
*preorder*( $T(c)$ )



# Traversal Algorithms

## Inorder Traversal (Duyệt trung thứ tự)

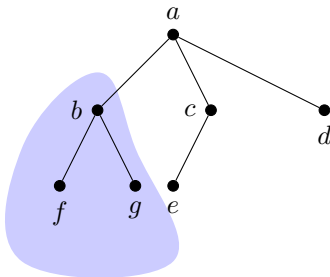
Suppose a tree  $T$  with root  $r$ . If  $T$  consists only of  $r$ , then  $r$  is **inorder traversal** of  $T$ . Otherwise, suppose  $r$  has subtrees  $T_1, T_2, \dots, T_n$  from left to right, **inorder traversal**:  
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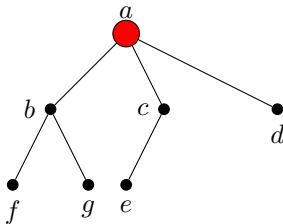




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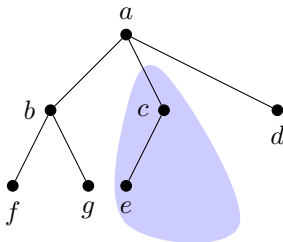
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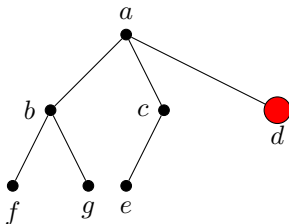
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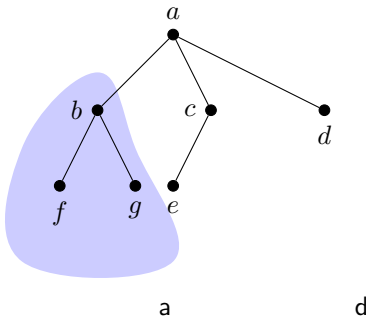
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# Traversal Algorithms

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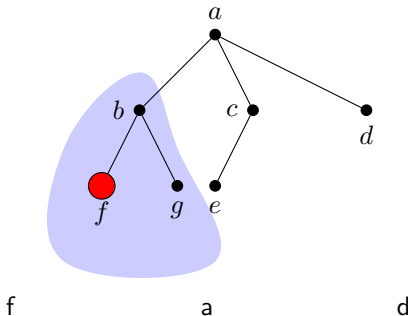
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# Traversal Algorithms

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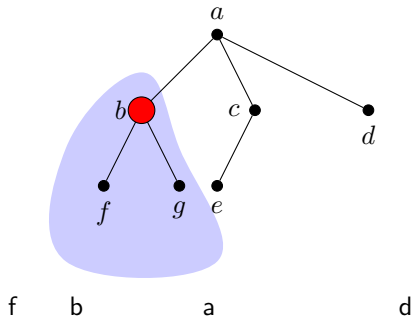
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# Traversal Algorithms

## Inorder Traversal (Duyệt trung thứ tự)

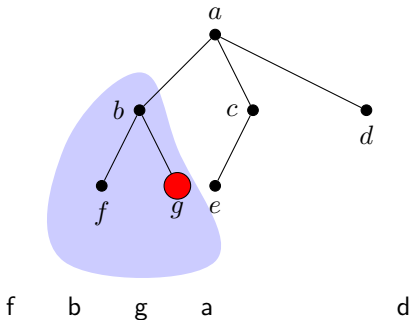
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# Traversal Algorithms

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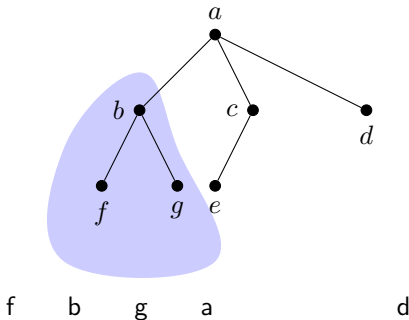
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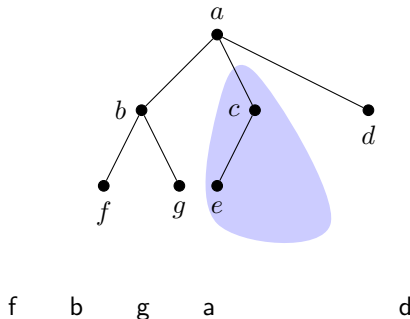




# Traversal Algorithms

## Inorder Traversal (Duyệt trung thứ tự)

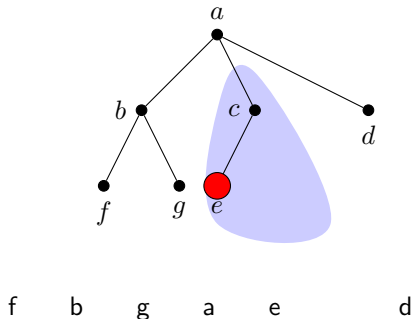
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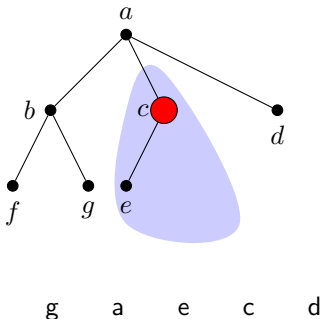
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# Traversal Algorithms

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**procedure** *postorder*( $T$ : ordered rooted tree)

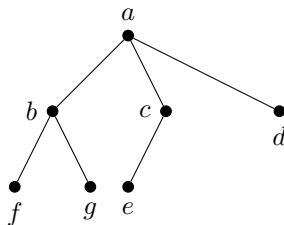
$r :=$  root of  $T$

**for** each child  $c$  of  $r$  from left to right

$T(c) :=$  subtree with  $c$  as its root

*postorder*( $T(c)$ )

**print**  $r$



# Traversal Algorithms

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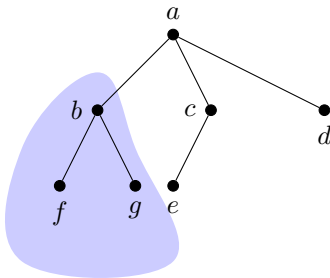
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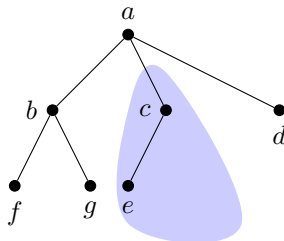
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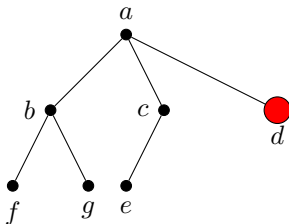
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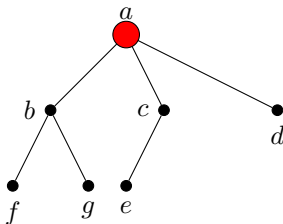
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d    a





