

算法设计与分析 期末复习

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算法设计与分析 期末复习

基础知识

1. 渐进记号
 - Θ 记号
 - O 记号
 - Ω 记号图例
2. 三种情况分析
 - 最好情况分析 (Best Case)
 - 最差情况分析 (Worst Case)
 - 平均 (期望) 情况分析 (Average Case)
3. 递归式求解
 - 主定理法
 - 递归树法
 - 和式求解

分治算法

1. 归并排序
2. 最大子数组
3. 逆序计数
4. 多项式乘法
5. 快速排序与划分
6. 随机选择
7. 基于比较的排序下界

动态规划

1. 0-1背包
2. 最大子数组
3. 最长公共子序列
4. 最长公共子串
5. 最小编辑距离
6. 钢条切割
7. 矩阵链乘法

贪心算法

1. 部分背包
2. 霍夫曼编码
3. 活动选择
4. 最小生成树
5. 单源最短路径

图算法

1. 图的基本概念
2. 广度优先搜索
3. 深度优先搜索
4. 环路检测
5. 拓扑排序
6. 强联通分量

7. 最小生成树
8. 单源最短路径

处理难问题

1. 问题分类
2. 证明问题为NPC问题
3. NPC问题举例

基础知识

1. 渐进记号

Θ 记号

定义：

$$\Theta(g(n)) = \{f(n) | \text{存在正常量 } c_1, c_2, n_0, \text{ 使得对所有 } n \geq n_0, \text{ 有 } 0 \leq c_1g(n) \leq f(n) \leq c_2g(n)\}$$

表示渐进紧确界

O 记号

定义：

$$O(g(n)) = \{f(n) | \text{存在正常量 } c, n_0, \text{ 使得对所有 } n \geq n_0, \text{ 有 } 0 \leq f(n) \leq cg(n)\}$$

表示渐进上界

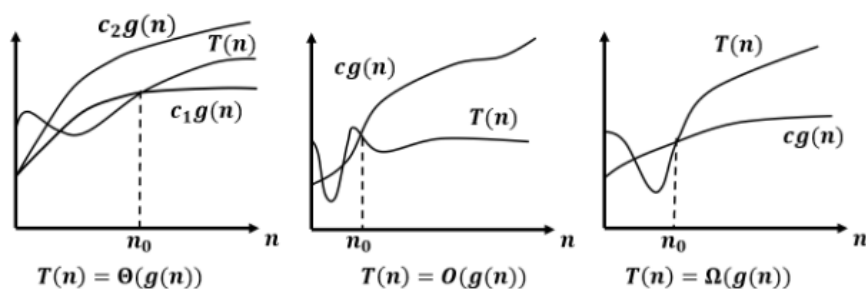
Ω 记号

定义：

$$\Omega(g(n)) = \{f(n) | \text{存在正常量 } c, n_0, \text{ 使得对所有 } n \geq n_0, \text{ 有 } 0 \leq cg(n) \leq f(n)\}$$

表示渐进下界

图例



2. 三种情况分析

最好情况分析 (Best Case)

- 对于输入 n 的最短可能运行时间

最差情况分析 (Worst Case)

