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今日 Topic： ch23、ch34、ch35、期末複習(另外一份)

## Ch 23 講義：

$$\hat{w}(u, v) = w(u, v) + h(u) - h(v)$$

rewighting

- We have  $h(v) \leq h(u) + w(u, v)$  if there is no negative weight cycle (why?)
- $\hat{w}(u, v) = w(u, v) + h(u) - h(v) \geq 0$

絕對是正的

```
1 Computing  $G'$ , where  $G'.V = G.V \cup \{s\}$ 
   and  $G'.E = G.E \cup \{(s, v) : v \in G.V\}$  and  $w(s, v) = 0$ .
2 if BELLMAN-FORD( $G', w, s$ ) = FALSE
3 print "the input graph contains negative weight
   cycle"
4 else for each vertex  $v \in G'.V$ 
5 set  $h(v)$  to be the value of  $\delta(s, v)$  computed by
   the BF algorithm
6 for each edge  $(u, v) \in G'.E$ ,  $\hat{w}(u, v) = w(u, v) +$ 
    $h(u) - h(v)$ 
```

```

7 Let  $D = (d_{uv})$  be a new  $n \times n$  matrix
8 for each vertex  $u \in G.V$ 
    run DIJKSTRA ( $G, \hat{w}, u$ ) to compute  $\hat{\delta}(u, v)$ 
    for all  $v \in V[G]$ .
10 for each vertex  $v \in G.V$ 
11    $d_{uv} = \hat{\delta}(u, v) + h(v) - h(u)$ 
12 return  $D$ 

```

**Complexity: Using Fibonacci heap  $O(V^2 \lg V + VE)$**   
**Using Binary heap implementation:  $O(VE \lg V)$**

## Ch 23 習題：

✓ 23.1-7

Suppose that you also want to compute the vertices on shortest paths in the algorithms of this section. Show how to compute the predecessor matrix  $\Pi$  from the completed matrix  $L$  of shortest-path weights in  $O(n^3)$  time.

✓  $\pi_{kj}^{(m)}$  is  $\arg \min_k (W_{kj}^{(m-1)} + \dots)$

簡單來說當前的 shortest path 一定會是  $i \rightarrow j$  或是 經過某個  $k$  的最短路徑相加，也就是說我們只需要檢查  $L[i, j] == L[i, k] + L[k, j]$ ，如果都沒有就是第一種 case，有的話就是我的前一步會更新到  $k$ ，預設  $\Pi[i, j] = i$ 。

```

less
複製程式碼

for i from 1 to n:
    for j from 1 to n:
        if i != j:
            for k from 1 to n:
                if k != i and k != j:
                    # Check if the shortest path i->j passes through k
                    if  $L[i][j] == L[i][k] + L[k][j]$ :
                        # Update predecessor of j in the path from i
                         $\Pi[i][j] = \Pi[k][j]$ 
                        break # Once a suitable k is found, no need to continue

```

Modify FASTER-ALL-PAIRS-SHORTEST-PATHS so that it can determine whether the graph contains a negative-weight cycle.

time for each assignment.

FASTER-APSP( $W, n$ )

```

1  let  $L$  and  $M$  be new  $n \times n$  matrices
2   $L = W$ 
3   $r = 1$ 
4  while  $r < n - 1$ 
5       $M = \infty$  // initialize  $M$ 
6      EXTEND-SHORTEST-PATHS( $L, L, M, n$ ) // compute  $M = L^2$ 
7       $r = 2r$ 
8       $L = M$  // ready for the next iteration
9  return  $L$ 

```

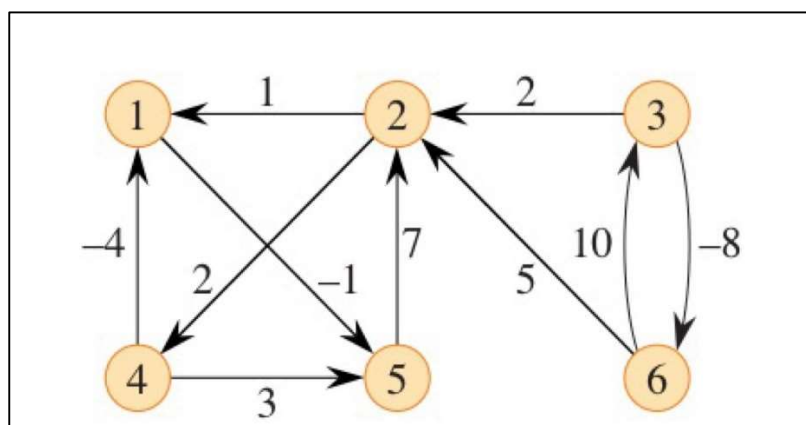
我們知道  $2^{(k+1)} > n-1$ ，因為  $2^k > n-1$ ，所以我們可以在多乘一次，也就是在 return 前多加一行，extended-shortest-path( $M, M, M', n$ )，以及 check  $M' = M$  or not。

Give an efficient algorithm to find the length (number of edges) of a minimum-length negative-weight cycle in a graph.

