

Train V

Oct 12. Ye Cao

Dynamic Programming I

To wrap up what we covered so far :

- Memorization & Subproblems

- C++11

- Smart pointer

Iterator

Sort & Binary search

2. Tree

Binary search tree, Heap

Binary Indexed tree, Range Query

3. Cumulative List

Sgt decomposition

Fenwick Tree

Segment Tree

Dynamic Programming (DP)

ways to think of dp :

1. Optimization Problem

2. Exhaustive Search done in a "CLEVER" Way

1: Shortest path problem e.g.

2: When there's a polynomial time algorithm, DP is the general approach.

① Specifically Session V will bring a few easy & intuitive examples about DP.

Dynamic Programming [Is it more efficient?]

- Memorization & Subproblems
- Fibonacci
- Shortest path
- Guessing & DAG (Directed Acyclic Graph) View

A little peek of what DP is:

DP = subproblem + "reuse" time it's called

Fibonacci numbers :

Naive recursive algorithm

$$\{ F_1 = F_2 = 1 \}$$

$$\{ F_n = F_{n-1} + F_{n-2} \}$$

Compute F_n ($1 \leq n \leq \dots$)

$\text{fib}(n)$

if $n \leq 2$: $f = 1$

else: $f = \text{fib}(n-1) + \text{fib}(n-2)$

return f

To make this algorithm work

Exponential Time

Memorize DP algorithm

$$\text{proof: } T(n) = T(n-1) + T(n-2)$$

$\text{memo} = \{\}$

if n is in memo:

return $\text{memo}[n]$

$$T(n) \geq 2T(n-2)$$

else: if $n \leq 2$: $f = 1$

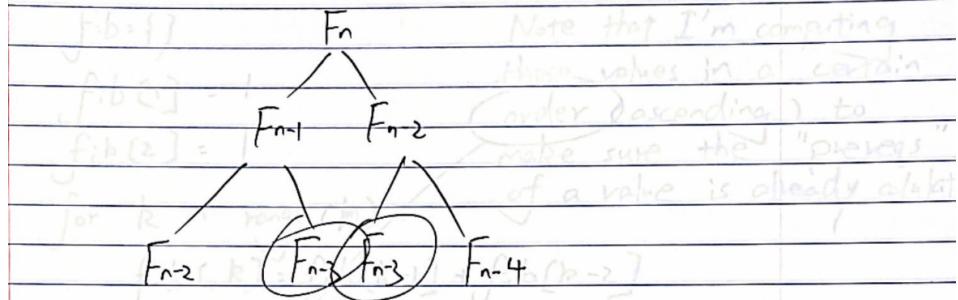
else $f = \text{fib}(n-1) + \text{fib}(n-2)$

$$= \Theta(2^n)$$

$\text{memo}[n] = f$

return f .

Why is the second algorithm more efficient?



$\text{fib}(k)$ only recurses the first time it's called

- memorized calls cost $O(1)$.
- non-memorized calls is $O(n)$
- $\text{fib}(1), \dots, \text{fib}(n)$
- $O(N)$

Not the best/efficient algorithm, best one $O(\log(n))$

DP \approx recursion + memorization.

- Memorize (remember)

Reuse solutions (subproblem)

- Time = # subproblems \times time / subproblem

Don't count memorized recursions $O(1)$ (this case)

Bottom-up DP Algorithm :

```
fib = {}
```

```
fib[1] = 1
```

```
fib[2] = 1
```

```
for k in range(3, n)
```

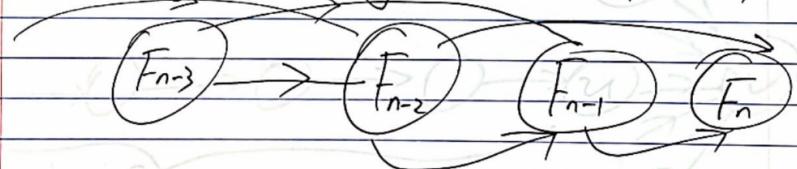
$$\text{fib}[k] = \text{fib}[k-1] + \text{fib}[k-2]$$

```
return fib[n]
```

Note that I'm computing these values in a certain order (ascending) to make sure the "preqs" of a value is already calculated.