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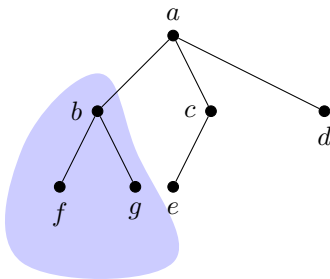
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d    a



## Trees



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## Introduction

## Properties of Trees

## Tree Traversal

## Applications of Trees

## Binary Search Trees

## Decision Trees



## Minimum Spanning Trees

### Prim's Algorithm

### Kruskal's Algorithm

# Traversal Algorithms

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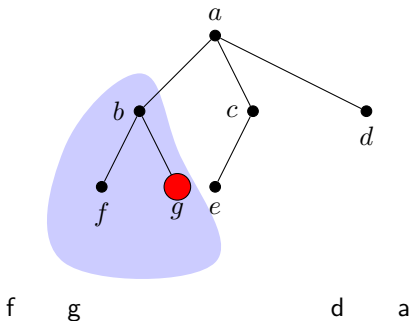
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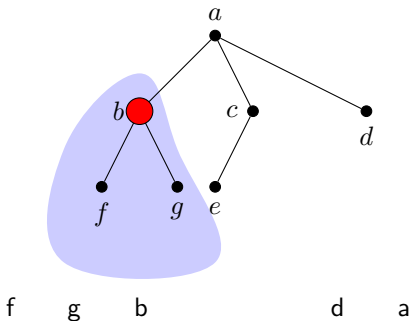
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*postorder*( $T(c)$ )

**print**  $r$



# Traversal Algorithms

## Postorder Traversal (Duyệt hậu thứ tự)

**procedure** *postorder*( $T$ : ordered rooted tree)

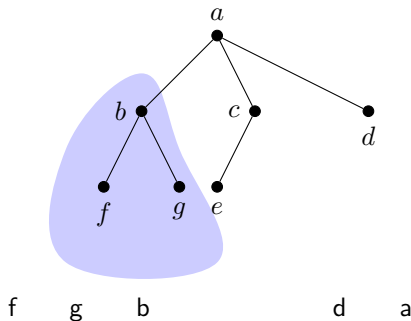
$r :=$  root of  $T$

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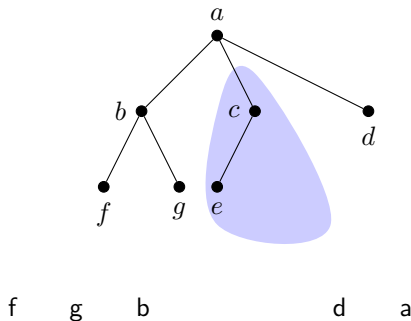
$r := \text{root of } T$

**for** each child  $c$  of  $r$  from left to right

$T(c) := \text{subtree with } c \text{ as its root}$

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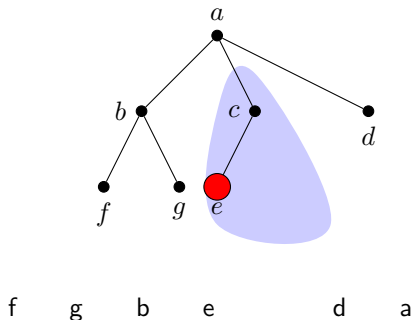
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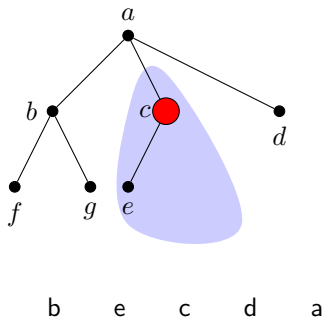
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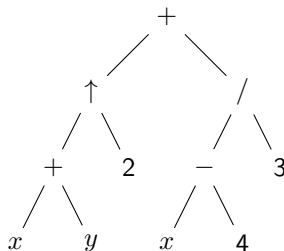


# Infix, Prefix and Postfix Notations

- Infix (*trung tố*):  
 $((x + y) \uparrow 2) + ((x - 4)/3)$

- Prefix (*tiền tố*):  
 $+ \uparrow + x y 2 / - x 4 3$

- Postfix (*hậu tố*):  
 $x y + 2 \uparrow x 4 - 3 / +$



## Exercise

### Exercise

Find the ordered rooted tree representing

$$(\neg(p \wedge q) \vee (\neg q \wedge r)) \rightarrow (\neg p \vee \neg r)$$

Then use this rooted tree to find the prefix, postfix and infix forms of this expression



### Exercise

Find the ordered rooted tree representing

$$(\neg(p \wedge q) \vee (\neg q \wedge r)) \rightarrow (\neg p \vee \neg r)$$

Then use this rooted tree to find the prefix, postfix and infix forms of this expression

### Solution

- *Constructing the rooted tree from the bottom up*
- *Preorder traversal creates prefix notation*  
 $\rightarrow \vee \neg \wedge p q \vee \neg q r \vee \neg p r$
- *Postorder traversal creates postfix notation*  
 $p q \wedge \neg \vee q \neg r \wedge p \neg r \vee \rightarrow$
- *Inorder traversal creates infix notation (with parentheses)*  
 $p q \neg \vee q \neg \wedge r \rightarrow p \neg \vee r$



## Exercise

### Exercise

Find postorder traversal of a binary tree with inorder D B H E I A  
F C J G K and preorder A B D E H I C F G J K.

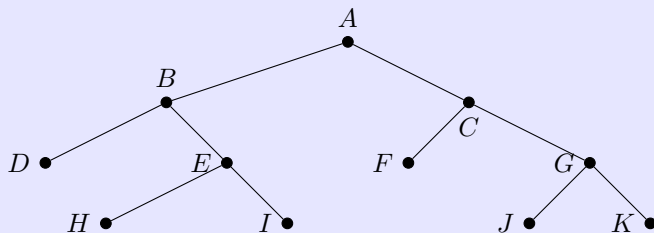


## Exercise

### Exercise

Find postorder traversal of a binary tree with inorder D B H E I A F C J G K and preorder A B D E H I C F G J K.

### Solution



Post order: D H I E B F J K G C A.

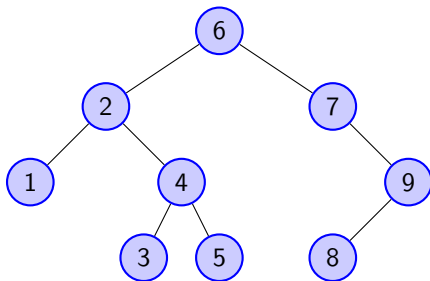


# Binary Search Trees

## Definition

**Binary search tree** (*cây tìm kiếm nhị phân* - BST) is a binary tree in which the assigned key of a vertex is:

- larger than the keys of all vertices in its left subtree, and
- smaller than the keys of all vertices in its right subtree.



# Adding and Locating an Item in BST

## Example

Form a BST for the words *mathematics*, *physics*, *geography*, *zoology*, *meteorology*, *geology*, *psychology*, *chemistry* using alphabetical order.



