

"Stable Matching Problem"

* Self-enforcing Process: where we take care of preferences.

"Perfect Match"

everybody in one set is connected to somebody in other set.

* Matching: A matching 'S' is a set of ordered pairs, each from $I \times E$ with property that each member of I and each member of E appears in at most one pair in S.

* Perfect Matching: S' is a perfect matching with property that each member of I & each member of E appears in exactly one pair in S'.

* We are assuming ^{that} we have same number of objects in both sets $n \times n$.

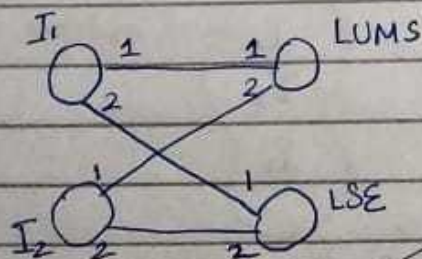
* Also,

→ Ties in preference.

→ Ranking can not change once denied.

e.g. $n=2$

I_1 (Inten 1):	¹ LUMS, ² LSE	LSE:	¹ I_1 , ² I_2
I_2 (Inten 2):	LUMS, LSE	LUMS:	I_1 , I_2



• LUMS & I_1 both prefer each other so No instability

possible
• One perfect match is $S = \{(I_1, LSE), (I_2, LUMS)\}$

$S \neq \{(I_1, LUMS), (I_2, LSE)\}$

if LSE offers extra scholarship to I_1 , I_1 will not change preference (self-enforcement) becoz its first preference is LUMS.

If I_2 offers money to LUMS, LUMS will not change preference.

- Matching 'S' is stable, if:
 - it is perfect
 - there is no instability w.r.t S

$$S_2 = \{ (I_1, ISE), (I_2, LUMS) \}$$

↓
 $(I_1, LUMS)$ is an instability w.r.t S_2 . becoz it does not belong to S_2 .

* (I_x, E_y) is an instability w.r.t a matching 'S', if I_x prefers E_y to its current partner and E_y prefers I_x to its current partner.

⇒ GALE-SHAPLEY ALGORITHM:

INTERNS						EMPLOYERS					
		Day 1	Day 2	Day 3							
* I_1	E_C	E_B	E_E	E_A	E_D	* E_A	I_3	I_5	I_2	I_1	I_4
I_2	E_A	E_B	E_E	E_C	E_D	E_B	I_5	I_2	I_1	I_4	I_3
I_3	E_D	E_C	E_B	E_A	E_E	E_C	I_4	I_3	I_5	I_1	I_2
I_4	E_A	E_C	E_D	E_B	E_E	E_D	I_1	I_2	I_3	I_4	I_5
I_5	E_A	E_B	E_D	E_B	E_C	E_E	I_2	I_3	I_4	I_1	I_5

$n=5$

Employers	Day 1	Day 2	Day 3	Day 4
E_A	I_2, I_4, I_5	I_5	I_5	I_5
E_B		I_2	I_1, I_2	I_2
E_C	I_1	I_1, I_4	I_4	I_4
E_D	I_3	I_3	I_3	I_3
E_E				I_1

Stable matching

Annotations:
 - E_C stayed back becoz only employees I_1, I_4 were preferred by E_C .
 - E_D was preferred by E_C .

* What is the "Progress Measure"? At end of day, somebody will cross out a candidate.
 Progress no. of cross-outs

• It will take almost $O(n^2)$

$$n \times (n-1) = (n^2 - n)$$

① Show G-S Algo produces a perfect matching.

⇒ Proof by Contradiction: Assume G-S does not produce a perfect matching.

- Some intern I which is rejected by every employer.
- Every employer has a better candidate than I .
- contradiction.

② Show G-S algo produces a stable matching.

⇒ Proof by Contradiction: (I, E) is a pair not in S .

Show (I, E) is not an instability

Case I: Employer E must have rejected I .

Case II: I have interviewed at E .

← I went
to E' which
is preferred
over E .

• Article in
Tardos

I_1	E_2	→ if we do not take preference of employees, then we will get a stable match, but it includes <u>Unfairness</u> .
I_2	E_3	
\vdots	\vdots	
I_n	E_1	

* In a Bipartite graph we are sure to get a stable match.

* Divide and Conquer:

• Collaborative Filtering:

→ Similarity metrics:

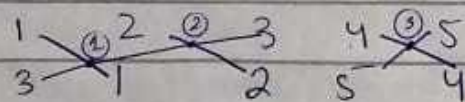
n set of movies 'n'	M_Z	M_A	M_B	M_Y	M_P	
Person x	1	2	3	4	5	← sorted rating of person x.
Me	3	1	2	5	4	
	a_1	a_n	← 'a' numbers.

"Inversions" $a_i < a_j$, where $i < j$

Suppose $a_1 \dots \underbrace{5 \dots 2}_{\text{inversion}} \dots a_n$

The inversion is w.r.t person x. (because person x's data is sorted)

How many inversions in above example? Easier way to check it:



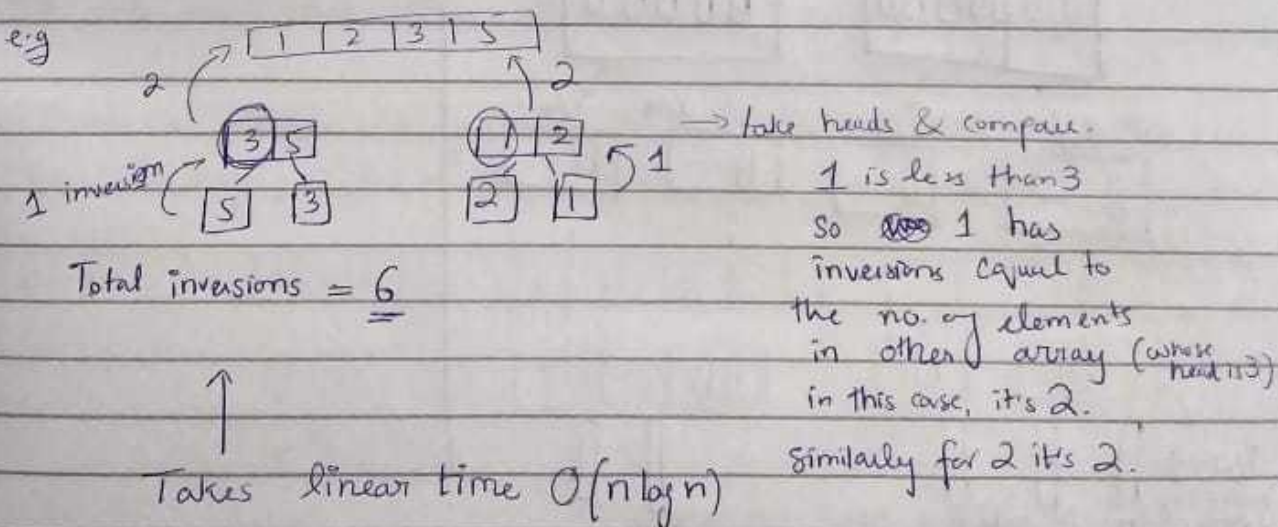
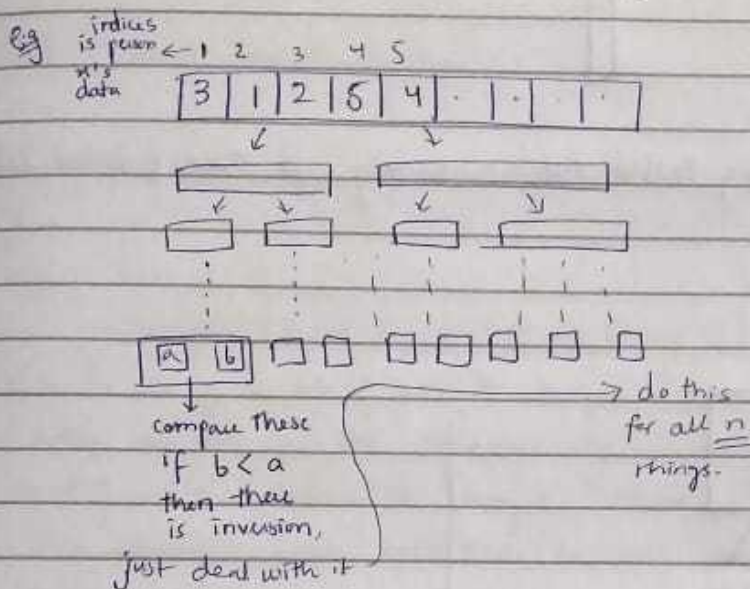
"No. of crossings or intersections are inversions in our data"