可以利用 APSP 每一次迭代都檢查對角線，時間複雜度是  $O(n^4)$ 。

Run the Floyd-Warshall algorithm on the weighted, directed graph of Figure 25.2. Show the matrix  $D^{(k)}$  that results for each iteration of the outer loop.

算算看



建議要

As it appears above, the Floyd-Warshall algorithm requires  $\Theta(n^3)$  space, since we compute  $d_{ij}^{(k)}$  for  $i, j, k = 1, 2, \dots, n$ . Show that the following procedure, which simply drops all the superscripts, is correct, and thus only  $\Theta(n^2)$  space is required.

```
FLOYD-WARSHALL (W)
  n = W.rows
  D = W
  for k = 1 to n
    for i = 1 to n
      for j = 1 to n
        d[i, j] = min(d[i, j], d[i, k] + d[k, j])
  return D
```

只會根據前一次的來做改變，且改變的時候是  $d_{ij}^{(m+1)} = \min(d_{ij}^{(m)}, d_{ik}^{(m)} + d_{kj}^{(m)})$ ，這代表，我只要在跟心之前，或者是在跟跟心的時候  $d_{ik}$ 、 $d_{kj}$  都不會被動到就好，那這是對的，因為如果會被動到就代表  $d_{ik} + d_{kk} < d_{ik}$  或者是  $d_{kk} + d_{kj} < d_{kj}$ ，那這是不可能發生的當圖沒有負環的時候。

How can we use the output of the Floyd-Warshall algorithm to detect the presence of a negative-weight cycle?

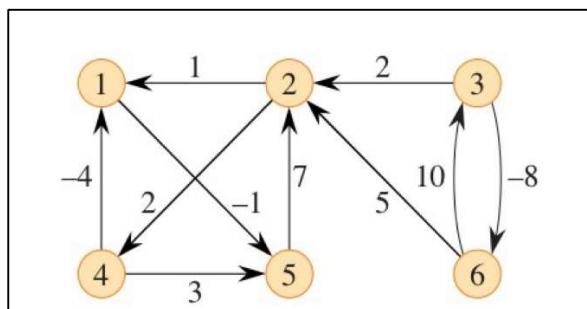
迭代完之後檢查對角線是否有非 0 元素。

### ✓ 23.2-8

Give an  $O(VE)$ -time algorithm for computing the transitive closure of a directed graph  $G = (V, E)$ . Assume that  $|V| = O(E)$  and that the graph is represented with adjacency lists.

這邊使用 dfs 對於每一個點，但這樣時間複雜度是  $O(VE + V \cdot V)$ ，且  $|V| = O(E)$ ，所以時間複雜就是  $O(VE + VE) = O(VE)$

Use Johnson's algorithm to find the shortest paths between all pairs of vertices in the graph of Figure 25.2. Show the values of  $h$  and  $\hat{w}$  computed by the algorithm.



算算看，建議要

What is the purpose of adding the new vertex  $s$  to  $V'$ , yielding  $V'$ ?

This is only important when there are negative-weight cycles in the graph. Using a dummy vertex gets us around the problem of trying to compute  $-\infty + \infty$  to find  $\hat{w}$ . Moreover, if we had instead used a vertex  $v$  in the graph instead of the new vertex  $s$ , then we run into trouble if a vertex fails to be reachable from  $v$ .

Suppose that  $w(u, v) \geq 0$  for all edges  $(u, v) \in E$ . What is the relationship between the weight functions  $w$  and  $\hat{w}$ ?

If all the edge weights are nonnegative, then the values computed as the shortest distances when running Bellman-Ford will be all zero. This is because when constructing  $G'$  on the first line of Johnson's algorithm, we place an edge of weight zero from  $s$  to every other vertex. Since any path within the graph has no negative edges, its cost cannot be negative, and so, cannot beat the trivial path that goes straight from  $s$  to any given vertex. Since we have that  $h(u) = h(v)$  for every  $u$  and  $v$ , the reweighting that occurs only adds and subtracts 0, and so we have that  $w(u, v) = \hat{w}(u, v)$

Suppose that we run Johnson's algorithm on a directed graph  $G$  with weight function  $w$ . Show that if  $G$  contains a 0-weight cycle  $c$ , then  $\hat{w}(u, v) = 0$  for every edge  $(u, v)$  in  $c$ .

