

Time Complexity

classify	algorithm	Time Complexity
Backtrack	BFS	Adjacent list: $O(E + V)$, matrix: $O(n^2)$
	DFS	Adjacent list: $O(E + V)$, matrix: $O(n^2)$
Dynamic programming	Floyd-Warshall	$O(n^3)$
	Matrix Chain	$O(n^3)$
	OBST	$O(n^3)$
	LCS	$O(mn)$
	Longest common substring	$O(mn)$
	Longest Increasing Subsequence	$O(n^2)$
	Huffman	$O(n \log n)$
	0/1 Knapsack problem	$O(nW)$
Greedy	Kruskal	adjacency matrix $O(n^2)$ adjacency list $O(E \lg E)$
	Prim's	adjacency matrix $O(n^2)$ binary heap+ adjacency list $\rightarrow O(E \log V)$ Fibonacci heap+ adjacency list $\rightarrow O(E + V \log V)$
	Dijkstra	Linear array $\rightarrow O(n^2)$ binary heap $\rightarrow O((E + V) \log V)$ time Fibonacci heap $\rightarrow O(E + V \log V)$ amortized
	Bellman-Ford	$O(VE)$
	fractional Knapsack problem	$O(n \log n)$
Divide-And-Conquer	Strassen's	$O(n^{\log_2 7})$

Matrix Chain Multiplication

Dynamic programming $O(n^3)$

現今已能在 $O(N\log N)$ 時間內解決 Matrix Chain Multiplication

96 中山資工

Matrix Chain $M_{5 \times 3} M_{3 \times 7} M_{7 \times 2} M_{2 \times 9} M_{9 \times 4}$					
	1	2	3	4	5
1	0	105	72	162	184
2		0	42	96	138
3			0	126	128
4				0	72
5					0

$M(1,3) = \min\{M(1,2)+5*7*2=175, M(2,3)+5*3*2=72\}=72$
 $M(2,4) = \min\{M(2,3)+3*2*9=96, M(3,4)+3*7*9=315\}=96$
 $M(3,5) = \min\{M(3,4)+7*9*4=378, M(4,5)+7*2*4=128\}=128$

 $M(1,4) = \min\{M(2,4)+5*3*9=231, M(1,2)+M(3,4)+5*7*9=546, M(1,3)+5*2*9=162\}=162$
 $M(2,5) = \min\{M(3,5)+3*7*4=212, M(2,3)+M(4,5)+3*2*4=138, M(2,4)+3*9*4=204\}=138$

 $M(1,5) = \min\{M(2,5)+5*3*4=198, M(1,2)+M(3,5)+5*7*4=373,$
 $M(1,3)+M(4,5)+5*2*4=184, M(1,4)+5*9*4=342\}=184$
 $(M_{5 \times 3}(M_{3 \times 7} M_{7 \times 2}))(M_{2 \times 9} M_{9 \times 4})$

Optimal Binary Search Tree

Dynamic programming $O(n^3)$

Example 1:

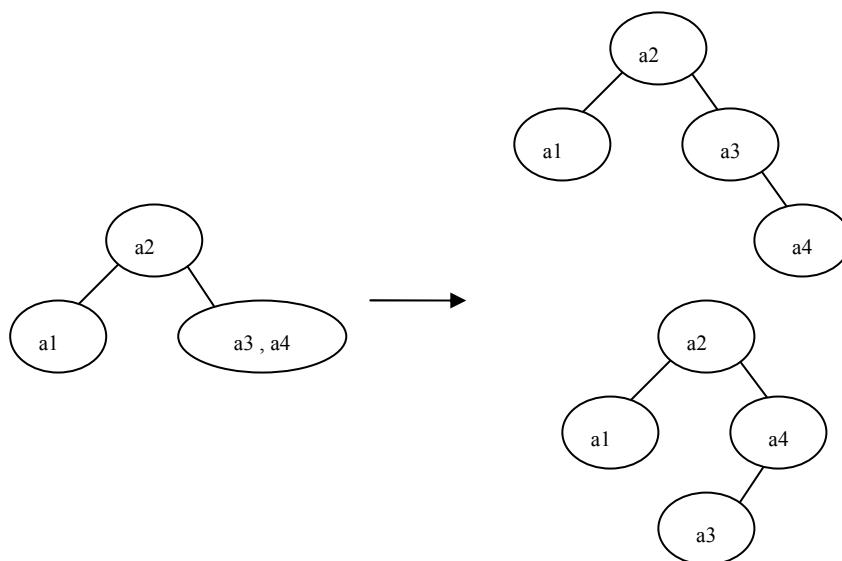
Let $n=4$, $(a_1, a_2, a_3, a_4) = (\text{do}, \text{for}, \text{void}, \text{while})$

$(p_1, p_2, p_3, p_4) = (3, 3, 1, 1)$ $(q_0, q_1, q_2, q_3, q_4) = (2, 3, 1, 1, 1)$

$w_{00}=2$ $c_{00}=0$ $r_{00}=0$	$w_{11}=3$ $c_{11}=0$ $r_{11}=0$	$w_{22}=1$ $c_{22}=0$ $r_{22}=0$	$w_{33}=1$ $c_{33}=0$ $r_{33}=0$	$w_{44}=1$ $c_{44}=0$ $r_{44}=0$	$\begin{cases} w_{01} = p_1 + q_1 + w_{00} = 8 \\ c_{01} = w_{01} + \min\{c_{00}, c_{11}\} = 8 \\ r_{01} = 1 \end{cases}$ $\begin{cases} w_{12} = p_2 + q_2 + w_{11} = 7 \\ c_{12} = w_{12} + \min\{c_{11}, c_{22}\} = 7 \\ r_{12} = 2 \end{cases}$ $\begin{cases} w_{23} = p_3 + q_3 + w_{22} = 3 \\ c_{23} = w_{23} + \min\{c_{22}, c_{33}\} = 3 \\ r_{23} = 3 \end{cases}$ $\begin{cases} w_{34} = p_4 + q_4 + w_{33} = 3 \\ c_{34} = w_{34} + \min\{c_{33}, c_{44}\} = 3 \\ r_{34} = 4 \end{cases}$
$w_{01}=8$ $c_{01}=8$ $r_{01}=1$	$w_{12}=7$ $c_{12}=7$ $r_{12}=2$	$w_{23}=3$ $c_{23}=3$ $r_{23}=3$	$w_{34}=3$ $c_{34}=3$ $r_{34}=4$		
$w_{02}=12$ $c_{02}=19$ $r_{02}=1$	$w_{13}=9$ $c_{13}=12$ $r_{13}=2$	$w_{24}=5$ $c_{24}=8$ $r_{24}=3 \text{ or } 4$			
$w_{03}=14$ $c_{03}=25$ $r_{03}=2$	$w_{14}=11$ $c_{14}=19$ $r_{14}=2$				
$w_{04}=16$ $c_{04}=32$ $r_{04}=2$					

重建OBST T_{04} 看 $r_{04}=2 \rightarrow \text{root}$ 為 2

右邊 a_3, a_4 看 $T_{24} \rightarrow \text{root}$ 為 3 or 4



Knapsack problem

0/1 Knapsack problem → Dynamic programming

0/1 problem ,opt cost ? Knapsack capacity=5kg

obj	1	2	3
weight	1 kg	2 kg	3 kg
cost	60	100	120

	0	1	2	3	4	5
0	0	0	0	0	0	0
1 {1}	0	60{1}	60{1}	60{1}	60{1}	60{1}
2 {1,2}	0	60{1}	100{2}	160{1,2}	160{1,2}	160{1,2}
3 {1,2,3}	0	60{1}	100{2}	160{1,2}	180{1,3}	220{2,3}

Fractional Knapsack problem → Greedy

Fractional Knapsack problem ,opt cost ? Knapsack capacity=15kg

obj	1	2	3	4	5	6	7
weight	4	3	2	4	2	3	4
cost	3	4	5	6	7	8	9

obj	1	2	3	4	5	6	7
cost/weight	3/4	4/3	5/2	6/4	7/2	8/3	9/4
weight	4	3	2	4	2	3	4

Item 5:2 kg Item 6:3 kg Item 3:2 kg Item 7:4 kg Item 4:4 kg

Cost 7+8+5+9+6=35

LCS Example: <ABCBDA B , BDCABA>

		A	B	C	B	D	A	B
	0	0	0	0	0	0	0	0
B	0	0	1	1	1	1	1	1
			↖	←	↖	←	←	↖
D	0	0	1	1	1	2	2	2
			↑	←	←	↖	←	←
C	0	0	1	2	2	2	2	2
			↑	↖	←	←	←	←
A	0	1	1	2	2	2	3	3
		↖	←	↑	↑	↑	↖	←
B	0	1	2	2	3	3	3	4
		↑	↖	←	↖	←	←	↖
A	0	1	2	2	3	3	4	4
		↖	↑	↑	↑	↑	↖	←

Longest common substring

Example : <baacc , abaca>

		b	a	a	c	c
	0	0	0	0	0	0
a	0	0	1	1	0	0
			↖	↖		
b	0	1	0	0	0	0
		↖				
a	0	0	2	1	0	0
			↖	↖		
c	0	0	0	0	2	1
					↖	↖
a	0	0	1	1	0	0
			↖	↖		

Longest Increasing Subsequence

LIS for sequence 5,7,1,6,2,4

Let $X = \langle 5, 7, 1, 6, 2, 4 \rangle$

$Y = \text{sort}(X) = \langle 1, 2, 4, 5, 6, 7 \rangle$

$\text{LCS}(X, Y)$

		1	2	4	5	6	7
		0	0	0	0	0	0
5		0	0	0	1	1	1
			←	←	↖	←	←
7		0	0	0	1	1	2
			←	←	↑	←	↖
1		0	1	1	1	1	2
			↖	←	←	←	↑
6		0	1	1	1	2	2
			↑	↑	↑	↖	←
2		0	1	2	2	2	2
			↑	↖	←	←	←
4		0	1	2	3	3	3
			↑	↑	↖	←	←

LIS = $\langle 1, 2, 4 \rangle$

Step 1: Make a sorted copy of the sequence A, denoted as B. $O(n \log n)$ time.

Step 2: Use Longest Common Subsequence on with A and B. $O(n^2)$ time.

