

## Network Flow Applications

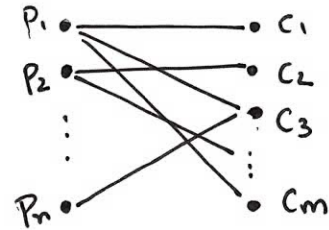
- Bipartite Matching
- Project Selection
- Baseball Elimination
- Assignment Problem (w/ lower bounds)

# Network Flow Application: Bipartite Matching.

Customers:  $P_1, \dots, P_n$

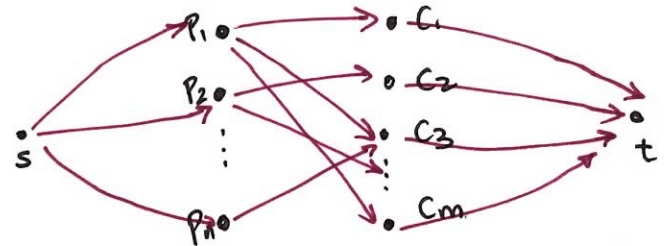
Cars:  $c_1, \dots, c_m$

Edge from  $P_i$  to  $c_j$  indicates that  $P_i$  is interested in  $c_j$  and can afford it.

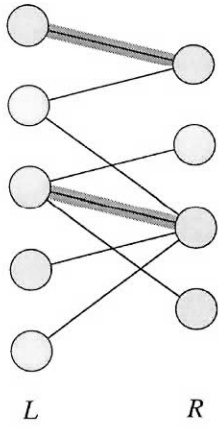


Claim 1: If there is a way to sell  $k$  cars to  $k$  customers, then there is a flow  $f$  with  $|f|=k$

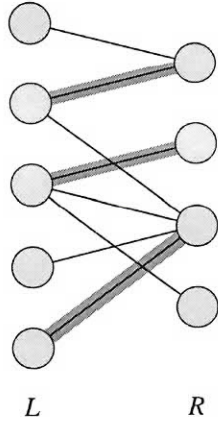
Claim 2: If there is an integer flow with  $|f|=k$ , then there is a way to sell  $k$  cars to  $k$  customers.



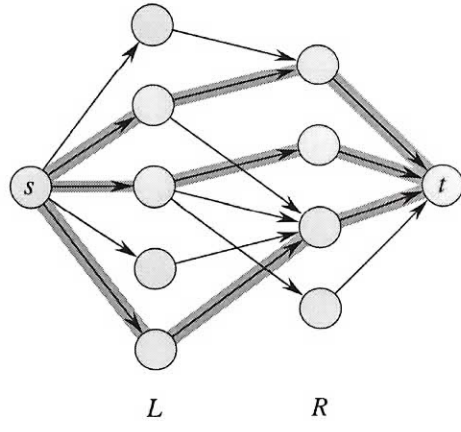
all edges have capacity = 1



(a)



(b)



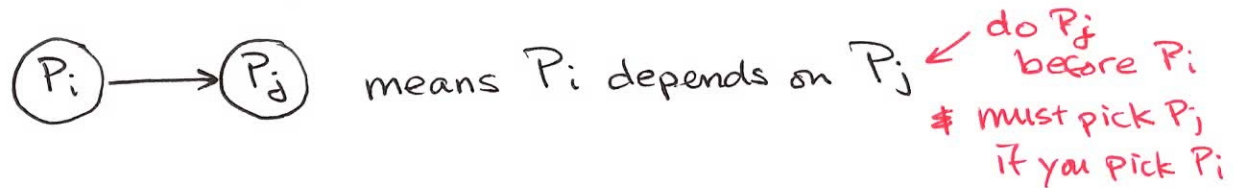
(c)

# Project Selection Problem: Select projects to maximize profit subject to dependency constraints

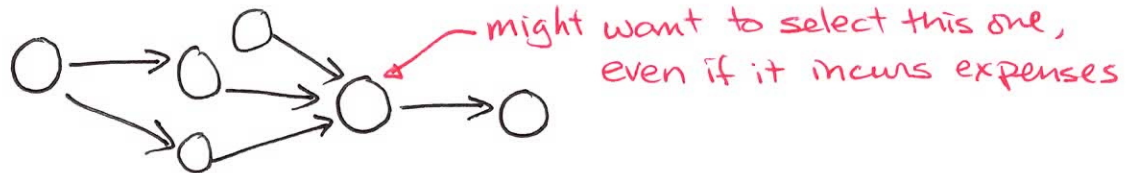
Set of projects  $P_1, \dots, P_n$ .

Projects either make money generate revenue or lose money incur expenses.

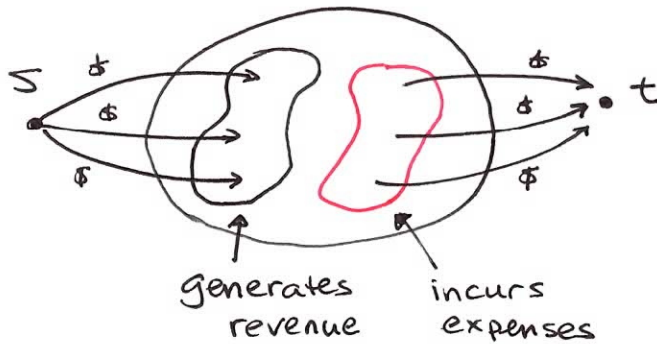
Projects have dependencies, given as a DAG



Multiple dependencies allowed



Convert into a max flow problem



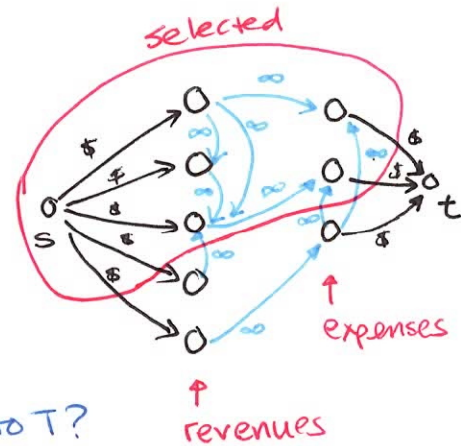
For each revenue generator  $P_i$ , add edge  $(s, P_i)$ .  
Set  $c(s, P_i) = \text{revenue}(P_i)$ .

