

24 February 2025

Max Flow Algorithms:  
Ford - Fulkerson.

## Plan

- \* Ideas for Flow Algorithms
- \* Announcements
- \* Ford - Fulkerson

# Network Flow Problem.

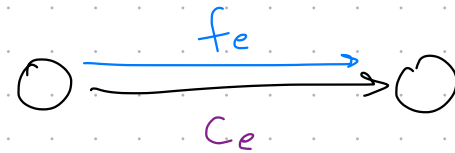
\* Given Flow Network  $G, s, t, c: E \rightarrow \mathbb{R}^+$

\* Find Flow  $f: E \rightarrow \mathbb{R}^+$  subject to

## Capacity Constraints

$\forall e \in E$

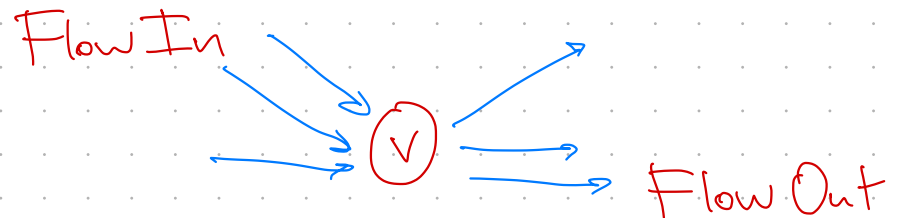
$$0 \leq f_e \leq c_e$$



## Conservation Constraints

$\forall v \in V \setminus \{s, t\}$

$$\sum_{uv \in E} f_{uv} = \sum_{vw \in E} f_{vw}$$

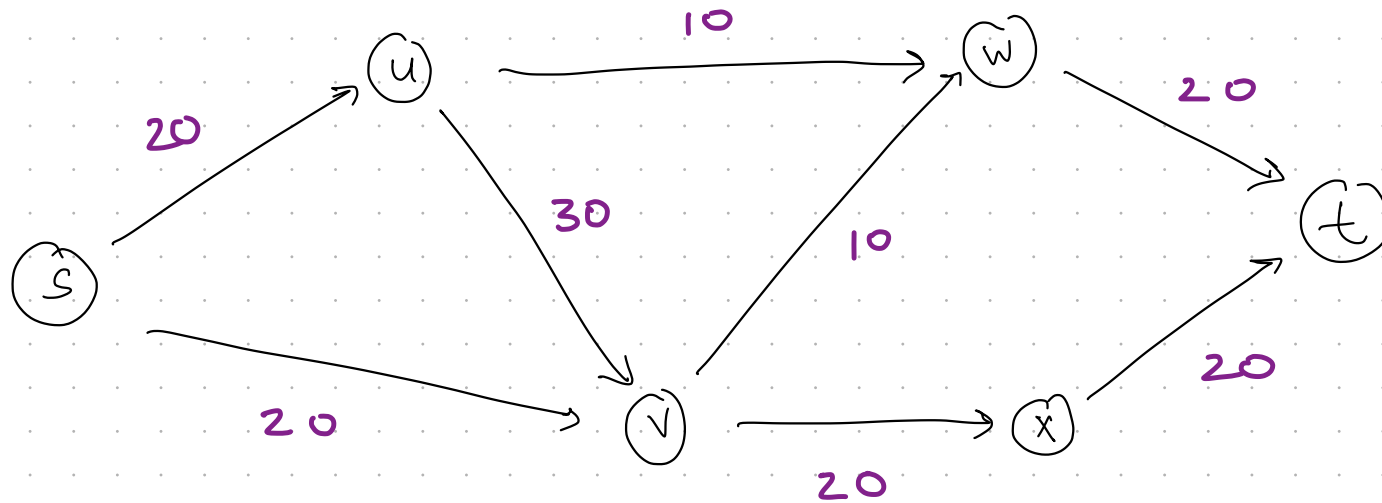


Max Flow. Find Flow  $f^*$  that maximizes FlowOut( $s$ )

## Attempt #0. Greedy

- \* Find  $st$ -path w/ positive capacity
- \* Push flow along path

Repeat  
until  
No  $s \rightsquigarrow t$   
paths.

