

MESSAGES

PHONE CALLS

WEDNESDAY

NOVEMBER

10

Asymptotic Analysis: not a well-defined

↑

Program → what is running time?

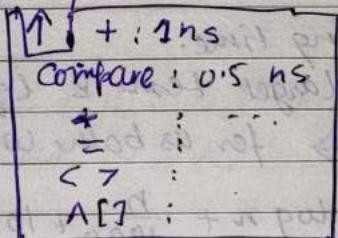
- I/P not specified
- S/M not specified.
- CPU h/w.

$$\begin{array}{l} \uparrow n \\ +2n \end{array}$$

$$\text{sum} = 0$$

$$+2n \text{ for } i=1 \dots n:$$

$$\text{sum} = \text{sum} + A[i]$$



algo as a

sequence of

(base) inst

1 unit of time

- Get an "approximate time": in sec in ms, "hours", indep ...?

- compare algorithm?

- how many UNITS of time? counting: $\frac{4n+100}{6n+1}$ factor 2^{-3} loss.

only concern with large n .

max. n, A

$$+1 \quad \text{max} = -1$$

5321 $\downarrow 12^3 \text{ us}$ +2n. for i = 1 ... n do depend on relative value.

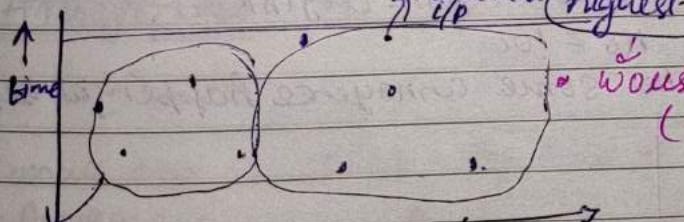
$$+2n \quad \text{if } \text{max} < A[i] \quad \text{max} = A[i]. \quad \text{Avg} \rightarrow 2l = 2 \log_2 n.$$

O/P max.

$4n+2+2l$, running time not be expressions on n alone.

conditional expression: running time could depend critically on these

? all actual highest



never comes different i/p's of length(n)

1999

• Best-Case

• average Case

• (Running time on i/p may come from

some i/p which is more likely)

• difficult to calculate

• some i/p may be more likely

• permutations

• i/p may come from

JULY	7
M	1
T	2
W	3
F	4
S	27
WK	

AUGUST	8
M	30
T	31
W	1
F	2
S	3
WK	31/08

SEPTEMBER	9
M	1
T	2
W	3
F	4
S	5
WK	36

OCTOBER	10
M	6
T	7
W	8
F	9
S	10
WK	37

NOVEMBER	11
M	1
T	2
W	3
F	4
S	5
WK	45

DECEMBER	12
M	1
T	2
W	3
F	4
S	5
WK	49

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THURSDAY
NOVEMBER

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1. # basic instⁿ $\frac{1}{2}n^2 + 6n$
 2. worst possible i/p for each n $(n^2 + 1)$
 3. compare alg. we understand how running time scales as we raise n

A is better. (as we only care abt how running time scale as we raise)
 $n = 2n$. $A = 2A$ but $B = 4A$

$T(n)$: expression for running time.

only care abt the larger terms & ignore constant

3rd type of approximation } $\frac{A}{4n}$ $\frac{B}{100n}$ \Rightarrow for us both will same.

$\Theta()$ notation.

$$100n^2 \log n + \frac{n}{1000} + 1000000n^2 \\ O(n^2 \log n).$$

Class 2: 12/Aug.

Defⁿ. $O(n)$ notation: Running time, some known fixed

$f(n), g(n)$ are two fun of n , where n is non-ve we say that $f(n) = O(g(n))$ if

$\exists c > 0 \quad f(n) \leq c g(n) \text{ for all } n$

$$\text{eg. } f(n) = 2n \quad g(n) = n \quad 2n \leq 2(n)$$

f c g.

$$f(n) = 100n^2 + 50n \quad g(n) = n^2 \quad f(n) \leq 150g(n)$$

$f(n) = \text{why we need to have } n_0 \text{ is mis defn}$ ($n > n_0$)

$$f(n) = n \quad n \geq 1$$

we still want to have $f(n) = O(g(n))$.

$$n_0 = 100.$$

$f(n) = \begin{cases} n & n > 100 \\ 0 & \text{otherwise} \end{cases}$ There could be some annoyance happening before $n_0 = 100$.

$$f(n) = O(g(n))$$

$\exists f_{c>0} \quad f_{n_0>0}$ such that

A zu h

$$f(n) \leq c g(n)$$

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MESSAGES

PHONE CALLS

FRIDAY
NOVEMBER

12

- $f(n) = n \quad g(n) = n^2$
 $f(n) \neq O(g(n)) \leftarrow \text{by contradiction}$
 $\rightarrow \text{suppose there is an } c, n_0 \text{ st. } f(n) \leq c g(n) \quad \forall n > n_0$
 $n^2 \leq cn \quad \forall n > n_0$
 $\boxed{n \leq c} \quad \forall n > n_0$
- $g(n) = n \text{ if } n \text{ is even}$ $f(n) = n$
 $1 \text{ if } n \text{ is odd}$
 $\text{if } f(n) = O(g(n))$
 $\text{suppose } f \text{ no, } c \text{ st } f(n) \leq c g(n) \quad \forall n > n_0$
 $\text{pick } n \text{ which is odd } n > n_0 \quad \boxed{n \leq c} \times$
- $f(n) = \Omega(g(n)) \text{ if}$
 $f_c, f_n \notin O(n) \quad \forall n > n_0 \quad f(n) \geq c g(n)$
 $n^3 = \Omega(n), \quad n = 50 \text{ in } \Omega(n) \quad n^2 - 10000n - 70 \text{ in } \Omega(n)$

eg. $T(n)$: worst-case running time

$$T(n) = O(n^2)$$

$$T(n) = \max \{ T(I_1), T(I_2), \dots \}$$

$$\xrightarrow[\text{length}]{\text{I}_1, I_2} T(n) = O(n^2)$$

$$T(n) = \max \{ T(I_1), \dots \} \geq cn^2 \text{ for some } c \Leftrightarrow \text{there is an i/p I st } T(I) \geq cn^2$$

eg. max-finding

 $T(n) = \# \text{ times loop } ④ \text{ executed.}$

$$T(n) = O(n) \quad \text{Base Case: 1}$$

$$T(n) = \Omega(n) \quad \text{consider the i/p } 1, 2, 3, \dots, n$$

Average Case: $\theta f(n) = \Theta(g(n)) \text{ if}$

$$f(n) = O(g(n)) \text{ & } f(n) = \Omega(g(n))$$

- worst case $T(n) = \text{Avg time of running } ④ \text{ is executed.}$ - Average case $A \boxed{\text{All permutations}}$

$$\sum (\# ④ \text{ is executed once})$$

1999

count loops by user						
JULY						
M	T	W	T	F	S	S
1	2	3	4	27		
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30	31	31

AUGUST						
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30	31			1	31	
2	3	4	5	6	7	8
9	10	11	12	13	14	15
16	17	18	19	20	21	22
23	24	25	26	27	28	29
35						

SEPTEMBER						
M	T	W	T	F	S	S
				1	2	3
6	7	8	9	10	11	12
13	14	15	16	17	18	19
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27	28	29	30			
35						

OCTOBER						
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11	12	13	14	15	16	17
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25	26	27	28	29	30	31
44						

NOVEMBER						
M	T	W	T	F	S	S
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15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30					
49						

DECEMBER						
M	T	W	T	F	S	S
				1	2	3
7	8	9	10	11	12	13
14	15	16	17	18	19	19
21	20	22	23	24	25	26
28	27	29	30			
53						

13 SATURDAY
NOVEMBER

MESSAGES

PHONE CALLS

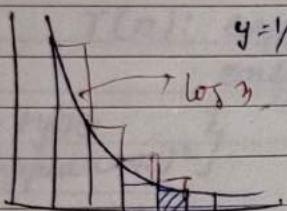
how many of me n! i/p will be update max when we compare $A[i]$, may

$$\text{choose } \frac{\binom{n}{i} \cdot (n-i)! \cdot (i-1)!}{n!} = \frac{1}{i}$$

$$\sum_{\sigma} (\# \text{ times } \circ \text{ is executed}) = \sum_{i=1}^n [\# \text{ permutations for which } \circ \text{ is exceeded} \text{ in the } i\text{th strategy}] / n!$$

$$y = \frac{1}{x} \Rightarrow \sum_{i=1}^{\infty} \left(\frac{1}{i} \right)$$

$$= 1 + \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{n} = \log n + 1$$



Amortized case:

Alg called P k time.
.k T(n).

Alg.:

✓ may be the worst case for sequence of ~~operator~~ calls.

$$T(n) = \text{worst-case}$$

eg. n in # add 1 to it.

$$\begin{array}{r} 10110011 \\ + 1 \end{array}$$

10110100

$$T(n) = \# \text{ hot open}$$

$$T(n) = \Theta(n) \quad \left\{ \begin{array}{l} T(n) = O(n) \\ T(n) = \Omega(n) \end{array} \right.$$

Suppose we start for increment- with $x=0$ & keep adding 1 if n steps what is the total running time?

$$n [n] \leq n$$

n times c/d worst case time. How often will $T(n)$ be just 1?

~~X~~ ✓ should be log n

JANUARY							FEBRUARY							MARCH							APRIL							MAY							JUNE																		
M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S												
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25	26	27	28	29	30	31	22	23	24	25	26	27	28	29	30	31	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	1	2	3	4	5	6	7

MESSAGES	PHONE CALLS	MONDAY NOVEMBER 15

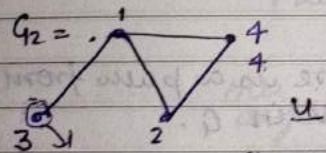
$$\frac{n}{2} \cdot 1 + \frac{n}{4} \cdot 2 + \dots + \frac{n}{2^i} \cdot i \leq \sum_{i=1}^{\log n} \frac{n}{2^i} \cdot i \leq 3n \sum_{i=1}^{\log n} \frac{i}{2^i} \leq 3$$

Amortized time complexity: n operations. Total running time of n operations
how it is different - mean Avg case!

Class 3 : 16/Aug

graphs: Study 'pairwise' relations.
example:

- FB: vertices = people, edges = friends. $E = \text{collection of pairs of } V$
 - www: vertices = webpage, edge = hyperlink $= V \times V = \{(a,b) | a \in V, b \in V\}$
 - Road n/w: vertices = city, edge = highway/roads $E \subseteq V \times V$ (directed)
 - Flight n/w: vertices = airport, edge = flight $(a,b) \neq (b,a)$ (undirected)

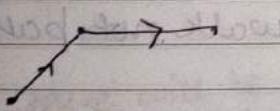


every edge contributes
two vertices' degree

1) Neighbour $\Gamma(u)$ = Set of vertices join to u by edges
 $= \{v : (u, v) \in E\}$ undirected

2) Degree of vertex $| \Gamma(u) |$

an undirected. $\sum_{u \in V} \deg(u) = 2|E|$



1) out neighbours $\Gamma^+(u)$ = set of vertex leaving u
 $\{v : (u, v) \in E\}$

D. 2) in neighbour: $T^-(u) = \{v : (v, u) \in E\}$

3) out-degree $\sum_{u \in V} \text{outdegree}(u) = |E|$
 in-degree.

② walk / path.:

a walk w is a sequence of vertices $v_1 \dots v_r$ s.t.
 $\forall i = 1, 2, \dots, r \quad (v_i, v_{i+1}) \in E$

1999 walk: vertices could repeat
could have path: vertices could not be

Cycle: walk where only 1st & last are same & others distinct.

