

# 18.453 Lecture 2

Plan

- Bipartite matchings
- König's theorem  
(vertex covers)
- Augmenting paths  
algorithm
- Hall's theorem

5 min

break →

# Bipartite matching

Recall from Tues: Graph  $G = (V, E)$   
↑ vertices ↑ edges.

## More terms:

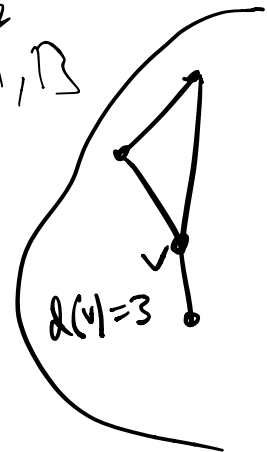
If  $e = (a, b) \in E$ , say  $e$  incident to  $a, b$ .  
or  $a, b$  endpoints of  $e$ .

degree  $d(v)$   
is # of edges  
incident  
to  $v$ .

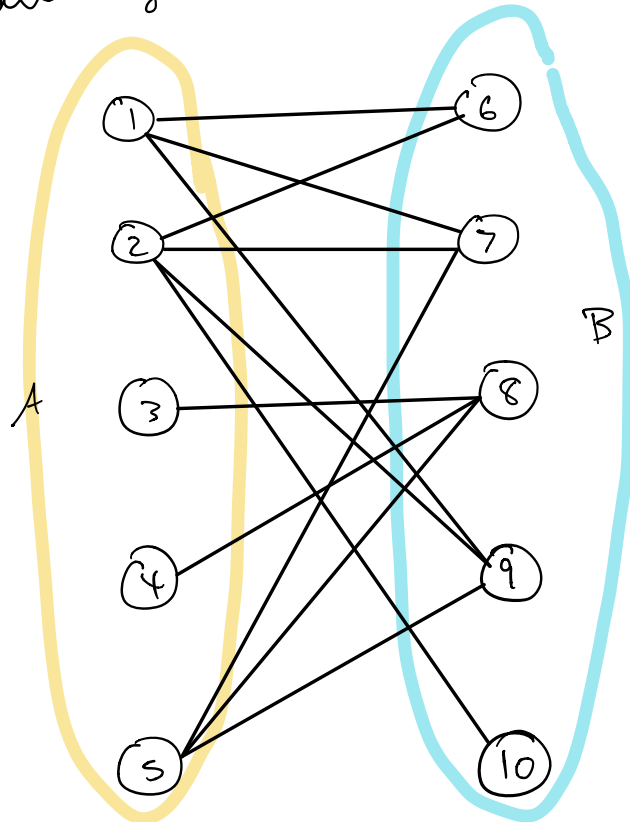
called  
"bipartition"

## Def: Bipartite

$G$  bipartite if  $V$  has partition  $A, B$   
s.t. all edges between  $A$  &  $B$ .



Ex:



Fact:

$G$  bipartite  
 $\Leftrightarrow$  no odd  
cycles.

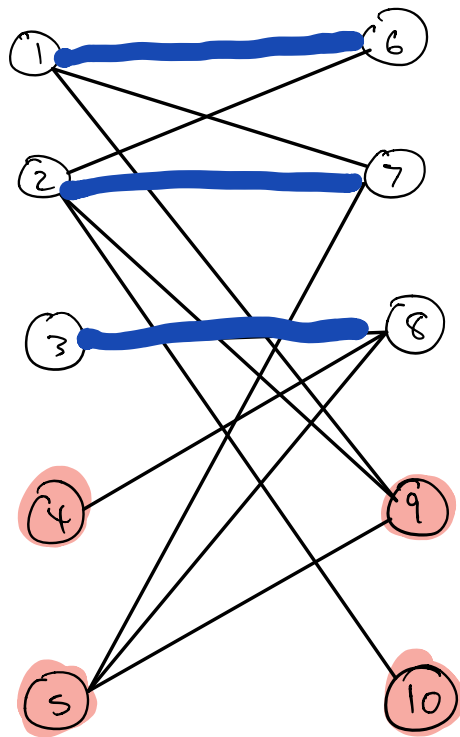
## Def: Matching

Recall matching: collection  $M \subseteq E$  of disjoint edges.

Say  $v$  exposed if no edge in  $M$  incident to  $v$ .

$M$  perfect if no exposed vertices.

Ex.



$M$  in blue

Exposed red

Matchings  
useful!

