

HW9 is online

HW10 is the last HW

Midterm II back
at the end of class.

CS4800: Algorithms & Data

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Lecture 19:

Applications of Network Flow

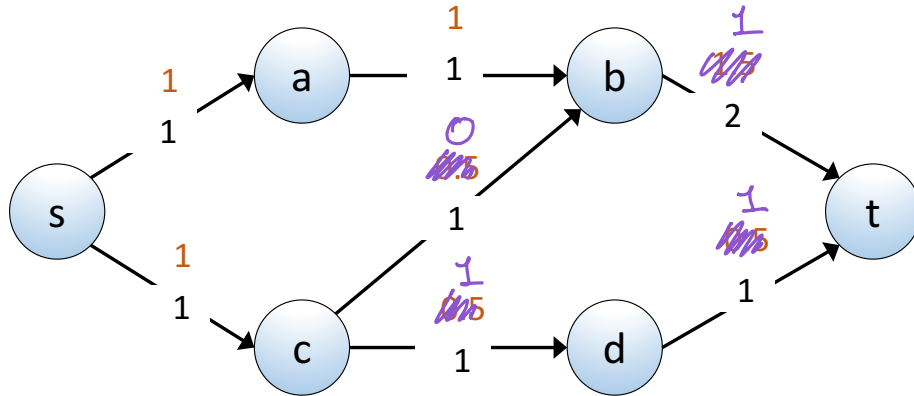
- Reductions
- Bipartite Matching

Mar 30, 2018

Ask the Audience

$$\text{val}(f) = 2$$

(a) Is this a maximum s-t flow? Yes! $\text{cap}(\{s\}, \{t\}) = 2$



(b) Does this network have an integer max s-t flow? Yes!

(c) Does every graph have an integer max flow? No!



(d) Does every graph with integer capacities have an integer max flow?

Claim: Given any flow network $G = (V, E, \{c(e)\}, s, t)$ with integer capacities. FF will find a maximum $s-t$ flow s.t. the flow on every edge is an integer.

"Proof": By induction. After each augmenting path the flow is an integer flow.

Recap

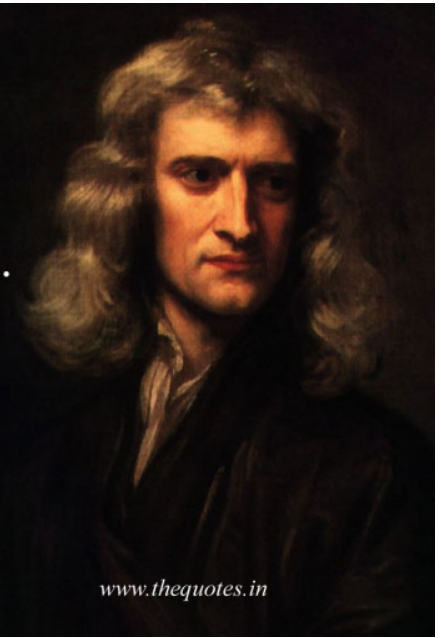
- Can solve maximum s-t flow in a flow network $G=(V,E,\{c(e)\},s,t)$ in $O(mn)$ time
 - If all capacities are integers, we get an integer flow
- Can find a minimum s-t cut in $O(mn)$ time

Applications of Network Flow

If I have seen further than others, it is
by standing upon the shoulders of giants.

Isaac Newton

www.thequotes.in



Applications of Network Flow

- Algorithms for maximum flow can be used to solve:
 - Bipartite Matching]
 - Disjoint Paths]
 - Survey Design
 - Matrix Rounding
 - Auction Design
 - Fair Division
 - Project Selection]
 - Baseball Elimination]
 - Airline Scheduling
 - ...

Reductions

There is an efficient algorithm that solves **Problem B** using calls to the library function that solves **Problem A**.

MAXFLOW

Mechanics of Reductions

- What exactly is a computational problem?