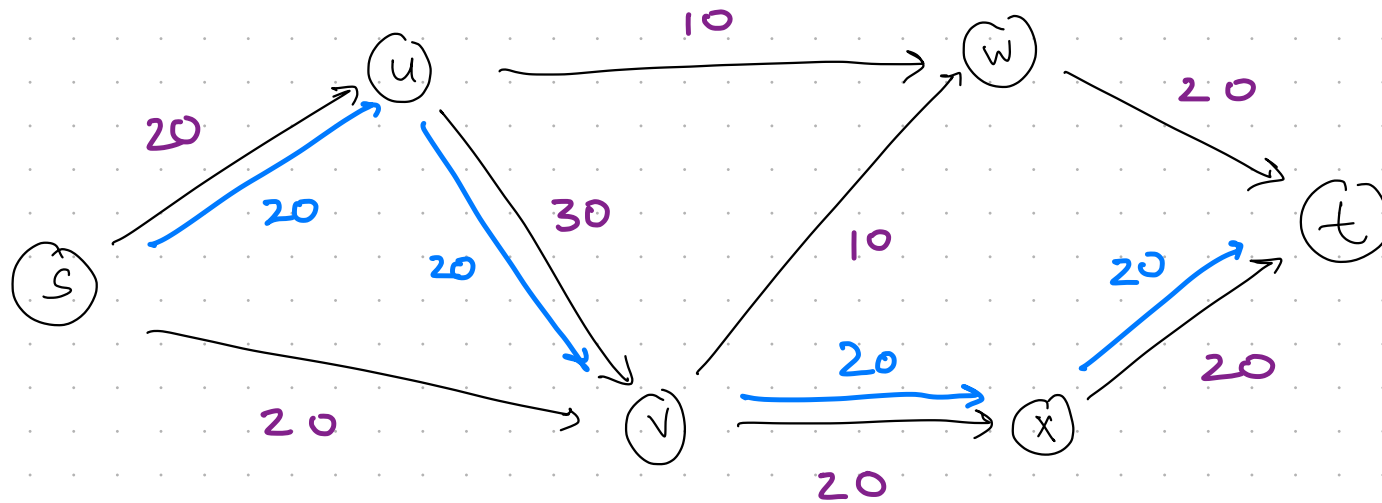


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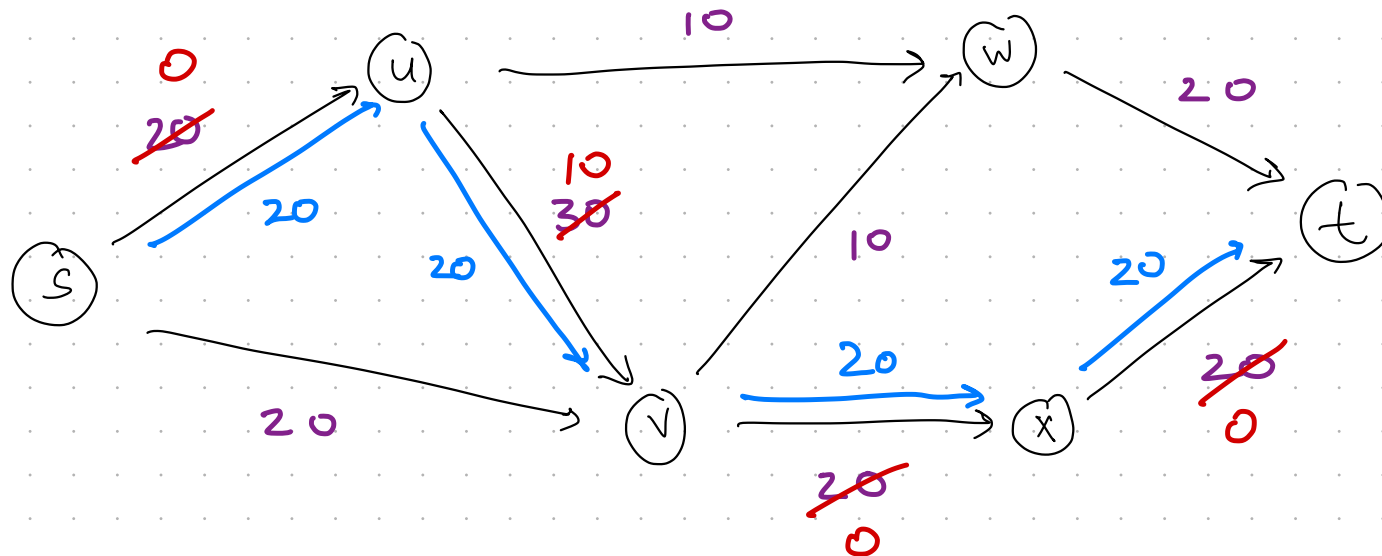
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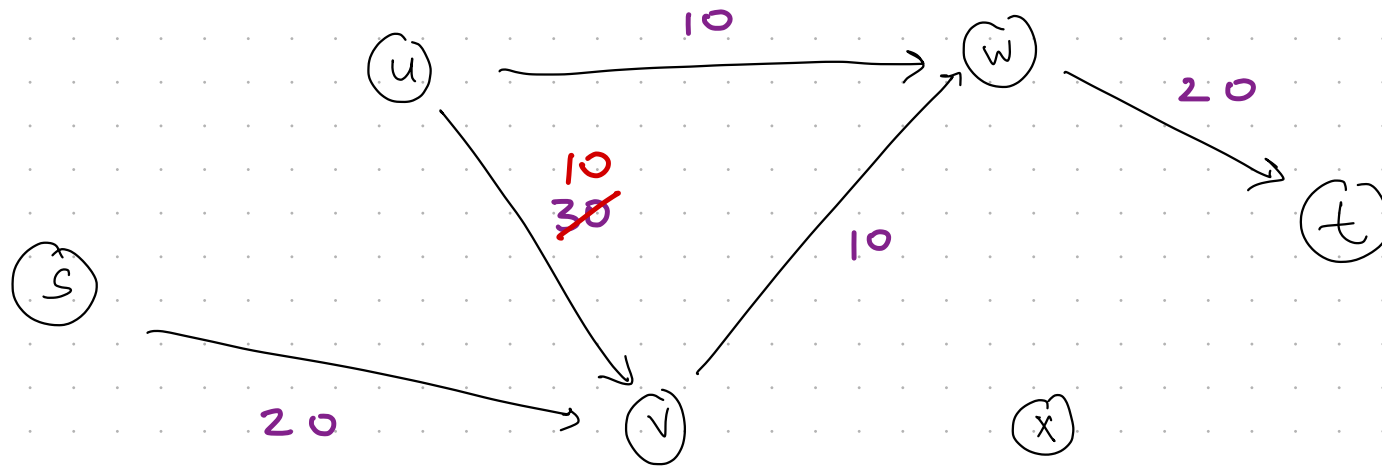
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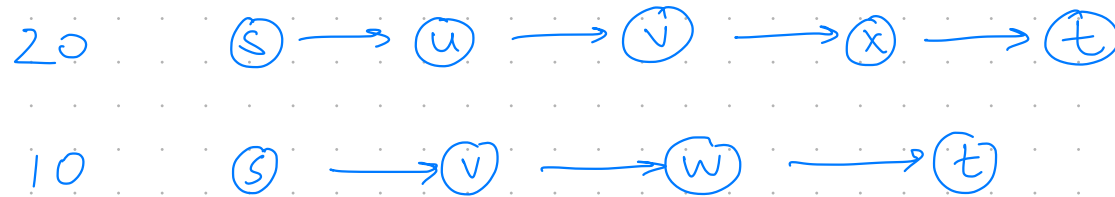
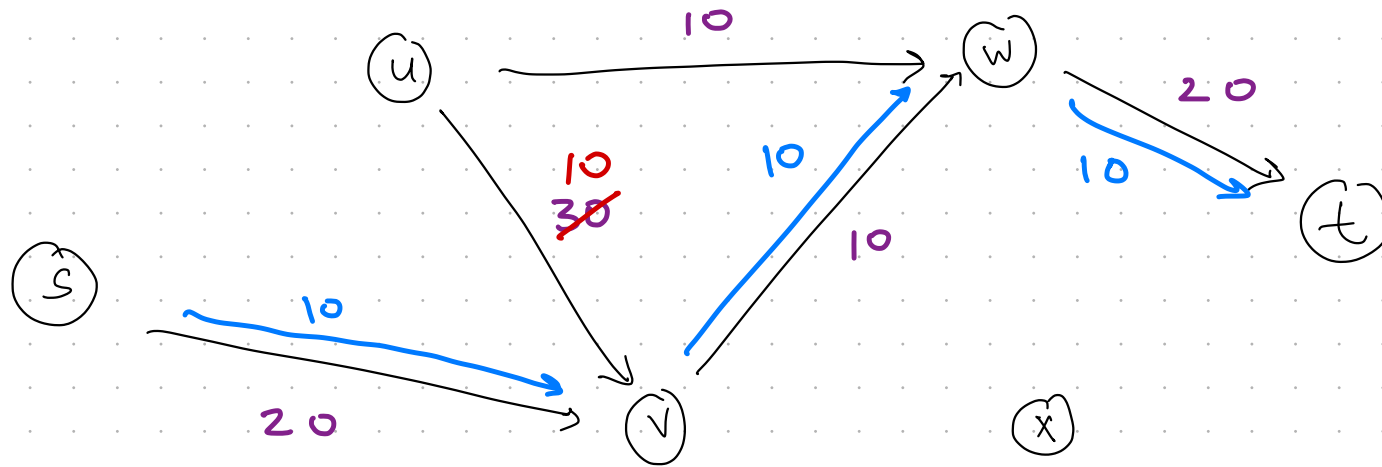


