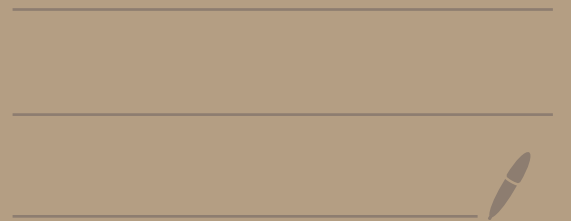


# Algorithms - Spring 2025

Flows & Cuts



## Recap

- No class next Monday, and office hours will be Wed: 1-3
- HW - due tonight
- Next HW: flows

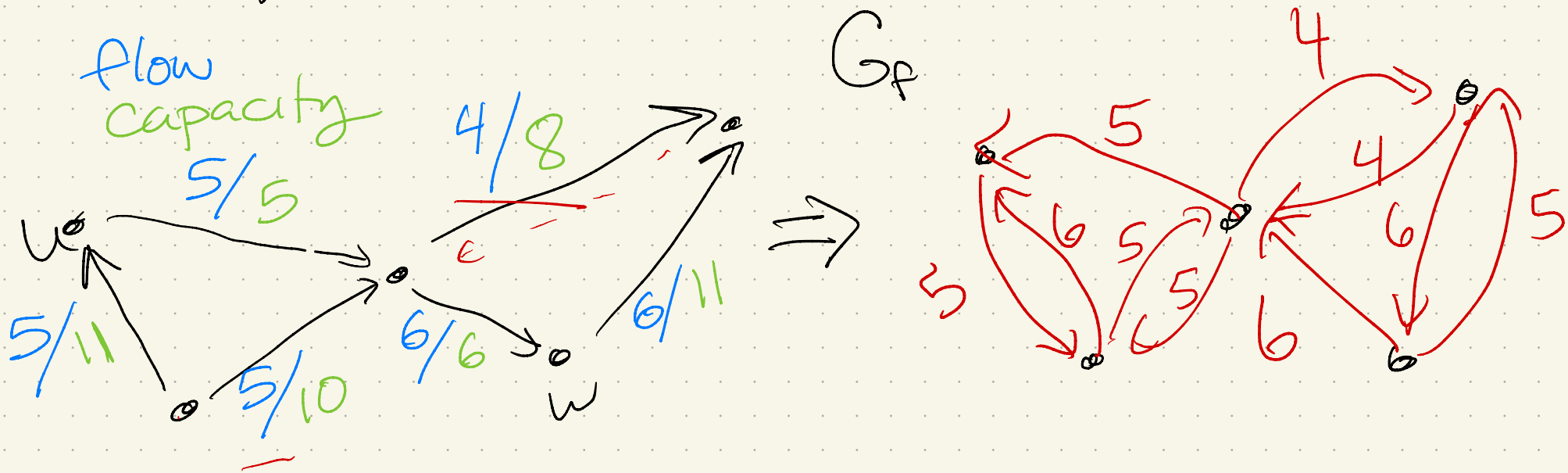
More formally: Residual network  $G_f$ :

Given  $G$  &  $f$ :

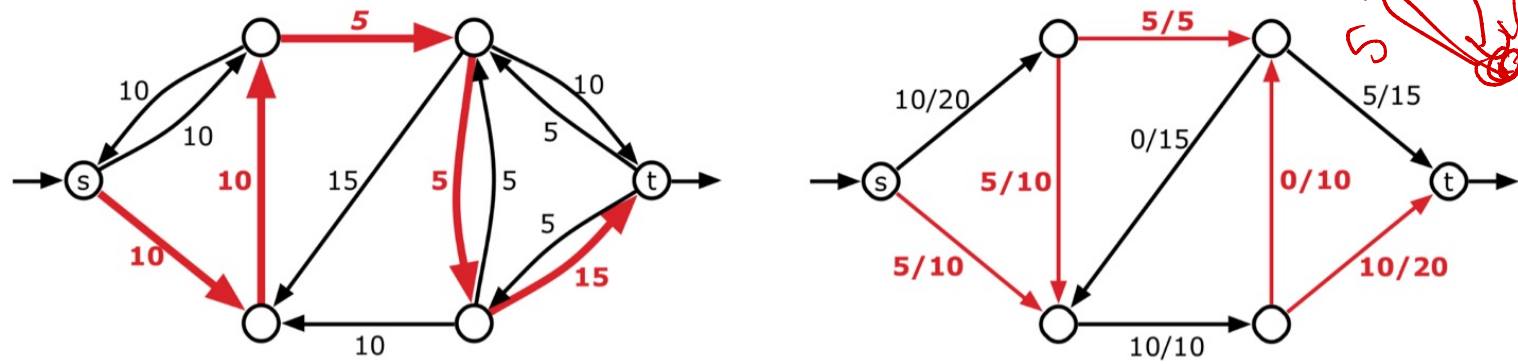
$$C_f(u \rightarrow v) = \begin{cases} c(u \rightarrow v) - f(u \rightarrow v) & \text{if } u \rightarrow v \text{ is in } E \\ \underline{f(u \rightarrow v)} & \text{if } v \rightarrow u \text{ is in } E \\ \text{no edge (or 0)} & \text{otherwise} \end{cases}$$

*if reverse edge*

Ex:  $G, f$



Augmenting a path: send more! BFS



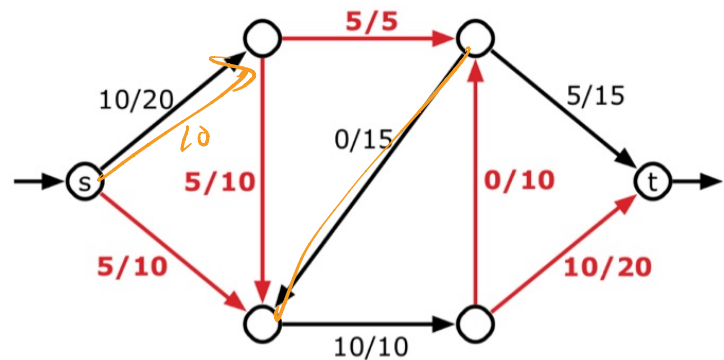
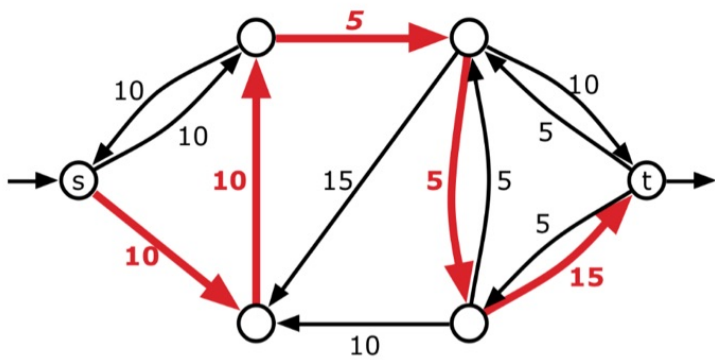
An augmenting path in  $G_f$  with value  $F = 5$  and the augmented flow  $f'$ .

