



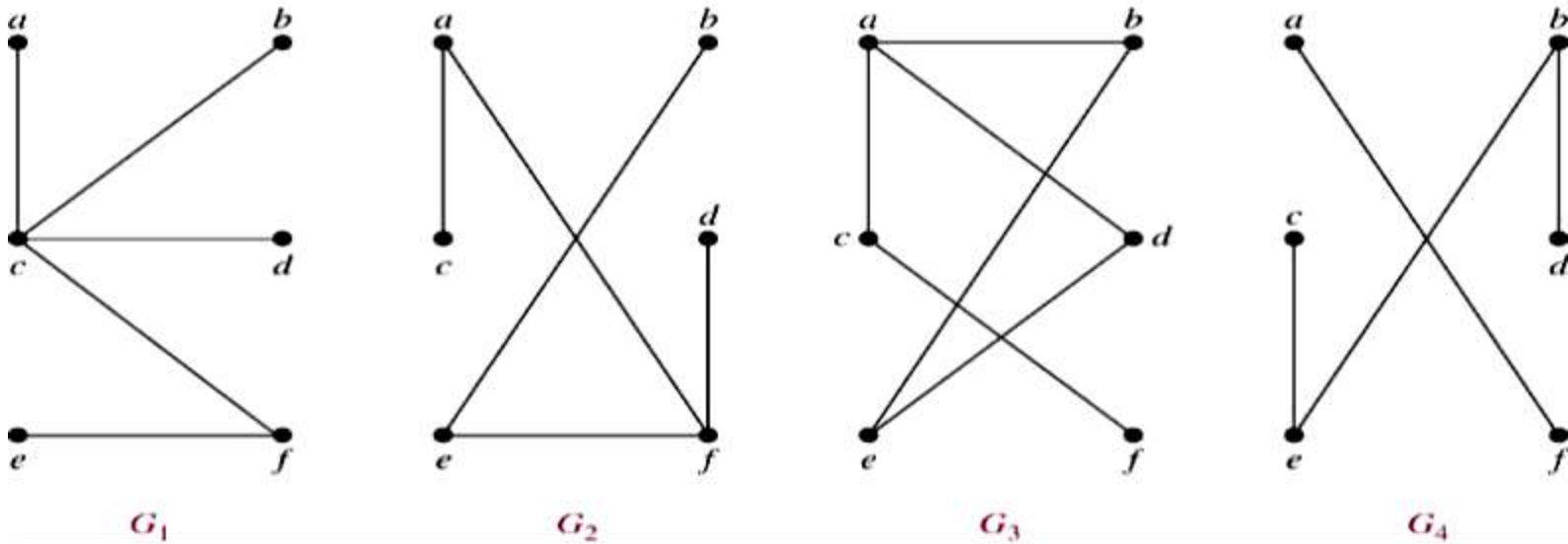
Outline

- 10.1 Introduction to Trees
- 10.2 Applications of Trees
- 10.3 Tree Traversal
- 10.4 Spanning Trees
- 10.5 Minimal Spanning Trees

10.1 Introduction to Trees

Def 1 A **tree** is a connected undirected graph with no simple circuits.

Example 1. Which of the graphs are trees?



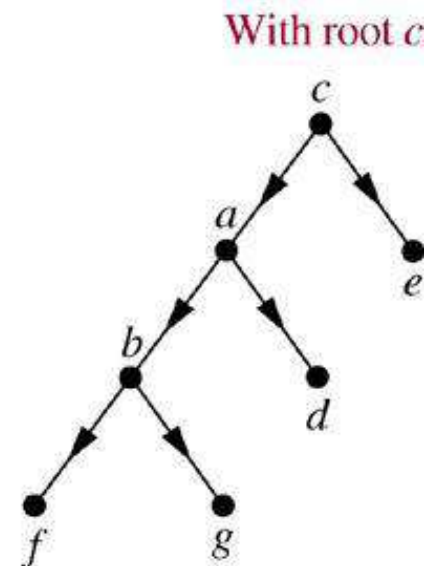
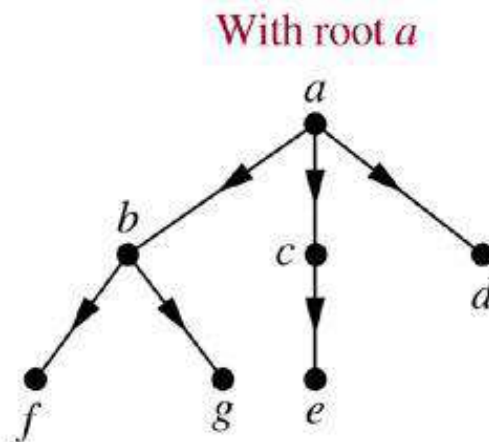
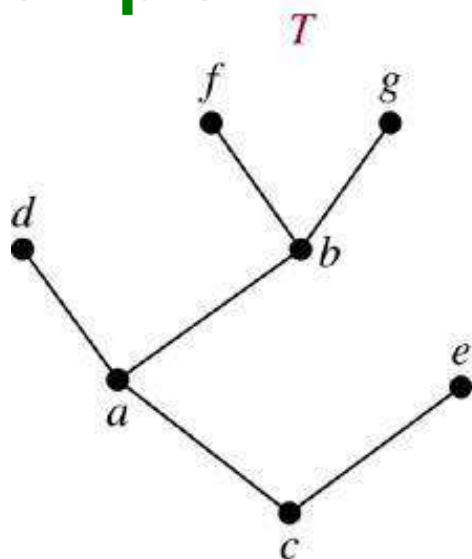
Sol: G_1, G_2

Note. 若拿掉connected的條件，就變成 **forest**

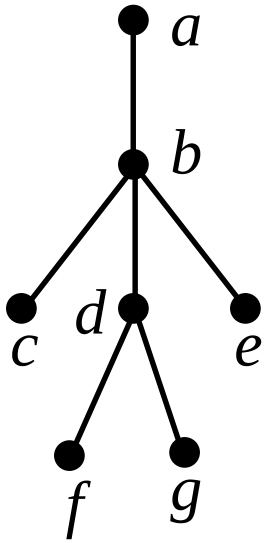
Thm 1. Any undirected graph is a tree if and only if there is a unique simple path between any two of its vertices.

Def 2. A **rooted tree** is a tree in which one vertex has been designed as the root and every edge is directed away from the root. (箭頭可消掉)

Example



Def:



a is the **parent** of b , b is the **child** of a ,
 c, d, e are **siblings**,

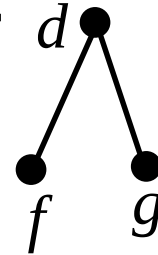
a, b, d are **ancestors** of f

c, d, e, f, g are **descendants** of b

c, e, f, g are **leaves** of the tree (deg=1)

a, b, d are **internal vertices** of the tree
(at least one child)

subtree with d as its root:

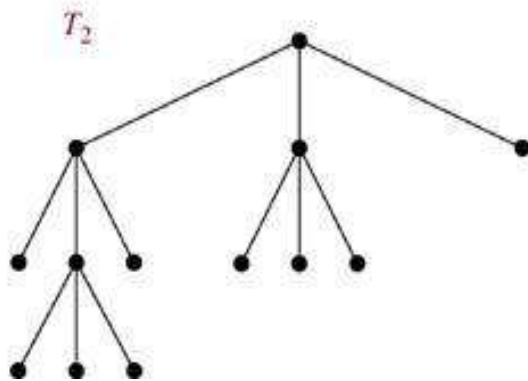


Def 3 A rooted tree is called an *m*-ary tree if every internal vertex has no more than *m* children. The tree is called a *full m*-ary tree if every internal vertex has exactly *m* children. An *m*-ary tree with $m=2$ is called a *binary tree*.

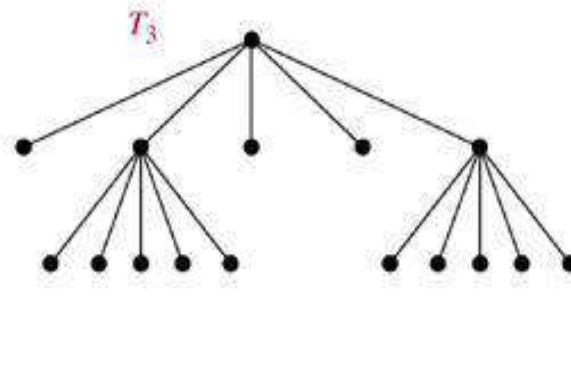
Example 3



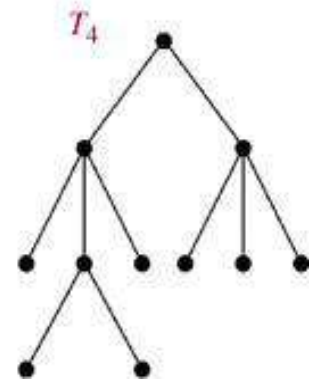
full binary tree



full 3-ary tree

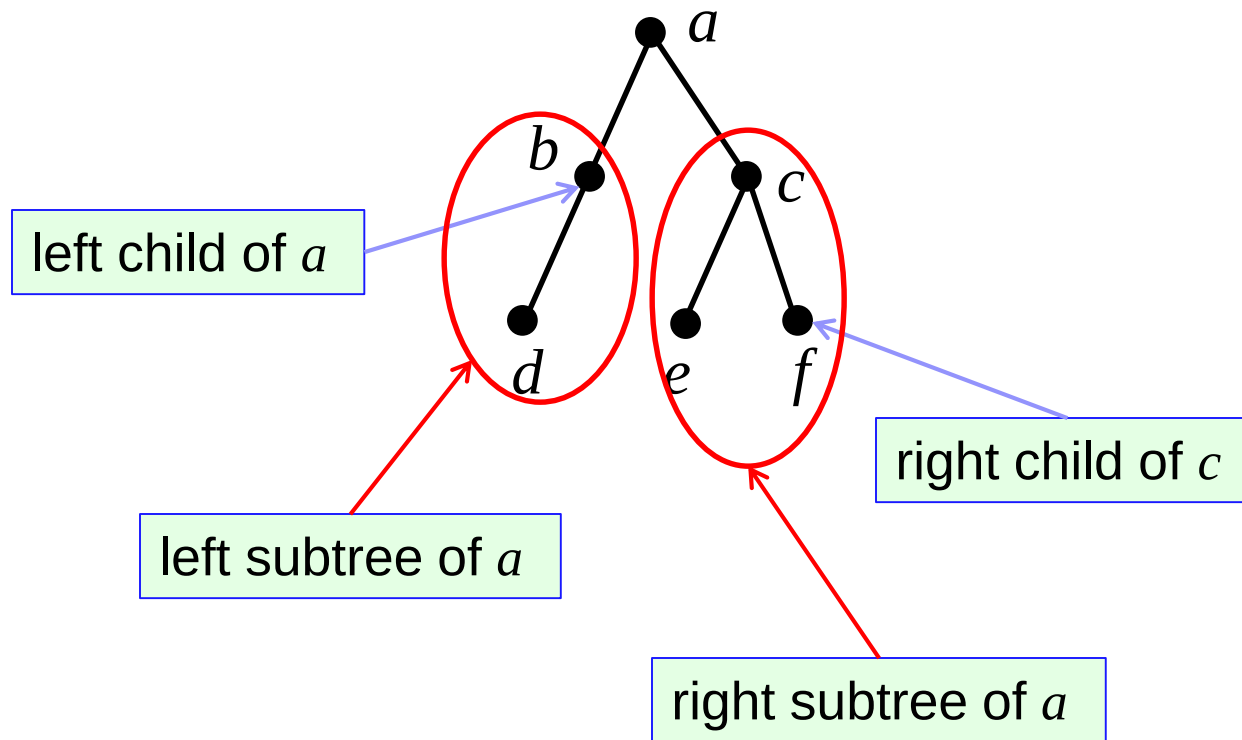


full 5-ary tree



not full 3-ary tree

Def:



Properties of Trees

Thm 2. A tree with n vertices has $n-1$ edges.

Pf. (by induction on n)

$n = 1$: K_1 is the only tree of order 1, $|E(K_1)| = 0$. **ok!**

Assume the result is true for every trees of order $n = k$.

Let T be a tree of order $n = k+1$, v be a leaf of T ,
and w be the parent of v .

Let T' be the tree $T - \{v\}$.

$\therefore |V(T')| = k$, and $|E(T')| = k-1$ by the induction hypothesis.

$\Rightarrow |E(T)| = k$

By induction, the result is true for all trees. #

Thm 3. A full m -ary tree with i internal vertices contains $n = mi + 1$ vertices.

Pf. Every vertex, except the root, is the child of an internal vertex.

Each internal vertex has m children.

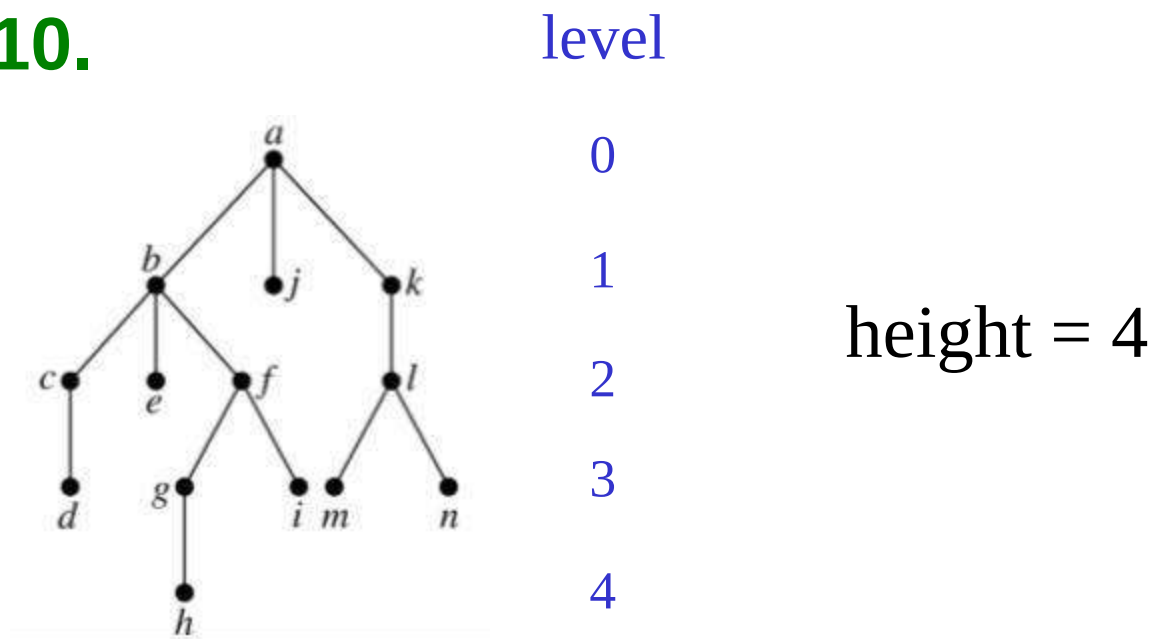
$\Rightarrow$ there are $mi + 1$ vertices in the tree

Exercise: 19

Cor. A full m -ary tree with n vertices contains $(n-1)/m$ internal vertices, and hence $n - (n-1)/m = ((m-1)n+1)/m$ leaves.