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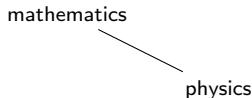
mathematics



# Adding and Locating an Item in BST

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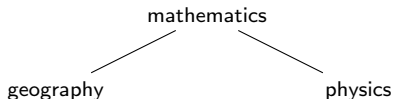
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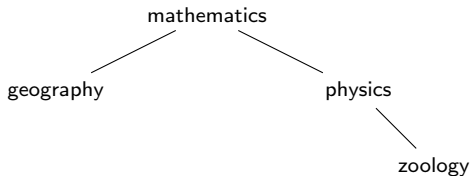
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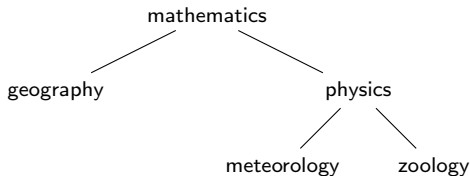
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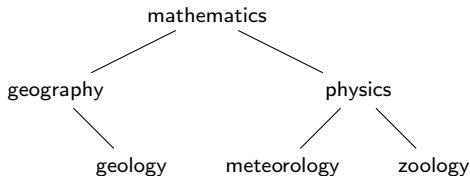
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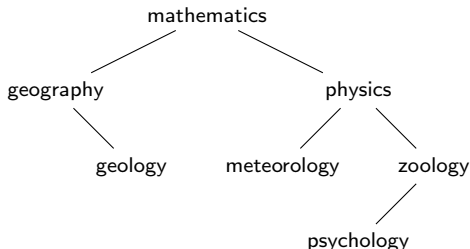
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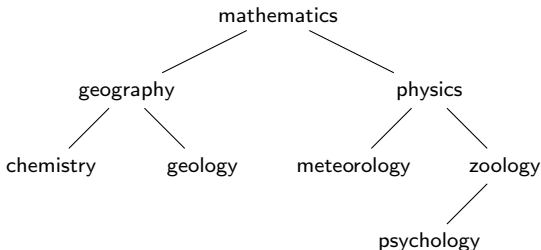
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Form a BST for the words *mathematics*, *physics*, *geography*, *zoology*, *meteorology*, *geology*, *psychology*, *chemistry* using alphabetical order.



## Complexity in searching

$O(\log(n))$  vs.  $O(n)$  in linear list





# Decision Trees (Cây quyết định)

## Example

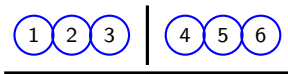
There are seven coins, all with the same weight, and a counterfeit coin that weighs less than the others. How many weighings are necessary using a balance scale to determine which of the eight coins is the counterfeit one? Give an algorithm for finding this counterfeit coin.



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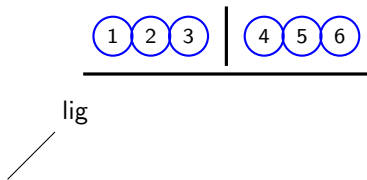
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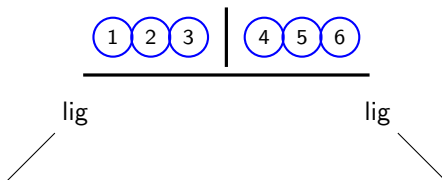
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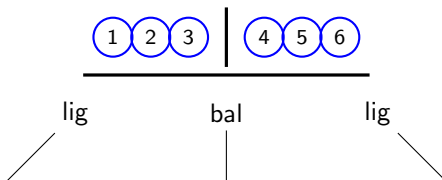
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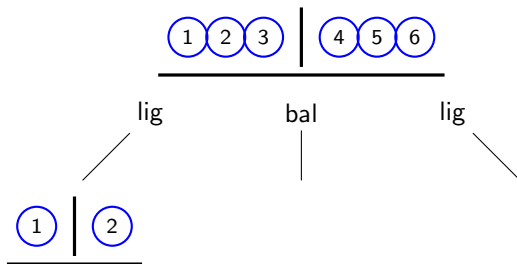
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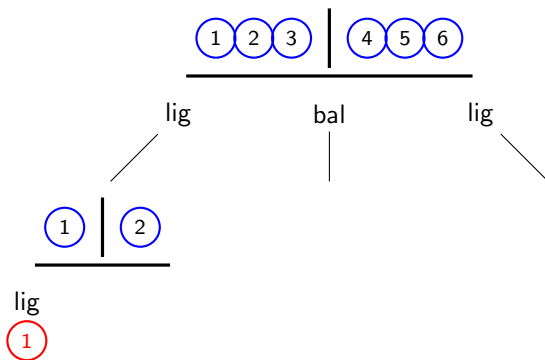
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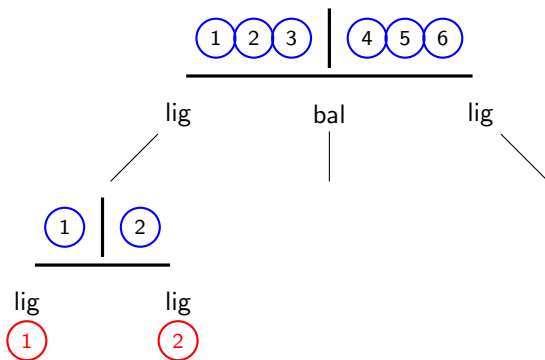
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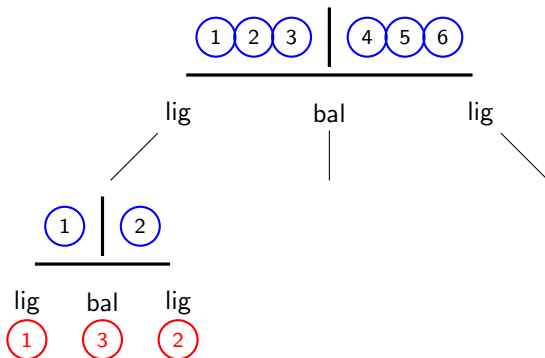