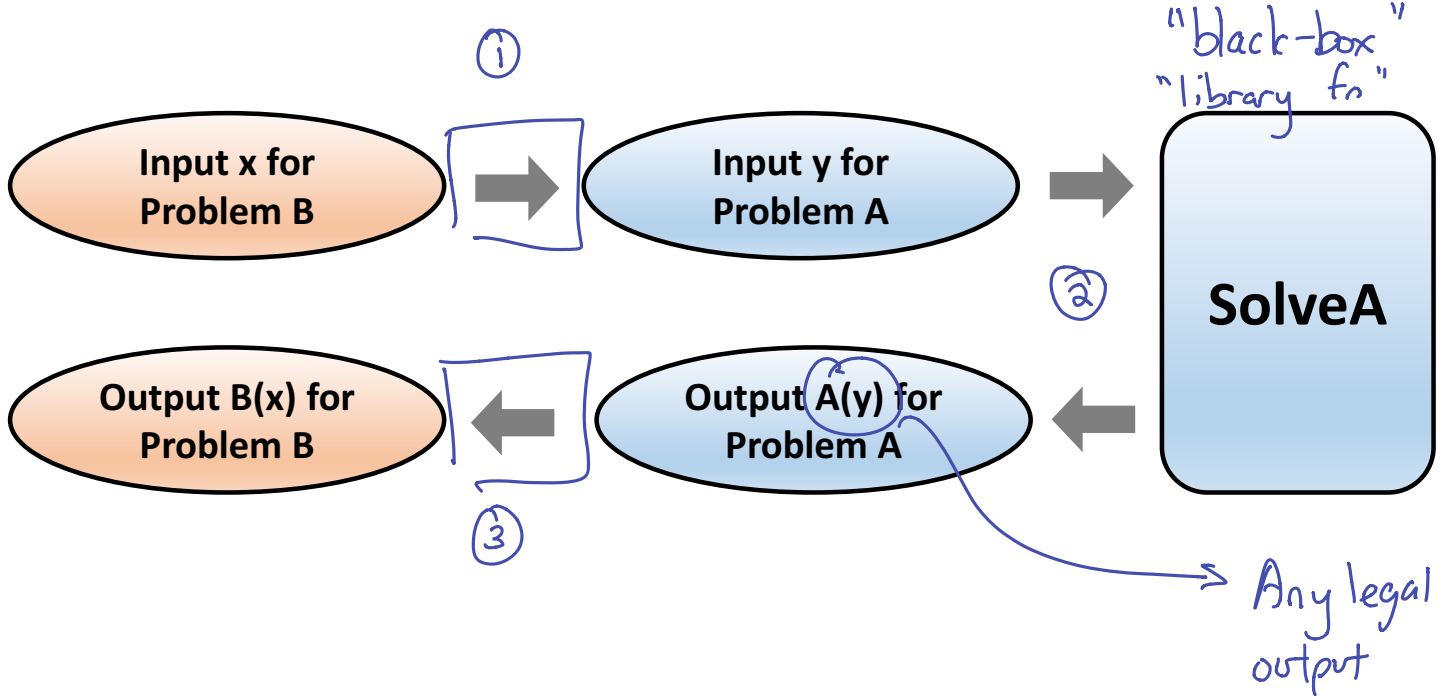
- A set of legal inputs x (An array $A[1], A[2], \dots$)
- A set $A(x)$ of legal outputs for each x (A in sorted order)

- Example Integer Maximum Flow

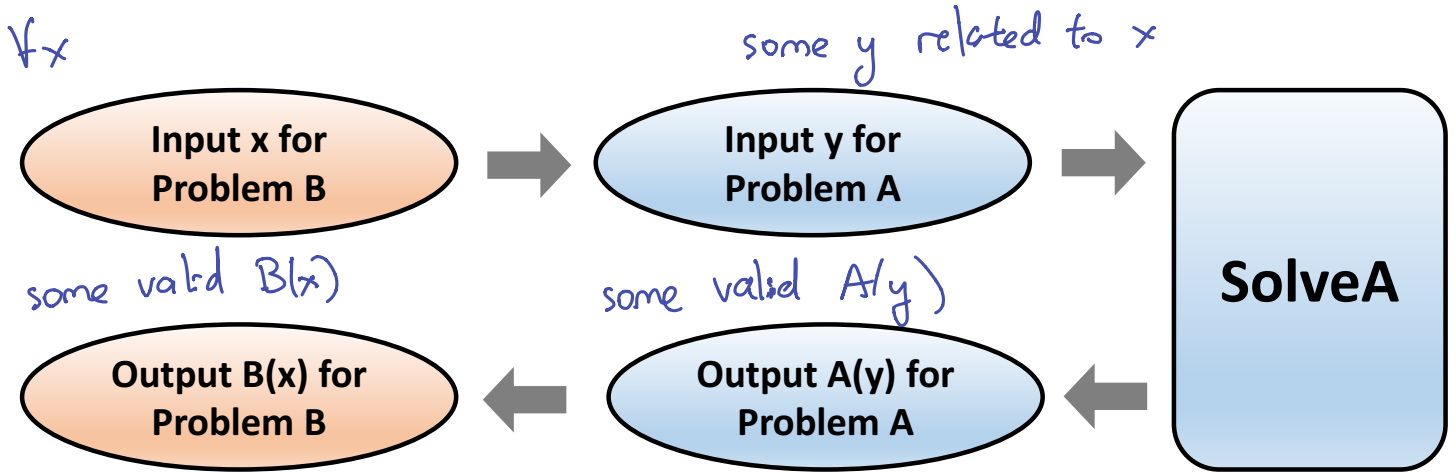
$$x : \left\{ \begin{array}{l} \text{directed graph } G = (V, E), \\ \text{integer cap's } \{c(e)\}, \\ \text{source } s, \text{ sink } t \end{array} \right\}$$

