

Some Classic Algorithm

1.

Description:

Find the j th smallest number in A (unsorted array).

Algorithm(for median):

1 Partition array A into $\text{ceiling}(n/5)$ lists of 5 items each.

$L1 = \{A[1]; A[2]; : : : ; A[5]\}$, $L2 = \{A[6]; : : : ;$

$A[10]\}$, $: : :$,

$L_i = \{A[5i - 4]; : : : ; A[5i]\}$, $: : :$,

$L(\text{ceiling}(n/5)) = L_{\text{ceiling}(n/5)} = \{A[5 * \text{ceiling}(n/5) - 4]; : : : ;$

$A[n]\}$.

2 For each find median b_i of L_i using brute-force in $O(1)$

time. Total $O(n)$ time

3 Let $B = \{b_1; b_2; : : : ; b_{\text{ceiling}(n/5)}\}$

4 Find median b of B

Code:

```
select(A, j):
  Form lists L1; L2; : : : ; L_ceil(n/5)
  Find median b_i of each L_i using brute-force
  Find median b of B = {b1; b2; : : : ; b_ceil(n/5)}
  Partition A into A_less and A_greater using b as pivot
  if (|A_less|) = j return b
  else if (|A_less|) > j
    return select(A_less, j)
  else
    return select(A_greater, j - |A_less|)
```

Running Time:

$T(n) = T(n/5) + \max\{T(|A_{\text{less}}|), T(|A_{\text{greater}}|)\} + O(n)$

From Lemma,

$T(n) \leq T(\text{ceiling}(n/5)) + T(\text{floor}(7n/10 + 6)) + O(n)$

and

$T(n) = O(1) \quad n < 10$

conclude

$T(n) = O(n)$

2.

Description:

Find the longest increasing subsequence inside a given sequence $A[]$.

Algorithm:

Use $L[i]$ to record the longest increasing subsequence end in

$A[i]$. And $D[i]$ to record the previous element in this subsequence.

Outer loop through $A[]$, and inner loop check every element before the current element to find the longest increasing loop end in current loop, fill $L[i]$ and $D[i]$.

Code:

```
LIS(A[1::n]):
  Array L[1::n] (* L[i] stores the value LISEnding(A[1..i]) *)
  Array D[1::n] (* D[i] stores how L[i] was computed *)
  m = 0, h = 0 (* m is the length of the LIS *)
  for i = 1 to n do
```

```

    L[i] = 1
    D[i] = 0
    for j = 1 to i - 1 do
        if (A[j] < A[i]) and (L[i] < 1 + L[j]) do
            L[i] = 1 + L[j], D[i] = j
        if (m < L[i]) m = L[i], h = i
    S = empty sequence
    while (h > 0) do
        add L[h] to front of S
        h = D[h]
    Output optimum value m, and an optimum subsequence S
Running time:  $O(n^2)$  Space:  $O(n)$ .

```

3.

Description:

Check if a string w is in L^k , where L is a language and k is an non-negative integer.

Algorithm:

Loop through each element to see if the substring before it (inclusive) is in L , and the substring after it is in $L^{(k-1)}$.

Code:

```

IsStringinLk(A[1::n]; k):
If (k = 0)
    If (n = 0) Output YES
    Else Output NO
If (k = 1)
    Output IsStringinL(A[1::n])
Else
    For (i = 1 to n - 1) do
        If (IsStringinL(A[1::i]) and IsStringinLk(A[i
+ 1::n]; k - 1))
            Output YES
    Output NO

```

Running time: $O(n^2 * k)$

4.

Description:

Given two words $X (x_1, \dots, x_m)$ and $Y (y_1, \dots, y_n)$, and gap penalty S and mismatch costs V_{pq} . Find alignment of minimum cost.

Algorithm:

$M(i; j)$ records the cost if before x_i and y_j is matched (inclusive).

$$M(i; j) = \min\{$$

$$V(x_i, y_j) + M[i-1][j-1]$$

$$S + M[i-1][j] \text{ (*match } x_i$$

$$S + M[i][j-1] \text{ (*match } y_j$$

$$\}$$

Using two arrays, $N[i, 0]$ records $M[i-1]$, $N[i, 1]$

records $M[i]$. Fill the array.