For each ~~expense incurrer~~ <sup>money loser</sup>  $P_i$ , add edge  $(P_i, t)$   
Set  $c(P_i, t) = \text{expense}(P_i)$ .

For each dependency  $(P_i, P_j)$ , set  $c(P_i, P_j) = \infty$ .

Compute max flow of network.  
 Let  $(S, T)$  be the min cut found.  
 Selected projects =  $S - \{s\}$ .

Claim: selected projects maximize profit



Which edges can cross the cut from  $S$  to  $T$ ?

None of the dependency edges with  $\infty$  capacity.

(cannot have  $\infty$  in min cut.)

so selected projects do not depend on projects not selected.

$$c(S, T) = \text{revenues of projects not selected} + \text{exp. of projects selected}$$

$$R = \text{sum of all revenues} \rightarrow = R - \text{revenues of projects selected} + \text{expenses of projects selected}$$

$$= R - \text{profit}$$

∞ minimize cut = maximize profit

# Baseball Elimination [Kleinberg-Tardos]

## Current Standing

New York	92
Baltimore	91
Toronto	91
Boston	90

## 5 Games left

NY v. B'more  
NY v. Toronto  
B'more v. Toronto  
B'more v. Boston  
Toronto v. Boston

Boston can't win or tie for first place:

- must win its last 2 games to get 92 pts and tie NY
- NY must lose its 2 games v.s. B'more & Toronto
- Then, B'more & Toronto each has 92 pts
- But, one of B'more & Toronto will win game vs each other and have 93 pts



# Baseball Elimination

[Kleinberg-Tardos]

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## 5 Games left

NY v. B'more  
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## Simpler explanation:

- Boston can get a maximum of  $90 + 2 = 92$  pts
- NY, B'more & Toronto already have  $92 + 91 + 91 = \overset{274}{\cancel{272}}$  pts
- There are 3 games w/o Boston remaining
- One of NY, B'more & Toronto will have  $> \overset{274}{\cancel{(272+3)}} \div 3 = 92.33$  pts



Example 2:

New York 90  
Baltimore 88  
Toronto 87  
Boston 79

Remaining Games:

Boston v. NY 4x

Boston v. B'more 4x

Boston v. Toronto 4x

B'more v. NY 1x

B'more v. Toronto 1x

NY v. Toronto 6x

You can always find a "short" explanation, but must consider subsets of teams. E.g. Can Boston win?

$$\text{NY} + \text{B'more} + \text{Toronto} = 90 + 88 + 87 = 265$$

$$+ 8 \text{ remaining game w/o Boston} = 273$$

$$273 \div 3 = 91 \leftarrow \text{doesn't tell us much}$$

$$\text{NY} + \text{Toronto} = 90 + 87 = 177$$

$$+ 6 \text{ remaining games} = 177 + 6 = 183$$

$$183 \div 2 = 91.5$$

max for Boston

$$= 79 + 12$$

$$= 91$$

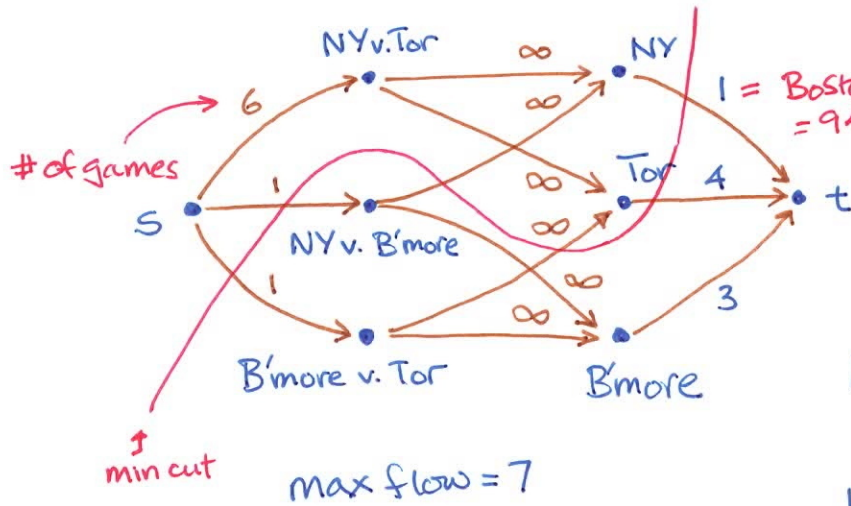
Boston  
cannot  
win

Example 2:

New York	90
Baltimore	88
Toronto	87
Boston	79

Remaining Games:

Boston v. NY	4x	B'more v. NY	1x
Boston v. B'more	4x	B'more v. Toronto	1x
Boston v. Toronto	4x	NY v. Toronto	6x



$1 = \text{Boston max} - \text{NY} = 91 - 90$  Can Boston win?