$$A(x) = \left\{ \begin{array}{l} \{f(e)\} \\ \text{integer flow} \end{array} : \begin{array}{l} f \text{ satisfies non-negativity, conservation, capacity} \\ \text{val}(f) \text{ is maximum} \end{array} \right\}$$

Mechanics of Reductions

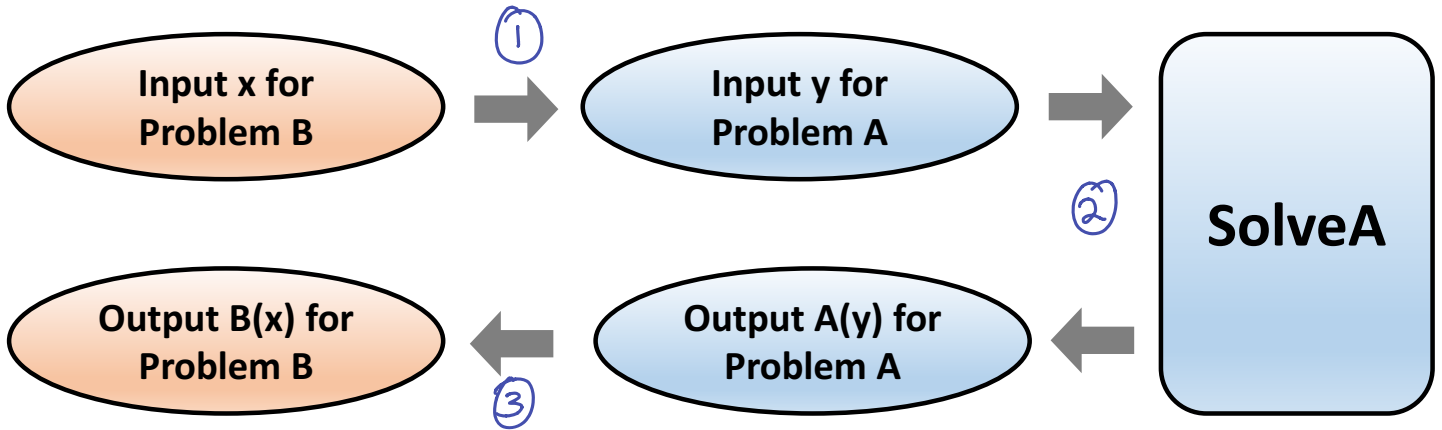


When is a Reduction Correct?



For every x , if the output of Solve A is a valid output for y , then $B(x)$ is a valid output for B.