Total $\Rightarrow O(n^2)$

KMP pattern matching

Time complexity : KMP $\Rightarrow O(n+m)$ Boyer-Moore algorithm 是 $O(nm)$

```

f[0] = -1;
for(j = 1; j < n; j++)
{
    i = f[j-1];
    while ((p[j] != p[i+1]) && (i >= 0))    i = f[i];
    if (p[j] == p[i+1])                    f[j] = i + 1;
    else                                    f[j] = -1;
}

```

Example 1: ababbababaa

j	0	1	2	3	4	5	6	7	8	9	10
p	a	b	a	b	b	a	b	a	b	a	a
f	-1	-1	0	1	-1	0	1	2	3	2	0

Convex Hull

Greedy $O(n \log n)$

對所有點相對於這個 s 點計算角度儲存起 $\rightarrow O(n)$

根據角度排序 $\Rightarrow O(n \log n)$

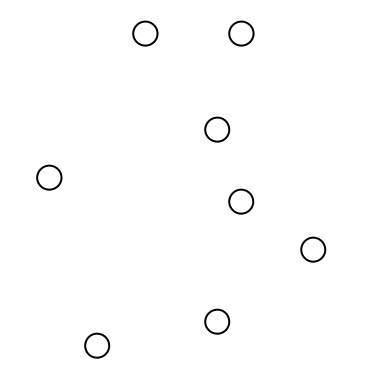
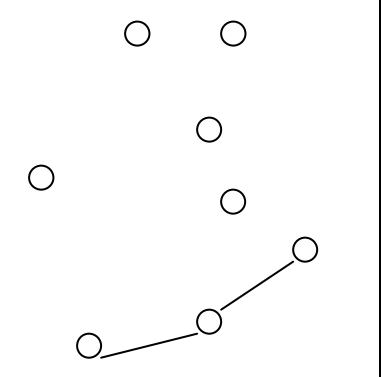
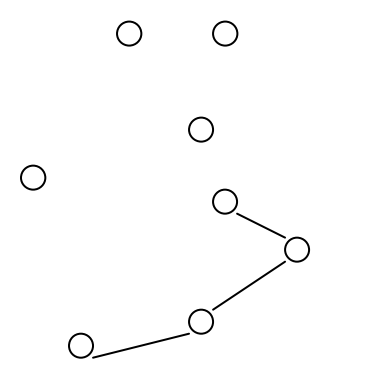
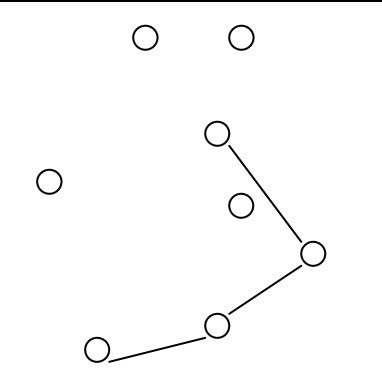
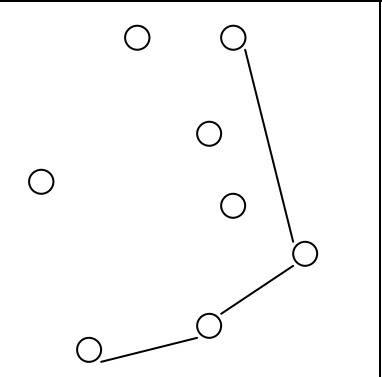
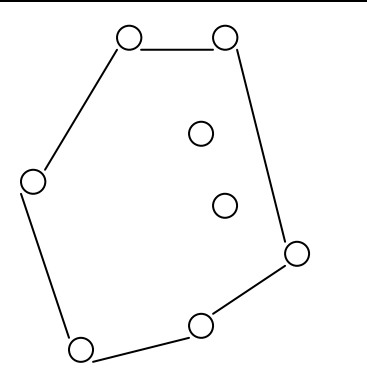
連續 3 個點來決定這角度是向外凹 or 內凹, 外凹就丟掉 $\rightarrow O(n)$

Overall cost 是 $O(n \log n)$

Graham-Scan

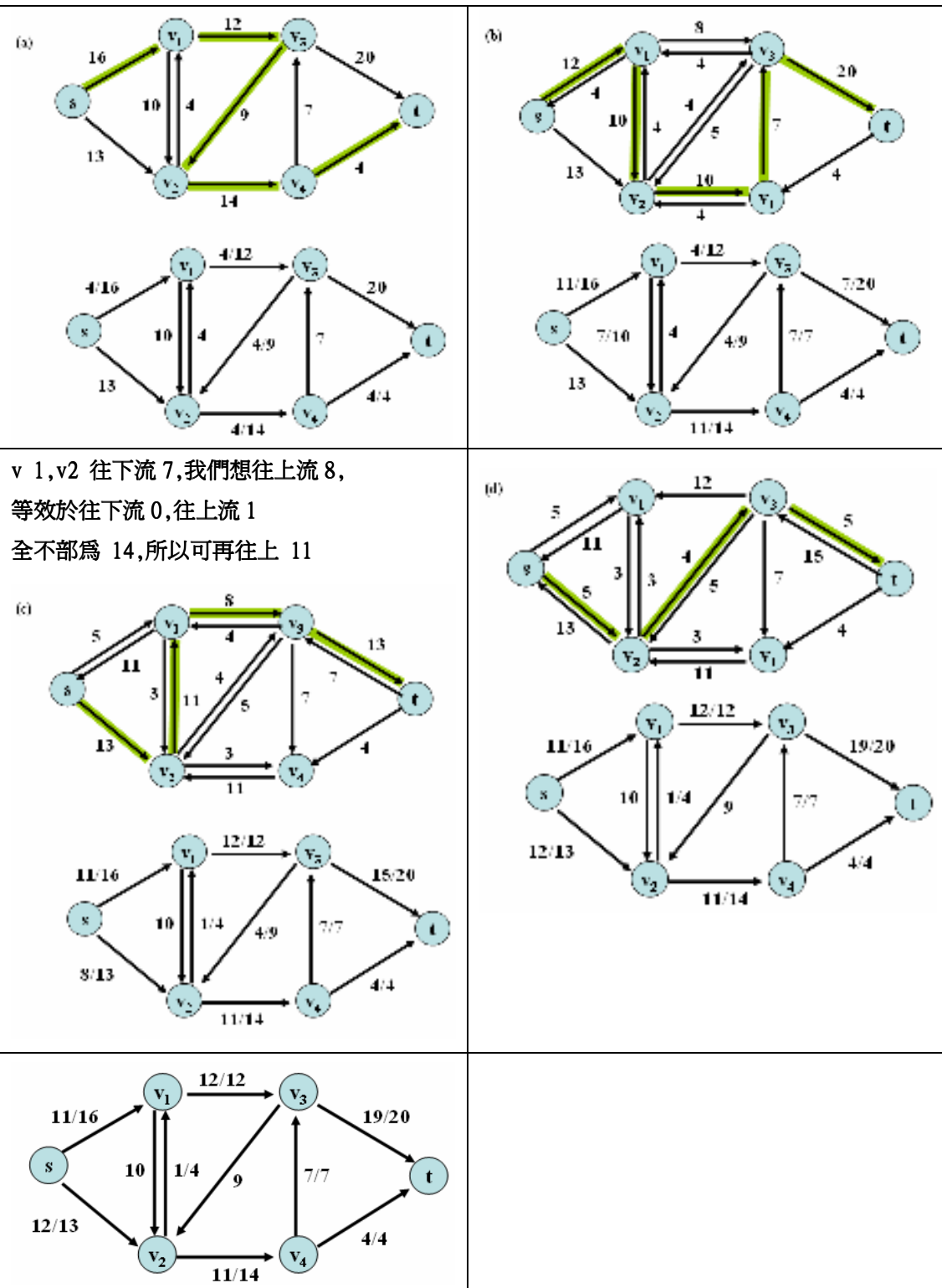
Graham-Scan(Q)

- 1 令 p_0 為 Q 中最低的點, 或最低的點中最左邊的;
- 2 令 $\langle p_1, p_2, \dots, p_m \rangle$ 為 Q 中剩下的點, 並已根據極角依逆時針方向排序好(以 p_0 為極點);
- 3 Push(p_0, S); // S 為 Stack
- 4 Push(p_1, S);
- 5 Push(p_2, S);
- 6 for $i \leftarrow 3$ to m do
- 7 while (從 next-to-top(S) 到 top(S) 再到 p_i 為右彎)
- 8 do Pop(S);
- 9 Push(p_i, S); //即為 6 點鐘方向到 12 點, 左半圓
- 10 return S ;

		
	Stack: p1, p2, p3	Stack: p1, p2, p3, p4
		
Stack: p1, p2, p3, p5	Stack: p1, p2, p3, p6	Stack: p1, p2, p3, p6, p7, p8

Flowing Network

Ford-Fulkerson



k^{th} Selection

Prune-and-Search $O(n)$

Input: A set S of n elements.

Output: The k th smallest element of S .

Step 1: 將 S 分成 $\lceil n/5 \rceil$ 組資料集合，每一組有 5 個資料，不足 5 個資料以 ∞ 補足。

Step 2: 排序每一組資料

Step 3: 找出所有組中位數的中位數

Step 4: 將 S 區分成三部份 S_1, S_2 and S_3 , which contain the elements less than, equal to, and greater than p , respectively.

Step 5: 利用三個判斷條件以找出第 k 小的元素:

If $|S_1| \geq k$, then 第 k 小的元素存在於 S_1 , prune away S_2 and S_3 。

else, if $|S_1| + |S_2| \geq k$, then p 即為第 k 小的元素。

else, 第 k 小的元素存在於 S_3 中, prune away S_1 and S_2 。令 $k' = (k - |S_1| - |S_2|)$, 在 S_3 中找第 k' 個元素即為解答

Time complexity: $T(n) = O(n)$

step 1: $O(n)$ //掃一輪即可得知

step 2: $O(n)$ //有 $\lceil n/5 \rceil$ 組資料，每組資料排序需固定常數時間 $O(1)$

step 3: $T(n/5)$ //採遞迴方式找尋，共有 $\lceil n/5 \rceil$ 組

step 4: $O(n)$ //掃一輪即可得知

step 5: $T(3n/4)$ //每次 Prune 掉至少 $n/4$ 資料量後，尚有 $3n/4$ 左右的剩餘資料需遞迴執行
遞迴方程式為 $T(n) = T(3n/4) + T(n/5) + O(n)$ ，採遞迴樹法分析，可得知此演算法的時間複雜度為 $O(n)$

```

Kruskal()
{
    T =  $\emptyset$ ;
    for each  $v \in V$ 
        MakeSet(v);                                //O(V)
    sort E by edge weight w                          //O(ElogV)
    for each  $(u,v) \in E$  (in sorted order)
        if FindSet(u)  $\neq$  FindSet(v)                //O(E)
            T = T  $\cup$   $\{(u,v)\}$ ;
            Union(FindSet(u), FindSet(v));          //O(logV)
}

```

```

MST-Prim(G, w, r)
{
    Q = V[G];                                        //O(V)
    for each  $u \in Q$ 
        key[u] =  $\infty$ ;
    key[r] = 0;
    p[r] = NULL;      //p[]: parent of this node
    while (Q not empty)
        u = ExtractMin(Q);                          //O(VlogV)
        for each  $v \in \text{Adj}[u]$ 
            if ( $v \in Q$  and  $w(u,v) < \text{key}[v]$ )
                p[v] = u;
                key[v] = w(u,v);                    //O(ElogV)
}

```

```

DFS(G)
{
    for each vertex  $u \in G \rightarrow V$ 
    {
        color [u] = WHITE;
    }
    time = 0;
    for each vertex  $u \in V [G]$ 
    {
        if (color [u]== WHITE)
            DFS_Visit(u);
    }
}

```

```

DFS_Visit(u)
{
    color [u] = GREY;
    d[u] = ++time;
    for each  $v \in \text{Adj}[u]$ 
    {
        if (color [u]== WHITE)
            DFS_Visit(v);
    }
    color [u] = BLACK;
    f[u] = ++time;
}