我們知道 **rewight** 後，一個圈圈的權重不會變，也知道 **rewight** 後如果沒有負環，他就會都大於等於 0，所以他一定全部都等於 0。

## Ch 34 講義：

### Cook-Levin Theorem

- If **SAT** is in **P**, then all problems in **NP** are also in **P**

這說明 SAT 是 NP 裡面最難的問題

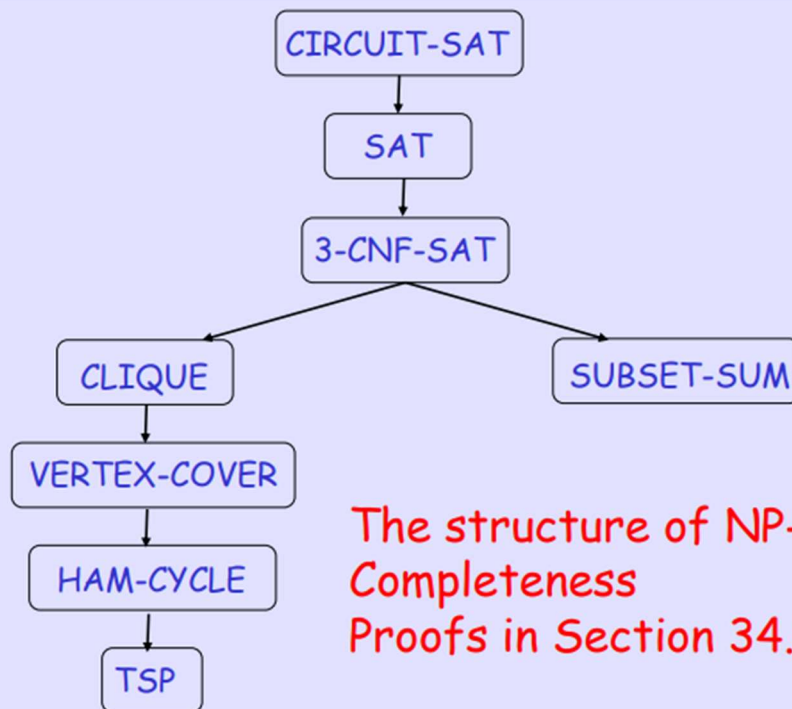
### Problem Reduction

- e.g., **A** = Finding median, **B** = Sorting
- We can solve **A** if we know how to solve **B**  
→ sorting is as hard as finding median
- eg., **A** = Topological Sort, **B** = DFS
- We can solve **A** if we know how to solve **B**  
→ DFS is as hard as topological sort

說是 reduction，但是其實是 show 更難



# Problem Reduction



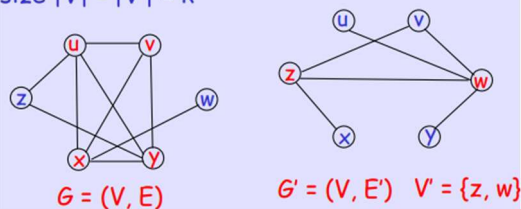
The structure of NP-Completeness Proofs in Section 34.3

越往下的問題越難，我們可以透過後面的證明，說明如果我解決下面的問題，那上面的問題就被解決了。

## Problem Reduction

- Theorem: The VERTEX-COVER problem is NP-complete
  - Proof:
    1. VERTEX-COVER  $\in$  NP
    2. Show that CLIQUE  $\leq_p$  VERTEX-COVER
- Given an undirected graph  $G = (V, E)$ , we define the **complement** of  $G$  as  $G' = (V, E')$ , where  $E' = \{(u, v) : u, v \in V, u \neq v, \text{ and } (u, v) \notin E\}$

Suppose that  $G'$  has a vertex cover  $V' \subseteq V$ . Then for all  $u, v \in V$ , if  $(u, v) \in E'$ , then  $u \in V'$  or  $v \in V'$  or both. This implies that for all  $u, v \in V$ , If  $u \notin V'$  and  $v \notin V'$ , then  $(u, v) \in E$ . In other words,  $V - V'$  is a clique, and its size  $|V| - |V'| = k$



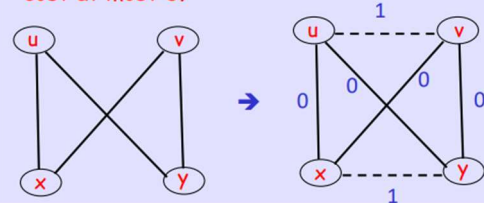
我們想要 show 點覆蓋也是 NPC，首先我們先說明他會落在 NP 裡，那它的難度一定小於 NPC，再來要說明另一邊，也就是說，我要說明如果點覆蓋可以解，那某一個 NPC 的問題也可以解，那這邊取的 NPC 問題是點團。

