# Review and Terminologies

#### Outline

- Complexity
- · Tree and search tree
- Graph

# 複雜度 (Complexity)

#### Insertion Sort

#### (不同的sort有不同的稱呼,請謹慎使用)

```
for (i = 1; i < n; i++)
{/* insert a[i] into a[0:i-1] */
  int t = a[i];
  int j;
  for (j = i - 1; j >= 0 && t < a[j]; j--)
      a[j + 1] = a[j];
                      想法: 先排好前k個數字, 接著決定
  a[j + 1] = t;
                      (k+1)-th數字要插入在所有k+1個數字
                      當中的哪裡,使完成k+1個數字的排列
```

#### Complexity的計算

- · 針對程式執行的time and/or 或使用的記憶體space所做的估算測量 (在程度上)
- · Time (常見)
  - 計數演算法當中一個有"代表性"的操作上的次數(代表性操作往往是最耗費時間或空間的操作,它應該出現在程式最花時間或空間的地方)
  - 代表性操作視演算法不同而不同
  - Insertion sort: 比較的操作

#### Comparison Count or Data Movement?

for 
$$(j = i - 1; j >= 0 && t < a[j]; j--)$$
  
 $a[j + 1] = a[j];$ 

這兩個數量的數值基本相當因此看當中一個就好了...

#### Comparison Count

- > Worst-case count = maximum count
  - > 我們最感興趣的數字之一
  - > 但有時沒多大參考價值
- > Best-case count = minimum count
  - > 很少用
- > Average count
  - > Expectation
  - > Variance (or deviation in general) 我們也關心
  - > 或, tail probability

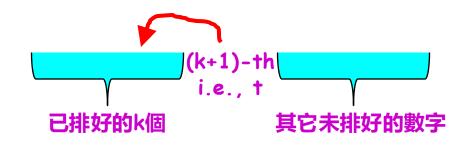
#### Worst-Case Comparison Count

```
for (j = i - 1; j >= 0 && t < a[j]; j--)

a[j + 1] = a[j];
```

```
a = [1, 2, 3, 4] and t = 0 \Rightarrow 4 compares a = [1, 2, 3, ..., i] and t = 0 \Rightarrow i compares
```

## Worst-Case Comparison Count (Here, n represents 資料量)



總共n筆資料

total compares = 1 + 2 + 3 + ... + (n-1)  
= 
$$(n-1)n/2 = \frac{1}{2}(n^2) - \frac{1}{2}(n)$$

A list in decreasing order

#### Asymptotic Complexity for Insertion Sort

- 關鍵因子,造成整體數量大小的關鍵
- $O(n^2)$ 
  - O: big-O (讀法) 其嚴謹的定義請上演算法的課
  - ・ 考慮如下: ½(n²)-½(n) vs n²+3n-4
    - · Both are  $O(n^2)$

某一個不知名的sorting algorithm

# Worst- vs Best-case Complexity for Insertion Sort

- Worst-case time is  $O(n^2)$
- Best-case is O(n)
  - · Why?
  - Increasing order

# 相異資料量n下 不同 Complexities的直觀

n	n	nlogn	n <sup>2</sup>	n <sup>3</sup> complexities
1000	1mic	10mic	1milli	1sec
10000	10mic	130mic	100milli	17min
10 <sup>6</sup>	1milli	20milli	17min	32years

#### 這種複雜度令人難以接受

n	n <sup>4</sup>	n <sup>10</sup>	<b>2</b> <sup>n</sup>	complexities
1000	17min	3.2 x 10 <sup>13</sup> years	3.2 x 10 <sup>283</sup> years	
10000	116 days	???	???	
10 <sup>6</sup>	3 x 10 <sup>7</sup> years	??????	??????	

#### Solution Space (解空間)

假設一位農民有一片面積為 L 公頃的農田,可以種植小麥或大麥,或者兩者的組合。農民擁有 F 千克的肥料和 P 千克的農藥。每公頃小麥需要  $F_1$  千克肥料和  $P_1$  千克農藥,而每公頃大麥需要  $F_2$  千克肥料和  $P_2$  千克農藥。設  $S_1$  和  $S_2$  分別為每公頃小麥和大麥的售價。如果用  $S_1$  和  $S_2$  分別表示種植小麥和大麥的面積,則通過選擇  $S_1$  和  $S_2$  的最佳值可以實現利潤最大化。這個問題可以表示為以下標準型的線性規劃問題:

max:  $S_1 \cdot x_1 + S_2 \cdot x_2$  (最大化收益,即小麥總銷售額加大麥總銷售額,收益是「目標函數」) s.t.  $x_1 + x_2 \leq L$  (總面積限制)  $F_1 \cdot x_1 + F_2 \cdot x_2 \leq F$  (肥料限制)  $P_1 \cdot x_1 + P_2 \cdot x_2 \leq P$  (農藥限制)  $x_1 \geq 0, x_2 \geq 0$  (種植面積不能為負)

#### Linear Programming

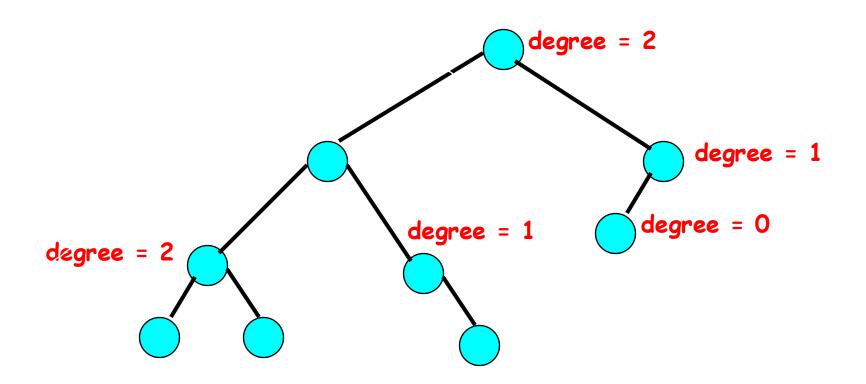
#### Approximation Ratio

- Solution space
  - ・ Valid (須是合法解)
  - 例如搜尋的問題, solution space = {insertion, quick, bubble, merge, radix, ...}
  - Solution space = {A, B, C, ..., optimum, ...}
- □ appox. ratio = (所提出的演算法/最佳的演算法)
- □ 最佳解"並非"人類眼前最好的做法,也更不是一般平均水平的做法
- □ 最佳解往往不存在,人類無法在多項式時間 (polynomial time) 内能 找出來
- Instead of optimum, we seek performance lower/upper bound