- 对于输入 n 的最长可能运行时间
- 通常使用的方法

平均（期望）情况分析（Average Case）

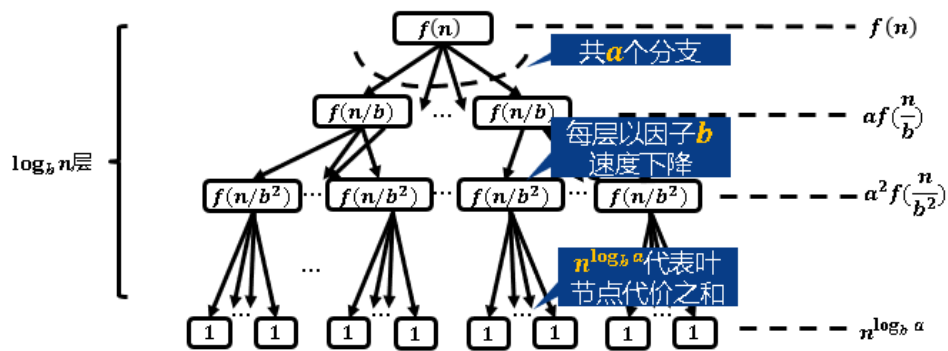
- 对于输入n的所有可能情况的平均运行时间

3. 递归式求解

主定理法

对于形如 $T(n) = aT(\frac{n}{b}) + f(n)$ 的递归式，其解为：

$$T(n) = \Theta(n^{\log_b a}) + \sum_{i=0}^{\log_b n - 1} a^i f(\frac{n}{b^i})$$



进一步分析：

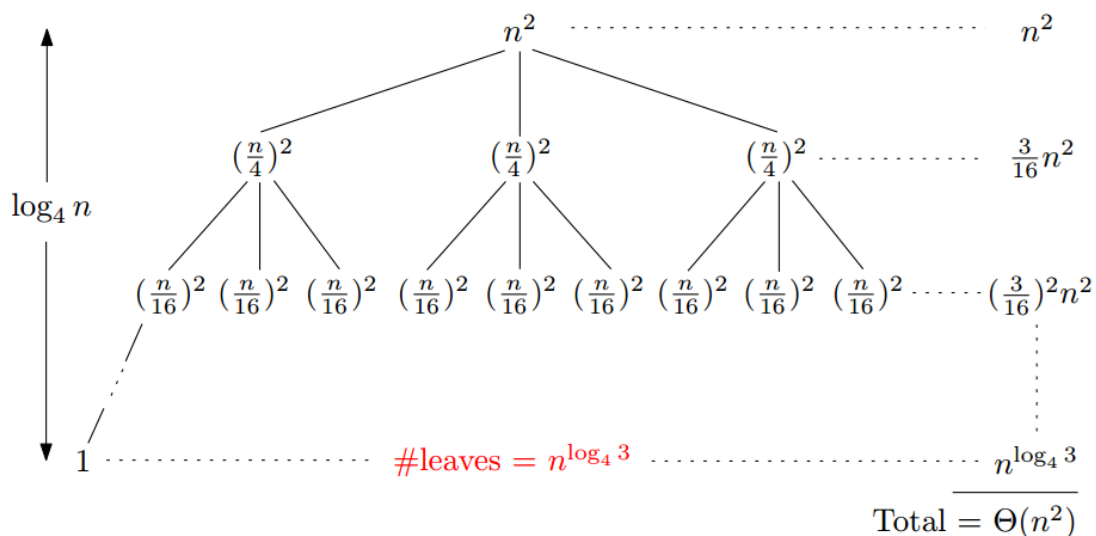
$$T(n) = \begin{cases} \Theta(f(n)) & , \text{if } f(n) = \Omega(n^{\log_b a + \epsilon}) \\ \Theta(n^{\log_b a} \log n) & , \text{if } f(n) = \Theta(n^{\log_b a}) \\ \Theta(n^{\log_b a}) & , \text{if } f(n) = O(n^{\log_b a - \epsilon}) \end{cases}$$

当 $f(n)$ 形式为 n^k 时，可以简化主定理公式：

$$T(n) = aT(\frac{n}{b}) + n^k = \begin{cases} \Theta(n^k) & , \text{if } k > \log_b a \\ \Theta(n^k \log n) & , \text{if } k = \log_b a \\ \Theta(n^{\log_b a}) & , \text{if } k < \log_b a \end{cases}$$

递归树法

$$T(n) = \begin{cases} 3T(n/4) + n^2, & \text{if } n > 1, \\ 1, & \text{if } n = 1. \end{cases}$$



和式求解

$$\sum_{i=1}^n i = O(n^2)$$

$$\sum_{i=1}^n i^2 = O(\log n^3)$$

$$\sum_{i=1}^n \frac{1}{i} = O(\log n)$$

分治算法

- 分解原问题
- 解决子问题
- 合并问题解

1. 归并排序

2. 最大子数组

3. 逆序计数

4. 多项式乘法

```
Input:  $A(x), B(x)$   
Output:  $A(x) \times B(x)$   
 $A_0(x) \leftarrow a_0 + a_1x + \cdots + a_{\frac{n}{2}-1}x^{\frac{n}{2}-1};$   
 $A_1(x) \leftarrow a_{\frac{n}{2}} + a_{\frac{n}{2}+1}x + \cdots + a_nx^{n-\frac{n}{2}};$   
 $B_0(x) \leftarrow b_0 + b_1x + \cdots + b_{\frac{n}{2}-1}x^{\frac{n}{2}-1};$   
 $B_1(x) \leftarrow b_{\frac{n}{2}} + b_{\frac{n}{2}+1}x + \cdots + b_nx^{n-\frac{n}{2}};$   
 $Y(x) \leftarrow \text{PolyMulti2}(A_0(x) + A_1(x), B_0(x) + B_1(x)); // T(n/2)$   
 $U(x) \leftarrow \text{PolyMulti2}(A_0(x), B_0(x)); // T(n/2)$   
 $Z(x) \leftarrow \text{PolyMulti2}(A_1(x), B_1(x)); // T(n/2)$   
return  $(U(x) + [Y(x) - U(x) - Z(x)]x^{\frac{n}{2}} + Z(x)x^{2\frac{n}{2}}); // O(n)$ 
```