- Exactly same computation

- Topological sort of subproblem dependency DAG



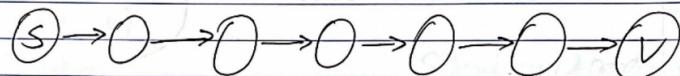
Benefits of bottom-up : Save space

~~Time complexity~~ Less function calls.

Shortest paths : $\delta(s, v) \forall v$ Single Source
shortest path

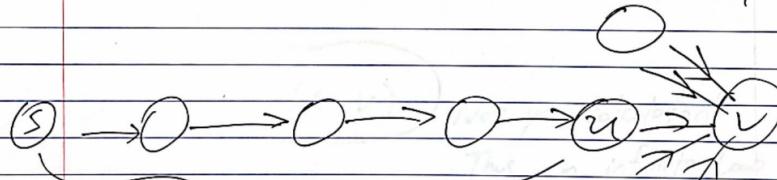
Guessing : don't know the answers? guess
Try ALL Guess

DP = recursion + memorization + Guessing



Guess Last edge approach

$\delta(s, v) \forall v$
Single Source
Shortest Path

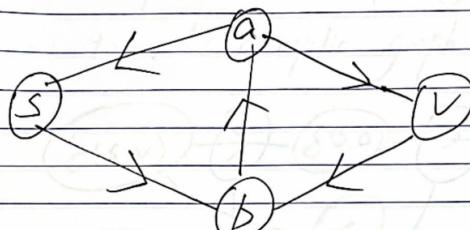


$$\delta(s, v) = \min(\delta(s, u) + w(u, v))$$

$$\delta(s, v) = \min (\delta(s, u) + w(u, v) \quad \forall (u, v) \in E)$$

Memorization table

Is there any problem with this algorithm?



Base case $\delta(s, s) = 0$

$\delta(s, v)$

$\delta(s, a) + w(a, v)$

$\delta(s, b)$

$\delta(s, s)$

$\delta(s, v)$

Subproblem Dependency should
be acyclic otherwise it's
an infinite algorithm.

Not yet calculated

Thus an infinite loop
on graph with cycles

DAG : $O(V+E)$ on directed acyclic graph

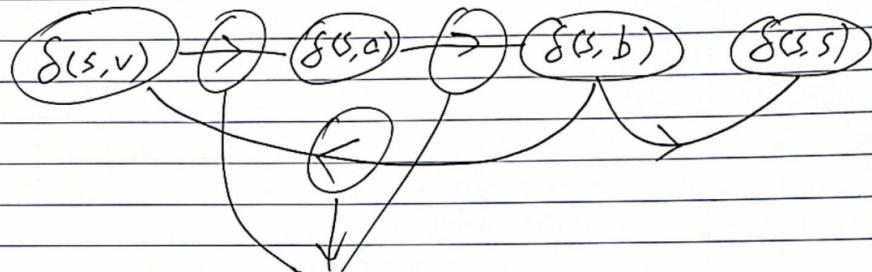
However, on cyclic graph, it's infinite loop!

~~* note of done problems~~

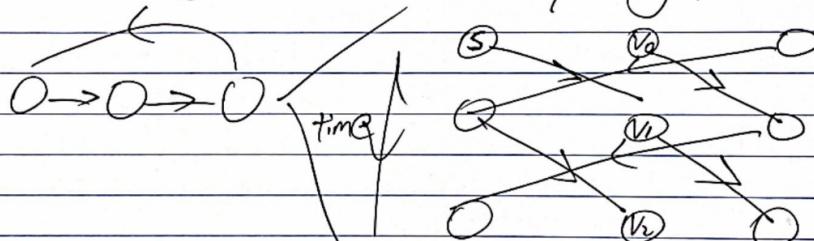
~~$\delta(s, v) = \min\{ \delta(s, a) + w(a, v), \delta(s, b) + w(b, v) \}$~~

How to fix to run cyclic graphs?

how to make a cyclic graph into an acyclic one?



Cyclic graph $\xrightarrow{\text{Cycle here !!!}}$ acyclic graph.



Explode graph to make it acyclic.

Change of our memorization table:
add another time dimension

$\delta_k(s, v)$ vs. $\delta(s, v)$

↓ weight of shortest path s to v using $\leq k$ edges.

$$\delta_k(s, v) = \min_{(u, v) \in E} (\delta_{k-1}(s, u) + w(u, v))$$

This time total running time $O(VE)$

- This is Bell-Man Ford Algorithm !!!