This is just an  $s$ - $t$  path in  $G_f$ .

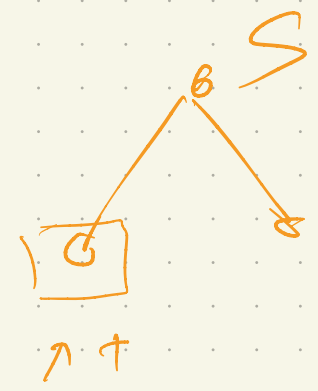
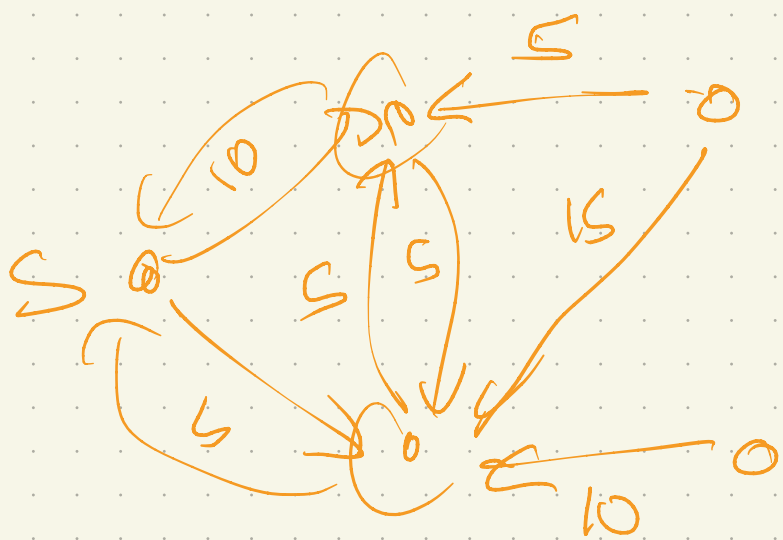
Then, find min capacity edge on that path

Claim: I can build a new flow whose value is bigger than  $f$ 's





An augmenting path in  $G_f$  with value  $F = 5$  and the augmented flow  $f'$ .



Claim: If  $f$  is a maximum flow,  
then  $G_f$  has no augmenting path

Proof: by contradiction

Assume  $f$  is maximum.

Build  $G_f$  & find path.

Use this path a bigger flow

+ bottle  
neck  
edge

$f'$

$\Rightarrow$  then  $f$  was not  
maximum

So:  $f$  wasn't a max flow, since  $f'$  is larger.

On other hand:

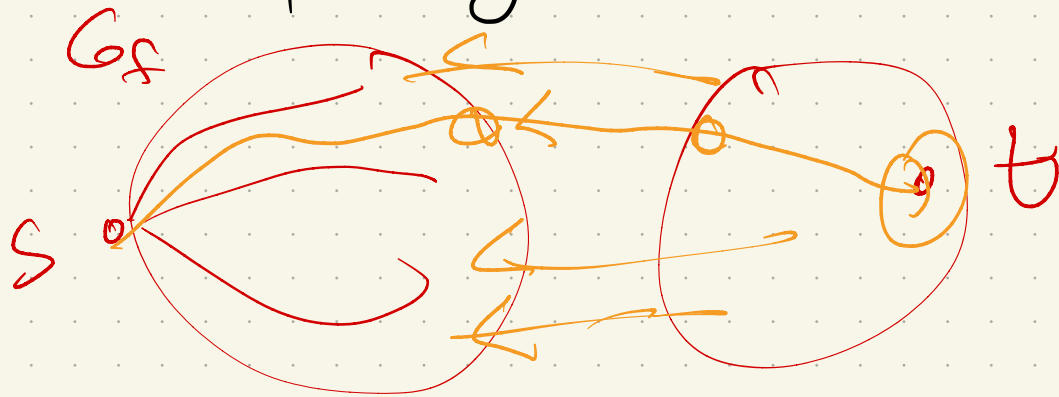
if  $G_f$  has no  $s \rightarrow t$  path, find

$|S|$  = set of vertices that  $s$  can reach

Claim:  $(S, V-S)$  is a cut.

( $f$  uses every  $S \rightarrow V-S$  edge to its max capacity)

Why?



Immediate Algorithm:  $(V+E) \cdot f^*$   
 $\approx$  max flow

Start with  $f = 0$ .

Build  $G_f$

WFS( $G_f, s$ )

While  $t$  &  $s$  in same component:

find  $s \rightarrow t$  path via WFS

Augment along the path to get  $f'$

$f \leftarrow f'$

Build  $G_f$

WFS( $G_f, s$ )

$V+E = O(E)$

$s$  &  $t$  connected

every  
time,  
flow increases

$V+E$

$O(V)$

Runtime?

loop repeats  $\leq f^*$  times

Why all this integrality stuff?

We are assuming each path pushes at least 1 more unit of flow!

Can it be that bad?

Yes:

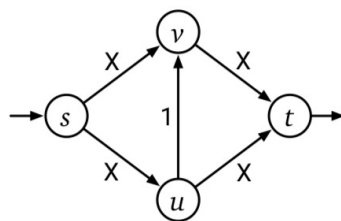


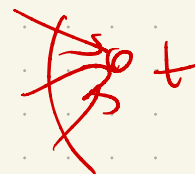
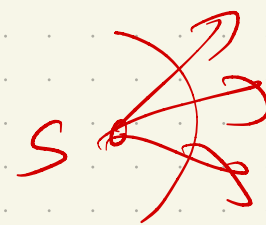
Figure 10.7. Edmonds and Karp's bad example for the Ford-Fulkerson algorithm.

+1 each round if bottleneck is that cap=1 edge

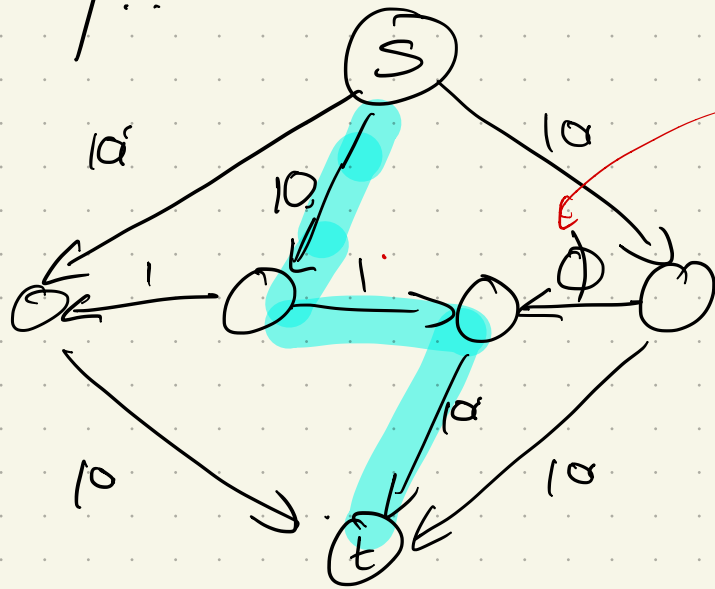
How "big" is  $f^*$ ?