## Problem 1: Cardinality perfect matching

find matching  $M$  of maximum size.

## Problem 2: Minimum weight perfect

Matching Given costs  $c_{ij}$  for all edges  $(i, j) \in E$ , find a perfect matching of minimum cost, where

$$\text{cost} = c(M) := \sum_{(i,j) \in M} c_{ij}.$$

Today we look at Problem 1.

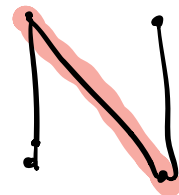
## König's theorem

Before building algorithms, how's one certify that a matching is optimal (largest possible)?

Use obstruction to larger matching.

Duality again!

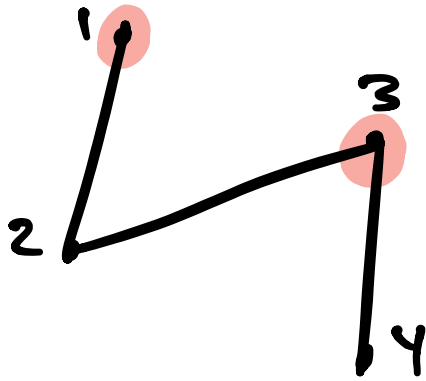
Def: Vertex Cover:



Set  $C$  of vertices is

a vertex cover for  $G$  if every edge  $e \in E$  is incident to some  $c \in C$ .

Ex.



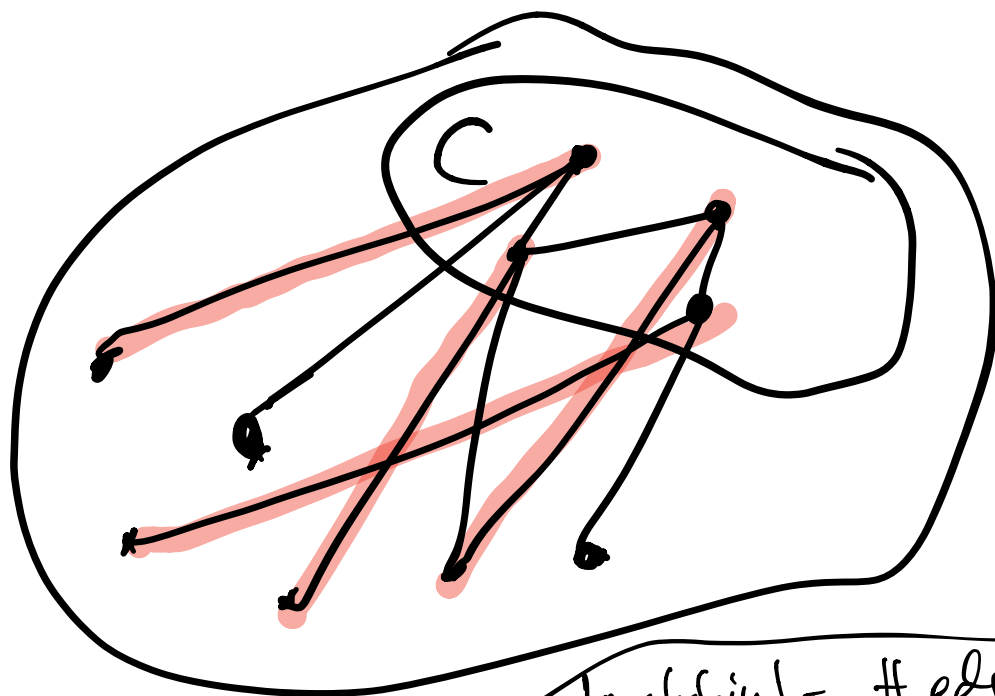
1, 3 form vertex cover

1, 4 do not.

Claim "weak duality"

$$|\text{any matching } M| \leq |\text{any vertex cover } C|$$

why?  $C$  contains at least one endpoint of every edge in  $M$ ; but edges in  $M$  disjoint.



$$|matching| = \# \text{ edges}$$

M

vertex covers are only  
 obstructions for bipartite  
 matching! **strong duality.**

Theorem (König 1931).

For any bipartite graph,

$$\max | \text{matching} | = \min | \text{vertex cover} |.$$

"min-max"

we'll prove this algorithmically.

## Augmenting paths Algorithm

outputs matching  $M$ , cover  $C$  with

$$|M| = |C|;$$

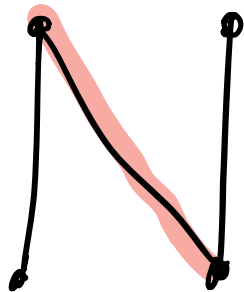
by weak duality,  $|M| \leq |C|$

they must be max/min, respectively.

