

Applications of flows and cuts  
(and, time permitting)

Circulations

(and, time permitting)

Kent

min-cost flow

Thursday, March 15

Team	Wins	Games left
New York	92	2
Baltimore	91	3
Toronto	91	3
Boston	89	+ 2 = 91

Can Boston catchup?

Team	Wins	Games left		
New York	92		2	
Baltimore	91		3	
Toronto	91		3	
Boston	90	+	2	92

Can Boston catch up?

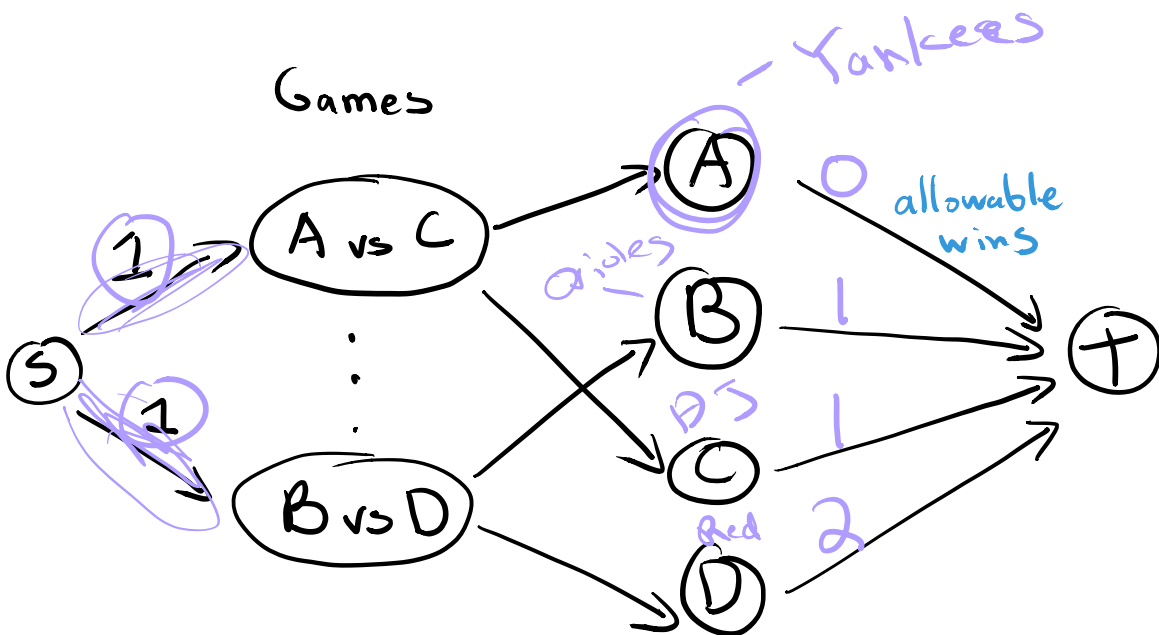
(wins)	(92)	<sup>92</sup> (91)	<sup>92 → 93</sup> (91)	(90)
	New York	Baltimore	Toronto	Boston
New York	X	<del>1</del>	<del>1</del>	0
<sup>92</sup> Baltimore	1	X	1	<del>1</del>
<sup>92</sup> Toronto	1	1	X	<del>1</del>
Boston	0	1	1	X

Modeling w/ max flow

each win is 1 unit of flow.

each games gives 1 win (unit of flow)

to one of the two teams



Input: Set of teams  $S$

1 for each team  $x \in S$ ,  $w_x = \#$  of wins of team  $x$

2 for each pair of teams  $x, y$ ,  $g(x, y) = \#$  games left between  $x$  and  $y$

3 favorite team  $z$

•  $z$  can win if: (for some  $m$ )

