

Longest increasing subseq (LIS)

- single seq of numbers

$$A = [5, 1, 3, 2, 7, 9]$$

inc. sub. seq. $[5, 7, 9] \checkmark$

$[1, 3, 7, 9] \checkmark$

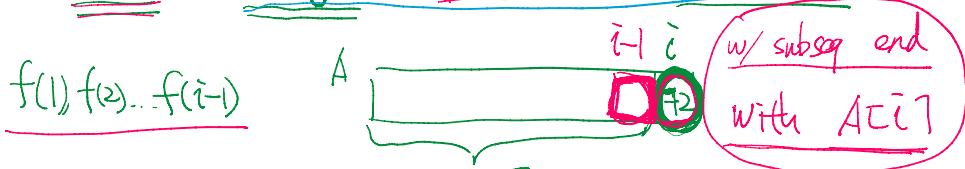
$\underline{[5, 2, 7]} \times$

LIS of A $[1, 2, 7, 9]$

or $[1, 3, 7, 9]$

- output: length of LIS.

$f(i)$:= length of LIS given $A[1 \dots i]$

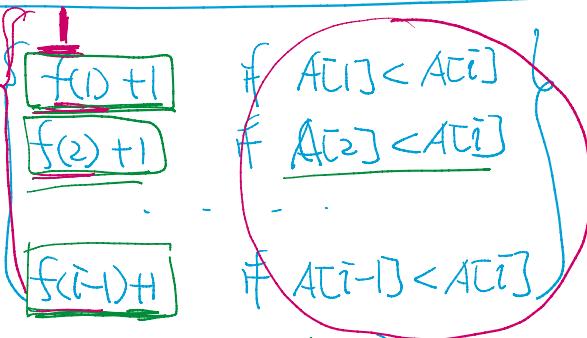


$$f(i-1) = 11$$

① if $A[i-1] < A[i]$
 $f(i)$ can be $f(i-1) + 1$

② if $A[i-1] > A[i]$
 $f(i-1)$ is useless

$$f(i) = \max$$



$$\max \{ \max \{ f(k)+1 \} \mid k \}$$

$$\max \left\{ \max_{k=1 \dots i-1} \{ f(k) + 1 \}, 1 \right\}$$

A[1] A[2]

A[i-1]

$$f(0) = 0 \quad f(1) = 1$$

LIS(A[1 ... n]) {

$$dp[1] = 1;$$

dp [] [] [] []

for ($i = 2, \dots, n$) {

$$dp[i] = 1;$$

for ($k = 1 \dots i-1$) {

if ($A[k] < A[i]$) {

$$dp[i] = \max(dp[i], dp[k]+1);$$

} } return max(dp[]);

(A)

r.t. $O(n^2)$

space $O(n)$

LIS

is similar to

LCS

reduction

(B)

LIS

A \Rightarrow

A
B = sort(A)

LCS

$O(n \log n)$

$O(n^2)$

given matrix of positive integer

A - start anywhere on A

=

5	1	2
3	7	1
4	5	6

- 

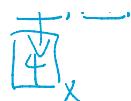
inc path

inc. path

 ✓
 X

inc path

inc. path



- Q: length of longest path?

$f(i, j)$ = Long inc. path that end with
position (i, j)

$$f(i, j) = \max \begin{cases} \textcircled{1} & \text{if } A[i, j-1] < A[i, j] \\ & f(i, j-1) + 1 \\ \textcircled{2} & \text{if } A[i-1, j] < A[i, j] \\ & f(i-1, j) + 1 \\ \textcircled{3} & 1 \end{cases}$$

LIP($A[1, n]$)

①
for ($i=2 \dots n$) {
 if ($A[i-1, 1] < A[i, 1]$) {
 $dp[i, 1] = dp[i-1, 1] + 1$
 } else {
 $dp[i, 1] = 1$
 }
}
fill the 1st col in dp
LIS

②
for ($j=2 \dots m$) {
 if ($A[1, j-1] < A[1, j]$) {
 $dp[1, j] = dp[1, j-1] + 1$
 } else {
 $dp[1, j] = 1$
 }
}
fill the 1st row in dp .
f(i)