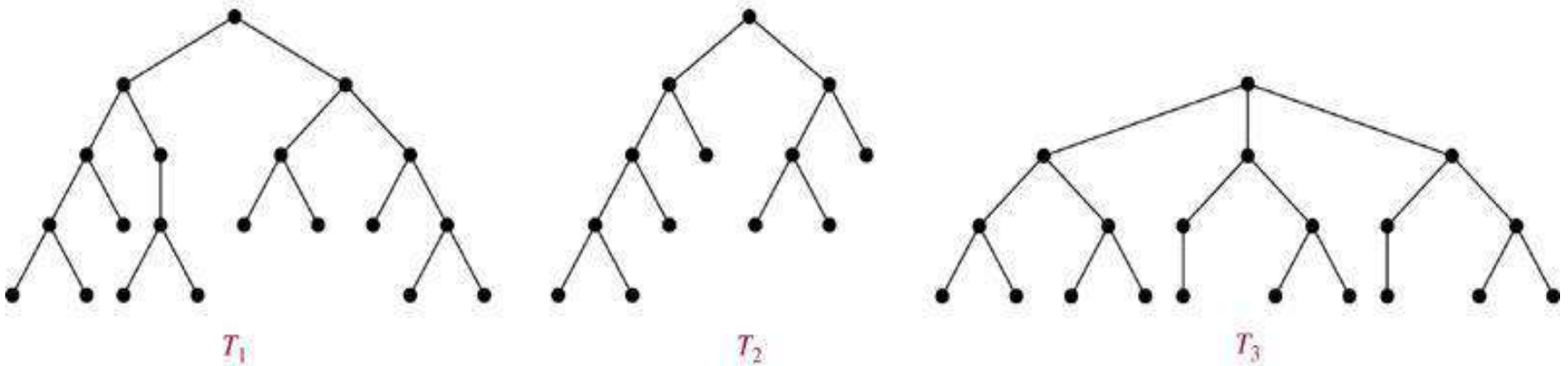
Def: The **level** of a vertex v in a rooted tree is the length of the unique path from the root to this vertex. The level of the root is defined to be zero. The **height** of a rooted tree is the maximum of the levels of vertices.

Example 10.



Def: A rooted m -ary tree of height h is **balanced** if all leaves are at levels h or $h-1$.

Example 11 Which of the rooted trees shown below are balanced?



Sol. T_1, T_3

Thm 5. There are at most m^h leaves in an m -ary tree of height h .

Def: A **complete m -ary tree** is a full m -ary tree, where every leaf is at the same level.

Ex 28 How many vertices and how many leaves does a complete m -ary tree of height h have?

Sol.

$$\# \text{ of vertices} = 1 + m + m^2 + \dots + m^h = (m^{h+1} - 1) / (m - 1)$$

$$\# \text{ of leaves} = m^h$$

10.2 Applications of Trees

Binary Search Trees

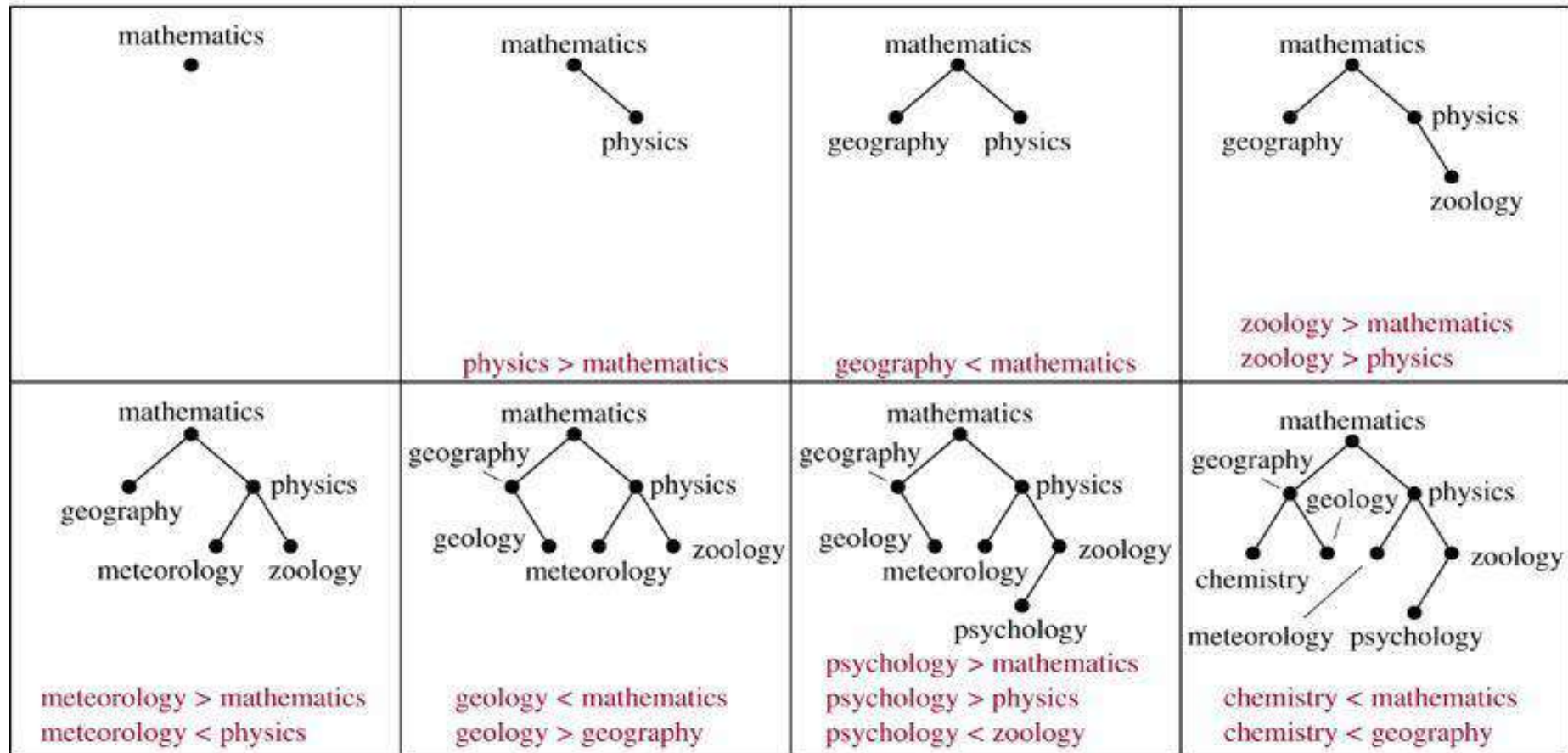
Goal: Implement a searching algorithm that finds items efficiently when the items are totally ordered.

Binary Search Tree: Binary tree + each child of a vertex is designed as a right or left child, and each vertex v is labeled with a key $label(v)$, which is one of the items.

Note: $label(v) > label(w)$ if w is in the left subtree of v
and $label(v) < label(w)$ if w is in the right subtree of v

Example 1 Form a binary search tree for the words *mathematics*, *physics*, *geography*, *zoology*, *meteorology*, *geology*, *psychology*, and *chemistry* (using alphabetical order).

Sol.



Algorithm 1 (Locating and Adding Items to a Binary Search Tree.)

Procedure *insertion*(T : binary search tree, x : item)

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

{a vertex not present in T has the value *null*}

while $v \neq \text{null}$ and $\text{label}(v) \neq x$

begin

if $x < \text{label}(v)$ **then**

if left child of $v \neq \text{null}$ **then** $v := \text{left child of } v$

else add *new vertex* as a left child of v and set $v := \text{null}$

else

if right child of $v \neq \text{null}$ **then** $v := \text{right child of } v$

else add *new vertex* as a right child of v and set $v := \text{null}$

end

if root of $T = \text{null}$ **then** add a vertex v to the tree and label it with x

else if v is null or $\text{label}(v) \neq x$ **then** label new vertex with x and

 let v be this new vertex

{ $v = \text{location of } x$ }

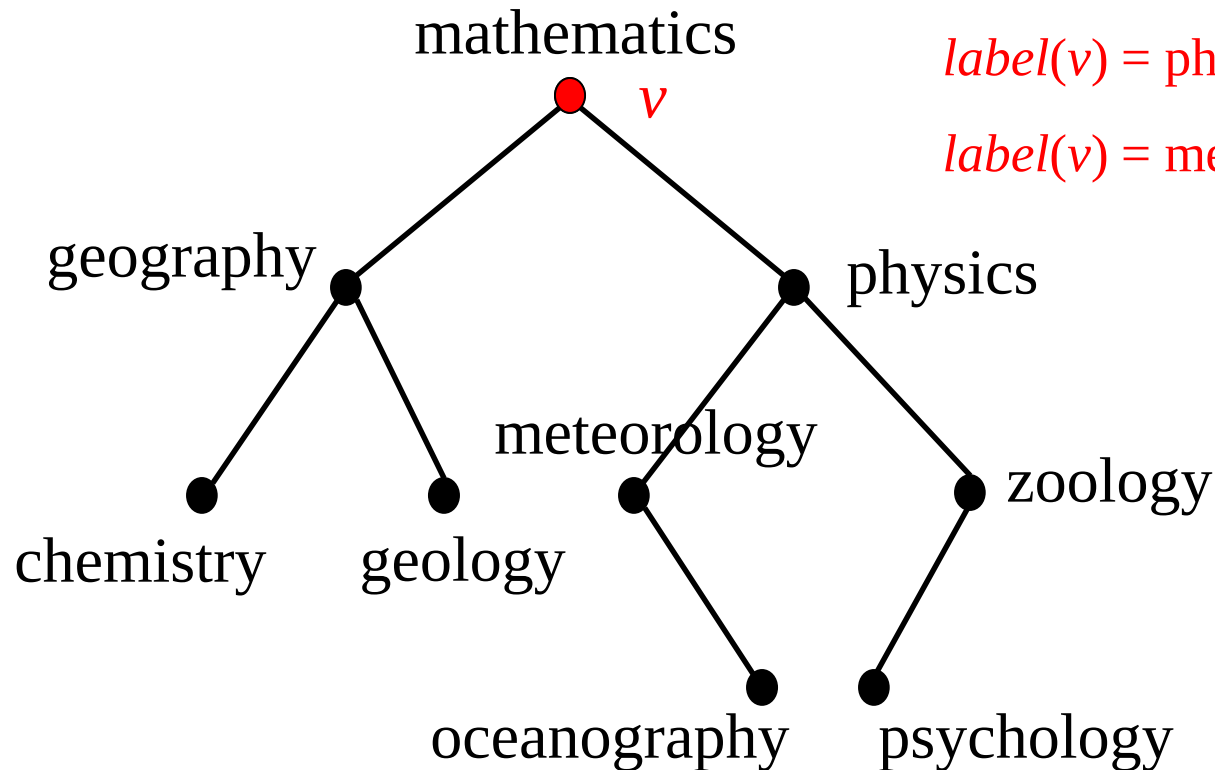
Example 2 Use Algorithm 1 to insert the word *oceanography* into the binary search tree in Example 1.

Sol.

$label(v) = \text{mathematics} < \text{oceanography}$

$label(v) = \text{physics} > \text{oceanography}$

$label(v) = \text{meteorology} < \text{oceanography}$



Exercise: 1,3

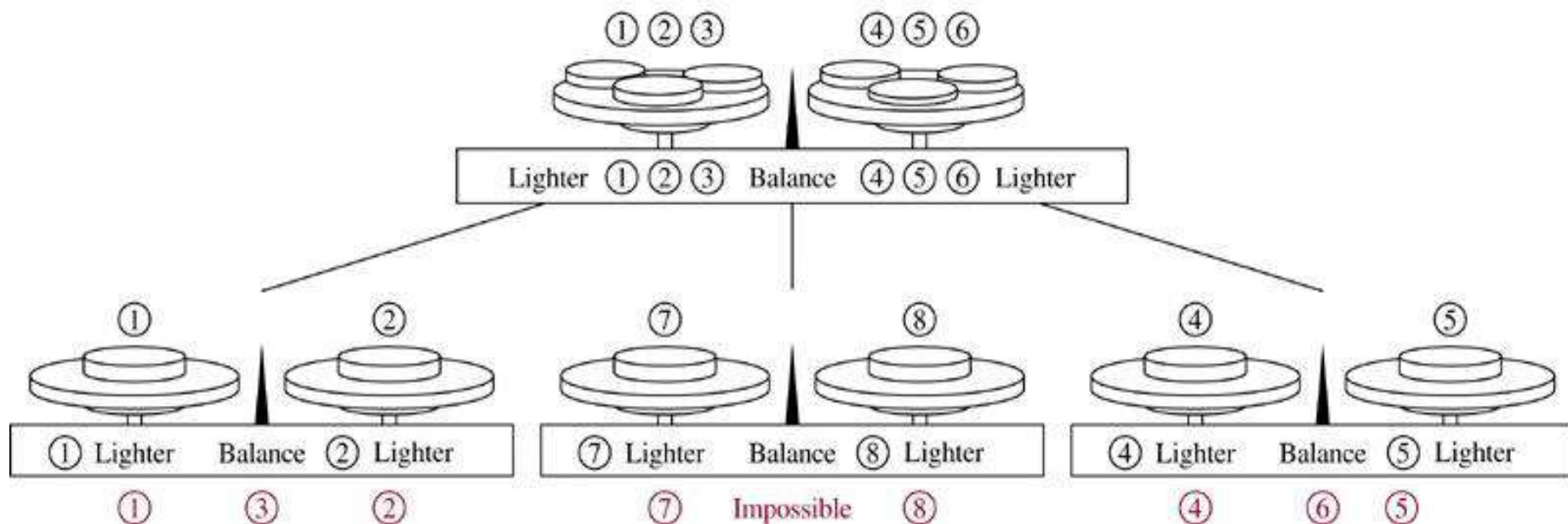
Decision Trees

A rooted tree in which each internal vertex corresponds to a decision, with a subtree at these vertices for each possible outcome of the decision, is called **a decision tree**.

Example 3 Suppose there are seven coins, all with the same weight, and a counterfeit (偽造) coin that weights less than the others. How many weighings (秤重) are necessary using a balance scale (秤) to determine which of the eight coins is the counterfeit one? Give an algorithm for finding this counterfeit coin.