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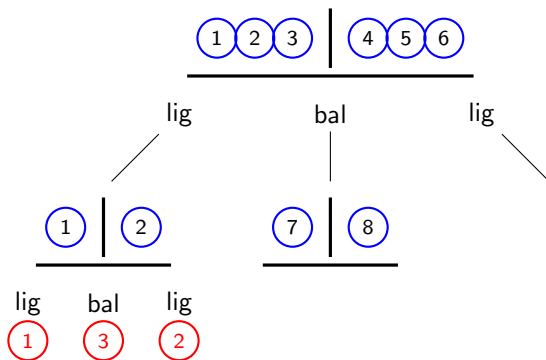
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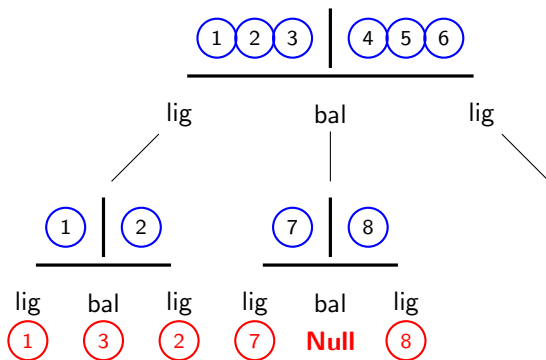
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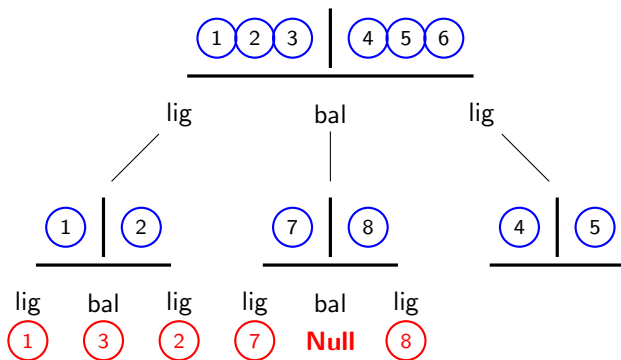
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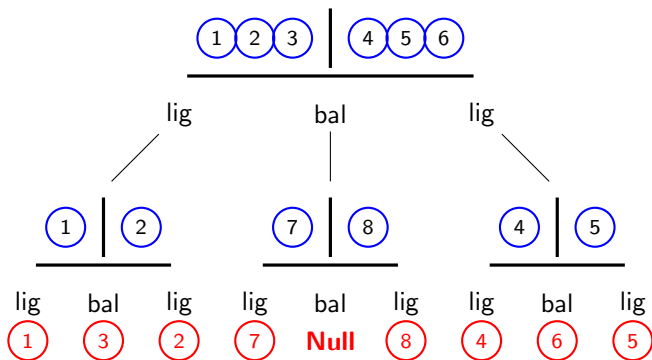
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# Yet Another Application

## Example

If we know that the probability that a person has tuberculosis (TB) is  $p(\text{TB}) = 0.0005$ .

We also know  $p(+|\text{TB}) = 0.999$  and  $p(-|\overline{\text{TB}}) = 0.99$ .

What is  $p(\text{TB}|+)$  and  $p(\overline{\text{TB}}|-)$ ?

Start! ●



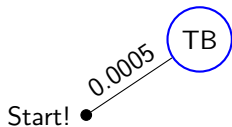
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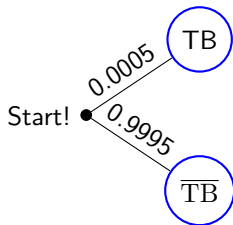
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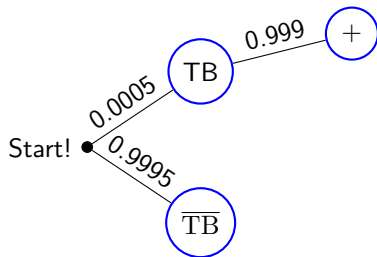
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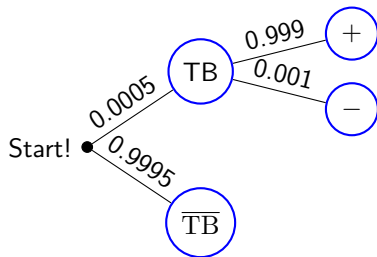
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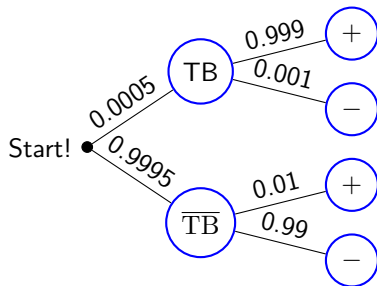
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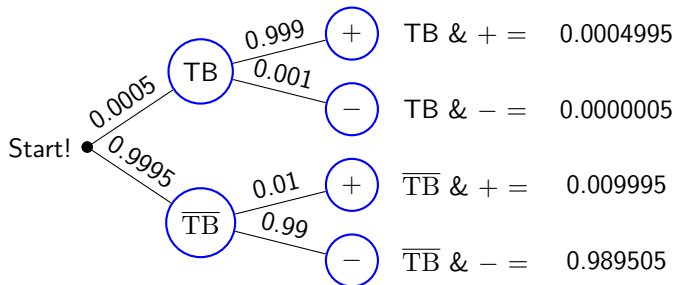
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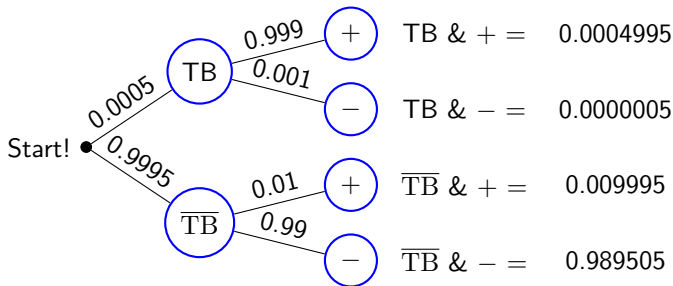
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$$p(\text{TB}|+) = \frac{p(\text{TB} \cap +)}{p(+)} = \frac{0.0004995}{0.0004995 + 0.009995} \approx 0.0476$$



## Definition

- A **spanning tree** (*cây khung*) in a graph  $G$  is a subgraph of  $G$  that is a tree which contains all vertices of  $G$ .

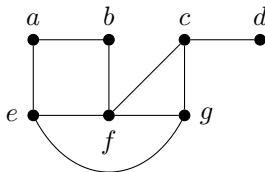


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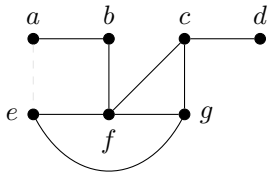
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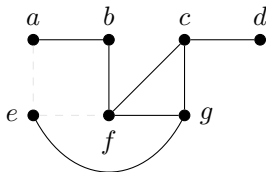
## Trees

Huynh Tuong Nguyen,  
Tran Vinh Tan



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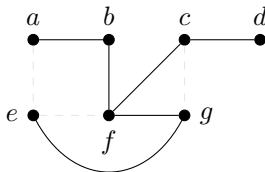
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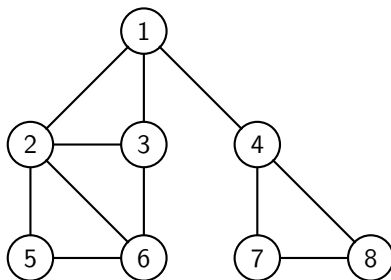
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# Depth-First Search (Tìm kiếm ưu tiên chiều sâu)