#### Trees and Binary Trees

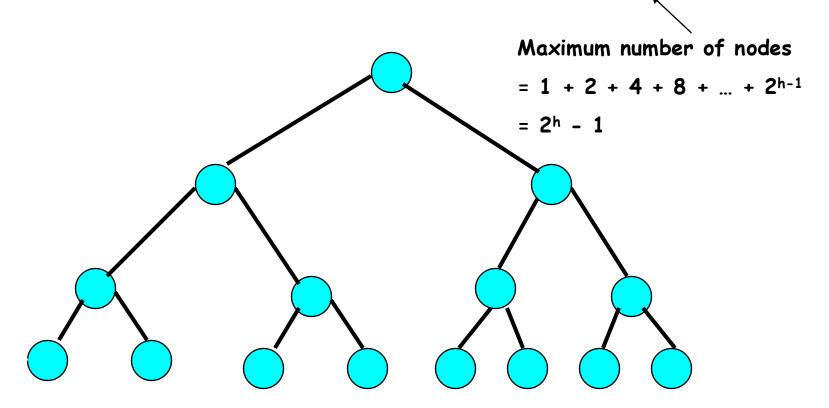
#### Binary Trees

- Recursive definition:
  - · 每個node有left sub-tree and/or right sub-tree
  - · Left sub-tree (or right sub-tree) is a binary tree // 方向性!
- · Root, leaf, and internal node (非root與非leaf以外的節點)
- · Degree of any given node: number of sub-trees



# "Full" Binary Tree

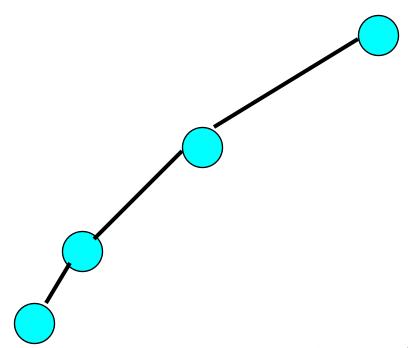
A full binary tree of a given height h has 2h - 1 nodes.



Height 4 full binary tree.

#### Minimum Number of Nodes

- Minimum number of nodes in a binary tree whose height is h.
- At least one node at each of first h levels.



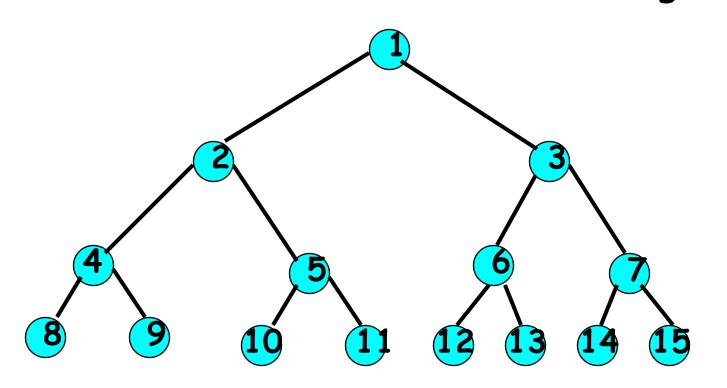
minimum number of nodes is h

#### Number of Nodes & Height

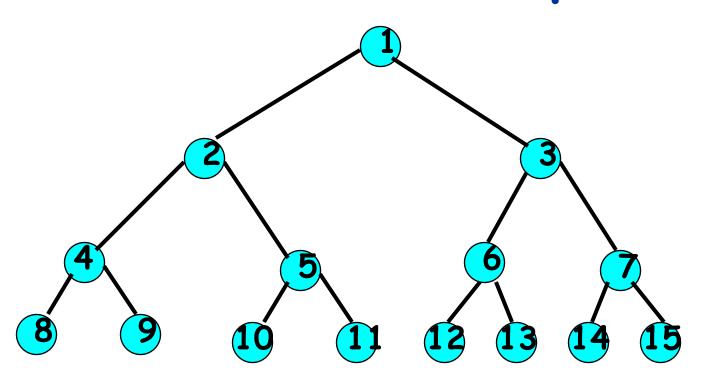
- Let n be the number of nodes in a binary tree whose height is h.
- $h <= n <= 2^h 1$
- $log_2(n+1) \leftarrow h$

#### Numbering Nodes in a Full Binary Tree

- Number the nodes 1 through 2<sup>h</sup> 1.
- Number by levels from top to bottom.
- · Within a level number from left to right.



#### Node Number Properties

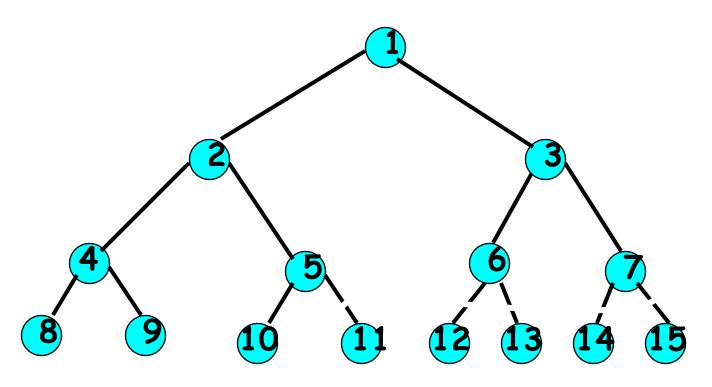


- Parent of node i is node floor(i / 2)
  - Node 1 is the root and has no parent
- Left (or Right) child of node i is node 2i (or 2i+1)

# "Complete" Binary Tree with n Nodes

- Number the nodes as described earlier.
- The binary tree defined by the nodes numbered 1
   through n is the unique n node complete binary tree.

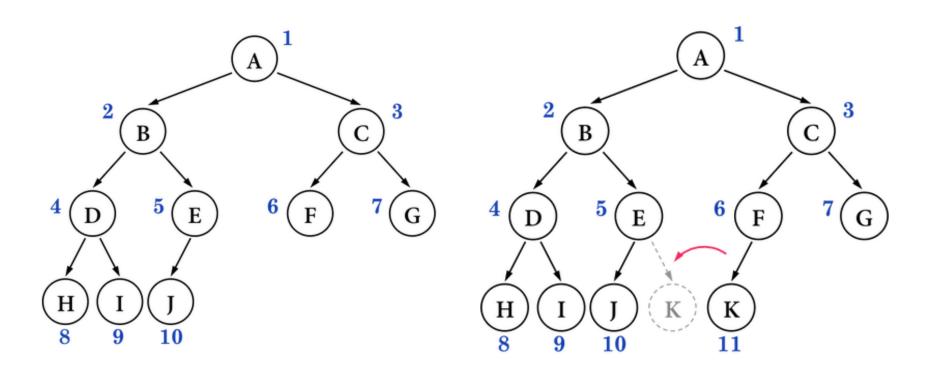
#### Example



Complete binary tree with 10 nodes.