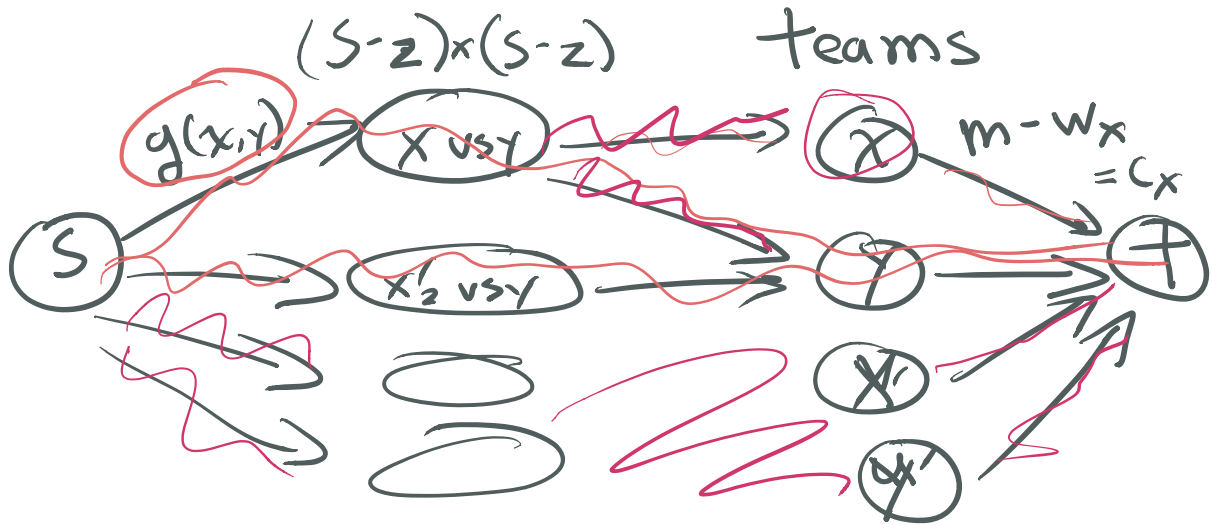
$z$  wins at least  $m$

all other teams win  $\leq m$

$$m = \left( \sum_{y \in S - z} g(y, z) \right) + w_z$$

I want each other  $y \in S - z$  to win

$$\leq m - w_y = c_y$$



1. compute max flow  $\Rightarrow$  value  $F$

2. if  $F = \sum_{x,y} g(x,y)$  then answer yes

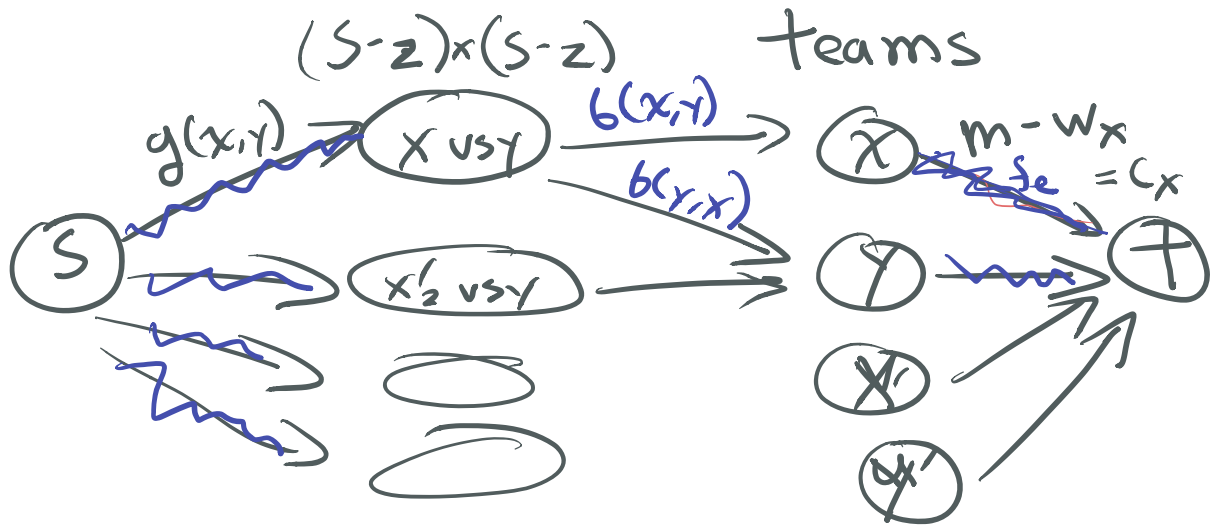
3. else answer no

team  $z$  is eliminated iff  $F < \sum_{x,y} g(x,y)$

(a) suppose  $z$  is not eliminated.