(Remember, not part of input!)

$$f^* \leq \sum_{\text{all edges } u \rightarrow v} c(u \rightarrow v)$$



What if it's not integers?  
Messy!!



The key:  

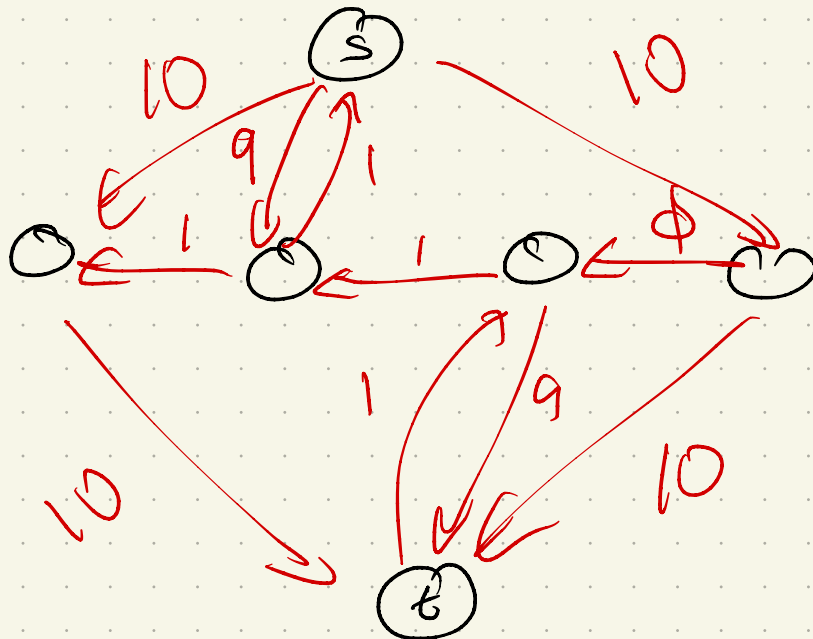
$$\phi = \frac{1 + \sqrt{5}}{2} < 1$$

WHY??

Simple:

$$1 - \phi = \phi^2$$

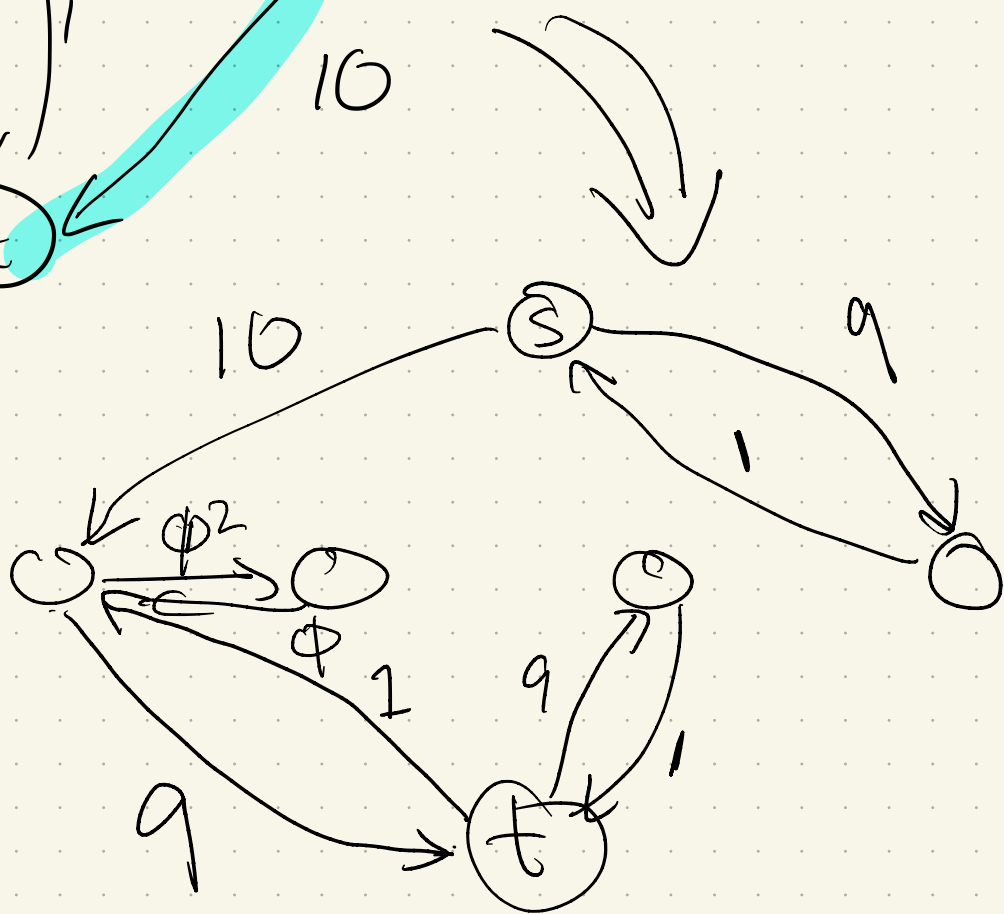
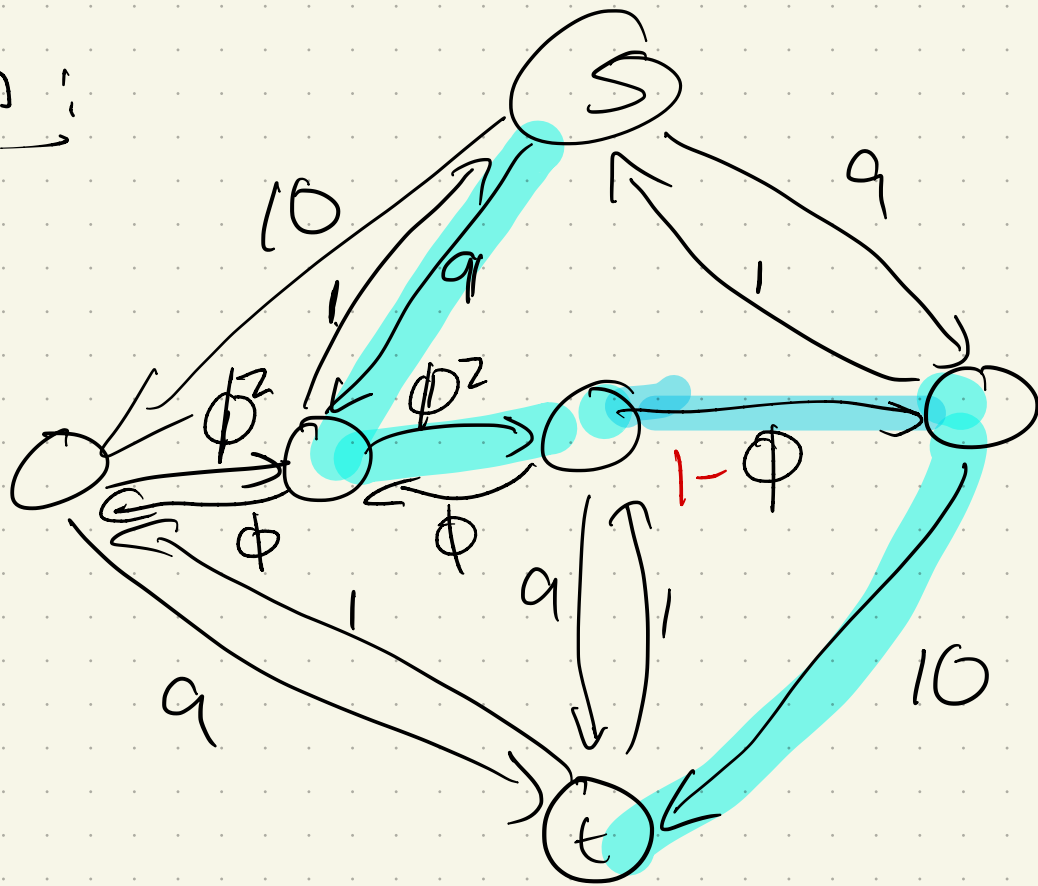
Gf:



Flow of  
val = 1



Then:





Continue to push:

assume integers!

Ends with:

$\phi$ , 0, and

$$1 - \phi = \phi^2$$

Repeat:

•  $\phi^2$ , 0,  $\phi^3$

$$(1 - \phi) \phi$$

then

•

etc ...

$$\phi^k$$

But, max flow = 21



Formalizing:

Linear combinations of flows  
result in flows!

(ignoring capacities...)

$$h(u \rightarrow v) = \alpha \cdot f(u \rightarrow v) + \beta g(u \rightarrow v)$$

$$f(u \rightarrow v) = 5$$



$$g(u \rightarrow v) = 1$$

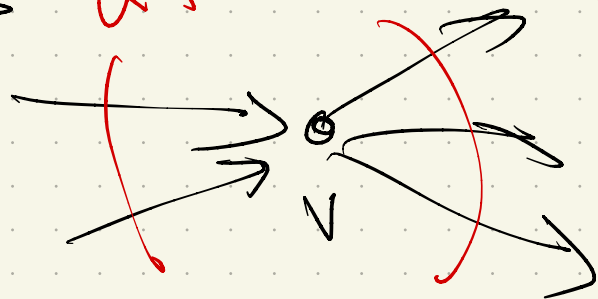
$$h = 2 \cdot 5 + 3 \cdot 1 = 13$$

vertex

constraints:  $\alpha \cdot f + \beta \cdot g$

$\alpha f + \beta g$

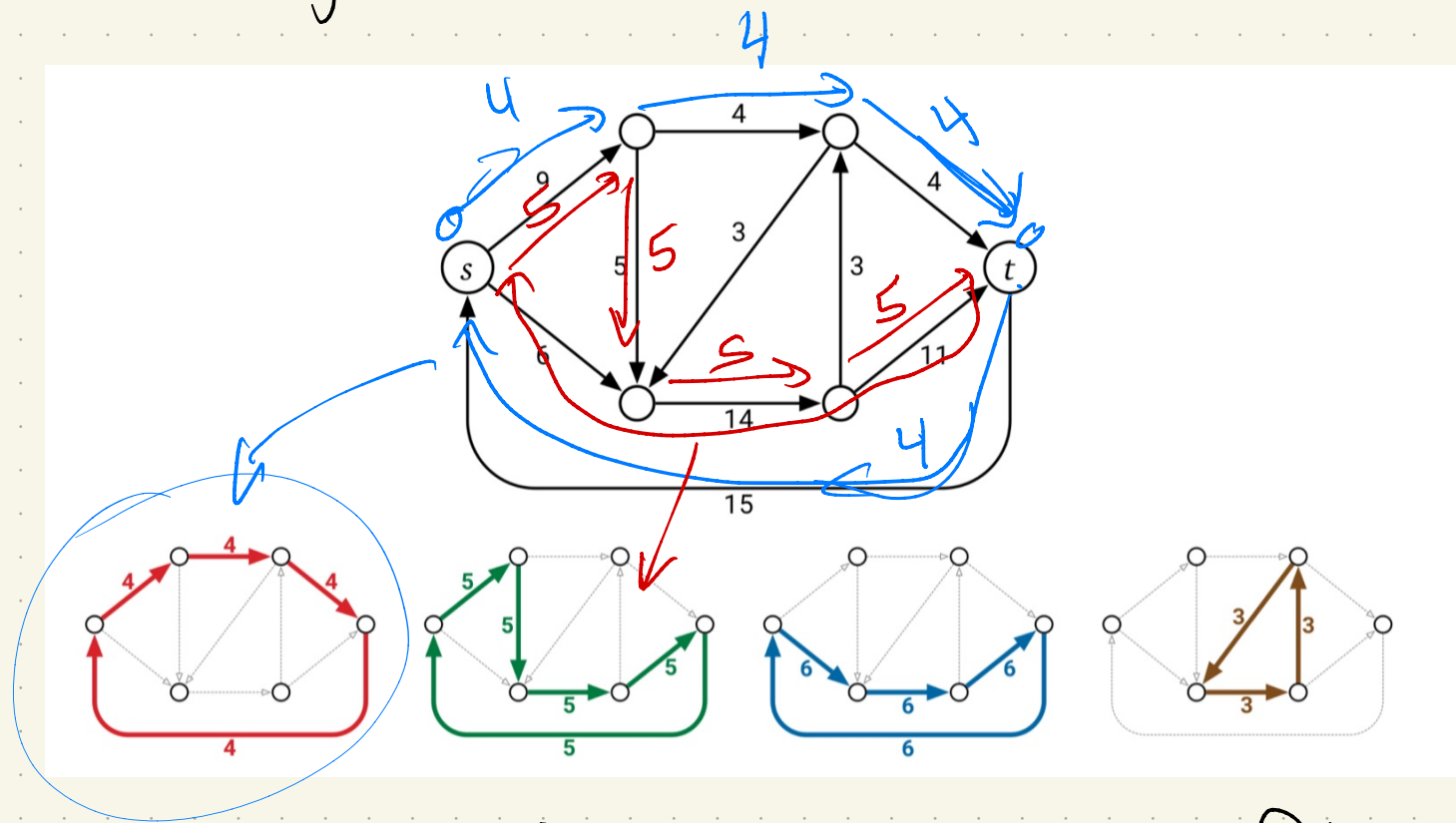
all OK



Flow decomposition:

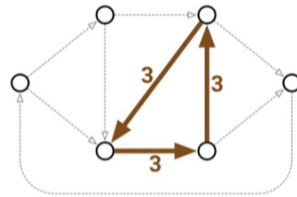
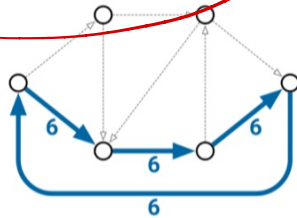
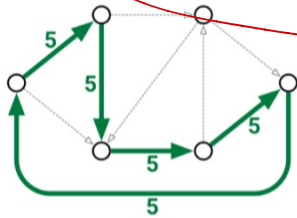
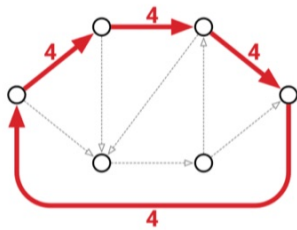
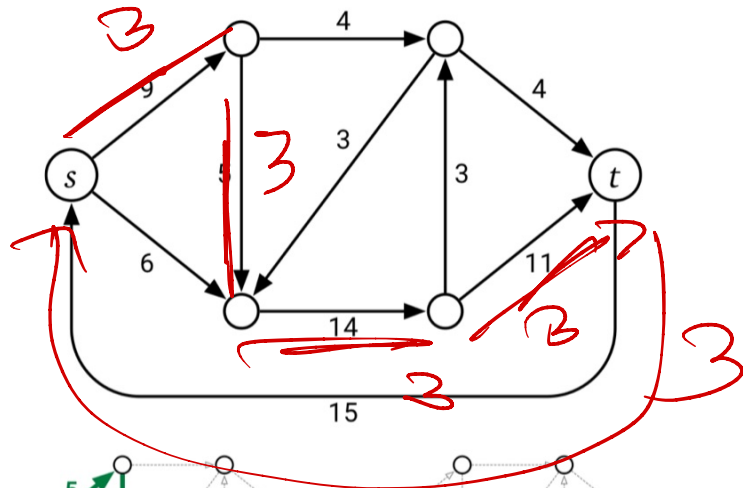
flow in = flow out

Add an edge  $t \rightarrow s$ ,  $\leftarrow$  can decompose a flow into cycles:



s.t. "sum" of cycles = flow.

Not unique:



Why care?

Suggests general strategy in FF

of "find a path & push" will  
always get you to best flow

(if integer capacity).

Let's see how it works...

## Faster versions

This is an active area of research!

We'll see two faster examples,  
both (relatively) simple variations  
on the Ford-Fulkerson algorithm:

① Edmonds-Karp: choose largest bottleneck edge

$$\hookrightarrow O(E^2 \log E \log |F^*|)$$

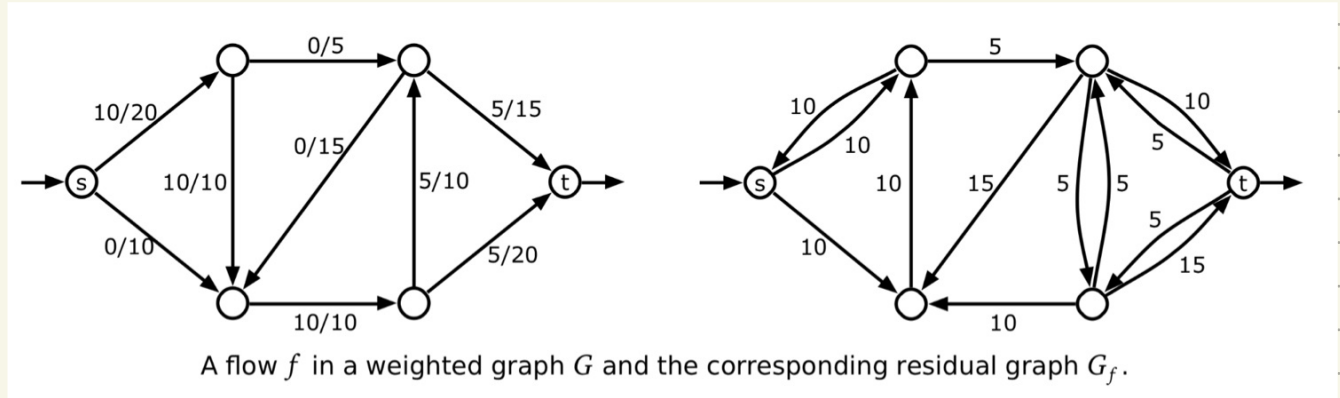
② shortest augmenting path (fewest edges)

$$\hookrightarrow O(VE^2)$$

# Edmonds-Karp:

Largest bottleneck: how?

Take  $G_f$ :



Grow a tree from  $s$ , adding largest edge out each time

↳ Similar to HW!

Runtime:

variant of MST:  $E \log V$



E-K

~~MAXFLOW~~(G):

Let  $f(e) = 0$  initially  $\forall e$   
Construct  $G_f$

While there is s-t path in  $G_f$ :

~~Let  $p$  be a simple augmenting path~~

$f' \leftarrow \text{augment}(f, p)$

$f \leftarrow f'$

update  $G_f$

return  $f$

$V+E$   
 $\Rightarrow O(E)$

Replace:  $E \log V$

Let  $p$  be the largest bottleneck path

# of repetitions in loop?

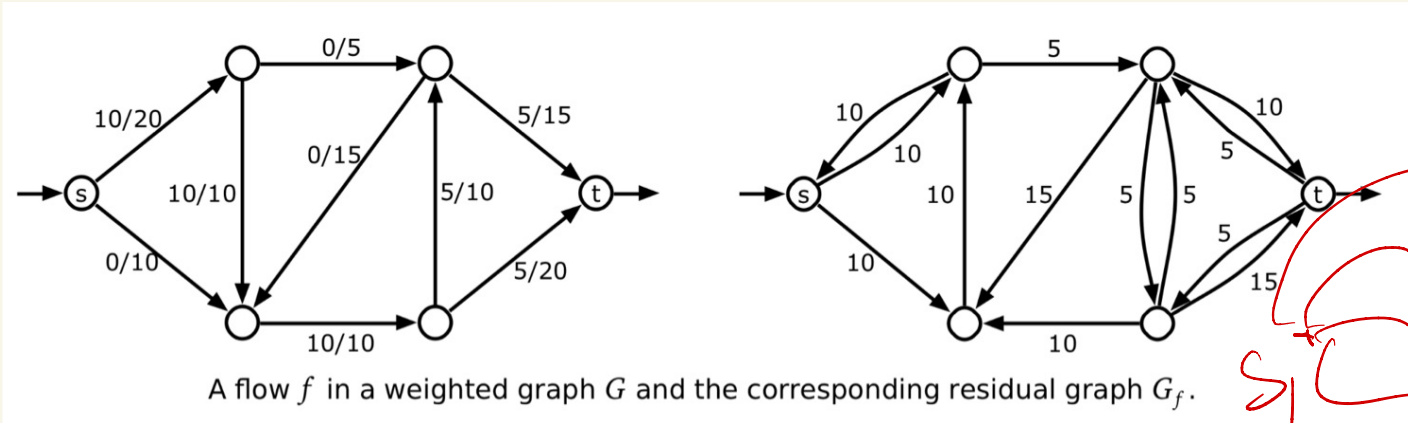
In FF, went down by  $\geq 1$ .