Note: Full binary tree是complete binary tree的一個特例

## Yes (Left) and No (Right)



# Binary "Search" Trees

#### Binary Search Trees

#### Operations:

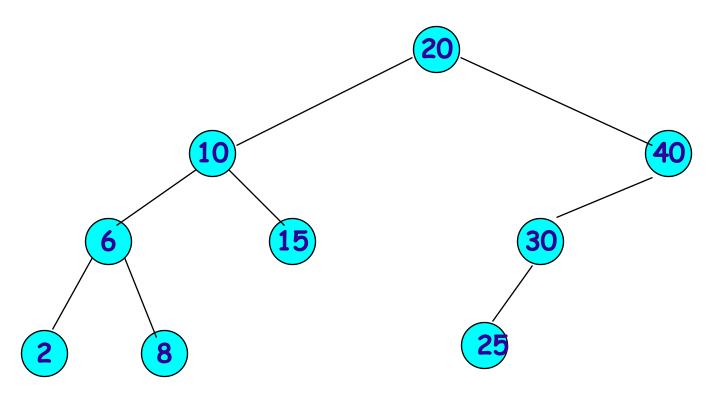
- Search(key)
- Insert(key, value)
- Delete(key)
- \_

# Definition of Binary Search Tree

- · A binary tree.
- · Each node has a (key, value) pair.
- · For every node  $\times$ , all keys in the left subtree of  $\times$  are smaller than that in  $\times$ .
- · For every node x, all keys in the right subtree of x are greater than that in x.

#### 我們暫時僅考慮所有資料的keys皆不同的情形

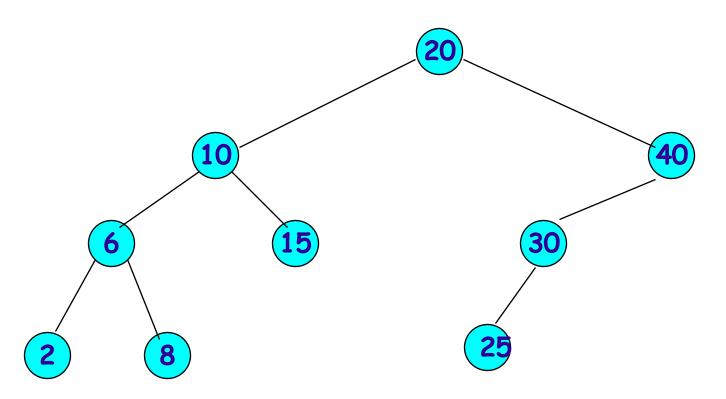
# Example Binary Search Tree



Only "keys" are shown.

(節點內還會有其他的資料欄位)

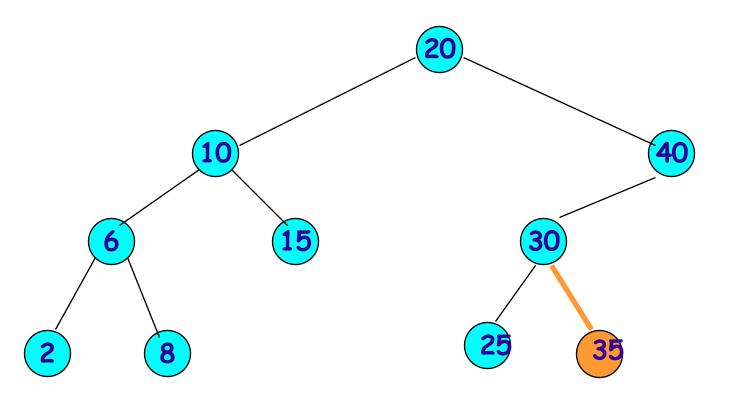
# The Operation Search()



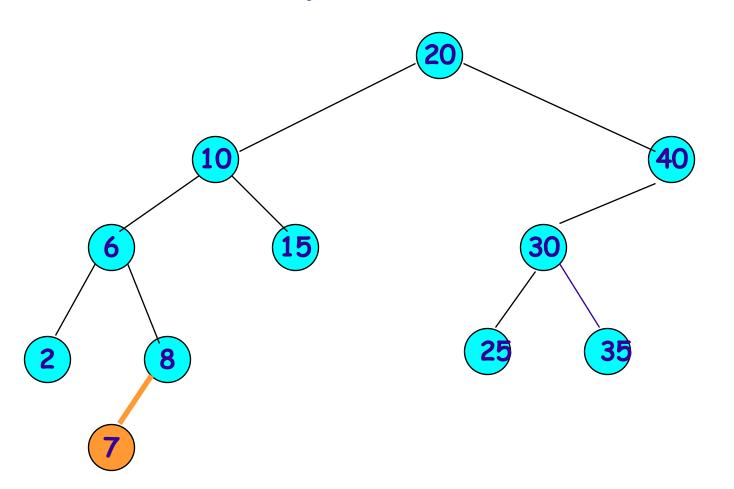
Complexity is O(height) = O(n), where n is number of nodes/elements. (樹可能歪歪斜斜的, skew)

#### Insert與Delete的初體驗

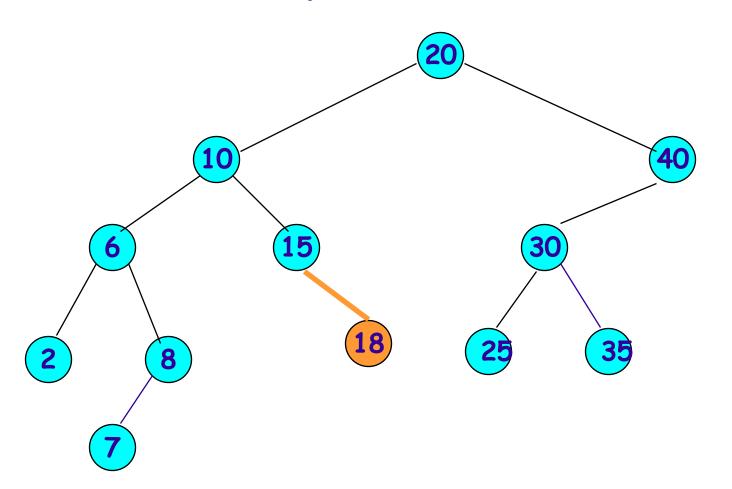
- · 僅是讓同學了解insert與delete之於binary search tree上的操作之初體驗
  - Insert前是binary search tree, insert後還是binary search tree (binary tree的定義必須被維持)
  - · Delete也是如此
- 往後,我們會面對"結構"上較具要求的binary search tree