let  $b(x,y)$  be the # times  $x$  beats  $y$ ,  
 (e.g.  $b(y,x) = g(x,y) - b(x,y)$ )

construct a flow  $f$



need to show that this flow is feasible and check it has value  $F$

$$\text{if } f_e > m - w_x, \Rightarrow \sum_y b(x,y) > m - w_x$$

$$w_x + \sum_y b(x,y) > m \quad \square$$

Opposite direction:

give integral flow  $f$  w/ value  $F$   
 then I can find  $b(x,y)$  s.t.  $z$   
 is still in  $S$  or  $T$



# Project scheduling

$n$  projects (numbered)  $1, 2, \dots, n$

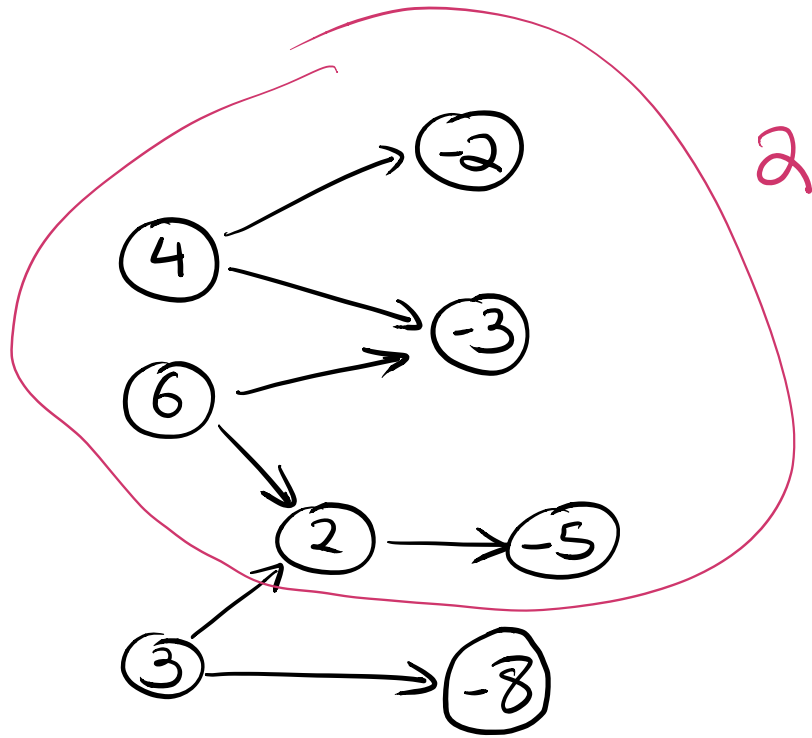
dependencies of the form

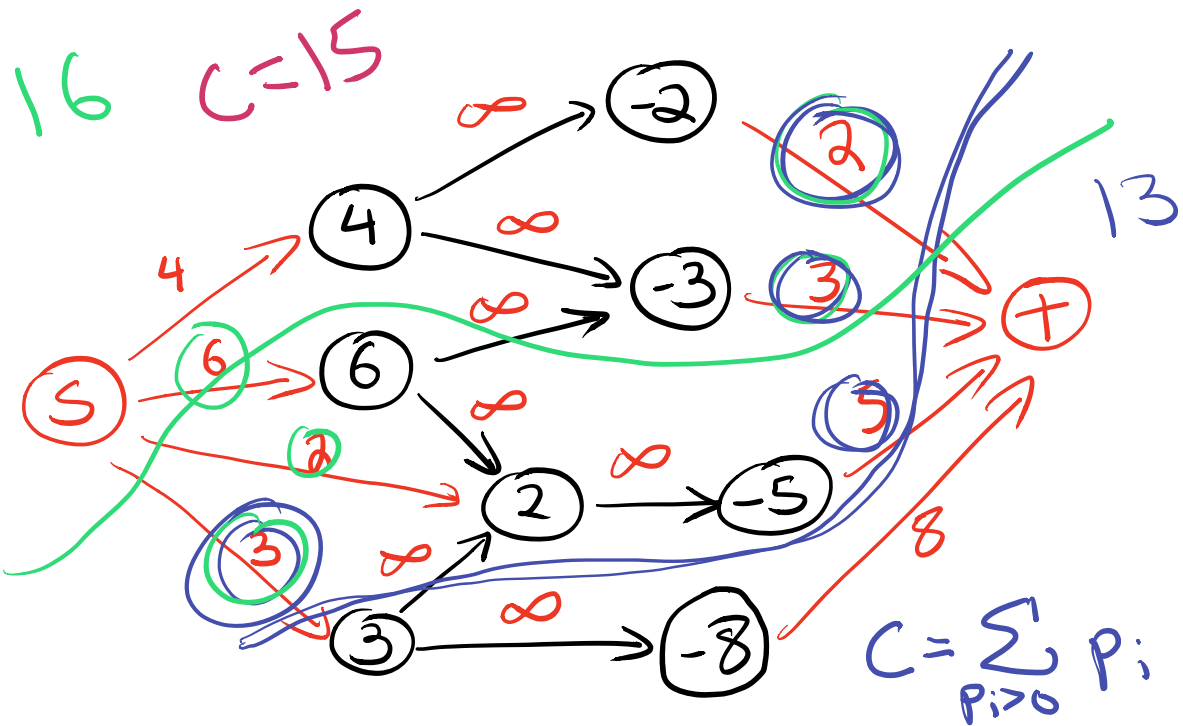
"project  $i$  depends on project  $j$ ."