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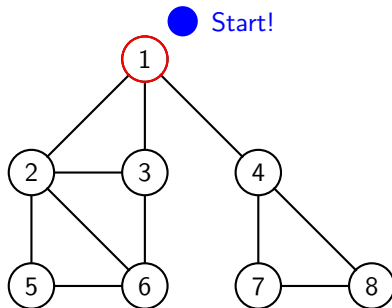
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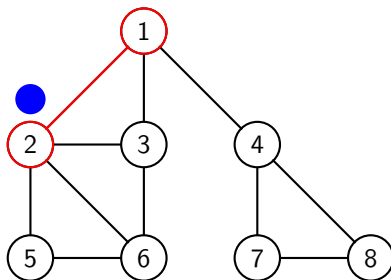
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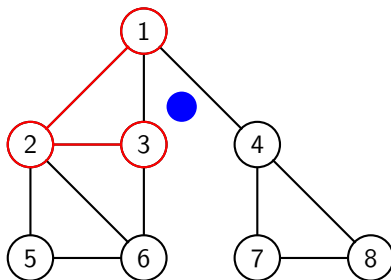
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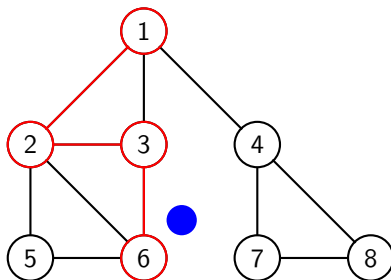
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# Depth-First Search (Tìm kiếm ưu tiên chiều sâu)

Trees

Huỳnh Tuong Nguyen,  
Tran Vinh Tan



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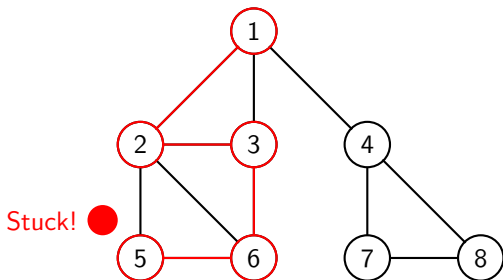
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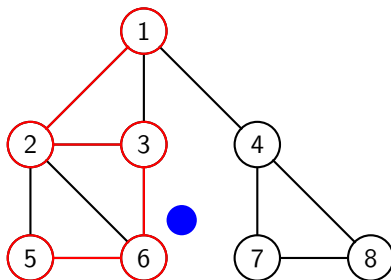
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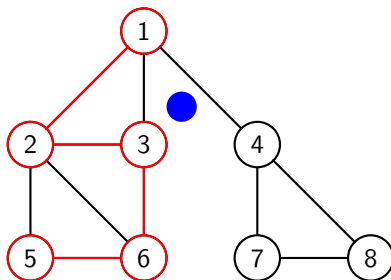
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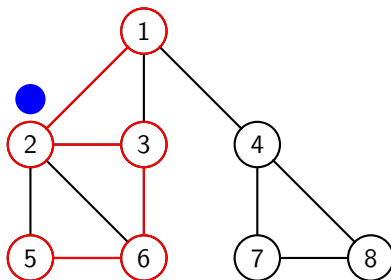
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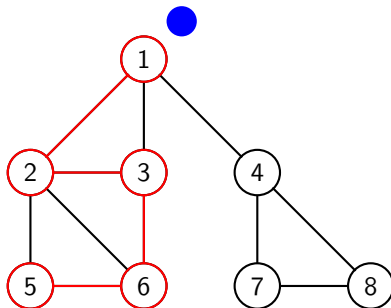
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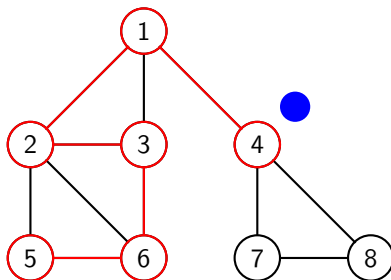
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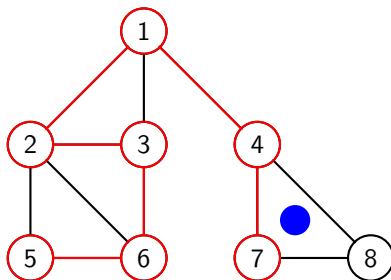
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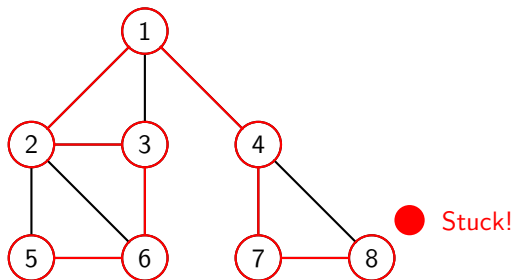
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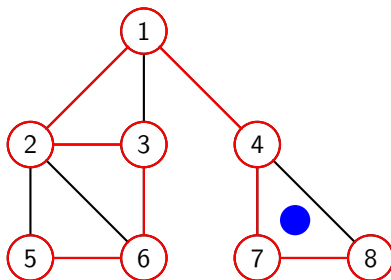
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# Depth-First Search (Tìm kiếm ưu tiên chiều sâu)



# Depth-First Search (Tìm kiếm ưu tiên chiều sâu)



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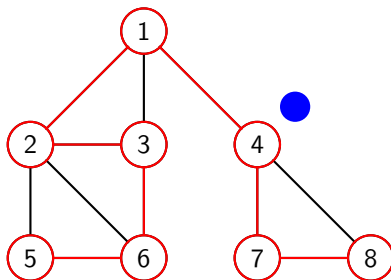
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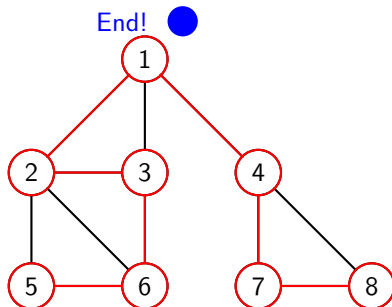
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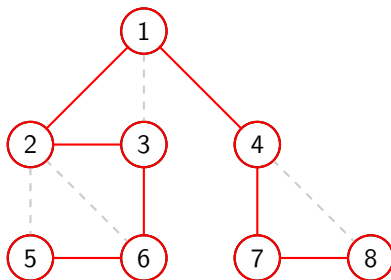
# Depth-First Search (Tìm kiếm ưu tiên chiều sâu)



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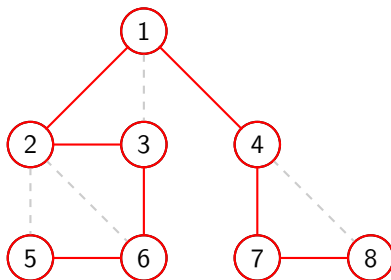
### Spanning Trees

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# Depth-First Search (Tìm kiếm ưu tiên chiều sâu)



## Property

- Go **deeper** as you can
- **Backtrack** (*quay lui*) to possible branch when you are stuck.
- $O(e)$  or  $O(n^2)$





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## Algorithm

**procedure** *DFS* (*G*)

$T :=$  tree consisting only vertex  $v_1$

*visit*( $v_1$ )