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Note: greedy algorithm

unit work.



Def: Alternating path w.r.t.  $M$

A path in  $G$  that alternates b/w edges in  $M$  and  $E - M$ .

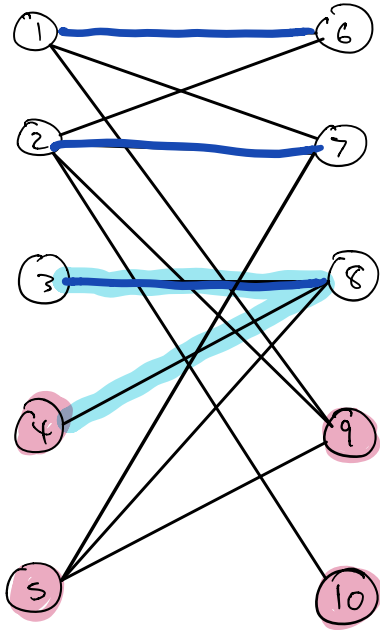
Def: Augmenting path w.r.t.  $M$

An alternating path whose first & last vertices are exposed.

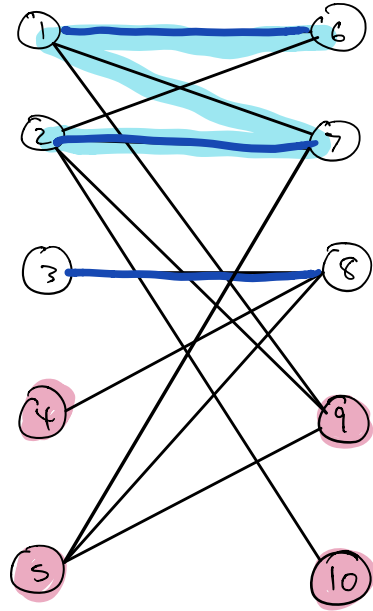


M

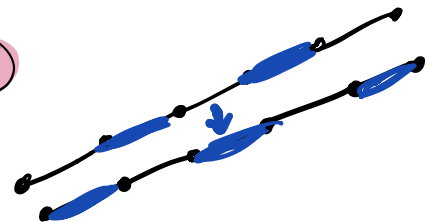
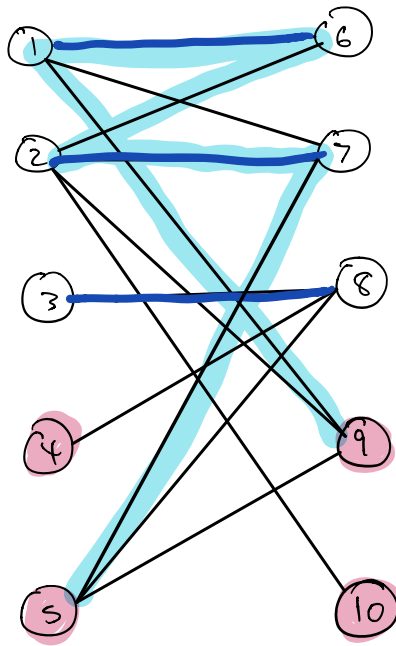
alternating



alternating



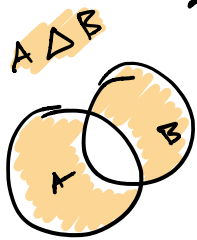
augmenting



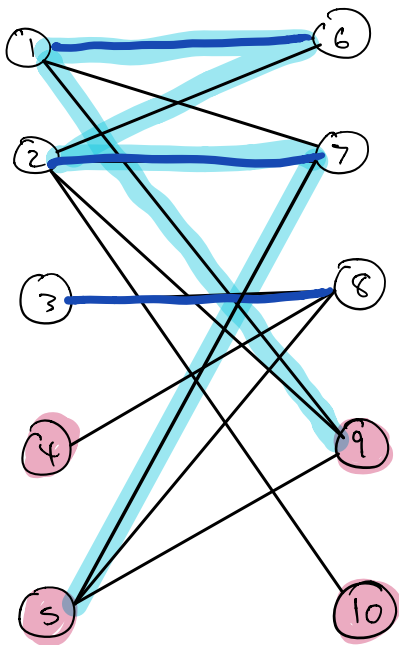
Interesting properties let  $P$  aug. path.