Code:

```
for all i do  $N[i; 0] = i * S$ 
for j = 1 to n do
     $N[0; 1] = j * S$  (* corresponds to  $M(0; j)$  *)
for i = 1 to m do
     $N[i; 1] = \min\{$ 
 $N[i-1; 0]$ 
 $1]$ 
 $S + N[i-1;$ 
 $S + N[i; 0]$ 
 $\}$ 
for i = 1 to m do
    Copy  $N[i; 0] = N[i; 1]$ 
```

Running Time:

$O(mn)$, Space $O(m)$.

5.

Description:

Find maximum weight independent set in T (T is a tree).

Algorithm:

See code.

Code:

```
MIS-Tree( $T$ ):
Let  $v_1; v_2; \dots; v_n$  be a post-order traversal of nodes of  $T$ 
for i = 1 to n do
     $M[v_i] = \max\{$ 
 $\text{sum of } M[v_j], v_j \text{ is the}$ 
 $\text{child of } v_i$ 
 $w(v_i) + \text{sum of } M[v_j], v_j \text{ is}$ 
 $\text{the grandchild of } v_i$ 
 $\}$ 
return  $M[v_n]$  (* Note:  $v_n$  is the root of  $T$  *)
```

Running Time:

$O(n)$

6.

Description:

A set of jobs with start and finish times to be scheduled on a resource. Schedule as many jobs as possible.

Algorithm:

Schedule the earliest finish time job.

Code:

```
 $R$  is the set of all requests
 $X$  is empty; (*  $X$  stores the jobs that will be scheduled *)
while  $R$  is not empty
    choose  $i$  in  $R$  such that finishing time of  $i$  is
smallest
    if  $i$  does not overlap with requests in  $X$ 
        add  $i$  to  $X$ 
    remove  $i$  from  $R$ 
```

return X
Running Time:
 $O(n \log n)$

7.

Some basic graph problems.

Graph Search and Find Tree $O(m+n)$:

Explore(G,u):

array Visited[1::n]

Initialize: Set Visited[i] = FALSE for $1 \leq i \leq n$

List: ToExplore, S

Add u to ToExplore and to S, Visited[u] = TRUE

Make tree T with root as u

while (ToExplore is non-empty) do

 Remove node x from ToExplore

 for each edge (x; y) in Adj(x) do

 if (Visited[y] == FALSE)

 Visited[y] = TRUE

 Add y to ToExplore

 Add y to S

 Add y to T with edge (x; y)

Output S

BFS: use queue to implement ToExplore

DFS: use stack to implement ToExplore

Follow Ups:

Q: Find all nodes that can reach u.

A: Form Grev that reverse every edge of G. Do basic search on

Grev.

Q: Find all strongly connected components containing u.

(SCC(u)).

A: $SCC(G; u) = rch(G; u) \cup rch(Grev; u)$

Q: Is G strongly connected?

A: For any v check if $|SCC(u)| = |V|$.

8.

Description:

Given G, is it a DAG? If it is, generate a topological sort.

Else output a cycle C.

Algorithm:

Record the time we visit each node when running DFS on G.

1 Tree edges that belong to T

2 A forward edge is a non-tree edges (x; y) such that $pre(x) < pre(y) < post(y) < post(x)$.

3 A backward edge is a non-tree edge (y; x) such that $pre(x) < pre(y) < post(y) < post(x)$.

4 A cross edge is a non-tree edges (x; y) such that the intervals $[pre(x); post(x)]$ and $[pre(y); post(y)]$ are disjoint.

G has a cycle iff there is a back-edge in DFS(G).

If there is a back edge $e = (v; u)$ then G is not a DAG. Output cycle C formed by path from u to v in T plus edge (v; u).

Otherwise output nodes in decreasing post-visit order. Note: no need to sort, DFS(G) can output nodes in this order.

Code (for DFS):

```
DFS(u)
    Mark u as visited
    pre(u) = ++time
    for each edge (u; v) in Out(u) do
        if v is not visited
            add edge (u; v) to T
            DFS(v)
    post(u) = ++time
```

Running Time:

$O(m+n)$

9.

:

Find all SCC in a graph G and obtain meta-graph.