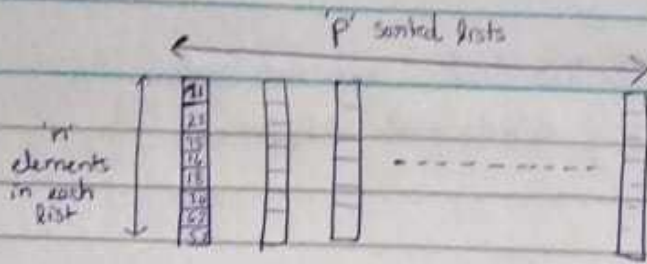
→ There are 3 inversions; $(1,3), (2,3), (4,5)$

aesthetic part

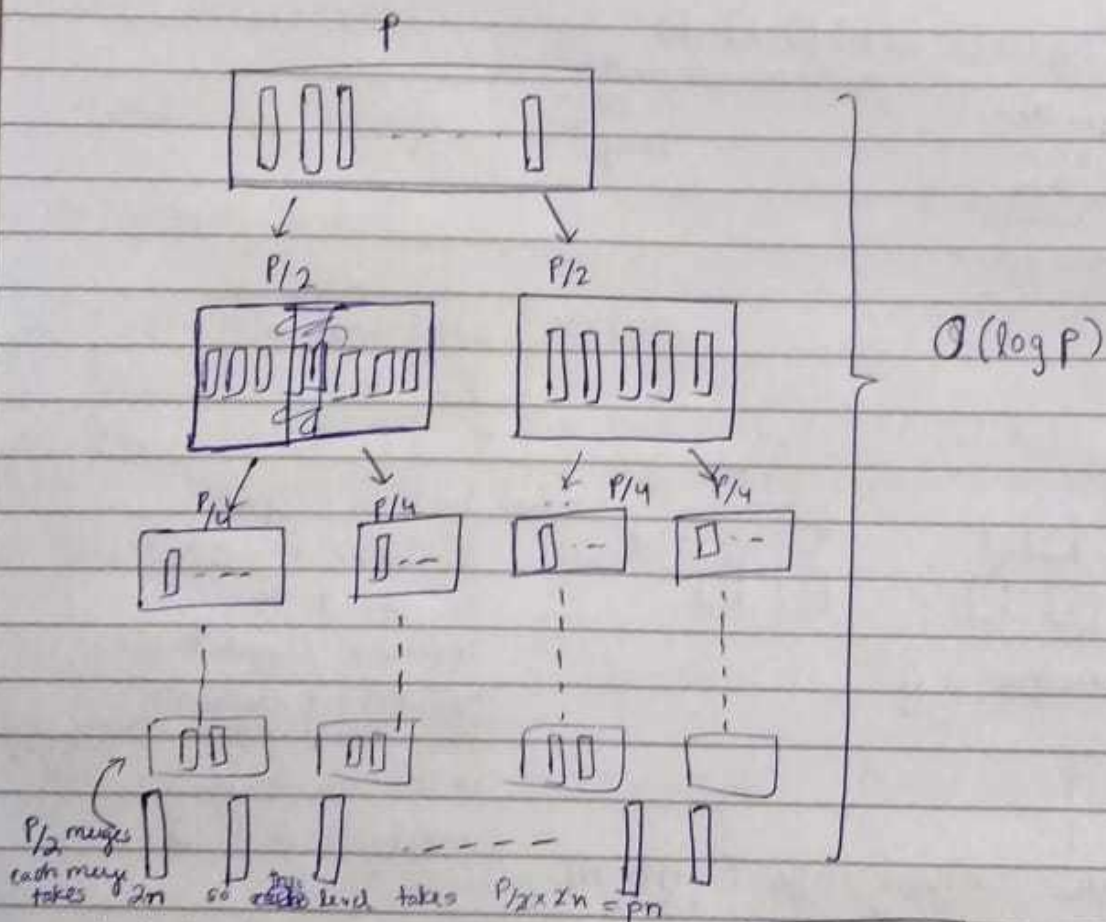
my algo is better than yours

* Brute Force will take $O(n^2)$ to do this task. We can reduce this time to $O(n \log n)$ by using divide and conquer.





→ we want to make a big sorted list containing all these P sorted lists.
 • size would be " pn "



each level takes pn so total time is $O(np \log p)$

Lecture 18

30th October 2019
Wednesday

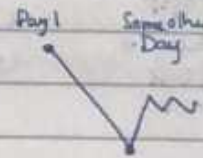
* Data that has fluctuations:

eg Stock price fluctuations

S_1 = Min Stock Price
 S_2 = Max Stock Price

* Brute force time complexity = $O(n^2)$

eg Price = { }
Change = { 2, -4, 5, -2, -2, 6, -3, 5, -3, 2 }

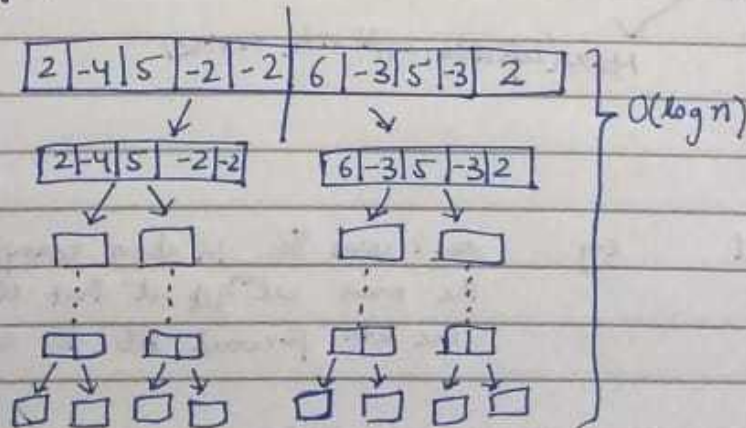


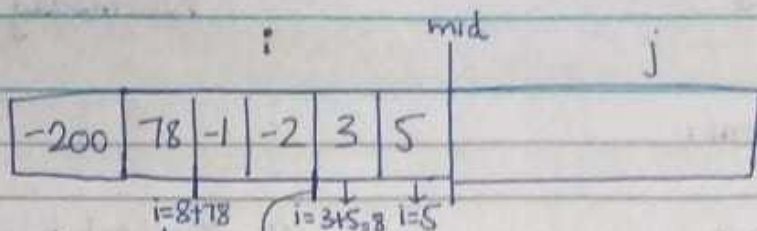
• if we are given set of prices & changes in price $i \& j$ where $i < j$ then either we can get the difference of our extreme prices as our profit; and if we are looking at changes then we have to add all of the changes from max price to min price to get our profit.

→ In this problem, we are picking the two ^{Days} ~~prices~~ (one → when will we purchase it and one → when will we sell it) and therefore 2 prices

• Divide and Conquer will give us better than brute force, but not the best. i.e $O(n \log n)$ but we can do this in linear time as well.

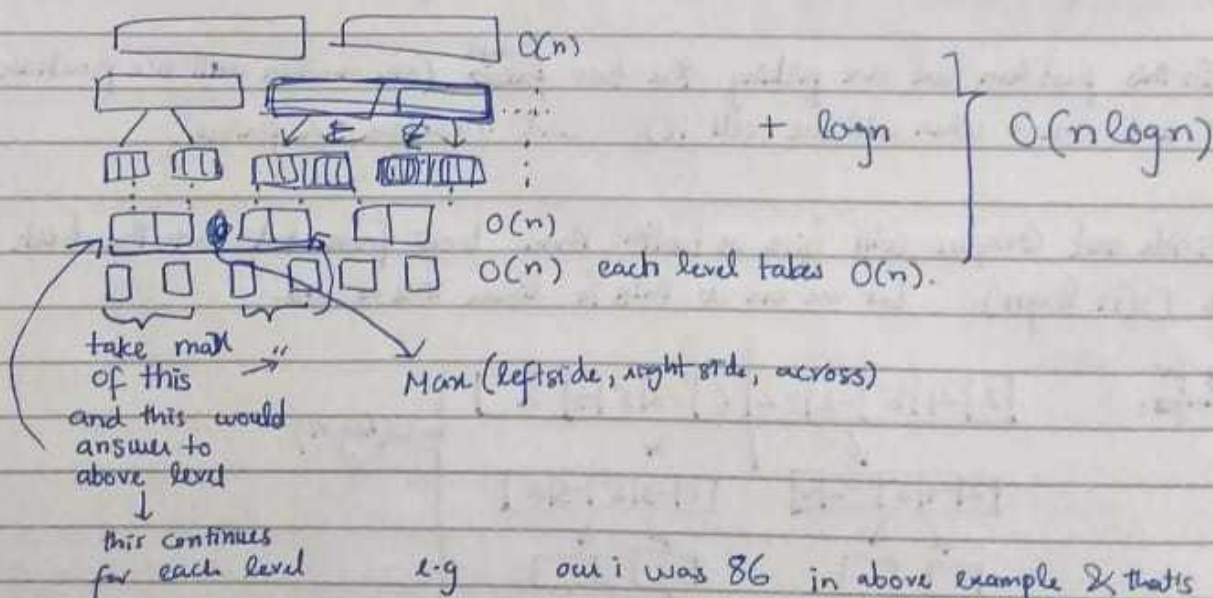
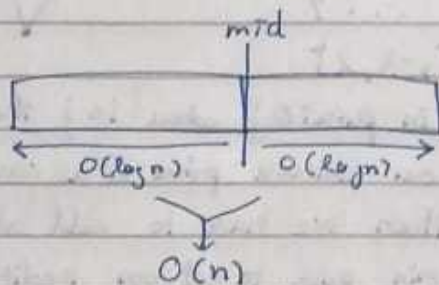
Array for Changes:





update the value of profit if there is a increase else not.

after this point I am not sure that whether my profit value would increase or decrease. so I just place a marker here (and will stop updating my value) and continue.