JULY							AUGUST							SEPTEMBER							OCTOBER							NOVEMBER							DECEMBER						
M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S							
WEEK							WEEK							WEEK							WEEK							WEEK							WEEK						
1	2	3	4	5	6	7	1	2	3	4	5	6	7	1	2	3	4	5	6	1	2	3	4	5	6	7	1	2	3	4	5	6	7								
8	9	10	11	12	13	14	15	16	17	18	19	20	21	13	14	15	16	17	18	19	10	11	12	13	14	15	16	7	8	9	10	11	12	13							
15	16	17	18	19	20	21	21	22	23	24	25	26	27	20	21	22	23	24	25	26	18	19	20	21	22	23	24	14	15	16	17	18	19	15							
22	23	24	25	26	27	28	28	29	30	31	1	2	3	27	28	29	30	31	40	25	26	27	28	29	30	31	29	30	31	21	22	23	24	25	26	22					
29	30	31	31	31	23	24	25	26	27	28	29	35	27	28	29	30	31	40	25	26	27	28	29	30	31	44	29	30	31	21	22	23	24	25	26	21					

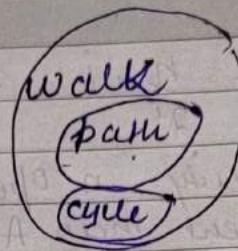
~~at least 2 vertices~~

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TUESDAY
NOVEMBER

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PHONE CALLS

 $v_1 \cdot v_2 \cdot \square / / / \square \cdots v_r$ (3) Connectivity: undirected:

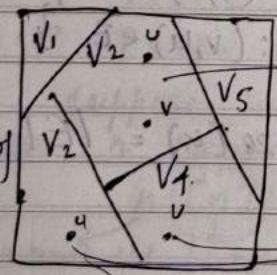
G is connected: if there is a path from every vertex u to every other vertex.

maximal connected subgraph
(something you could not expand)SubGraph: if $G(V, E)$ is a graph, then $G'(V'; E')$ is subgraph of G ,
 $\Leftrightarrow V' \subseteq V, E' \subseteq E$.

Formal defn of connected component:

we define relation on V : $u \sim v \Leftrightarrow$ there is a path from u to v in G .
is related to

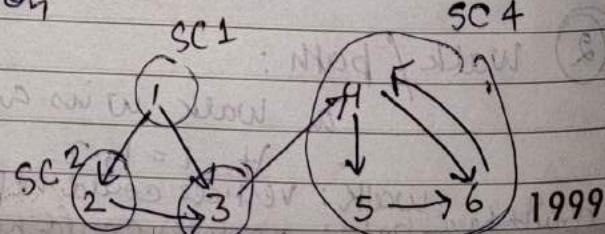
Equivalence Relation:

i) Reflexive $u \sim u$ (obvious)ii) Symmetric $u \sim v \Rightarrow v \sim u$ iii) Transitivity $u \sim v, v \sim w \Rightarrow u \sim w$ → may be walk not path.

always path. b/c in set

EQUIVALENCE CLASS

no connection

Directed Graphs: $G(V, E)$ 

JANUARY				FEBRUARY				MARCH				APRIL				MAY				JUNE			
M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK
1	2	3	1	2	3	4	1	1	2	3	4	5	6	7	10	1	2	3	4	5	6	7	10
4	5	6	7	8	9	10	2	8	9	10	11	12	13	14	11	5	6	7	8	9	10	11	14
11	12	13	14	15	16	17	3	15	16	17	18	19	20	21	12	12	13	14	15	16	17	18	21
18	19	20	21	22	23	24	4	15	16	17	18	19	20	21	8	19	20	21	22	23	24	25	28
25	26	27	28	29	30	31	5	22	23	24	25	26	27	28	9	29	30	31	14	15	16	17	27

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WEDNESDAY

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G is strongly connected if there is a path from every vertex to every vertex v .

"strongly connected" components

$u \sim v$ if there is a path from u to v & there is a path from v to u

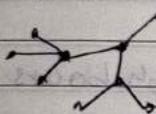
i) reflexive ✓

ii) Symm. ✓

iii) Transitivity ✓. The equivalence classes define strongly connected components.

④ Trees, forest

undirected: connected graph w/o any cycle



(They are minimally connected graphs)

(removing any edge disconnects)

fact: if G is a tree, n vertices then it has $n-1$ edges.

Proof: By induction

$$n=1 \quad n=1 \quad \text{edges} = 0.$$

our argument [induction]: suppose statement ④ is true for any tree on $n-1$ vertices. Leaf: is a $d=1$ vertex.

→ Let G be a tree on n vertices



let's remove a leaf → 1st makes no leaf exist

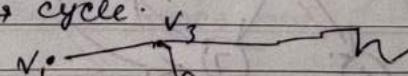
suppose every vertex has degree ≥ 2 .

there will be at least one vertex of $d=1$

$v_1, v_2, v_3, v_{i-1}, v_i, v_{i+1}$ # vertices $\neq \infty$

we form a chain v_1, v_2, \dots, v_i ∵ graph is finite some vertex will be repeated → cycle.

(leaf exists)



G' : $n-1$ vertices connected

↓ no cycle.

a tree → G' has $n-2$ edges

⇒ G has $n-1$ edges

1999

JULY	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32
M																																
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W	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	
F	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32		
S	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32			
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AUGUST	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32
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F	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32		
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SEPTEMBER	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32
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W	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	
F	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32		
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WK	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60		

OCTOBER	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32
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S	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32			
S	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32				
WK	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52	53	54	55	56	57	58	59	60		

NOVEMBER	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32
M																																
T	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32
W	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	
F	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32		
S	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32			
S	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23													

18

THURSDAY
NOVEMBER

MESSAGES

PHONE CALLS

Trees

i) connected

(i) (ii) \Rightarrow (iii)

✓

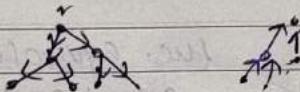
ii) No cycle

(i) (ii) \Rightarrow (ii)

{ DIY }

iii) $n-1$ edge(ii) (iii) \Rightarrow (i)

Directed: in tree, out trees.



forest:

acquiesce

How to store a graph.

1) Adjacency Matrix

A[i,j] = 1 if i & j have an directed or symmetric (store 1/2)

what kind of quest' do we answer for

i) v,v : is an edge (u,v) ?

ii) what are the neighbours.

O(n²) \rightarrow O(n²): storage space complexity

A: Is G connected? strongly conn? ✓?

2) Adjacency list

For vertex v, we store the list of neighbours of v.

Directed - one

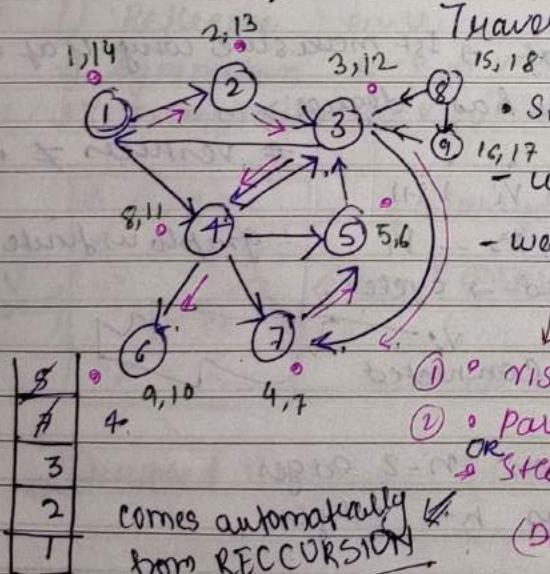
B: u,v is there a path from u to v

space = $n + \sum_{v \in V} \deg(v) = n + 2m = O(n+m)$.

C: Robust? if we remove one v, g should not be disconnected.

Class. 4 19/Aug.

Traversal of an ungraph: starting from s discover the graph



- Start from s, keep walking

- What are pitfalls? "dead end" \Rightarrow no outgoing edge.

- We might stuck in loop,

m/m sort of required

① visited [] \leftarrow array② parent [] \leftarrow the preceding vertex buff or stack

: going to a new vertex: push on stack

(DFS) Backtrack: pop from the stack

1999

JANUARY							FEBRUARY							MARCH							APRIL							MAY							JUNE							
M	T	W	T	F	S	S	M	T	W	F	S	S	W	M	T	W	T	F	S	S	W	M	T	W	T	F	S	S	W	M	T	W	T	F	S	S	W					
1	2	3	4	5	6	7	1	2	3	4	5	6	7	1	2	3	4	5	6	7	10	1	2	3	4	5	6	7	23	1	2	3	4	5	6	7	23					
4	5	6	7	8	9	10	2	1	2	3	4	5	6	7	8	9	10	11	12	13	14	1	2	3	4	5	6	7	23	1	2	3	4	5	6	7	23					
11	12	13	14	15	16	17	3	8	9	10	11	12	13	14	7	15	16	17	18	19	20	21	12	13	14	15	16	17	18	20	7	8	9	10	11	12	13	24				
18	19	20	21	22	23	24	4	15	16	17	18	19	20	21	6	22	23	24	25	26	27	28	13	12	13	14	15	16	17	20	14	15	16	17	18	19	20					
25	26	27	28	29	30	31	5	22	23	24	25	26	27	28	9	29	30	31	14	15	16	17	18	19	20	21	17	18	19	20	21	22	23	21	21	22	23	24	25	26	27	26

DFS

Runn

Con

how
- S

Obse

1999

JULY
M T W
5 6 7
12 13 14
19 20 21
26 27 28

MESSAGES

PHONE CALLS

FRIDAY
NOVEMBER

19

DFS(v)

visited[v] = false : DFS(Sh) ; (v) push : DFS call

DFS(v) :

Pop : DFS return

visited[v] = true ;

for all out neighbours of v

if visited[u] = false .

DFS(u).

Running Time: 1) for each vertex we c/d DFS(v) at most once.

(bcz visited[v] is set to blue now)

2) how much time inside running loop.

$$\sum (1 + \text{degree}(v)) = n + 2m = O(n+m)$$

Correctness: $S \subseteq V$: there is a path from S to v.
 i) $\text{DFS}(u)$ = this will exactly visit all vertices in S
 proof: induction on order of vertices in which they are visited
 base case: S is visited.

$v_1, v_2, \dots, v_i, v_{i+1} \in S \rightarrow$ the set of vertices visited by $\text{DFS}(s)$

ii) let $w \in S$ be yet unvisited

DFS
needs
edge

Suppose w is not visited by $\text{DFS}(s)$

$\text{DFS}(x)$ was called.

- consider y $\xrightarrow{\text{1}} \text{DFS}(y)$ gets c/d

$\xrightarrow{\text{2}} \text{DFS}(y)$ is not c/d.

$\xrightarrow{\text{3}} \text{visited}[v]$ was blue.

there must
be some
edge like
this

CONTRADICTION

how to explore the entire graph:

- Start from one another unvisited vertices. (per loop on v.)
 (This does not affect running time too.) can be used to count connected components

Observation:

• There must be a path from u to v, ($\nexists v_0 \text{ to } v_f$)

1999 v_n v_1 v_r

• v_1, v_{i+1} is an edge.