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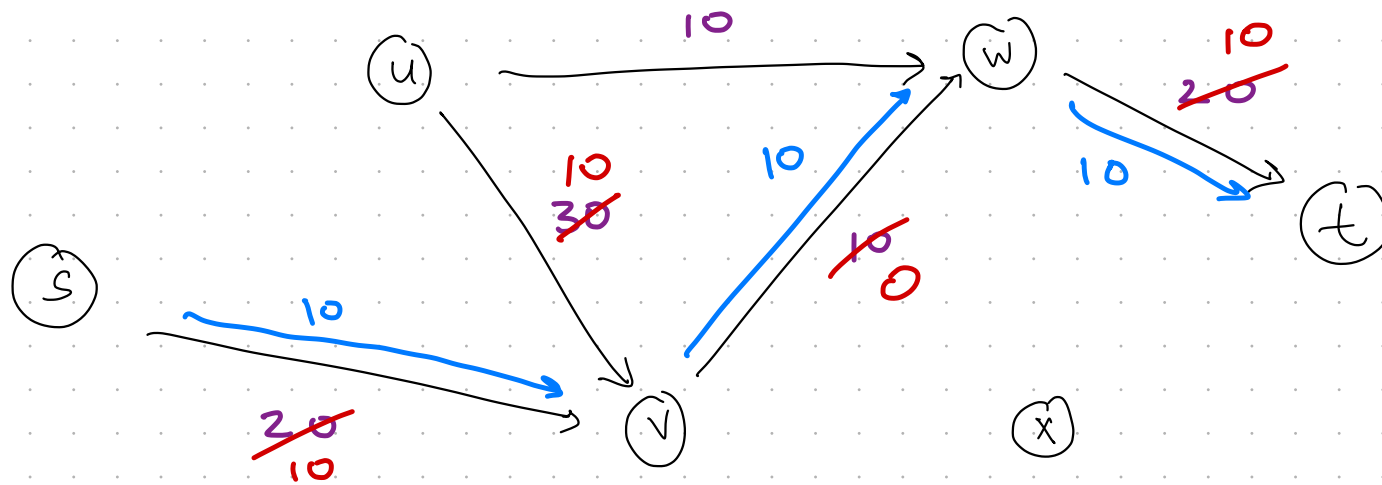
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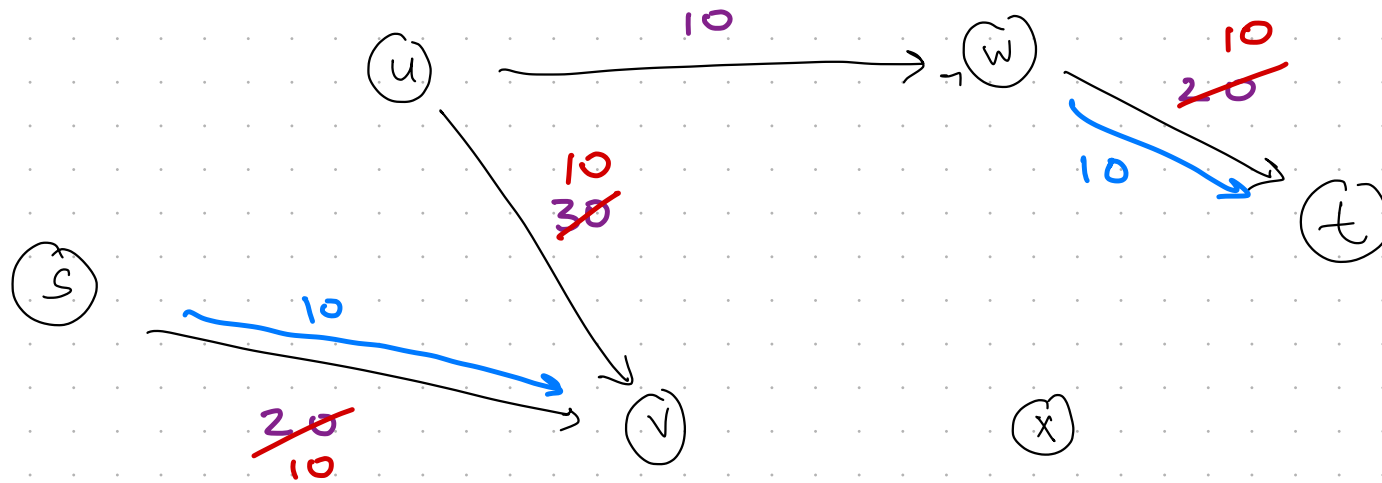
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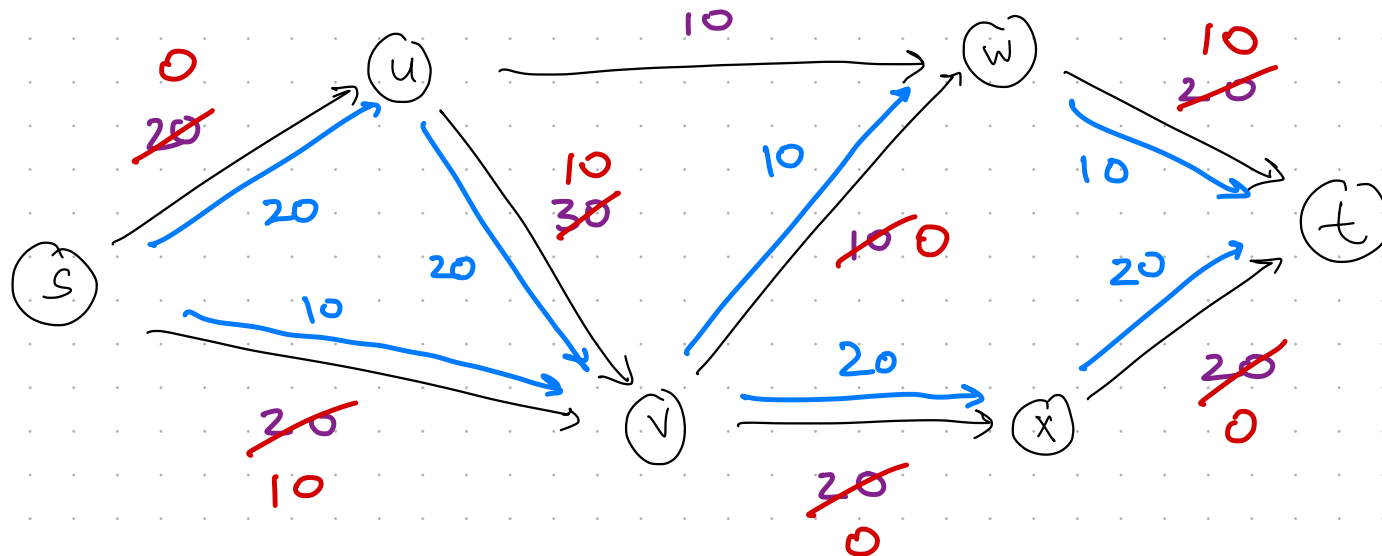
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Repeat until  
No  $s \rightarrow t$  paths.