(Assume dependencies are acyclic)

Each project has cost/profit  $p_i$   
(negative  $p_i$  is a cost)

goal: find maximum profit  
set of projects





look for min-  $s \rightarrow t$  cut; component containing  $s$  is the projects we take

how to make the aux.

- for each  $i$  w/  $p_i > 0$ , add an edge from  $s$  to  $i$  w/ capacity  $p_i$
- for each  $i$  w/  $p_i < 0$ , add an edge from  $i$  to  $t$  w/ capacity  $-p_i$

- for each dependency  $i \rightarrow j$ ,  
add an edge from  $i$  to  $j$   
w/ capacity  $\infty$

## Proof

given a cut defined by

$S \subseteq V$ . ( $\partial(S)$  = edges leaving  $S$ )

take all projects in  $S$ .

if cost of  $\partial(S) < \infty$ , then

(I claim) I didn't break any dependencies.



in opp. direction,

if I have "feas. projects"

and  $S = \{s_1, \dots\}$ .

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Given a feasible set of projects  $P \subseteq [n]$  of total profit  $d$ , there is an <sup>ST</sup> cut

of weight

$$d = C - D$$

$$D = ~~d~~ C - d$$

sum of all profits      cut weight

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given cut of weight  $D$

we can make set of feas. projects  
w/ sum profit  $C - D$

More Formally:

[reduction, slowly]