1. If  $P$  has  $k$  edges in  $M$ , has  $k+1$  edges not in  $M$ .

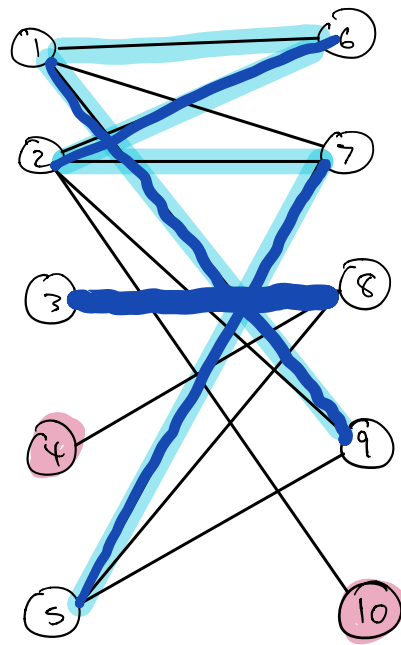
2.  $P$ 's endpoints are on opposite sides  
(parity)



≡. "Switch" edges in  $P$ : replace  $M$  by symmetric difference  $M' = M \Delta P$  to obtain matching  $M'$  with one more edge.



3



4

Equiv: replace edges in  $P \cap M$  by edges in  $P \setminus M$ .

Say we have augmented  $M$  along  $P$ .

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Thm: Matching  $M$  maximum  
 $\Leftrightarrow$  there are no augmenting  
paths w.r.t.  $M$ .

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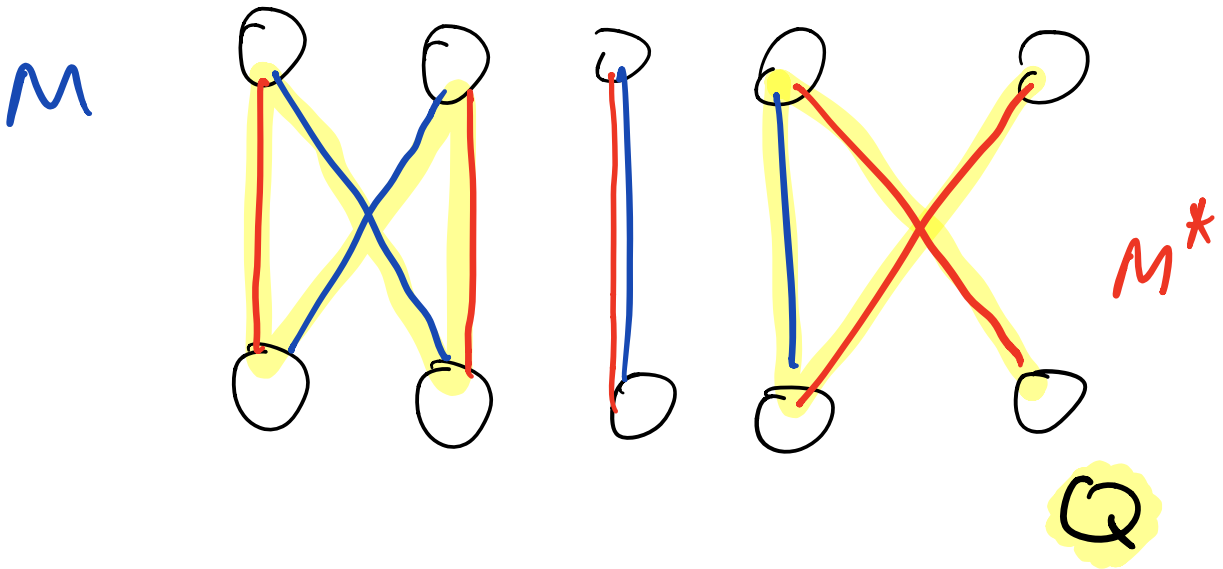
Proof: By contradiction.