JULY							AUGUST							SEPTEMBER							OCTOBER							NOVEMBER							DECEMBER							
M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S								
1	2	3	4	5	6	7	30	31	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31			
5	6	7	8	9	10	11	28	29	30	31	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	
12	13	14	15	16	17	18	29	30	31	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31		
19	20	21	22	23	24	25	30	31	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31			
26	27	28	29	30	31	31	23	24	25	26	27	28	29	30	31	23	24	25	26	27	28	29	30	31	23	24	25	26	27	28	29	30	31	23	24	25	26	27	28	29	30	31
30	31	1	2	3	4	5	31	31	1	2	3	4	5	36	6	7	8	9	10	11	12	13	14	15	16	17	18	19	19	20	21	22	23	24	25	26	27	28	29	30	31	

20

SATURDAY
NOVEMBER
DFS TREE:

When we call DFS(v) ; the stack give in a path from s to v

$s \rightarrow v$

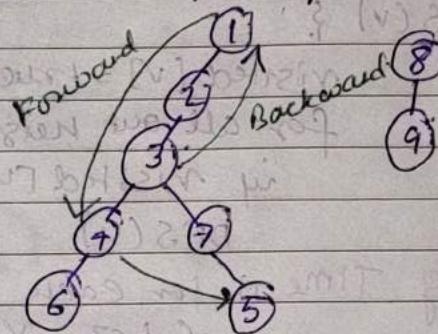
$x = v$

when ($x \neq s$)

$x = \text{parent}[x]$

The edge ($\text{parent}[u], u$) for every u

Subgraph of G



CLASS 5:

Kleinberg Tardos : Algorithm Design

- induction
- contradiction
- invariance.

- Clock \rightarrow when n calls happen \rightarrow Clock + t

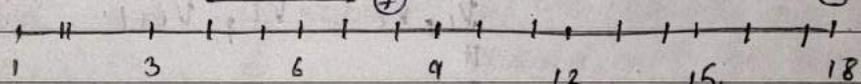
for discovery time \downarrow end \rightarrow Clock + t

for finished time

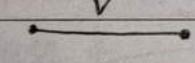
$\rightarrow 5$

① vertex

Observations:



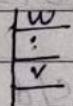
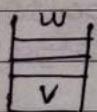
① \Rightarrow



could not happen.

that's how stack work.

w has to popped b4 v is popped. $F[v] < F[w]$



Stack is like this

CLAIM: v will be an ancestor of w in DFS tree.

why?



$\text{parent}[v'] = v \Rightarrow$ in the DFS tree v' a child of v

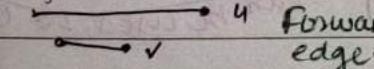
21 SUNDAY

is the converse true? Yes.

③ \Rightarrow

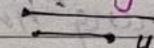
$u \rightarrow v$ is an edge in graph which is not possible

① \rightarrow



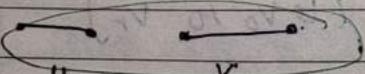
Forward edge

③ \rightarrow



v backedge

② \rightarrow



not possible

when we end DFS(u), v have been visited

1999

JANUARY

M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	1
8	9	10	11	12	13	14	2
15	16	17	18	19	20	21	12
22	23	24	25	26	27	28	13
29	30	31					14
25	26	27	28	29	30	31	5

FEBRUARY

M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	6
8	9	10	11	12	13	14	11
15	16	17	18	19	20	21	12
22	23	24	25	26	27	28	13
29	30	31					14
22	23	24	25	26	27	28	9

MARCH

M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	10
8	9	10	11	12	13	14	11
15	16	17	18	19	20	21	12
22	23	24	25	26	27	28	13
29	30	31					14

APRIL

M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	14
8	9	10	11	12	13	14	15
15	16	17	18	19	20	21	12
22	23	24	25	26	27	28	13
29	30	31					14

MAY

M	T	W	T	F	S	S	WK
31							18/23
3	4	5	6	7	8	9	19
10	11	12	13	14	15	16	20
17	18	19	20	21	22	23	21
24	25	26	27	28	29	30	22

JUNE

M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	23
8	9	10	11	12	13	14	24
14	15	16	17	18	19	20	25
21	22	23	24	25	26	27	26
28	29	30					27

MONDAY
NOVEMBER 22

As special case if G is undirected (i) \equiv (iii)
all edge must be back edge.

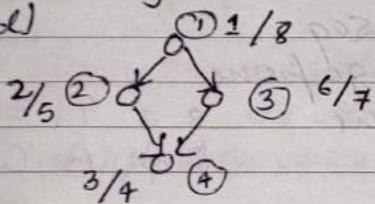
(iii) v could not present

Application:

① Given a graph G, how do we find a cycle?

(undirected) if G has any edge other than T, $T = \text{DFS}(G)$.

(directed)



no cycle v.

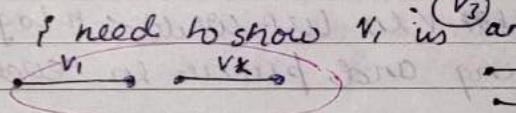
② if there is a backedge
 \Rightarrow there is an backedge

is converse true?

if there is a cycle does there have to have a backedge.

suppose G has a cycle C

③ There does not mean
DFS went like this is
cycle.



could not happen

proof by contradiction

v_1
 v_k
 v_3

suppose v_i is the vertex
with smallest $D[v]$ value
among all vertices in C.

v_k will always happen

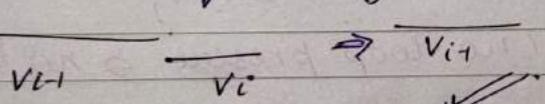
the integers v_1, v_k, v_3 are all
inside the intervals for v_3 .

suppose ④ is not true \Rightarrow

let i be the smallest index

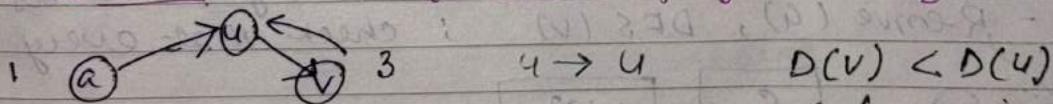
$v_1, v_2, v_3, v_4, v_5, v_6$

at some point somebody will go out



but v_5 to v_6
has edge.

Significance DAG 2 how to check if a backedge while doing DFS



and forward time is not
defined

1999

JULY						
M	T	W	T	F	S	S
1	2	3	4	27		
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30	31	

AUGUST						
M	T	W	T	F	S	S
30	31			1	0108	
2	3	4	5	6	7	32
9	10	11	12	13	14	33
16	17	18	19	20	21	34
23	24	25	26	27	28	29

SEPTEMBER						
M	T	W	T	F	S	S
			1	2	3	4
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	29	30			

OCTOBER						
M	T	W	T	F	S	S
			1	2	3	4
4	5	6	7	8	9	10
11	12	13	14	15	16	17
18	19	20	21	22	23	24
25	26	27	28	29	30	31

NOVEMBER						
M	T	W	T	F	S	S
			1	2	3	4
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30					

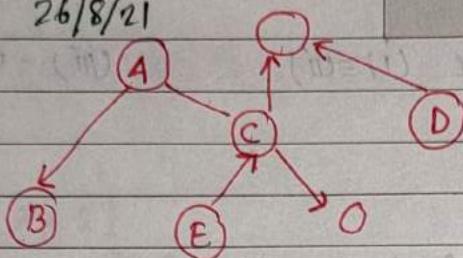
DECEMBER						
M	T	W	T	F	S	S
			1	2	3	4
7	8	9	10	11	12	50
14	15	16	17	18	19	51
21	22	23	24	25	26	52
28	29	30				53

23 TUESDAY
NOVEMBER
CLASS - 6 26/8/21

MESSAGES

PHONE CALLS

DAG:-

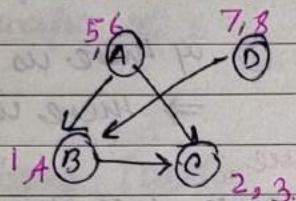


used in - computer design
open pit mining
(divide core in pb)
2 join it using
4 neighbour &
create DAG for max

Topological Sort :- is ordering of

vertices in a seq

st all edges go from
left to right



$V_{G_1}, V_{G_2}, \notin V_{G_3}, V_{G_n}$ all parr. $\leftarrow V_{G_i}$

8 6 4 3
DA BC
Finne

Avg Average the vertices perform DFS to visit all the vertices \leftarrow
 $D[v], F[v]$ value... Arg to vertices in dec ord of $F[v]$ value.

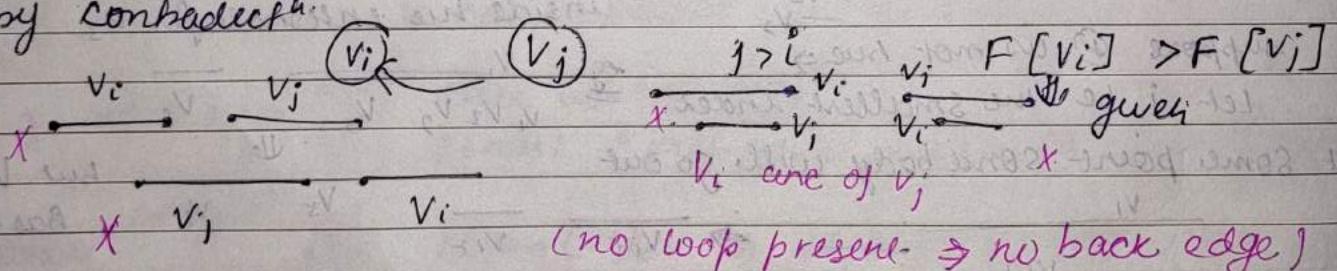
We can use stack (put v in list while n logn).

pushing and popping in reverse order).

why does it work?

$v_1, v_2, v_3, \dots, v_n$ dec ord of $F(v)$ \rightarrow

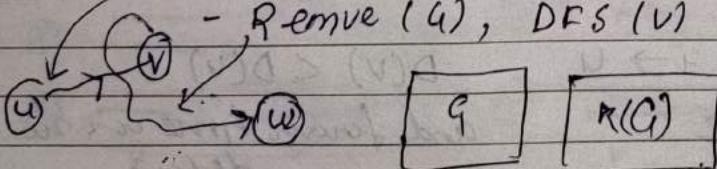
by contradiction.



Strongly connected:-

= Run DFS (v) & check that every vertex is visited

- Remove (G), DFS (v) ; check that every



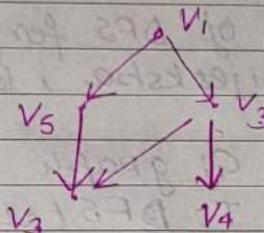
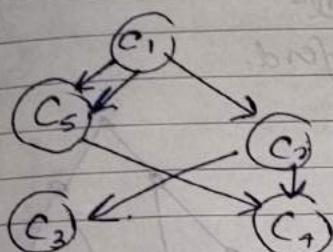
JANUARY	FEBRUARY	MARCH	APRIL	MAY	JUNE										
M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK
4 5 6 7 8 9 10 2	1 2 3 4 5 6 7 6	1 2 3 4 5 6 7 10	5 6 7 8 9 10 11 14	31	1 2 3 4 5 6 23										
11 12 13 14 15 16 17 3	8 9 10 11 12 13 14 7	8 9 10 11 12 13 14 11	12 13 14 15 16 17 18 16	3 4 5 6 7 8 9 19	7 8 9 10 11 12 13 24										
18 19 20 21 22 23 24 4	15 16 17 18 19 20 21 8	15 16 17 18 19 20 21 12	19 20 21 22 23 24 25 17	10 11 12 13 14 15 16 20	14 15 16 17 18 19 20 25										
25 26 27 28 29 30 31 5	22 23 24 25 26 27 28 9	22 23 24 25 26 27 28 13	26 27 28 29 30 18	17 18 19 20 21 22 23 21	21 22 23 24 25 26 27 26										
		29 30 31		24 25 26 27 28 29 30 22	28 29 30 27										

WEDNESDAY

NOVEMBER

24

SCC Assign.



Sink out degree = 0
Source in degree = 0

Kosaraju's Algorithm: suppose we perform DFS from u which is in a sink SCC
 how do we identify such vertex ??? \hookrightarrow congrats \Rightarrow You got-SCC

- Run DFS
- Look at the vertex with the highest $F[v]$ value. (This vertex will be in a source node)
- (the moment you start with vertex which is not source vertex you can't reach at source(DAG it is)).