Boston's max =  $79 + 12 = 91$   
 Min cut has capacity 7

$$\begin{aligned} \text{NY} + \text{Toronto} &= 90 + 87 = 177 \\ &+ 6 \text{ remaining games} = 183 \\ 183 \div 2 &= 91.5 \end{aligned}$$

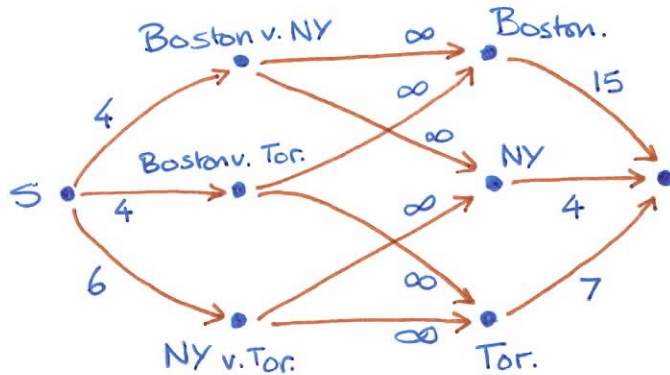
Boston cannot win

Example 2:

New York 90  
 Baltimore 88  
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Remaining Games:

Boston v. NY 4x  
 Boston v. B'more 4x  
 Boston v. Toronto 4x  
 B'more v. NY 1x  
 B'more v. Toronto 1x  
 NY v. Toronto 6x



max flow = 14

Baltimore can win:

$$\text{pts} = 88 + 6 \text{pts} = 94 \text{pts}$$

Boston wins all its games

$$\text{pts} = 79 + 8 = 87 \text{pts}$$

Toronto wins all its games v. NY

$$\text{pts} = 87 + 6 = 93 \text{pts}$$

NY stays at 90pts

$Z$  = team under consideration

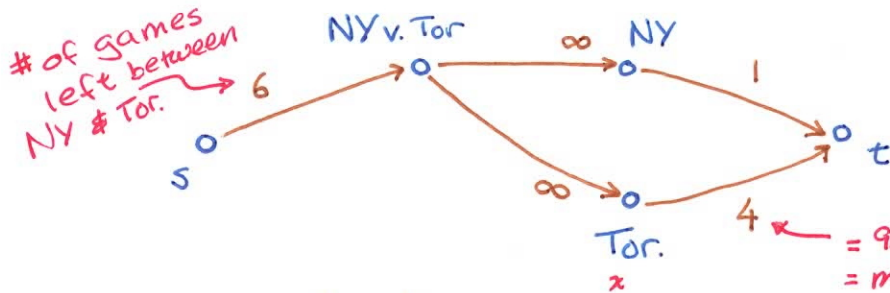
$m$  = maximum possible pts for  $Z$

= current pts + # of remaining games

$g^*$  = # of games not involving  $Z$

assume that  $Z$   
wins all of these

Idea: distribute pts from game to teams



$Z$  = Boston  
 $m = 79 + 12 = 91$

$x$  = some other team

$w_x$  = current points of  $x$

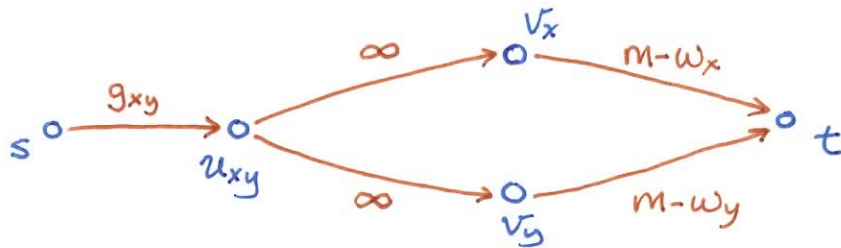
$g_{xy}$  = # of game left between  
team  $x$  & team  $y$

$= 91 - 87$   
 $=$  max number of pts Tor can win  
without beating Boston's max  
 $= m - w_x$

## General Construction:

Vertices: 1 vertex  $v_x$  for team  $x$   
1 vertex  $u_{xy}$  for pair of teams  $x \neq y$   
source  $s \neq$  sink  $t$

Edges:  $c(s, u_{xy}) = g_{xy} = \#$  of games left between  $x \neq y$   
 $c(u_{xy}, v_x) = \infty$   
 $c(u_{xy}, v_y) = \infty$   
 $c(v_x, t) = m - w_x = \#$  of games  $x$  can win & not beat  $z$



$g^*$  = number of games left not involving  $z$ .

Question: Is max flow =  $g^*$ ?

Yes =  $z$  can win or tie for 1<sup>st</sup> place  
because pts from remaining games  
can be distributed to teams  
without any team exceeding  $z$ 's max. pts.

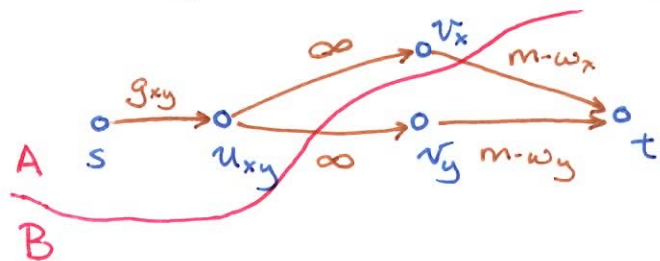
No =  $z$  cannot win ... because?

There is always a short proof.