$\Rightarrow$  we already showed:

(if there is augmenting  
path, then exists bigger  
matching.  $\times$ )

$\Leftarrow$  Assume  $M$  not  
maximum. Then let  $M^*$   
be maximum, so  $|M^*| > |M|$ .

$$\text{Let } Q = M \Delta M^* \\ = (M - M^*) \cup (M^* - M).$$



Then:

①  $Q$  has more edges from  $M^*$  than  $M$

$$|M^*| = |M \cap M^*| + |M^* - M|$$

$$|M| \geq |M \cap M^*| + |M - M^*|$$

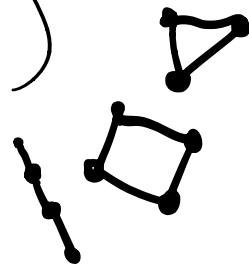
② Every vertex  $v \in G$   
 adjacent to  $\leq 1$  EDGE  
 in  $M \cap Q$ ,  $\leq 1$  in  $M^* \cap Q$ .  
 b/c  $M, M^*$  matchings.

vertex disjoint.

③  $Q$  partitioned into paths,  
 cycles that alternate  
 between  $M, M^*$ .

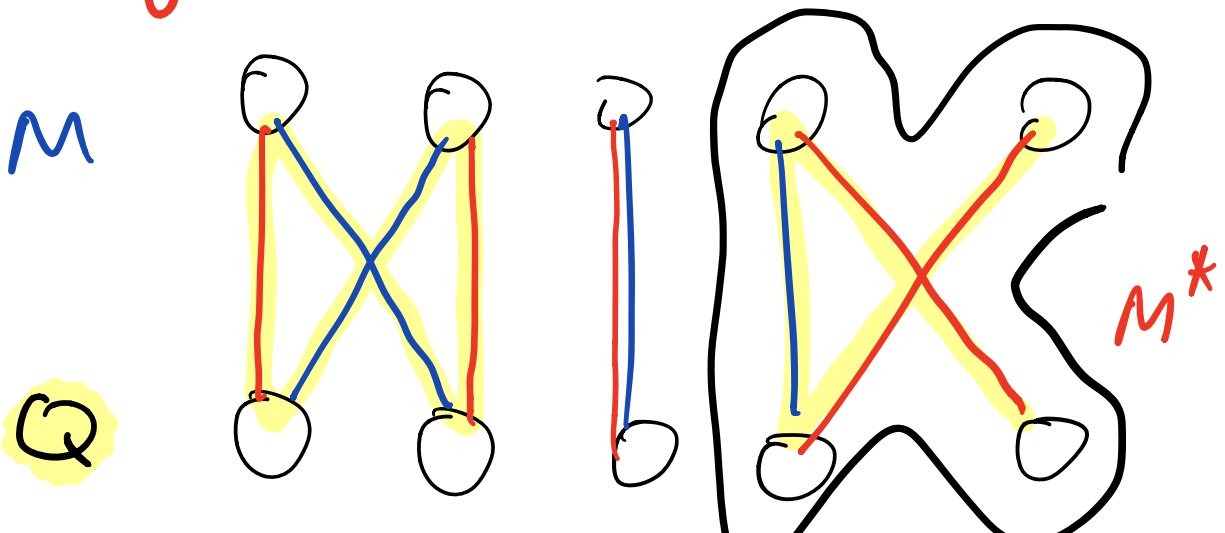
( ②  $\Rightarrow$  every vertex in  $Q$  has degree 1 or 2.  
 $\Rightarrow Q$  decomp. into paths & cycles

②  $\Rightarrow$  paths & cycles  
 alternate.



④ must be path in  $Q$   
 with more edges from  
 $M^*$  than from  $M$ .  
 (b/c cycles are evenly  
 split, and ①).

But this path is  
 augmenting! Contradiction.  $\square$

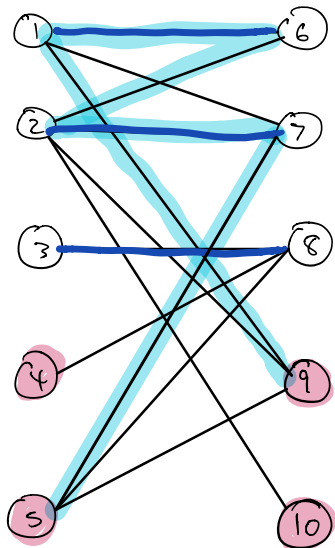


augmenting path for  $M$ .

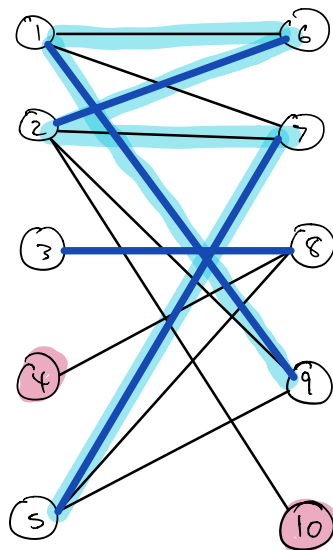
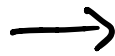
## Alg: Augmenting paths.