```

BellmanFord()

```

for each  $v \in V$            $d[v] = \infty;$           //O(V)
 $d[s] = 0;$ 
for  $i=1$  to  $|V|-1$ 
    for each edge  $(u,v) \in E$ 
        if  $(d[v] > d[u]+w(u,v))$  then  $d[v]=d[u]+ (u,v)$     //O(VE)
for each edge  $(u,v) \in E$                                 //O(E)
    if  $(d[v] > d[u] + w(u,v))$ 
        return "FALSE";

```

Dijkstra(G)

```

for each  $v \in V$        $d[v] = \infty;$ 
 $d[s] = 0;$ 
 $S = \emptyset;$   $Q = V;$ 
while  $(Q \neq \emptyset)$ 
     $u = \text{ExtractMin}(Q);$ 
     $S = S \cup \{u\};$ 
    for each  $v \in \text{Adj}[u]$ 
        if  $(d[v] > d[u]+w(u,v))$  then  $d[v] = d[u]+w(u,v);$ 
linear array  $\rightarrow O(V^2)$ 
binary heap for  $Q \rightarrow O(E \log V)$ 
Fibonacci heaps for  $Q \rightarrow O(V \log V + E)$ 

```

Floyd-Warshall(G,W)

```

{
     $n \leftarrow |V|;$   $D^{(0)} \leftarrow W;$ 
    for  $k = 1$  to  $n$  do
        for  $i = 1$  to  $n$  do
            for  $j = 1$  to  $n$  do
                if  $D^{(k-1)}[i,j] > D^{(k-1)}[i,k] + D^{(k-1)}[k,j]$  then
                     $D^{(k)}[i,j] \leftarrow D^{(k-1)}[i,k] + D^{(k-1)}[k,j];$   $\pi[i,j] \leftarrow \pi[k,j];$ 
                else  $D^{(k)}[i,j] \leftarrow D^{(k-1)}[i,j]$ 
    return  $D^{(n)}$ 
}

```

$O(n^3)$

```

LCS-Length(X,Y)
{
    m ← length[X];
    n ← length[Y];
    for i= 1 to m do c[i,0] ← 0;
    for j= 1 to n do c[0,j] ← 0;
        for i= 1 to m do
            for j= 1 to n do
                {
                    If xi = yj then
                        c[i,j] = c[i-1,j-1]+1;  b[i,j] = "↖";
                    else if c[i-1,j] ≥ c[i,j-1]
                        then { c[i,j] = c[i-1,j]; b[i,j] = "↑"; }
                    else { c[i,j] = c[i,j-1]; b[i,j] = "←"; }
                }
    return b, c
}

```

```

Print-LCS(b, X, i, j)
{
    If i=0 or j=0 then return;
    If b[i,j] = "↖ ";
        then
            {
                Print-LCS(b, X, i-1, j-1);
                print xi;
            }
    else if b[i,j] = "↑"
        then Print-LCS(b, X, i-1, j);
    else Print-LCS(b, X, i, j-1);
}

```

Topological Sort fail when graph contains cycle

Topological-Sort()

```
{  
    Run DFS  
    When a vertex is finished, output it  
    Vertices are output in reverse topological order  
}
```

adjacency matrix: $O(V^2)$, adjacency lists : $O(V+E)$

SCC

```
{  
    1. 呼叫 DFS( $G$ )對所有點  $u$ ，計算出  $f[u]$ ，即 finishing time。  
    2. 計算出  $GT$ ，即點集合與  $G$  相同，而邊連接方向相反的圖。  
    3. 呼叫 DFS( $GT$ )，但在 DFS 主迴圈中，選擇點的順序是先挑取  $f[u]$ 值較大的點  $u$ 。  
    4. 在 DFS( $GT$ )的 Depth-first forest 中，每一個樹均是一個 Strongly connected  
        component。  
}
```

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Determine the largest number and smallest number in n number, which operation are $(3n/2) - 2$

Algorithm LARGESMALL

Step 1: 把 n 個 element 分成左右 2 半, $(a_1, a_{\frac{n}{2}+1}), (a_2, a_{\frac{n}{2}+2}), \dots, (a_{\frac{n}{2}}, a_n)$ 比較

小的放左邊, 大的放右邊

Step 2: 左半找最小 $for(i = 2, smallest = key[1], i \leq \frac{n}{2}, i++)$

If($key[i] < smallest$) $smallest = key[i]$

Step 2: 右半找最大

Time complexity: $(3n/2) - 2$,

Step 1: $n/2$ comparisons Step 2: $(n/2) - 1$ comparisons Step 3: $(n/2) - 1$ comparisons.

95 清大資工

We have a directed graph $G=(V,E)$, represented using adjacent list. the edge costs are integers in range $\{1,2,3,4,5\}$, assume that G has no self-loops or multiple edge. Design a algorithm that solve the single-source shortest path problem in $O(|V|+|E|)$

DAG-Shortest-Path(G, w, s)

```
{
  Topologically sort  $V[G]$ 
  for each  $v \in V$ 
     $d[v] = \infty$ ;
   $d[s] = 0$ ;
  for each  $u$  taken in topological order
    do for each  $v \in adj[u]$ 
      if ( $d[v] > d[u] + w(u,v)$ ) then  $d[v] = d[u] + w(u,v)$ ;
}
```

以上演算法僅需 $O(|V|+|E|)$ 的時間

Let a graph be denoted as $G = (V, E)$. Discuss how to test if the graph is connected in $O(|V| + |E|)$

DFS connected component algorithm

```

DFS(G)
for each vertex  $u \in V[G]$  { do color[u] ← WHITE ;  $\pi[u] \leftarrow \text{NIL}$  }
time=0
Tree_count=0;
for each vertex  $u \in V[G]$ 
    if (color[u] == WHITE) { Tree_count++; DFS-Visit(u); }
If (Tree_count==1) return true
Else return False

DFS-VISIT(u)
color[u]=GRAY //u has just been discovered
d[u]=++time
cc[u]=Tree_count; //cc[u]為 node u 所屬的 connected component number
for each  $v \in \text{Adj}[u]$ 
{
    if color[v]=WHITE {  $\pi[v] \leftarrow u$ ; DFS-Visit(v); }
}
color[u] ← black
f[u]=++time

```

connected component algorithm time complexity:

adjacency matrix : $O(n^2)$ adjacency lists : $O(n+e)$

Show that the second smallest of n elements can be found with $n + \lceil \log n \rceil - 2$ comparisons in the worst case

n 個 element, 比較 $n-1$ 次就能找到最小的 element

第 2 小的 element, 一定是剛才與最小的 element 所比的輸家其中一位

而最小的 element 只會比 $\lceil \log n \rceil$ 次(樹高), 因為 n 個 element 樹高不會超過 $\lceil \log n \rceil$

則 $\lceil \log n \rceil$ 個 element 再找出最小的需比 $\lceil \log n \rceil - 1$ 次

所以總共為 $n - 1 + \lceil \log n \rceil - 1 = n + \lceil \log n \rceil - 2$

describe how to use depth first search to determine whether input direct graph $G=(V,E)$ is acyclic

a directed graph G is acyclic iff a DFS of G yields no back edges

```

DFS-Acyclic( $G$ )
{
  for each vertex  $u \in V[G]$  { do color[ $u$ ]  $\leftarrow$  WHITE ;  $\pi[u] \leftarrow$  NIL }
  time=0
  for each vertex  $u \in V[G]$ 
  {
    if (color[ $u$ ] == WHITE) DFS-Visit( $u$ );
  }
  Return false;
}

```

```

DFS-VISIT( $u$ )
color[ $u$ ] = GRAY //  $u$  has just been discovered
d[ $u$ ] = ++time
for each  $v \in \text{Adj}[u]$ 
{
  if color[ $v$ ] = WHITE {  $\pi[v] \leftarrow u$  ; DFS-Visit( $v$ ) ; }
  elseif color[ $v$ ] = Gray Halt and Return True
}
color[ $u$ ]  $\leftarrow$  black
f[ $u$ ] = ++time

```

Design an algorithm to test whether a given graph is bipartite or not

boolean visit: false \rightarrow 未尋訪 true \rightarrow 尋訪過

int mark: 0 \rightarrow 沒集合, 1 \rightarrow 位於 set1, 2 \rightarrow 位於 set2

bipartite($v, type$)

visit[v] = true

foreach $u \in \text{adj}[v]$

if (mark[u] == 0) mark[u] = 3 - type

else if (mark[u] == type) return false

if (! visit[u])

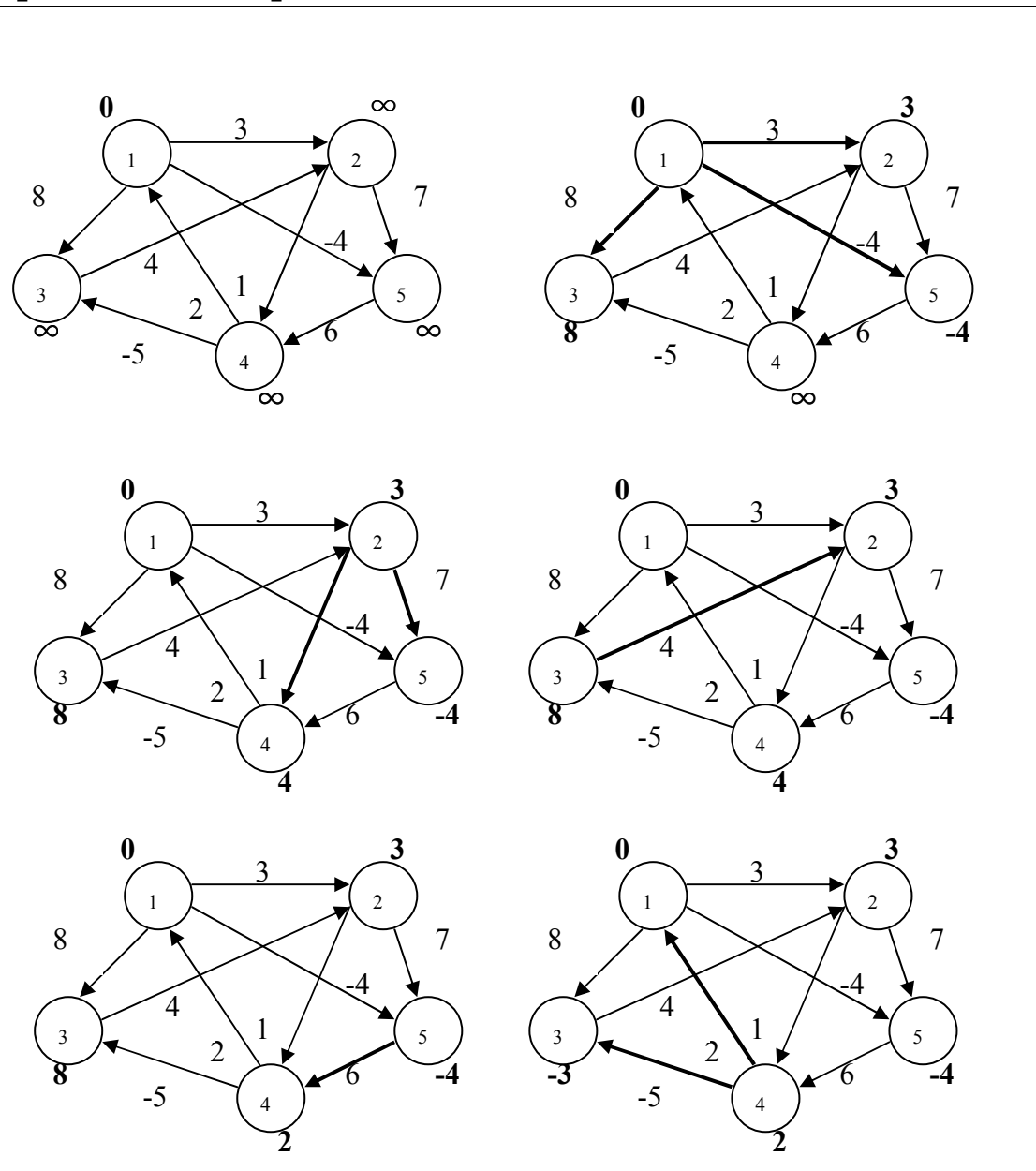
if (! bipartite ($u, 3 - type$) return false

return true

Bellman Ford algorithm example

0	3	8	∞	-4
∞	0	∞	1	7
∞	4	0	∞	∞
2	∞	-5	0	∞
∞	∞	∞	6	0

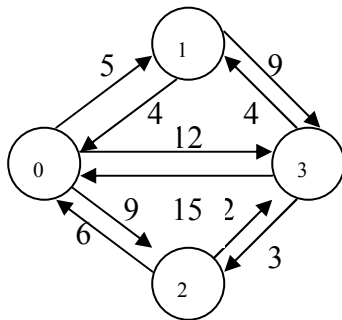
Bellman Ford find a shortest path from vertex 1 to vertex 3.