applications ✓

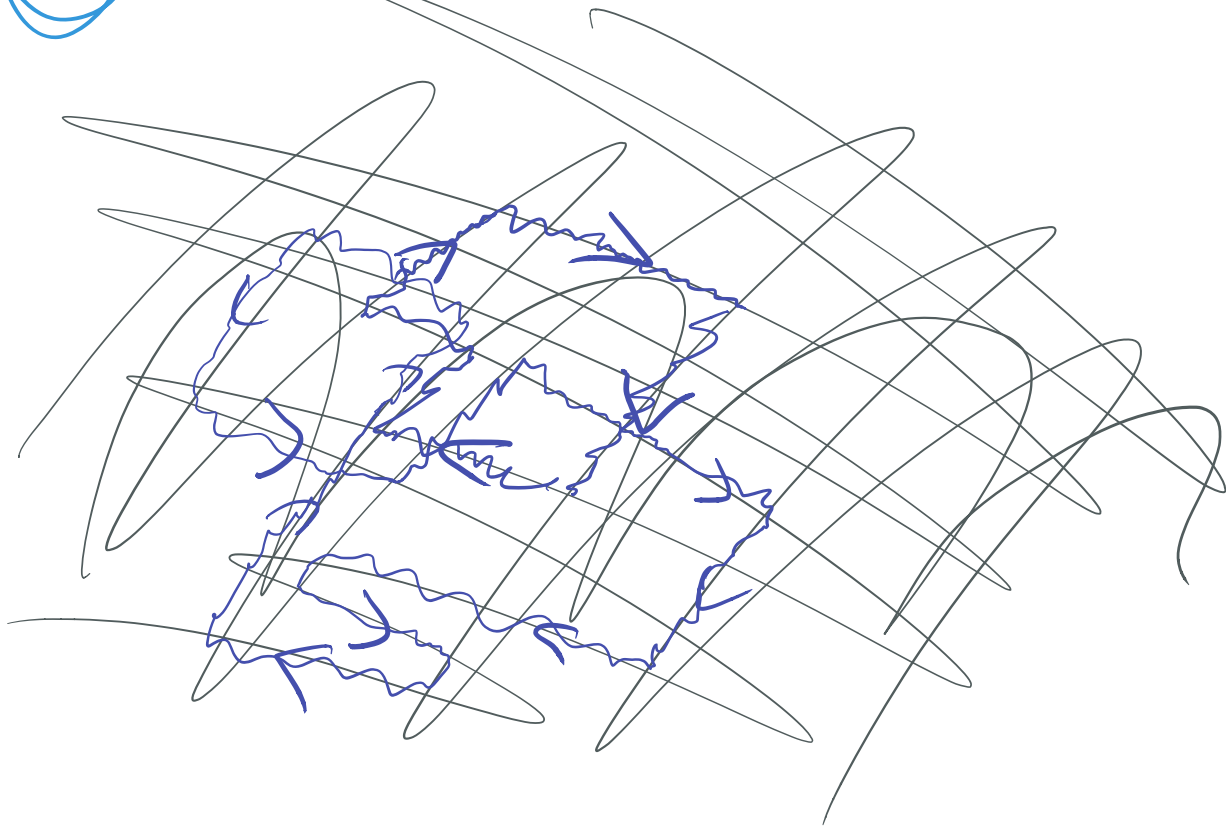
- ① circulations
- ② min cost max flow

Circulations  $G=(V,E)$  w/ capacities  $c$ .

"circulation":  $f: E \rightarrow \mathbb{R}_{>0}$

(a)  $\sum_{e \text{ into } v} f(e) = \sum_{e \text{ out of } v} f(e)$  for each  $v \in V$

(b)  $f(e) \leq c(e)$  for each  $e \in E$



circulation problem

← capacities  
← lower bounds

input:  $G=(V,E)$ ,  $c:E \rightarrow \mathbb{R}_{>0}$ ,  $l:E \rightarrow \mathbb{R}_{>0}$

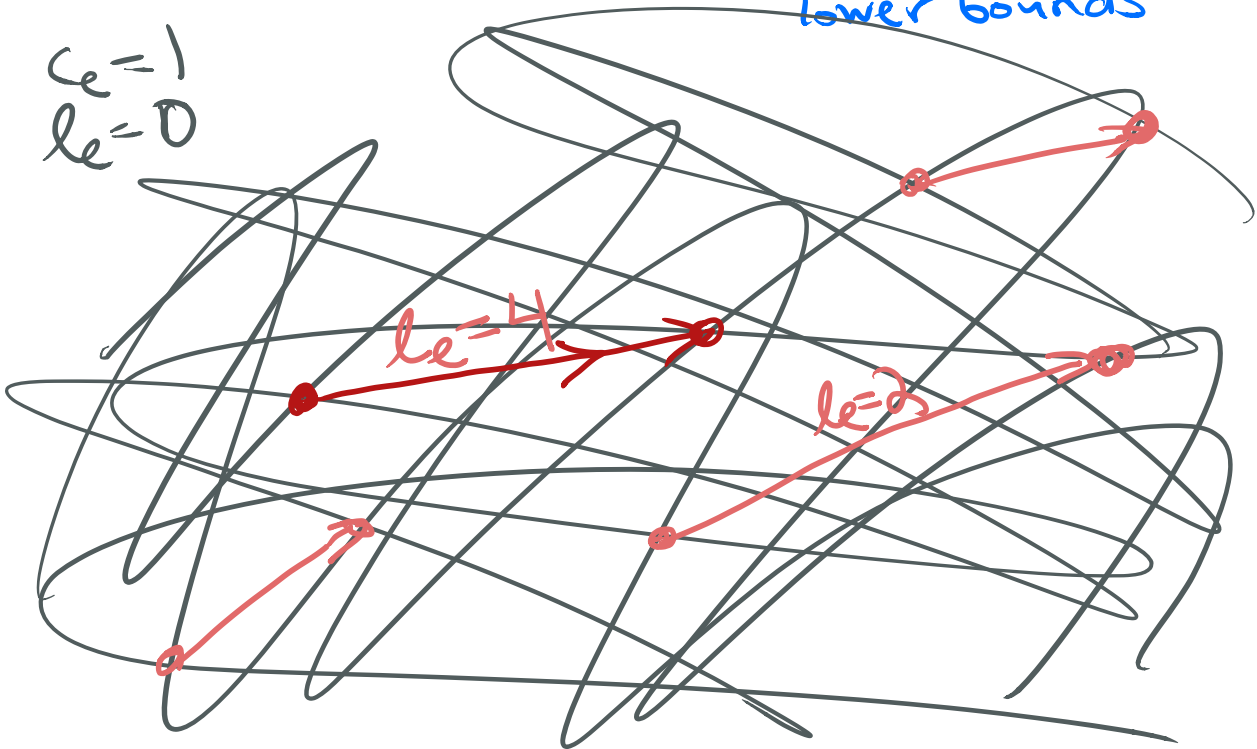
goal: find a circulation  $f:E \rightarrow \mathbb{R}_{>0}$