Algorithm:

Form a topological sort then we can guarantee the source is always at front. DFS(u) only visits edges and vertices in SCC(u).

Code:

```
do DFS(Grev) and output vertices in decreasing post order.
Mark all nodes as unvisited
for each u in the computed order do
    if u is not visited then
        DFS(u)
        Let Su be the nodes reached by u
        Output Su as a strong connected component
        Remove Su from G
```

Running Time:

$O(m + n)$

10.

BFS with layers:

BFSLayers(s):

Mark all vertices as unvisited and initialize T to be

empty

Mark s as visited and set $L_0 = \{s\}$

$i = 0$

while L_i is not empty do

 initialize L_{i+1} to be an empty list

 for each u in L_i do

 for each edge (u; v) in Adj(u) do

 if v is not visited

 mark v as visited

 add (u; v) to tree

T

 add v to L_{i+1}

$i = i + 1$

Running time: $O(n + m)$

Properties:

BFSLayers(s) outputs a BFS tree

L_i is the set of vertices at distance exactly i from s

Every edge in the graph is either between two vertices that

are either (i) in the same layer (cross edge), or (ii) in two consecutive layers.

11.

Description:

Find shortest paths for all pairs of nodes (all edges are non negative) for a given node u .

Algorithm:

Dijkstra's Algorithm: Loop through every node, put the computed node in X . Start from u , find the closest node v to X from $V - X$. Update the distance between s and every node in $\text{Adj}(v)$.

Code:

```
Initialize for each node  $v$ ,  $\text{dist}(s; v) = \text{infinity}$ 
Initialize  $X = \text{empty}$ ;;  $\text{dist}(s; s) = 0$ 
for  $i = 1$  to  $|V|$  do
    Let  $v$  be such that  $\text{dist}(s; v) = \min(u \text{ in } V - X)$ 
 $\text{dist}(s; u)$ 
     $X = X + \{v\}$ 
    for each  $u$  in  $\text{Adj}(v)$  do
         $\text{dist}(s; u) = \min\{\text{dist}(s; u); \text{dist}(s; v) +$ 
 $l(v; u)\}$ 
```

Code using Priority Queues:

```
 $Q = \text{makePQ}()$ 
 $\text{insert}(Q, (s; 0))$ 
for each node  $u \neq s$  do
     $\text{insert}(Q, (u, \text{infinity}))$ 
 $X = \text{empty}$ ;
for  $i = 1$  to  $\{V\}$  do
     $(v; \text{dist}(s; v)) = \text{extractMin}(Q)$ 
     $X = X + \{v\}$ 
    for each  $u$  in  $\text{Adj}(v)$  do
         $\text{decreaseKey}\{Q; (u, \min(\text{dist}(s; u); \text{dist}(s; v)$ 
 $+ l(v; u)))\}$ 
```

Code to find the shortest path:

```
 $Q = \text{makePQ}()$ 
 $\text{insert}(Q, (s; 0))$ 
 $\text{prev}(s) = \text{null}$ 
for each node  $u \neq s$  do
     $\text{insert}(Q, (u; \text{infinity}))$ 
     $\text{prev}(u) = \text{null}$ 
 $X = \text{empty}$ ;
for  $i = 1$  to  $|V|$  do
     $(v; \text{dist}(s; v)) = \text{extractMin}(Q)$ 
     $X = X + \{v\}$ 
    for each  $u$  in  $\text{Adj}(v)$  do
        if  $(\text{dist}(s; v) + l(v; u) < \text{dist}(s; u))$  then
             $\text{decreaseKey}(Q, (u; \text{dist}(s; v) + l(v; u)))$ 
             $\text{prev}(u) = v$ 
```

The edge set $(u; \text{prev}(u))$ is the reverse of a shortest path tree rooted at s . For each u , the reverse of the path from u to s in the tree is a shortest path from s to u .

Running Time:

$O((n + m) \log n)$ with heaps

$O(n \log n + m)$ with Fibonacci Heaps

12.

Description:

Check if there is negative length cycle reachable from s , if not find the shortest path distances.

Algorithm:

Bellman-Ford Algorithm:

$d(v; k)$: shortest walk length from s to v using at most k

edges.