Sol. 秤重時，可能左重、右重或平衡 $\Rightarrow$ 3-ary tree

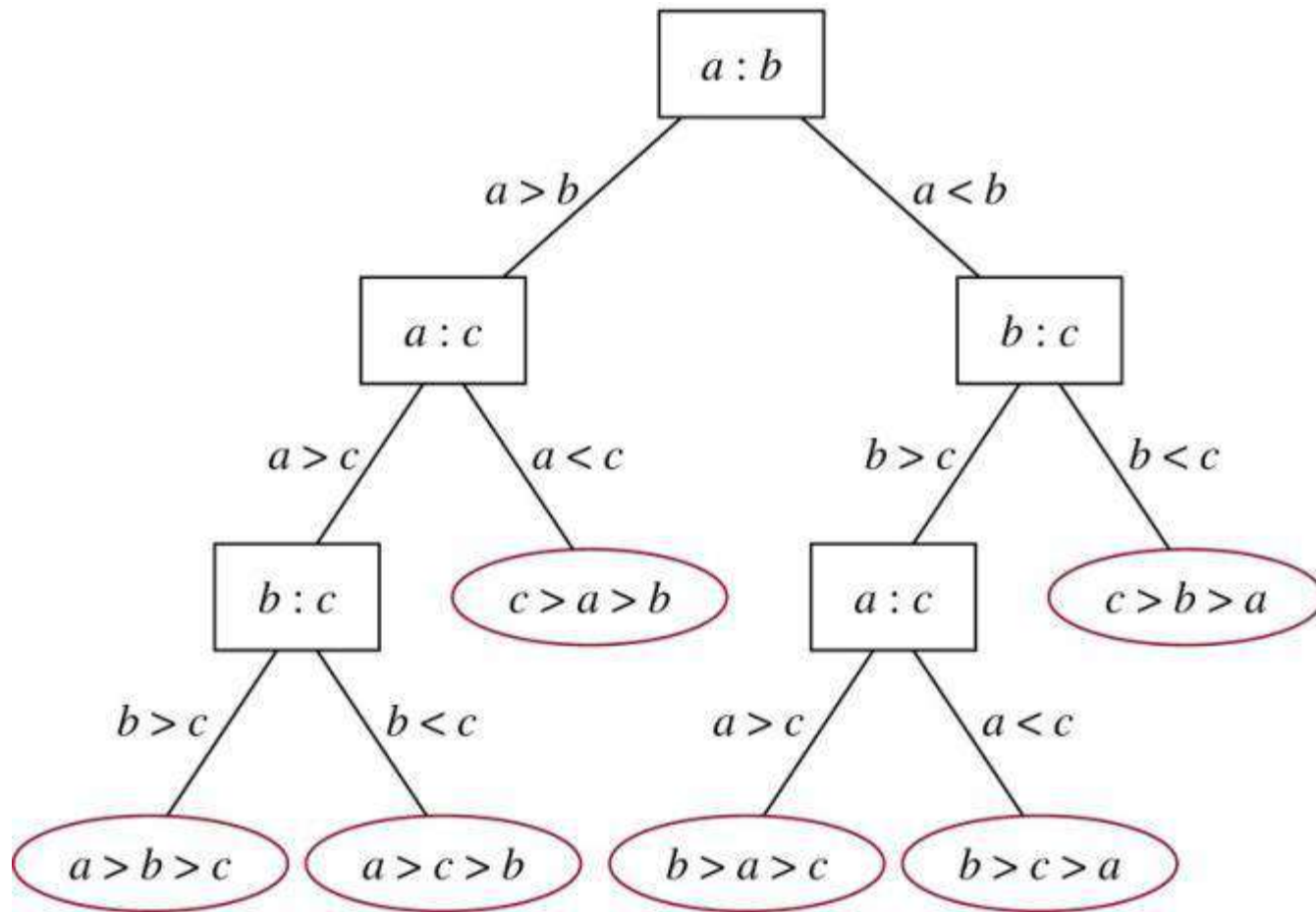
Need 8 leaves $\Rightarrow$ 至少需秤重兩次



Exercise: 7

Example 4 A decision tree that orders the elements of the list a, b, c .

Sol.



Prefix Codes

Problem: Using bit strings to encode the letter of the English alphabet (不分大小寫)

- ⇒ each letter needs a bit string of length 5 (因 $2^4 < 26 < 2^5$)
- ⇒ Is it possible to find a coding scheme of these letter such that when data are coded, fewer bits are used?
- ⇒ Encode letters using varying numbers of bits.
- ⇒ Some methods must be used to determine where the bits for each character start and end.
- ⇒ **Prefix codes:** Codes with the property that the bit string for a letter never occurs as the first part of the bit string for another letter.

Example: (not prefix code)

$e : 0, a : 1, t : 01$

The string 0101 could correspond to *eat*, *tea*, *eaea*, or *tt*.

Example: (prefix code)

$e : 0, a : 10, t : 11$

The string 10110 is the encoding of *ate*.

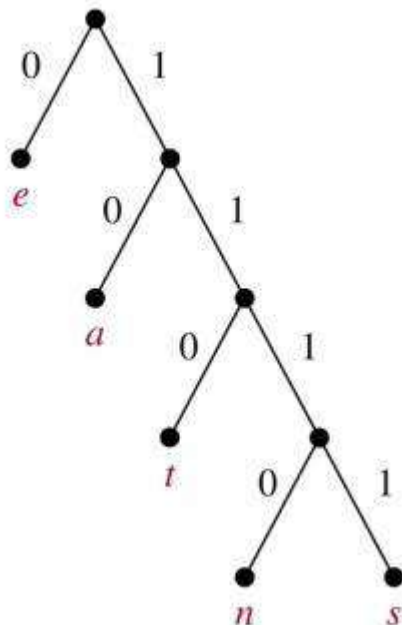
A prefix code can be represented using a binary tree.

character: the label of the leaf

edge label: left child $\rightarrow$ 0, right child $\rightarrow$ 1

The bit string used to encode a character is the sequence of labels of the edges in the unique path from the root to the leaf that has this character as its label.

Example:



encode

$e : 0$
 $a : 10$
 $t : 110$
 $n : 1110$
 $s : 1111$

從root走起，到leaf為止，重複

decode

11111011100
 $\underbrace{\hspace{1.5cm}}_s \underbrace{\hspace{1.5cm}}_a \underbrace{\hspace{1.5cm}}_n \underbrace{\hspace{1.5cm}}_e$

$\Rightarrow$ sane

Exercise: 22

Huffman Coding (data compression重要工具)

Input the frequencies of symbols in a string and output a prefix code that encodes the string using the fewest possible bits, among all possible binary prefix codes for these symbols.

一開始有很多孤立點，label就是各個symbol，
將最少使用的兩個symbol結合成一個subtree，
重複此一概念，
將最少使用的兩個subtree結合成一個subtree， ...

Algorithm 2 (Huffman Coding)

Procedure *Huffman*(C : symbols a_i with frequencies w_i , $i = 1, \dots, n$)
 $F :=$ forest of n rooted trees, each consisting of the single vertex a_i
and assigned weighted w_i

while F is not a tree

begin

Replace the rooted trees T and T' of least weights from F with
 $w(T) \geq w(T')$ with a tree having a new root that has T as its
left subtree and T' as its right subtree. Label the new edge to T
with 0 and the new edge to T' with 1.

Assign $w(T)+w(T')$ as the weight of the new tree.

end

Example 5 Use Huffman coding to encode the following symbols with the frequencies listed:

A: 0.08, B: 0.10, C: 0.12, D: 0.15, E: 0.20, F: 0.35.

What is the average number of bits used to encode a character?

Sol:

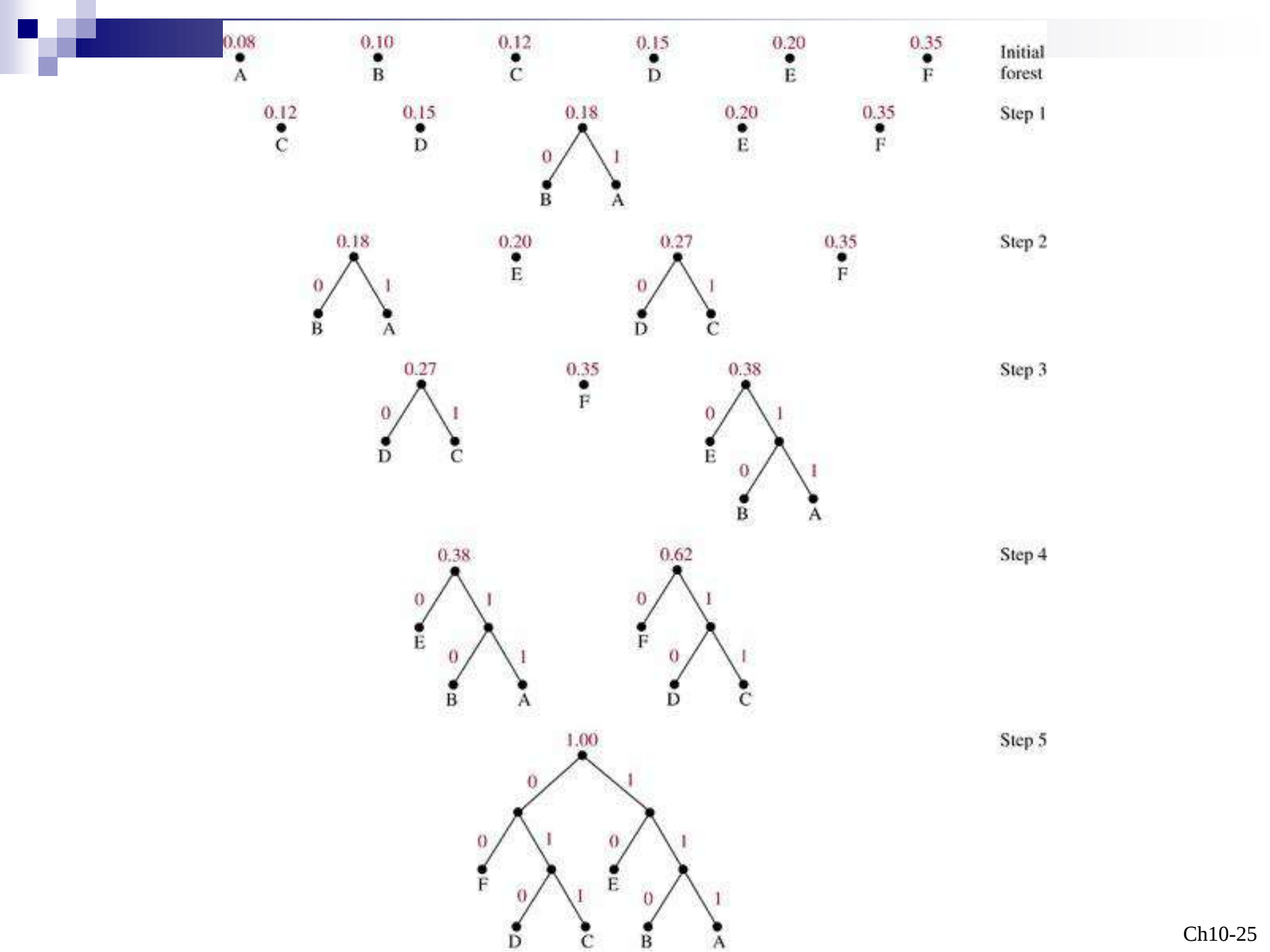
1. 下頁圖

2. The average number of bits is:

每個symbol 長度× 頻率 的加總

$$= 3 \times 0.08 + 3 \times 0.10 + 3 \times 0.12 + 3 \times 0.15 + 2 \times 0.20 + 2 \times 0.35$$

$$= 2.45$$



10.3 Tree Traversal

We need procedures for visiting each vertex of an ordered rooted tree to access data.

Universal Address Systems

Label vertices:

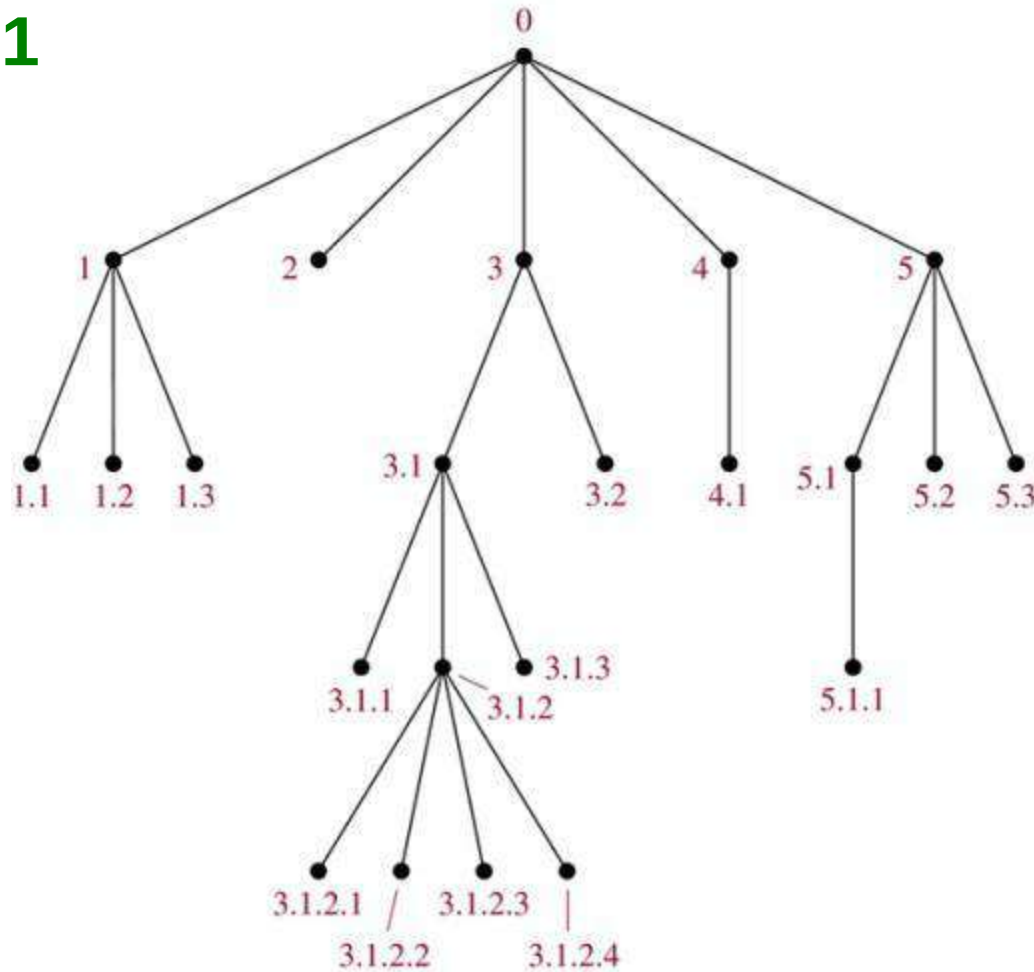
1. root $\rightarrow 0$, its k children $\rightarrow 1, 2, \dots, k$ (from left to right)
2. For each vertex v at level n with label A , its r children $\rightarrow A.1, A.2, \dots, A.r$ (from left to right).