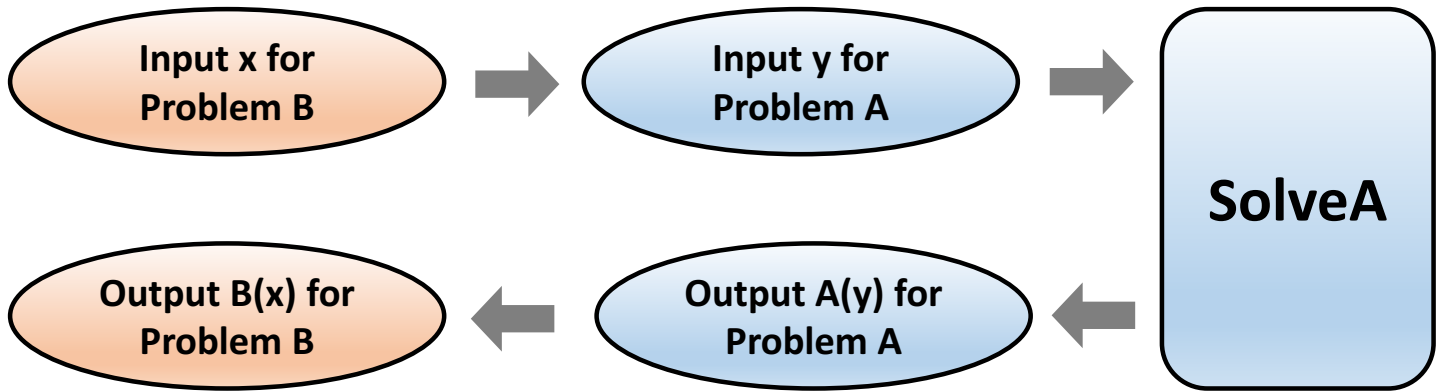
What is the Running Time?



Running Time : ① + ② + ③

- How long does it take to compute y given x ?
- How long does SolveA take to solve y ?
- How long does it take to compute $B(x)$ given $A(y)$?

Retconned Example: Minimum Cut



$B = \text{MIN S-T CUT}$

$$x = \{ G=(V,E), \{c(e)\}, s,t \}$$

$B(x)$: ① compute G_{f^*}

② find $A = \{ v \text{ reachable from } s \text{ in } G_{f^*} \}$

③ output A

$A = \text{MAX S-T FLOW}$

$$y = \{ G=(V,E), \{c(e)\}, s,t \}$$

$A(y) = \text{a max flow } f^*$

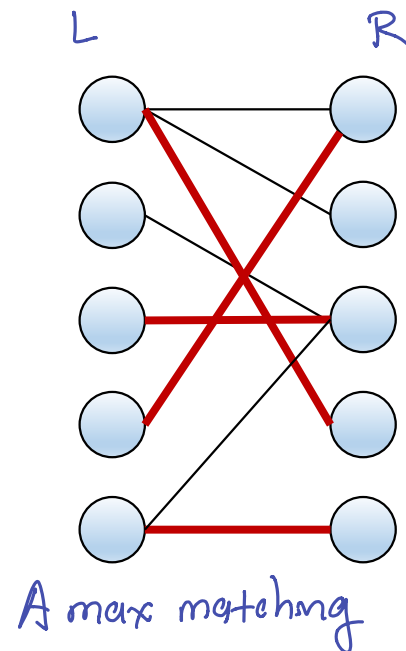
Bipartite Matching

undirected, unweighted

- **Input:** bipartite graph $G = (V, E)$ with $V = L \cup R$
- **Output:** a maximum cardinality matching
 - A matching M is a subset of E such that every node v is an endpoint of at most one edge in M
 - Cardinality = $|M|$

Models any problem where one type of object is assigned to another type:

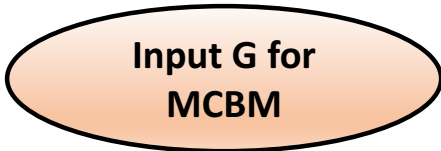
- employees to employers
- jobs to processors
- advertisements to websites



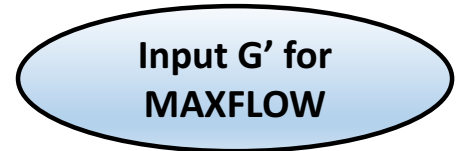
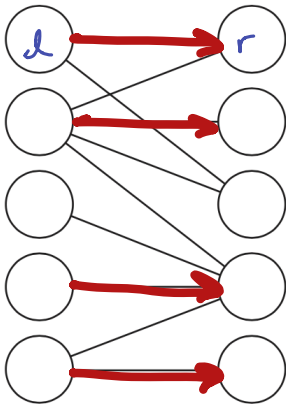
Bipartite Matching

- Theorem: can solve **maximum bipartite matching** using an algorithm that solves **integer max flow**

