

# Flows, cuts, linear programs, quadratic programs ①

Recall setup:

we have a directed graph

$$V = \{\text{vertices}\}$$

$$E = \{\text{edges}\}$$

- two special verts:  $s$  (source) only outgoing edges  
 $d$  (drain) only incoming edges

- each edge has a capacity; label each edge (integer,  $\geq 0$ ) w/ flow

- flow through edge may not exceed capacity

- at a vertex  $v$

$$\sum_{v_i} f_{v_i \rightarrow v} - \sum_{v_j} f_{v \rightarrow v_j} = 0$$

(Kirchhoff's laws)

- flow  $\geq 0$  on each edge.

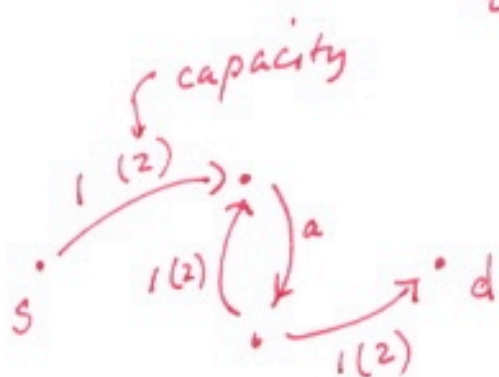
Q: what is max flow out of  $s$ ?  
(equiv: into  $t$ ).

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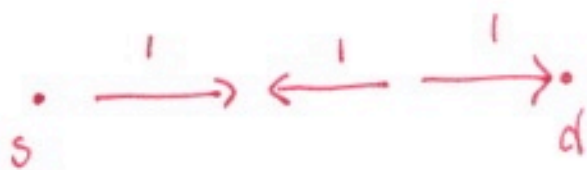
An elementary alg:

- assume we have a feasible flow  $f$
- an augmenting path for this flow is an undirected path from  $s$  to  $t$  such that:
  - all forward arrows ( $s \rightarrow t$ ) are below capacity
  - all backward arrows ( $t \rightarrow s$ ) are greater than zero.

eg.



(Q: what is flow, capacity on  $a$ ?)



is aug.

(Q: why no probs w/  $a$ ?)

- if an augmenting path exists, flow is NOT maximal (Because we can increase flow along this path)
- if flow is maximal, there is no A.P. (Because if there were, we could increase flow).

Alg outline:

- find augmenting path
- max flow on this path,

Notice there is some house keeping here



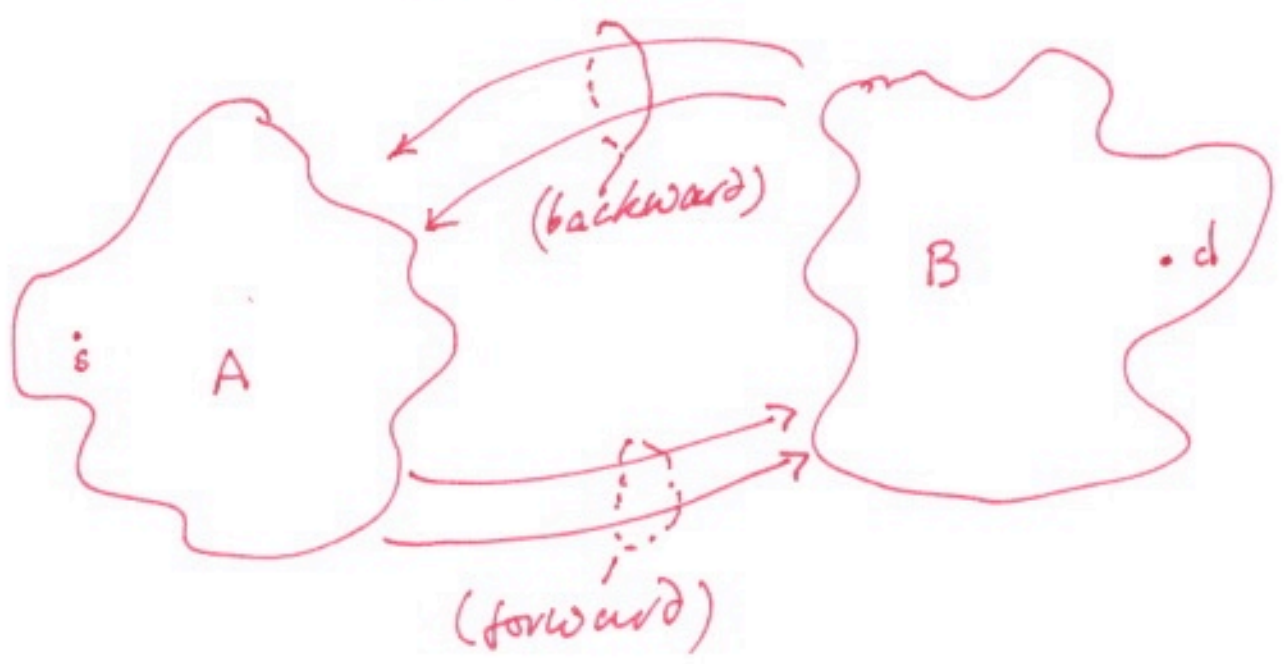
Notice also we are taking a feasible soln (original flow) and improving it; but always feasible cause always (a) meets ineq constraints (b) meets eq. constraints (Kirchoffs laws).