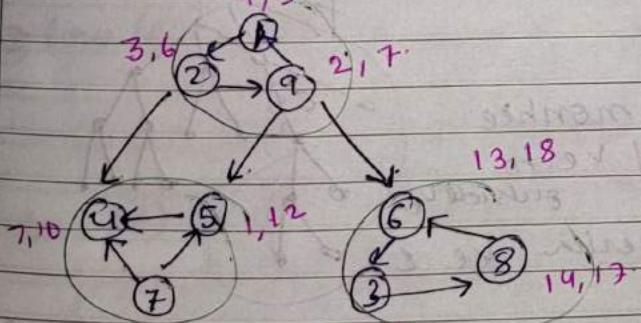
since you want to end up in sink vertex CC when reverse edge source & sink & is reversed in this case.

① Given run DFS on this

w_1, w_2, \dots, w_n dec. ord of $F[v]$ value.

for ($i = 1 \dots n$)

w_i is not visited \Downarrow on G.
 \Downarrow see which are the new vertices when are visited



rev sorted. of finish time.

6 8 3 5 7 4 9 2 1
 \Downarrow next sink

identified sink 6 8 3 found.
 \Downarrow 5, 7, 4 found

1999

8, 11

15, 16

JULY

M	T	W	T	F	S	S	WK
1	2	3	4	27			
5	6	7	8	9	10	11	28
12	13	14	15	16	17	18	29
19	20	21	22	23	24	25	30
26	27	28	29	30	31		

AUGUST

M	T	W	T	F	S	S	WK
30	31			1	31/35		
2	3	4	5	6	7	8	32
9	10	11	12	13	14	15	33
16	17	18	19	20	21	22	34

SEPTEMBER

M	T	W	T	F	S	S	WK
6	7	8	9	10	11	12	37
13	14	15	16	17	18	19	38
20	21	22	23	24	25	26	39

OCTOBER

M	T	W	T	F	S	S	WK
4	5	6	7	8	9	10	41
11	12	13	14	15	16	17	42
18	19	20	21	22	23	24	43

NOVEMBER

M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	45
8	9	10	11	12	13	14	46
15	16	17	18	19	20	21	47

DECEMBER

M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	49
7	8	9	10	11	12	13	50
14	15	16	17	18	19	18	51

25

THURSDAY
NOVEMBER

MESSAGES

PHONE CALLS

Class - 7.

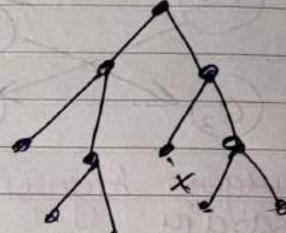
- One more application of DFS for undirected-
- BFS, connect with Dijkstra, Bellman Ford.

DFS for undirected: G : graph

T : DFS tree.

All edges in $G-T$ should be back edge.

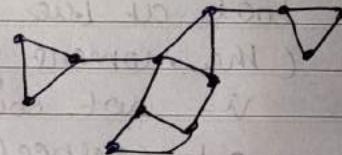
$u \rightarrow v$  could not happen.



= $G(V, E)$: undirected. we say that an edge $e \in E$ is a cut-edge if removing e disconnects the graph.

how to check if an edge e is a cut-edge?

$O(|V| + |E|)$ time using DFS
 $\hookrightarrow O(E)$ if graph is connected
 $\text{as } |E| \geq |V| + 1$



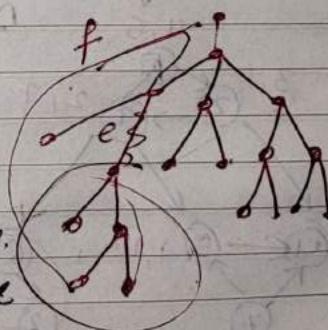
how do we find all cut edges? $O(|E|^2)$.

Def²: An edge e is a cut edge iff there is no cycle containing it.
Algo:

Run DFS:

claim: At Any edge $e \in G-T$ can not be a cut-edge
 $O(|V|, |E|)^2$

Can we do it in linear time?



e is a cut-edge iff there is no non-tree edge which goes from subtree of v_e to outside v_e .

e is a cut edge if there is a vertex v_e s.t. $v \notin v_e$ & $e \in E$ back edge

$D[v] \subset D[u]$

1999

JANUARY							1
M	T	W	T	F	S	S	WK
4	5	6	7	8	9	10	2
11	12	13	14	15	16	17	3
18	19	20	21	22	23	24	4
25	26	27	28	29	30	31	5

FEBRUARY							2
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	8
8	9	10	11	12	13	14	7
15	16	17	18	19	20	21	12
22	23	24	25	26	27	28	9

MARCH							3
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	10
8	9	10	11	12	13	14	11
15	16	17	18	19	20	21	12
29	30	31					14

APRIL							4
M	T	W	T	F	S	S	WK
							14
5	6	7	8	9	10	11	15
12	13	14	15	16	17	18	16
19	20	21	22	23	24	25	17
26	27	28	29	30			18

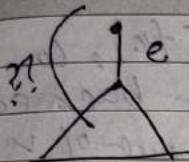
MAY							5
M	T	W	T	F	S	S	WK
31							18/23
3	4	5	6	7	8	9	19
10	11	12	13	14	15	16	20
17	18	19	20	21	22	23	21
24	25	26	27	28	29	30	22

JUNE							6
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	23
8	9	10	11	12	13	14	24
15	16	17	18	19	20	21	25
21	22	23	24	25	26	27	26
28	29	30					27

MESSAGES

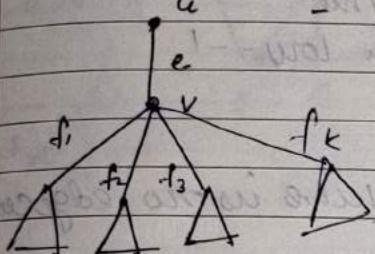
PHONE CALLS

FRIDAY
NOVEMBER **26**



near time and space

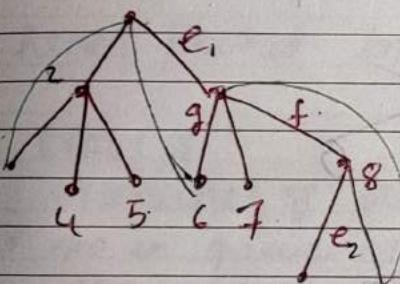
- Do traversal of the DFS tree & check this for every edge e
 - post order / pre order.



- suppose we know f_1, \dots, f_k which of them are cut edges.
 - can we figure out whether e is a cut edge or not

Is a cut edge?

low [f] : if $w + f$ is the highest such that there is a back edge $(u, v) \in V_f$,
 highest pt out of subtree.



$$\text{low}(e_1) = 1.$$

$$\text{low}(f) =$$

suppose know

$\rightarrow \text{low}[f_1], \text{low}[f_2], \dots, \text{low}[f_K]$

Can we figure out how [e]?

highest away D] and the back edge from v.

Let w_i be the one with min $D(w)$ value. $w_i \equiv v$. $\text{Env}(v) = -1$

$$\textcircled{1} \quad \text{low}(e) = w_i \text{ if } w_i \neq V \\ -1 \text{ if } w_i = V \quad \}$$

w_i : look at all the edge f_j where $\text{low}[f_j] = -1$ among them pick the vertex w/ min $D[f_j]$ value.

now (e) {
 { if e is an leaf edge.
 } $| u, v |$

1999

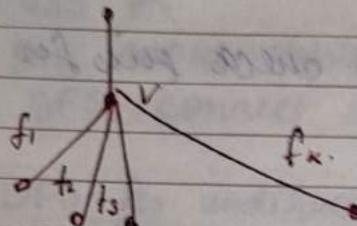
$\text{low}[e] = \text{highest back edge going out of } v$

27

SATURDAY
NOVEMBER

MESSAGES

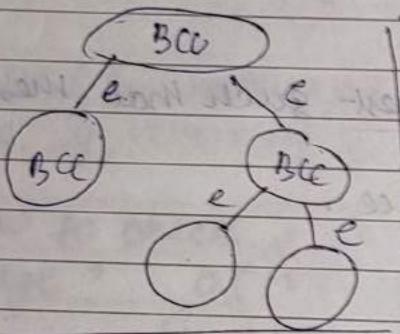
PHONE CALLS



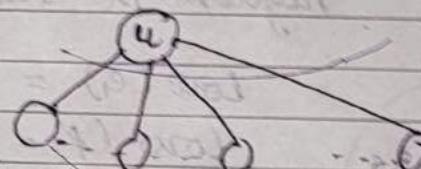
complete low (f_1) ... complete (f_2), \dots
 $low[f_i] = \emptyset$ highest back edge
 going out of V
 $O(|V|+|E|)$ time
 off all edges with $low[i] = -1$

Bi-Connected:

A graph is said to be bi-connected if there is no edge cut.

BFS

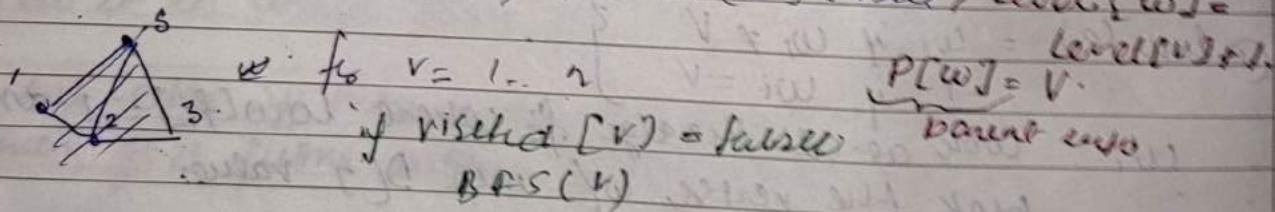
DFS is not good for finding shortest path.



BFS: tell ALL your neighbours

Queue \leftarrow enqueue. Dequeue.Enqueue (s). visited [s] = true. level [s] = 0
At each step:repeat { $V = \text{Dequeue} (Q)$ for all neighbours w of V { visited [w] = false.
enqueue (w). visited [w] = true; level [w] =

28 SUNDAY

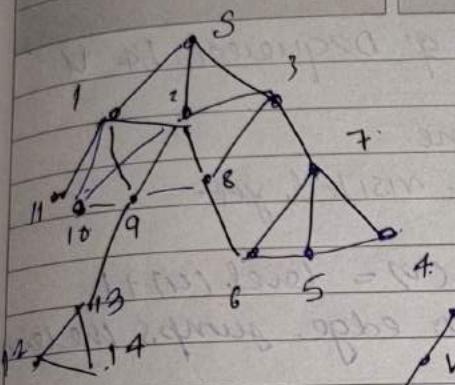


JANUARY				FEBRUARY				MARCH				APRIL				MAY				JUNE				1999								
M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK	
4	5	6	7	8	9	10	2	1	2	3	4	5	6	7	10	5	6	7	8	9	10	11	14	31	1	2	3	4	5	6	25	
11	12	13	14	15	16	17	3	8	9	10	11	12	13	14	11	12	13	14	15	16	17	18	15	3	4	5	6	7	8	18		
18	19	20	21	22	23	24	4	15	16	17	18	19	20	21	12	19	20	21	22	23	24	25	17	10	11	12	13	14	15	20		
25	26	27	28	29	30	31	5	22	23	24	25	26	27	28	9	29	30	31	14	26	27	28	29	30	18	7	8	9	10	11	12	15

MONDAY

NOVEMBER

29



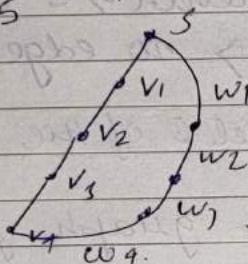
how do we prove that BFS tree is a shortest path.