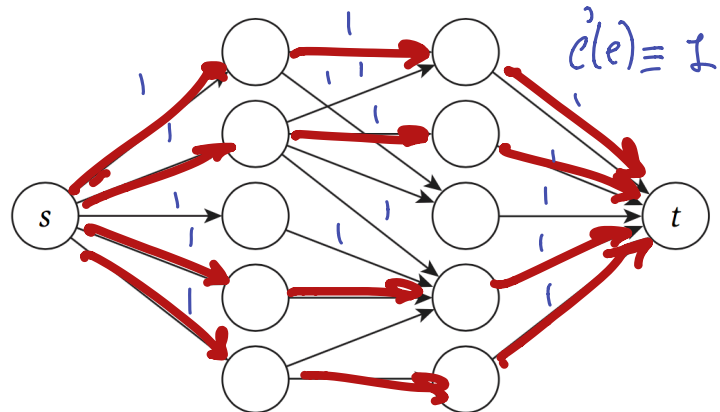
Step 1: Transform the Input



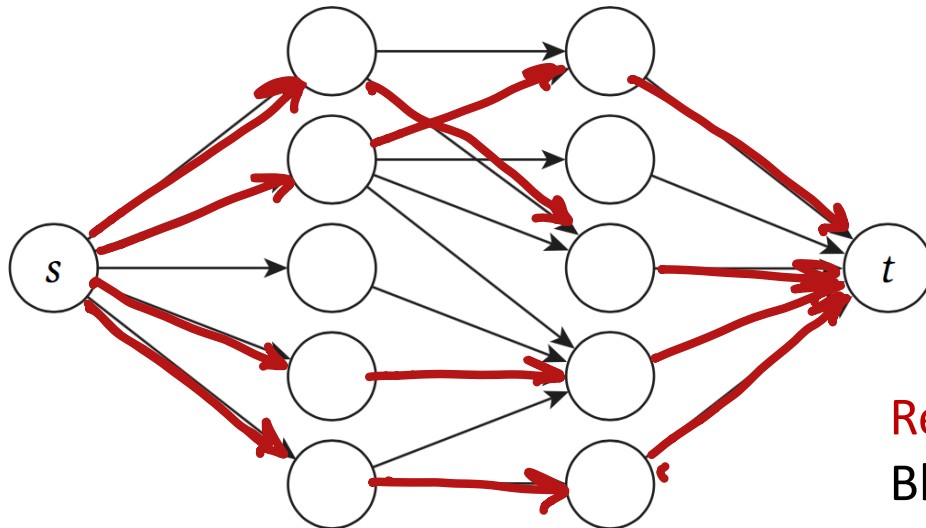
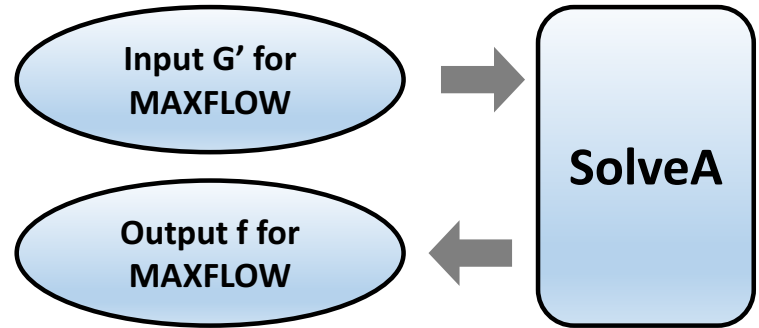
$$G = (V, E)$$



$$G' \quad V' = V + \{s, t\}$$
$$E' = \text{for every } (l, r) \in E$$
$$\text{add } l \rightarrow r$$
$$\text{add } s \rightarrow l, r \rightarrow t$$



Step 2: Receive the Output



Red arrow means $f(e)=1$
Black means $f(e) = 0$

all $c(e)=1$

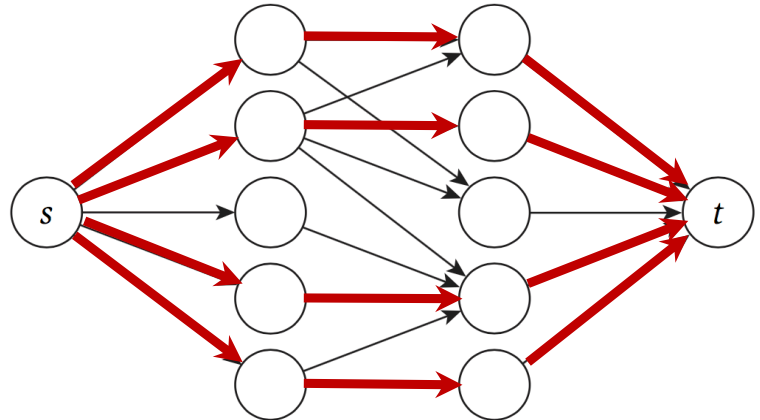
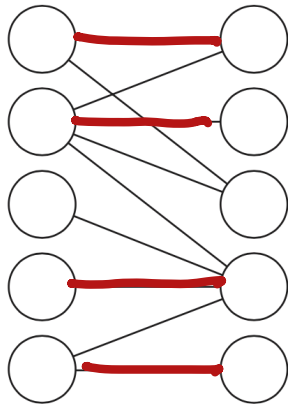
Step 3: Transform the Output