We can **totally order** the vertices using the lexicographic ordering of their labels in the universal address system.

$$x_1.x_2.\dots.x_n < y_1.y_2.\dots.y_m$$

if there is an i , $0 \leq i \leq n$, with $x_1=y_1, x_2=y_2, \dots, x_{i-1}=y_{i-1}$, and $x_i < y_i$;
or if $n < m$ and $x_i=y_i$ for $i=1, 2, \dots, n$.

Example 1

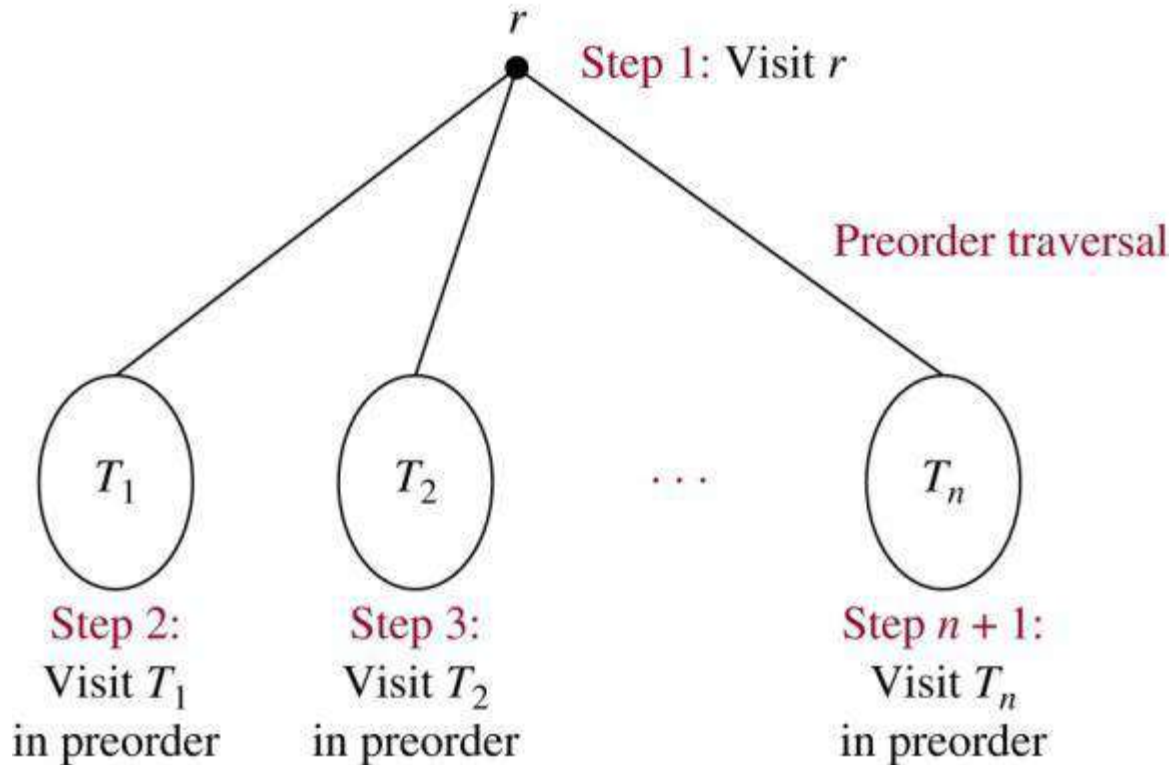


The lexicographic ordering is:

$0 < 1 < 1.1 < 1.2 < 1.3 < 2 < 3 < 3.1 < 3.1.1 < 3.1.2 < 3.1.2.1 < 3.1.2.2 < 3.1.2.3 < 3.1.2.4 < 3.1.3 < 3.2 < 4 < 4.1 < 5 < 5.1 < 5.1.1 < 5.2 < 5.3$

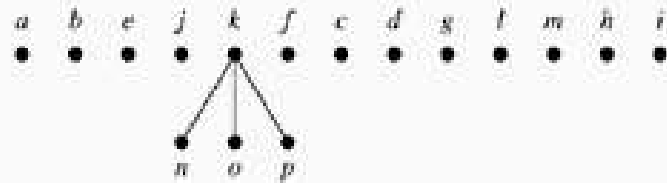
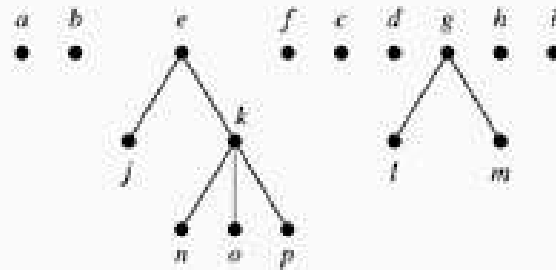
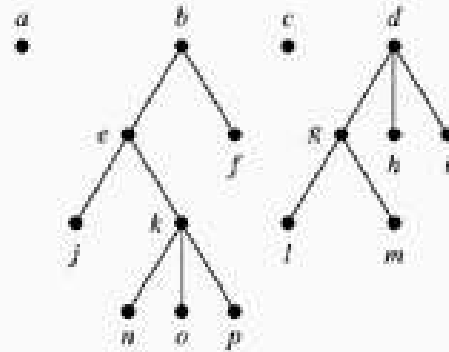
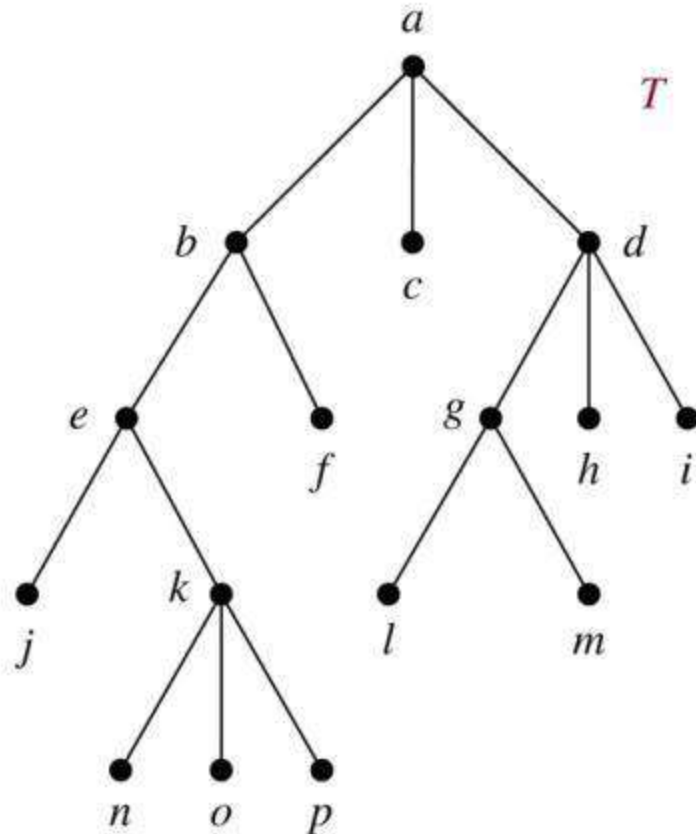
Traversal Algorithms

Preorder traversal (前序)



Example 2. In which order does a preorder traversal visit the vertices in the ordered rooted tree T shown below?

Sol:

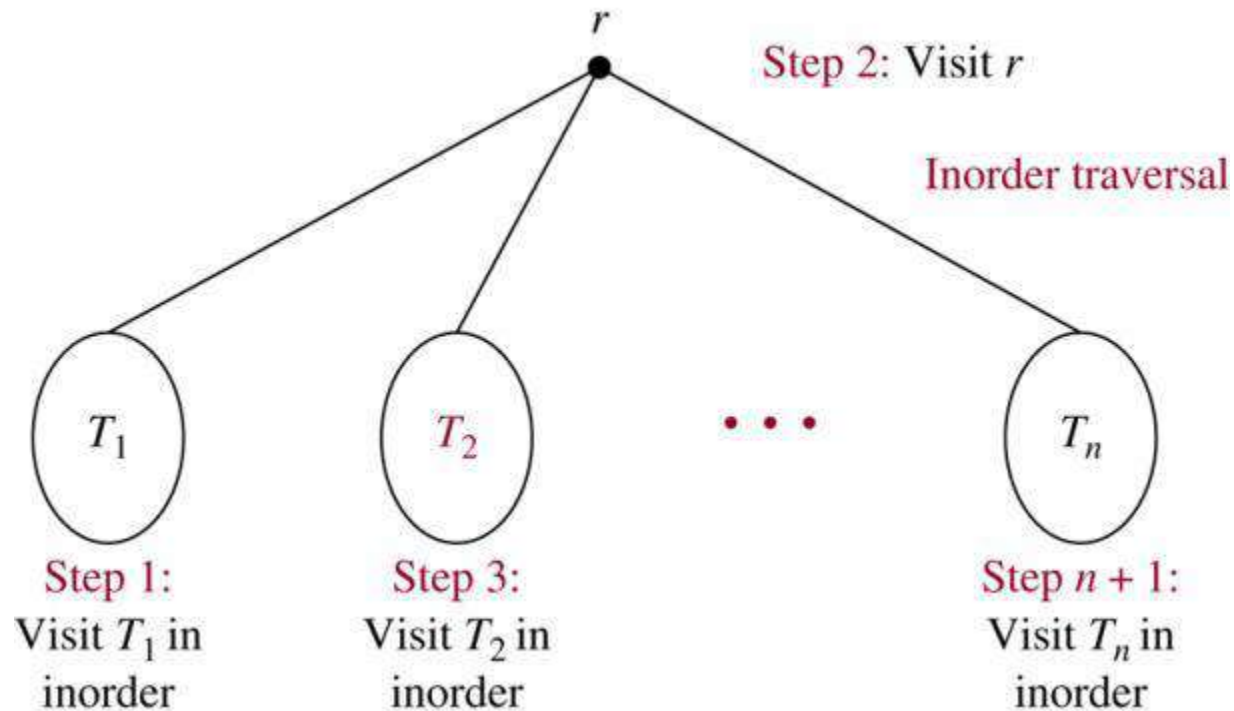


Algorithm 1 (Preorder Traversal)

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

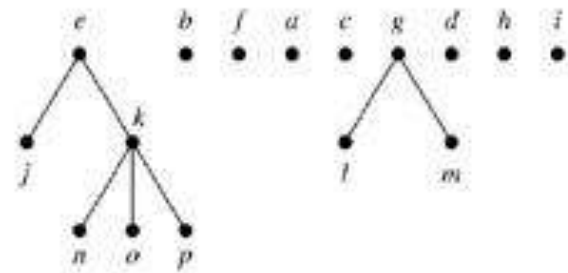
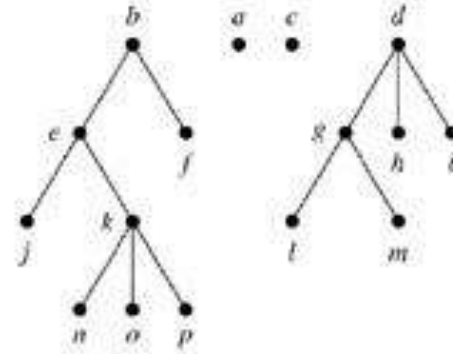
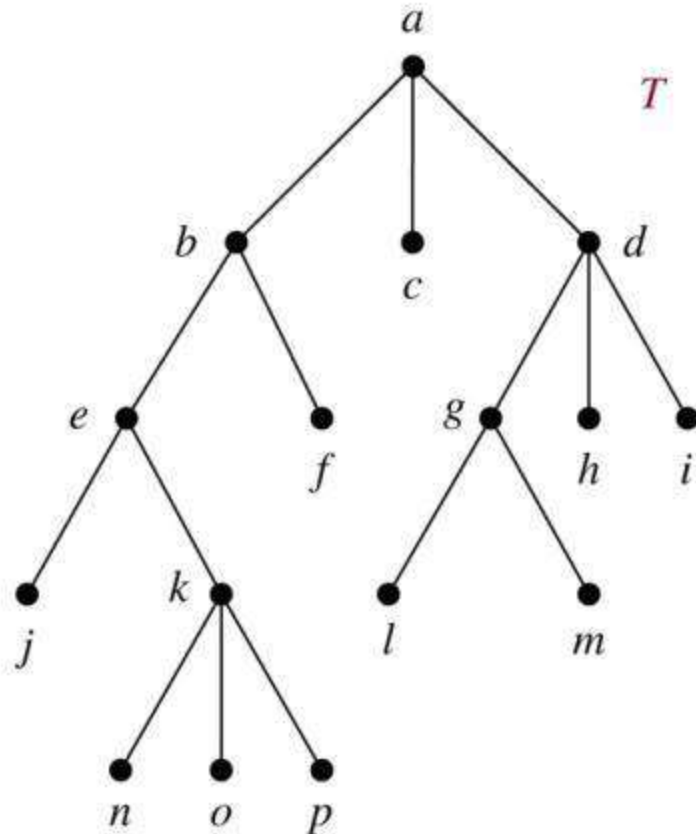
Exercise : 8

Inorder traversal(中序)



Example 3. In which order does a preorder traversal visit the vertices in the ordered rooted tree T shown below?