## Problem Reduction

- Theorem: The traveling-salesman problem (TSP) is NP-complete
- Proof:
  1.  $TSP \in NP$
  2. Show that  $HAM-CYCLE \leq_p TSP$   
 Let  $G = (V, E)$  be an instance of HAM-CYCLE. We construct an instance of TSP as follows. We form a **complete graph**  $G' = (V, E')$ , where  $E' = \{(i, j) \mid i, j, \in V, \text{ and } i \neq j\}$  and we define the cost function

$$C(i, j) = \begin{cases} 0 & \text{if } (i, j) \in E \\ 1 & \text{if } (i, j) \notin E \end{cases}$$

We can show that graph  $G$  has a Hamiltonian cycle iff graph  $G'$  has a tour cost at most 0.



同理，自己想一下。

- **NP-Complete:** a problem  $A$  is in NPC iff (i)  $A$  is in NP, and (ii) **any** problem in NPC can be reduced to it in  $O(n^k)$  time.
- If any problem in NPC can be solved in  $O(n^k)$  time, then  $P=NP$ . It is believed (but not proved) that  $P \neq NP$ .
- **NP-Hard:** a problem  $A$  is in NPH iff a problem in NPC can be reduced to  $A$  in  $O(n^k)$  time.

NPC 的 decision problem，他的最佳化問題是 NPH。

- Give a polynomial algorithm to solve the 2-CNF satisfiability problem

### 演算法

假設 Boolean formula 有  $n$  種布林變數， $m$  個子句

1. 將 Boolean formula 轉成一有向圖  $G$  (Implication Graph) :

建構方式：

- (1) 對每個  $x_i$ ，新增兩個點  $X_i$  和  $\hat{X}_i$
- (2) 對每個子句  $(x_i \vee x_j)$ ，新增兩條有向邊  $(\hat{X}_i, X_j)$  和  $(\hat{X}_j, X_i)$

2. 利用 Kosaraju's Algorithm 找出所有強連通分量。

3. 檢查每組  $x_i$  和  $\hat{x}_i$  是否在同一個強連通分量中。如果存在一組相同代表 Unsatisfiable 則回傳 False。若每組  $x_i$  和  $\hat{x}_i$  都在不同的強連通分量中，代表此 Boolean formula 為 Satisfiable，回傳 True。

- If a problem is NPC, it cannot be solved by any polynomial time algorithm in the worst cases.
- If a problem is NPC, we have not found any polynomial time algorithm to solve it in the worst cases until now.
- If a problem is NPC, then it is unlikely that a polynomial time algorithm can be found in the future to solve it in the worst cases.

FTF

- If we can prove that the lower bound of an NPC problem is exponential, then we have proved that  $NP \neq P$ .
- Any NP-hard problem can be solved in polynomial time if an algorithm can solve the satisfiability problem in polynomial time.

TF

- Suppose that all edge weights in a graph are integers ranging from 1 to  $|V|$ . How fast can you make Prim's algorithm run?
- How do you solve the single-source shortest paths problem in directed acyclic graphs (DAGs)?

$O(V+E)$  、 DAG-shortest-path (use topologic sort)



## Ch 34 習題：

Is the dynamic-programming algorithm for the 0-1 knapsack problem that is asked for in Exercise 16.2-2 a polynomial-time algorithm? Explain your answer.

```
0-1-KNAPSACK(n, W)
    Initialize an (n + 1) by (W + 1) table K
    for i = 1 to n
        K[i, 0] = 0
    for j = 1 to W
        K[0, j] = 0
    for i = 1 to n
        for j = 1 to W
            if j < i.weight
                K[i, j] = K[i - 1, j]
            else
                K[i, j] = max(K[i - 1, j], K[i - 1, j - i.weight] + i.value)
```

這是 fake polynomial，因為如果背包大小大到  $2^n$ ，那就是不是 P 了。

Prove that if  $G$  is an undirected bipartite graph with an odd number of vertices, then  $G$  is nonhamiltonian.

他會從 A 到 B，但因為是奇數的關係，所以最後停的那一塊一定跟原本的不同塊。

Show that the hamiltonian-path problem from Exercise 34.2-6 can be solved in polynomial time on directed acyclic graphs. Give an efficient algorithm for the problem.