Output M for MCBM



Output f for MAXFLOW

$\forall e = (l \rightarrow r), \text{ if } f(e) = 1, \text{ add } (l, r) \text{ to } M$
Output M.



Reduction Recap

- **Step 1: Transform the Input**

- Given $G = (L,R,E)$, produce $G' = (V,E,\{c(e)\},s,t)$ by...
 - ... orient edges e from L to R
 - ... add a node s with edges from s to every node in L
 - ... add a node t with edges from every node in R to t
 - ... set all capacities to 1

- **Step 2: Receive the Output**

- Find an integer maximum s - t flow in G'

- **Step 3: Transform the Output**

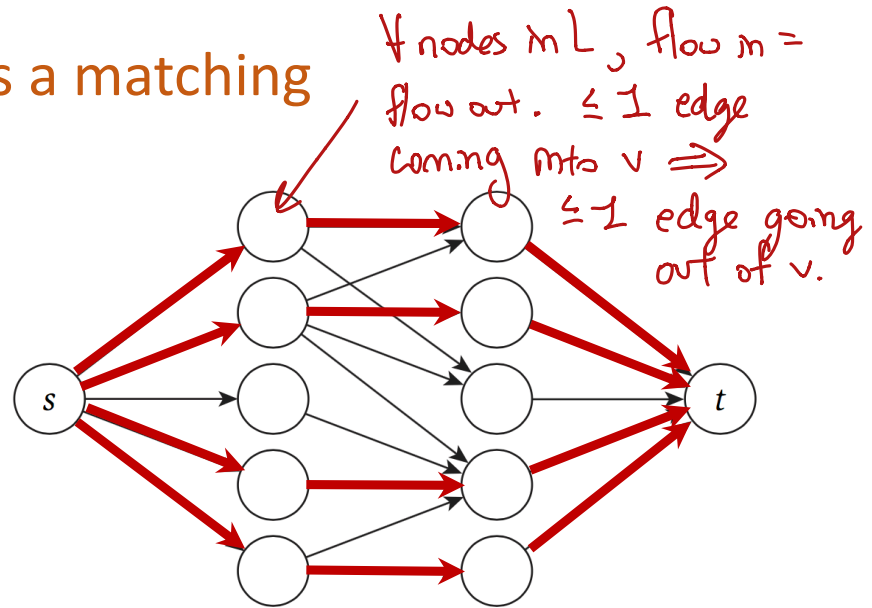
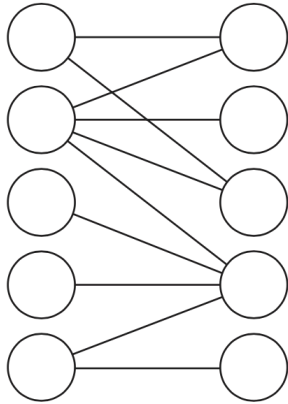
- Given an integer s - t flow $f(e)$...
 - Let M be the set of edges e going from L to R that have $f(e)=1$

Correctness

- Need to show:
 - (1) This algorithm returns a matching
 - (2) This matching is a maximum cardinality matching