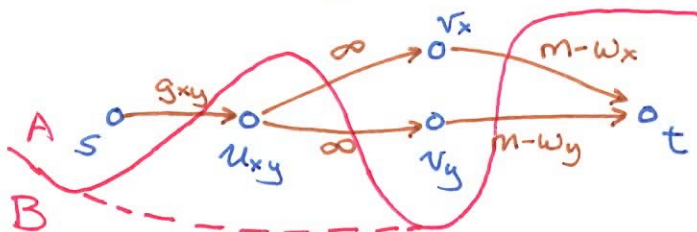


Let  $(A, B)$  be the mincut:

- Cannot have  $u_{xy} \in A$ , but  $v_x \notin A$  or  $v_y \notin A$ .  
An edge with  $\infty$  capacity would cross  $(A, B)$



- If  $v_x \in A$  &  $v_y \in A$ , then  $u_{xy} \notin A$  means  $(A, B)$  not mincut.



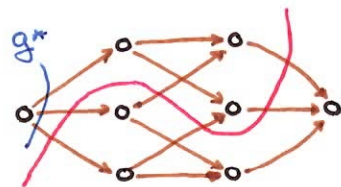
↑ if we add  $u_{xy}$  to  $A$ ,  $(s, u_{xy})$  not cut & no other edges cut.

$(A \cup \{u_{xy}\}, B - \{u_{xy}\})$  is a smaller cut, because  $(s, u_{xy})$  not cut.



Let  $T = \{x \mid v_x \in A\}$  = teams on A side of mincut.

$$c(A, B) = \sum_{\{x, y\} \not\subseteq T} g_{xy} + \sum_{x \in T} (m - w_x)$$



$$= g^* - \sum_{\{x, y\} \subseteq T} g_{xy} + m|T| - \sum_{x \in T} w_x$$

$$\text{Then, } \sum_{x \in T} w_x + \sum_{\{x, y\} \subseteq T} g_{xy} = m|T| + \overbrace{g^* - c(A, B)}^{> 0} > m|T|$$

↑ cut arounds
↑ min cut

$$\text{So, } \frac{1}{|T|} \left( \sum_{x \in T} w_x + \sum_{\{x, y\} \subseteq T} g_{xy} \right) > m.$$

there exists  
a subset  
of teams  
 $T$

↑  
average  
over  
 $T$

↑  
points  
teams in  
 $T$  already have

↑  
points from  
games left

↑  
max pts  
 $z$  can  
have

# Assignment Problem: Basic Version

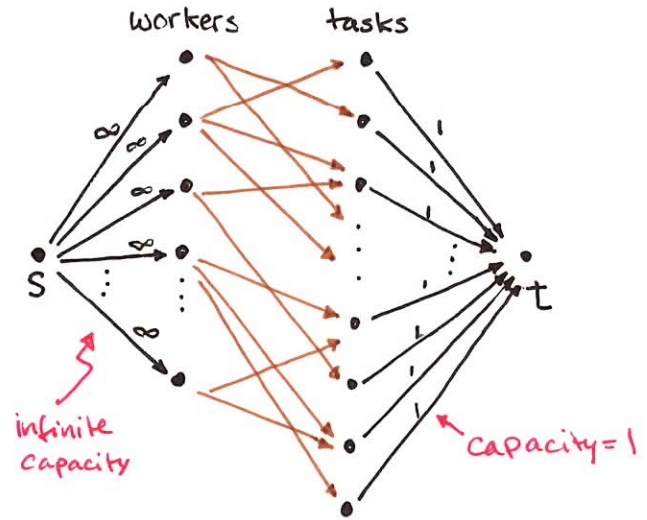
$n$  workers:  $w_1, w_2, \dots, w_n$

$m$  tasks:  $t_1, t_2, \dots, t_m$

Each worker is competent for a subset of the tasks.

Assign workers to tasks so each task is assigned a competent worker.

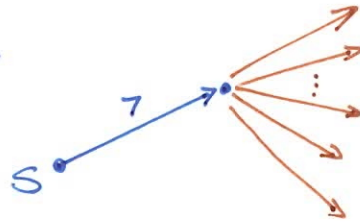
Q: does max flow saturate all edges into  $t$ ?



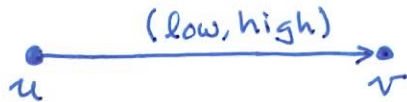
edge  $(w_i, t_j)$   
if worker  $i$  is competent in task  $j$   
capacity = 1

What if we want to prevent an individual worker from performing too many or too few tasks?

Limit worker to 7 tasks:



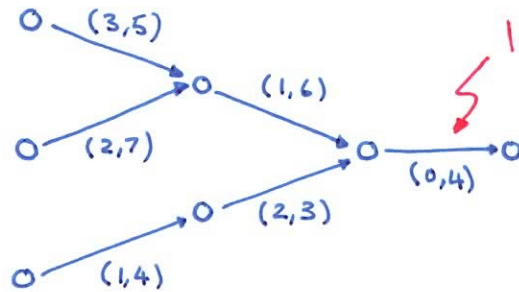
Need flow networks with lower bounds if we want to require a worker perform at least some number of tasks.



$$\text{low}(u,v) \leq f(u,v) \leq \text{high}(u,v)$$

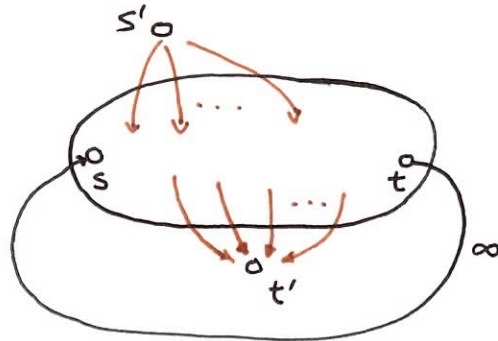
same as capacity

Some flow networks with lower bounds have no solution:

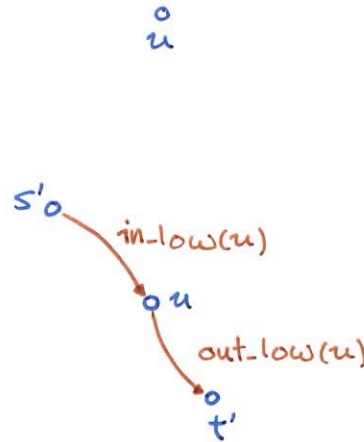


lower bounds on other edges  
require that at least 7 units  
flow thru this edge,  
but that exceeds  
the edge's capacity

Idea: convert flow networks w/ lower bounds into normal flow networks.