③
for ($i = 2 \dots n$) {
 for ($j = 2 \dots m$) {
 $dp[i, j] = 1$
 if ($A[i-1, j] < A[i, j]$) {
 $dp[i, j] = dp[i-1, j] + 1$
 }
 }
}
fill rest

```

X' | if ( $A[i-1, j] < A[i, j]$ )
    |      $dp[i, j] = \max(dp[i, j], dp[i-1, j])$ 
    | if ( $A[i, j-1] < A[i, j]$ )
    |      $dp[i, j] = \max(dp[i, j], dp[i, j-1])$ 
    |
    | } return  $\max(dp[ ])$ 
}

```

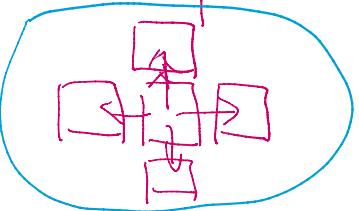
(A) easy (B) okay (C) hard $\textcircled{2}$

```

` for ( $i=1 \dots n$ ) {
    for ( $j=1 \dots n$ ) {
         $dp[i, j] = 1;$ 
        if ( $i-1 \geq 1 \& A[i-1, j] < A[i, j]$ )
             $dp[i, j] = \max(dp[i, j], dp[i-1, j])$ ;
        if ( $j-1 \geq 1 \& A[i, j-1] < A[i, j]$ )
             $dp[i, j] = \max(dp[i, j], dp[i, j-1])$ ;
    }
}
return  $\max(dp[ ])$ ;

```

- given matrix A (positive integer)
- inc path

- inc path
- 

- can choose any starting position

- Q: length of LIP

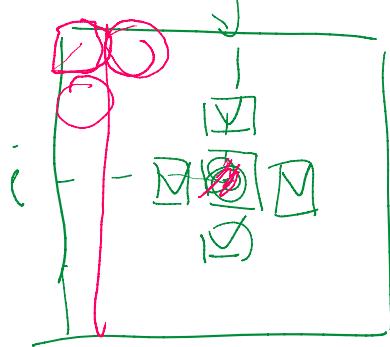
$f(i, j)$: length of LIP ended w/ $A[i, j]$

$$f(i, j) = \begin{cases} 1 & \\ f(i-1, j)+1 & \text{if } A[i-1, j] < A[i, j] \\ f(i, j-1)+1 & \text{if } A[i, j-1] < A[i, j] \\ f(i+1, j)+1 & \text{if } A[i+1, j] < A[i, j] \\ f(i, j+1)+1 & \text{if } A[i, j+1] < A[i, j] \end{cases}$$



 i j

bottom up vs top down ??



+ LIP(A[], dp[], i, j)

+ $(dp[i, j] \neq -1)$

return $dp[i, j]$ $f(i, j)$

return $\text{LIP}(A, dp, i, j)$
 $\boxed{\text{val} = 1;}$
 if ($i-1 \geq 1$ & $A[i-1, j] < A[i, j]$)
 $\text{val} = \max(\text{val}, \underline{\text{LIP}}(A, dp, i-1, j))$
 if ($j-1 \geq 1$ & $A[i, j-1] < A[i, j]$)
 $\text{val} = \max(\text{val}, \underline{\text{LIP}}(A, dp, i, j-1))$
 if ($i+1 \leq n$ ---)
 if ($j+1 \leq m$ ---)
 $dp[i][j] = \text{val};$
 return val.

```

for (i=1---n)
  for (j=1---m)
     $\underline{\text{LIP}}(A, dp, i, j)$ 
return  $\max(dp[1:n][1:m])$ 
```



running time -
 $\underline{\mathcal{O}(nm)}$

A

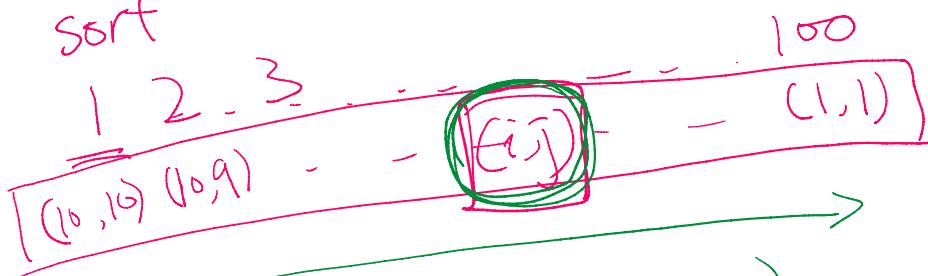
10	99	98	...	91
81	80	79	...	71
10	99	98	...	91
10	99	98	...	91