Sol:



Algorithm 2 (Inorder Traversal)

Procedure *inorder*(T : ordered rooted tree)

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

If r is a leaf **then** list r

else

begin

$l := \text{first child of } r \text{ from left to right}$

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

inorder($T(l)$)

 list r

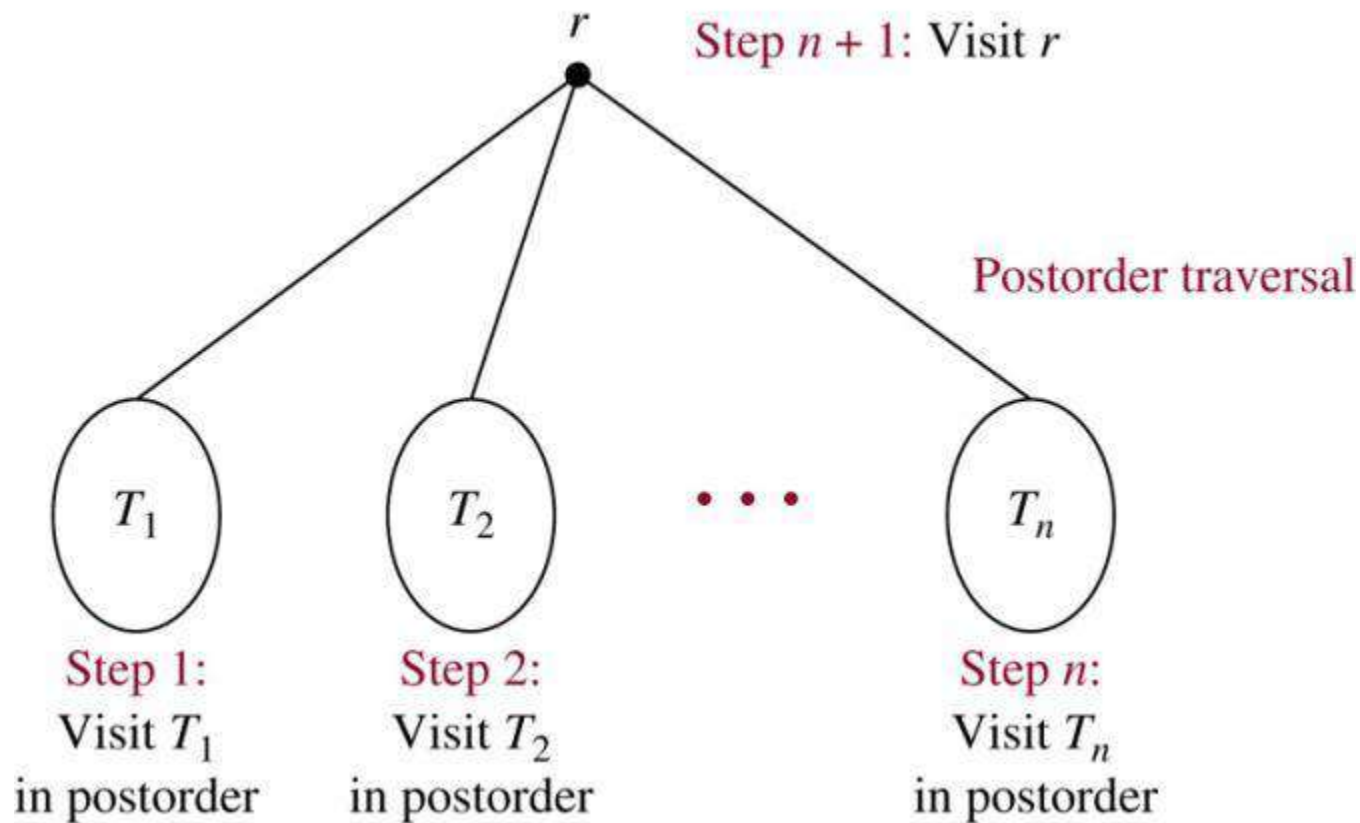
for each child c of r except for l from left to right

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

inorder($T(c)$)

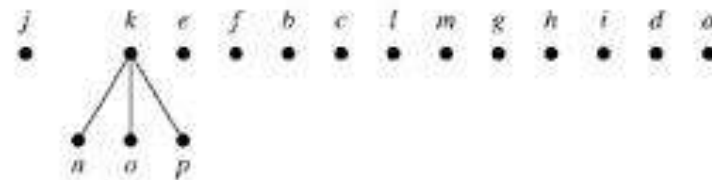
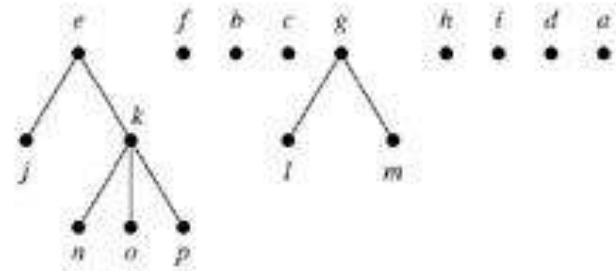
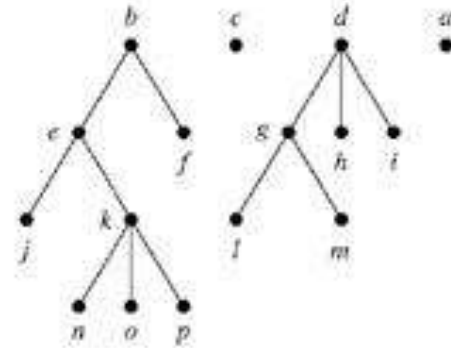
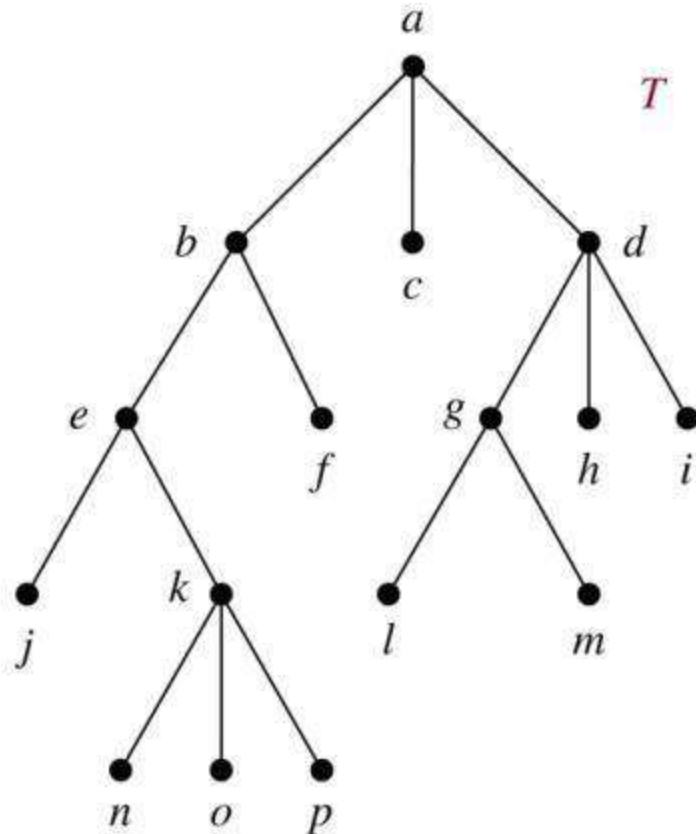
end

Postorder traversal(後序)



Example 4. In which order does a preorder traversal visit the vertices in the ordered rooted tree T shown below?

Sol:



Algorithm 3 (Postorder Traversal)

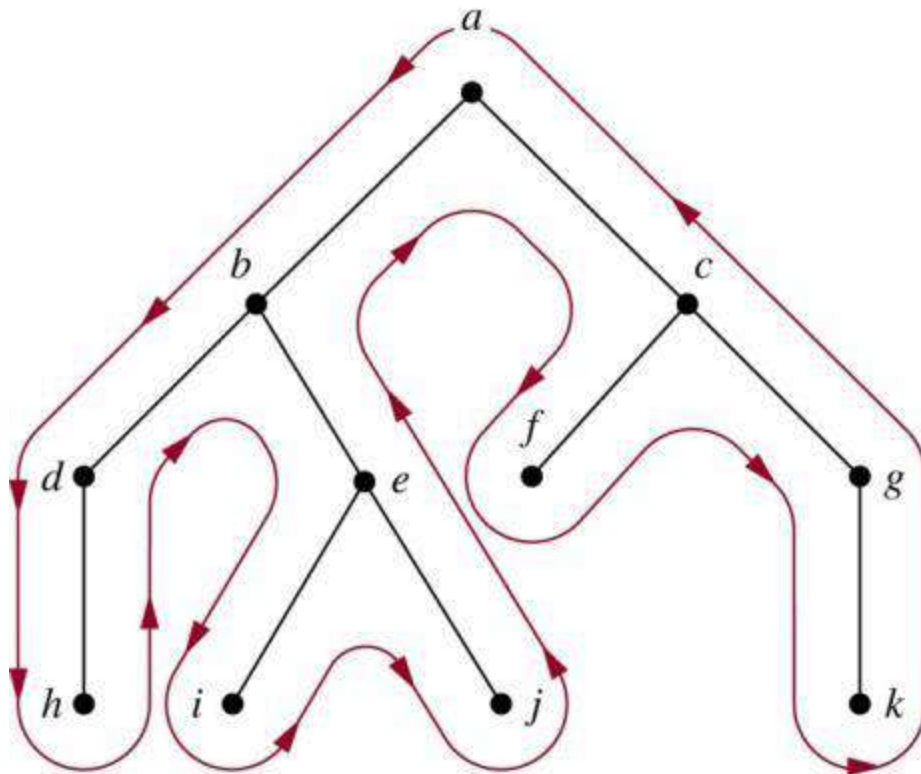
```
Procedure postorder( $T$ : ordered rooted tree)
 $r :=$  root of  $T$ 
for each child  $c$  of  $r$  from left to right
begin
     $T(c) :=$  subtree with  $c$  as its root
    postorder( $T(c)$ )
end
list  $r$ 
```

比較容易的表示法：依紅線的走法拜訪節點

Preorder: curve第一次通過該點時就list該節點

Inorder: curve第一次通過一個leaf時就list它，第二次通過一個internal節點時就list它

Postorder: curve最後一次通過該點時就list該節點



Preorder:

a, b, d, h, e, i, j, c, f, g, k

Inorder:

h, d, b, i, e, j, a, f, c, k, g

Postorder:

h, d, i, j, e, b, f, k, g, c, a

Infix, Prefix, and Postfix Notation

We can represent complicated expressions, such as compound propositions, combinations of sets, and arithmetic expressions using ordered rooted trees.

Example 1 Find the ordered rooted tree for $((x+y)^2) + ((x-4)/3)$. ($\uparrow$ 表示次方)

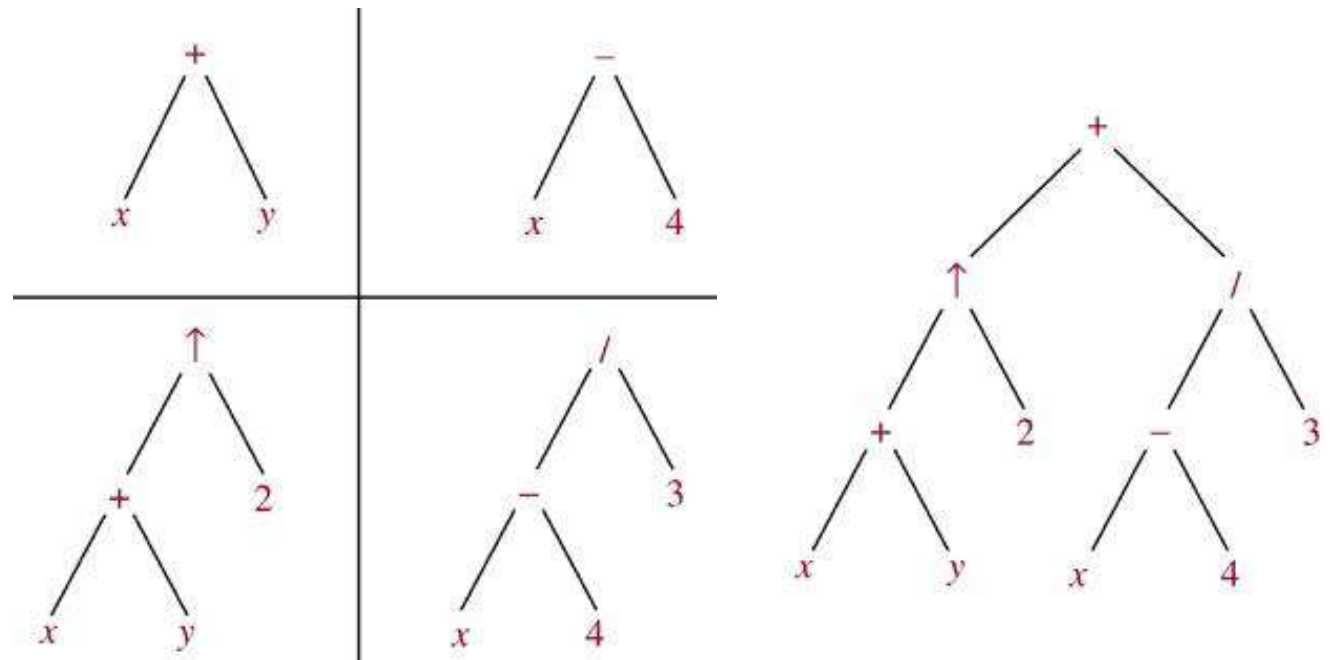
Sol.

leaf:

variable

internal vertex:

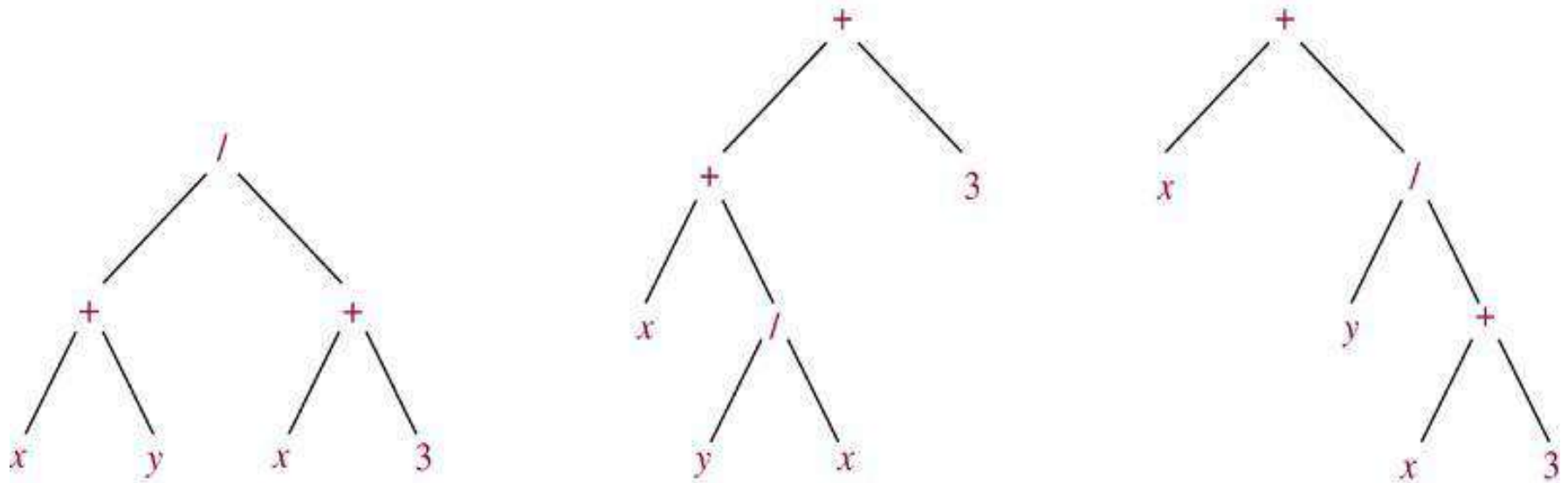
operation on
its left and right
subtrees



The following binary trees represent the expressions:

$(x+y)/(x+3)$, $(x+(y/x))+3$, $x+(y/(x+3))$.