- (1) 從 node 1 開始
- (2) node 2, node 3, node 5
- (3) node 4

Floyd-Warshall example 96 彰師數位

Find the all pair shortest path of following graph?



$$D = \begin{bmatrix} 0 & 5 & 9 & 12 \\ 4 & 0 & \infty & 9 \\ 6 & \infty & 0 & 2 \\ 15 & 4 & 3 & 0 \end{bmatrix}, D^0 = \begin{bmatrix} 0 & 5 & 9 & 12 \\ 4 & 0 & 13 & 9 \\ 6 & 11 & 0 & 2 \\ 15 & 4 & 3 & 0 \end{bmatrix}, D^1 = \begin{bmatrix} 0 & 5 & 9 & 12 \\ 4 & 0 & 13 & 9 \\ 6 & 11 & 0 & 2 \\ 8 & 4 & 3 & 0 \end{bmatrix}$$

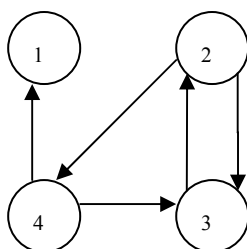
$$D^2 = \begin{bmatrix} 0 & 5 & 9 & 11 \\ 4 & 0 & 13 & 9 \\ 6 & 11 & 0 & 2 \\ 8 & 4 & 3 & 0 \end{bmatrix}, D^3 = \begin{bmatrix} 0 & 5 & 9 & 11 \\ 4 & 0 & 12 & 9 \\ 6 & 6 & 0 & 2 \\ 8 & 4 & 3 & 0 \end{bmatrix}$$

$$D^0 \Rightarrow \begin{cases} (1,2) = \min\{(1,2), (1,0) + (0,2)\} = 13 \\ (2,1) = \min\{(2,1), (2,0) + (0,1)\} = 11 \end{cases}, D^1 \Rightarrow (3,0) = \min\{(3,0), (3,1) + (1,0)\} = 8$$

$$D^2 \Rightarrow (0,3) = \min\{(0,3), (0,2) + (2,3)\} = 11, D^3 \Rightarrow \begin{cases} (1,2) = \min\{(1,2), (1,3) + (3,2)\} = 12 \\ (2,1) = \min\{(2,1), (2,3) + (3,1)\} = 6 \end{cases}$$

如果點為 0~3 則 $D^0 \sim D^3$, 如果點為 1~4 則 $D^1 \sim D^4$

Find transitive closure
use Floyd-Warshall?



$$A_0 = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 \\ 0 & 1 & 1 & 0 \\ 1 & 0 & 1 & 1 \end{bmatrix}, A_1 = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 \\ 0 & 1 & 1 & 0 \\ 1 & 0 & 1 & 1 \end{bmatrix}, A_2 = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 \\ 0 & 1 & 1 & 1 \\ 1 & 0 & 1 & 1 \end{bmatrix}$$

$$A_3 = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 1 & 1 \\ 0 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 \end{bmatrix}, A_4 = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 \end{bmatrix}$$

$$\begin{aligned}
(1) T(n) &= 4T\left(\frac{n}{4}\right) + n \log n & (2) T(n) &= T(n-1) + \frac{1}{n} \\
(3) T(n) &= T\left(\frac{n}{2}\right) + 1 & (4) T(n) &= T(n-1) + \lg n \\
(5) T(n) &= 2T(\sqrt{n}) + \log n & (6) T(n) &= 4T\left(\frac{n}{4}\right) + \frac{n}{\log n} \\
(7) T(n) &= 4T\left(\frac{n}{4}\right) + \frac{n}{\log^2 n} & (8) T(n) &= 4T\left(\frac{n}{4}\right) + \frac{n}{\log^3 n} \\
(9) T(n) &= \sqrt{n}T(\sqrt{n}) + n & (10) T(n) &= \sqrt{n}T(\sqrt{n}) + \sqrt{n}
\end{aligned}$$

$$\begin{aligned}
(1) O(n \log^2 n) & \quad (2) O(n \log n) \quad (3) O(\log n) \\
(4) T(n) &= T(n-1) + \lg n = T(n-2) + \lg(n-1) + \lg n \\
&= T(1) + \dots + \lg(n-1) + \lg n \leq \lg n + \lg n + \dots + \lg n = O(n \lg n) \\
(5) \text{let } n &= 2^{2^k}, F(k) = 2F(k-1) + 2^k = 2^2 F(k-1) + (2^k + 2^k) \\
&= 2^k F(1) + k(2^k) = \lg n + (\lg \lg n) \log n = O(\lg n \lg \lg n) \\
(6) \text{let } n &= 4^k, F(k) = 4F(k-1) + \frac{4^k}{k} = 4^2 F(k-2) + \frac{4^k}{k-1} + \frac{4^k}{k} \\
&= 4^k F(0) + 4^k \left(1 + \frac{1}{2} + \dots + \frac{1}{k}\right) = n + n \log \log n = O(n \log \log n) \\
(7) \text{let } n &= 4^k, F(k) = 4F(k-1) + \frac{4^k}{k^2} = 4^2 F(k-2) + \frac{4^k}{(k-1)^2} + \frac{4^k}{k^2} \\
&= 4^k F(0) + 4^k \left(1^2 + \frac{1}{2^2} + \dots + \frac{1}{k^2}\right) = O(n) \\
(8) \text{let } n &= 4^k, F(k) = 4F(k-1) + \frac{4^k}{k^3} = 4^2 F(k-2) + \frac{4^k}{(k-1)^3} + \frac{4^k}{k^3} \\
&= 4^k F(0) + 4^k \left(1^3 + \frac{1}{2^3} + \dots + \frac{1}{k^3}\right) = O(n) \\
(9) T(n) &= \sqrt{n}T(\sqrt{n}) + n \\
T(n) &= n^{\frac{1}{2}}T(n^{\frac{1}{2}}) + n = n^{\frac{1}{2}}(n^{\frac{1}{4}}T(n^{\frac{1}{4}}) + n^{\frac{1}{2}}) + n = n^{\frac{1}{2} + \frac{1}{4}}T(n^{\frac{1}{4}}) + n + n \\
&= \dots = n^{1 - \frac{1}{2^k}}T(n^{\frac{1}{2^k}}) + kn \Rightarrow k = \theta(\lg \lg n) \Rightarrow T(n) = \theta(n \lg \lg n) \\
(10) T(n) &= \sqrt{n}T(\sqrt{n}) + \sqrt{n} \\
T(n) &= n^{\frac{1}{2}}T(n^{\frac{1}{2}}) + \sqrt{n} = n^{\frac{1}{2}}(n^{\frac{1}{4}}T(n^{\frac{1}{4}}) + n^{\frac{1}{2}}) + \sqrt{n} = n^{\frac{1}{2} + \frac{1}{4}}T(n^{\frac{1}{4}}) + \sqrt{n} + \sqrt{n} \\
&= \dots = n^{1 - \frac{1}{2^k}}T(n^{\frac{1}{2^k}}) + k\sqrt{n} \Rightarrow k = \theta(\lg \lg n) \Rightarrow T(n) = \theta(\sqrt{n} \lg \lg n)
\end{aligned}$$

$O(g(n))$
$\{f(n): \text{there exist positive constants } c, n_0 \text{ such that } 0 \leq f(n) \leq cg(n) \text{ for all } n \geq n_0\}$
$\Omega(g(n))$
$\{f(n): \text{there exist positive constants } c, n_0 \text{ such that } 0 \leq cg(n) \leq f(n) \text{ for all } n \geq n_0\}$
$\theta(g(n))$
$\{f(n): \text{there exist positive constants } c_1, c_2, n_0 \text{ such that } c_1g(n) \leq f(n) \leq c_2g(n) \text{ for all } n \geq n_0\}$
$o(g(n))$
$\{f(n): \text{for any positive constant } c > 0, \text{ there exists a constant } n_0 > 0 \text{ such that } 0 < f(n) < cg(n) \text{ for all } n \geq n_0\}.$
$\omega(g(n))$
$\{f(n): \text{for any positive constant } c > 0, \text{ there exists a constant } n_0 > 0 \text{ such that } 0 < cg(n) < f(n) \text{ for all } n \geq n_0\}.$

Prove

(1) $f(n) = 3n + 8 \Rightarrow f(n) = O(n)$

(2) $f(n) = 2n^2 + 4n + 3 \Rightarrow f(n) = O(n^2)$

(3) $f(n) = 3n + 2 \Rightarrow f(n) = O(1)?$

(4) $f(n) = 2n^2 + 3n - 9 \Rightarrow f(n) = \Omega(n^2)$

(5) $f(n) = 3n^2 + 6n - 12 \Rightarrow f(n) = \theta(n^2)$

(1) 我們可以找到 $c = 4, n_0 = 8$ 使得 $3n + 8 \leq cn, \forall n \geq n_0$

(2) 我們可以找到 $c = 3, n_0 = 5$ 使得 $2n^2 + 4n + 3 \leq cn^2, \forall n \geq n_0$

$$ps: 2n^2 + 4n + 3 \leq 3n^2 \Rightarrow n^2 - 4n - 3 \geq 0 \Rightarrow n_0 = 5$$

(3) $3n + 2 \leq c \cdot 1$, 我們找不到 c 是常數, $\forall n \geq n_0 \Rightarrow f(n) = O(1)$ wrong

(4) 我們可以找到 $c = 2, n_0 = 3$ 使得 $2n^2 + 3n - 9 \geq cn^2, \forall n \geq n_0$

(5) 我們可以找到 $c_1 = 3, c_2 = 4, n_0 = 2$ 使得 $c_1n^2 \leq 3n^2 + 6n - 12 \leq c_2n^2, \forall n \geq n_0$