$$T(n) = O(n \log n)$$

5. 快速排序与划分

$Quicksort(A, p, r)$

```
Input: An array  $A$  waiting to be sorted, the range of index  $p, r$   
Output: Sorted array  $A$   
if  $p < r$  then  
|  $q \leftarrow \text{Partition}(A, p, r);$   
|  $Quicksort(A, p, q - 1);$   
|  $Quicksort(A, q + 1, r);$   
end  
return  $A;$ 
```

$Partition(A, p, r)$

```

Input: An array  $A$  waiting to be sorted, the range of index  $p, r$ 
Output: Index of the pivot after partition
 $x \leftarrow A[r]$ ; //  $A[r]$  is the pivot element
 $i \leftarrow p - 1$ ;
for  $j \leftarrow p$  to  $r - 1$  do
    if  $A[j] \leq x$  then
         $i \leftarrow i + 1$ ;
        exchange  $A[i]$  and  $A[j]$ ;
    end
end
exchange  $A[i + 1]$  and  $A[r]$ ; // Put pivot in position
return  $i + 1$ ; //  $q \leftarrow i + 1$ 

```

6. 随机选择

Randomized – Partition(A, p, r)

```

Input: An array  $A$  waiting to be sorted, the range of index  $p, r$ 
Output: A random index in  $[p..r]$ 
 $j \leftarrow \text{random}(p, r)$ ;
exchange  $A[r]$  and  $A[j]$ ;
Partition( $A, p, r$ );
return  $j$ ;

```

7. 基于比较的排序下界

在最坏情况下，任何基于比较的排序算法都需要做 $\Omega(n \log n)$ 次比较

动态规划

- 问题结构分析
- 递推关系建立
- 自底向上计算
- 最优方案追踪

1.0-1背包

```

Input: Allowed maximum weight  $W$ , intermediate array from Knapsack
           $V$ 
Output: Maximum value of any subset of items  $\{1, 2, \dots, n\}$  of weight at
          most  $W$ .
 $K \leftarrow W$ ;
for  $i \leftarrow n$  to 1 do
    if  $\text{keep}[i, K]$  is equal to 1 then
        Output  $i$ ;
         $K \leftarrow K - w[i]$ ;
    end
end

```

```

Let  $V[0..n, 0..W]$  and  $keep[0..n, 0..W]$  be two new 2-dimension arrays;
for  $i \leftarrow 0$  to  $W$  do
|  $V[0, i] \leftarrow 0$ ;
end
for  $i \leftarrow 1$  to  $n$  do
| for  $j \leftarrow 0$  to  $W$  do
| | if  $(w[i] \leq w) \text{ and } (v[i] + V[i - 1, w - w[i]] > V[i - 1, j])$  then
| | |  $V[i, j] \leftarrow \max\{V[i - 1, j], v[i] + V[i - 1, w - w[i]]\}$ ;
| | |  $keep[i, j] \leftarrow 1$ ;
| | end
| | else
| | |  $V[i, j] \leftarrow V[i - 1, j]$ ;
| | |  $keep[i, j] \leftarrow 0$ ;
| | end
| end
end
 $K \leftarrow W$ ;
for  $i \leftarrow n$  to  $1$  do
| if  $keep[i, K]$  is equal to  $1$  then
| | Output  $i$ ;
| |  $K \leftarrow K - w[i]$ ;
| end
end
return  $V[n, W]$ ;

```

$$T(n) = O(nW)$$

2. 最大子数组

3. 最长公共子序列

Longest – Commom – Subsequence(X, Y)

Input: Two strings X, Y .

Output: Longest common subsequence of X and Y .