All their inorder traversals lead to $x+y/x+3 \Rightarrow$ ambiguous
 $\Rightarrow$ need parentheses



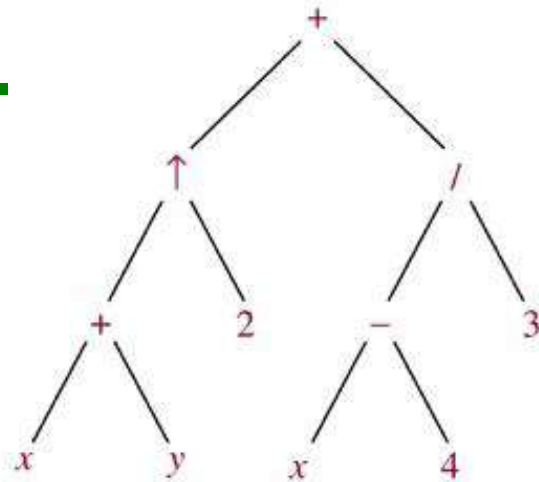
Infix form: An expression obtained when we traverse its rooted tree with inorder.

Prefix form: by preorder. (also named **Polish notation**)

Postfix form: by postorder. (**reverse Polish notation**)

Example 6 What is the prefix form for $((x+y)^{\uparrow 2})+((x-4)/3)$?

Sol.



$+ \uparrow + x y 2 / - x 4 3$

Example 8 What is the postfix form of the expression $((x+y)^{\uparrow 2})+((x-4)/3)$?

Sol.

$x y + 2 \uparrow x 4 - 3 / +$

Note. An expression in prefix form or postfix form is unambiguous, so no parentheses are needed.

Example 7 What is the value of the prefix expression

$+ - * 2 3 5 / \uparrow 2 3 4$?

Sol.

由右到左運算，將第一個出現的
運算記號(如 $\uparrow$)右邊的兩個數字
做此運算，運算結果取代原先位置，
依此類推。

$+ \quad - \quad * \quad 2 \quad 3 \quad 5 \quad / \quad \uparrow \quad 2 \quad 3 \quad 4$

$$2 \uparrow 3 = 8$$

$+ \quad - \quad * \quad 2 \quad 3 \quad 5 \quad / \quad 8 \quad 4$

$$8 / 4 = 2$$

$+ \quad - \quad * \quad 2 \quad 3 \quad 5 \quad 2$

$$2 * 3 = 6$$

$+ \quad - \quad 6 \quad 5 \quad 2$

$$6 - 5 = 1$$

$+ \quad 1 \quad 2$

$$1 + 2 = 3$$

Value of expression: 3

Example 9 What is the value of the postfix expression

$7\ 2\ 3\ *\ -\ 4\ \uparrow\ 9\ 3\ /\ +?$

Sol.

由左到右運算，將第一個出現的
運算記號(如*)左邊的兩個數字
做此運算，運算結果取代原先位
置，依此類推。

$7\ 2\ 3\ *\ -\ 4\ \uparrow\ 9\ 3\ /\ +$

$$2 * 3 = 6$$

$7\ 6\ -\ 4\ \uparrow\ 9\ 3\ /\ +$

$$7 - 6 = 1$$

$1\ 4\ \uparrow\ 9\ 3\ /\ +$

$$1^4 = 1$$

$1\ 9\ 3\ /\ +$

$$9 / 3 = 3$$

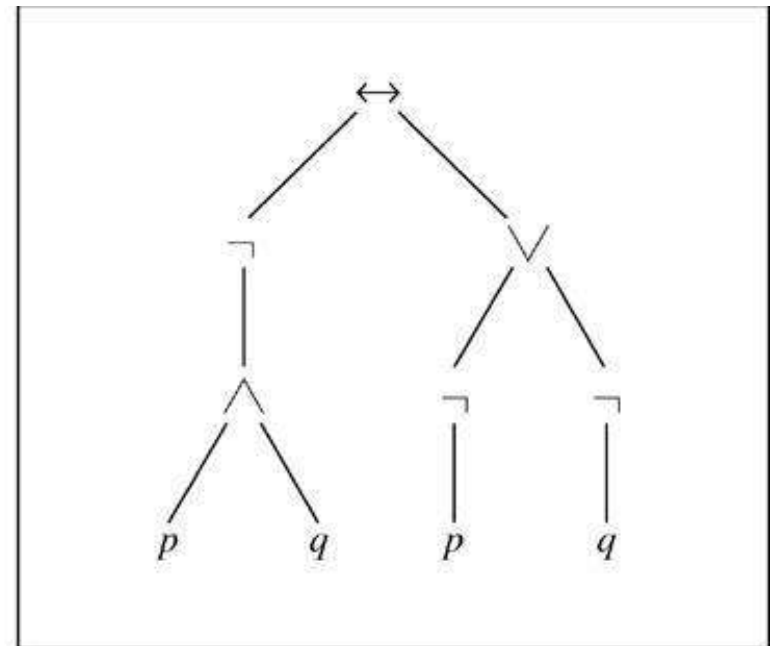
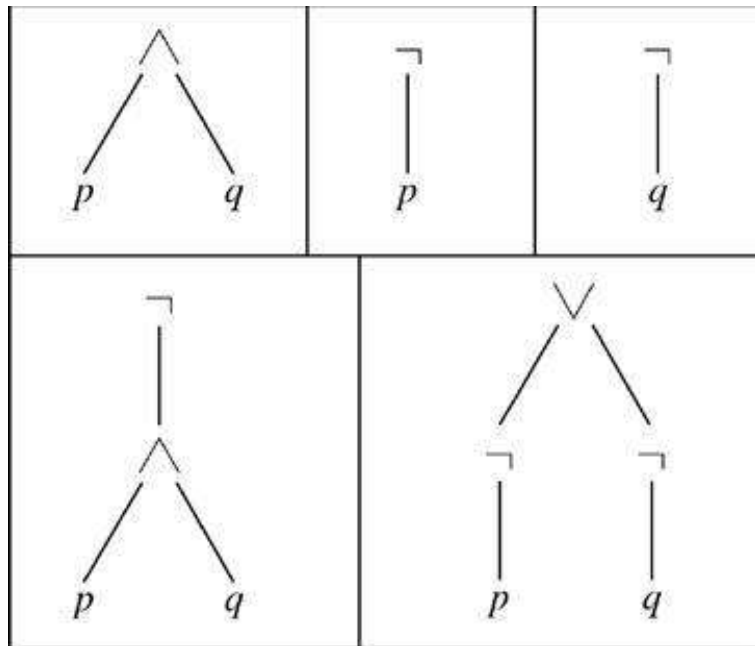
$1\ 3\ +$

$$1 + 3 = 4$$

Value of expression: 4

Example 10 Find the ordered rooted tree representing the compound proposition $(\neg(p \wedge q)) \leftrightarrow (\neg p \vee \neg q)$. Then use this rooted tree to find the prefix, postfix, and infix forms of this expression.

Sol.



prefix: $\leftrightarrow \neg \wedge p q \vee \neg p \neg q$

postfix: $p q \wedge \neg p \neg q \neg \vee \leftrightarrow$

infix: $(\neg(p \wedge q)) \leftrightarrow ((\neg p) \vee (\neg q))$

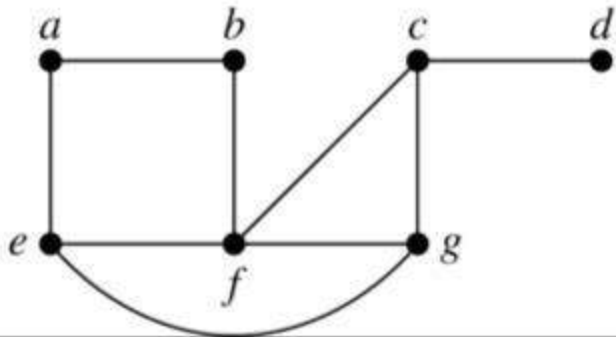
Exercise : 17, 23, 24

10.4 Spanning Trees

Introduction

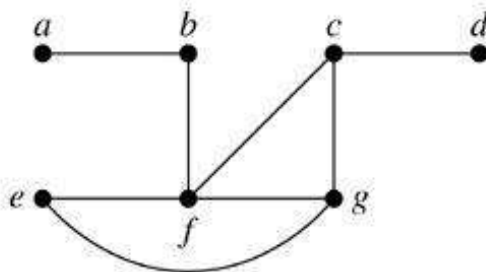
Def. Let G be a simple graph. A **spanning tree** of G is a subgraph of G that is a tree containing every vertex of G .

Example 1 Find a spanning tree of G .



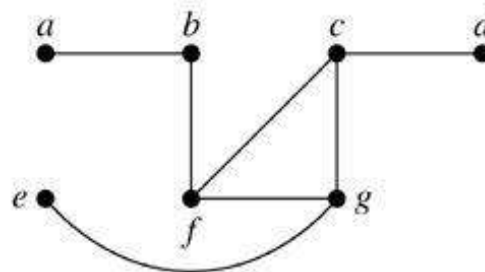
Sol.

Remove an edge from any circuit.
(repeat until no circuit exists)



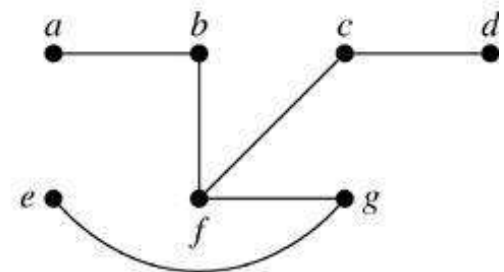
Edge removed: $\{a, e\}$

(a)



$\{e, f\}$

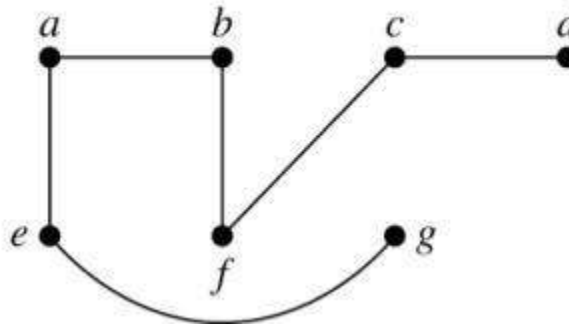
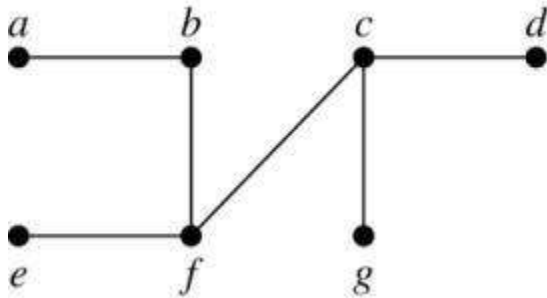
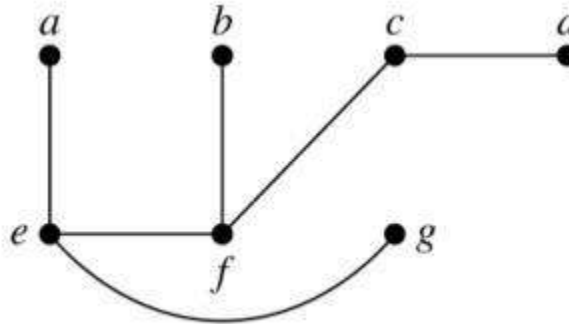
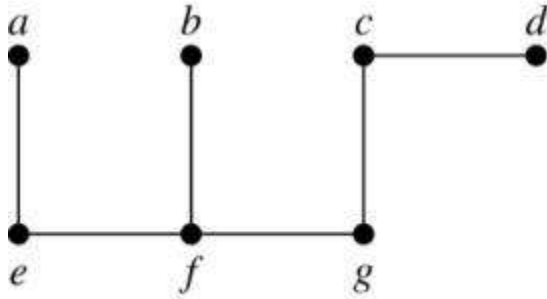
(b)



$\{c, g\}$

(c)

Four spanning trees of G :



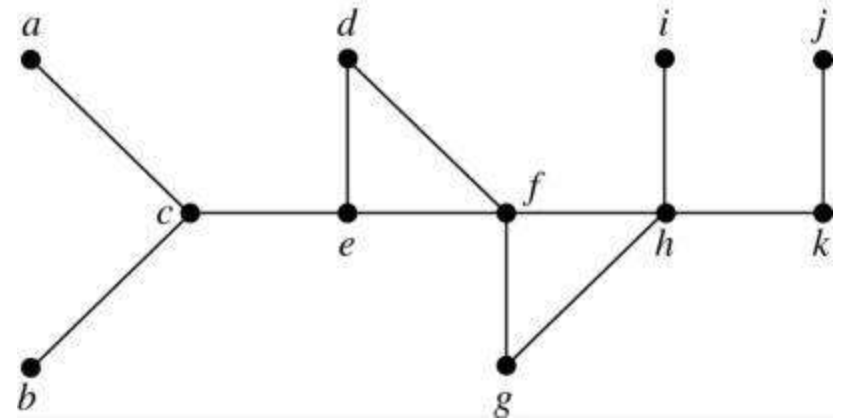
Exercise : 1, 8, 11

Thm 1 A simple graph is connected if and only if it has a spanning tree.

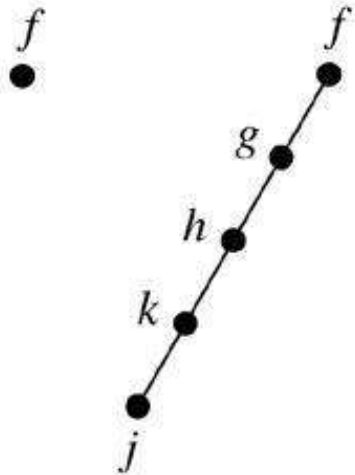
Exercise : 24, 25

Depth-First Search (DFS)

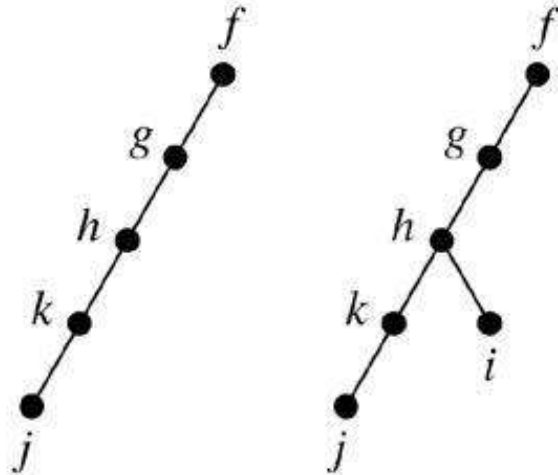
Example 3 Use depth-first search to find a spanning tree for the graph.