Prove $\log(n!) = \theta(n \log n)$

$$(O) \log(n!) = \log n + \log(n-1) + \dots + 2 + 1 < \log n + \log n + \dots + \log n + \log n = O(n \log n)$$

$$(\Omega) \log(n!) = \log n + \log(n-1) + \dots \log \frac{n+1}{2} + \log \frac{n}{2} + \dots + 2 + 1$$

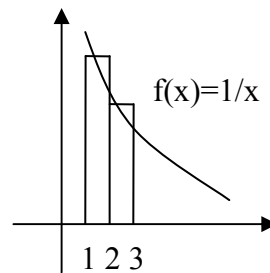
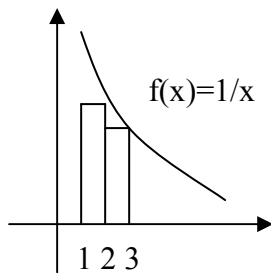
$$\geq \log n + \log(n-1) + \dots \log \frac{n+1}{2} \geq \log \frac{n}{2} + \log \frac{n}{2} + \dots + \log \frac{n}{2} \geq \frac{n}{2} \log \frac{n}{2} = \Omega(n \log n)$$

$$\therefore \log(n!) = \theta(n \log n)$$

$$T(n) = \frac{1}{1} + \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{n} \quad \text{prove } T(n) = \theta(\log n)$$

$$\text{block area } A_1 = \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{n} = T(n) - 1$$

$$A_1 < \int_1^n \frac{1}{x} dx = \ln x - \ln 1 = \ln x \Rightarrow T(n) - 1 < \ln x \equiv T(n) < \ln x + 1 = O(\ln n)$$



$$\text{block area } A_2 = 1 + \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{n} = T(n)$$

$$A_2 > \int_1^n \frac{1}{x} dx = \ln x - \ln 1 = \ln x \Rightarrow T(n) > \ln x = \Omega(\ln n)$$

$$\therefore T(n) = \Omega(\ln n), T(n) = O(\ln n) \Rightarrow T(n) = \theta(\ln n)$$

(4)rank time complexity

$$(\lg n)! < \frac{n^2}{\log n} < n^2 = 4^{\lg n} < \lg(n!) < (\lg n)^{\lg n} = n^{\lg n \lg n} < n^{\log n} < 2^n < n! < n^{0.0001n}$$

(5)Master Theorem

$$T(n) = aT\left(\frac{n}{b}\right) + f(n)$$

(a) if $f(n) = O(n^{\log_b a - \varepsilon})$, for some $\varepsilon > 0 \Rightarrow T(n) = \theta(n^{\log_b a})$

(b) if $f(n) = n^{\log_b a} \Rightarrow T(n) = \theta(n^{\log_b a} \log n)$

(c) if $f(n) = \Omega(n^{\log_b a + \varepsilon})$, for some $\varepsilon > 0$, $af\left(\frac{n}{b}\right) \leq cf(n)$, $c < 1$

$$\Rightarrow T(n) = \theta(f(n))$$

Master theorem solve

(a) $T(n) = 7T\left(\frac{n}{2}\right) + n^2$ (b) $T(n) = 3T\left(\frac{n}{2}\right) + n^2$ (c) $T(n) = 4T\left(\frac{n}{2}\right) + n^2$

by master theorem

(a) $a = 7, b = 2 \Rightarrow n^{\log_b a} = n^{\lg 7}, f(n) = n^2$

pick $f(n) = n^2 = O(n^{\lg 7 - \varepsilon}) \Rightarrow T(n) = \theta(n^{\lg 7})$

$a = 3, b = 2 \Rightarrow n^{\log_b a} = n^{\lg 3}, f(n) = n^2$

(b) pick $\varepsilon = 2 - \lg 3 \Rightarrow f(n) = n^2 = \Omega(n^{\lg 3 + \varepsilon})$

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

by master theorem

(c) $a = 4, b = 2 \Rightarrow n^{\log_b a} = n^2, f(n) = n^2$

and $f(n) = \theta(n^2) \Rightarrow T(n) = \theta(n^2 \log n)$

exercises Chapter 4.1

$$(a)T(n) = T(\sqrt{n}) + 1 \quad (b)T(n) = 5T\left(\frac{n}{5}\right) + \frac{n}{\lg n} \quad (c)T(n) = 2T\left(\frac{n}{2}\right) + \frac{n}{\lg n}$$

$$(d)T(n) = T(n-1) + \frac{1}{n} \quad (e)T(n) = T(n-1) + \lg n \quad (f)T(n) = \sqrt{n}T(\sqrt{n}) + n$$

$$(a)T(n) = T(\sqrt{n}) + 1, \text{ let } m = \lg n \Rightarrow S(m) = T(2^m)$$

$$T(2^m) = T(2^{m/2}) + 1 \Rightarrow S(m) = S(m/2) + 1 = \theta(\lg m)$$

$$\Rightarrow T(n) = \theta(\lg \lg n)$$

$$(b)\text{let } n = 5^k \Rightarrow T(k) = 5T(k-1) + \frac{5^k}{k} = 5^2 T(k-2) + \frac{5^k}{k-1} + \frac{5^k}{k}$$

$$= \dots = 5^k \left(1 + \frac{1}{2} + \dots + \frac{1}{k}\right) = n \left(1 + \frac{1}{2} + \dots + \frac{1}{\lg n}\right) = O(n \log \log n)$$

$$(c)\text{let } n = 2^k \Rightarrow T(k) = 2T(k-1) + \frac{2^k}{k} = 2^2 T(k-2) + \frac{2^k}{k-1} + 2 \frac{2^k}{k}$$

$$= \dots = 2^k \left(1 + \frac{1}{2} + \dots + \frac{1}{k}\right) = n \left(1 + \frac{1}{2} + \dots + \frac{1}{\lg n}\right) = O(n \log \log n)$$

$$(d)T(n) = T(n-1) + \frac{1}{n} = \frac{1}{1} + \frac{1}{2} + \dots + \frac{1}{n} = O(\lg n)$$

$$(e)T(n) = T(n-1) + \lg n = T(n-2) + \lg(n-1) + \lg n = \dots$$

$$= \lg 2 + \lg 3 + \dots + \lg n \leq \lg n + \lg n + \dots + \lg n = O(n \lg n)$$

$$(f)T(n) = \sqrt{n}T(\sqrt{n}) + n$$

$$T(n) = n^{\frac{1}{2}} T(n^{\frac{1}{2}}) + n = n^{\frac{1}{2}} (n^{\frac{1}{4}} T(n^{\frac{1}{4}}) + n^{\frac{1}{2}}) + n = n^{\frac{1}{2} + \frac{1}{4}} T(n^{\frac{1}{4}}) + n + n$$

$$= \dots = n^{1 - \frac{1}{2^k}} T(n^{\frac{1}{2^k}}) + kn$$

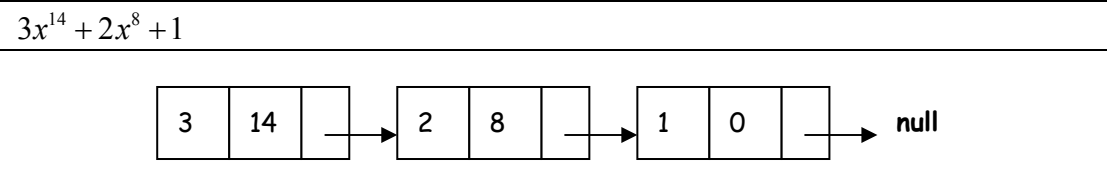
$$\therefore k = \theta(\lg \lg n) \Rightarrow T(n) = \theta(n \lg \lg n)$$

$$(1) \quad T(n) = 4T\left(\frac{n}{2}\right) + \frac{n^2}{\lg n} = \theta(n^2 \lg \lg n)$$

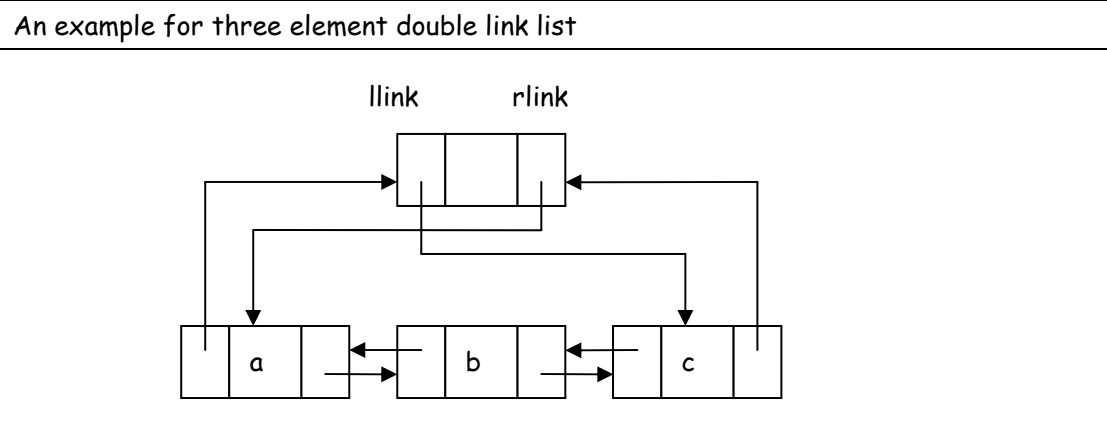
$$(2) \quad T(n) = 4T\left(\frac{n}{2}\right) + \frac{n^2}{\lg^2 n} = \theta(n^2)$$

$$(3) \quad T(n) = 4T\left(\frac{n}{2}\right) + \frac{n^2}{\lg^3 n} = \theta(n^2)$$

(6) link list for polynomial



(7) double link list



Insert node t after node x	Delete node t
<p>New x</p> <p>$t \rightarrow \text{llink} = (x \rightarrow \text{rlink}) \rightarrow \text{llink}$</p> <p>$t \rightarrow \text{rlink} = x \rightarrow \text{rlink}$</p> <p>$(x \rightarrow \text{rlink}) \rightarrow \text{llink} = t$</p> <p>$x \rightarrow \text{rlink} = t$</p> <p>Single link list insert 只需改 2 個 pointer double link list insert 需改 4 個 pointer</p>	<p>$(t \rightarrow \text{rlink}) \rightarrow \text{llink} = t \rightarrow \text{llink}$</p> <p>$(t \rightarrow \text{llink}) \rightarrow \text{rlink} = t \rightarrow \text{rlink}$</p> <p>Free t</p>