$m \leftarrow \text{length}(X)$;

$n \leftarrow \text{length}(Y)$;

Let $d[0..m, 0..n]$ and $p[0..m, 0..n]$ be two new 2-dimension arrays;

//Initializaiton

for $i \leftarrow 0$ **to** m **do**

| $d[i, 0] \leftarrow 0$;

end

for $j \leftarrow 0$ **to** n **do**

| $d[0, j] \leftarrow 0$;

end

```

//Dynamic Programming
for  $i \leftarrow 1$  to  $m$  do
    for  $j \leftarrow 1$  to  $n$  do
        if  $x_i$  is equal to  $y_j$  then
             $d[i, j] \leftarrow d[i - 1, j - 1] + 1$ ;
             $p[i, j] \leftarrow \text{"LU"}$ ; // "LU" indicates left up arrow.
        end
        else if  $d[i - 1, j] \geq d[i, j - 1]$  then
             $d[i, j] \leftarrow d[i - 1, j]$ ;
             $p[i, j] \leftarrow \text{"U"}$ ; // "U" indicates up arrow.
        end
        else
             $d[i, j] \leftarrow d[i, j - 1]$ ;
             $p[i, j] \leftarrow \text{"L"}$ ; // "L" indicates left arrow.
        end
    end
end
return  $d, p$ ;

```

Print – $LCS(p, X, i, j)$

Input: Array p generated from Longest-Common-Subsequence, string X , index i and j .
Output: Output the longest common subsequence of $X[1..i]$ and $Y[1..j]$.
if i is equal to 0 or j is equal to 0 then
| return NULL;
end
if $p[i, j]$ is equal to "LU" then
| Print-LCS($p, X, i - 1, j - 1$);
| print x_i ;
end
else if $p[i, j]$ is equal to "U" then
| Print-LCS($p, X, i - 1, j$);
end
else
| Print-LCS($p, X, i, j - 1$);
end

$$T(n) = O(mn)$$

4. 最长公共子串

Longest – Commom – Substring(X, Y)

Input: Two strings X, Y .
Output: Longest common substring of X and Y .
 $m \leftarrow \text{length}(X)$;
 $n \leftarrow \text{length}(Y)$;
Let $d[0..m, 0..n]$ be a new 2-dimension array;
 $l_{max} \leftarrow 0$;
 $p_{max} \leftarrow 0$;
//Initializaiton
for $i \leftarrow 0$ **to** m **do**
| $d[i, 0] \leftarrow 0$;
end
for $j \leftarrow 0$ **to** n **do**
| $d[0, j] \leftarrow 0$;
end

//Dynamic Programming
for $i \leftarrow 1$ **to** m **do**
| **for** $j \leftarrow 1$ **to** n **do**
| | **if** $x_i \neq y_j$ **then**
| | | $d[i, j] \leftarrow 0$;
| | **end**
| | **else**
| | | $d[i, j] \leftarrow d[i - 1, j - 1] + 1$;
| | | **if** $d[i, j] > l_{max}$ **then**
| | | | $l_{max} \leftarrow d[i, j]$;
| | | | $p_{max} \leftarrow i$;
| | | **end**
| | **end**
| **end**
end
return l_{max}, p_{max} ;

Print – $LCSubstring(X, l_{max}, p_{max})$

Input: String X , l_{max} and p_{max} are generated from Longest-Common-Substring.
Output: Output the longest common substring of $X[1..i]$ and $Y[1..j]$.
if l_{max} is equal to 0 **then**
| **return** *NULL*;
end
for $i \leftarrow (p_{max} - l_{max} + 1)$ **to** p_{max} **do**
| **print** x_i ;
end

$$T(n) = O(mn)$$

5. 最小编辑距离

Minimum – Edit – Distance(X, Y)

Input: Two strings X, Y .

Output: Minimum edit distance of X and Y .

$m \leftarrow \text{length}(X)$;

$n \leftarrow \text{length}(Y)$;

Let $d[0..m, 0..n]$ and $p[0..m, 0..n]$ be two new 2-dimension arrays;

//Initialization

for $i \leftarrow 0$ *to* m **do**

$d[i, 0] \leftarrow i$;

$p[i, 0] \leftarrow \text{"U"}$;

end

for $j \leftarrow 0$ *to* n **do**

$d[0, j] \leftarrow j$;

$p[0, j] \leftarrow \text{"L"}$;

end

//Dynamic Programming

for $i \leftarrow 1$ *to* m **do**

for $j \leftarrow 1$ *to* n **do**

if x_i *is not equal to* y_j **then**

$c \leftarrow 1$;

end

else

$c \leftarrow 0$;

end

if $d[i-1, j-1] + c \leq d[i-1][j] + 1$ *and*

$d[i-1, j-1] + c \leq d[i][j-1] + 1$ **then**

$d[i, j] \leftarrow d[i-1, j-1] + c$;