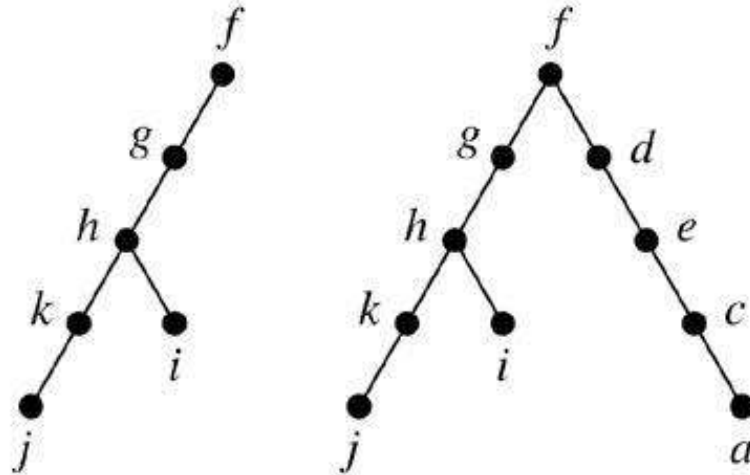
Sol. (arbitrarily start with the vertex f)



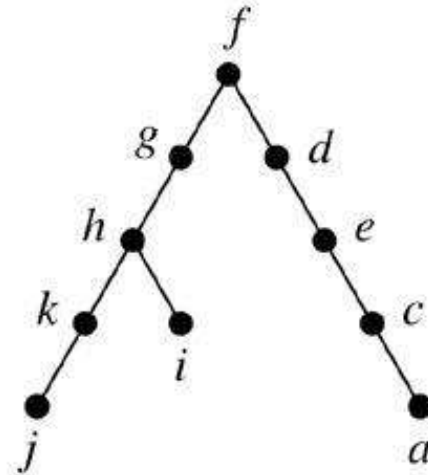
(a)



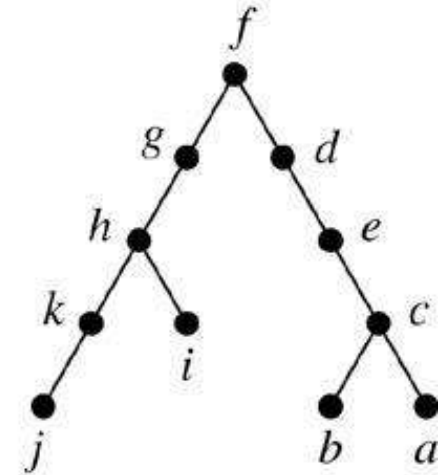
(b)



(c)



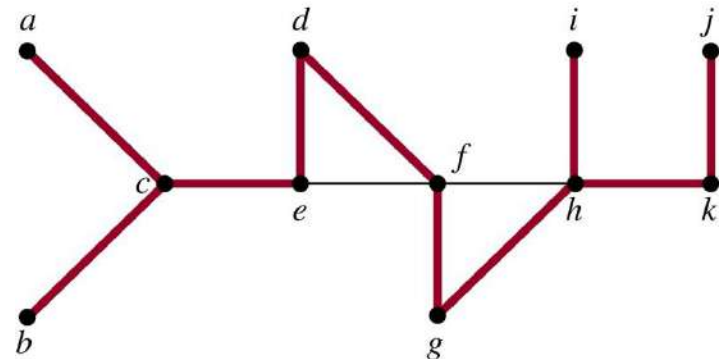
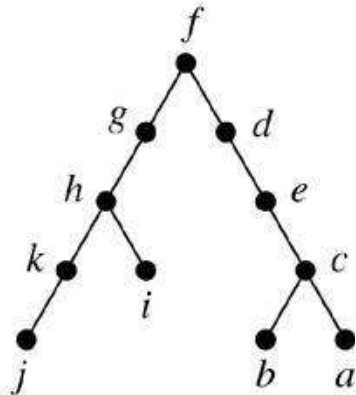
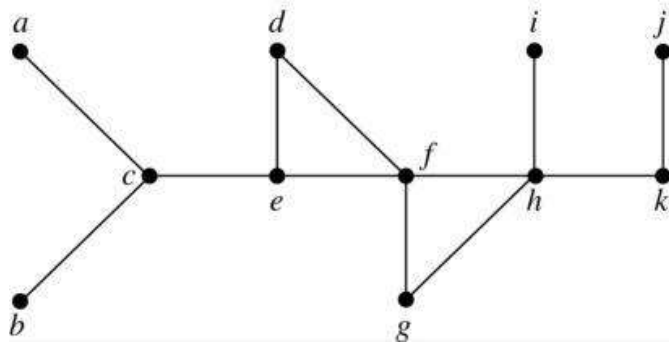
(d)



(e)

The edges selected by DFS of a graph are called **tree edges**. All other edges of the graph must connect a vertex to an ancestor or descendant of this vertex in the tree. These edges are called **back edges**.

Example 4 (承上題)



The tree edges (red)
and back edges (black)

Algorithm 1 (Depth-First Search)

Procedure *DFS*(G : connected graph with vertices $v_1, v_2, \dots, v_n$)

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

visit(v_1)

procedure *visit*(v : vertex of G)

for each vertex w adjacent to v and not yet in T

begin

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

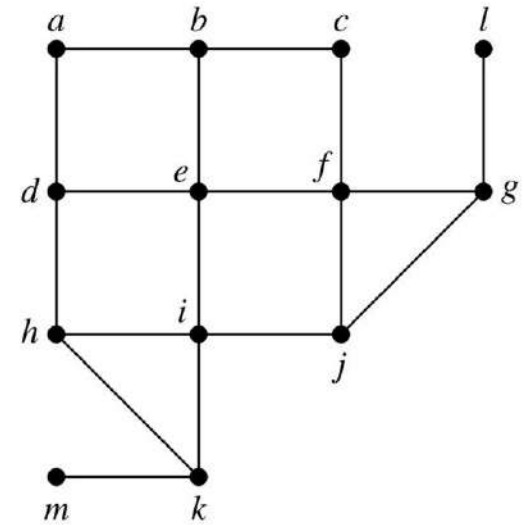
visit(w)

end

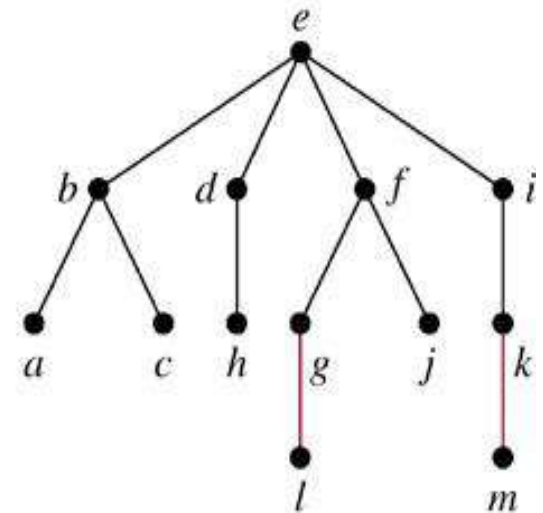
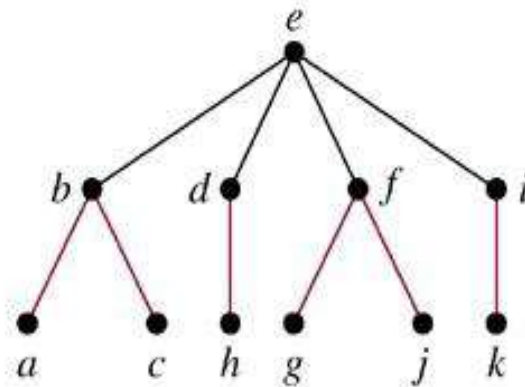
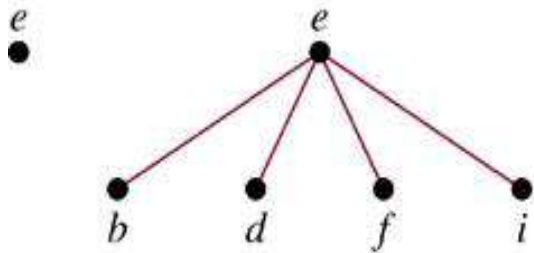
Exercise : 13

Breadth-First Search (BFS)

Example 5 Use breadth-first search to find a spanning tree for the graph.



Sol. (arbitrarily start with the vertex e)



Algorithm 2 (Breadth-First Search)

```
Procedure BFS(G: connected graph with vertices  $v_1, v_2, \dots, v_n$ )  
   $T :=$  tree consisting only of vertex  $v_1$   
   $L :=$  empty list  
  put  $v_1$  in the list  $L$  of unprocessed vertices  
  while  $L$  is not empty  
  begin  
    remove the first vertex  $v$  from  $L$   
    for each neighbor  $w$  of  $v$   
      if  $w$  is not in  $L$  and not in  $T$  then  
        begin  
          add  $w$  to the end of the list  $L$   
          add  $w$  and edge  $\{v, w\}$  to  $T$   
        end  
      end  
    end  
  end
```

Exercise : 16

Backtracking Applications

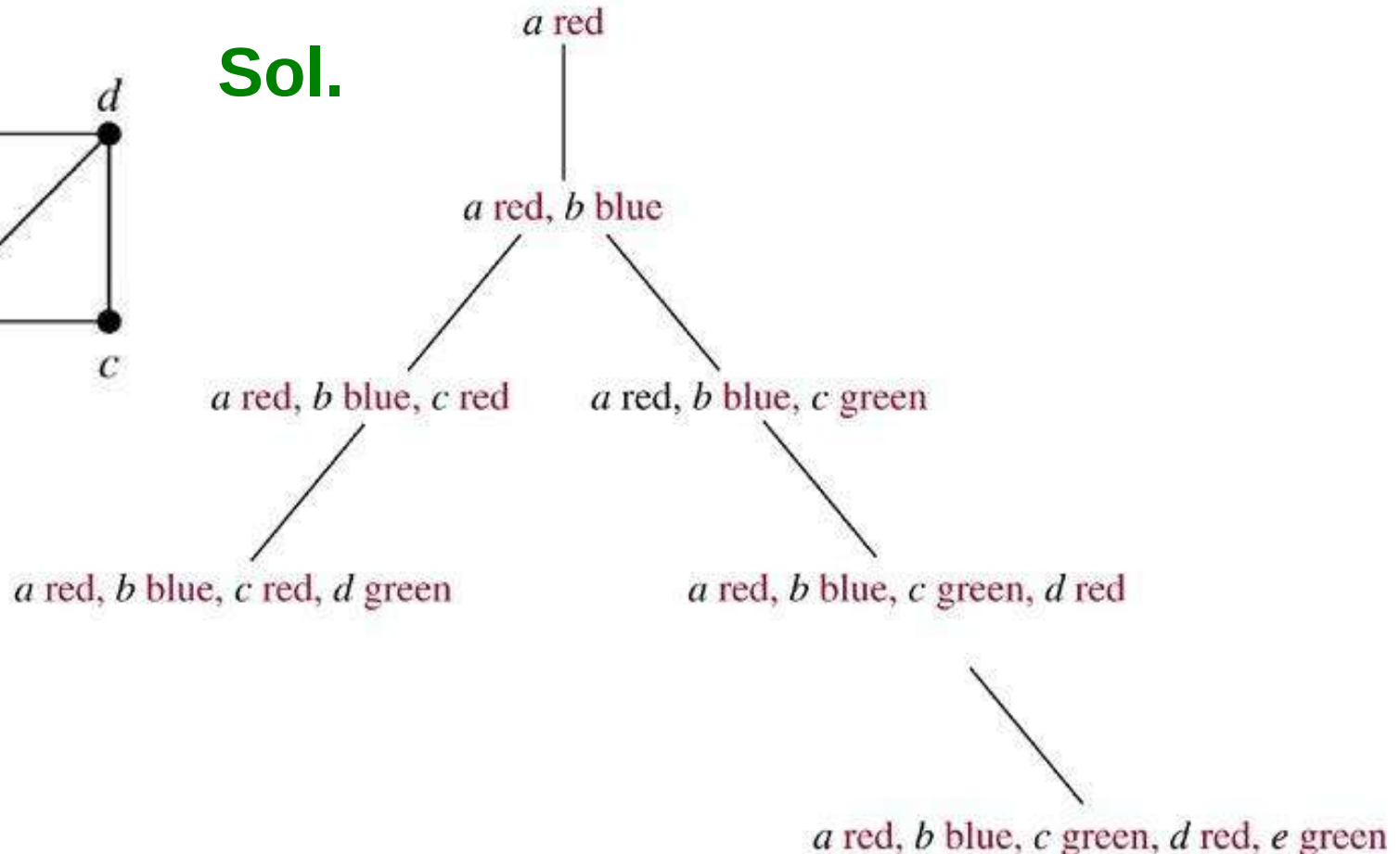
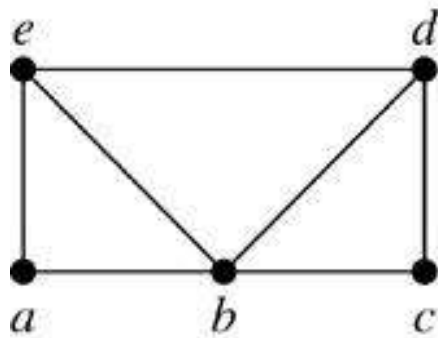
There are problems that can be solved only by performing an exhaustive (徹底的) search of all possible solutions.

Decision tree: each internal vertex represents a decision, and each leaf is a possible solution.

To find a solution via **backtracking**: 在 decision tree 上由 root 做一連串的 decision 走到 leaf, 若 leaf 不是 solution, 或整個子樹檢查完未找到解, 則退到上層 parent, 改找另一個子樹。

Example 6 (Graph Colorings) How can backtracking be used to decide whether the following graph can be colored using 3 colors?

Sol.