Any $(u, v) \in E$ $\| \text{level}(u) - \text{level}(v) \| \leq 1$

5 edge S to V_5 is the BFS tree

suppose there is a shorter path from

S to V_5 : 4 edge ||

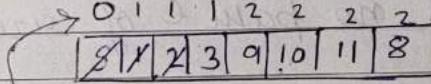


\Rightarrow any one of them is jumping 1 level which is not possible

Hence proved. That we have shortest path.

Class 8 :

Properties of BFS:



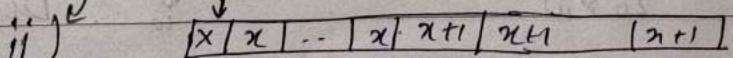
- no in queue always be like: $x, x+1, x+1, \dots, x+2, x+2, \dots$
- the queue will always has following properties
 - the levels of this vertices are in ascending order from front to rear
 - levels of any two vertices on queue by at most 1.

something will always true, for always \Rightarrow induction
Prove by induction in this case.

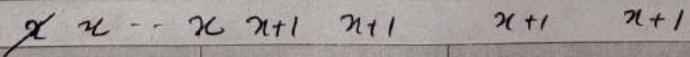
i) satisfied at beginning

ii) suppose it is satisfied at some step then it is also satisfied at next step

v. $\text{Dequeue}(v)$ enqueue some of the neighbor of v



or.



i) $[S]$

1999

0

JULY							1
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	27
8	9	10	11	12	13	14	28
15	16	17	18	19	20	21	29
22	23	24	25	26	27	28	30
28	29	30	31				31

AUGUST							2
M	T	W	T	F	S	S	WK
30	31						1
1	2	3	4	5	6	7	31/08
8	9	10	11	12	13	14	33
15	16	17	18	19	20	21	34
22	23	24	25	26	27	28	35

SEPTEMBER							3
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	36
12	13	14	15	16	17	18	37
19	20	21	22	23	24	25	38
26	27	28	29	30			39

OCTOBER							4
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	40
8	9	10	11	12	13	14	41
15	16	17	18	19	20	21	42
22	23	24	25	26	27	28	43
29	30						44

NOVEMBER							5
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	45
8	9	10	11	12	13	14	46
15	16	17	18	19	20	21	47
22	23	24	25	26	27	28	48
29	30						49

DECEMBER							6
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	49
7	8	9	10	11	12	13	50
14	15	16	17	18	19	20	51
21	22	23	24	25	26	27	52
28	29	30	31				53

30

TUESDAY
NOVEMBER

MESSAGES

[u]	...	[]
n	n	n+1 n+1

PHONE CALLS

* Suppose $(u, v) \in E$ let us say u is dequeued by u (at some time t).

where is v ? i) v is in Q at time t .

ii) v has not been visited yet.

$$\text{level}(v) = \text{level}(u)$$

$$\text{or } \text{level}(v) + 1$$

$$\text{level}(v) = \text{level}(u) + 1$$

at most 1 difference is possible \Rightarrow no edge jumps the level.



Suppose v is a vertex at level k of the BFS tree.

$$s - v_1 - v_2 - \dots - v$$

Let P be any path in the graph from s to v .

$$s \xrightarrow{w_1} v_1 \xrightarrow{w_2} v_2 \xrightarrow{w_k} v$$

$$w_1 \leq 1 \leq w_2 \leq \dots \leq w_k$$

$$\text{level}(v_1) \leq 1 \quad \text{level}(v) \leq k \Rightarrow k \geq l$$

there is no path of size less than k .

Directed Graph:

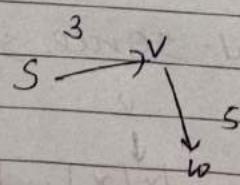
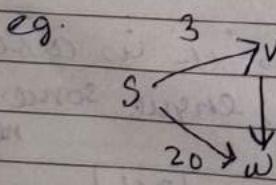
neighbours becomes out-neighbours.

$$(u, v) \Rightarrow u \xrightarrow{w} v$$

prove it yourself.

$$\text{level}(v) \leq \text{level}(u) + 1$$

Shortest-path for weighted graphs: (Directed graphs)
each edge has a weight w_e .



let's take $w_e > 0$

Dijkstra's Algo.

JANUARY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
5	6	7	8	9	10	11

FEBRUARY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
5	6	7	8	9	10	11

MARCH						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
6	7	8	9	10	11	12

APRIL						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
10	11	12	13	14	15	16

MAY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
11	12	13	14	15	16	17

JUNE						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
9	10	11	12	13	14	15

1999

MESSAGES

PHONE CALLS

WEDNESDAY

DECEMBER

01

gdeca

e ∇_e $W_e = 1 \rightarrow \text{BFS}$

\Downarrow subdivide e with W_e edges & nodes
 e can now solve ~~the us~~ BFS
 depend upon \leftarrow level of edge $W_{e[0, l]}$ $O(LIEI)$

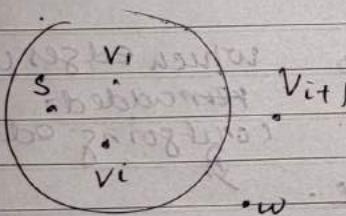
but dejkshar is doing it implicitly.

- visit the graph in BFS-like manner
- Dij's Algo will also visit vertices in order of increasing distance from S :

$s, v_1, v_2, v_3, \dots, v_k$ vertices arranged in ↑ order of distance fr s .

$s \quad v_1 \quad v_2 \quad v_i \quad v_{i+1}$
 $0 \quad d_1 \quad d_2 \quad \dots \quad d_i$

$s \xrightarrow{?} v_1$
 $s \rightarrow$ go out from the edge e leaving this set



let us consider the shortest path s to v_{i+1}

$s \rightarrow \underbrace{\dots}_{\in \{v_1, \dots, v_i\}} \rightarrow v_j \rightarrow v_{i+1}$

then the length of this path = $d_j + w(v_j, v_{i+1})$

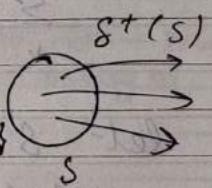
$\text{visited}[v] =$

let $S = \{s\}$ $D[s] = 0$

while ($S \neq \text{all vertices}$) {

consider all edges e in $S^+(s)$ $\{u \in S, v \notin S\}$

$$w_e = D(u) + w(e)$$



pick the edge with min weight e^*

suppose $e^* = [u, v]$ then add v to S , $D[v] = w_{e^*}$

1992

JULY	AUGUST	SEPTEMBER	OCTOBER	NOVEMBER	DECEMBER
M T W T F S S WK 1 2 3 4 27	M T W T F S S WK 30 31	M T W T F S S WK 1 2 3 4 5 36	M T W T F S S WK 1 2 3 4 10 40	M T W T F S S WK 8 9 10 11 12 13 14 46	M T W T F S S WK 1 2 3 4 5 6 7 45
5 6 7 8 9 10 11 28	2 3 4 5 6 7 8 32	6 7 8 9 10 11 12 37	4 5 6 7 8 9 10 41	15 16 17 18 19 20 21 47	7 6 8 9 10 11 12 50
12 13 14 15 16 17 18 29	9 10 11 12 13 14 15 33	13 14 15 16 17 18 19 38	11 12 13 14 15 16 17 42	14 13 15 16 17 18 19 51	
19 20 21 22 23 24 25 30	16 17 18 19 20 21 22 34	20 21 22 23 24 25 26 39	18 19 20 21 22 23 24 43	22 23 24 25 26 27 28 48	21 20 22 23 24 25 26 52
26 27 28 29 30 31 31	23 24 25 26 27 28 29 35	27 28 29 30 40	25 26 27 28 29 30 31 44	29 30 49	28 27 29 30 31 53

02 THURSDAY DECEMBER

MESSAGES

PHONE CALLS

Proof of
correctness

After i iterations of the while loop.

$S = \{s, v_1, \dots, v_i\}$ & $D[v]$ will be the shortest path distance from s to v for all $v \in S$.

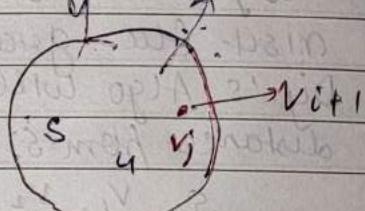
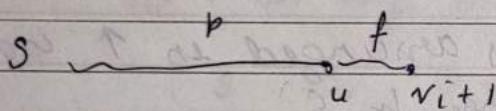
Base case $S = \{s\}$. $D[s] = 0$

Inductⁿ $S = \{s, v_1, \dots, v_i\}$ $D[v_1], \dots, D[v_i]$

Claim $v = v_{i+1} \& x_e^* = D[v]$.

Let P be shortest path

from s to v_{i+1}

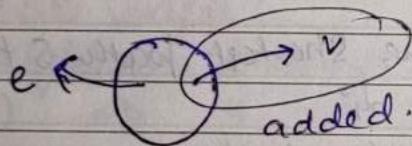


length of P $x_f = D[u] + l(f) = D[v_{i+1}]$.

path P from s to v . $x_e^* = D[v_j] + l(e^*)$

$x_e^* \leq x_f \Rightarrow v = v_{i+1} \quad x_e^* = D[v_{i+1}]$

Can we improve from here?



which incoming edges will be removed. which edges will be added. (outgoing edges for)

→ we can use heaps. ? problem will be delete.

→ we can use AVL tree. \downarrow value of $e \in S(s)$

→ can use fibonacci heaps.

$\sum_{v \in V} \deg(v) \log n \rightarrow O(|E| \log n)$

$(m+n \log n)$

let $S \leftarrow \{s\}$ $d(v) \rightarrow \infty$

while ($)$ { d

for every edge $e (u, v) \in \delta^+(s)$

$$d[v] = D[u] + w(e)$$

same as previous code.

1999

JANUARY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

FEBRUARY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

MARCH						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

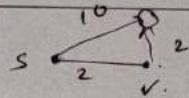
APRIL						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

MAY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

JUNE						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

MESSAGES

PHONE CALLS



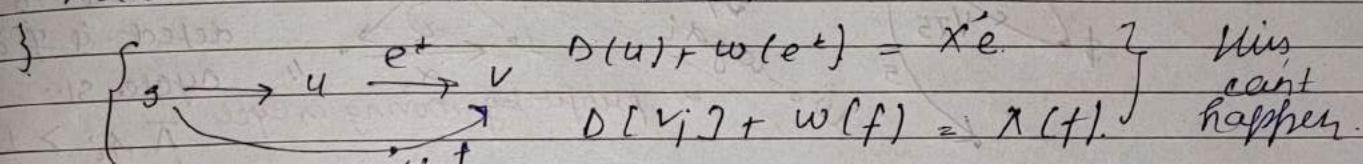
FRIDAY

DECEMBER

03

pick the vertex $v \in S$ w/ min $d(v)$ value.

Add v to S $D(v) = d(v)$.



morals of the story

now store the $D[v]$ on heap next x_e values
just get the minⁿ

class 9

6/9/21

what Dijkshet do? $\min d(v) = \min [w_e + D[u]]$

$$\begin{matrix} e \in u, v \\ u \in S \\ v \notin S \end{matrix}$$

we want to know $\min d(v)$.