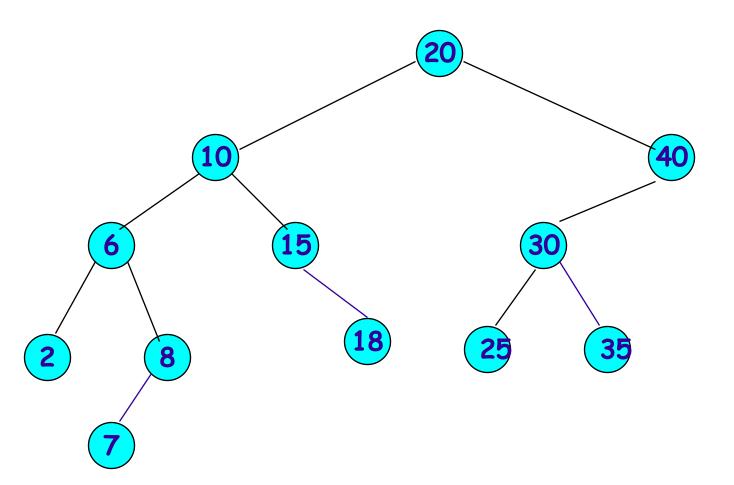
Insert a pair whose key is 35.



Insert a pair whose key is 7.



Insert a pair whose key is 18.

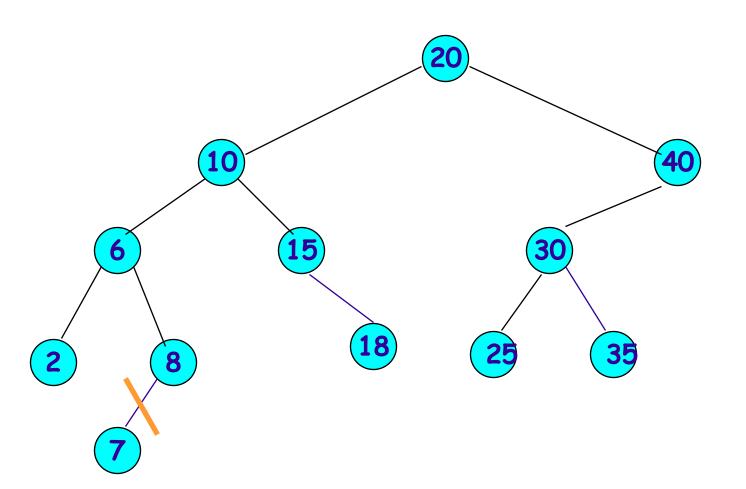


Complexity of Insert() is O(height).

# The Operation Delete()

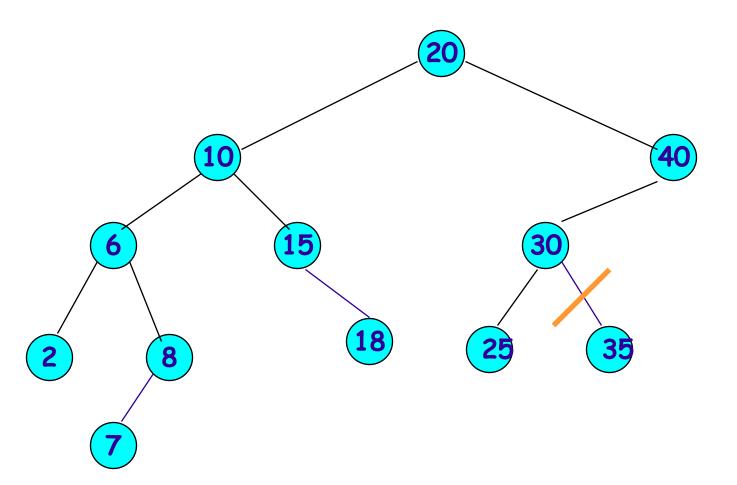
- · Four cases:
  - No element with delete key.
  - •Element is in a leaf.
  - Element is in a degree 1 node.
  - •Element is in a degree 2 node.