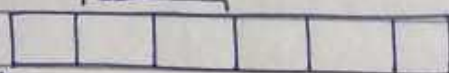


e.g

our i was 86 in above example & that's the max we can get at that stage so we will forward 86 to above level.

* In linear time:

some -ve values \rightarrow we will not add them in our max sum ... ignored!



Start from one end.

- \rightarrow Max sum, \rightarrow that is being updated only if we have increase in value of profit
- \rightarrow Current sum, \rightarrow adds up all the values

It will take $O(n)$.

* Recurrence Time with Substitution:

$$T(1) = b$$

$$T(n) = T(n/2) + cn$$

$$T(m) = T(m/2) + cm \rightarrow \text{basic template}$$

$$\text{where } m = n/2$$

$$T(n/2) = T(n/4) + \frac{cn}{2}$$

$$T(n/2) = T(n/4) + \frac{cn}{2}$$

$$\text{now } m = n/4$$

$$T(n/4) = T(n/8) + \frac{cn}{4}$$

$$T(n/4) = T(n/8) + \frac{cn}{4}$$

$$T(n) = \underbrace{T(n/2)}_{\text{put value of } T(n/2)} + cn$$

$$T(n) = \underbrace{T(n/4)}_{\text{put value of } T(n/4)} + \frac{cn}{2} + cn$$

$$T(n) = T(n/8) + \frac{cn}{4} + \frac{cn}{2} + cn$$

⋮

$$T(n) = \cancel{T(n/2^j)} T\left(\frac{n}{2^j}\right) + \left[\frac{cn}{2^{j-1}} + \dots + \frac{cn}{2} + cn\right]$$

$$u = T(1) + cn \left(\frac{1}{2} + \dots + \frac{1}{2} + 1 \right)$$

$$u = cn \left(\frac{1 - \frac{1}{2}j}{1 - \frac{1}{2}} \right) + b$$

$$T(n) = 2 \cdot cn \left[1 - \frac{1}{n} \right] + b$$

$$u = 2cn \left[\frac{n-1}{n} \right] + b$$

$$u = 2cn - 2c + b$$

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

$$T(n) = 2c(n-1) + b$$

$$T(n) = \underbrace{(2c)}_{\text{The first level takes almost half of the time and}} + \underbrace{cn - 2c + b}_{\text{rest take lesser & lesser time as we go down}}$$

The first level takes almost half of the time and rest take lesser & lesser time as we go down

$$cn$$

$$cn/2$$

$$cn/4$$

$$\dots$$

$$\square \rightarrow b$$

this thing is called 'Decaying Recurrence Time'

or "Decaying Geometric Series"

* e.g. $T(n) = 2T\left(\frac{n}{2}\right) + cn^2$
 $T(2) = 6$

$$T(m) = 2T\left(\frac{m}{2}\right) + cm^2 \quad \text{where } m = n/2$$

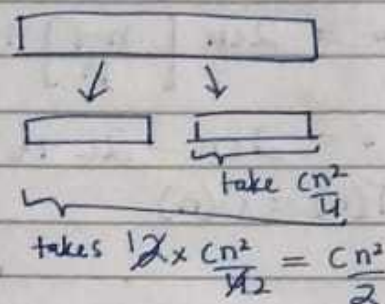
$$T\left(\frac{n}{2}\right) = 2T\left(\frac{n/2}{2}\right) + c\left(\frac{n}{2}\right)^2$$

$$T\left(\frac{n}{4}\right) = 2T\left(\frac{n}{4}\right) + c\frac{n^2}{4}$$

$$m = \frac{n}{4}$$

$$T\left(\frac{n}{4}\right) = 2T\left(\frac{n/4}{2}\right) + c\left(\frac{n}{4}\right)^2$$

$$T\left(\frac{n}{8}\right) = 2T\left(\frac{n}{8}\right) + \frac{cn^2}{16}$$



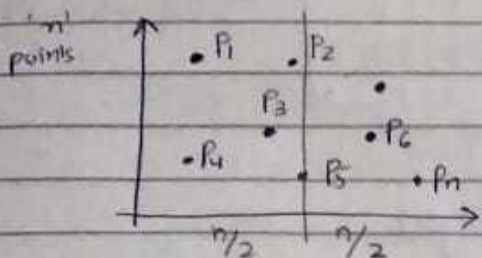
$$T(n) = 2T\left(\frac{n}{2}\right) + cn^2$$

$$T(n) = 2 \left[2T\left(\frac{n}{4}\right) + \frac{cn^2}{4} \right] + cn^2$$

$$T(n) = 2 \left[2 \left[2T\left(\frac{n}{8}\right) + \frac{cn^2}{16} \right] + \frac{cn^2}{4} + cn^2 \right]$$

lec 19

4th Nov. 2019
Monday



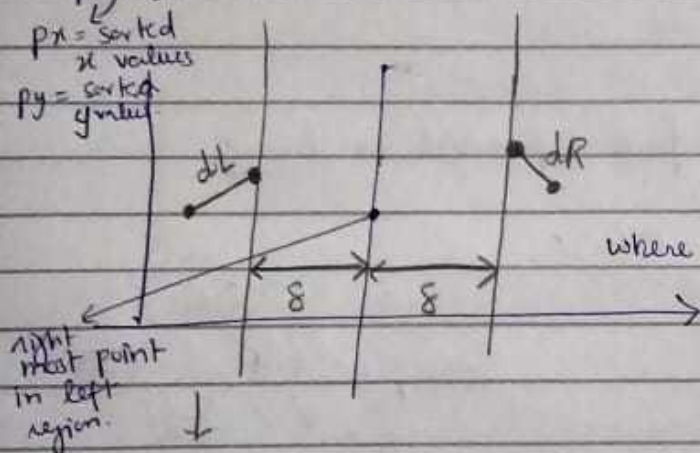
By brute force: $O(n^2)$

Choose points P_i, P_j such that we minimize the Euclidean dist. (P_i, P_j) .

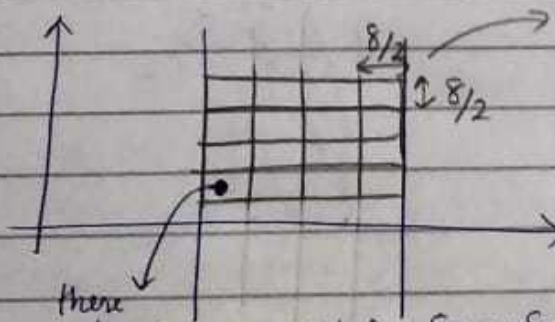
We want to reduce the time to $O(n \log n)$. (firstly)

$p(x, y)$
 $p_x = \text{sorted } x \text{ values}$
 $p_y = \text{sorted } y \text{ values}$

for that we need our combining operation to be of $O(n)$.

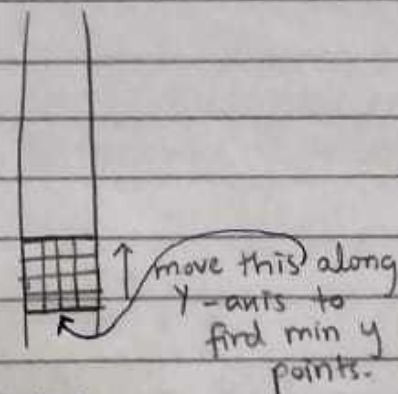


where $\delta = \min(d_L, d_R)$



there can be just one point in $\delta/2 \times \delta/2$ square.

because if we will have 2 points in one square (then their length would be less than δ) \rightarrow contradictory thing

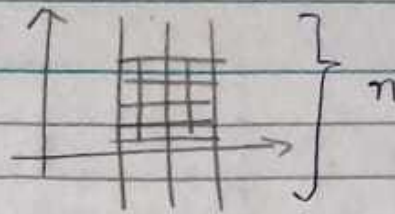
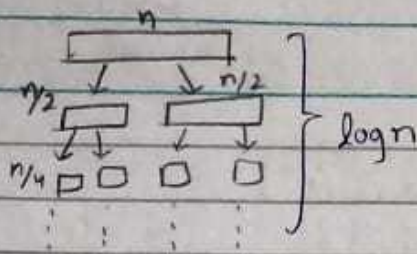


move this along y-axis to find min y points.

TAT2C
W17

24
31
188
55
11

not done



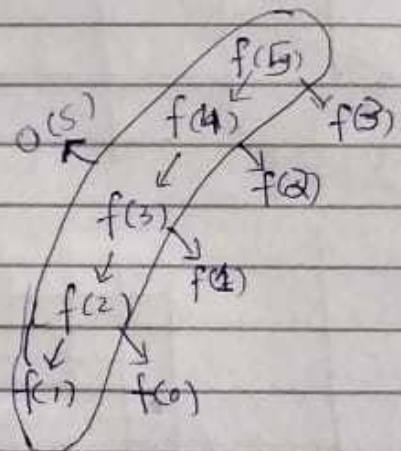
\therefore total time is $n \times \log n \approx O(n \log n)$

record
Memo

* Memoization : \rightarrow reducing time from exponential to linear

For fibonacci : Memo filling needs $O(n)$

Total time is also $O(n)$.