- Begin with any matching  $M$ .
- Find augmenting path  $P$  wrt  $M$ , augment  $M$  along  $P$ .
- Stop when no more augmenting paths.

Ex:



3



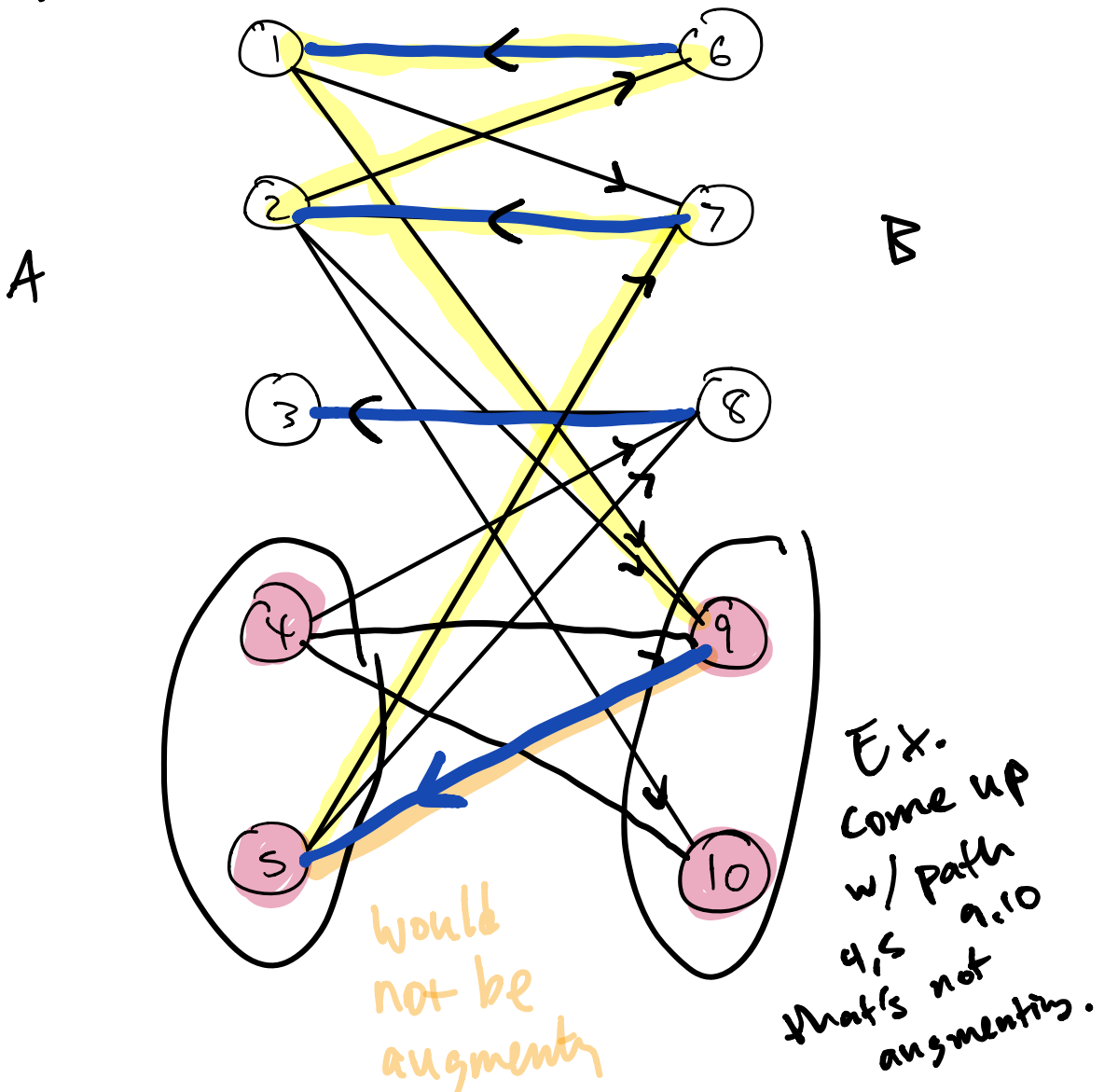
4

→ Done.

Terminates after  $\leq |M| \leq \frac{|V|}{2}$  augmentations.