Here? Hopefully better!

Key: look at current flow

# loop repetitions:

Consider current flow:



total is f'



Residual graph: Also a flow graph!

Let  $f'$  be max flow in  $G$ .

$G_f$  has  $f'$  flow, & at most  $E$  paths from  $s$  to  $t$

$\Rightarrow$  One of them is big:

$$\Rightarrow \frac{f'}{E}$$

$\leq E$

So: adds  $\geq \frac{f'}{E}$  to flow

$f' - \frac{f'}{E}$  next time

$\Rightarrow$  next residual graph will have  $\geq (1 - \frac{1}{E})f'$  in it.

$\hookrightarrow (1 - \frac{1}{E})^l f^*$  repetitions

What is  $l$ ?

Well,  $l = E \cdot \ln f^*$  repetitions,

$$(1 - \frac{1}{E})^l f^* < \underline{\underline{1}}$$

Wait:  $< 1$ ??

$\hookrightarrow$  must hit integer since valued

$$f' \rightarrow \left(1 - \frac{1}{E}\right) f'$$

↓

$$\left(1 - \frac{1}{E}\right)^2 f'$$

↓

$$\left(1 - \frac{1}{E}\right)^3 f'$$

→

smaller

2

E-K

~~MAXFLOW~~(G):

Let  $f(e) = 0$  initially  $\forall e$   
Construct  $G_f$

While there is s-t path in  $G_f$ :

~~Let p be a simple augmenting path~~

$f' \leftarrow \text{augment}(f, p)$

$f \leftarrow f'$

update  $G_f$

return  $f$

Replace:

Let  $p$  be the largest bottleneck path

Inside of loop:

find bottleneck:

$$E \log V + (V + E)$$

\* # iterations:  $E \ln f$

$$\Rightarrow O(E^2 \log V \ln f)$$

# Shortest paths $\leftarrow$ min # of edges

~~MAX FLOW~~ (G):

Let  $f(e) = 0$  initially  $\forall e$   
Construct  $G_f$

while there is s-t path in  $G_f$

~~let  $p$  be a simple s-t path~~

$f' \leftarrow \text{augment}(f, p)$

$f \leftarrow f'$

update  $G_f$

return  $f$

Let  $p =$  shortest  
s-t path  
(# edges, not  
capacities)

$V+E$

$V+E$

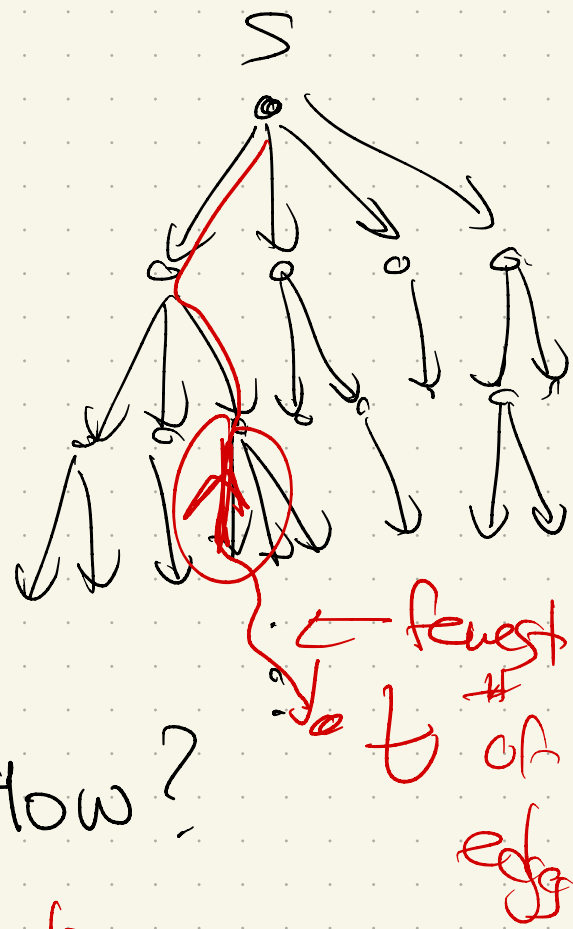
Which traversal?

BFS

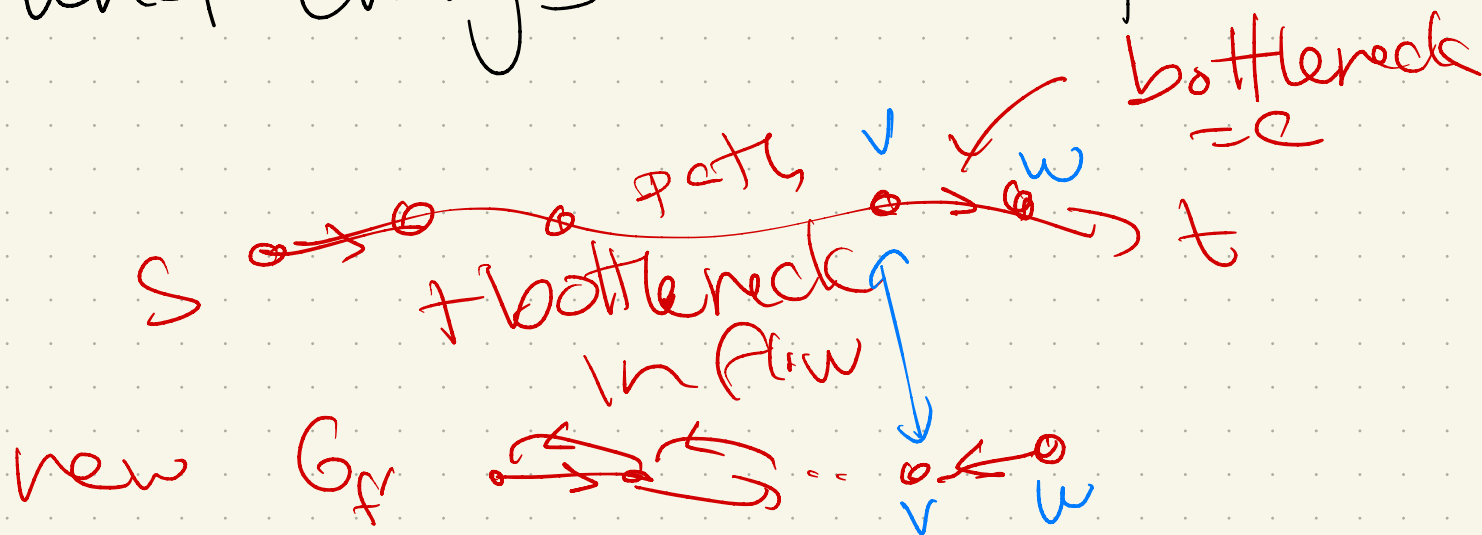
So inside of loop =  $O(V+E)$

Q: How many times do we need a path?  
 (ie: how many repetitions of the while loop?)