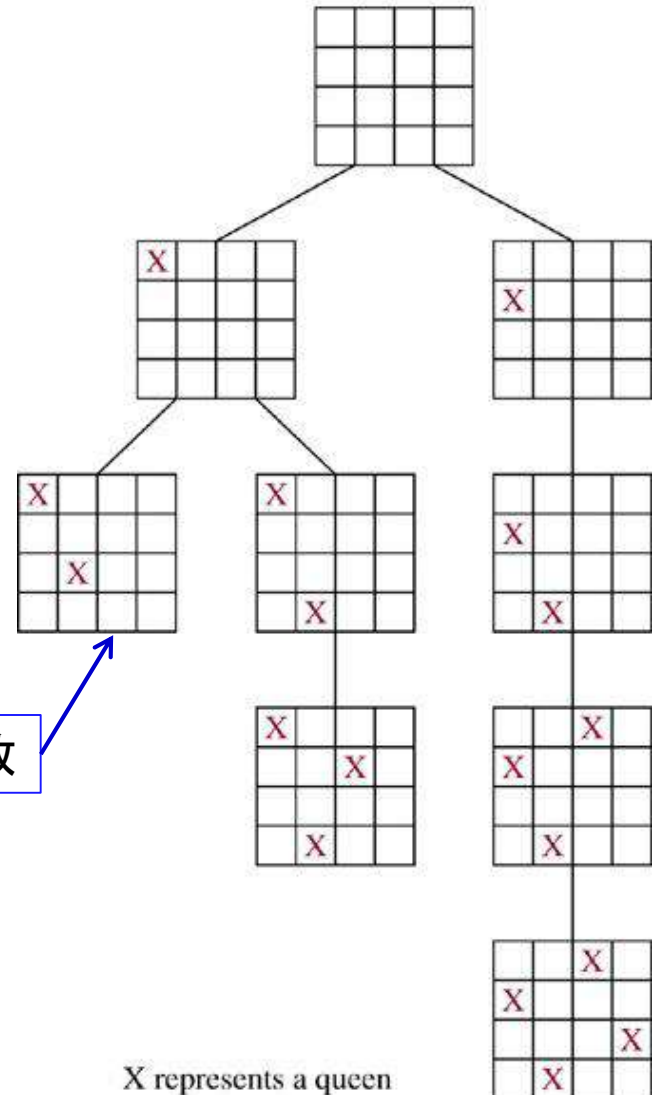
Example 7

(The n -Queens Problem)

The n -queens problem asks how n queens can be placed on an $n \times n$ chessboard so that no two queens can attack on another. How can backtracking be used to solve the n -queens problem.

Sol. 以 $n=4$ 為例

3rd column不能放



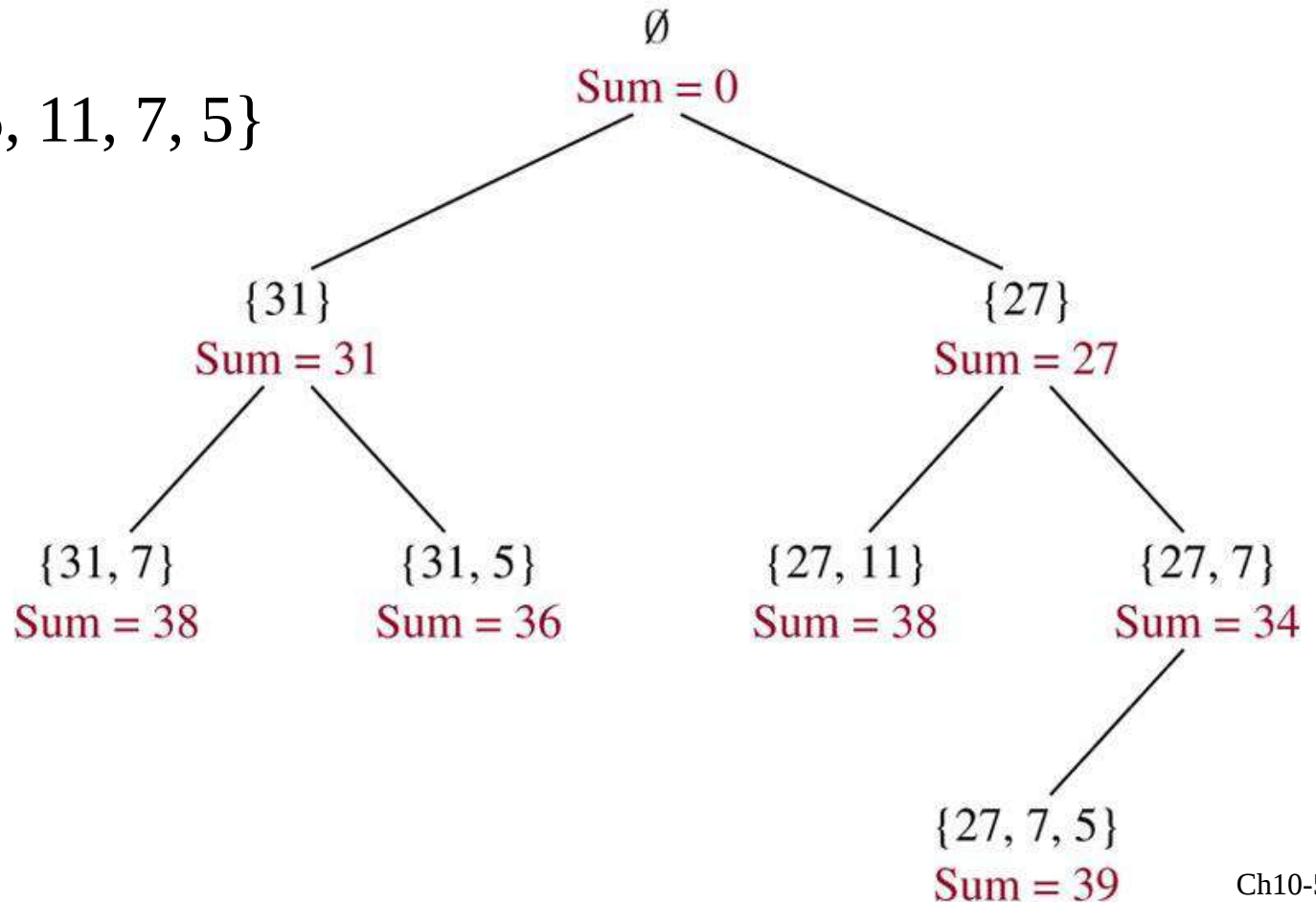
Example 8 (Sum of Subsets)

Give a set S of positive integers $x_1, x_2, \dots, x_n$, find a subset of S that has M as its sum. How can backtracking be used to solve this problem.

Sol.

$$S = \{31, 27, 15, 11, 7, 5\}$$

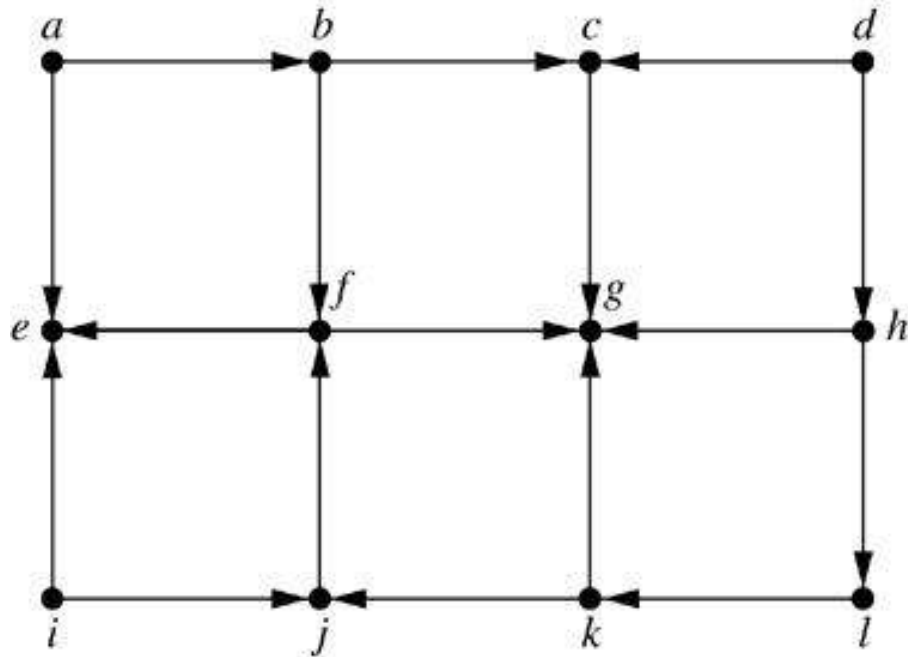
$$M = 39$$



Exercise : 30

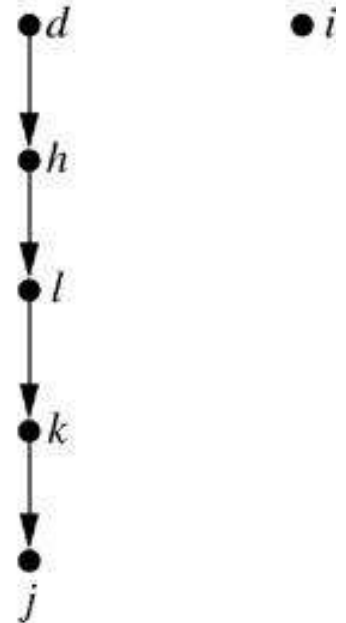
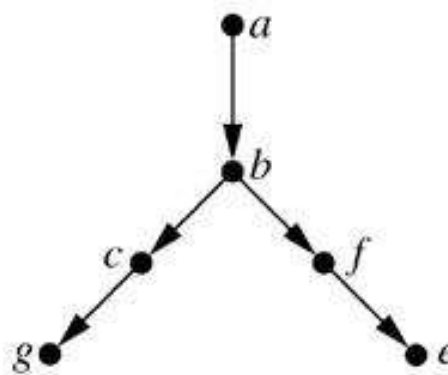
Example 9 What is the output of DFS given the graph G?

Example 9 What is the output of DFS given the graph G?



(a)

Sol.



(b)

10.5 Minimum Spanning Trees

G : connected weighted graph (each edge has an weight ≥ 0)

Def. **minimum spanning tree** of G : a spanning tree of G with smallest sum of weights of its edges.

Algorithms for Minimum Spanning Trees

Algorithm 1 (Prim's Algorithm)

Procedure *Prim*(G : connected weighted undirected graph with n vertices)

$T :=$ a minimum-weight edge

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

begin

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

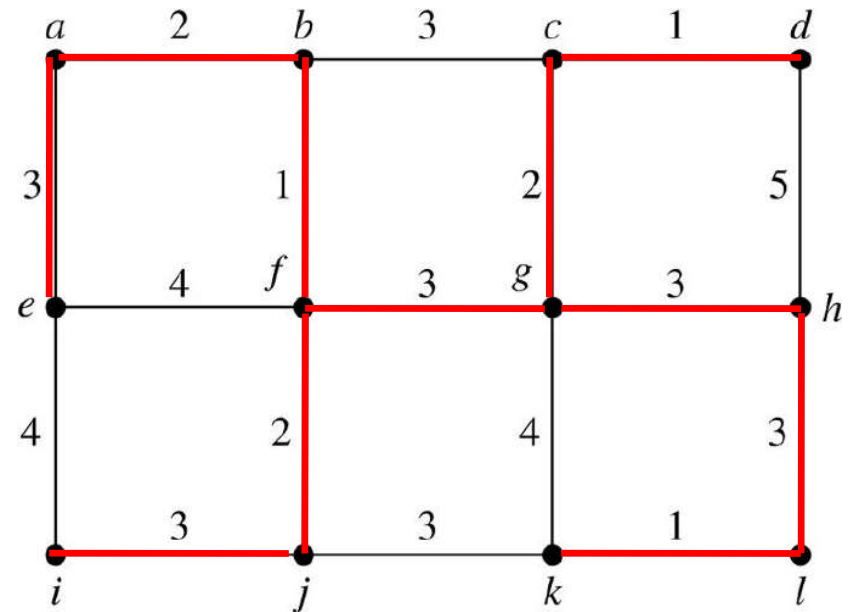
$T := T$ with e added

end { T is a minimum spanning tree of G }

Example 2 Use Prim's algorithm to find a minimum spanning tree of G .

Sol.

Choice	Edge	Weight
1	$\{b, f\}$	1
2	$\{a, b\}$	2
3	$\{f, j\}$	2
4	$\{a, e\}$	3
5	$\{i, j\}$	3
6	$\{f, g\}$	3
7	$\{c, g\}$	2
8	$\{c, d\}$	1
9	$\{g, h\}$	3
10	$\{h, l\}$	3
11	$\{k, l\}$	<u>1</u>
Total:		24



(過程中維持只有一個tree)

Exercise: 3

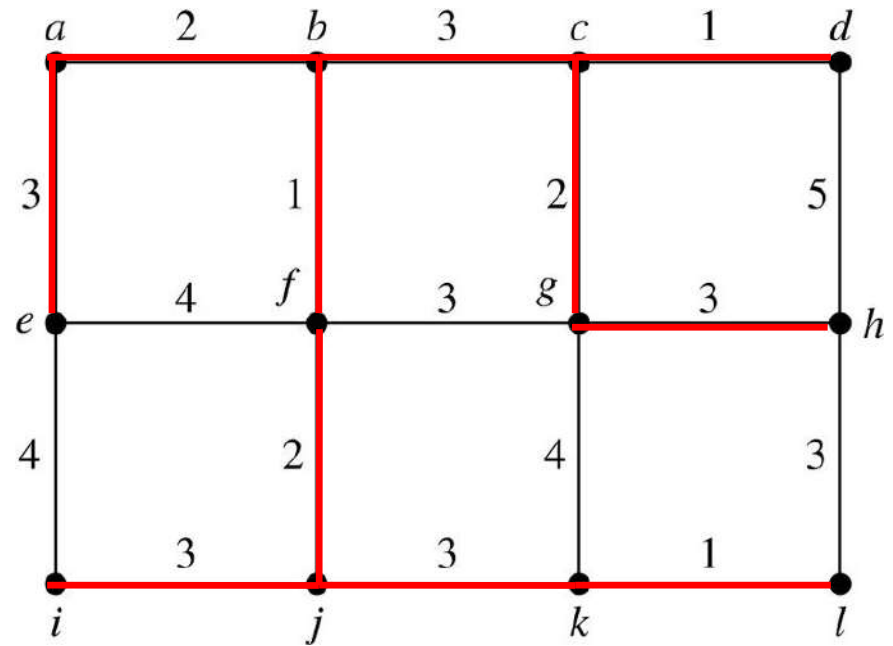
Algorithm 2 (Kruskal Algorithm)

```
Procedure Kruskal( $G$ : connected weighted undirected graph with  $n$  vertices)  
 $T :=$  empty graph  
for  $i := 1$  to  $n-1$   
begin  
     $e :=$  any edge in  $G$  with smallest weight that does not form a simple  
        circuit when added to  $T$   
     $T := T$  with  $e$  added  
end { $T$  is a minimum spanning tree of  $G$ }
```

Example 3 Use Kruskal algorithm to find a minimum spanning tree of G .

Sol.

Choice	Edge	Weight
1	$\{c, d\}$	1
2	$\{k, l\}$	1
3	$\{b, f\}$	1
4	$\{c, g\}$	2
5	$\{a, b\}$	2
6	$\{f, j\}$	2
7	$\{b, c\}$	3
8	$\{j, k\}$	3
9	$\{g, h\}$	3
10	$\{i, j\}$	3
11	$\{a, e\}$	3
Total:		24



(過程中tree通常會有好幾個)

Exercise: 7