Create new source  $s'$   
 & new sink  $t'$   
 add edge w/  $\infty$  cap. between  $t' \# s$

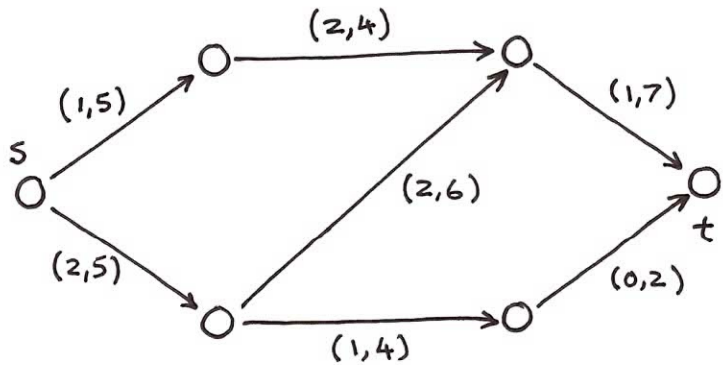


$$in\_low(u) = \sum_{v \in V} low(v, u)$$

= sum lower bounds of edges into  $u$

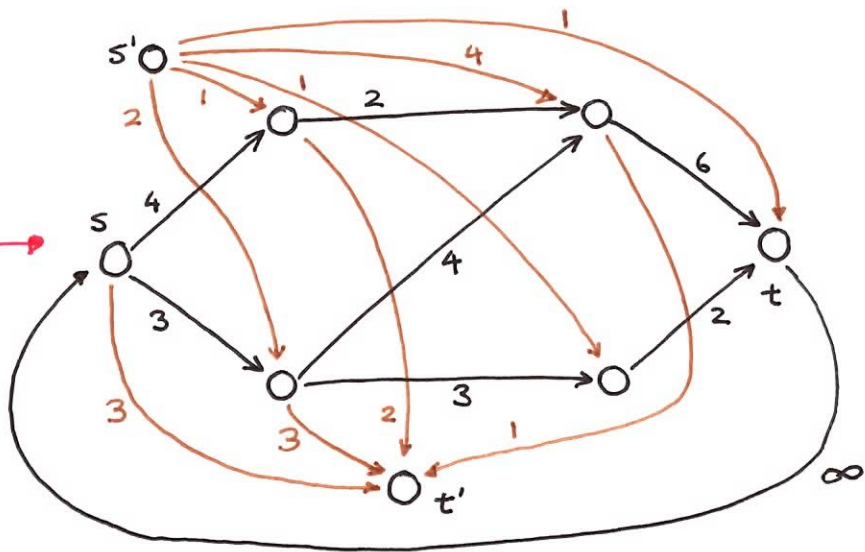
$$out\_low(u) = \sum_{v \in V} low(u, v)$$

= sum lower bounds of edges out of  $u$



(low, high)

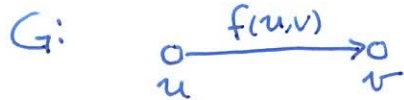
assume no edges into original source



Claim: network  $G$  with lower bounds has a legal solution  
 iff normal network  $G'$  has max flow that saturates  
 edges out of  $s'$ .  
 ↪ equivalently, all edges into  $t'$  saturated.

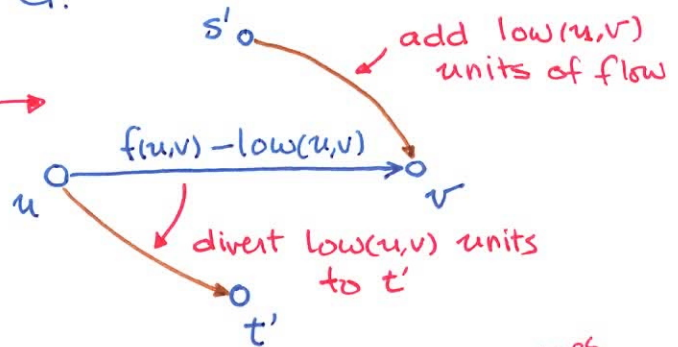
Pf:

( $\Rightarrow$ ) let  $f$  be a legal flow in  $G$ .



$$\text{low}(u,v) \leq f(u,v) \leq \text{high}(u,v)$$

flow is conserved!



total units added to  $(s',v)$  for all edges

$$= \sum_{x \in V} \text{low}(x,v) = \text{in-low}(v)$$

total units diverted to  $(u,t')$  for all edges

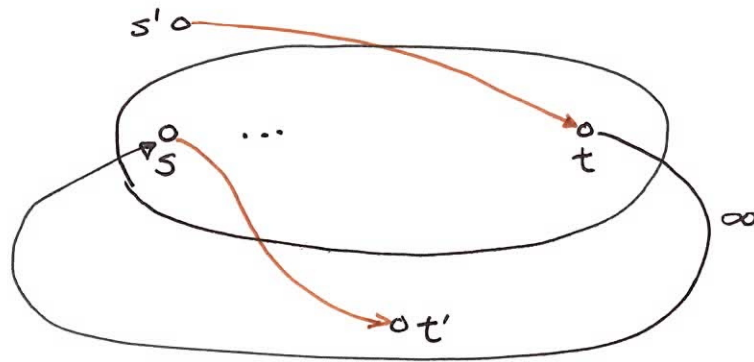
$$= \sum_{x \in V} \text{low}(u,x) = \text{out-low}(u)$$

hence all edges out of  $s'$  are saturated, and we have max flow



Special cases:  $s \neq t$

There are no edges into  $s$  or out of  $t$



Flow comes into  $t$  with nowhere to go.  
Flow out of  $s$ , but none coming in.