- take all edges coming to v from S . & choose the min

$$D[S] = 0 \text{ initially } d[v] = \infty \quad v \neq S$$

repeat {

let v be a vertex $\text{visited}[v] = \text{false}$ & $d[v]$ is min

$$\text{visited}[v] = \text{true} \quad D[u] = d[u]$$

for all edges $e: (u \rightarrow v)$ where $\text{visited}[v] = \text{false}$

$$d[v] = \min [d[u], w_e + D[u]]$$

$$P[v] = u.$$

en-

}

Fibonacci heap $(m + n \log n)$
heap $m \log n$
AVL

what happen if w_e is -ve ??

g) $w_e = -1$ & edges: longest path $\min -1P$ $\max |P|$

\Rightarrow NP hard problem

1999

JULY						
M	T	W	T	F	S	S
1	2	3	4	27		
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30	31	

AUGUST						
M	T	W	T	F	S	S
30	31		1	2	3	4
2	3	4	5	6	7	8
9	10	11	12	13	14	15
16	17	18	19	20	21	22
23	24	25	26	27	28	29

SEPTEMBER						
M	T	W	T	F	S	S
1	2	3	4	5	36	
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	29	30		39	

OCTOBER						
M	T	W	T	F	S	S
	1	2	3	4	5	36
4	5	6	7	8	9	10
11	12	13	14	15	16	17
18	19	20	21	22	23	24
25	26	27	28	29	30	31

NOVEMBER						
M	T	W	T	F	S	S
1	2	3	4	5	6	45
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30				49	

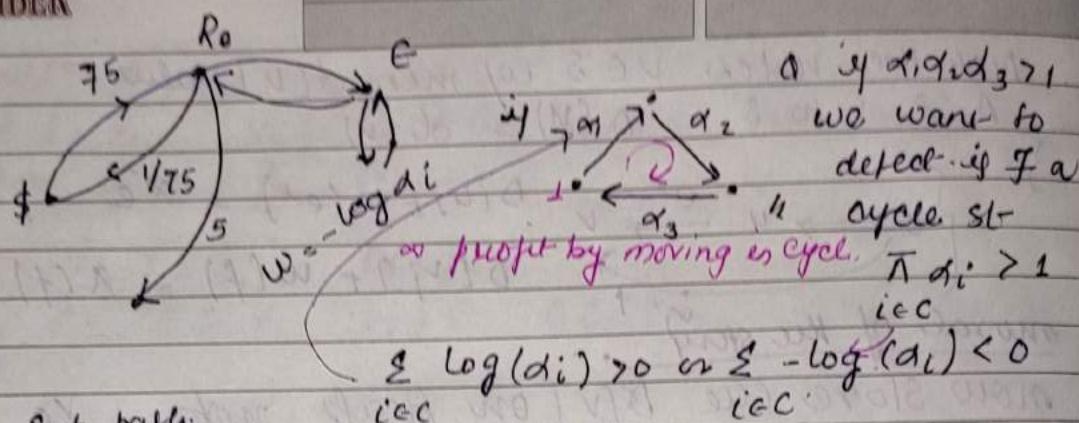
DECEMBER						
M	T	W	T	F	S	S
	1	2	3	4	5	49
7	8	9	10	11	12	50
14	15	16	17	18	19	19
21	20	22	23	24	25	26
28	29	30			53	

04 SATURDAY
DECEMBER

MESSAGES

PHONE CALLS

ii) Currencies



$\alpha_1 \alpha_2 \alpha_3 > 1$
we want to detect if α_i is a cycle s.t $\prod \alpha_i > 1$
 $i \in C$

$$\sum_{i \in C} \log(d_i) > 0 \text{ or } \sum_{i \in C} -\log(d_i) < 0$$

get shortest S-T path

shortest S-T walk \rightarrow most algo tried to solve

most algo try to do this

if -ve edge present then length of shortest S-T path

walk would be < length of shortest S-T Cycles.

As long as, if no negative cycle shortest walk = shortest path

There are polynomial time algo to find the shortest ST path

Bellman Ford :

$O(mn) \Rightarrow O(m \log n) \Rightarrow$ dynamic

maintain $d[v]$ = estimate of shortest-path from s to v .

$D[v] =$ length of " " " "

$d[v] \geq D[v]$ always

$d[u] \xrightarrow{e} d[v]$

$D[v] \leq d[u] + we$

$\leq d[u]$

$< d[v]$

if $(d[v] > d[u] + we)$ then

$d[v] = d[u] + we$

5 SUNDAY

repeat :

if there is an edge (u, v) st-

$d[v] > d[u] + we$

update

$d[v] = d[u] + we$

1999

JANUARY						
M	T	W	T	F	S	S
1	2	3	1			
4	5	6	7	8	9	10
11	12	13	14	15	16	17
18	19	20	21	22	23	24
25	26	27	28	29	30	31

FEBRUARY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

MARCH						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

APRIL						
M	T	W	T	F	S	S
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30		

MAY						
M	T	W	T	F	S	S
31	1	2	3	4	14	
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30		

JUNE						
M	T	W	T	F	S	S
1	2	3	4	5	6	23
7	8	9	10	11	12	13
14	15	16	17	18	19	20
21	22	23	24	25	26	27
28	29	30				

JULY						
M	T	W	T	F	S	S
5	6					
12	13					
19	20					
26	27					

MESSAGES

PHONE CALLS

MONDAY
DECEMBER 06

until no edge can be found.

why will it terminate??

$$D[v] \leq u$$

$O(nV)$ # steps

⇒ this procedure will run into a loop if there is a -ve cycle.

Proof: suppose (n), suppose it terminates p.

e_i = it must be the case

this must be the case.

$$d[v_{i+1}] \leq w_{e_i} + d[v_i]$$

Inequalities

add them all

$$d[v_2] \leq w_{e_1} + d[v_1]$$

$$d[v_3] \leq w_{e_2} + d[v_2]$$

$$d[v_i] \leq w_{e_{i-1}} + d[v_{i-1}]$$

$$\therefore 0 \leq w_{e_1} + w_{e_2} + w_{e_3}$$

writing Algo in a diff way.

e_1, e_2, \dots, e_m

for $i = 1 \dots n-1$

for $j = 1 \dots m$

suppose $e_j = (v_j, v_j)$

$$\therefore d[v_j] > d[u_j] + w_{e_j}$$

$$d[v_j] = d[u_j] + w_{e_j}$$

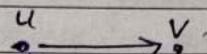
if there is an edge $e(u \rightarrow v)$

$d[v] > d[u] + w_e$ then detect -ve cycle.

Claim $\forall v \in V$ $d[w] > D[w]$

PF by induction on # steps
base case: $D[v] = \infty$ ✓
when R happens is its still

true?



by IH P has

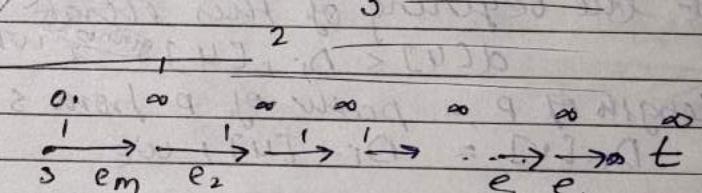
length $\leq d[u]$

$$(i.e. d[u] \geq D[u])$$

$$D[v] \leq d[u] + w_e$$

??

contradiction
with starting



you almost
not need to

do it $- O(m^2)$

$D_i[v] = \text{shortest path from } s \text{ to } v \text{ using } \leq i \text{ edges}$

$$D_i[v] = \begin{cases} 0 & \text{if } v = s \\ \infty & \text{if } v \neq s \end{cases}$$

1999

JULY						
M	T	W	T	F	S	S
1	2	3	4	27		
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30	31	31

AUGUST						
M	T	W	T	F	S	S
30	31			1	31/08	
2	3	4	5	6	7	8
9	10	11	12	13	14	15
16	17	18	19	20	21	22
23	24	25	26	27	28	29
30	31			35		

SEPTEMBER						
M	T	W	T	F	S	S
1	2	3	4	5	30	
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	29	30			35

OCTOBER						
M	T	W	T	F	S	S
1	2	3	4	5	30	
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30			40		

NOVEMBER						
M	T	W	T	F	S	S
1	2	3	4	5	30	
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30			41		

DECEMBER						
M	T	W	T	F	S	S
1	2	3	4	5	30	
7	8	9	10	11	12	13
14	15	16	17	18	19	19
21	22	23	24	25	26	26
28	29	30		42		

07 TUESDAY
DECEMBER

MESSAGES

PHONE CALLS

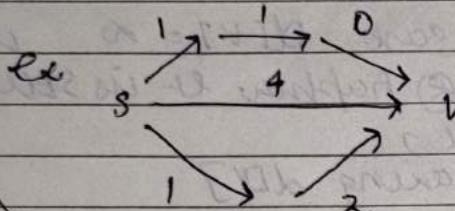
Claim: After i iteration of outer for loop

$$d[v] \leq D_i[v]$$

$$d[v] = D_{n-1}[v]$$

$$D''[v]$$

atmost-
(allow 0 edge)



$$D_0[v] = \infty$$

$$D_1[v] = 4$$

$$D_2[v] = 3$$

$$D_3[v] = 2$$

Proof by induction of i

$$\rightarrow i=0 ? \quad d[v] = \infty \quad d[s] = 0$$

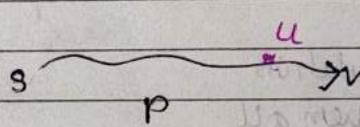
$$\left\{ \begin{array}{l} D[v] = \infty \quad v \neq s \\ D[v] = 0 \quad v = s \end{array} \right.$$

$$\left\{ \begin{array}{l} D[v] = \infty \quad v \neq s \\ D[v] = 0 \quad v = s \end{array} \right.$$

Suppose it is true for $i-1$

$$\left. \begin{array}{l} \leftarrow d[u] \leq D_{i-1}[v] \\ \leftarrow d[v] \leq D_i[v] \end{array} \right. \text{if } u \neq v$$

$$d[v] \leq D_i[v] \quad \text{if } u \neq v$$



let p be the shortest $s-v$ path of length atmost i

at the beginning of this else

$$d[u] \leq D_{i-1}[u] \quad \text{when we look at this edge during the for loop}$$

length of p = path of p from $s-u$ + edge e .

$$D_i[v] = D_{i-1}[u] + w_e$$

$$d[v] \leq d[u] + w_e$$

$$\begin{aligned} & D_{i-1}[u] \\ & = D_i[v] \end{aligned}$$

• very distributed algorithm. every edge can update its own.

Class 90 9/sep/21, computational problem: min/max some quantity
Greedy Algorithm: a solⁿ which achieve this min/max
coin changing problem.

values / $C_1, C_2, C_3, \dots, C_n$

denomination ↗ supply

find: find an exact change for n coins as few coin as possible

1999

JANUARY							FEBRUARY							MARCH							APRIL							MAY							JUNE							
M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S	M	T	W	T	F	S	S								
1	2	3	1				1	2	3	4	5	6	7	6	1	2	3	4	5	10	5	6	7	8	9	10	11	15	31	1	2	3	4	5	6	23						
4	5	6	7	8	9	10	2	1	2	3	4	5	6	7	6	8	9	10	11	12	15	16	17	18	19	20	21	16	3	4	5	6	7	8	19							
11	12	13	14	15	16	17	3	8	9	10	11	12	13	14	7	15	16	17	18	19	20	21	22	23	24	25	10	11	12	13	14	15	20									
18	19	20	21	22	23	24	4	15	16	17	18	19	20	21	8	22	23	24	25	26	27	28	13	19	20	21	22	23	24	17	17	18	19	20	21	25						
25	26	27	28	29	30	31	5	22	23	24	25	26	27	28	9	29	30	31	14	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	22	28	29	30	27	27

MESSAGES

PHONE CALLS

WEDNESDAY

DECEMBER

08

each step do something that seems right at that point - pick the biggest coin $c_1 < M$ $c_n \geq 1$, $M - c_1$

$$\text{ex. } c_1 = 1, c_2 = 7, c_3 = 10$$

$$M = 14 \quad 2 \text{ coins of } 7$$

$10, 1, 1, 1, 1$ 5 coins acc. to greedy. L.O.L.

what if $c_1/c_2, c_2/c_3, \dots, c_r/c_n$? then greedy is optimal.

how do we prove that a greedy is correct?