20  $s \rightarrow u \rightarrow v \rightarrow x \rightarrow t$

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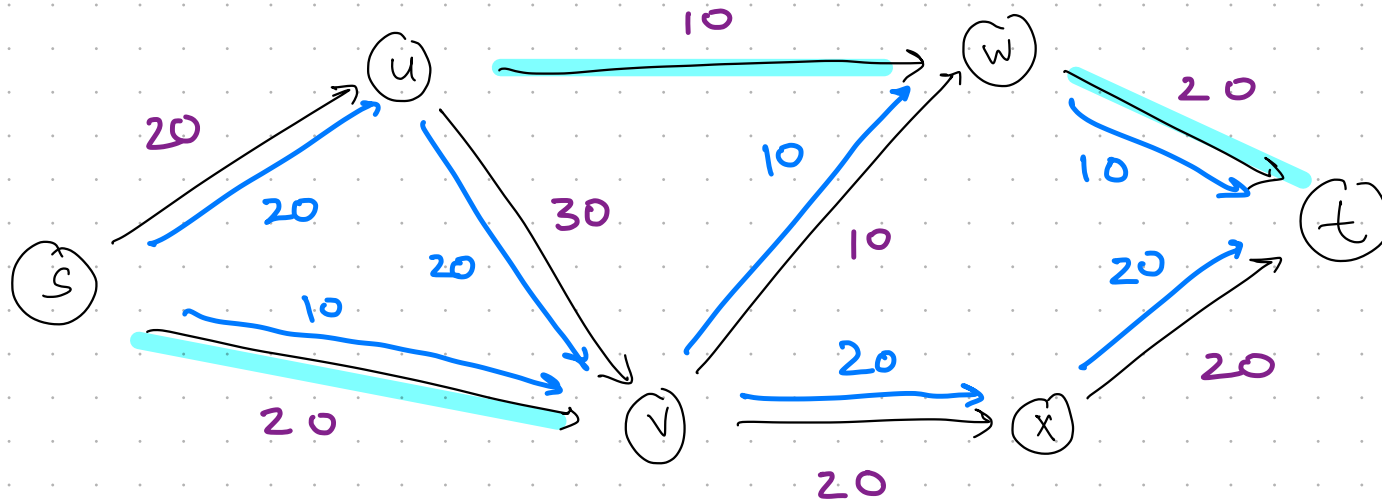
No more  $s \rightarrow t$  paths

GREEDY FLOW : 30.

# Problem w/ Greedy

Myopic

Irrevocable

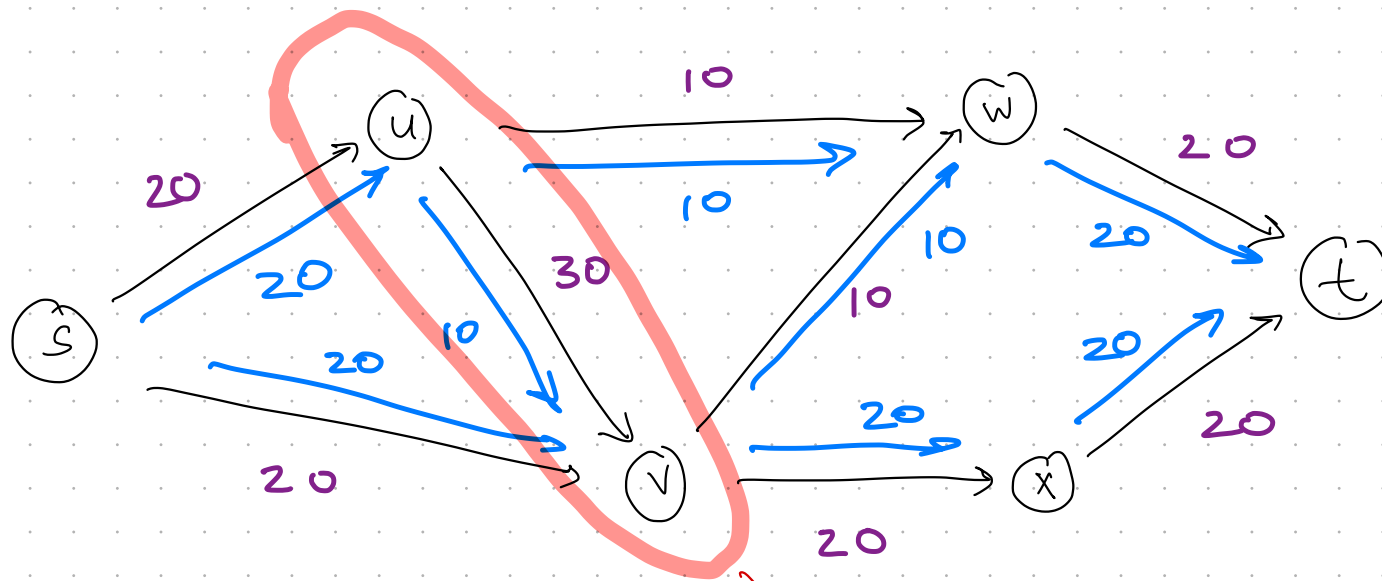


$$\text{Max Flow}(G) = 40.$$

# Problem w/ Greedy

Myopic

Irrevocable



$\text{MaxFlow}(G) = 40.$

Greedy solution assigned  $f_{uv} = 20.$

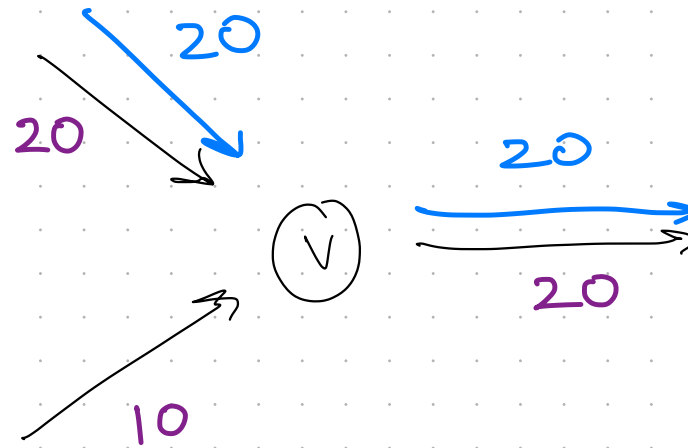
but  $f_{uv}^* = 10.$

## Announcements

- \* Prelim #1 Grades Released After Lecture.
- \* HW #3 Released Wednesday.
- \* Recitation Starts again on Saturday.