$p[i, j] \leftarrow \text{"LU"}$; *// "LU" indicates left up arrow.*

end

else if $d[i, j-1] + 1 < d[i-1][j] + 1$ *and*

$d[i, j-1] + 1 < d[i-1, j-1] + c$ **then**

$d[i, j] \leftarrow d[i, j-1] + 1$;

$p[i, j] \leftarrow \text{"L"}$; *// "L" indicates up arrow.*

end

else

$d[i, j] \leftarrow d[i-1, j] + 1$;

$p[i, j] \leftarrow \text{"U"}$; *// "U" indicates left arrow.*

end

end

end

return d, p ;

Print – $MED(p, X, i, j)$

```

Input: Array  $p$  generated from Minimum-Edit-Distance, string  $X$ , index  $i$  and  $j$ .
Output: Output the sequence of operations.
if  $i$  is equal to 0 and  $j$  is equal to 0 then
    | return NULL;
end
if  $p[i, j]$  is equal to "LU" then
    | Print-MED( $p, X, i - 1, j - 1$ );
    | if  $x_i$  is equal to  $y_j$  then
    | | print "Do nothing"
    | end
    | else
    | | print "Substitue  $x_i$  with  $y_j$ ";
    | end
end
else if  $p[i, j]$  is equal to "U" then
    | Print-MED( $p, X, i - 1, j$ );
    | print "Delete  $x_i$ ";
end
else
    | Print-MED( $p, X, i, j - 1$ );
    | print "Insert  $y_j$ ";
end

```

$$T(n) = O(mn)$$

6. 钢条切割

7. 矩阵链乘法

```

Let  $m[1..n, 1..n]$  and  $s[1..n, 1..n]$  be two 2-dimension arrays;
for  $i \leftarrow 1$  to  $n$  do
    |  $m[i, i] \leftarrow 0$ ;
end
for  $l \leftarrow 2$  to  $n$  do
    | for  $i \leftarrow 1$  to  $n - l + 1$  do
    | |  $j \leftarrow i + l - 1$ ;
    | |  $m[i, j] \leftarrow \infty$ ;
    | | for  $k \leftarrow i$  to  $j - 1$  do
    | | |  $q \leftarrow m[i, k] + m[k + 1, j] + p[i - 1] * p[k] * p[j]$ ;
    | | | if  $q < m[i, j]$  then
    | | | |  $m[i, j] \leftarrow q$ ;
    | | | |  $s[i, j] \leftarrow k$ ;
    | | | end
    | | end
    | end
end
return  $m[1, n]$  and  $s$ ;

```

$$T(n) = O(n^3)$$

贪心算法

- 提出贪心策略
- 证明策略正确

一个常见的方法是：假设最优方案为X，而贪心算法得到的结果为Y。若X与Y不同，则能够在保证X不变差的情况下将X转化为Y。

1. 部分背包

```
Input: Value array  $v$  and weight array  $w$  of  $n$  items, capacity of  
knapsack  $K$ .  
Output: Solution of maximum value.  
Let  $r[1..n], x[1..n]$  be two new arrays;  
for  $i \leftarrow 1$  to  $n$  do  
|  $r[i] \leftarrow v[i]/w[i]$ ;  
|  $x[i] \leftarrow 0$ ;  
end  
Sort the items in decreasing order of their ratios  $r$ , rename the items if  
necessary so that the sorted order of items is  $\langle 1, 2, \dots, n \rangle$ ;  
 $j \leftarrow 0$ ;  
while  $K > 0$  and  $j \leq n$  do  
|  $j \leftarrow j + 1$ ;  
| if  $K > w[j]$  then  
| |  $x[j] \leftarrow 1$ ;  
| |  $K \leftarrow K - w[j]$ ;  
| end  
| else  
| |  $x[j] \leftarrow K/w[j]$ ;  
| | break;  
| end  
end  
return  $x$ ;
```