- i) the 1st step is correct & agrees w/ the algo on 1st step.
- ii) use induction.

if optimal $s_1 | s_1 s_2 \dots s_k$ After taking the 1st step the problem
soln. $s_2 | s_2 ? \rightarrow$ becomes same type of problem.

1st step agrees on this \uparrow optimal soln 0 where the 1st step is also.

s_1 : problem where we have already taken the 1st step.

$0_2, -0_3, \dots$

$(0_1, s_2 - s_1)$ is only better than $0_1, 0_2, 0_3, \dots, M$ coins

coin changing problem: $c_1 \dots c_n$ $c_1/c_2, c_2/c_3, \dots, c_{n-1}/c_n$

M : pick the largest coin $c_i < M$, $M - c_i$

coin chose

$c_1, c_2, \dots, c_n \} i) a_1 = c_1$ think about it 1st step

$c_1, c_2, \dots, c_n \} ii) Both $c_2, \dots, c_n \leq c_1$ On the first change $M - c_1$$

repetition is here claim: greedy alg is optimal.

proof- by induction $n-1 \leq k-1$

induction on M greedy optimal, substructure problem.

$\Rightarrow n \leq k$

$n = \# \text{ coins in optimal soln}$

$k = \# \text{ coin w/ greedy}$

EXCHANGE ALGO ??

1999

JULY							1
M	T	W	T	F	S	S	WK
1	2	3	4	27			
5	6	7	8	9	10	11	28
12	13	14	15	16	17	18	29
19	20	21	22	23	24	25	30
26	27	28	29	30	31		31

AUGUST							8
M	T	W	T	F	S	S	WK
30	31			1	3	5	36
2	3	4	5	6	7	8	32
9	10	11	12	13	14	15	33
16	17	18	19	20	21	22	34
23	24	25	26	27	28	29	35

SEPTEMBER							9
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	36
6	7	8	9	10	11	12	37
13	14	15	16	17	18	19	38
20	21	22	23	24	25	26	39
27	28	29	30				40

OCTOBER							10
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	40
8	9	10	11	12	13	14	41
15	16	17	18	19	20	21	42
22	23	24	25	26	27	28	43
29	30						44

NOVEMBER							11
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	45
8	9	10	11	12	13	14	46
15	16	17	18	19	20	21	47
22	23	24	25	26	27	28	48
29	30						49

DECEMBER							12
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	49
7	8	9	10	11	12	13	50
14	15	16	17	18	19	19	51
21	22	23	24	25	26	27	52
28	29	30	31				53

09 THURSDAY
DECEMBER

MESSAGES

PHONE CALLS

weighted completion time scheduling

job	j_1	j_2	\dots	j_n
size	P_1	P_2	\dots	P_n
weight-w	w_1	w_2	\dots	w_n

$$\begin{array}{|c|c|c|c|} \hline C_2 & j_1 & j_5 & J_C \\ \hline \end{array}$$

j_1 | j_2 | j_3

Schedule: an order in which to process the jobs

Cj: completion time of job

Goal: min $\sum C_{ji} \cdot W_{ji}$

$$J_2 \quad | \quad J_3 \quad | \quad J_7 \\ 3 \rightarrow \quad | \quad 5 \quad | \quad 7 \\ 3 \quad | \quad 8 \quad | \quad 15 \quad CT_{im}$$

Greedy Algo: $\frac{w_1}{p_1} \geq \frac{w_2}{p_2} \geq \dots \geq \frac{w_n}{p_n}$

sortin jobs in this order & execute it - is this order

i) There is an opt algo which also processes job 1 1st

5 | 3 | 1 | 2 | - | 1 | 0 | }

1, 2, 3 -- 10

exchange argument: consider an opt solⁿ

→ jobs here
are not affected.

Modify opt to a new optimal soln

swap $j \geq 1$ to move toward greedy sol^w, but get ℓ th sure Goal will be
going to better

tryng = B4 live scope T+

$$(T + P_j) w_j + (T + b_j + P_i) w_i$$

After the sleep

$$(T + P_1) w_1 + (T + P_j + P_1) w_j \leq 0$$

1999

JANUARY							1	FEBRUARY							2	MARCH							3	APRIL							4	MAY							5	JUNE							6
M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK	M	T	W	T	F	S	S	WK								
4	5	6	7	8	9	10	2	1	2	3	4	5	6	7	6	1	2	3	4	5	6	7	10	1	2	3	4	14	14	1	2	3	4	5	6	6	23										
11	12	13	14	15	16	17	3	8	9	10	11	12	13	14	7	8	9	10	11	12	13	14	11	15	6	7	8	9	10	11	15	3	4	5	6	7	8	9	19								
18	19	20	21	22	23	24	4	15	16	17	18	19	20	21	8	22	23	24	25	26	27	28	13	12	13	14	15	16	17	16	10	11	12	13	14	15	16	20									
25	26	27	28	29	30	31	5	22	23	24	25	26	27	28	9	29	30	31					14	19	20	21	22	23	24	17	17	18	19	20	21	22	21										
																											26	27	28	29	30		18	24	25	26	27	28	29	30							

MSES

PHONE CALLS

FRIDAY

DECEMBER

10

$P_i w_j \leq P_j w_i$ (everything else changes)

$\frac{w_i}{P_i} > \frac{w_j}{P_j}$ (true) do it in recursive manner

swap i.e., it starts

ii) suppose the greedy algo is optimal when there $< n$ jobs suppose we have n jobs $\frac{w_1}{P_1} > \dots > \frac{w_n}{P_n}$

by step (i) there is an opt solⁿ O_1, \dots, O_n where $O_1 = 1$

(1, 2, 3, ..., n) steps
 (0, 0, 2, ..., 0, n)

by induction hypothesis:

weighted comp time $(1, 2, 3, \dots, n) \leq$ weight comp $(0, 0, \dots, 0, n)$
 (same greedy algo on smaller job)

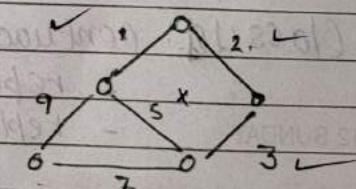
weighted comp $(1, \dots, n) = w_1(1) + \dots + w_n(n)$

weight comp $(0, \dots, 0, n) = w_1(0) + w_2(0) + \dots + w_n(n)$

optimal solⁿ greedy solⁿ is better or equal to optimal (since it can't be better \Rightarrow it is same.)

Minimum Spanning Tree:

$G \not\models (V, E)$ e: we connected



Goal: pick a spanning tree of min total wt

greedy Alg. $w_{e_1} \leq w_{e_2} \leq w_{e_m}$

$T \leftarrow \emptyset$

repeat {

if adding e_i to T does not create a cycle
 pick e_i & add it to T

1999

JULY	AUGUST	SEPTEMBER	OCTOBER	NOVEMBER	DECEMBER
M T W T F S S WK	M T W J F S S WK	M T W T F S S WK	M T W T F S S WK	M T W T F S S WK	M T W T F S S WK
1 2 3 4 5 6 7 27	30 31	1 2 3 4 5 36	1 2 3 4 5 30	1 2 3 4 5 6 7 45	1 2 3 4 5 6 49
5 6 7 8 9 10 11 28	2 3 4 5 6 7 8 32	6 7 8 9 10 11 12 37	4 5 6 7 8 9 10 41	8 9 10 11 12 13 14 46	7 6 8 9 10 11 12 50
12 13 14 15 16 17 18 29	9 10 11 12 13 14 15 33	13 14 15 16 17 18 19 38	11 12 13 14 15 16 17 42	15 16 17 18 19 20 21 47	14 13 15 16 17 18 19 51
19 20 21 22 23 24 25 30	16 17 18 19 20 21 22 34	20 21 22 23 24 25 26 39	18 19 20 21 22 23 24 43	22 23 24 25 26 27 28 48	21 20 22 23 24 25 26 52
26 27 28 29 30 31 31	23 24 25 26 27 28 29 35	27 28 29 30 40	25 26 27 28 29 30 31 44	29 30 49	28 27 29 30 31 53

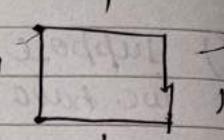
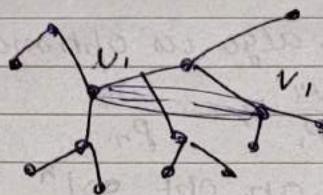
11

SATURDAY
DECEMBER

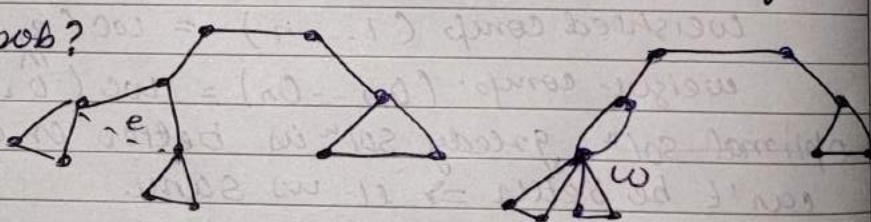
MESSAGES

PHONE CALLS

why is this optimal: pick edges

i) let us say greedy $g_1, g_2, \dots, g_{n-1} : G \cup g_i \leq w_{g_i} \leq w_g$
optimal $o_1, o_2, \dots, o_{n-1} : O$ O also contain g_i ? not sure but O an optimal sol'n which has g_i in O Add let O does not g_i ,
 $g_i \in (u, v)$ Add G_i to the sol'n O ; Create a cycle. Remove any one edge from this cycle

\Rightarrow the cost will always go down or remains same
 & modify something in O to show that greedy's 1st step can be incorporated.

ii) let's say that e is removed. (e can't remain
Now what is remaining prob?
that is of same kindcontract e .Class 10: contract an edge $e = (u, v)$ - replace u, v to a new vertex w .

12 SUNDAY

- replace all edges (u, x) or (v, x) by (w, x) (except for all edges b/wsuppose there is a spanning tree T in G which contains e The T' : tree obtain by contracting e T' is a spanning tree in G' Conversely if T' is a spanning tree in G' then $T' + e$ is a spanning tree in G .

1999

JANUARY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30	31	

FEBRUARY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	29	30	31		

MARCH						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
10	11	12	13	14	15	16
17	18	19	20	21	22	23
24	25	26	27	28	29	30

APRIL						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				
11	12	13	14	15	16	17
18	19	20	21	22	23	24
25	26	27	28	29	30	

MAY						
M	T	W	T	F	S	S
31						
1	2	3	4	5	6	7
10	11	12	13	14	15	16
17	18	19	20	21	22	23
24	25	26	27	28	29	30
1	2	3	4	5	6	7
14	15	16	17	18	19	20
21	22	23	24	25	26	27

JUNE						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30					
2	3	4	5	6	7	8
11	12	13	14	15	16	17
18	19	20	21	22	23	24

MESSAGES

PHONE CALLS

MONDAY
DECEMBER

13

$$e_2, e_3, \dots, e_k, e_{k+1}$$

greedy : $(g_1) \dots g_{n-1}$

opt : $(o_1) \dots o_{n-1}$

$$g_1 = o_1 = e.$$

g_2, \dots, g_{n-1} is the spanning tree produced by greedy on g'

o_2, \dots, o_{n-1} is also a spanning tree in G' by induction hypothesis

$$\begin{aligned} \text{cost}(g_2, \dots, g_{n-1}) &\leq \text{cost}(o_2, \dots, o_{n-1}) \\ &+ \text{cost}(g_1) + \text{cost}(o_1) \\ \Rightarrow \text{cost(greedy)} \text{ on } G' &\leq \text{cost(opt)} \text{ on } G' \end{aligned}$$

example: what if we started w/ prim's algo
start by taking min wt edge & go on.