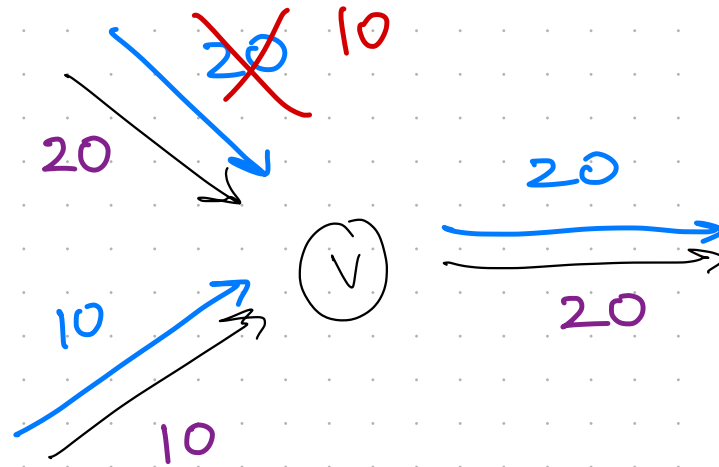
## Augmenting a flow



To conserve Flow at  $v$ .

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Given a Flow Network

$G$ , source  $s$ , sink  $t$   
w/ capacities  $c: E \rightarrow \mathbb{R}^+$   
and flow  $f: E \rightarrow \mathbb{R}^+$

The Residual Network

$G^f$  is a flow network  
w/ same vertex set  
as  $G$ .

and residual capacities  $c^f: E \rightarrow \mathbb{R}^+$ , where

$$c^f(uv) =$$

Allow us to reason about  
flow we can still push/unpush

$(u)$

$(v)$

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$$c^f(uv) = \begin{cases} \textcircled{1} \end{cases}$$

if  $f_{uv} = c_{uv}$

NO RESIDUAL

$\textcircled{u}$

X

$\textcircled{v}$

$uv$  at capacity

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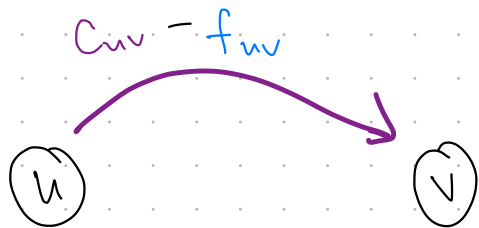
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$$c^f(uv) = \begin{cases} 0 & \text{if } f_{uv} = c_{uv} \\ c_{uv} - f_{uv} & \text{if } f_{uv} < c_{uv} \end{cases}$$

FORWARD RESIDUAL



$uv$  still has capacity to push flow

Given a Flow Network

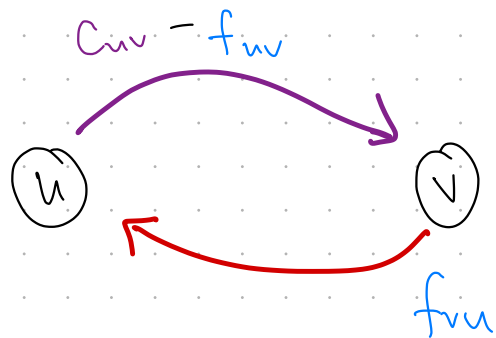
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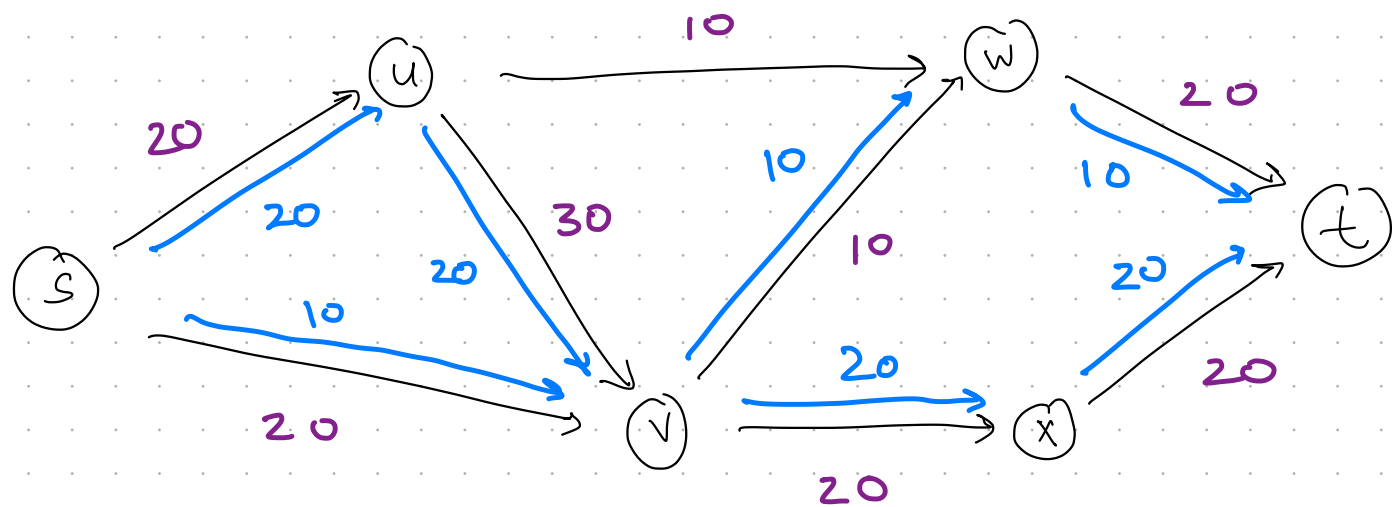
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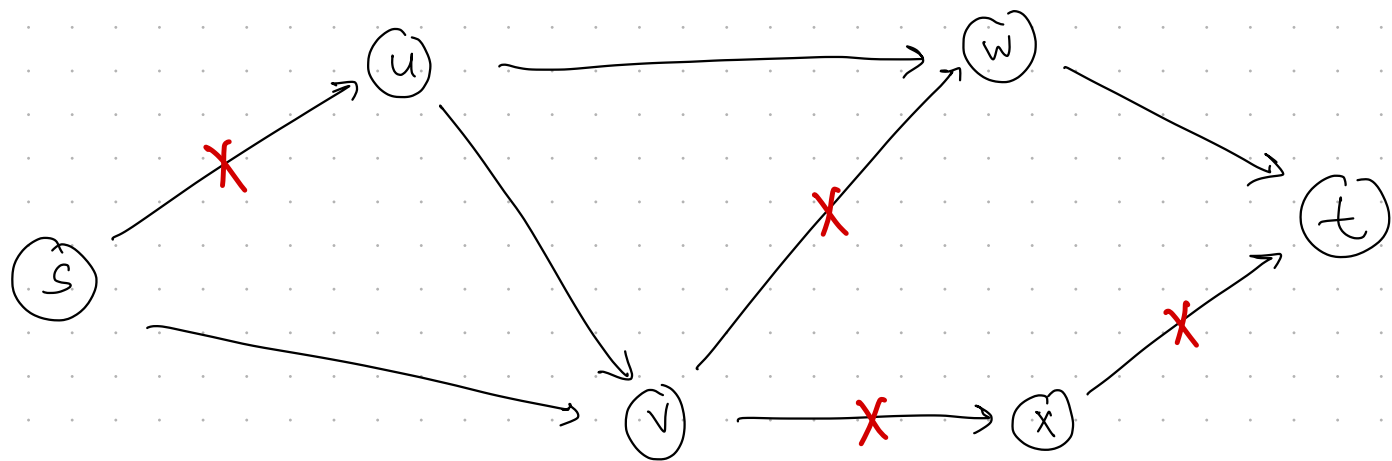
**BACKWARD RESIDUAL**