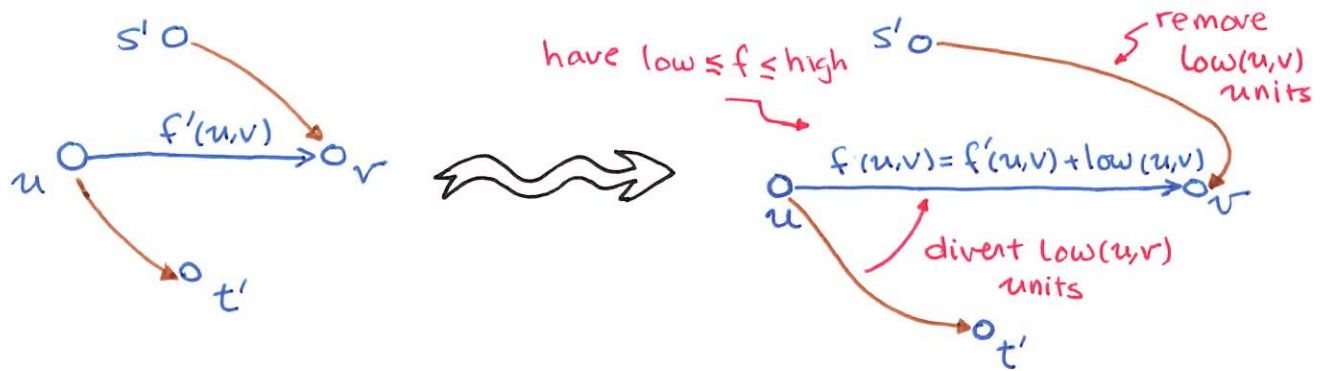
} flow conservation means these amounts are equal

Send this flow from  $t$  to  $s$  using special  $\infty$ -capacity edge.

Pf of Claim continued

( $\Leftarrow$ ) [Need to show if max flow in  $G'$  saturates all edges out of  $s'$ , then  $G$  has a legal flow]

Reverse process. Let  $f'$  be a max flow in  $G'$



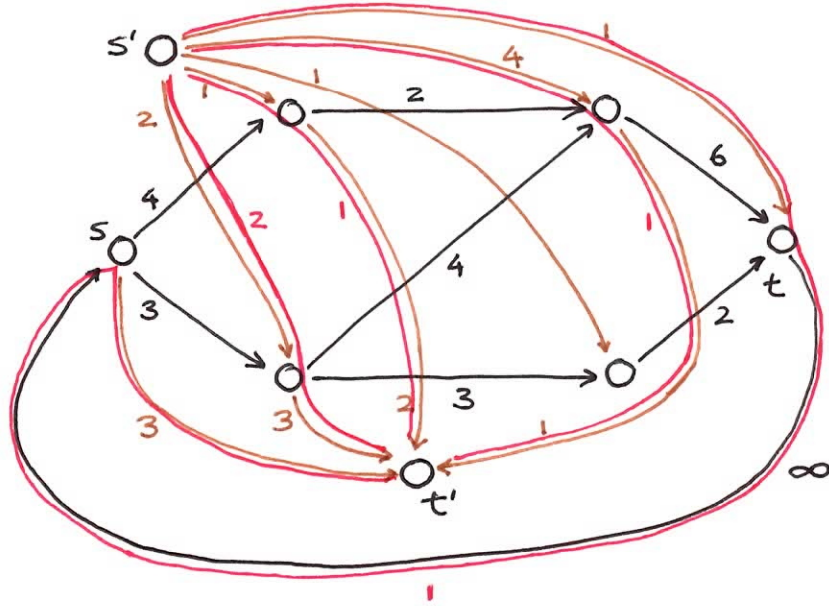
When all edges processed,  $out\_low(u)$  units diverted from  $(u,t')$  and  $in\_low(v)$  units removed from  $(s',v)$ .

Flow does not involve  $s' \neq t'$ . Remove edge  $(t,s)$ .

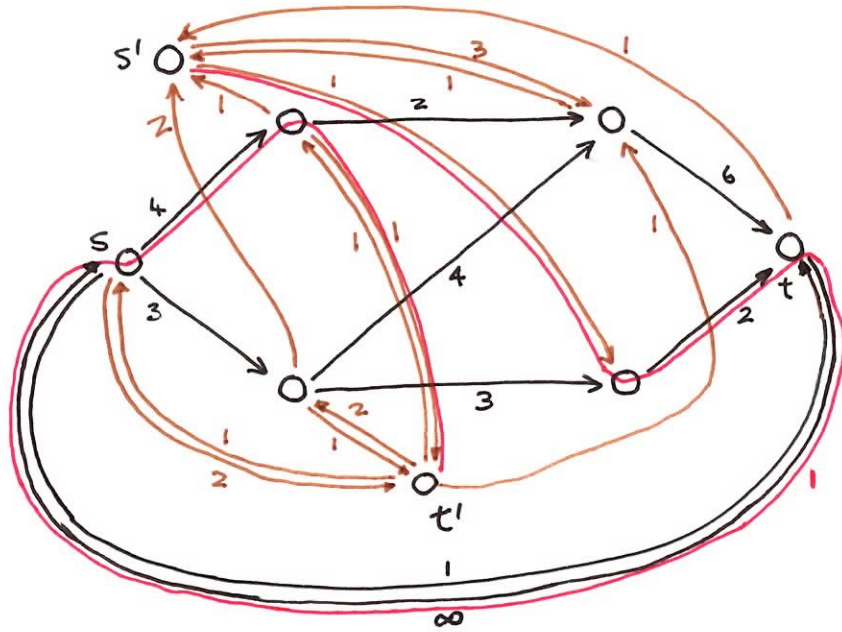
Now we have legal flow in  $G$ .