## BUT HOW TO FIND THE PATHS?

Reduces to finding path in a directed graph.



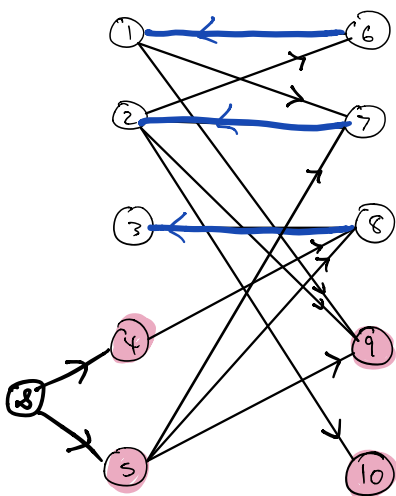


Direct  $e A \rightarrow B$  if  $e \in M$ ,  $B \rightarrow A$  else.

Augmenting path is precisely a directed path from exposed vertex in A to exposed vertex in B.

Suggests to use depth-first search.  
(DFS)

## Subroutine for Aug paths:

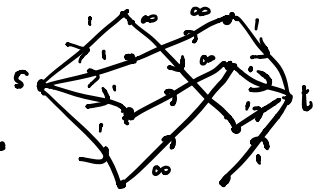


\* direct graph as above.

\* attach vertex  $s$  to exposed vertices in A

\* do DFS until hit exposed vertex in B.

\* Trace back path.



Takes  $O(|E|)$  time to find  
augmenting path in  $G$ .  
(repeat  $\frac{|V|}{2}$  times)

$\rightarrow c$  <sup>sf.</sup>  
 $\uparrow$  time  $\leq c|V||E|$ .

Thus, complexity is  $O(|V||E|)$ .

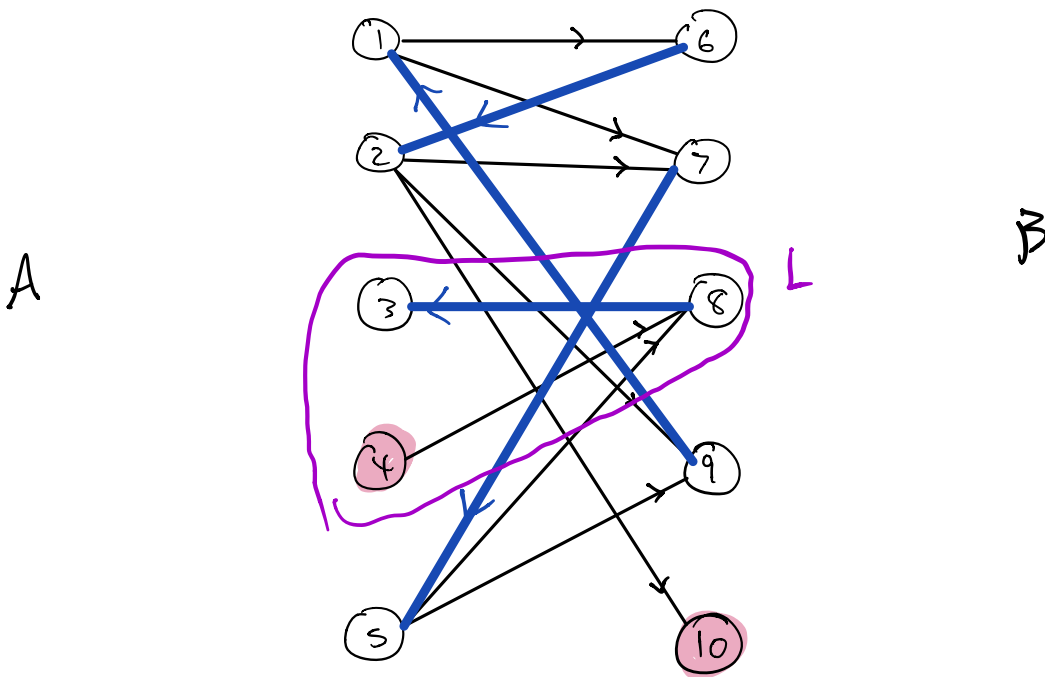
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possible to get  $O(\sqrt{|V||E|})$ ; Hopcroft-Karp.

## Vertex Covers

If no augmenting path w.r.t  $M$ ,  
aug. path subroutine outputs  
a vertex cover. How?

Let  $L$  be set of vertices reachable by directed path from exposed vert in  $A$ .