### Delete from a Leaf

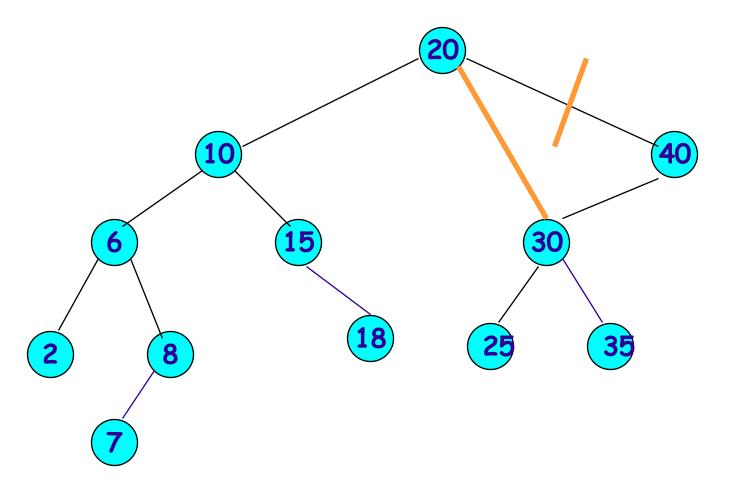


Delete a leaf element. key = 7

## Delete from a Leaf (contd.)

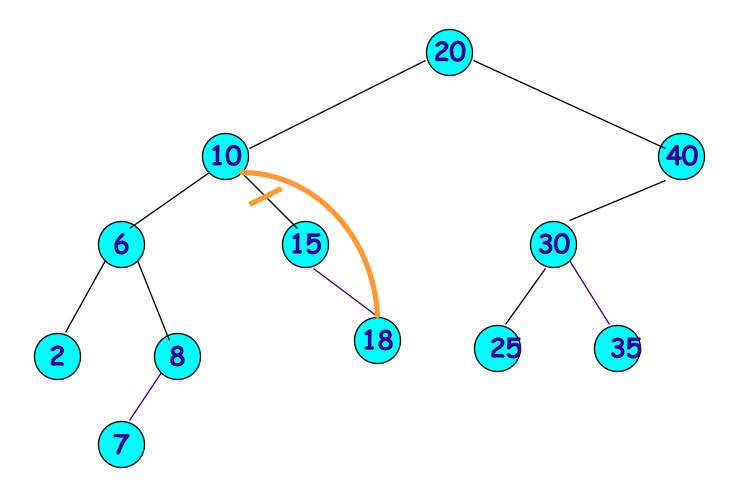


Delete a leaf element. key = 35

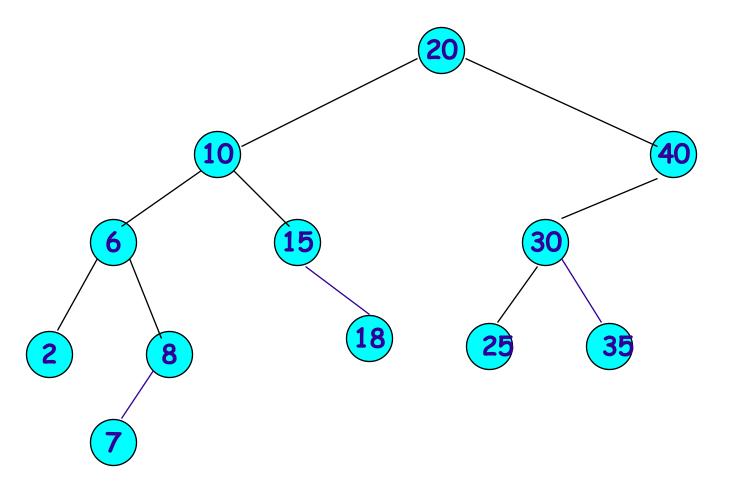


Delete from a degree 1 node. key = 40

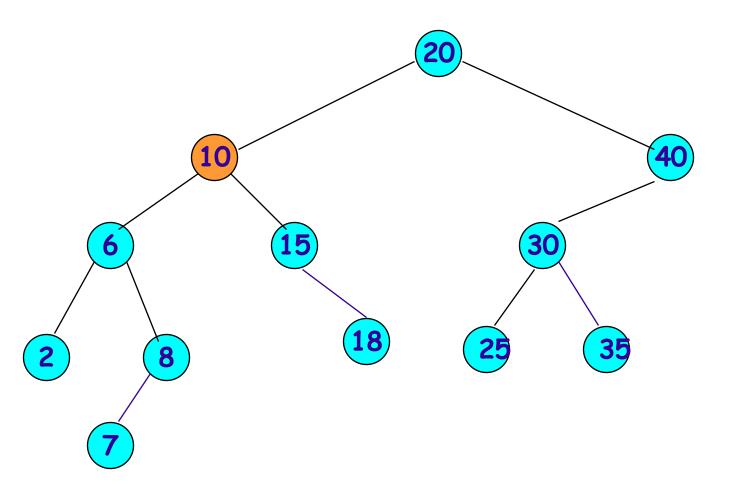
#### Delete from a Degree 1 Node (contd.)



Delete from a degree 1 node. key = 15

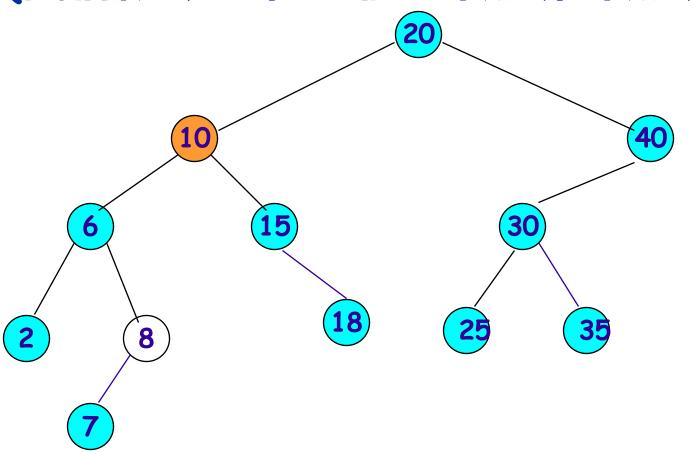


Delete from a degree 2 node. key = 10

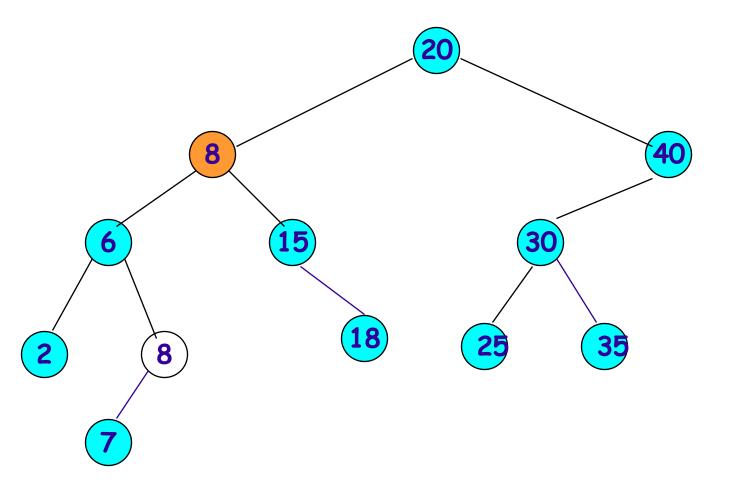


Replace with largest key in left subtree (or smallest in right subtree).

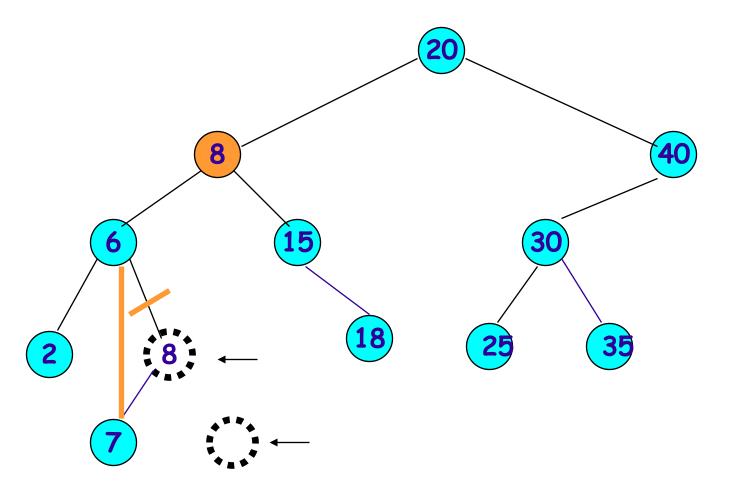
# Delete from a Degree 2 Node (我們說明一種可能的做法,做法非唯一)



Replace with largest key in left subtree (or smallest in right subtree).