Think of  $G_f$  + the BFS tree rooted at  $s$ .



what changes after we push flow?



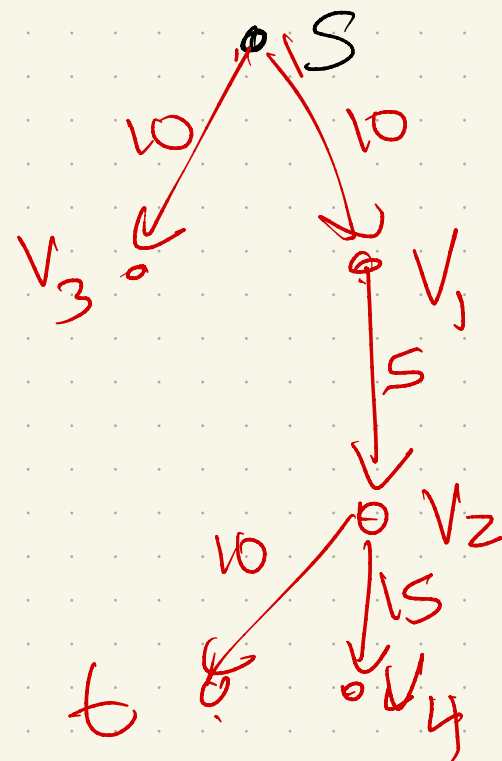
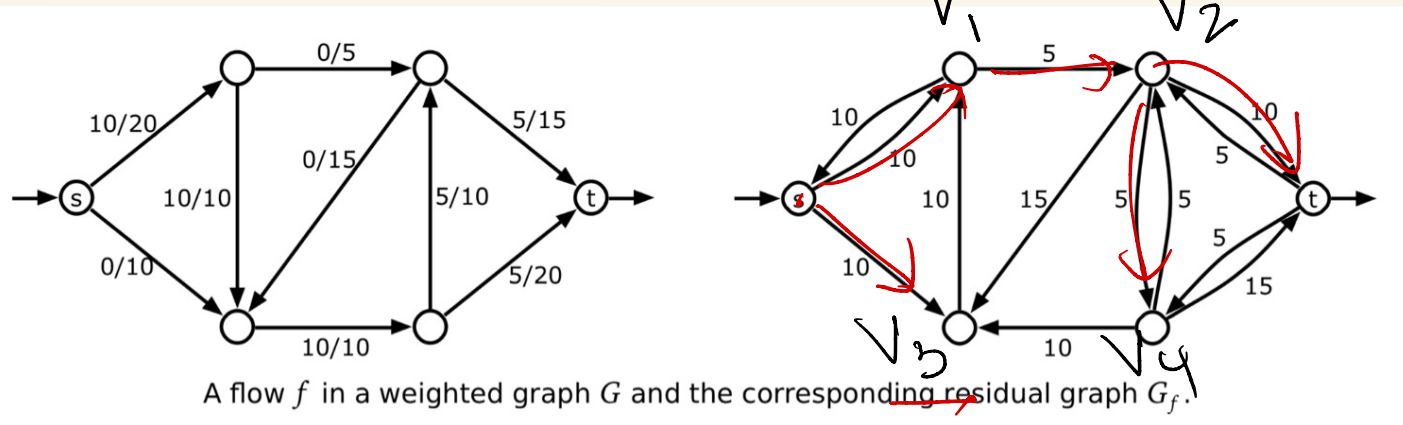
Let  $G_0 = \text{initial } G_f$

$\&$   $G_i = \text{residual graph after } i \text{ repetitions of the loop.}$

$G_i$  has a BFS tree  $T_i$ , so let  $\text{level}_i(v) = \text{depth in tree}$

(Note: once  $s$  can't reach  $t$ , then  $\text{level}(t) = \infty$ .)

BFS tree:





Claim: levels only get bigger  
in each round.

proof: induction on level. (fix  $i$ )

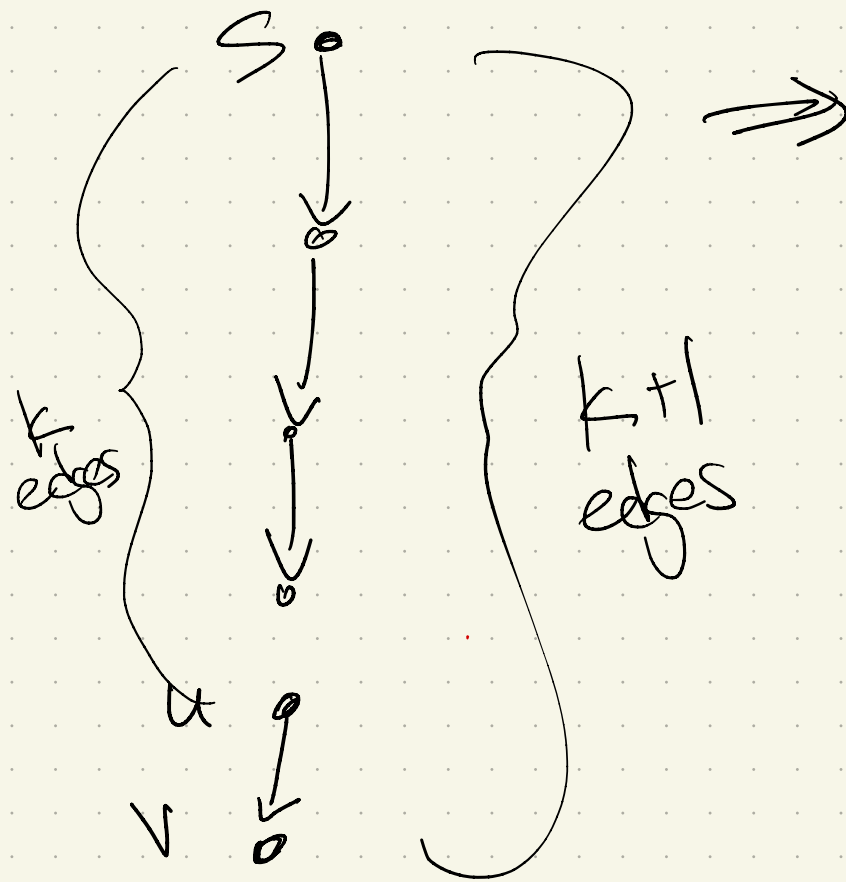
base case:  $S$  (level 0), always stays  $\geq 0$