Now consider a disconnecting cut

- a set of edges that disconnects  $s, d$ .
- divider verts into  $A, B$

st  $A \cup B = V$   
 $A \cap B = \emptyset$

$s \in A, d \in B$



the total flow from  $s \rightarrow d$  is (5)

$$\sum \text{forward} - \sum \text{backward}.$$

we say the value of the cut is

$$\sum \text{capacities forward}.$$

Thm :

There is at least one cut so that

- all forward are at capacity
- all backward are zero

$\Leftrightarrow$

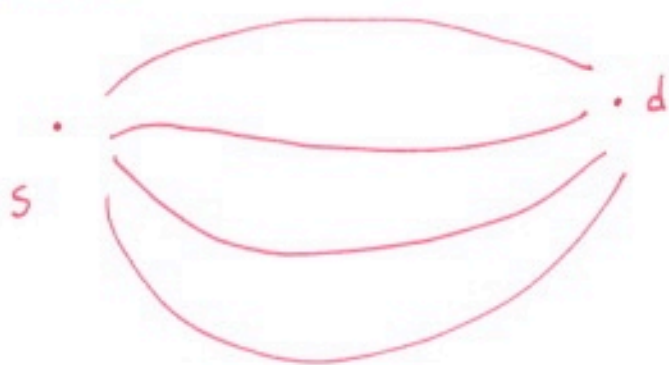
Flow is maximal.

$\Rightarrow$  easy; there can be no augmenting path  $\square$

⇐

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consider all paths,  $s \rightarrow d$



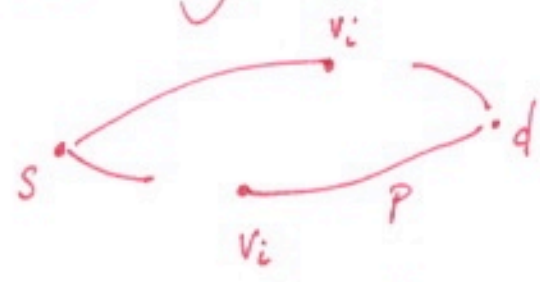
- each has either at least one edge forward and at capacity or at least one edge backward and w/ flow 0 (else there would be an augmenting path)

~~• now cut each of these edges~~  
• now cut each path at some such edge.

Q: is this a cut?

A: No, cause some verts could be on both s-side and t-side

Now assume  $v_i \in V(s)$  and  $v_i \in V(d)$   
after cutting



we can move it from  $V(d)$  to  $V(s)$   
w/o problems.

(Why: - there must be a downstream edge on P that we could have cut, but didn't, else there is an aug path!)

- restore edges as required.

Notice: value of this cut  
 "  $\Sigma$  capacities forward  
 " Max flow

# Notice

(8)

there cannot be a cut of lower value because if there were, the flow would be smaller.

In linear programming language:

for directed graph, write an incidence matrix  $A$

verts  $\downarrow$

$$a_{ij} = \begin{cases} 0 & \text{- if } e_j \text{ not incident on } v_i \\ 1 & \text{- if } e_j \rightarrow v_i \\ -1 & \text{- if } e_j \leftarrow v_i \end{cases}$$

edges  $\rightarrow$

• arrange  $A$  so row 1 is  $s$   
row 2 is  $d$



Can write max flow as

⑨

$$\begin{array}{l} \text{max} \\ \text{st} \end{array} \quad v \quad A f + v \begin{bmatrix} -1 \\ 1 \\ 0 \\ 0 \\ 0 \end{bmatrix} = 0 \quad \leftarrow \text{Kirchoff's laws}$$

$$f \geq 0$$

$$f \leq c$$

↑  
flow

↑  
vector of capacities

Another LP version

(10)

$$A_R = \left[ \begin{array}{l} \text{all rows of} \\ A \text{ but the first} \\ \text{two} \end{array} \right]$$

$$w^T = \text{second row of } A, \text{ csp to target / drain vertex.}$$

$$\max \quad w^T f$$

$$\text{st } A_R f = 0$$

(Kirchhoff's laws)

$$f \geq 0 \quad f \leq c$$

Thm:

$A, A_R$  are TUM.