Replace with largest key in left subtree (or smallest in right subtree).



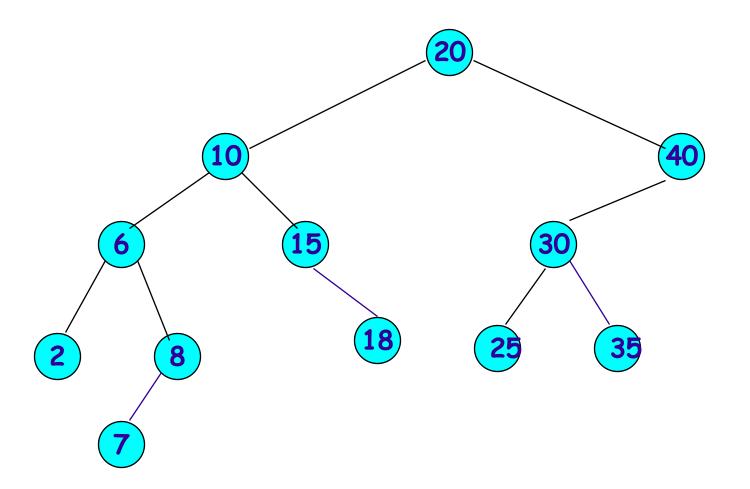
Largest key must be in a leaf or degree 1 node. Why?



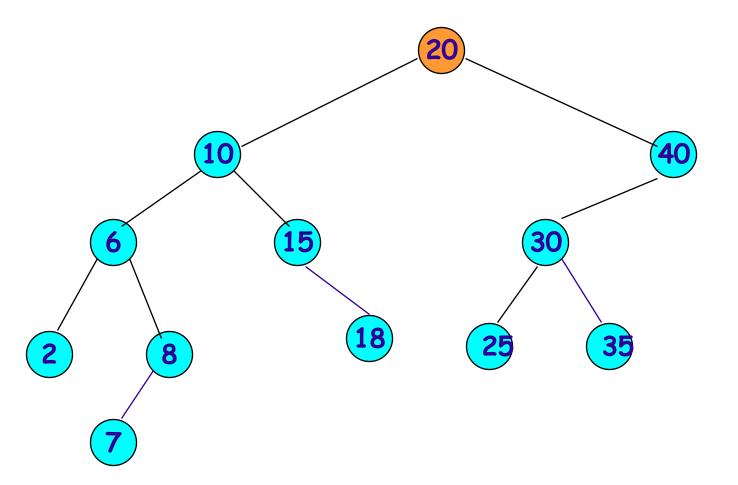
### 善用已經存在的操作...