2. 霍夫曼编码

```
Input: An alphabet  $A$  with frequency distribution.  
Output: Huffman tree.  
 $n \leftarrow |A|$ ;  
 $Q \leftarrow$  a new Priority Queue of  $A$ ;  
for  $i \leftarrow 1$  to  $n - 1$  do  
| // Why  $n - 1$ ?  
|  $z \leftarrow$  a new node;  
|  $z.left \leftarrow \text{Extract-Min}(Q)$ ;  
|  $z.right \leftarrow \text{Extract-Min}(Q)$ ;  
|  $z.freq \leftarrow z.left.freq + z.right.freq$ ;  
|  $\text{Insert}(Q, z)$ ;  
end  
return  $\text{Extract-Min}(Q)$ ;
```

$$T(n) = O(n \log n)$$

3. 活动选择

```

Input: a set of activities  $A = a_1, a_2, \dots, a_n$ 
Output: the largest subset of  $A$  that do not overlap
Sort activities in increasing order of finishing time;
 $P = a_1$ ; // insert the activity with earliest finishing time
 $k = 1$ ; // index to the last activity in  $A$ 
for  $i \leftarrow 2$  to  $n$  do
    if  $s[i] \geq f[k]$  then
        //  $i$  starts after  $k$  finishes - no overlap
         $P \leftarrow P \cup a_i$ ;
         $k \leftarrow i$ ;
    end
end
return  $P$ ;

```

时间复杂度主要来自排序算法

$$T(n) = O(n \log n)$$

带权重的活动选择——动态规划

```

Input: a set of activities  $A = a_1, a_2, \dots, a_n$ 
Output: the max weight of any subset of mutually compatible activities
Sort activities by finishing time and renumber so that  $f_1 \leq f_2 \leq \dots \leq f_n$ ;
Compute  $p[1], p[2], \dots, p[n]$  via binary search;
 $OPT[0] \leftarrow 0$ ;
for  $j = 1$  to  $n$  do
    |  $OPT[j] \leftarrow \max\{OPT[j-1], w_j + OPT[p[j]]\}$ ;
end
return  $OPT[n]$ ;

```

$$T(n) = O(n \log n)$$

4. 最小生成树

5. 单源最短路径

图算法

1. 图的基本概念

2. 广度优先搜索

- $color[u]$: the color of each vertex visited

WHITE: undiscovered

GRAY: discovered but not finished processing

BLACK: finished processing

- $pred[u]$: the predecessor pointer

pointing back to the vertex from which u was discovered

- $d[u]$: the distance from the source to vertex u

$BFS(G)$

```
Input: A graph  $G$ 
Output: None
//Initialize
for  $u$  in  $V$  do
     $color[u] \leftarrow WHITE$ ; //undiscovered
     $pred[u] \leftarrow NULL$ ; //no predecessor
end
for  $u$  in  $V$  do
    //start a new tree
    if  $color[u]$  is equal to  $WHITE$  then
         $BFSVisit(u)$ ;
    end
end
```

$BFSVisit(s)$

```
Input: A vertex  $s$ 
Output: None
 $color[s] \leftarrow GRAY, d[s] \leftarrow 0$ ;
 $Q \leftarrow \emptyset, Enqueue(Q, s)$ ;
while  $Q \neq \emptyset$  do
     $u \leftarrow Dequeue(Q)$ ;
    for  $v \in Adj[u]$  do
        if  $color[v] \leftarrow WHITE$  then
             $color[v] \leftarrow GRAY$ ;
             $d[v] \leftarrow d[u] + 1$ ;
             $pred[v] \leftarrow u$ ;
             $Enqueue(Q, v)$ ;
        end
    end
     $color[u] \leftarrow BLACK$ ;
end
```

$T(n) = O(V + E)$

3. 深度优先搜索

- $color[u]$: the color of each vertex visited

$WHITE$: undiscovered

$GRAY$: discovered but not finished processing

$BLACK$: finished processing

- $pred[u]$: the predecessor pointer

pointing back to the vertex from which u was discovered

- $d[u]$: the discovery time

a counter indicating when vertex u is discovered

- $f[u]$: the finishing time

| a counter indicating when the processing of vertex u (and all its descendants) is finished

$DFS(G)$

```
Input: A graph  $G$   
Output: None  
for  $u$  in  $V$  do  
|  $color[u] \leftarrow WHITE$ ; //undiscovered  
|  $pred[u] \leftarrow NULL$ ; //no predecessor  
end  
 $time \leftarrow 0$ ;  
for  $u$  in  $V$  do  
| //start a new tree  
| if  $color[u]$  is equal to  $WHITE$  then  
| |  $DFSVisit(u)$ ;  
| end  
end
```