END OF CLAIM  $\square$

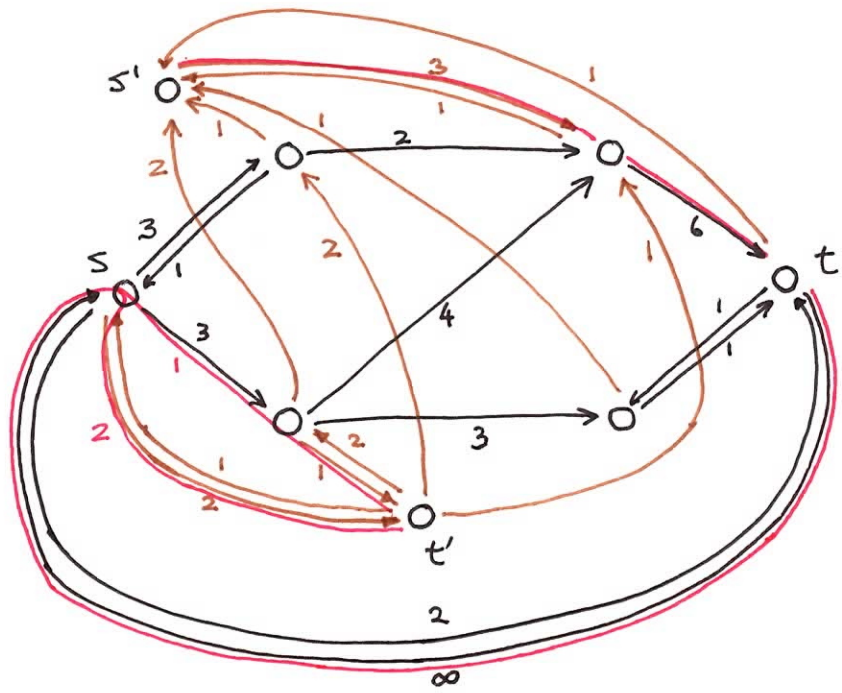
Finding max flow in  $G'$ .



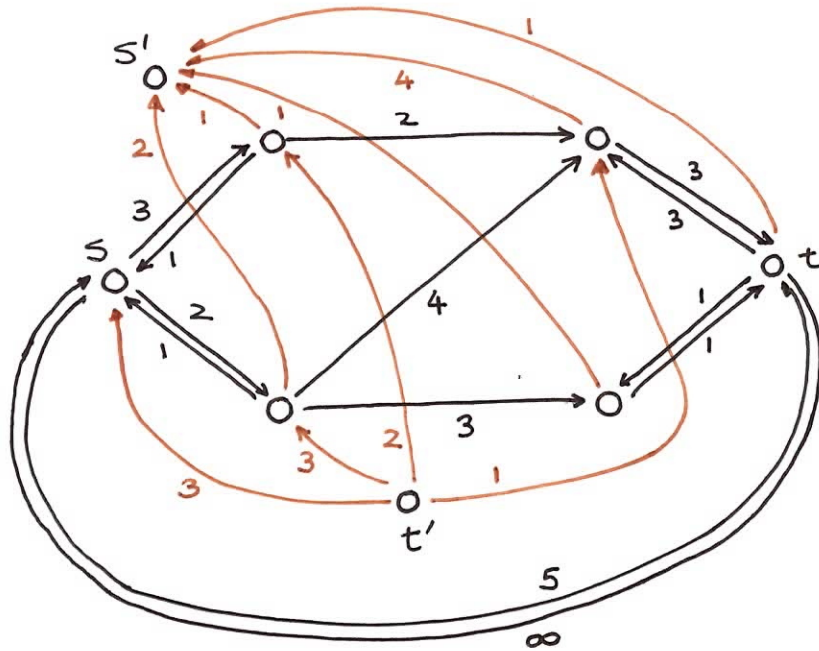
4 augmenting paths  
with path flows  
2, 1, 1, 1