IH: consider levels  $\leq k$  in  $G_i$ .  
for any such  $u$  on level  $\leq k$ ,  
$$\text{level}_{i-1}(u) \leq \text{level}_i(u)$$

IS: now take  $v$  on level  $k+1$  of  $G_i$ :

Must be a path  $S \rightsquigarrow v$

take  $u$  just before  
 $v$  on path



Now: how did we get this path in  $G_i$ ?

cont:

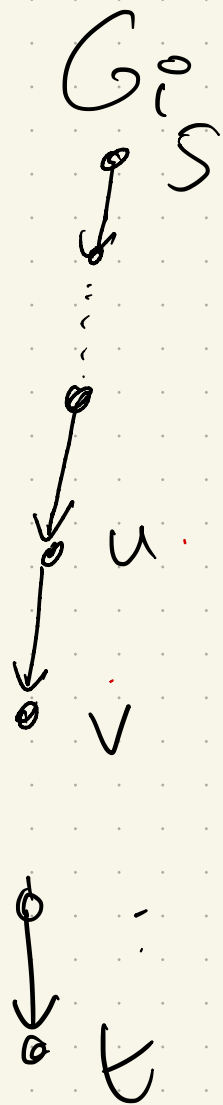
-  $u \rightarrow v$  is an edge in  $G_{i-1}^0$

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

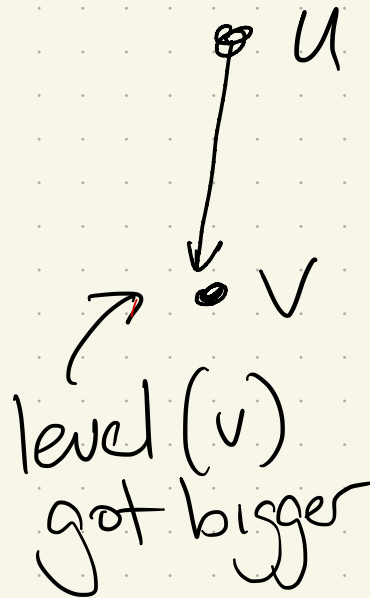
- might have come from pushing in  $G_{i-1}$ :  
here, it came from pushing a shortest  
path in the last round,  
so  $v \rightarrow u$  was used last round.

Then: Edges can disappear & reappear.

How many times?



level(v)  
got  
bigger!



if level  
goes up  
 $\leq 2$ , after  
 $\frac{V}{2}$  rounds  
 $\Rightarrow$

In each iteration of the loop —  
Some edge disappears!

$\Rightarrow \frac{V}{2} \cdot E$  repetitions

Total:

Let  $p =$  shortest

MAX FLOW ( $G$ ):

Let  $f(e) = 0$  initially  $\forall e$   
Construct  $G_f$

while there is s-t path in  $G_f$   
~~let  $p$  be a simple s-t path~~  
 $f' \leftarrow \text{augment}(f, p)$   
 $f \leftarrow f'$   
update  $G_f$

return  $f$

s-t path  
(# edges, not capacities)

$$V \cdot E \cdot (V + E) \\ = VE^2$$

# And... not done!

Technique	Direct	With dynamic trees	Source(s)
Blocking flow	$O(V^2E)$	$O(VE \log V)$	[Dinitz; Karzanov; Even and Itai; Sleator and Tarjan]
Network simplex	$O(V^2E)$	$O(VE \log V)$	[Dantzig; Goldfarb and Hao; Goldberg, Grigoriadis, and Tarjan]
Push-relabel (generic)	$O(V^2E)$	–	[Goldberg and Tarjan]
Push-relabel (FIFO)	$O(V^3)$	$O(VE \log(V^2/E))$	[Goldberg and Tarjan]
Push-relabel (highest label)	$O(V^2\sqrt{E})$	–	[Cheriy and Maheshwari; Tunçel]
Push-relabel-add games	–	$O(VE \log_{E/(V \log V)} V)$	[Cheriy and Hagerup; King, Rao, and Tarjan]
Pseudoflow	$O(V^2E)$	$O(VE \log V)$	[Hochbaum]
Pseudoflow (highest label)	$O(V^3)$	$O(VE \log(V^2/E))$	[Hochbaum and Orlin]
Incremental BFS	$O(V^2E)$	$O(VE \log(V^2/E))$	[Goldberg, Held, Kaplan, Tarjan, and Werneck]
Compact networks	–	$O(VE)$	[Orlin]

**Figure 10.10.** Several purely combinatorial maximum-flow algorithms and their running times.

Many use  
very different  
techniques

- linear programming
- complex data structures
- not residual graphs

Still active:

Showing 1–50 of 368 results for all: maximum flow in graphs Search v0.5.6 released 2020-02-24

maximum flow in graphs All fields

Show abstracts  Hide abstracts Advanced Search

50 results per page. Sort results by Announcement date (newest first)

1 2 3 4 5 ...

1. [arXiv:2503.20985](#) [pdf, ps, other] cs.DS  
**Deterministic Vertex Connectivity via Common-Neighborhood Clustering and Pseudorandomness**  
**Authors:** [Yonggang Jiang](#), [Chaitanya Nalam](#), [Thatchaphol Saranurak](#), [Sorrachai Yingchareonthawornchai](#)  
**Abstract:** We give a deterministic algorithm for computing a global minimum vertex cut in a vertex-weighted **graph**  $n$  vertices and  $m$  edges in  $\tilde{O}(mn)$  time. This breaks the long-standing  $\tilde{\Omega}(n^4)$ -time barrier in dense...   
Submitted 26 March, 2025; originally announced March 2025.
2. [arXiv:2503.13274](#) [pdf, ps, other] cs.DS  
**Parallel Minimum Cost Flow in Near-Linear Work and Square Root Depth for Dense Instances**  
**Authors:** [Jan van den Brand](#), [Hossein Gholizadeh](#), [Yonggang Jiang](#), [Tijn de Vos](#)  
**Abstract:** ...edge **graphs** with integer polynomially-bounded costs and capacities, we provide a randomized parallel algorithm for the minimum cost **flow** problem with  $\tilde{O}(m + n^{1.5})$  work and  $\tilde{O}(\sqrt{n})$  depth. On moderately dense **graphs** ( $m > n^{1.5}$ ), our algorithm is the fir...   
Submitted 17 March, 2025; originally announced March 2025.
3. [arXiv:2502.09105](#) [pdf, other] cs.DS  
**Incremental Approximate Maximum Flow via Residual Graph Sparsification**  
**Authors:** [Gramoz Goranci](#), [Monika Henzinger](#), [Harald Räcke](#), [A. R. Sricharan](#)  
**Abstract:** ...**maximum flow** in undirected, uncapacitated  $n$ -vertex **graphs** undergoing  $m$  edge insertions in  $\tilde{O}(m + nF^*/\epsilon)$  total update time, where  $F^*$  is the...   
Submitted 13 February, 2025; originally announced February 2025.

Plus work for special classes of graphs:  
planar, sparse, etc.