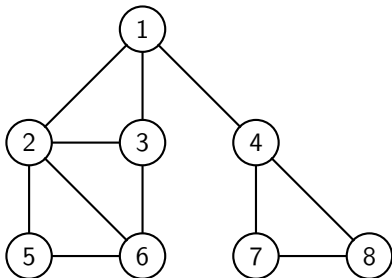
**procedure** *visit*( $v$ : vertex of  $G$ ) /\* recursive \*/

**for** each vertex  $w$  adjacent to  $v$  and not in  $T$

        add  $w$  and edge  $\{v, w\}$  to  $T$

*visit*( $w$ )

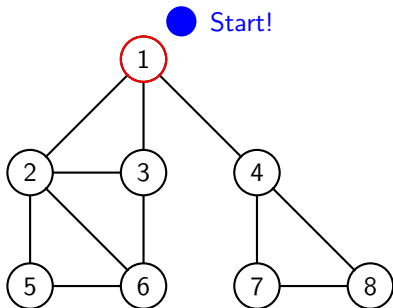
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$



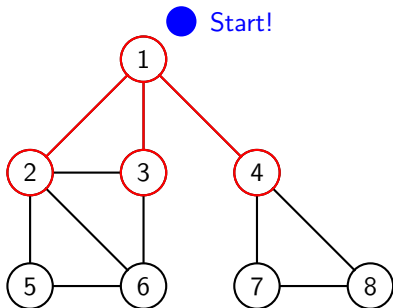
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
1	$\emptyset$



# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)

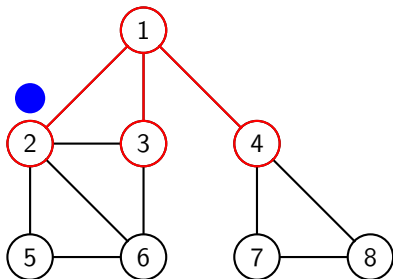


vertex	$L$
	$\emptyset$
1	2, 3, 4





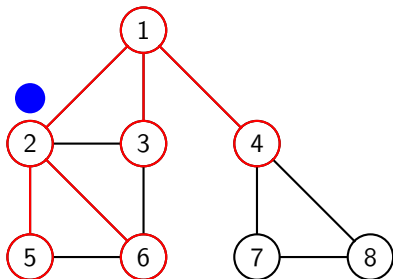
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4



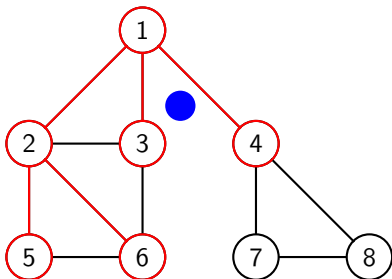
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6



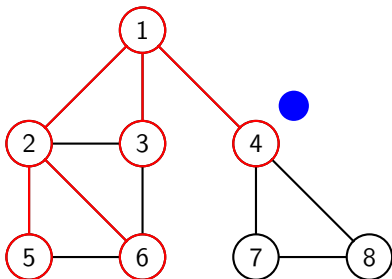
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6
3	4, 5, 6



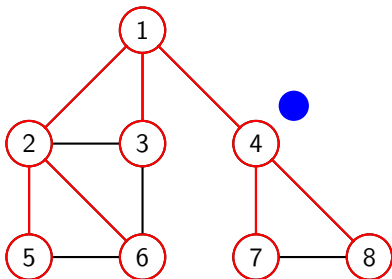
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6
3	4, 5, 6
4	5, 6



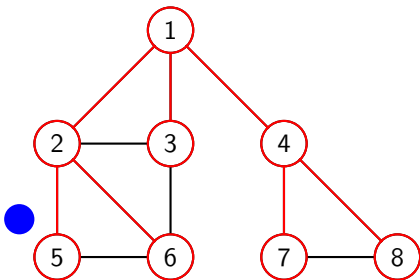
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6
3	4, 5, 6
4	5, 6, 7, 8



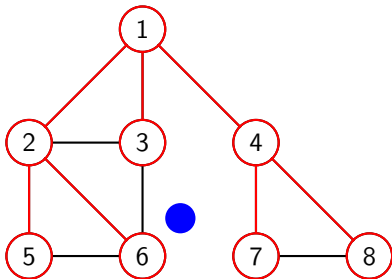
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6
3	4, 5, 6
4	5, 6, 7, 8
5	6, 7, 8



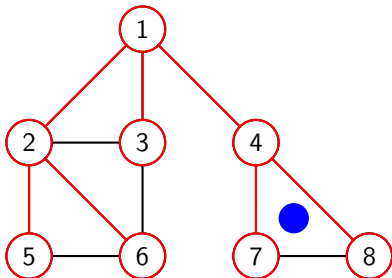
# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6
3	4, 5, 6
4	5, 6, 7, 8
5	6, 7, 8
6	7, 8



# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)

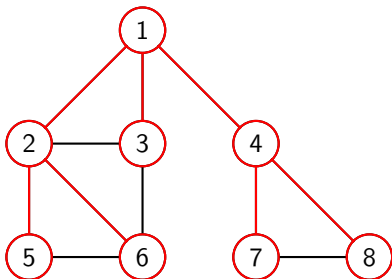


vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6
3	4, 5, 6
4	5, 6, 7, 8
5	6, 7, 8
6	7, 8
7	8





# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)

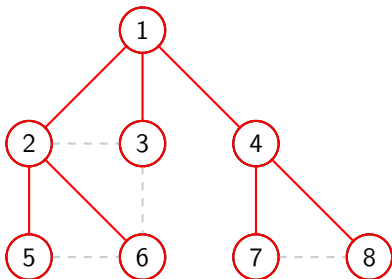


● End!

vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6
3	4, 5, 6
4	5, 6, 7, 8
5	6, 7, 8
6	7, 8
7	8
8	$\emptyset$



# Breadth-First Search (Tìm kiếm ưu tiên chiều rộng)



vertex	$L$
	$\emptyset$
1	2, 3, 4
2	3, 4, 5, 6
3	4, 5, 6
4	5, 6, 7, 8
5	6, 7, 8
6	7, 8
7	8
8	$\emptyset$

## Property

- $O(e)$  or  $O(n^2)$





## Algorithm

**procedure** *BFS* ( $G$ )

$T :=$  tree consisting only vertex  $v_1$

$L :=$  empty list

put  $v_1$  in the list  $L$  of unprocessed vertices

**while**  $L$  is not empty

    remove the first vertex,  $v$ , from  $L$

**for** each neighbor  $w$  of  $v$

**if**  $w$  is not in  $L$  and not in  $T$  **then**

            add  $w$  to the end of the list  $L$

            add  $w$  and edge  $\{v, w\}$  to  $T$

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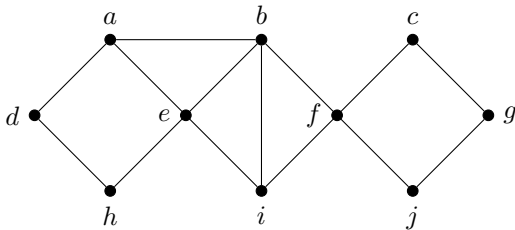
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## Exercise

### Exercise

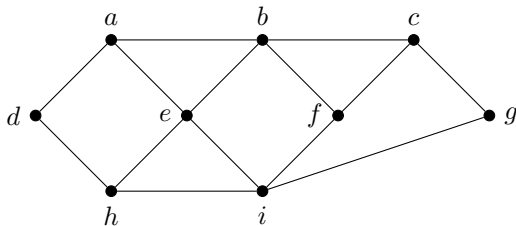
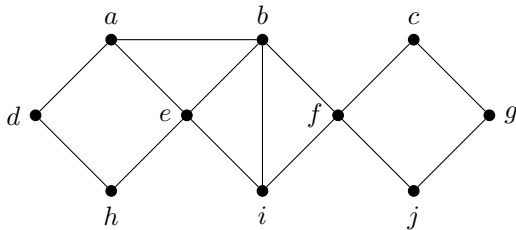
Find spanning tree in the following graphs.