→  $f(e) \leq c_e$

s.t. for each  $e \in E$ ,  $f(e) \geq l(e)$

"lower bounds"

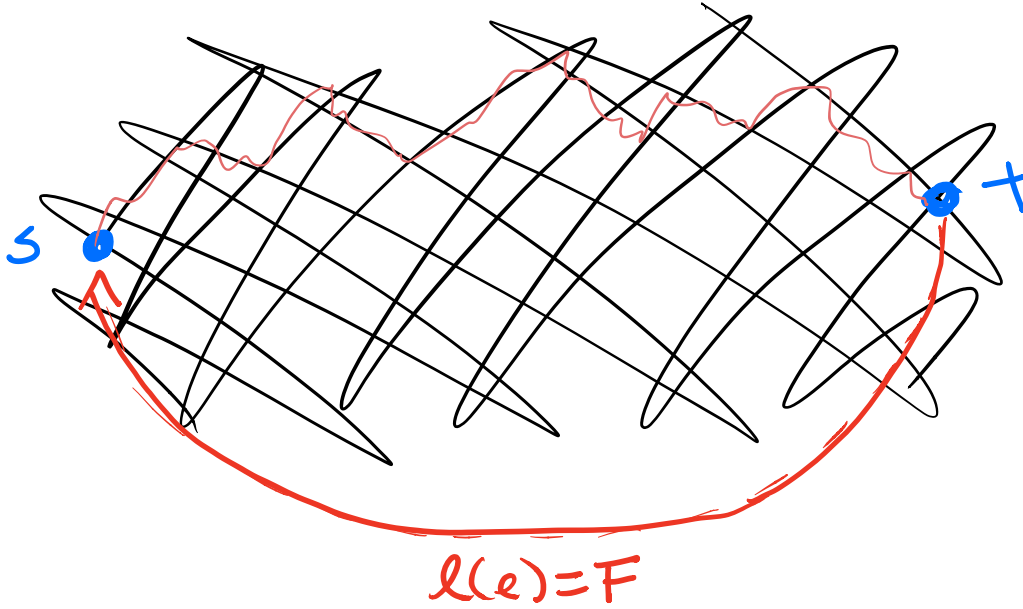
$c_e = 1$   
 $l_e = 0$



all black edges have capacity 1



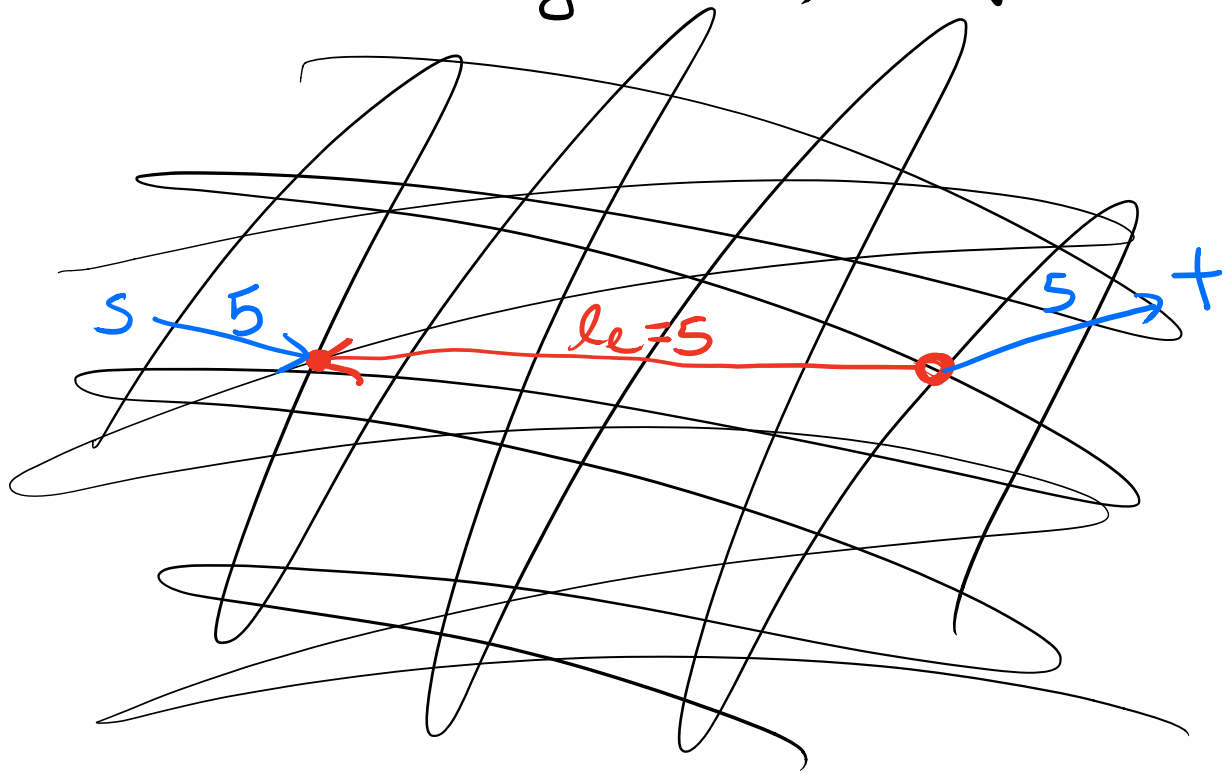
max flow  $\rightarrow$  circulation