Proof: (induction)

• consider some  $k \times k$  minor

• 3 cases:

• some col is all zeros  
 $\rightarrow \det(B) = 0$

•  $B$  has 1 col that has exactly 1 non-zero

$$\rightarrow \det(B) = \det \begin{bmatrix} 1 & b^T \\ 0 & \tilde{B} \end{bmatrix} \times (\pm 1)$$

$$\text{so } \det(B) = \pm \det(\tilde{B}).$$

•  $B$  has all cols with 2 non-zeros

$$\rightarrow i^T B = 0, \det B = 0$$

Careful This argument does not mean that  $\det(B)$  is always zero!

Obtain the dual :

(12)

h.p.       $\max w^T f$   
st       $A_R f = 0$   
 $c - f \geq 0$        $f \geq 0$

Dual:

$$Q(y, z, u) = \sup_f [w^T f - y^T A_R f + z^T f + u^T (c - f)]$$
$$= \begin{cases} u^T c & \text{if } [w^T - y^T A_R + z^T - u^T = 0] \\ \infty & \text{otherwise} \end{cases}$$

where  $z \geq 0$ ,  $u \geq 0$

$$\begin{aligned} \text{So} \quad & \min \quad u^T c \\ & \text{st} \quad w + A^T y + z - u = 0 \\ & \quad z \geq 0 \\ & \quad u \geq 0 \end{aligned}$$

we can clean up to:

$$\begin{aligned} \min \quad & u^T c \\ \text{st} \quad & A^T y + u \geq w \\ & u \geq 0 \end{aligned}$$

(z is non-neg.)

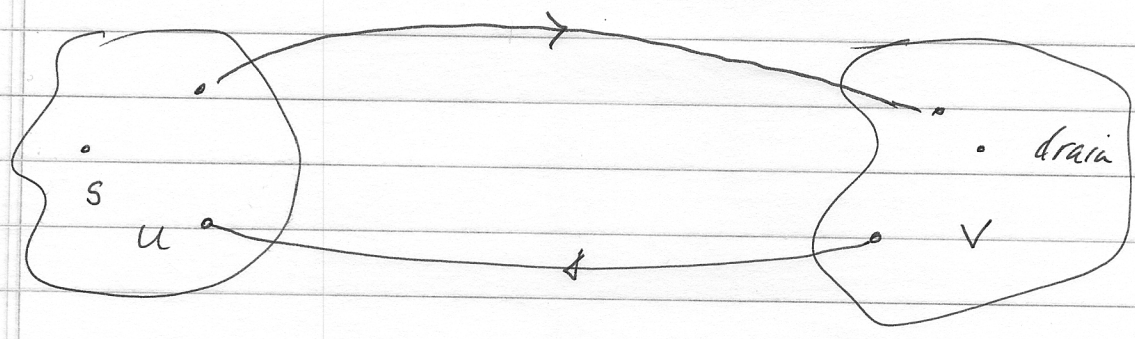
At a solution to this dual,  $y$  and  $u$   
are integer

(0-1)

Min-cut = easy 0-1 QP

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- Consequence - if we have an easy 0-1 QP, we can do it with any fast min-cut alg we have.



have  $x_i, I$  per vertex:

$$u: x_i = 0$$

$$v: x_i = 1$$

$$\text{value of cut} = \sum_{\substack{a \in \text{edges} \\ \text{from} \\ u \text{ to } v}} c_a$$

$$= \sum_{\substack{a \\ \in \text{all edges}}} (1 - x_i)(x_j) \cdot c_{i \rightarrow j}$$

So we have

$$\min \sum_{i,j} (1-x_i)(x_j) C_{i \rightarrow j}$$

$$\text{s.t. } x \in \{0, 1\}$$

But this is

$$\max \sum_{i,j} (x_i - 1)x_j C_{i \rightarrow j}$$

$$\text{s.t. } x \in \{0, 1\}$$

and we have

$$\max x^T A x + b^T x$$

↑

non neg

$$\text{s.t. } x \in \{0, 1\}$$