Note: $\text{dist}(s; v) = d(v; n - 1)$. Recursion for $d(v; k)$:

$d(v; k) = \min\{$

$\min(u \in V) (d(u; k - 1) +$

$l(u; v))$

$d(v; k - 1)$

$\}$

Base case: $d(s; 0) = 0$ and $d(v; 0) = \text{infinity}$ for all $v \neq s$.

Code:

for each u in V do

$d(u) = \text{infinity}$

$d(s) = 0$

for $k = 1$ to $n - 1$ do

for each v in V do

for each edge $(u; v)$ in $\text{In}(v)$ do

$d(v) = \min\{d(v); d(u) + l(u; v)\}$

(* One more iteration to check if distances change *)

for each v in V do

for each edge $(u; v)$ in $\text{In}(v)$ do

if $(d(v) > d(u) + l(u; v))$

Output "Negative Cycle"

for each v in V do

$\text{dist}(s; v) = d(v)$

Running Time:

$O(mn)$ Space: $O(m + n)$

13.

Description:

Find shortest distance for every node from s in a DAG.

Algorithm:

As there are no cycles in DAG, we can run shortest path for it.

Code:

for $i = 1$ to n do

$d(s; v_i) = \text{infinity}$

$d(s; s) = 0$

for $i = 1$ to $n - 1$ do

for each edge $(v_i; v_j)$ in $\text{Adj}(v_i)$ do

$d(s; v_j) = \min\{d(s; v_j); d(s; v_i) + l(v_i;$

$v_j)\}$

return $d(s;)$ values computed

Running Time:

$O(m + n)$

14.

Description:

Find shortest paths for all pairs of nodes.

Algorithm:

Floyd-Warshall Algorithm:

Code:

```
for i = 1 to n do
    for j = 1 to n do
        dist(i; j; 0) = l(i; j) (* l(i; j) = infinity
if (i; j) not in E, 0 if i = j *)
    for k = 1 to n do
        for i = 1 to n do
            for j = 1 to n do
                dist(i; j; k) = min{dist(i; j; k -
1); dist(i; k; k - 1) + dist(k; j; k - 1)}
        for i = 1 to n do
            if (dist(i; i; n) < 0) then
                Output that there is a negative length cycle
```

in G

Running Time:

$O(n^3)$ Space: $O(n^3)$.

15.

Description:

Find the MST in a graph.

Algorithm:

Kruskal: Process edges in the order of their costs (starting from the least) and add edges to T as long as they don't form a cycle.

Prim: T maintained by algorithm will be a tree. Start with a node in T. In each iteration, pick edge with least attachment cost to T.

Reverse Delete Algorithm: Process edges in the order of their costs (starting from the greatest) and remove edges from T as long as they don't form disconnect.

Boruvka: While T is not spanning, for every connected component, add the cheapest edge connect to it to T.

Code:

Prim:

Prim ComputeMST

E is the set of all edges in G

$S = \{1\}$

T is empty (* T will store edges of a MST *)

for v not in S, $a(v) = \min (w \text{ in } S) c(w; v)$

for v not in S, $e(v) = w$ such that $w \text{ in } S$ and $c(w; v)$

is minimum

while $S \neq V$ do

pick v with minimum $a(v)$

add $(e(v); v)$ to T

add v to S


```

        update arrays a and e
    add e to T
    add w to S
    return the set T
Maintain vertices in  $V \setminus S$  in a priority queue with key  $a(v)$ .
Kruskal:
    Kruskal ComputeMST
        Sort edges in E based on cost
        T is empty (* T will store edges of a MST *)
        each vertex u is placed in a set by itself
        while E is not empty do
            pick e = (u; v) in E of minimum cost
            if u and v belong to different sets
                add e to T
                merge the sets containing u
            and v
        return the set T
Boruvka:
    T is empty; (* T will store edges of a MST *)
    while T is not spanning do
        X is empty;
        for each connected component S of T do
            add to X the cheapest edge between S and  $V \setminus S$ 
        Add edges in X to T
    return the set T
Running Time:
    Prim:  $O((m + n) \log n)$  with standard heaps
            $O(n \log n + m)$  with Fibonacci Heaps
    Kruskal:  $O((m + n) \log m)$  with Union-Find data structure
    Boruvka:  $O(m \log n)$ 

```