$DFSVisit(u)$

```
Input: A vertex  $u$   
Output: None  
 $color[u] \leftarrow GRAY$ ; //u is discovered  
 $d[u] \leftarrow ++time$ ; //u's discovery time  
for  $v \in Adj(u)$  do  
| //Visit undiscovered vertex  
| if  $color[v]$  is equal to  $WHITE$  then  
| |  $pred[v] \leftarrow u$ ;  
| |  $DFSVisit(v)$ ;  
| end  
end  
 $color[u] \leftarrow BLACK$ ; //u has finished  
 $f[u] \leftarrow ++time$ ; //u's finish time
```

$T(n) = O(V + E)$

4. 环路检测

5. 拓扑排序

```

Input: A graph  $G$ 
Output: None
Initialize  $Q$  to be an empty queue;
for  $u \in V$  do
    if  $u.in\_degree$  is equal to 0 then
        //Find all starting vertices
        Enqueue( $Q, u$ );
    end
end
while  $Q$  is not empty do
     $u \leftarrow$  Dequeue( $Q$ );
    Output  $u$ ;
    for  $v \in Adj(u)$  do
        //remove u's outgoing edges
         $v.in\_degree \leftarrow v.in\_degree - 1$ ;
        if  $v.in\_degree$  is equal to 0 then
            Enqueue( $Q, v$ );
        end
    end
end

```

出队顺序即为输出顺序

$$T(n) = O(V + E)$$

6. 强联通分量

```

Input: A directed graph  $G$ 
Output: The set of strongly connected components  $R$ 
 $R \leftarrow \{\}$ ; // set of SCCs
 $G^R \leftarrow$  reverse graph of  $G$ ;
 $L^R \leftarrow$  DFS-b( $G^R$ ); // Perform DFS
 $L \leftarrow$  reverse order of  $L^R$ ;
for  $u \in L$  do
    if  $color[u]$  is equal to WHITE then
         $Lscc \leftarrow$  DFSVisit( $G, u$ ); // Perform DFS starting at u
         $R \leftarrow R \cup Set(Lscc)$ ;
    end
end
return  $R$ ;

```

$$T(n) = O(V + E)$$

连通图是有向无环图

7. 最小生成树

- Prim算法

```

Input: A graph  $G$ , a matrix  $w$  representing the weights between vertices
in  $G$ , the algorithm will start at root vertex  $r$ 
Output: None
Let  $color[1...|V|]$ ,  $key[1...|V|]$ ,  $pred[1...|V|]$  be new arrays;
for  $u \in V$  do
    |  $color[u] \leftarrow WHITE, key[u] \leftarrow +\infty$ ; // Initialize
end
 $key[r] \leftarrow 0, pred[r] \leftarrow NULL$ ; // Start at root vertex
 $Q \leftarrow \text{new PriQueue}(V)$ ; // put vertices in  $Q$ 
while  $Q$  is nonempty do
    |  $u \leftarrow Q.\text{Extract-Min}()$ ; // lightest edge
    for  $v \in adj[u]$  do
        | if  $(color[v] \leftarrow WHITE) \&\& (w[u, v] < key[v])$  then
            | |  $key[v] \leftarrow w[u, v]$ ; // new lightest edge
            | |  $Q.\text{Decrease-Key}(v, key[v])$ ;
            | |  $pred[v] \leftarrow u$ ;
        | end
    end
    |  $color[u] \leftarrow BLACK$ ;
end

```

结果由 $pred[]$ 表示

$key[]$ 之和为选中的边权重之和

$$T(n) = O(E \log V)$$

- Kruskal算法

```

Input: A graph  $G$ , a matrix  $w$  representing the weights between vertices
in  $G$ 
Output: MST of  $G$ 
Sort  $E$  in increasing order by weight  $w$ ; //  $O(|E| \log |E|)$ 
// After sorting  $E = \langle \{u_1, v_1\}, \{u_2, v_2\}, \dots, \{u_{|E|}, v_{|E|}\} \rangle$ 
 $A \leftarrow \{\}$ ;
for  $u \in V$  do
    |  $\text{Create-Set}(u)$ ; //  $O(|V|)$ 
end
for  $e_i \in E$  do
    | //  $O(|E| \log |V|)$ 
    | if  $\text{Find-Set}(u_i) \neq \text{Find-Set}(v_i)$  then
        | | add  $\{u_i, v_i\}$  to  $A$ ;
        | |  $\text{Union}(u_i, v_i)$ ;
    | end
end
return  $A$ ;