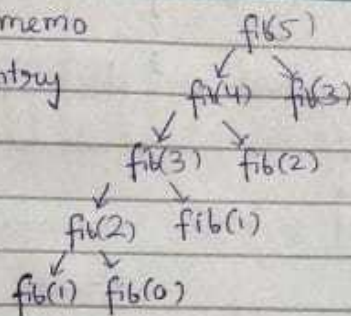


Lecture 20

Wednesday
5th November 2019

* Running time = Number of entries in the memo
 × time to compute each entry

i.e. $n \times \overset{\substack{\uparrow \\ \text{time for each entry}}}{1} = O(n)$
 \uparrow
 no. of entries



* Dynamic Programming: Problems that can be tackled using DP have two characteristics:

- ① Optimal Substructure
- ② Overlapping sub problems.

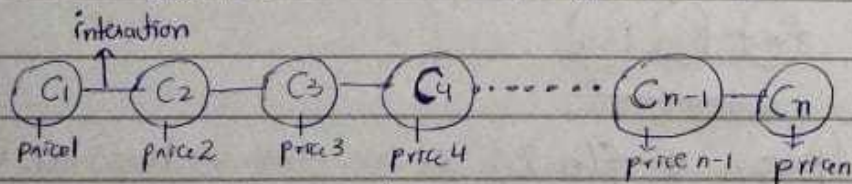
① "Ordering" of sub problems

② Recurriance relation

so that I can combine my smaller problems to get a bigger.

e.g.

'n' chemicals

Graph Type: ~~Bi~~ Undirected Chain Graph

We have to choose a ^{sub} set of chemicals that have no interaction and we ^{want to} ~~will~~ get the max price. (sum of prices to be max)

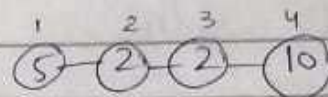
They have to be placed in only 1 box.

$S =$ Subset of chemicals such that $\sum_{i \in S} \text{price}_i$ are maximised.

one sol proposed was choose prices at ~~odd~~ odd & even indices.

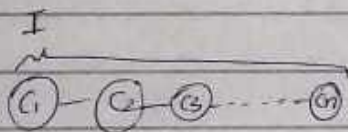
$\{C_1, C_3, C_5, \dots\}$ and $\{C_2, C_4, C_6, \dots\}$

↓
Not correct → Counter example



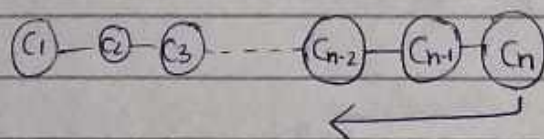
odd even gives max price = 15

odd odd = 7 not max even even = 12 not max



* By using "Brute Force" - trying all possible subsets, we will get
Power Set $(I) = 2^n$

* DP would be an "Intelligent Brute Force"

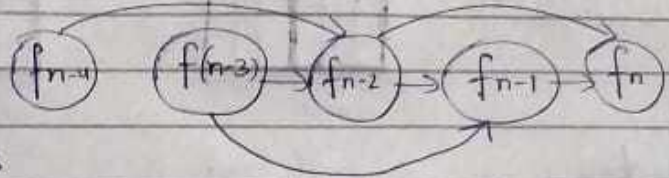
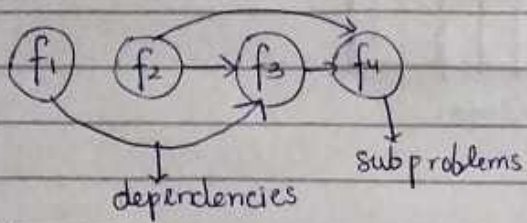


$f(n) = \max \begin{cases} \text{price}_n + f(n-2) \\ f(n-1) \end{cases}$ ← case where we have C_n include
← when we Do NOT have ~~C_n~~ C_n .

$f(n-2) = \max \begin{cases} \text{price}_{n-2} + f(n-4) \\ f(n-3) \end{cases}$ ← compare

still will give $O(2^n) \rightarrow$ we will do memoization to get $O(n)$!!

* Base case would be $f(0) = 0$
 $f(1) = \text{price}_1$



↑ DAG → implicit

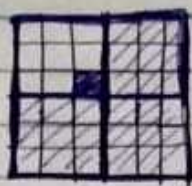
$O(n)$

Lecture 21

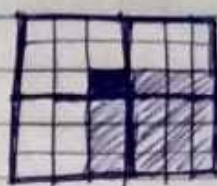
11th November 2017
Monday

hw solution

$$T(n) = 3T(n/2) + c$$

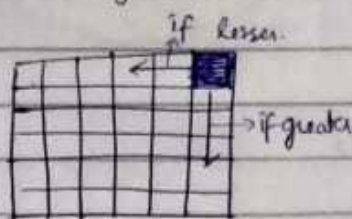


greater

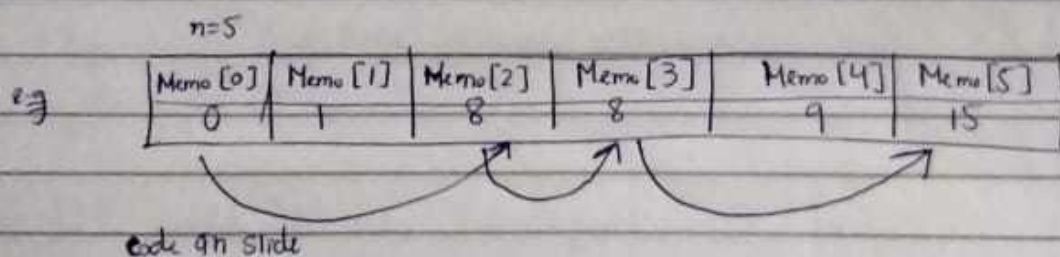


lesser.

linear time:



* How do we find set of n chemicals?



It takes $O(n)$

* Overlapping Subproblems: when a recursive algo. ^{re}visits the same stage/step again and again. _{pbl}

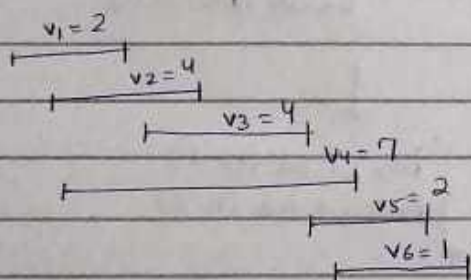
- ① What are your subproblems? → normally of polynomial size, should NOT be too large e.g. in exponential
- ② Define an ordering.
- ③ Write recurrence relation.

* 3 steps to Dynamic Programming:

- ① Define the recurrence relation to get your answer.
- ② Keep your space small → do not use larger ⁿ⁻¹ subproblems.
- ③ Specify the order.



* Weighted Interval Scheduling:



- ~~P(0)~~ $P(1)=0$ ← number of classes that are compatible with 1 & comes earlier than 1.
- $P(2)=0$
- $P(3)=1$
- $P(4)=0$
- $P(5)=3$
- $P(6)=3$

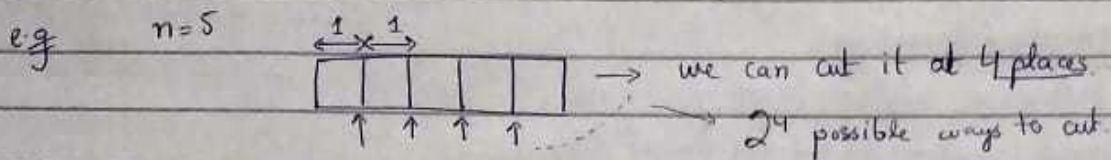
$$f(n) = \max \begin{cases} v_n + f(p(n)) \\ f(n-1) \end{cases} \rightarrow \begin{cases} \text{if } v_n \text{ included in my final answer} \\ \text{if not} \end{cases}$$

* Base case: $f(0)=0$, $f(1)=v_1$

→ That would be an exponential algo, ^{do} memoization to do it in linear time i.e. $O(n)$
 • with sorting ($O(n \log n)$)

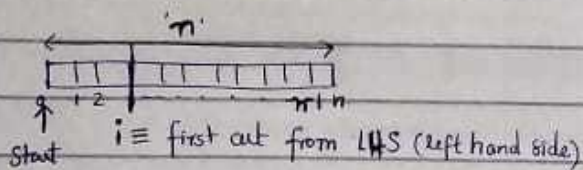
* Rod Cutting Problem:

~~Ques~~ We are given rods of length 'n' inches, and prices relevant to the lengths



There $\boxed{2^{n-1}}$ ways to cut the rod.

→ Goal is to maximize the revenue.