- ·轉換成delete
  - · degree-1 node, or
  - leaf

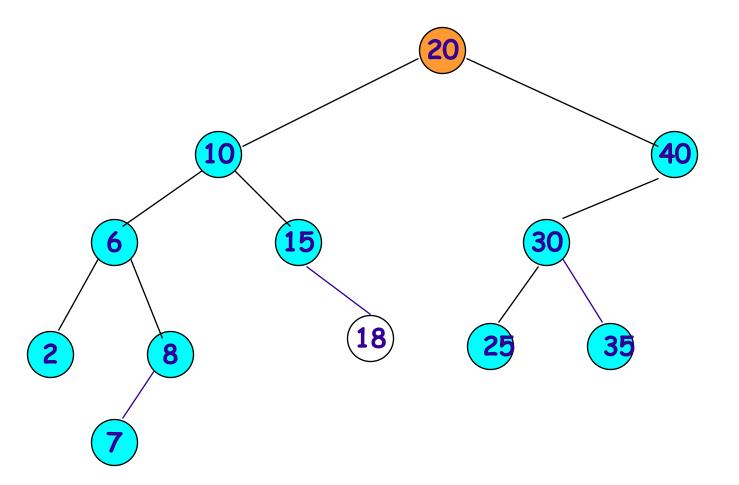
### Another Delete from a Degree 2 Node



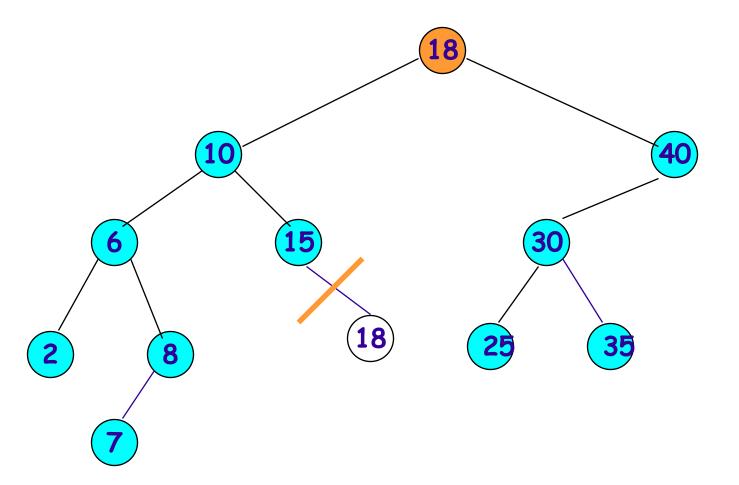
Delete from a degree 2 node. key = 20



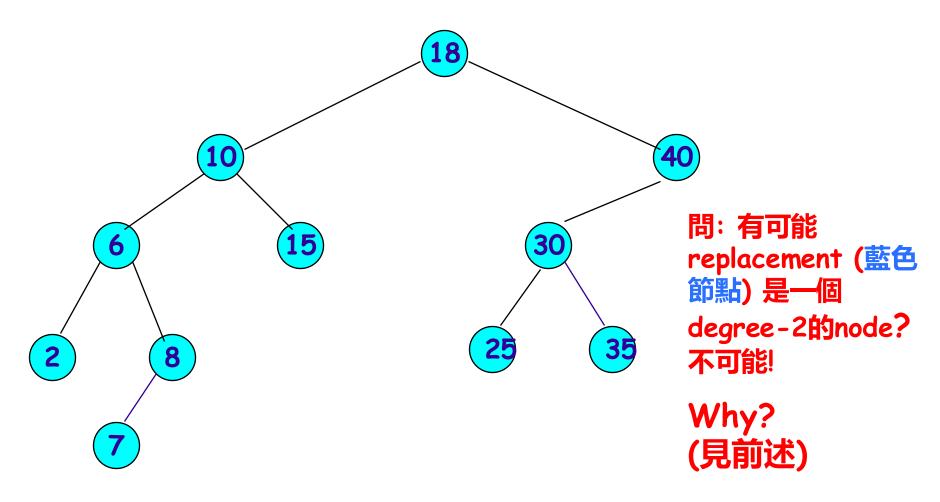
Replace with largest in left subtree.



Replace with largest in left subtree.



Replace with largest in left subtree.



Complexity is O(height).

### Indexing

- Databases最重要、最核心的功能之一
  - · 基於some search trees

## Graphs

### Graphs

- G = (V,E)
- V is the vertex set.
- Vertices are also called nodes and points.
- E is the edge set.
- Each edge connects two different vertices.
- Edges are also called arcs and lines.
- Directed edge has an orientation (u,v).



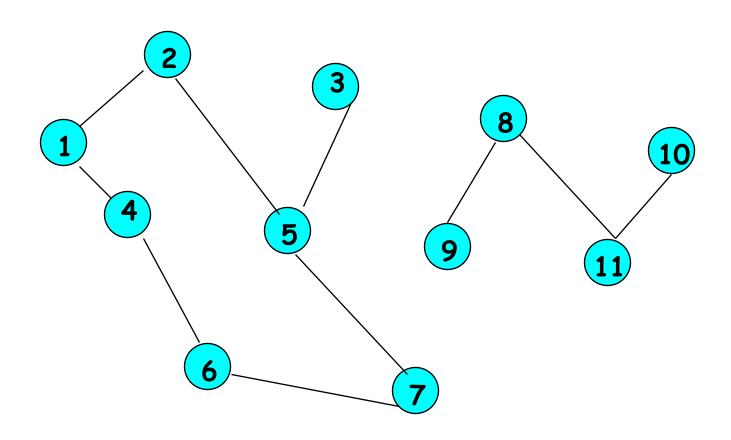
# Undirected and Directed Graphs

Undirected edge has no orientation (u,v).

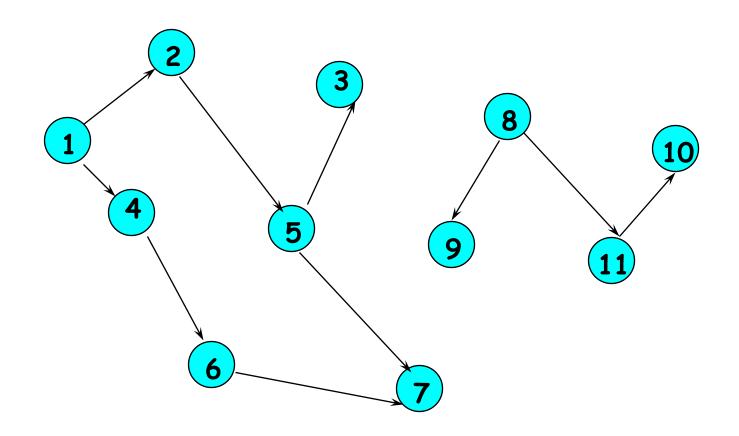
u — v

- · Undirected graph => no oriented edge.
- Directed graph => every edge has an orientation.

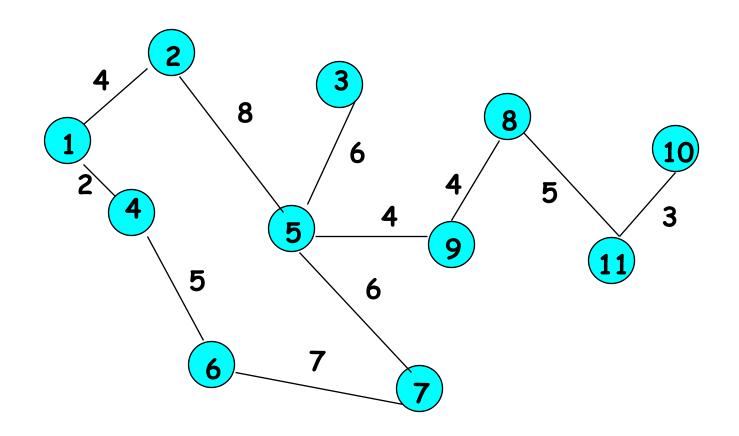
## Undirected Graph



## Directed Graph (Digraph)



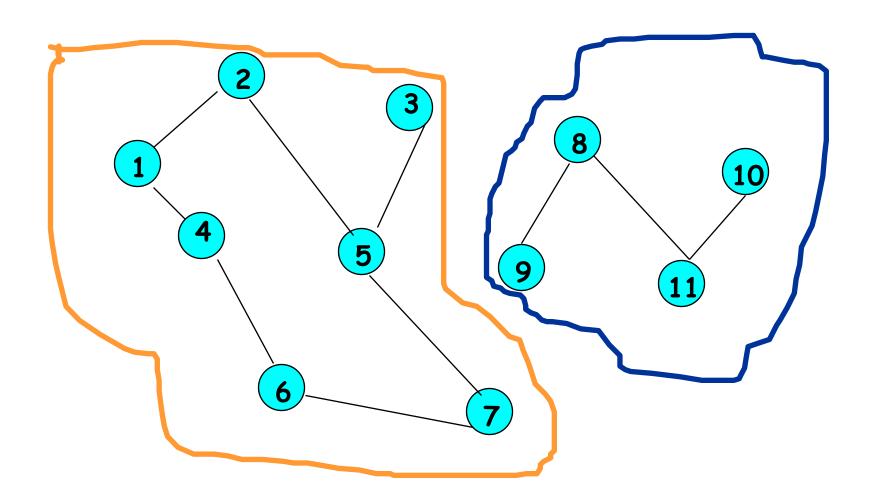
## Applications: Driving Distance/Time Map



Vertex = city

Edge weight = driving distance/time.