$vu$  has capacity to be "unpushed"

Output of Greedy



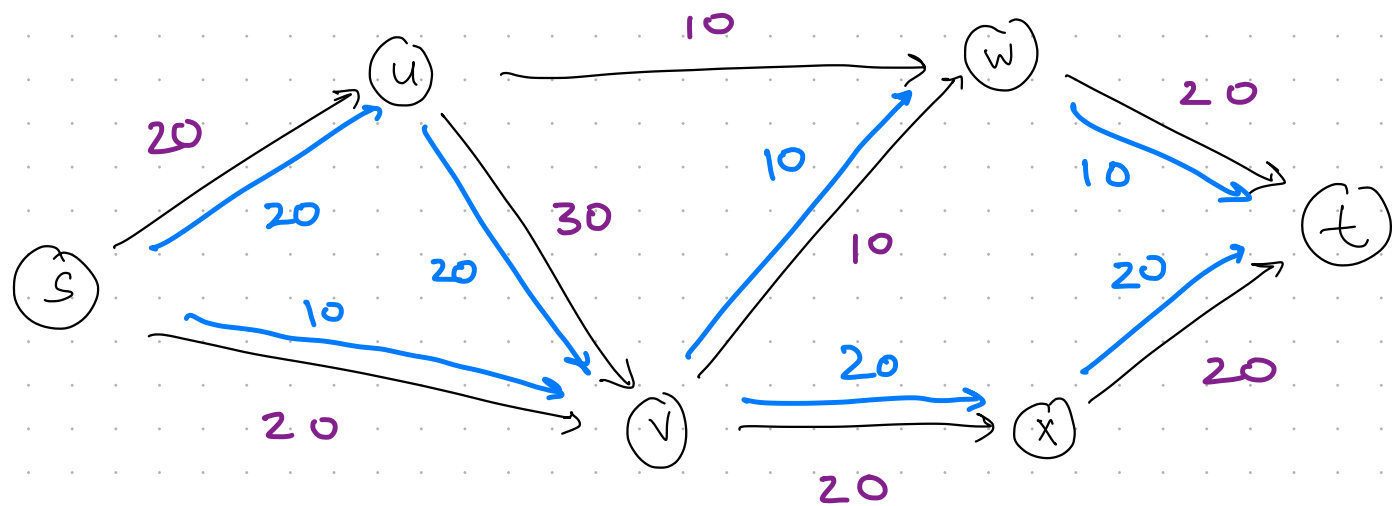
Residual Network



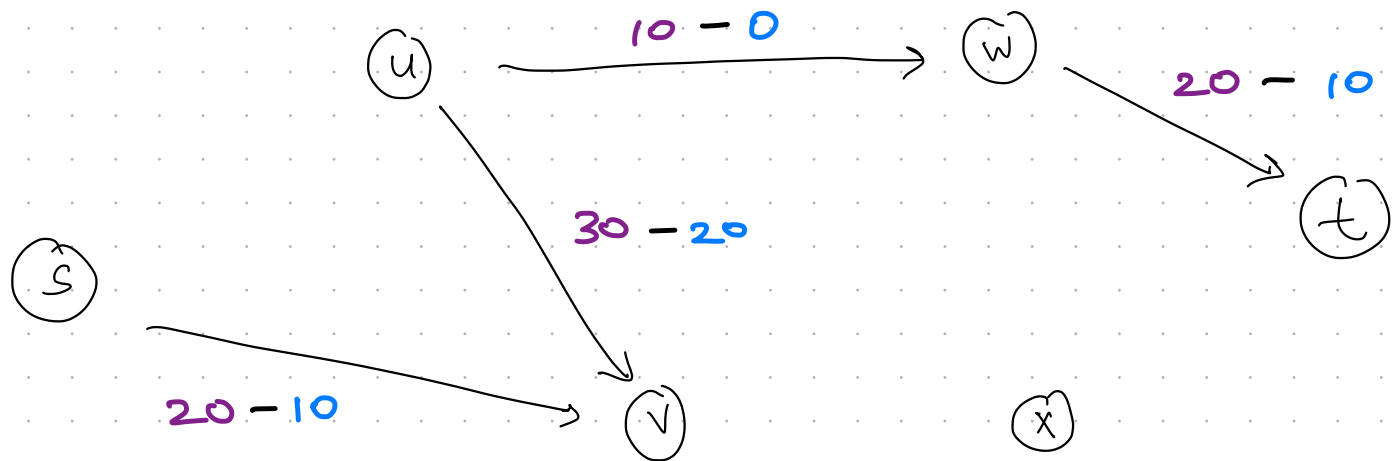
NO RESIDUAL

$$f_e = c_e$$

Output of Greedy

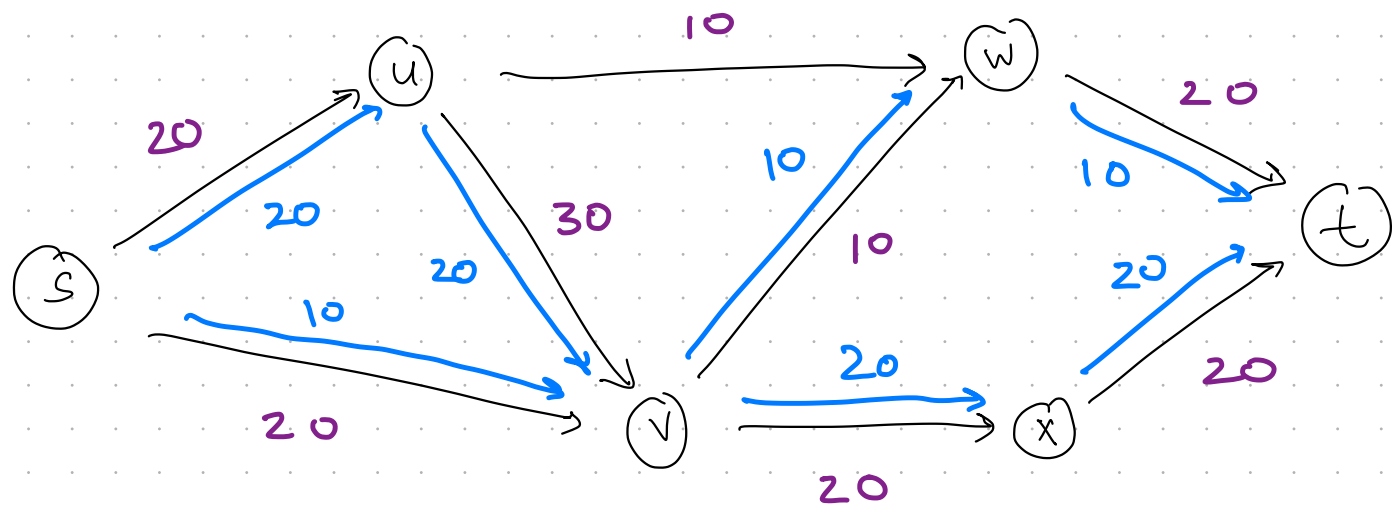