Huffman Encoding:

A A B AA C AA BC AAA ← given a text/string

↓ encode as binary string S : alphabet

00 00 01 00 00 10 $A: 00$ $\mathcal{Z} = \{A, B, C\}$
 $2n$ $B: 01$ R
 $C: 10$

variable length encoding

A: 0 00 10 00 11 much smaller.

B: 10

C: 11

take another case.

A: 0	
B: 01	ACAC BDC
C: 11	011011 0110 11
D: 10	.

} prfpr free property l_1, \dots, l_k
 \Rightarrow encoding(l_1), encoding(l_2)...
none of these is the prefix of other

1999

JULY							WK
M	T	W	T	F	S	S	
1	2	3	4	27			
5	6	7	8	9	10	11	28
12	13	14	15	16	17	18	29
19	20	21	22	23	24	25	30
26	27	28	29	30	31		31

AUGUST							WK
M	T	W	T	F	S	S	
30	31			1	31/08		
2	3	4	5	6	7	8	32
9	10	11	12	13	14	15	33
16	17	18	19	20	21	22	34
23	24	25	26	27	28	29	35

SEPTEMBER							WK
M	T	W	T	F	S	S	
6	7	8	9	10	11	12	37
13	14	15	16	17	18	19	38
20	21	22	23	24	25	26	39
27	28	29	30				40

OCTOBER							WK
M	T	W	T	F	S	S	
				1	2	3	36
				4	5	6	
				11	12	13	41
				18	19	20	42
				25	26	27	43
				25	26	27	44

NOVEMBER							WK
M	T	W	T	F	S	S	
1	2	3	4	5	6	7	45
8	9	10	11	12	13	14	46
15	16	17	18	19	20	21	47
22	23	24	25	26	27	28	48
29	30						49

DECEMBER							WK
M	T	W	T	F	S	S	
				1	2	3	49
				7	8	9	50
				14	15	16	51
				21	22	23	52
				28	29	30	53

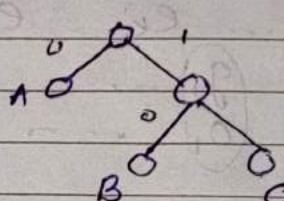
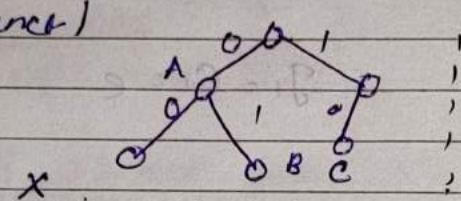
14 TUESDAY
DECEMBER

MESSAGES

PHONE CALLS

This encoding can be seen as a tree st all labels should be on leaves (distance)

A: 0
B: 01



This data structure is QD tree.

Problem: given a string, find a variable length encoding (trie) with min length of their encoding.

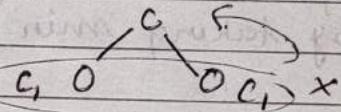
A B C D

10 50 30 70

C₁ depth(C₁) . fC₁

C₂ depth(C₂) . fC₂

try to give max length encoding to words which are less frequent.



Algo: let C₁, C₂ be the two letters with freq (fC₁, fC₂).

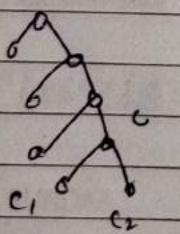
if only ↓

2 letters replace C₁, C₂ by a new letter C 11.01. 1

0.1

$$fC_1 + fC_2 = f_C$$

solve the smaller problem. Let us say the encoding C is σ (σ=0110).
encoding for C₁, C₂ are σ₀, σ₁.



earlier $f_{C_1} \cdot l_1 + f_{C_2} \cdot l_2$

Now $(f_{C_1} + f_{C_2}) \cdot e$

$f_{C_1} + f_{C_2}$ does not depend on the tree

01 00 10 11
A B C D

0 10 11
E C D

0 1
E F

A B

- 1) There is an opt soln which matches with the obs on the 4th step
- 2) Apply induction

1999

JANUARY							1
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	1
4	5	6	7	8	9	10	2
11	12	13	14	15	16	17	3
18	19	20	21	22	23	24	4
25	26	27	28	29	30	31	5

FEBRUARY							2
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	6
8	9	10	11	12	13	14	7
15	16	17	18	19	20	21	8
22	23	24	25	26	27	28	9

MARCH							3
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	10
8	9	10	11	12	13	14	11
15	16	17	18	19	20	21	12
22	23	24	25	26	27	28	13
29	30	31					14

APRIL							4
M	T	W	T	F	S	S	WK
							14
5	6	7	8	9	10	11	15
12	13	14	15	16	17	18	16
19	20	21	22	23	24	25	17
26	27	28	29	30			18

MAY							5
M	T	W	T	F	S	S	WK
31							1
1	2	3	4	5	6	7	2
3	4	5	6	7	8	9	19
10	11	12	13	14	15	16	20
17	18	19	20	21	22	23	21
24	25	26	27	28	29	30	22

JUNE							6
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	23
7	8	9	10	11	12	13	24
14	15	16	17	18	19	20	25
21	22	23	24	25	26	27	26
28	29	30					27

MESSAGES

PHONE CALLS

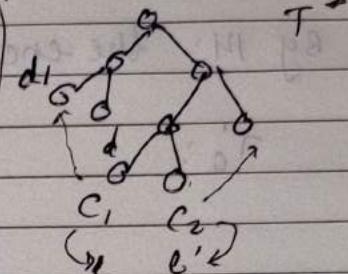
WEDNESDAY

15

$C_1 \Rightarrow$ then I am going to see
new solⁿ in only
 $C_1 C_2$ better equal to opt.

DECEMBER

Greedy: 1st combine C_1, C_2 into a new letter c .
we want to prove that there is an opt solⁿ.
where to prove that there is an opt solⁿ.
the leaves C_1, C_2 have a common parent.



why? let L be the deepest leaf in T^*

$$\begin{aligned} l &\leftarrow d \\ c_1 &\leftarrow d_1 \\ l &\leftarrow d_1 \\ c_1 &\leftarrow d \end{aligned}$$

$$f_{cl} + f_{c_1} d_1 \geq f_{cl} + f_{c_1} d$$

$$b.c.m \quad f_{cl} + f_{c_1} d - f_{c_1} d_1 - f_{c_1} d \geq 0$$

$$\Leftrightarrow (f_{cl} - f_{c_1})(d - d_1) \geq 0$$

class 12: 16/sep.

i) we showed that there is optimal solⁿ T^* where C_1, C_2 have a common parent

ii) induction proof:

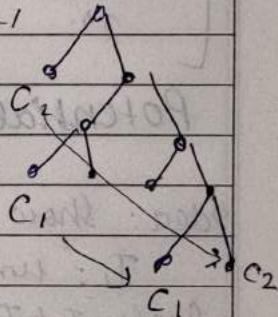
Assume that the greedy alg is optimal where there $< k-1$ letters.

k letters a_1, \dots, a_k .

ai - the 1st step greedy alg.

combine $C_1, C_2 \rightarrow C$.

By ii) there is an opt solⁿ T^* where C_1, C_2 have a common parent



$$\Sigma' = (\Sigma - \{C_1, C_2\}) \cup \{C\} : k_1 \text{ letters.}$$

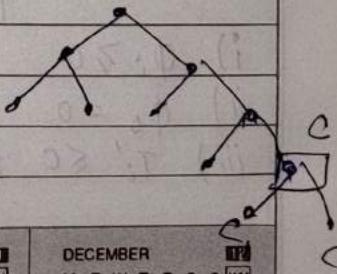
By induction hypothesis the greedy edge is opt for Σ'

$\sigma^{*1}: T^* \text{ w/ } C_1, C_2 \text{ removed \& the common parent labelled } C$.

T^* for Σ .

then $(T^*)'$ is also solⁿ for Σ'

1999 opt & greedy agrees on 1st step.



JULY							1
M	T	W	T	F	S	S	WK
1	2	3	4	5	27		
5	6	7	8	9	10	11	28
12	13	14	15	16	17	18	29
19	20	21	22	23	24	25	30
26	27	28	29	30	31		31

AUGUST							8
M	T	W	T	F	S	S	WK
30	31			1	31/08		
2	3	4	5	6	7	8	32
9	10	11	12	13	14	15	33
16	17	18	19	20	21	22	34
23	24	25	26	27	28	29	35

SEPTEMBER							9
M	T	W	T	F	S	S	WK
			1	2	3	4	36
6	7	8	9	10	11	12	37
13	14	15	16	17	18	19	38
20	21	22	23	24	25	26	39
27	28	29	30		40		

OCTOBER							10
M	T	W	T	F	S	S	WK
			1	2	3	4	40
4	5	6	7	8	9	10	41
11	12	13	14	15	16	17	42
18	19	20	21	22	23	24	43
25	26	27	28	29	30	31	44

NOVEMBER							11
M	T	W	T	F	S	S	WK
1	2	3	4	5	6	7	45
8	9	10	11	12	13	14	46
15	16	17	18	19	20	21	47
22	23	24	25	26	27	28	48
29	30				49		

DECEMBER							12
M	T	W	T	F	S	S	WK
			1	2	3	4	49
7	8	9	10	11	12	13	50
14	15	16	17	18	19	19	51
21	20	22	23	24	25	26	52
28	27	29	30	31			53

$$\Sigma \rightarrow \Sigma' \rightarrow \text{Mfgr } \Sigma^T G \rightarrow \Sigma$$

16

THURSDAY
DECEMBER

MESSAGES

T'_G

PHONE CALLS

By M: the encoding length of greedy on Σ' \leq^e length of (T'_G)

T'_G :

T'_G : greedy soln

$(T'_G)'$: greedy for Σ

Next Topic: Amortized complexity, total time / n.

$\rightarrow [A]$ $i_1, i_2, \dots, i_k \rightarrow A$

$T(n)$.

This is worst case
 $O(k T(n))$ running time

example: Bit increment:

$$\begin{array}{r} 10111011 \\ +1 \\ \hline 10111100 \end{array}$$

bit operation = 1 + # consecutive 1's at max

$$\left\{ \begin{array}{l} \sum_{i=1}^{2^n} T_i = ? \\ \leq 2^n \end{array} \right\}$$

Potential function? ϕ_i : non-ve number at the beginning of the i th step.

Idea: show that when the alg. takes lot of time potential drops]

T_i : time taken by the alg at the i th step

Goal: $T_1 + T_2 + \dots + T_n \leq C(n)$: one way of showing is that $T_i \leq C(n)/n$

modified time at step i

$$T'_i = T_i + \Delta\phi_i = T_i + \phi_{i+1} - \phi_i \quad \text{--- (1)}$$

- i) $\phi_i > 0$
- ii) $\phi_0 = 0$
- iii) $T'_i \leq C$ for each i

$$\sum_{i=1}^n T'_i \leq C \cdot n$$

1999

JANUARY						
M	T	W	T	F	S	S
1	2	3	1			
4	5	6	7	8	9	10
11	12	13	14	15	16	17
18	19	20	21	22	23	24
25	26	27	28	29	30	31

FEBRUARY						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

MARCH						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

APRIL						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

MAY						
M	T	W	T	F	S	S
31						
1	2					
3	4	5	6	7	8	9
10	11	12	13	14	15	16
17	18	19	20	21	22	23
24	25	26	27	28	29	30

JUNE						
M	T	W	T	F	S	S
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
21	22	23	24	25	26	27
28	29	30				