## Exercise

### Exercise

Find spanning tree in the following graphs.



# Minimum Spanning Trees

## Definition

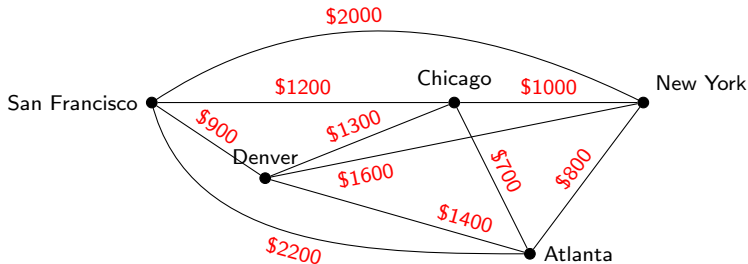
- A **minimum spanning tree** (*cây khung nhỏ nhất*) in a connected weighted graph is a spanning tree that has the smallest possible sum of weights of its edges.



# Minimum Spanning Trees

## Definition

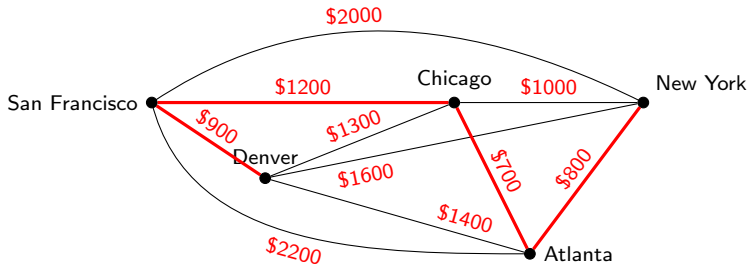
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# Minimum Spanning Trees

## Definition

- A **minimum spanning tree** (*cây khung nhỏ nhất*) in a connected weighted graph is a spanning tree that has the smallest possible sum of weights of its edges.





# Prim's Algorithm (Nearest-Neighbor)



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## Prim's Algorithm (1957)

**procedure** *Prim*( $G$ )

$T :=$  a minimum-weight edge

**for**  $i := 1$  to  $n - 2$

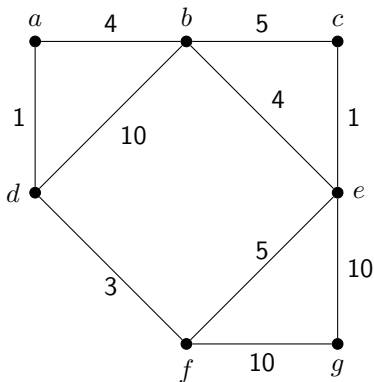
$e :=$  an edge of minimum weight incident to a vertex in  $T$   
        and not forming a simple circuit in  $T$  if added to  $T$

$T := T$  with  $e$  added

**return**  $T$

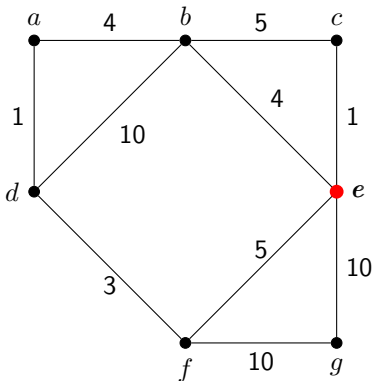
# Prim's Algorithm (Nearest-Neighbor)

- Pick a vertex to start from
- Iteratively absorb smallest edge possible



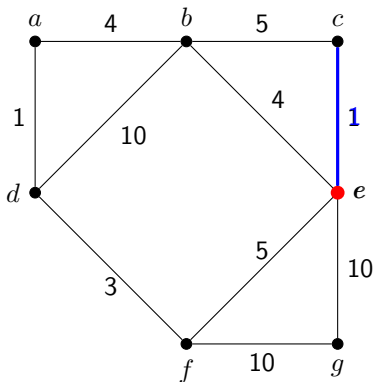
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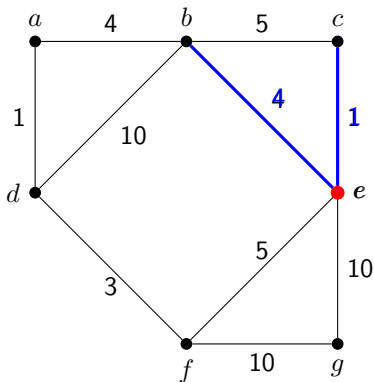
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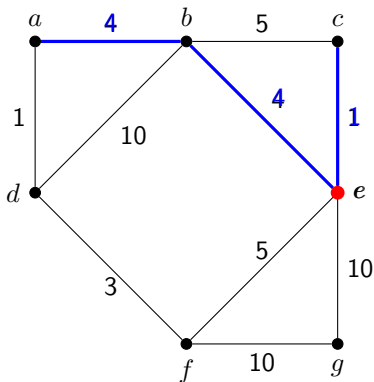
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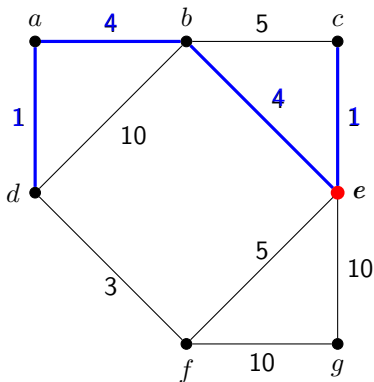
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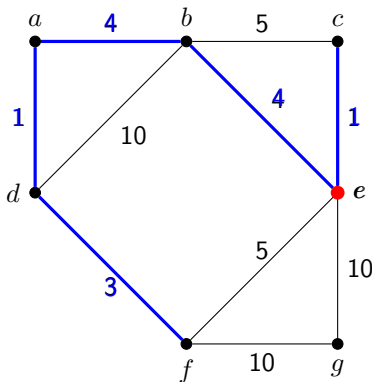
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# Prim's Algorithm (Nearest-Neighbor)