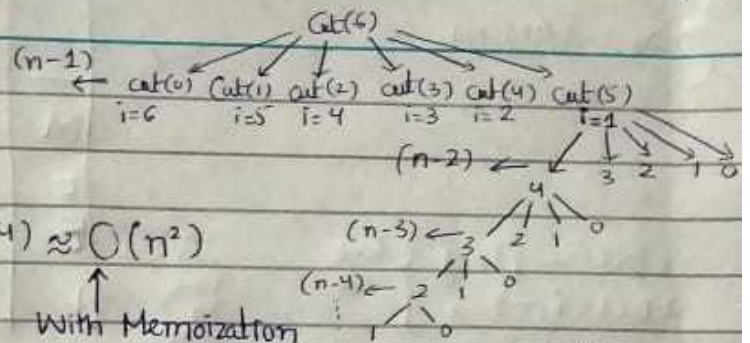
$$\text{length of rod} \uparrow$$
$$\text{cut}(n) = \max \{ \text{price}_i + \text{cut}(n-i) \}$$
$$\text{where } (1 \leq i \leq n)$$

$$\downarrow$$
$$\max \left\{ \begin{array}{l} \text{Price}_1 + \text{cut}(n-1) \\ \text{Price}_2 + \text{cut}(n-2) \\ \vdots \\ \text{Price}_n + \text{cut}(n-n) \end{array} \right.$$

Base case: $\text{cut}(0) = 0$

Lecture 22

13th November 2015
Wednesday



$$(n-1) + (n-2) + (n-3) + (n-4) \approx O(n^2)$$

With Memoization

What does implicit DAG look like?



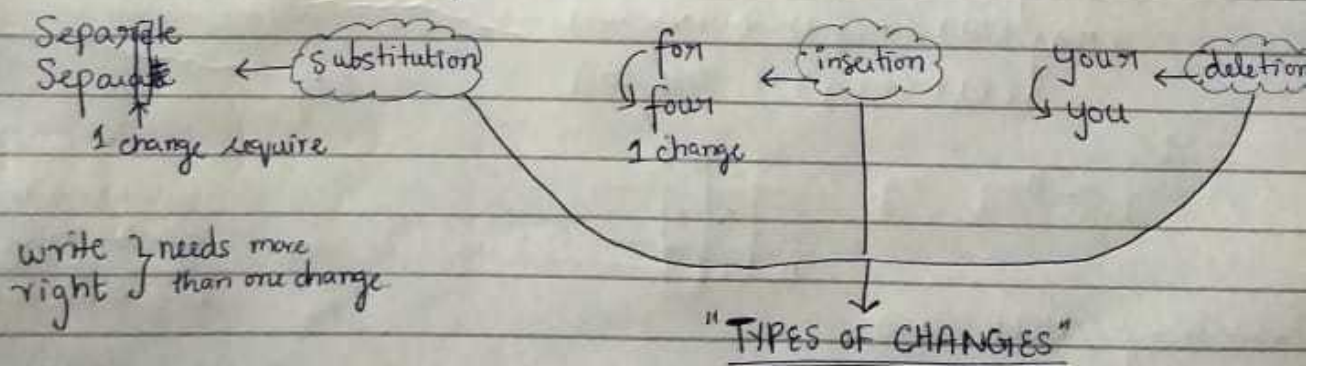
$O(n^2)$
because
at each
stage we
are taking
max of
 $n-1$ memos.

* [Figure out the no. of subproblems and then relate time to compute each subproblem] \leftarrow to get time complexity

here $n-2$ edges are going
here $n-1$ edges are going.

* EDIT DISTANCE:

Given 2 strings: cost function is how many changes I need to transform one string to another.



eg
 $\begin{matrix} \nearrow SA = LAMENT \\ \searrow SB = MEET \end{matrix}$

$$\left. \begin{array}{l} \text{EDIT}(-, j) = j \\ \text{EDIT}(i, -) = i \end{array} \right\} \begin{array}{l} \text{Base} \\ \text{case} \end{array}$$

C1 Null string \downarrow insertion \rightarrow

			L	A	M	E	N	T	
R1		0	1	2	3	4	5	6	
	M	1	2	2	3	4	5		i
	E	2	2	2	3	2	3	4	deletion \downarrow
we can reach here by 3 ways.	E	3	3	3	3	3	3	4	
	T	4	4	4	4	4	4	3	min cost to change SA to SP \rightarrow

$$\text{EDIT}(i, j) = ?$$

↘ diagonal represents substitution

for R1 converting null to null will take 0 change
converting null to L will take 1 change
(insert).

Converting ~~the~~ null(-) to -LA will take 2 changes and this goes on.

converting null to - LAMENT takes
G changes

* \rightarrow represents one insertion and then one deletion

* deletion
↓ → represents
one deletion
and then one
insertion

for C1 converting M to Null takes 1 chg
converting -M to takes 2 chgs and so on.

given,

- INSERTION COST = 1
- DEL. COST = 1
- SUBS. COST = 1

$$\text{EDIT}(i, j) = \begin{cases} \text{EDIT}(i-1, j-1) + \text{SUB_COST}, \\ \min \begin{cases} \text{EDIT}(i, j-1) + \text{INS_COST}, \\ \text{EDIT}(i-1, j) + \text{DEL_COST} \end{cases} \end{cases}$$

↓
missing one thing e.g.

	-	A	C
A	0	1	
B	1		

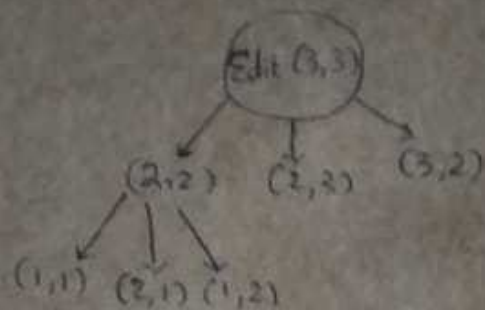
it would be zero

so we need to
take the case
where we ~~are~~
have same characters

- introducing MATCH COST = 0

$$\text{EDIT}(i, j) = \min \begin{cases} \text{EDIT}(i-1, j-1) + \begin{cases} 0 & \text{if } SA[i] == SB[j] \\ \text{else SUBS. COST} \end{cases} \\ \text{EDIT}(i, j-1) + \begin{cases} 0 & \text{if } SA[i] == SB[j] \\ \text{else INS. COST} \end{cases} \\ \text{EDIT}(i-1, j) + \begin{cases} 0 & \text{if } SA[i] == SB[j] \\ \text{else DEL COST} \end{cases} \end{cases}$$

- What's the time complexity for this?



at every stage the time to add new cost is constant time.

 $|S_n| = n$ $|\mathcal{S}_B| = m$ $O(n \cdot m)$

Implicit DAG



18th November 2019
Monday

lecture 23 (1)

→ used in comp. biology

* Longest Common Subsequence: (LCS)

$S_1 = a c b g h a f$

$S_2 = c g a b g h f$

* Substrings

part of string that has no gaps b/w it.

* Subsequence

we have gaps b/w part of string.

* from S_1 one subsequence is "cbghf"

another → "cbghf"

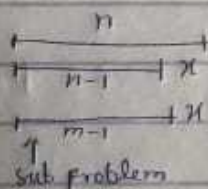
"abghf"

$|S_1| = n \leftarrow$ longest common subseq. for S_1

$|S_2| = m \leftarrow$ " " " " S_2

$SA = Sa_1 Sa_2 Sa_3 \dots Sa_n$

$SB = Sb_1 Sb_2 Sb_3 \dots Sb_m$



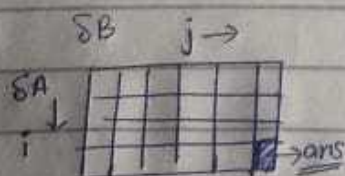
if $Sa_n = Sb_m$

* Base Case:

$LCS(0, -) = 0$

$LCS(-, 0) = 0$

* go with a tabular approach.

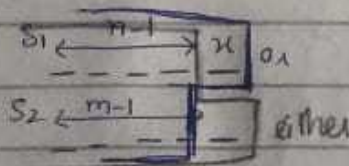


• if $Sa_n == Sb_m$

$LCS(i-1, j-1) + 1$

• if $Sa_n != Sb_m$

$$= \max \begin{cases} LCS(i, j-1) \\ LCS(i-1, j) \end{cases}$$



• There are total $n \times m$ possibilities of i, j pairs.

(2)

* Reduction ~~we~~ use already known answer to solve new ^{sub} problem.

* Can we use EDIT DISTANCE() to find the solution for LCS?
we can change the costs, (insert-cost, delete-cost, ~~sub~~-cost),
in order to get sol. for LCS. _{match-cost}

* In LCS, we want to maximize the match cost,
and change the subs. with delete & insert
disallow substitutions.

(or delete the
match of no. of
(make subs.
zero.)

* Maximum Monotonically Increasing Subsequence: _{we can have gaps}

S = 3 7 2 9 5 6 8 7

$j \quad i \quad \rightarrow$ then $j < i$

7 9 \leftarrow one possible Monotonically $\uparrow\uparrow$ subseq.