Chapter 3 Stack

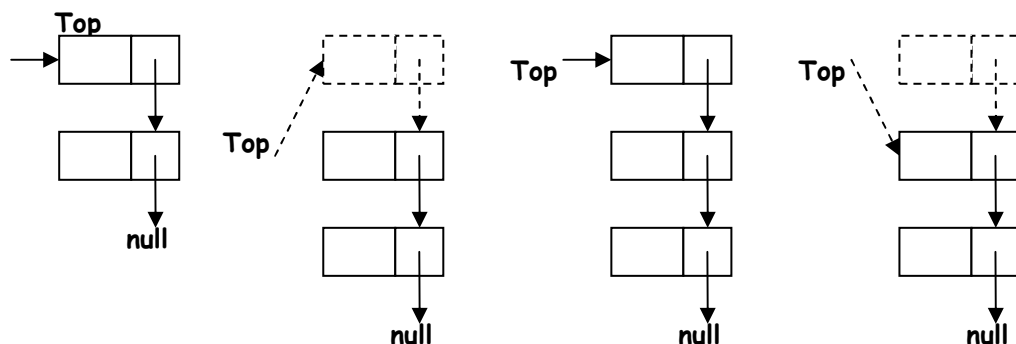
(1) Stack operation

(a) Array Array[1~n]

Boolean IsFull(S) if (top >= MAX_STACK_SIZE-1) return true; else return false;	Boolean IsEmpty(S) if (top < 0) return true; else return false;
void push (S, element item) O(1) if (top == n) stack_full(); else stack[++top]=item;	element pop (S) O(1) if (top == 0) return stack_empty(); return stack[top--];

(b) Link list

Boolean IsFull(S) → no Need	Boolean IsEmpty(S) if (top == null) return true; else return false;
void push (S, element item) New t ; t -> data=item ; t -> link=top ; top=t ;	element pop (S) if (IsEmpty(S)) return "S is empty" else t= top; item=top-> data; top=top -> link ; free (t) ;



(2)Queue operation

Insert rear

Delete front

(a)

Method 1: Array Array[1~n]

缺點:front!=0 並不代表 Queue 是滿的

解決: 把 front+1 到 rear 左移 front 格 ,rear=rear-front ,front=0

Boolean IsFull if (rear == n) return true; else return false;	Boolean IsEmpty if (front == rear) return true; else return false;
void addq (Q, element item) O(n) if (rear == n) queue_full(); else queue[++rear] = item;	element deleteq (Q) O(1) if (front == rear) return queue_empty(); else return queue[++front];

Method 2:circular array 改善 linear array 碰到 array 底需全部左移

只利用 n-1 個空間,因如果用 front 放 data

當 front == rear 無法判斷 queue 為空或為滿

queue 為空或 queue 為滿條件式皆為 rear == front

void addq (Q, element item) O(1) rear=(rear+1)%n if (rear == front) queue_full(); else queue[rear] = item;	element deleteq (Q) O(1) if (front == rear) return queue_empty(); else front=(front +1)%n return queue[front];
--	--

Method 3:circular array

可充份利用 n 個空間

若 tag=true 表示 queue 是滿

因 add queue 或 delete queue 都多了判斷 tag,所以比 Method 2 耗時

void addq (Q, element item) O(1) if (rear == front&& tag==true) queue_full(); else rear=(rear+1)%n if(rear==front) tag=true queue[rear] = item;	element deleteq (Q) O(1) if (front == rear&& tag==false) queue_empty(); else front=(front +1)%n if(rear==front) tag=true return queue[front];
--	---

(b) Link list

Method 1 :single link list

Boolean IsFull(S) →no Need	Boolean IsEmpty(S) if (top==null) return true; else return false;
void addq (Q, element item) New t ; t -> data=item ; t -> link=null ; if(rear==null) then front =t; else rear -> link=t ; rear =t;	element deleteq (Q) if (front==null) return "Q is empty" else t= front; item= front -> data; front = front -> link ; free (t) ;

Method 2 :circular link list

void addq (Q, element item) New t ; t -> data=item ; t -> link=null ; if(rear==null) then t->link=t; else t -> link= rear -> link ; rear -> link =t; rear=t ;	element deleteq (Q) if (front==null) return "Q is empty" else t=rear->link; item= (rear->link)->data; rear->link = (rear->link) -> link ; free (t) free (t) ;
--	--

Postfix evaluation:由左而右掃描 **stack** 先拉出來的 operand 擺後面

Prefix evaluation:由右而左掃描 **stack** 先拉出來的 operand 擺前面

(1)Prefix evaluation of +- / 6 2 3 * 4 2 (2)postfix of 6 2 / 3 - 4 2 * +							
		6					
		2		3			
4		3		3		0	
2	*	8	/	8	-	8	+
							8
				2			
6		3		4		8	
2	/	3	-	0	*	0	+
							8

判斷合法 stack permutation 方法

前序為 sort abcdef... 中序為答案選項, 畫樹, 檢查前序是否與樹相同

Which of following are not stack permutation ? (a)abdc (b)dcab (c)cbda (d)dacb (e)cadb
(b)無法造出前序為 abcd,中序為 dcab 之二元樹(造出來樹之前序不為 abcd) (d)無法造出前序為 abcd,中序為 dacb 之二元樹(造出來樹之前序不為 abcd) (e) 無法造出前序為 abcd,中序為 cadb 之二元樹(造出來樹之前序不為 abcd)
<div style="display: flex; justify-content: space-around; align-items: center;"><div style="text-align: center;"><p>(a)</p><pre>graph TD; a --> b; a --> c; c --> d;</pre></div><div style="text-align: center;"><p>(c)</p><pre>graph TD; a --> b; a --> d; b --> c;</pre></div></div>

(a)tree:樹不可為空

4 條件等價: (1) G 為非退化樹 (2) G 中任兩點有唯一路徑

(3)去掉任 1 邊為不連通 (4) G 加入一邊存在唯一 cycle

3 條件等價: (1) G 為樹 (2) G 不含迴路且 $|E|=|V|-1$ (3) G 為連通且 $|E|=|V|-1$

(b)forest : n 棵互斥樹之集合 $n \geq 0 \Rightarrow$ 森林可為空

(c)compare of tree and binary tree

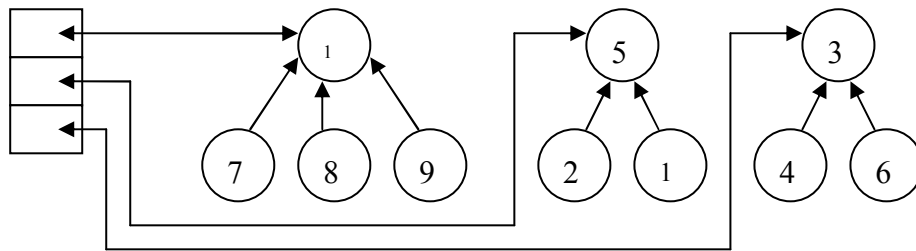
樹不可為空 child 間無順序 $degree \geq 0$

二元樹可為空 child 間有順序 $0 \leq degree \leq 2$

(16) Disjoint Set

$S1=\{0, 6, 7, 8\}$, $S2=\{1, 4, 9\}$, $S3=\{2, 3, 5\}$

表示法 1: Link list represent



表示法 2: Array represent

data	1	2	3	4	5	6	7	8	9	10
parent	0	5	0	3	0	3	1	1	1	5

Operation:

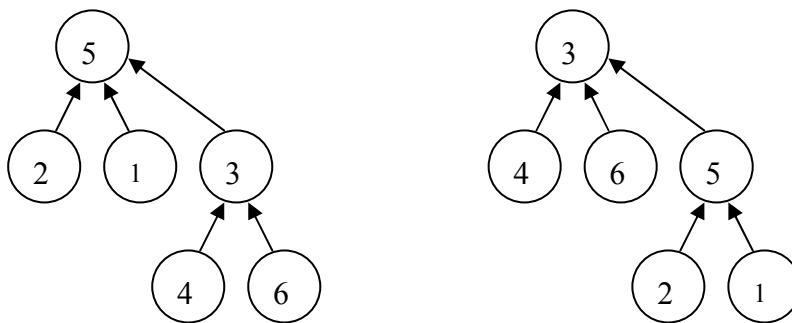
(1) Union(i,j): 聯集 Set i 與 Set j

(2) Find(x): 找出 x 位於那個 Set

(a) Union and simple find

Union: $O(1)$ 作法: $Parent[i]=j$ 或 $Parent[j]=i$

Union($S2, S3$): 2 種方法



Find: $O(k)$, k 為樹高 作法: 延 x 往上走, 直到 root

Time complexity:

Union: $O(1)$, Find: $O(n)$

M 個 Union/ Find $\rightarrow O(mn)$

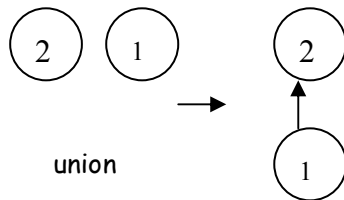
(b) Union-by-height and simple find

Union-by-height: 樹高較高的 set 當樹根

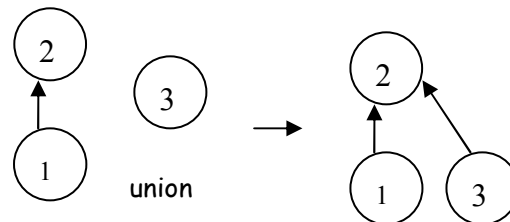
作法: 樹高相同作 union, 樹高才加 1,

樹高不同 union, 樹高不變

例(1):



例(2):



例(3): binomial tree

Time complexity:

Union: $O(1)$, Find: $O(\log n) \rightarrow$ 因為 binomial tree

M 個 Union/ Find $\rightarrow O(m \log n)$

(c) Union-by-height and find-with-path compression

find-with-path compression: 在 find 過程中, 把所有路徑上 node 指到 root

Time complexity:

Union: 趨近 $O(1)$, Find: 趨近 $O(1)$

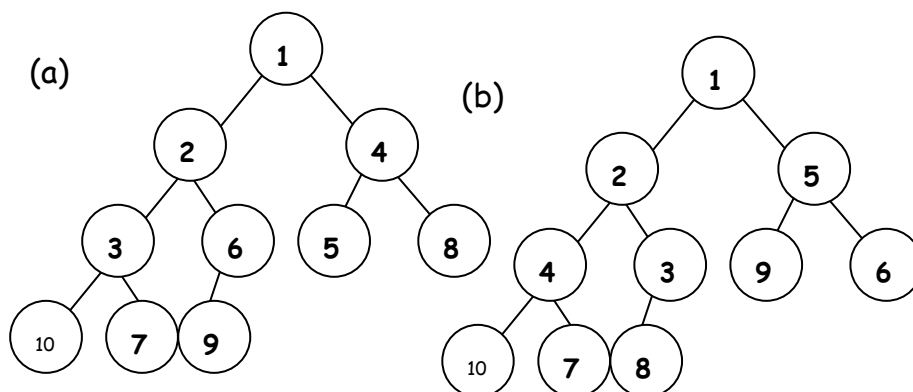
M 個 Union/ Find $\rightarrow O(m * \alpha(m, n)) \cong O(m * \log^* n)$