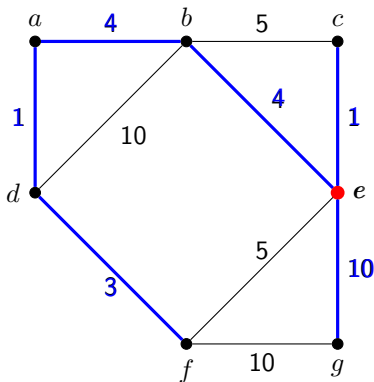
- Pick a vertex to start from
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# Prim's Algorithm (Nearest-Neighbor)

- Pick a vertex to start from
- Iteratively absorb smallest edge possible



# Kruskal's Algorithm (Lightest-Edge)



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## Kruskal's Algorithm (1958)

**procedure** *Kruskal*( $G$ )

$T :=$  empty graph

**for**  $i := 1$  **to**  $n - 1$

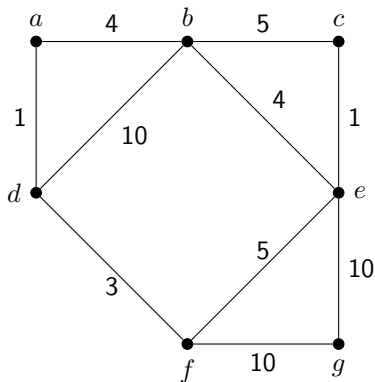
$e :=$  any edge in  $G$  with smallest weight that does not form  
a simple circuit when added to  $T$

$T := T$  with  $e$  added

**return**  $T$

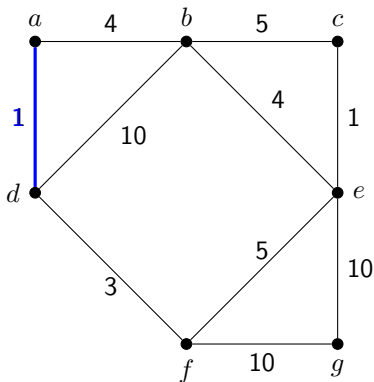
# Kruskal's Algorithm (Lightest-Edge)

- Iteratively add smallest edge possible



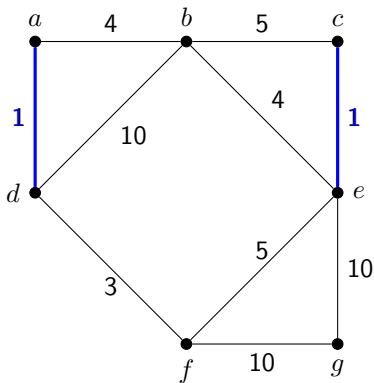
# Kruskal's Algorithm (Lightest-Edge)

- Iteratively add smallest edge possible



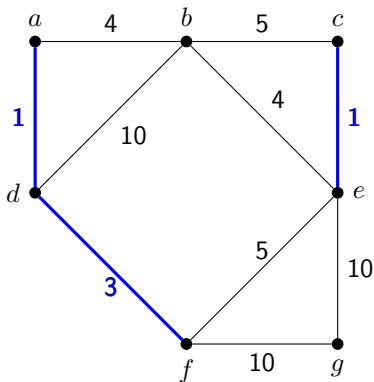
# Kruskal's Algorithm (Lightest-Edge)

- Iteratively add smallest edge possible



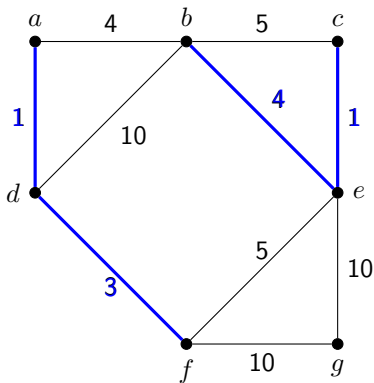
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- Iteratively add smallest edge possible



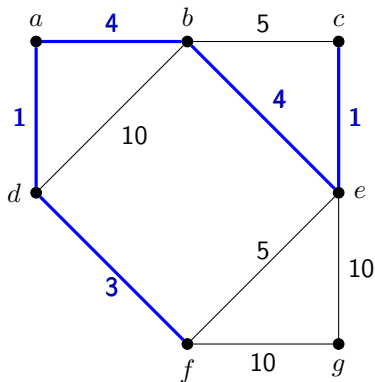
# Kruskal's Algorithm (Lightest-Edge)

- Iteratively add smallest edge possible



# Kruskal's Algorithm (Lightest-Edge)

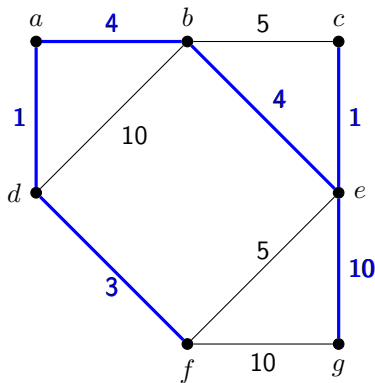
- Iteratively add smallest edge possible





# Kruskal's Algorithm (Lightest-Edge)

- Iteratively add smallest edge possible



## Exercise

### Exercise

By using Prim's and Kruskal's algorithm, determine minimum spanning tree in the following graphs.



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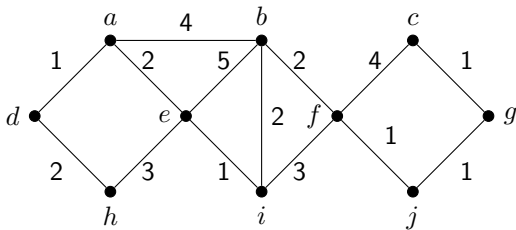
Prim's Algorithm

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## Exercise

### Exercise

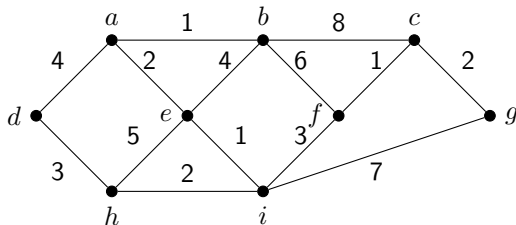
By using Prim's and Kruskal's algorithm, determine minimum spanning tree in the following graphs.



## Exercise

### Exercise

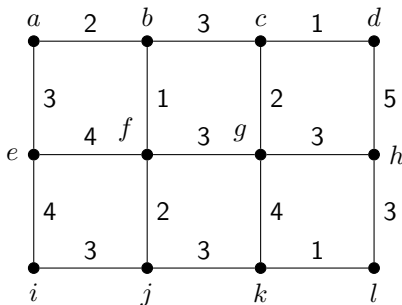
By using Prim's and Kruskal's algorithm, determine minimum spanning tree in the following graphs.



## Exercise

### Exercise

By using Prim's and Kruskal's algorithm, determine minimum spanning tree in the following graphs.



## Exercise

### Exercise

By using Prim's and Kruskal's algorithm, determine minimum spanning tree in the following graphs. (and maximum spanning tree (*cây khung cực đại*)).