$\Rightarrow 2 5 6 8$

$\Rightarrow 2 5 6 7$

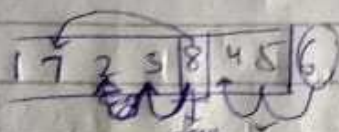
S = 3 7 2 9 5 6 8 7 \rightarrow might be in our final and might not be!

MMIS(n) = ?

returns the
length of
max monotonically
inc. subseq.

(3)

eg 2 7 3 8 4 5 (6)
 6 can be part of MMIS that ends at 5
 " " " " at 4
 " " " " at 3
 " " " " at 2
 but not that ends at 7 or 8



which should I pick 8 → 3 or 8 → 7

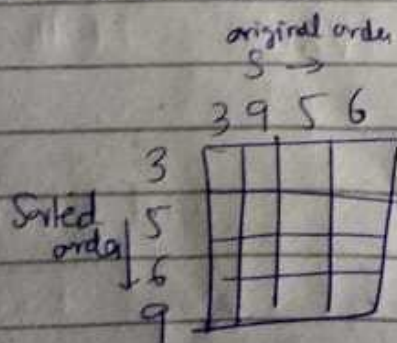
8 → 3 will give 1, 2, 3, 8 & 8 → 7 will give 1, 7, 8
 longer MMIS than this

$$MMIS(n) = \max_{1 \leq i \leq n} \begin{cases} MMIS(i) \text{ s.t. } s[i] \leq s[n] \end{cases}$$

* Base Case: $MMIS(0) = 0$
 $MMIS(1) = 1$

Time complexity for this is $O(n^2)$

How can we use LCS() to find sol. for MMIS()?



Lecture 24 (4)

20th November 2019
Wednesday

* Longest Palindromic Subsequence: LPS

$S = C \overset{i=1}{H} A R A C T E R \overset{j=n}{}$



returns the length of LPS longest

$$LPS(i, j) = \begin{cases} \text{if } S[i] == S[j] \\ 2 + LPS(i+1, j-1) \\ \text{if } S[i] != S[j] \\ \text{Max} \begin{cases} LPS(i+1, j) \\ LPS(i, j+1) \end{cases} \end{cases}$$

Base case if $i == j$ (only one character in S)
return 1.

if $j == i+1$ (2 characters long string)
return 1

if $S[i] != S[j]$
return 1

else if $S[i] == S[j]$
return 2

at this point we have 3 palindromic chars "ARA"
at this point I have palindromic seq of "S C A R A C"
each column represents the subproblem S.

j →	1	2	3	4	5	6	7	8	9
i ↓	C	H	A	R	A	C	T	E	R
i=1 C	1	1	1	1	3	5	5	5	5
i=2 H	1	1	1	1	3	3	3	3	3
i=3 A		1	1	1	3	3	3	3	3
i=4 R			1	1	3	3	3	3	3
i=5 A				1	1	3	3	3	3
i=6 C					1	1	3	3	3
i=7 T						1	1	3	3
i=8 E							1	1	3
i=9 R									1

the answer to LPS is 5.

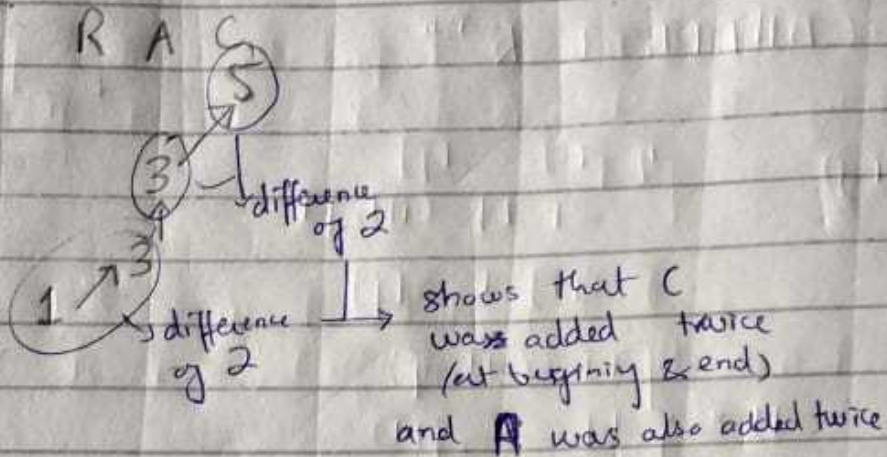
backtracking: 3 → 5

value at i+1 & j would be used to deduce

(5)

* But how can we construct our palindromic ~~set~~ string after filling the table?

Back track.



(6)

* Knap Sack Problem: Resource constrained selection problems.

Knap Sack can hold a total weight of W kg
' n ' items of weights $w_1, w_2, w_3, \dots, w_n$ & value v_1, v_2, \dots, v_n

$Knap(-)$ = max value that we can achieve with the
Knap sack of capacity W and items $i=1, 2, \dots, n$

• We need to keep track of remaining capacity. and remaining items.

$Knap(n, w_c) =$

if ($w_n > w_c$)

$Knap(n-1, w_c)$

↓ ↓

go to next item capacity remains the same

$\leftarrow i_1, i_2, i_3, \dots, i_n$

if ($w_n \leq w_c$) → now we can put it in our bag but we are not sure that would go in final solution.

Max { $v_n + Knap(n-1, w_c - w_n)$ if item goes inside bag

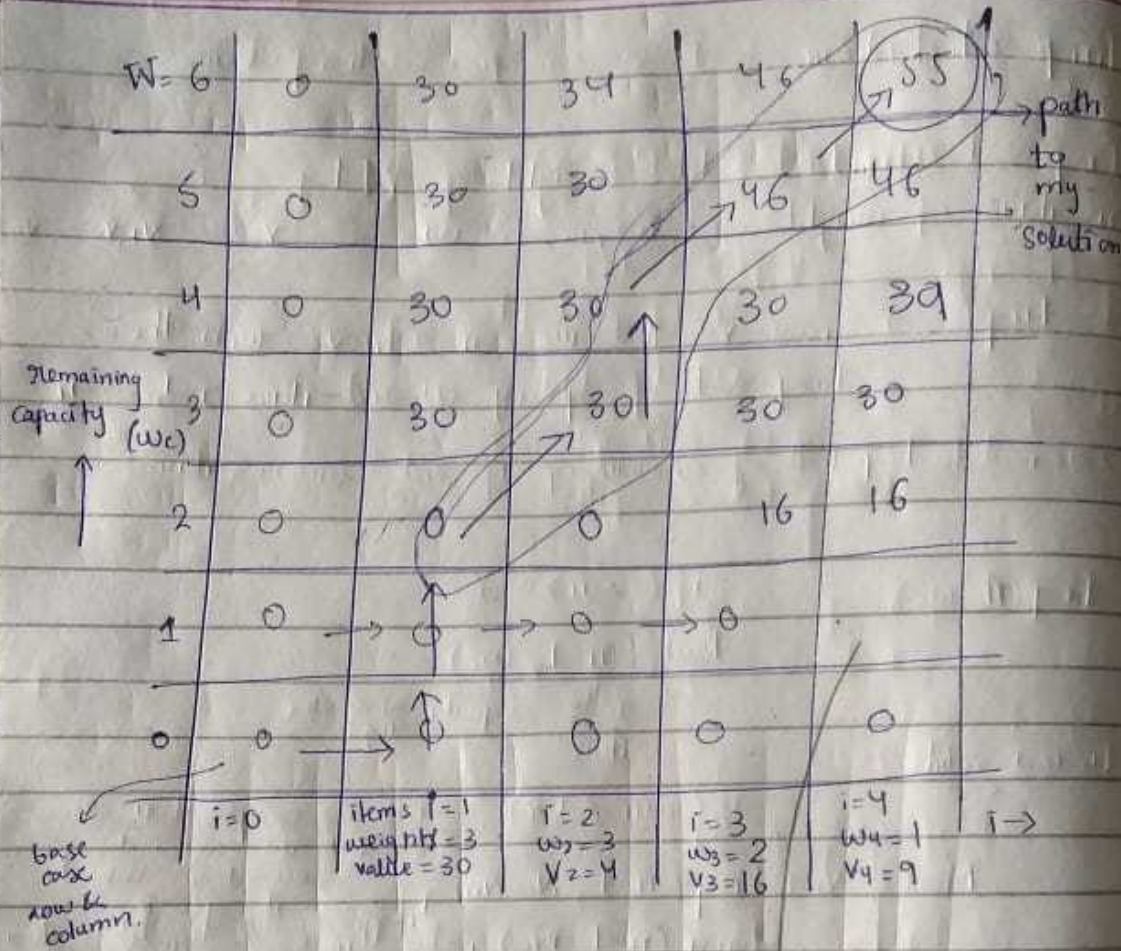
$Knap(n-1, w_c)$ if does not go in

Base Case: $Knap(0, w_c) = 0$
 $Knap(i, 0) = 0$

Was without repetition

i.e. I don't have multiple copies of same item.