Create a min heap by 10,9,8,7,6,5,4,3,2,1

(a) bottom-up (b) Top-down

(a) bottom-up \rightarrow 先把 10,9,8,7,6,5,4,3,2,1 擺成 complete B.T, 做 Min-Heapfy

(b) Top-down \rightarrow 一邊 insert, 一邊調整



operation	Link list	Binary Heap	Binomial Heap	Fibonacci Heap
case	Worse case	Worse case	Worse case	amortized
Make-Heap	$\theta(1)$	$\theta(1)$	$\theta(1)$	$\theta(1)$
insert	$\theta(1)$	$\theta(\log n)$	$O(\log n)$	$\theta(1)$
delete	$\theta(n)$	$\theta(\log n)$	$\theta(\log n)$	$O(\log n)$
Find-Min	$\theta(n)$	$\theta(1)$	$O(\log n)$	$\theta(1)$
Delete-Min	$\theta(n)$	$\theta(\log n)$	$\theta(\log n)$	$O(\log n)$
Union	$\theta(1)$	$\theta(n)$	$O(\log n)$	$\theta(1)$
Decrease-Key	$\theta(1)$	$\theta(\log n)$	$\theta(\log n)$	$\theta(1)$

operation	Array	Link list	AVL Tree
Search for x	$O(\log n)$	$O(n)$	$O(\log n)$
insert	$O(n)$	$O(1)$	$O(\log n)$
Delete x	$O(n)$	$O(1)$	$O(\log n)$
Search k th item	$O(1)$	$O(k)$	$O(\log n)$
Delete k th item	$O(n - k)$	$O(k)$	$O(\log n)$
Output in order	$O(n)$	$O(n)$	$O(\log n)$

	DFS	BFS
adjacency list (both $O(e)$)	DFS examine each node one times	$\sum_{i=1}^n \text{degree}(i) = O(n)$
adjacency matrix (both $O(n^2)$)	(1) determine the adjacent vertex of v $\rightarrow O(n)$ (2) at most traverse n vertex	each vertex enter queue one times \rightarrow while loop $O(n)$ at most traverse n vertex

	Single Source/All Destinations	Single Source/All Destinations	<u>All Pairs Shortest Path</u>
algorithm	Dijkstra	Bellman Ford	Floyd Warshall
Time complexity	linear array: $O(V^2)$ binary heap $O((E + V) \log V)$ Fibonacci heap $O(E + V \log V)$	adjacency matrix: $O(V^3)$ adjacency lists $\rightarrow O(VE)$	$O(n^3)$
Negative edge	X	O	O
Negative cycle	X	X	X
method	Greedy	Dynamic Programming	Dynamic Programming

名詞定義

BST

- (1) 每一個 node 有一個 key
- (2) $key(left_child) < my_key < key(right_child)$
- (3) 左右子樹仍為 BST

AVL tree $(\log(n+1) \leq height \leq 1.44 \log(n+2))$

空樹為 AVL tree, T 不是空的二元樹, T_L, T_R 為左右子樹

- (1) T_L, T_R 均為高度平衡樹
- (2) $|h_L - h_R| \leq 1$, 其中 h_L, h_R 是 T_L, T_R 的高度

Red-Black Trees $(\log(n+1) \leq height \leq 2 \log(n+1))$

為一 BST

- (1) node 顏色為黑或紅
- (2) root 為黑節點
- (3) external nodes 為黑節點
- (4) 若為紅色 node, 其 child 必為黑 node (防止連續紅色 node 存在)
- (5) root 至 leaf(external) 路徑上, 具相同數目黑節點

B-Tree

一棵 order 為 m 的 B-tree 是一 m-way 搜尋樹。可為空樹, 假若高度 > 1

(1) 樹根至少有二個子節點 (children), 亦即節點內至少有一鍵值 (key value)。

(2) 所有 nodes 除了根與葉至少 $\left\lceil \frac{m}{2} \right\rceil$ children

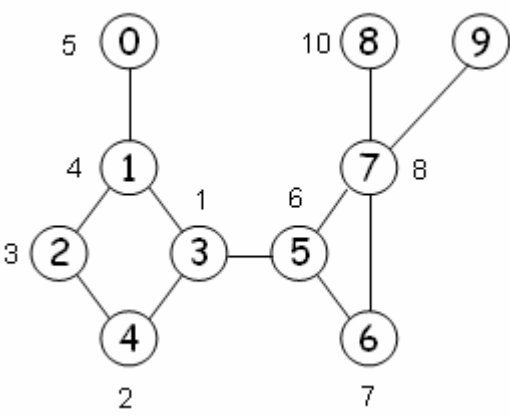
(3) 所有的樹葉節點皆在同一階層。

2-3 Trees

A 2-3 tree 為一搜尋樹, 可為非空, 如為非空, 滿足

- (a) 每一內部節點 為 2-node (1-element) 或 a 3-node (2-element)
- (b) 如為 2-node (1-element), 則 $LeftChild < LData.key < MiddleChild$
- (c) 如為 3-node (2-element), 則 $LeftChild < LData.key < MiddleChild < RData.key < RightChild$
- (d) 全部外部節點 (external node) 為於同一 level

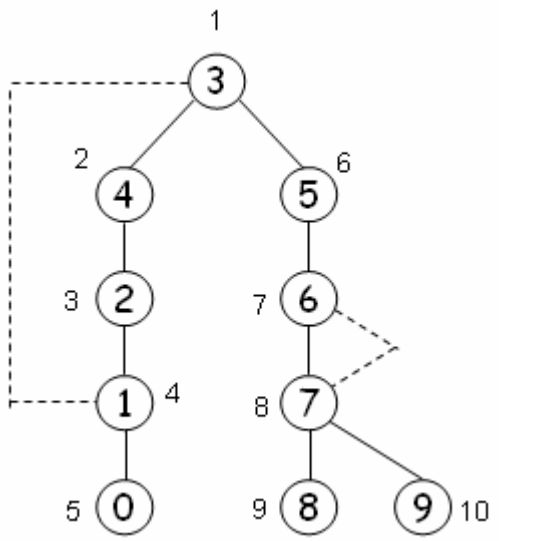
DFS spanning tree

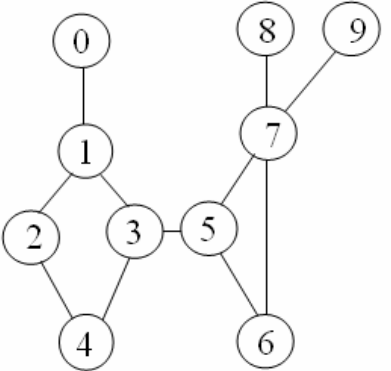


(a) draw the DFS spanning tree

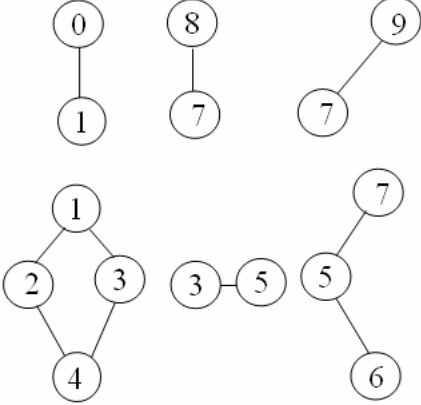
(b) point the articulate point

(c) draw the biconnected component





1,3,5,7 be articulation point



biconnected component
沒有 articulation point 的 connected component

$\because 3: \text{root} \ \& \ \text{has} \ 2 \ \text{child}$
 $\Rightarrow 3: \text{articulation point}$
 $\because 6 = \text{child}[5], \text{lower}[6] \geq \text{dfn}[5]$
 $\Rightarrow 5: \text{articulation point}$
 $\because 0 = \text{child}[1], \text{lower}[0] \geq \text{dfn}[1]$
 $\Rightarrow 1: \text{articulation point}$
 $\because 9 = \text{child}[7], \text{lower}[9] \geq \text{dfn}[7]$
 $\Rightarrow 7: \text{articulation point}$

兒子的 *low* 大於父親的 *DFN*
 則父親為 articulation point

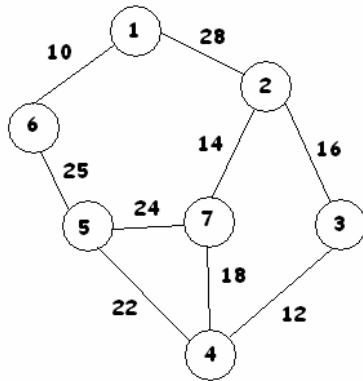
v	0	1	2	3	4	5	6	7	8	9
dfn	5	4	3	1	2	6	7	8	9	10
low	5	1	1	1	1	6	6	6	9	10

Sollins algorithm(Greedy) (96 台大工科)

(1)把每個 node 視為一棵 component ,則原題目為 forest

(2) 每 component 挑一條最小邊,並把連到的 component 加到自己

Sollins algorithm



Sollins algorithm

Origin has 7 forest , forest1~ forest 7 ,each contains a certex

Run 1:

Vertex 1: $\min\{10,28\} \rightarrow 10$ forest 6 ,edge(1,6) add into forest 1

Vertex 2: $\min\{14,16,28\} \rightarrow 14$ forest 7 ,edge(2,7) add into forest 2

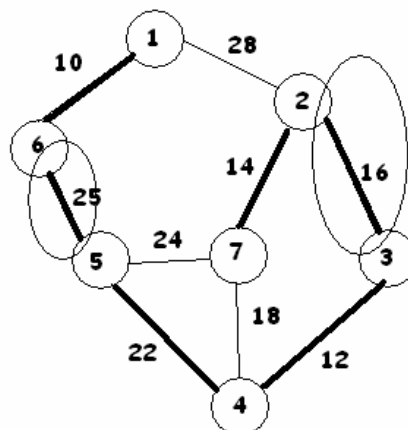
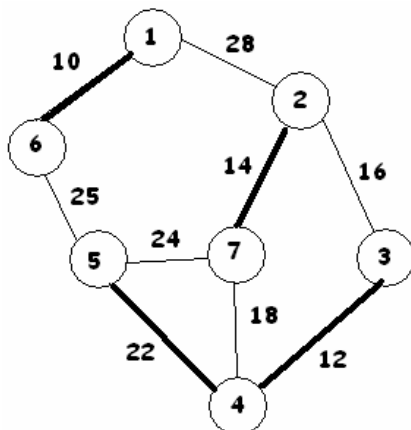
Vertex 3: $\min\{16,12\} \rightarrow 12$ forest 4 ,edge(3,4) add into forest 3

Vertex 5: $\min\{22,24,25\} \rightarrow 22$ forest 5 ,edge(4,5) add into forest 3

Run 2:

Forest {1,6}: $\min\{25,28\} \rightarrow 25$ forest 1, forest 3 做合併成新的 forest 1

Forest {2,7}: $\min\{28,16,18,24\} \rightarrow 16$ forest 1, forest 2 再做合併成新的 forest 1