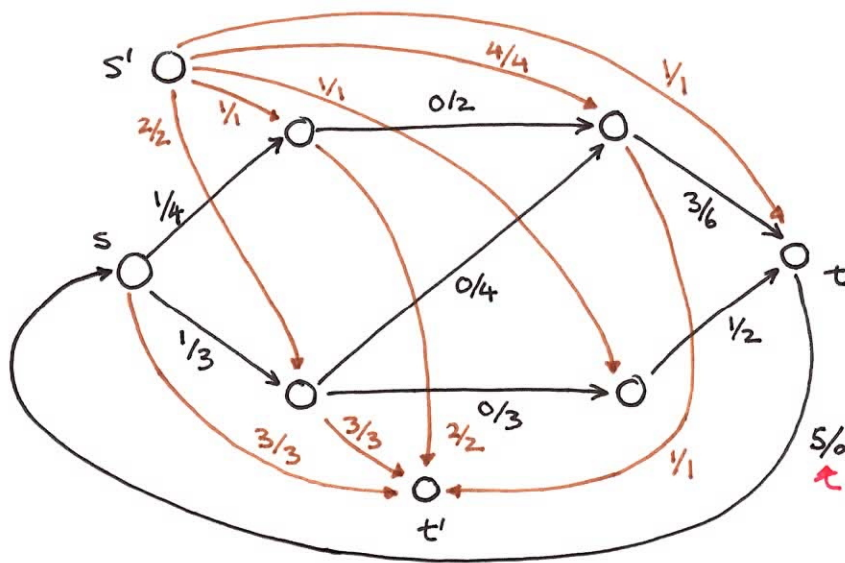
1 augmenting path with path flow 1



2 augmenting paths  
with path flows  
1, 2



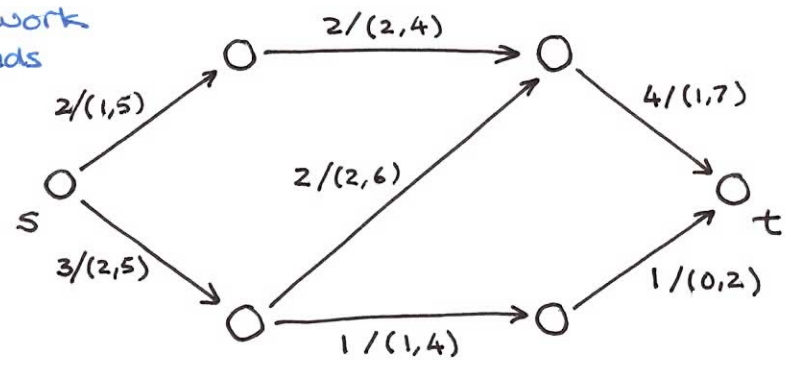
final residual graph has no augmenting paths



final flow:  
edges out of  $s'$   
and into  $t'$   
are saturated  
check flow conserv.

Corresponding flow  
in original network  
with lower bounds

Add lower  
bounds  
to flow above.

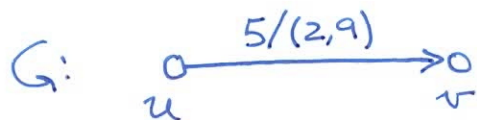


notation:  
flow/(low, high)

legal flow,  
but not max!



# Residual Graph for flow networks w/ lower bounds



Can send 4 more units from  $u$  to  $v$ .  
How many can we send back to  $u$   
from  $v$ ? 3 [must preserve lower bound]

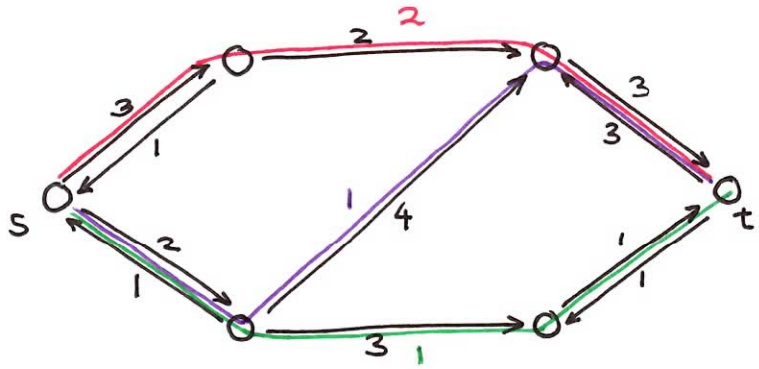


$$c_f(u,v) = \begin{cases} \text{high}(u,v) - f(u,v) & \text{if } (u,v) \in E \\ f(u,v) - \text{low}(u,v) & \text{if } (v,u) \in E \\ 0 & \text{otherwise} \end{cases}$$

Augment with paths as before.

Max flow is achieved when no more augmenting paths.

Residual graph respecting lower bounds



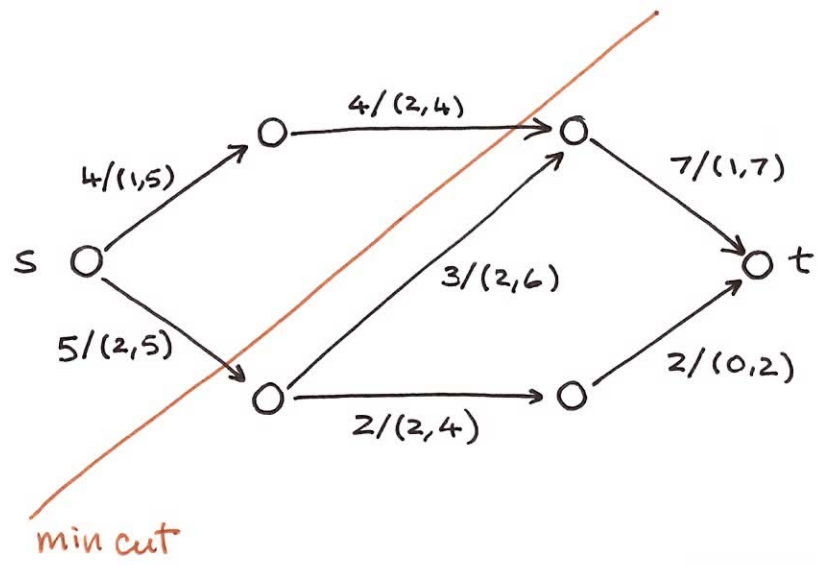
3 augmenting paths

1st path, flow = 2

2nd path, flow = 1

3rd path, flow = 1

Final flow is max.



flow/(low, high)