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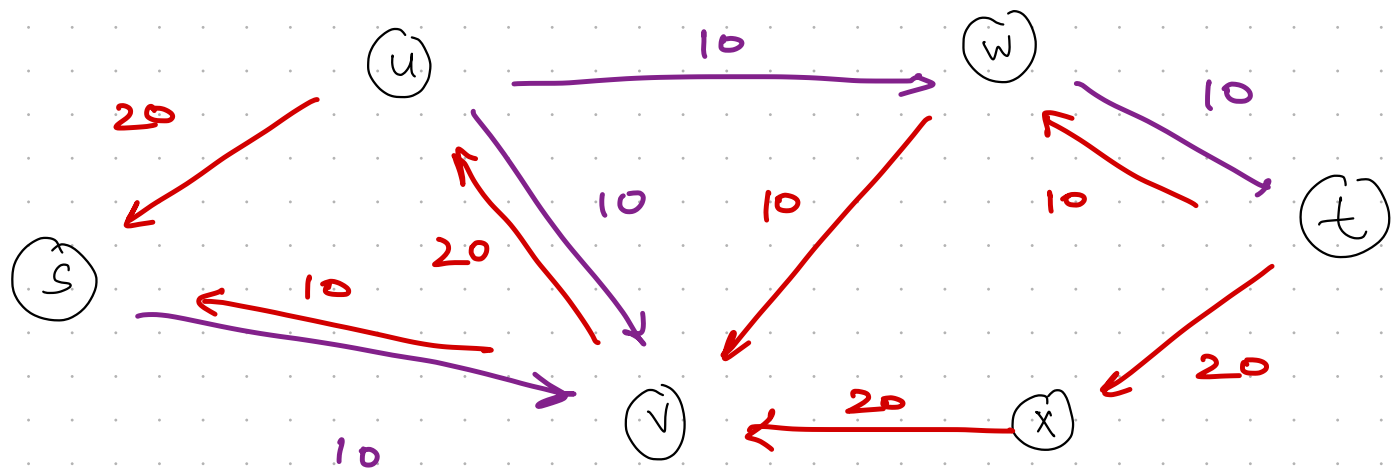


FORWARD RESIDUALS  $f_e < c_e$

Output of Greedy



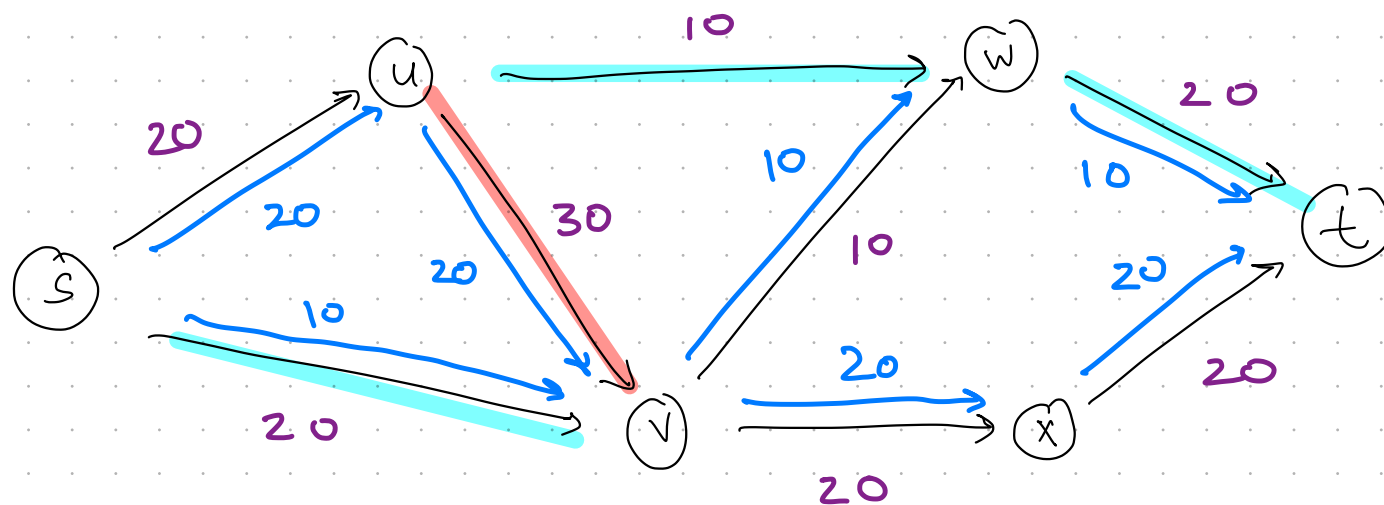
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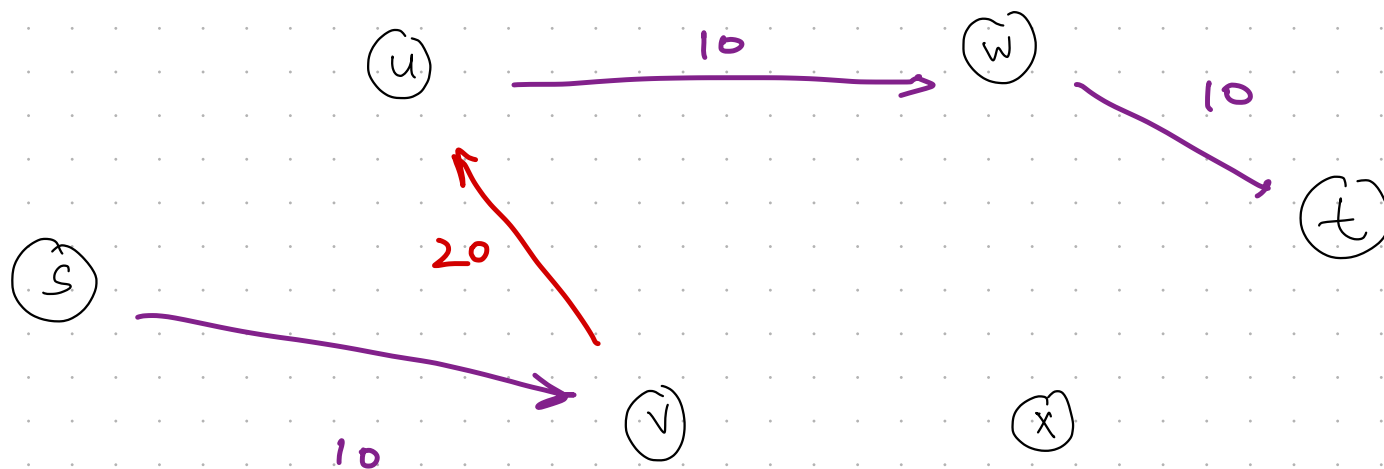
BACKWARD RESIDUALS