```

$$T(n) = O(E \log V)$$

8. 单源最短路径

- BFS

适用于无权图

- Dijkstra算法

要求所有边权重为非负值


```

Input: A graph  $G$ , a matrix  $w$  representing the weights between vertices
in  $G$ , source vertex  $s$ 
Output: None
for  $u \in V$  do
|  $d[u] \leftarrow \infty, color[u] \leftarrow \text{WHITE};$  // Initialize
end
 $d[s] \leftarrow 0;$ 
 $pred[s] \leftarrow \text{NULL};$ 
 $Q \leftarrow$  queue with all vertices;
while  $Non-Empty(Q)$  do
| // Process all vertices
|  $u \leftarrow \text{Extract-Min}(Q);$  // Find new vertex
| for  $v \in Adj[u]$  do
| | if  $d[u] + w(u, v) < d[v]$  then
| | | // If estimate improves
| | |  $d[v] \leftarrow d[u] + w(u, v);$  // relax
| | |  $\text{Decrease-Key}(Q, v, d[v]);$ 
| | |  $pred[v] \leftarrow u;$ 
| | end
| end
|  $color[u] \leftarrow \text{BLACK};$ 
end

```

$$T(n) = O(E \log V)$$

- Bellman-Ford算法

$Relax(u, v)$

```

Input: Update estimation of  $u$  according to distance of  $v$ 
Output: None
if  $d[u] + w(u, v) < d[v]$  then
|  $d[v] \leftarrow d[u] + w(u, v);$ 
|  $pred[v] \leftarrow u;$ 
end

```

$Bellman - Ford(G, w, s)$

```

Input: A directed graph  $G$ , weights  $w$ , and the source vertex  $s$ 
Output: Return FALSE if  $G$  contains negative cycle, return TRUE if
shortest paths from  $s$  to any other vertices obtained.
for  $u \in V$  do
|  $d[u] \leftarrow \infty, pred[u] \leftarrow \text{NIL};$  // Initialize
end
for  $i \leftarrow 1$  to  $|V| - 1$  do
| for  $e \in E$  do
| |  $RELAX(u, v, w);$ 
| end
end
for  $e \in E$  do
| if  $d[v] > d[u] + w(u, v)$  then
| | return FALSE;
| end
end
return TRUE;

```

$$T(n) = O(EV)$$

处理难问题

1. 问题分类

- P

在多项式时间内可以解决的问题，即可以在 $O(n^k)$ 内解决

- NP

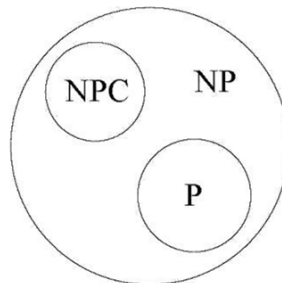
在多项式时间内可以被证明的问题

- NPC

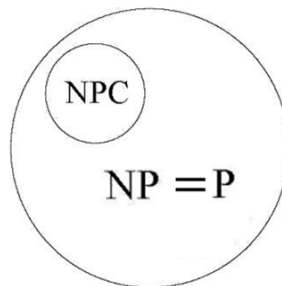
NP完全问题

说明：

- $P \subset NP$
- 如果 $NP \neq P$



- 如果 $NP = P$



2. 证明问题为NPC问题

- 证明 $Y \in NP$
- 寻找一个已知的NPC问题X，并证明 $X \leq_p Y$.

如何证明 $X \leq_p Y$?

使用Y的结果解决X

- 对问题X的任意一个输入x, 将其映射为Y的一个输入 $f(x)$ 。
- 证明问题X在输入x的条件下返回“yes”当且仅当问题Y在输入 $f(x)$ 的条件下返回“yes”。

3. NPC问题举例

- SAT问题（布尔可满足性问题）

某一个布尔表达式是不是“可满足”的问题

“可满足”的意思是存在一组“真值赋值”使得布尔表达式为真

3-SAT问题

某个具有特殊形式的布尔表达式是否可满足的问题

特殊形式指“3合取范式”或“3-CNF”

- DCLIQUE（团问题）

寻找图中规模最大的团

团：完全子图

- Decision Vertex Cover (DVC)（顶点覆盖问题）

寻找图的最小顶点覆盖

顶点覆盖 V ：原图的每一条都有至少一个端点在 V 内

- Decision Independent Set (DIS) (独立集问题)

寻找图的最大独立集

独立集 V ：其内任意一对顶点之间都没有边相连