Space $O(n^m)$

bottom up?? Yes

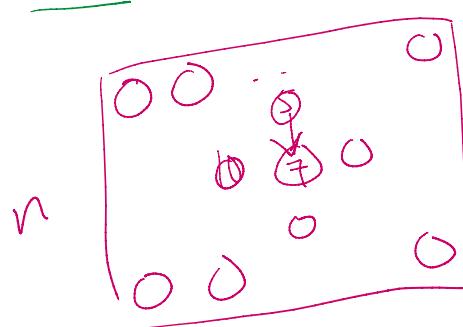
- find minimum

- sort



$O(nm \lg(nm)) + nm$

- topological sort
 $O(nm)$



- 4 steps

- recursion design

- bottom up vs top down

{ - 2 seg ((CS, Ed))
- 1 seg (palindrome, LIS)
- knapsack
- interval (matrix multiplication)

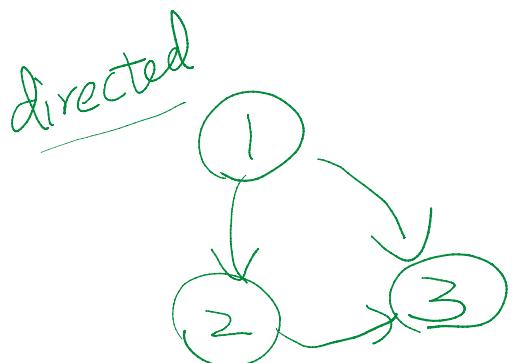
- bottom up vs top down
- interval (max sum)
- position (LIP)

Graph algorithms

- graph search (bfs, dfs) }
- shortest path
- mst undirected

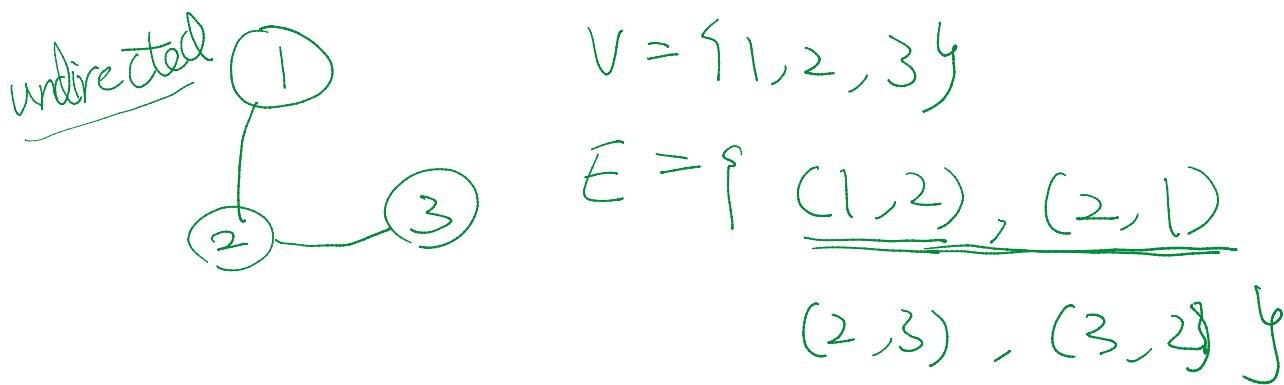
Graph $G = \underline{\underline{V}}, \underline{\underline{E}}$
 set of vertices set of edge.