circulation  $\rightarrow$  max flow

circulation  $\rightarrow$  max flow

(see Kleinberg-Tardos, Chap 7)



• Important properties

↳  $O(mn)$  time

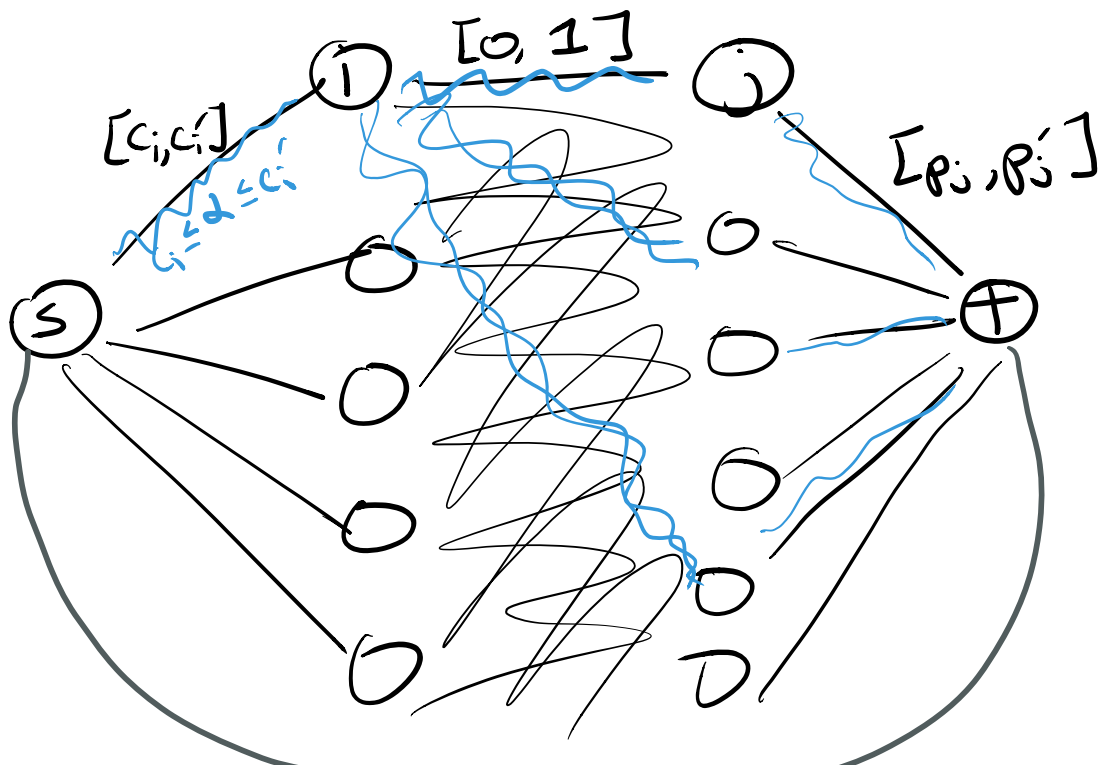
↳ integral capacities, lower bounds  
 $\Rightarrow$  integer valued circulation