W=6 → capacity of Knap Sack. ⑦



* Maximum



e.g. Input



It depends on number of subproblems, and the values of W_c in each sub problem.

max { $\text{knap}(3,0) + V_4$
 $\text{knap}(3,1)$ }

How? capacity of knapsack.

It will take $O(nW)$
 \downarrow
 no. of items

Now my complexity depends on W e.g. we can have a very large value of W (2^{30}) and similarly very small as well $W=1$.

"Pseudo Polynomial"

how many bits to store W ? $\log(W)$ bits

$O(nW) = O(n2^{\log(W)})$
 \downarrow
 This is the time complexity based on an input.

(Basically now it's not fixed)

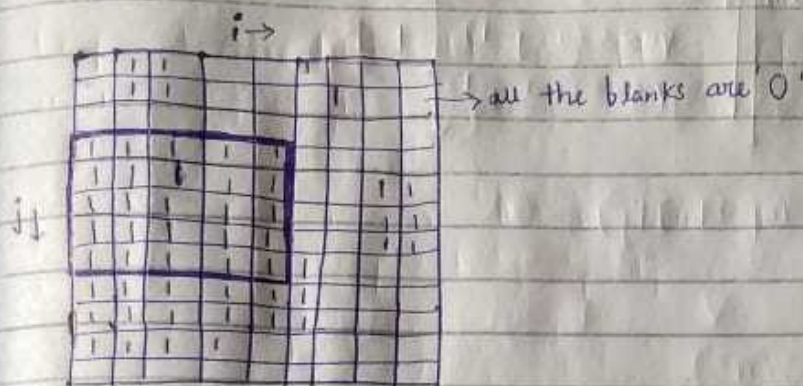
e.g. $n=4$ will take 2 bits or 2 bits
 $n=8$ will take 3 bits or 3 bits

Lecture 25 (8)

25th November 2019
Monday

* Maximum Sized ^{Sub} Square containing all 1's:

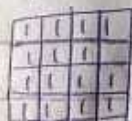
2⁽¹⁾
2⁽²⁾
2⁽³⁾



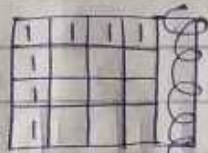
our sub problem



Input



Square ← that needs to be filled.



boundary conditions.



1	1	1	1
1	2	2	2
1	2	3	3
1	2	3	4

Back to our actual problem!

Now we'll use above example to fill in our square.

0	1	1	0	0	1	0	0	0
0								
0								
1								
1								
1								
1					5	3		
1					5	5		

(9)

if (input[i][j] == 1)

$$\text{Square}(i, j) = \min \left\{ \begin{array}{l} \text{Square}(i-1, j), \\ \text{Square}(i, j-1), \\ \text{Square}(i-1, j-1) \end{array} \right\} + 1$$

if input[i][j] == 0

It will take $O(n^2)$.

e.g

3	4	-1	6	

basically doing prefix sum

3	4+3	4+3-1	4+3-1+6	

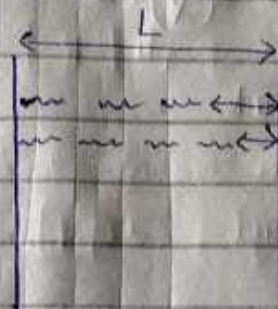
Lecture 24 (10)

"Document Layout Problem"

27th Nov. 2019
Wednesday

* Minimize Total Penalty = $\sum (\text{Line Penalty})^2$

w_1 w_2 w_3 ... w_n ← words



* Line Penalty = (Page Width - sum of words length of that line)

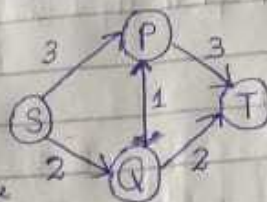
$$\text{line}(n) = \min_{1 \leq i \leq n} \left\{ \underbrace{e_{in}}_{\substack{\text{SSE} \\ \downarrow \\ \text{SSE} = \text{error}}} + \underbrace{C + \text{line}(i-1)}_{\substack{\text{Penalty} \\ \text{for line segment}}} \right\}$$

← we can use this to solve

"Network Flow Problems"

(11)

Input: Directed graph $G(V, E)$



→ Source $S \in V$ No edges going into source

→ Sink $T \in V$ No edges coming out of sink

Integral capacity $C_e \forall e \in E$ and $C_e \geq 0$

* Assign $f_e \geq 0 \forall e \in E$ s.t

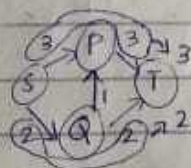
① $f_e \leq C_e \forall e \in E \rightarrow$ "CAPACITY Constraint"

② Flow in = Flow out $\forall v \neq S, T \rightarrow$ "Conservation Constraint"

(whichever goes into internal nodes, needs to get out of it)
all nodes other than source & sink are internal nodes

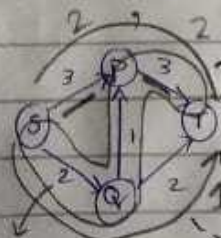
* Objective: Maximize the flow from S to T

greedy



$\rightarrow 3+2=5$
↳ minimum flow

what's the other way?



out of these min. is 1 so push 1 in each edge S & P T.

→ we also have SPT 1 out of 3 is already given by SQPT, so I am left with 2.

→ in case of SPT 1 out of 2 is already given by SQPT, so we are left with 1.

In this example, we are getting 2, 1, 1 or $2+1+1=4$ as max flow.

Now it seems like our greedy algo. which was giving 5 was good

* Greedy

Initialize

repeat

search

for

if

else

* Greedy

Ford-

Original

* $G(V, E)$

(u) C_e
 $f_e \rightarrow$

(12)

* Greedy Algo:

Initialize $f_e = 0$ for all $e \in E$

repeat

search for an $s-t$ path such that $f_e < c_e$
for every $e \in P$

if no such path then stop with current flow f_e ($e \in E$)

else let $\Delta = \min_{e \in P} (c_e - f_e)$
room on edge e
room on path P

for all edges $e \in P$ increase f_e by Δ } we have Augmented the flow by Δ

* Greedy Picked the "wrong" path.

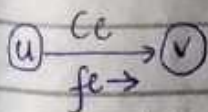
Ford-Fulkerson Algo:

Implement
"Undo"
operation.

↓
e.g. in last
example
we changed
SOT from
3 to 2
our Δ was
2 (from 3 and)
becoz it's
min.

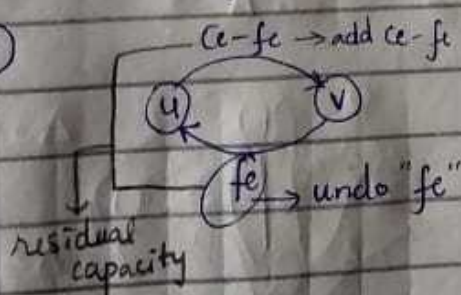
Original Graph

* $G_1(V, E)$



* Residual Graph \rightarrow will have
some extra edges
which are
not present in
real graph G_1 .

$G_2(V, E')$



122

* Ford Fulkerson AGO (FF)

Initialize $f_e = 0$ for all $e \in E$

repeat

Search for an s-t path 'P' such that $f_e < c_e$

for every $e \in P$ in residual graph G_f

if no such path then STOP with current flow $f_e \in E$

else let $\Delta = \min_{e \in P} (\text{residual capacity of } e \text{ in } G_f)$

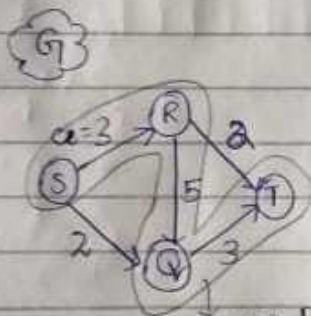
for all edges e of G where forward edge is in P

increase f_e by Δ

for all edges e of G where reverse edge is in P

decrease f_e by Δ

eg



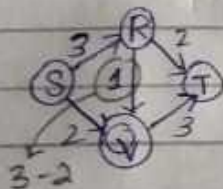
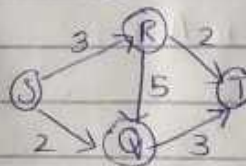
wrong path

coz I can take SRT or SQRT

so why SRQT.

min. of these is 3 so our $\Delta = 3$

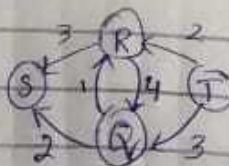
G_f



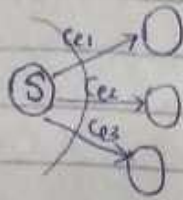
$\Delta 3 \Rightarrow P = \text{SRQT}$

$\Delta 2 \Rightarrow P = \text{SQRT}$

out of 2, 3, 2; 2 is min so $\Delta = 2$



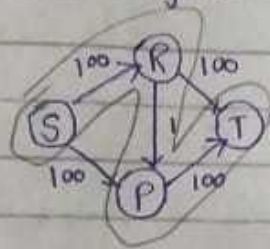
2nd December 2019
Monday



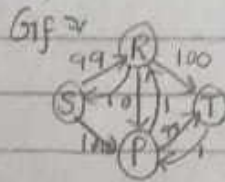
$$C = \sum_{e \in \delta^+(S)} c_e$$

edges coming out of S

Case where FF gives a wrong maxflow?