} directed graph
 undirected graph



$$V = \{1, 2, 3\}$$

$$E = \{(1, 2), (2, 3), (3, 1)\}$$



$$V = \{1, 2, 3\}$$

$$E = \{ \underline{(1, 2)}, \underline{(2, 1)} \}$$

$$(2, 3), (3, 2) \}$$

$$|V| = n \quad |E| = m$$

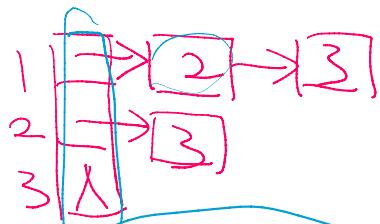
$$|V| = n \quad |E| = m$$

$$\boxed{O(n+m)}$$

$$O(|V| + |E|)$$

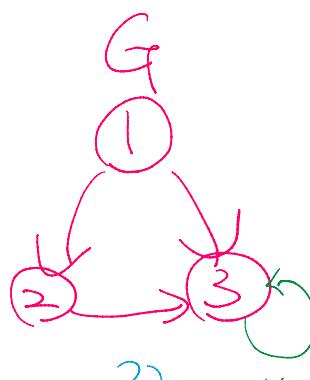
graph representation

adj. list



space complexity

$$\boxed{O(n+m)}$$



$\boxed{O(n^2)}$ self loop

adj matrix

A	1	2	3
1	T/F	T	T
2	F	T/F	T
3	F	F	T/F

$$A[i,j] = \begin{cases} T & (i,j) \in E \\ F & \text{o/w} \end{cases}$$

density

[sparse graph]
[dense graph]

social network

complete graph



- run time for operation

① given vertex u ,
traverse all its neighbors

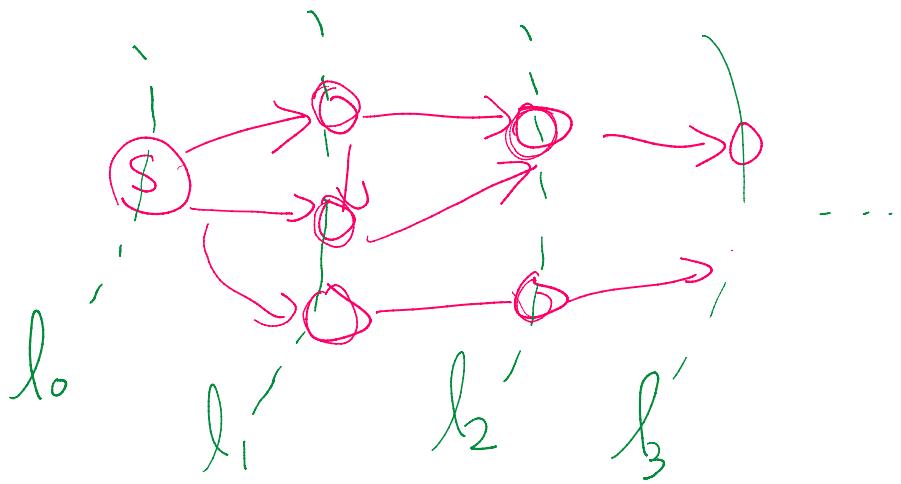
② $(u, v) \in E ?$

BFS (Breath First Search)

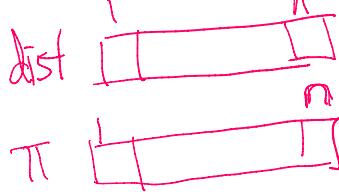
- given $G = (V, E)$. starting point S

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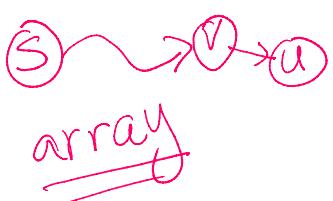
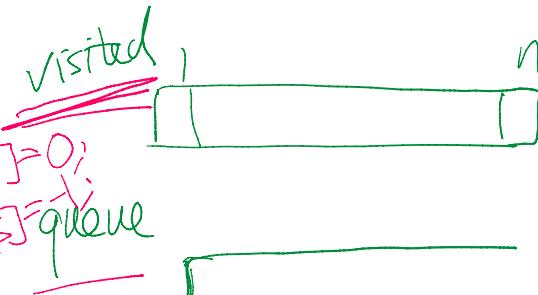
- visit all reachable vertex "level by level"



BFS(G, S)



q.enqueue(S); $\text{dist}[S] = 0$; $\pi[S] = \text{None}$



while ($q.\text{empty}() == \text{False}$)

$u = q.\text{dequeue}();$

print u ; // processing.

for (v in $G.\text{neighbours}(u)$)

if ($\text{visited}[v] == \text{False}$)

$q.\text{enqueue}(v);$

$\text{visited}[v] = \text{True};$

$\text{dist}[v] = \text{dist}[u] + 1;$

$\pi[v] = u;$

... - n -



BSF \Rightarrow shortest path.

BFS \Rightarrow process reachable vertices in some order

- ① shortest distant
- ③ shortest path