$$f_e > 0$$

Output of Greedy



Residual Network



st-path in Residual Network  $G^f$  ?

New Attempt. (Greedy in the Residual Network)

Initialize  $f_e = 0 \quad \forall e \in G.$

Repeat.

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\* if no st-path in  $G^f$

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Ford - Fulkerson Algorithm  
for Max Flow.

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\* Flow  $f^*$  returned by FF s.t.

$$\text{FlowOut}^{f^*}(s) \geq \text{FlowOut}^f(s)$$

for all valid flows  $f$ .

### SIMPLIFYING ASSUMPTIONS

\* capacities are integer

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$$* |E| \geq \Omega(|V|)$$

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↪ Suppose st-path  $P$  has  
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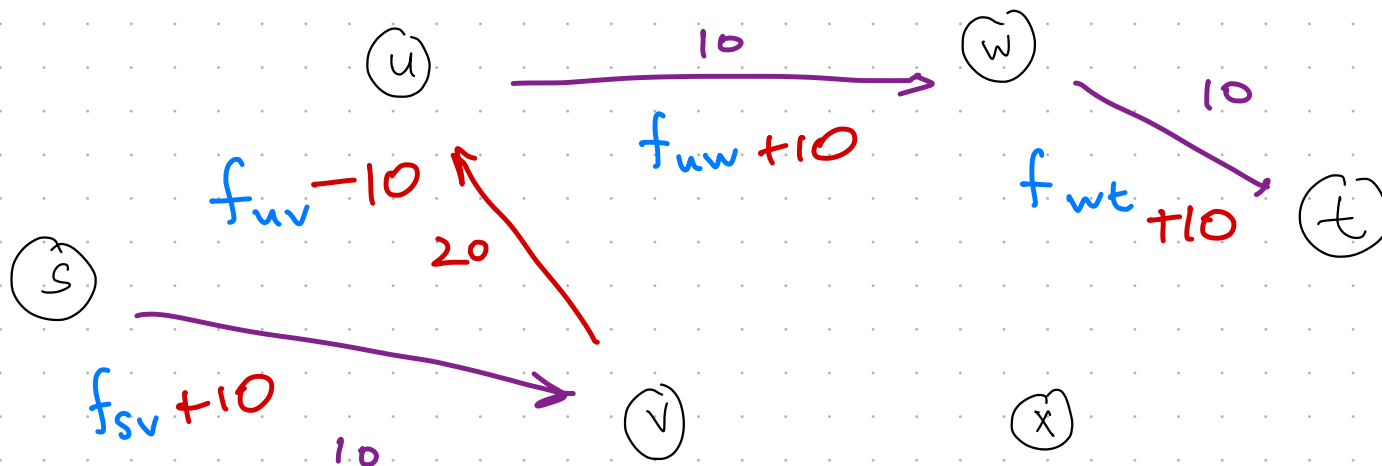
For all forward residual edges in  $P$ .

$$f_e \leftarrow f_e + b$$

For all backward residual edges in  $P$

$$f_e \leftarrow f_e - b.$$

$$b=10$$



For all forward residual edges in  $P$ .

$$f_e \leftarrow f_e + b$$

push more  
flow

For all backward residual edges in  $P$

$$f_e \leftarrow f_e - b.$$

unpush  
flow

Lemma. Suppose  $P$  is an  $st$ -path through  $C^f$   
with bottleneck capacity  $b = \min_{e \in P} c^f(e)$ .

Pushing  $b$  units of flow along  $P$  preserves  
CAPACITY & CONSERVATION constraints of  $f$ .

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### CAPACITY

Forward edges:  $c_e - f_e = c^f(e)$   
 $\Rightarrow c_e = f_e + c^f(e) \geq f_e + b \quad \square$

Backward edges:  $f_e - b \geq f_e - c^f(e) = f_e - f_e = 0 \quad \square$

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### CONSERVATION

For all  $v \in V \setminus \{s, t\}$ :

In-Edge.



Out-Edge.

Forward

$$\Delta \text{FlowIn}(v) = +b$$

Forward

$$\Delta \text{FlowOut}(v) = -b$$

Backward

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Backward

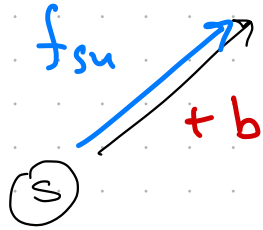
$$\Delta \text{FlowIn}(v) = +b$$

$\Rightarrow$  All in-out options preserve conservation.



So, FF preserves that  $f$  is a valid flow

Why does FF terminate?



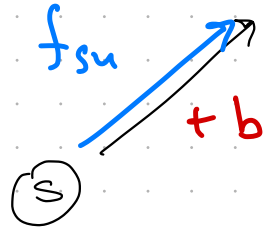
$\text{FlowOut}^f(s)$



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$\text{FlowOut}^f(s)$

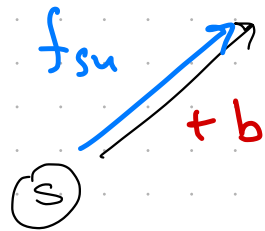


$\text{FlowOut}^{f+b}(s)$

↳ By integer weights  $b \geq 1$   
in every iteration.

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$\Rightarrow$  After  $\text{Cap}(s) = \sum_{sv \in E} c_{sv}$  iterations, No more augmenting paths.

## Ford - Fulkerson Running Time

Suppose  $c^* = \max_{e \in E} c_e$ .

$$\Rightarrow \text{Cap}(s) \leq c^* \cdot n.$$

How long does each iteration take?

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How long does each iteration take?

- \* Construct  $G^f$   $\leftarrow \leq 2$  edges per  $e \in E$
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- \* Update flow  $f$   $\leftarrow$  1 update per edge in simple path

# Ford - Fulkerson Running Time

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$$O(m) + O(m) + O(n)$$

RT.  $\boxed{O(c^* \cdot n \cdot m)}$  // pseudopolynomial time.