SRPT



i.e. the max flow is proportional to C but actual max flow is way lesser than this

* Next time it would be "SRPT" and then again SRPT and this will go on

Maxflow = 200

Time complexity = $O\left(C \cdot \underbrace{(\min n)}_{\text{for BFS or DFS}}\right) \approx O(E) \text{ or } O(C \cdot m)$

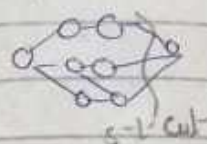
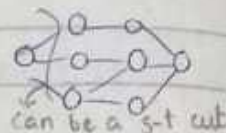
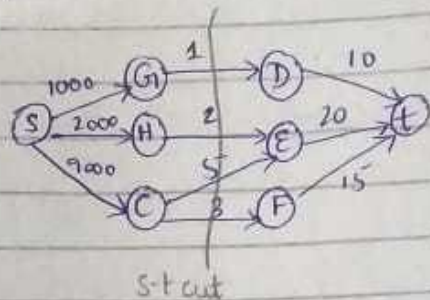
This a "pseudo polynomial" complexity because it depends on the value of our capacities.

* Edward Karp Alg (built on basis of FF) uses the path which has min. no. of hops. (from S to T)

* Maximum Flow - Min cut theorem:

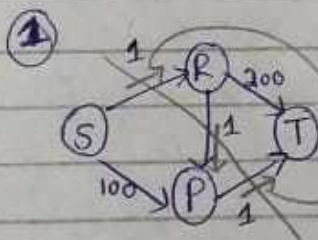
* S-t cut An s-t cut of graph $G(V, E)$ is a partition of V into sets A, B with $s \in A$ and $t \in B$.

eg

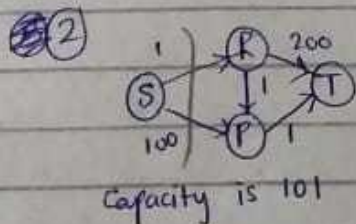


s-t cut can be anywhere but it must contain 'S' in A and 'T' in B.

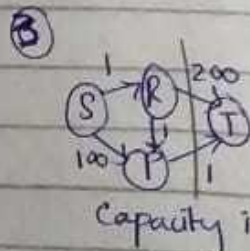
* Capacity of cut = $\sum_{e \in S^+(A)} c_e$
edges coming out of set A



only two coming out of set A.
So Capacity is 2 \rightarrow $S \rightarrow R \ 1 \rightarrow 2$
 $P \rightarrow T \ 1$



Capacity is 101



Capacity is 201

Manflow for (1) is 2 ... set $A = \{S, P\}$ $B = \{R, T\}$
 $\downarrow \quad \quad \downarrow$
 $1 + 1 = 2$

* Theorem let 'f' be a flow in graph $G(V, E)$.

The following are equivalent (i.e. all these statements hold or none of them hold)

- ① f is max flow of G.
- ② There is an s-t cut (A, B) such that the value of f equals the capacity of cut (A, B)
- ③ There is no s-t path (with respect "to" residual capacity) in the residual network G_f .

* Proof:

$$\textcircled{2} \rightarrow \textcircled{1} \rightarrow \textcircled{3} \rightarrow \textcircled{2}$$

$$\textcircled{2} \rightarrow \textcircled{1} \quad \text{value of } f = \sum_{e \in \delta^+(s)} f_e - \sum_{e \in \delta^-(s)} f_e \rightarrow \textcircled{1}$$

outgoing edges incoming edges

zero \rightarrow becoz no edge coming in S or towards S.

$$\sum_{e \in \delta^+(v)} f_e - \sum_{e \in \delta^-(v)} f_e = 0 \quad \text{for every } v \neq s, t \rightarrow \textcircled{2}$$

Add ① & ②

$$\text{value of } f = \sum_{v \in A} \left(\sum_{e \in \delta^+(v)} f_e - \sum_{e \in \delta^-(v)} f_e \right) = \sum_{e \in \delta^+(A)} f_e - \sum_{e \in \delta^-(A)} f_e$$

\downarrow \downarrow

$$\leq \sum_{e \in \delta^+(A)} c_e$$

must be some number or zero.
 ≥ 0
f cannot exceed capacity

$$\sum_{e \in \delta^+(A)} f_e - \sum_{e \in \delta^-(A)} f_e = \sum_{e \in \delta^+(A)} c_e \leftarrow \text{capacity of cut (A, B)}$$

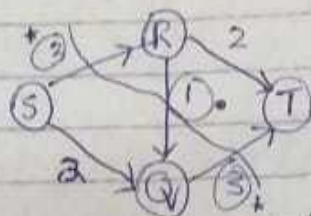


the edges that are only in A or only in B are not involved in calculation of value of flow.

LAST CLASS

24th December 2019
Wednesday

* Max Flow - Min Cut Theorem Continued



capacity = 6
flow = 6 - 1

* contributes to capacity
• capacity - • contributes to flow

2 → 1 → 3 → 2

* ① → ③

(not 3 implies not 1)

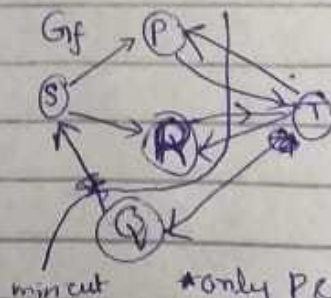
proof it by contrapositive i.e. ③ → ①

⇒ f can be augmented so it could not previously have been the max flow.

How can I draw a mincut?

In my residual graph, I will look for the nodes that are reachable from S & these nodes will be part of Set A and they will be part of the section where we have ⑤.

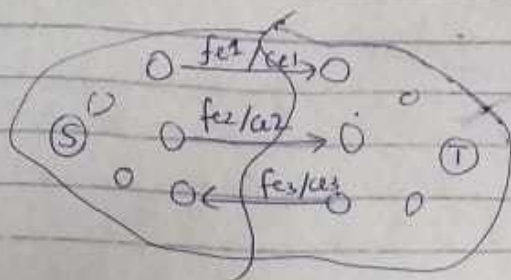
"good example in slides"



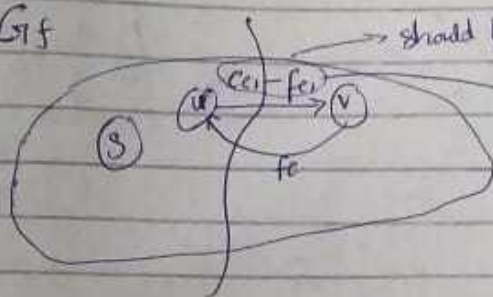
min cut * only P & R reachable from S

11 December 2019
Wednesday

* $(3) \rightarrow (2)$



G, f



→ should be equal to zero

→ should be saturated

i.e. [no remaining capacity]

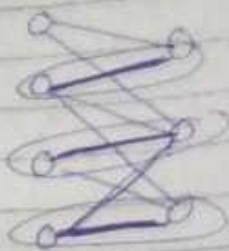
if all the edges coming out of A are saturated then we'll have no edge coming back to set A, this means that sum of ~~flow~~ of those edges = ~~capacity~~ capacity.

$$f_e = c_e$$

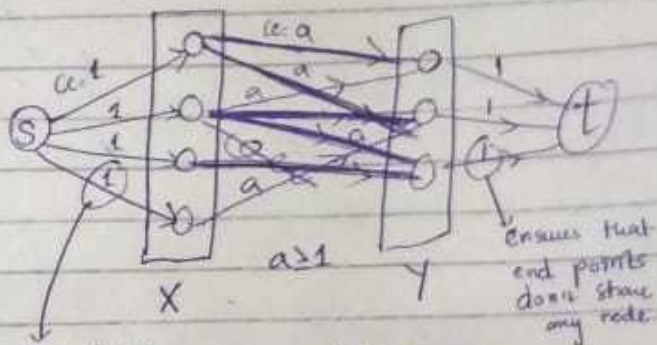
to f from

Applications:

* Bipartite Matching Reduction!



the best match.
(we can have 3)
How can we have these?



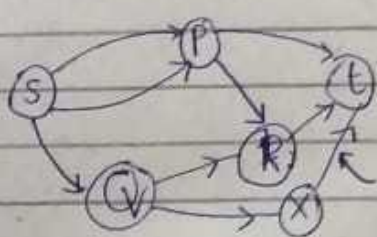
this shows that only 1 ~~node~~ ^{capacity} edge [out of ~~node~~ X] can be selected.

Matching
Set of edges where their end points don't share any node.

* Input = $G(V, E)$, $s, t \in V$

s - t edge-disjoint paths in G

i.e. no two paths share an edge, but they can share vertices



How many ^{such} paths can we have?

set capacity of each edge to 1.

How do I ensure that any edge in my path contains the flow for that path?

I want to avoid situations like