↳ Hoffman's circulation theorem equiv.  
to max-flow min cut

↳ circulation decomposes to  $m$  cycles

# Survey design

- $k$  products,  $l$  customers
- ask customers about purchased products
- ask at customer  $i$  about at least  $c_i$  products and at most  $c_i$  products
- ask about a product  $j$  at least  $p_j$  times and at most  $p_j$  products



# Min-cost flow

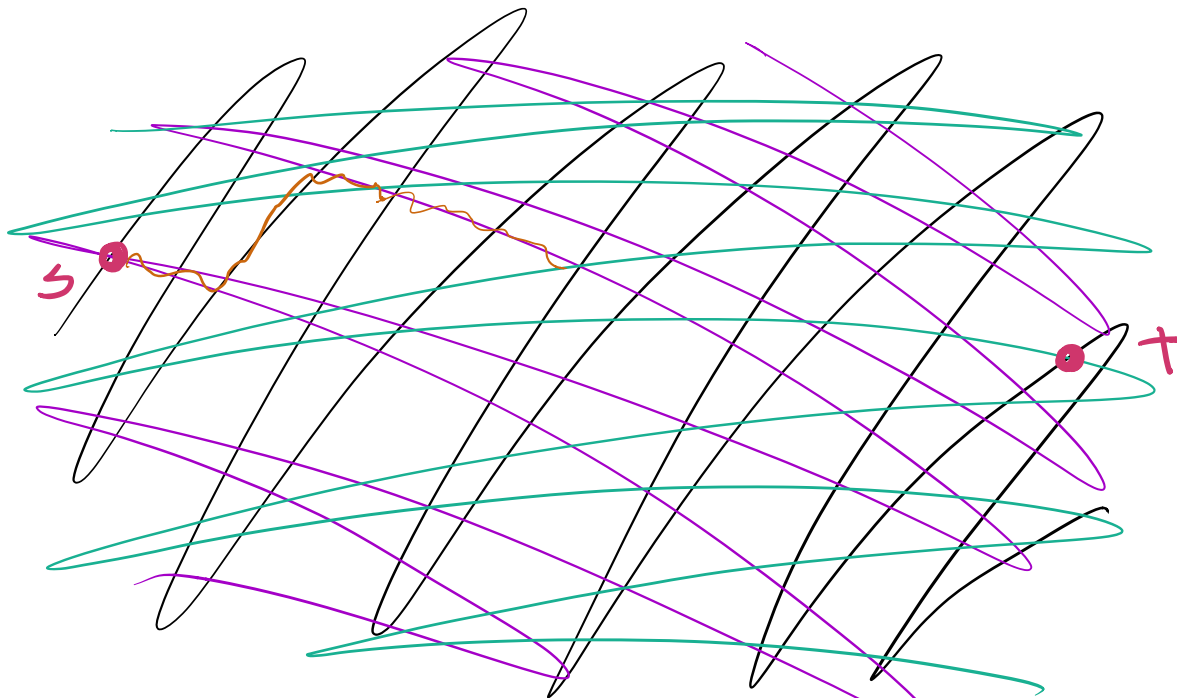
$[0, \infty]$

Input:  $G=(V, E)$ ,  $c: E \rightarrow \mathbb{R}_{\geq 0}$ ,  
target  $F$

costs  
 $w: E \rightarrow \mathbb{R}$ ,

Goal: find min-cost flow of size  $F$  from  
 $s$  to  $t$

$$\text{cost of } f: E \rightarrow \mathbb{R}_{\geq 0} = \sum_e w_e f_e$$



— = cost 1 — = cost 2 — = cost 3

Facts about min-cost max flow

$O(mn \log(C) \log(nW))$  time  
[ $C$ =max capacity,  $W$ =max weight]

$O(m^2 \log n + n^2 \log^2 n)$  "strongly  
poly nomial time"

Today: 2 algorithms

- cycle canceling
- shortest augmenting paths