### Applications: Connected Components

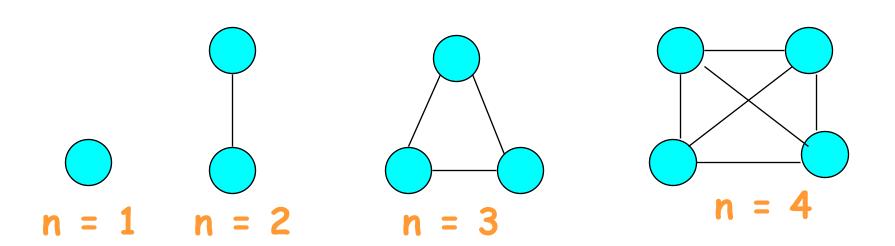


#### Notes

- · Tree是一種特別的graph
- · Graph本質上並沒有超出tree會考量使用的資料結構
  - Array, e.g., adjacent matrix
  - Linked list

### Complete Undirected Graph

Has all possible edges.



## Some Trivial Properties

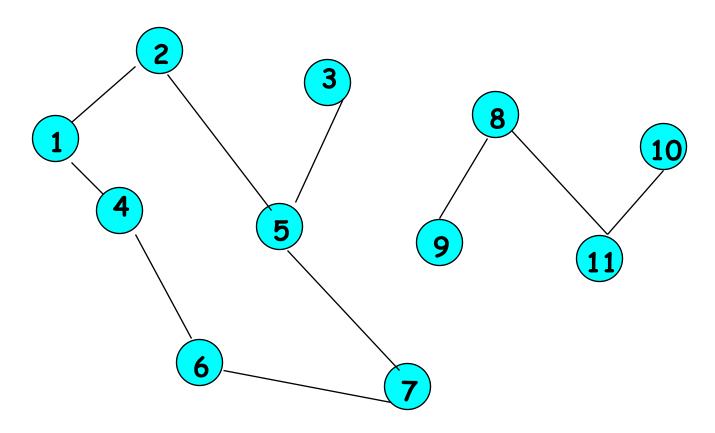
### Number of Edges—Undirected Graph

- Each edge is of the form (u,v), u != v.
- Number of such pairs in an n vertex graph is n(n-1).
- Since edge (u,v) is the same as edge (v,u), the number of edges in a complete undirected graph is n(n-1)/2.
- Number of edges in an undirected graph is  $\langle = n(n-1)/2 \rangle$ .

### Number of Edges—Directed Graph

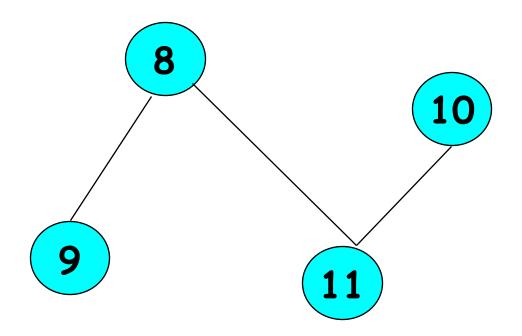
- Each edge is of the form (u,v), u != v.
- Number of such pairs in an n vertex graph is n(n-1).
- Since edge (u,v) is not the same as edge (v,u), the number of edges in a complete directed graph is n(n-1).
- Number of edges in a directed graph is  $\leq n(n-1)$ .

### Vertex Degree



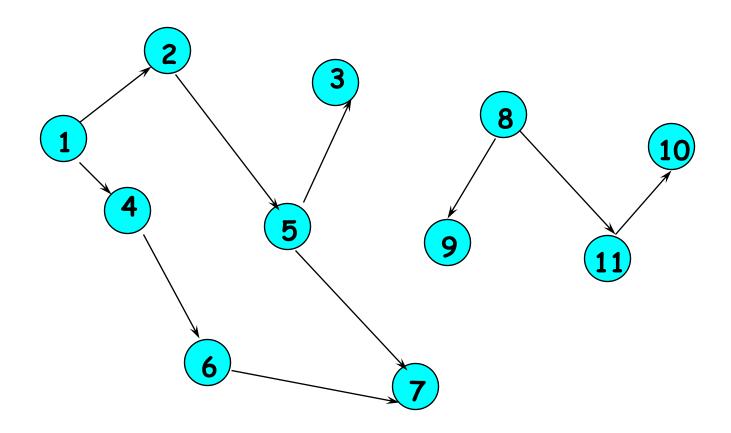
- Number of edges incident to vertex.
- degree(2) = 2, degree(5) = 3, degree(3) = 1

### Sum of Vertex Degrees



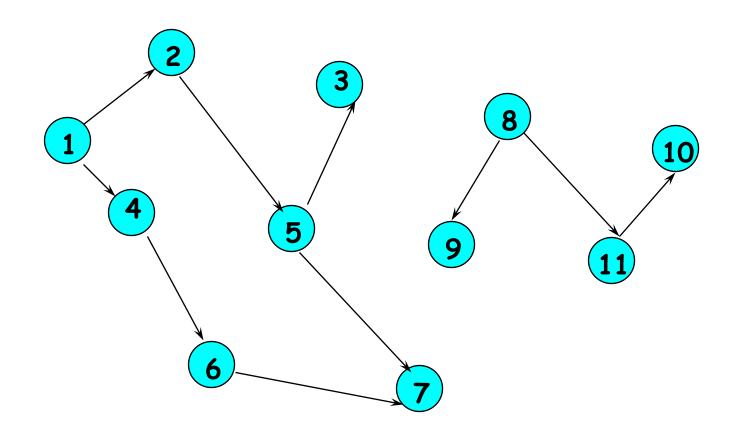
Sum of degrees = 2e (where e is number of edges)

### In-Degree of a Vertex



- in-degree is number of incoming edges
- indegree(2) = 1, indegree(8) = 0

### Out-Degree of a Vertex



- out-degree is number of outbound edges
- outdegree(2) = 1, outdegree(8) = 2

### Sum of In- and Out-Degrees

 each edge contributes 1 to the in-degree of some vertex and 1 to the out-degree of some other vertex

sum of in-degrees = sum of out-degrees = e,
 where e is the number of edges in the digraph

#### Tree

- Connected graph that has no cycles.
  - Connected graph: a graph contains a single connected component
- n vertex connected graph with n-1 edges.
- · Tree本質是directed graph, 惟我們大部分的時候不會如此強調。Tree透過parent, children, left child (in case binary tree), right child (in case binary tree) 等等定義了方向性。