Correctness

- This algorithm returns a matching



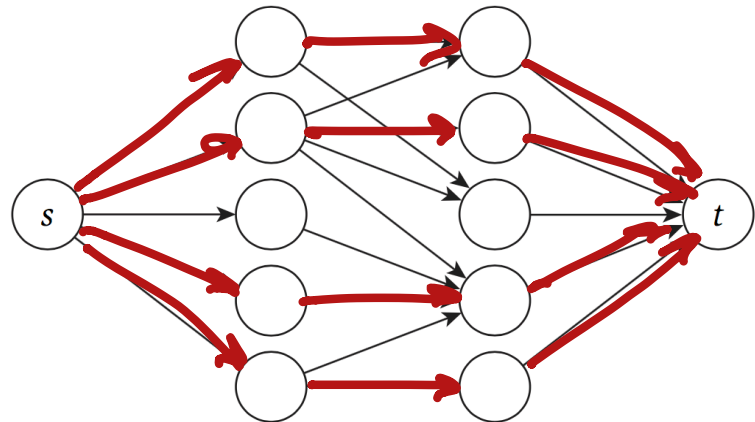
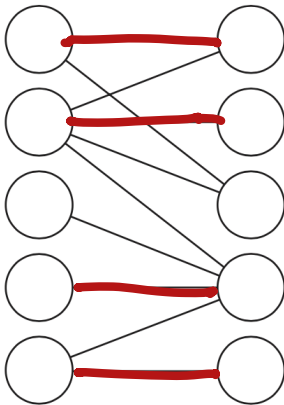
Clm: If M is the matching from our reduction, then no vertex touches two edges.

Correctness

- Claim: G has a matching of cardinality at least k if and only if G' has an s - t flow of value at least k

matching \Rightarrow flow

MAXFLOW \geq MAXMATCHING



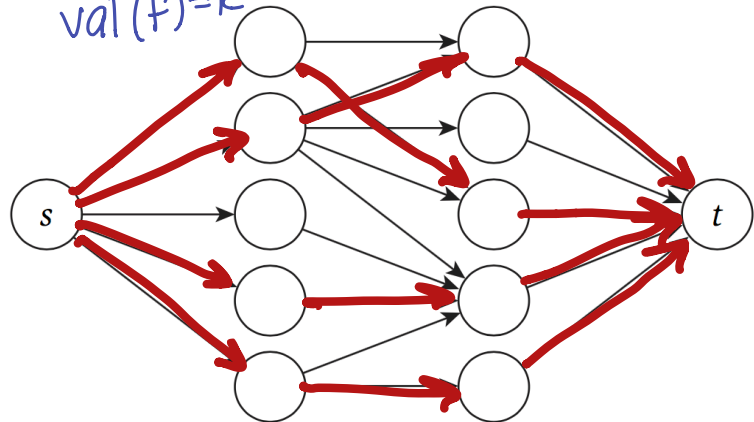
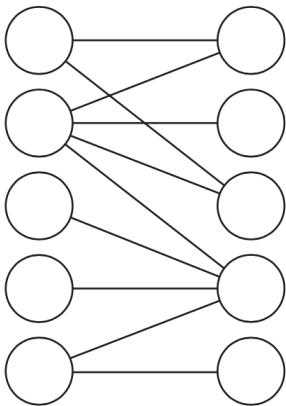
Correctness

- Claim: G has a matching of cardinality at least k if and only if G' has an s - t flow of value at least k

flow \Rightarrow matching

MAXMATCH \geq MAXFLOW

- there are k ^{flow carrying edges} edges leaving s , each carrying one unit of flow
 - therefore there are k $L \rightarrow R$ edges v w/ $f(e)=1$
 - therefore M has size k
- $val(f)=k$



Running Time

$$\text{Total Time} = O(mn)$$

• Need to analyze the time for:

- (1) Producing G' given G $O(m+n)$
- (2) Finding a maximum flow in G' $O(mn)$
- (3) Producing M given G' $O(m)$

① $O(n)$ to create nodes of G' , $O(m+n)$ to create edges of G' ,
 $O(m+n)$ to create capacities, $O(1)$ to designate source/sink

② G' has n' nodes, m' edges $n' = n+2$ $m' = m+n$

$$\begin{aligned} \text{Time is } O(m'n') &= O((m+n)(n+2)) = O(mn + n^2 + m + n) \\ &= O(mn + n^2) \end{aligned}$$

③ $O(m)$ time $= O(mn)$

Summary

Solving maximum ^{integer}s-t flow in a graph with $n+2$ nodes and $m+n$ edges and $c(e) = 1$ in time T



Solving maximum bipartite matching in a graph with n nodes and m edges in time $T + O(m+n)$

- Can solve maximum bipartite matching in time $O(nm)$ using Ford-Fulkerson
 - Improvement for maximum flow gives improvement for maximum bipartite matching!

State-of-the-art is $O(m^{10/7})$?

Midterm II Grades

Mean $\approx 71/100$