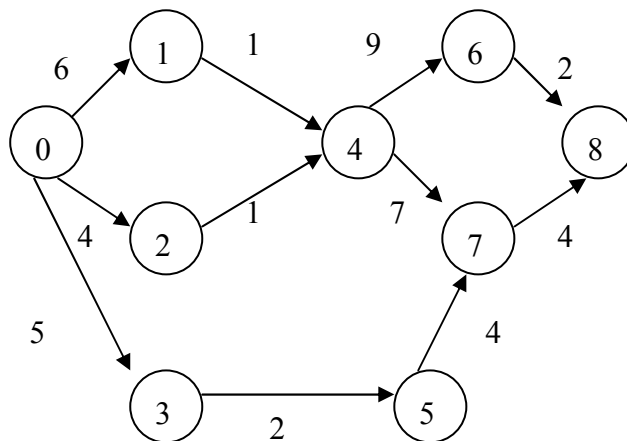


AOE network

Example 1: Find the critical path

earliest time: 由 start node 的後面 node 開始 ,前面路點加路徑,挑最大

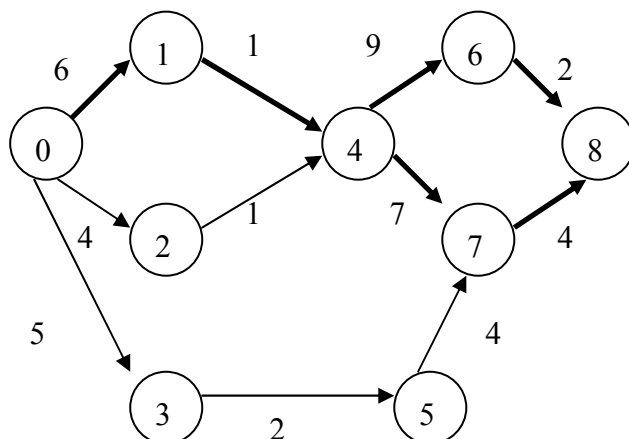
latest time: 由 end node 的前面 node 往 start node ,後面路點減路徑,挑最小



$\text{Earliest}(1) = \text{Max}\{(0+6)\} = 6$, $\text{Earliest}(2) = \text{Max}\{(0+4)\} = 4$, $\text{Earliest}(3) = \text{Max}\{(0+5)\} = 5$
 $\text{Earliest}(4) = \text{Max}\{(6+1), (4+1)\} = 7$, $\text{Earliest}(5) = \text{Max}\{(5+2)\} = 7$, $\text{Earliest}(6) = \text{Max}\{(7+9)\} = 16$
 $\text{Earliest}(7) = \text{Max}\{(7+7), (7+4)\} = 14$, $\text{Earliest}(8) = \text{Max}\{(16+2), (14+4)\} = 18$

$\text{Latest}(6) = \text{Min}\{(18-2)\} = 16$, $\text{Latest}(7) = \text{Min}\{(18-4)\} = 14$, $\text{Latest}(4) = \text{Min}\{(16-9), (14-7)\} = 7$
 $\text{Latest}(5) = \text{Min}\{(14-4)\} = 10$, $\text{Latest}(3) = \text{Min}\{(10-2)\} = 8$, $\text{Latest}(2) = \text{Min}\{(7-1)\} = 6$
 $\text{Latest}(1) = \text{Min}\{(7-1)\} = 6$, $\text{Latest}(0) = \text{Min}\{(6-6), (6-6), (8-5)\} = 0$

$\text{late}(a_i) = \text{early}(a_i)$, 都算是 critical path



	best	Worse	average	storage	Stable	Compar based
insert	$O(n)$	$O(n^2)$	$O(n^2)$	$O(1)$	O	O
bubble	$O(n)$	$O(n^2)$	$O(n^2)$	$O(1)$	O	O
selection	$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$	X	O
quick	$O(n \log n)$	$O(n^2)$	$O(n \log n)$	$O(n \log n)$	X	O
merge	$O(n \log n)$	$O(n \log n)$	$O(n \log n)$	$O(n)$	O	O
heap	$O(n \log n)$	$O(n \log n)$	$O(n \log n)$	$O(1)$	O	O
shell	-	$O(n(\log n)^2)$	-	$O(1)$	X	O
radix	$O(d(n+k))$	$O(d(n+k))$	$O(d(n+k))$	$O(n \cdot r)$	Msd : X Lsd : O	X

QuickSort prove

worse case: partition N item into two part 1 N-1

$$\begin{aligned}
 T(n) &= T(n-1) + cn \\
 &= [T(n-2) + c(n-1)] + cn \\
 &= \dots \\
 &= T(1) + c(2 + \dots + n) = T(1) + c \left(\frac{(n+2)(n-1)}{2} \right) = O(n^2)
 \end{aligned}$$

best case: partition N item into two part N/2 N/2 (same as merge sort)

$$\begin{aligned}
 T(n) &= 2T\left(\frac{n}{2}\right) + cn \\
 &= 2 \left[2T\left(\frac{n}{4}\right) + c \frac{n}{2} \right] + cn \\
 &= \dots \\
 &= 2^k T\left(\frac{n}{2^k}\right) + ckn \quad (2^k = n \Rightarrow k = \log n) \\
 &= nT(1) + cn \log n = O(n \log n)
 \end{aligned}$$

Prove Compare-base sorting algorithm $\Omega(n \log n)$

n data decision tree has n! leaf node

$$n! \leq 2^{k-1} \Rightarrow \log n! + 1 \leq k \quad \text{decision tree height at least } \log n! + 1$$

$$\therefore \log n! \geq \frac{n}{2} \log \left(\frac{n}{2} \right) \Rightarrow \log n! + 1 = \Omega(n \log n)$$

(1)definition

(a)Hashing definition

一總資料儲存機制,欲存取資料 x 時,先經由 hashing function $H(k)$ 算出 hashing address 再到 hashing table 之 bucket 中存取

(b)Load density:

$$\alpha = \frac{n}{b * s}, b * s : \text{hashing table size}, n: \text{使用過的 identifier 總數}$$

$\alpha \uparrow \rightarrow$ hash table 使用度 $\uparrow \rightarrow$ collision 機會 \uparrow

(c) identifier density : $\frac{n}{T}$, T :total identifier, n :使用過的 identifier 總數

(d)bucket:一個 hashing table 分爲 b 個 bucket

(e)slot: 一個 bucket 分爲 s 個 slot ,每個 slot 可存一個 key

(f) collision:不同的key (如 x & y)經過hashing function , 得到相同的address

(g)overflow :新的key hash到滿的的bucket中

(h)perfect hashing: hashing沒有collision與overflow

(2)property

(a)使用雜湊法搜尋，檔案不須事先**sorting**。

(b)沒有**collision**及**overflow**，只需一次讀取即可，且搜尋的速度與資料量的多寡無關。

(c)保密性高，若不知雜湊函數，無法擷取到資料。

(d)可做**data compression**，適當的散置函數，將資料壓縮到一個較小的範圍內，節省空間。

(3)Hashing function

(a) Mid-Square : key 平方後,取中間三位數 ,e.g. $8128^2 = 66015625 \rightarrow$ pick 015 or 156

(b) Division: mod 取餘數,如 buck size=13 , $h(57)=5$, $h(62)=10$, $h(26)=0$

(c) Folding: e.g. 38123159639

(1)shift folding: 381 231 596 39 , $381+231+596+39=1247$, $1248 \% b$

(2)boundary shift folding: 381 231 596 39 \rightarrow 381 132 596 93=1202, $1248 \% b$

(4)collision handle

Method 1:open addressing \rightarrow Linear probing , Quadratic probing , Rehashing

Method 2:separate chaining

Given a hash table of size 10 (assuming that the hash table starts with index 0), show how the following data (in the given order) would be stored in the table using

(a) linear probing

(b) Quadratic probing

(c) double hashing: $h_1(x) = x \% 10$ and $h_2(x) = 2 + (x \% 7)$

Data: 99, 15, 75, 36, 20, 25, 89, 0, 47, 42

$h(99)=9$, $h(15)=5$, $h(75)=5$, $h(36)=6$, $h(20)=0$, $h(25)=5$, $h(89)=9$, $h(0)=0$, $h(47)=7$, $h(42)=2$

(a)

bucket	0	1	2	3	4	5	6	7	8	9
key	20	89	0	47	42	15	75	36	25	99
collision	0	2	2	6	2	0	1	1	3	0

(b)

bucket	0	1	2	3	4	5	6	7	8	9
key	20	0	42	47	25	15	75	36	89	99
collision	0	1	0	3	2	0	1	1	2	0

(c)

bucket	0	1	2	3	4	5	6	7	8	9
key	20	25	75	89	0	15	36	47	42	99
collision	0	1	1	2	2	0	0	7	3	0

$$h(75, 1) = (h_1(75) + h_2(75) * 1) \% 10 = 2$$

$$h(25, 1) = (h_1(25) + h_2(25) * 1) \% 10 = 1$$

$$h(89, 1) = (h_1(89) + h_2(89) * 1) \% 10 = 6$$

$$h(89, 2) = (h_1(89) + h_2(89) * 2) \% 10 = 3$$

$$h(0, 1) = (h_1(0) + h_2(0) * 1) \% 10 = 2$$

$$h(0, 2) = (h_1(0) + h_2(0) * 2) \% 10 = 4$$

$$h(42, 1) = (h_1(42) + h_2(42) * 1) \% 10 = 4$$

$$h(42, 2) = (h_1(42) + h_2(42) * 2) \% 10 = 6$$

$$h(42, 3) = (h_1(42) + h_2(42) * 3) \% 10 = 8$$

Hash (a)insert worse case (b)delete worse case (c) search worse case

(d)search best case

(a) $O(n)$ (b) $O(n)$ (c) $O(n)$ (d) $O(1)$

(5) Linear probing

如 collision ,往後一個 bucket ,到最佳一個 bucket 時再繞回第一個 bucket
易形成資料群聚 (Clustering)現象，增加 Searching Time

(6)Quadratic probing

為改善 Clustering 現象而提出。當 $h(x)$ 發生 overflow 時

$$h(x) \text{ overflow} \rightarrow (h(x) \pm i^2) \% b, \quad 1 \leq i \leq \frac{b-1}{2}$$

$$(h(x) + 1) \% b, (h(x) - 1) \% b$$

$$(h(x) + 4) \% b, (h(x) - 4) \% b$$

$$(h(x) + 9) \% b, (h(x) - 9) \% b$$

(7)double hashing

使用 h_1 hashing function,如果collision 則使用 $(h_1(key) + h_2(key) * i) \% bucket, i = 1, 2, 3 \dots$

double hashing: $h_1(x) = x \% 10$ and $h_2(x) = 7 - (x \% 7)$,bucket=10

5,10,15,20,6,35,11,40

bucket	0	1	2	3	4	5	6	7	8	9
key	10	15	20		11	5	6		40	35
collision	0	1	2		1	0	0		4	2

$h_1(15)=5$,collision $\rightarrow [h_1(15)+ h_2(15)]\%10=1$

$h_1(20)=0$,collision $\rightarrow [h_1(20)+ h_2(20)]\%10=1$,collision, $[h_1(20)+2*h_2(20)]\%10=2$

$h_1(35)=5$,collision $\rightarrow [h_1(35)+ h_2(35)]\%10=2$,collision, $[h_1(35)+2*h_2(35)]\%10=9$

$h_1(11)=1$,collision $\rightarrow [h_1(11)+ h_2(35)]\%10=4$

$h_1(40)=0$,collision $\rightarrow [h_1(40)+ h_2(40)]\%10=2$,collision, $[h_1(40)+2*h_2(40)]\%10=4$,collision

$\rightarrow [h_1(40)+ 3*h_2(40)]\%10=6$,collision, $[h_1(40)+4*h_2(40)]\%10=8$

(1) rehashing

準備多組雜湊函數 $h_1(x), h_2(x), h_3(x), \dots, h_m(x)$, 用 $h_1(x)$ 發生溢位，則改用 $h_2(x)$, 若再發生溢位則改用 $h_3(x)$, ...