Use topologic sort，檢查相鄰的是否都有邊連接。

## Ch 35 講義：

- Let us consider the following algorithm:
  - $C$  = an empty set
  - while (there is an edge in  $G$ ) {
    - Pick an edge, say  $(u, v)$ ;
    - Put  $u$  and  $v$  into  $C$ ;
    - Remove  $u, v$ , and all edges adjacent to  $u$  or  $v$ ;}
  - return  $C$

- What is so special about  $C$ ?
  - Vertices in  $C$  must cover all edges.
  - But ... it may not be the smallest one
- How far is it from the optimal?
  - At most two times (why?)
  - Because each edge in **line 3** of the algorithm can only be covered by its endpoints  $\rightarrow$  in each iteration, one of the selected vertexes **must be** in the optimal vertex cover

APPROX\_TSP\_TOUR( $G, c$ )

- 1 Select a vertex  $r \in G.V$  to be a root vertex
- 2 grow an MST  $T$  for  $G$  from root  $r$  using  $MST\_PRIM(G, c, r)$
- 3 Let  $H$  be the list of vertices visited in a preorder walk of  $T$
- 4 **return** the Hamiltonian cycle  $H$  that visits the vertices in the order  $H$

**Time complexity:  $O(E) = O(V^2)$**

- Clearly,  $|W| = 2|T|$ . Thus,  $|W| \leq 2|H^*|$ .  
Note that  $W$  is not a tour. It visits a vertex more than once. However, by triangle inequality, we can delete unnecessary visits to a vertex without increasing the cost to obtain  $H$ . In our example,  $H = (a, b, c, h, d, e, f, g)$  Thus,  $|H| \leq |W| \leq 2|H^*|$ . #
- **Can we find an approximation algorithm for the general TSP Problem?**

3

1.  $V_1 = V_2 =$  empty set ;
2. Label the vertices by  $x_1, x_2, \dots, x_n$
3. For ( $k = 1$  to  $n$ ) {
 

/\* Fix location of  $x_k$  \*/  
 Fix  $x_k$  to the set such that more  
 in-between edges (with those already fixed  
 vertices  $x_1, x_2, \dots, x_{k-1}$ ) are obtained ;
4. return the cut ( $V_1, V_2$ ) ;

- How far is our **cut** from the optimal?
  - At most two times (why?)
  - When a vertex  $v$  is fixed, we will **add** some edges into the **cut** and **discard** some edges ( $u, v$ ) if  $u$  is placed in the same set as  $v$
  - But when each vertex is fixed :
 

$\#edges \text{ added} \geq \#edges \text{ discarded}$   
 $\rightarrow \text{total } \#edges \text{ added} \geq m/2$

## Ch 35 習題：

Give an efficient greedy algorithm that finds an optimal vertex cover for a tree in linear time.

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**Algorithm 1** GREEDY-VERTEX-COVER( $G$ )

---

```
1:  $V' = \emptyset$ 
2: let  $L$  be a list of all the leaves of  $G$ 
3: while  $V \neq \emptyset$  do
4:   if  $|V| == 1$  or  $0$  then
5:     return  $V'$ 
6:   end if
7:   let  $v$  be a leaf of  $G = (V, E)$ , and  $\{v, u\}$  be its incident edge
8:    $V = V - v$ 
9:    $V' = V' \cup u$ 
10:  for each edge  $\{u, w\} \in E$  incident to  $u$  do
11:    if  $d_w == 1$  then
12:       $L.insert(w)$ 
13:    end if
14:     $E = E - \{u, w\}$ 
15:  end for
16:   $V = V - u$ 
17: end while
```

---

From the proof of Theorem 34.12, we know that the vertex-cover problem and the NP-complete clique problem are complementary in the sense that an optimal vertex cover is the complement of a maximum-size clique in the complement graph. Does this relationship imply that there is a polynomial-time approximation algorithm with a constant approximation ratio for the clique problem? Justify your answer.

It does not imply the existence of an approximation algorithm for the maximum size clique. Suppose that we had in a graph of size  $n$ , the size of the smallest vertex cover was  $k$ , and we found one that was size  $2k$ . This means that in the complement, we found a clique of size  $n - 2k$ , when the true size of the largest clique was  $n - k$ . So, to have it be a constant factor approximation, we need that there is some  $\lambda$  so that we always have  $n - 2k \geq \lambda(n - k)$ . However, if we had that  $k$  was close to  $\frac{n}{2}$  for our graphs, say  $\frac{n}{2} - \epsilon$ , then we would have to require  $2\epsilon \geq \lambda\frac{n}{2} + \epsilon$ . Since we can make  $\epsilon$  stay tiny, even as  $n$  grows large, this inequality cannot possibly hold.