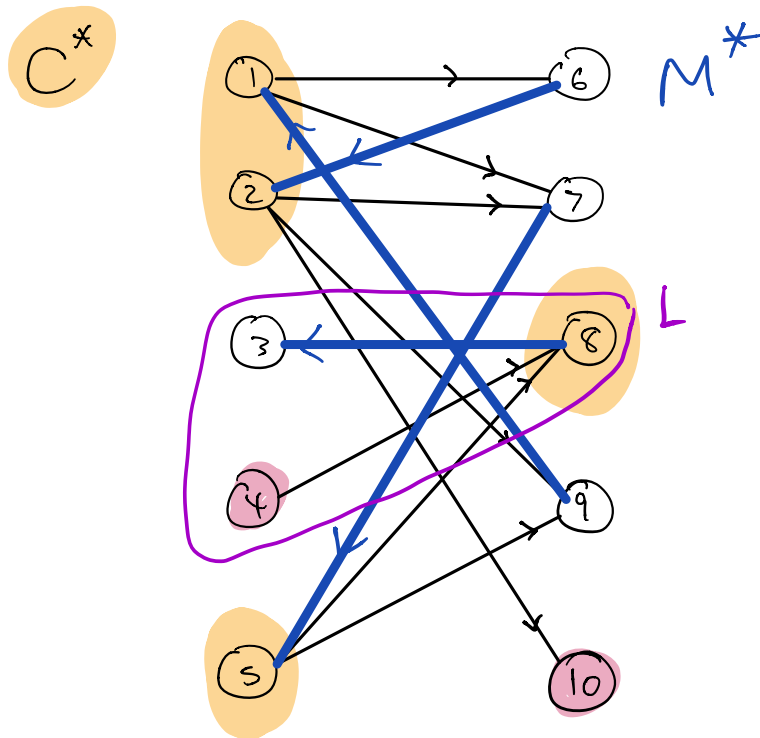


Claim: When the algorithm

$$\text{terminates, } C^* = (A - L) \cup (B \cap L)$$

's a vertex cover &  $|C^*| = |M^*| + 1$

↑  
matching  
returned by alg.

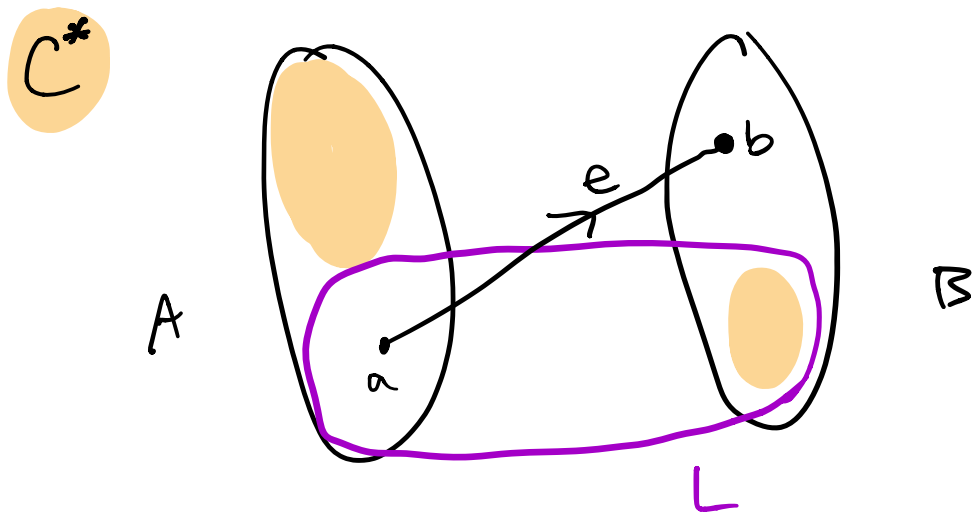


Corollary: König's Theorem

$$\max |\text{matching}| = \min |\text{vertex cover}|$$

Proof of Claim: First show  $C^*$  is cover. Assume not.

- Then exists  $e = (a, b) \in E$  with  $a \in A \setminus L$ ,  $b \in (B - L)$



- ①  $e \notin M$ . 1) if  $e \in M$  then  $a$  is not exposed.
- 2) if  $e \in M$ , then  $e$  is only  $B \rightarrow A$  edge to  $a$   
 $\Rightarrow a$  not reachable;  
 contradicts  $a \in L$ .

Thus,  $b$  reachable;  
 contradicts  $b \notin L$ .

$C^*$  is cover.



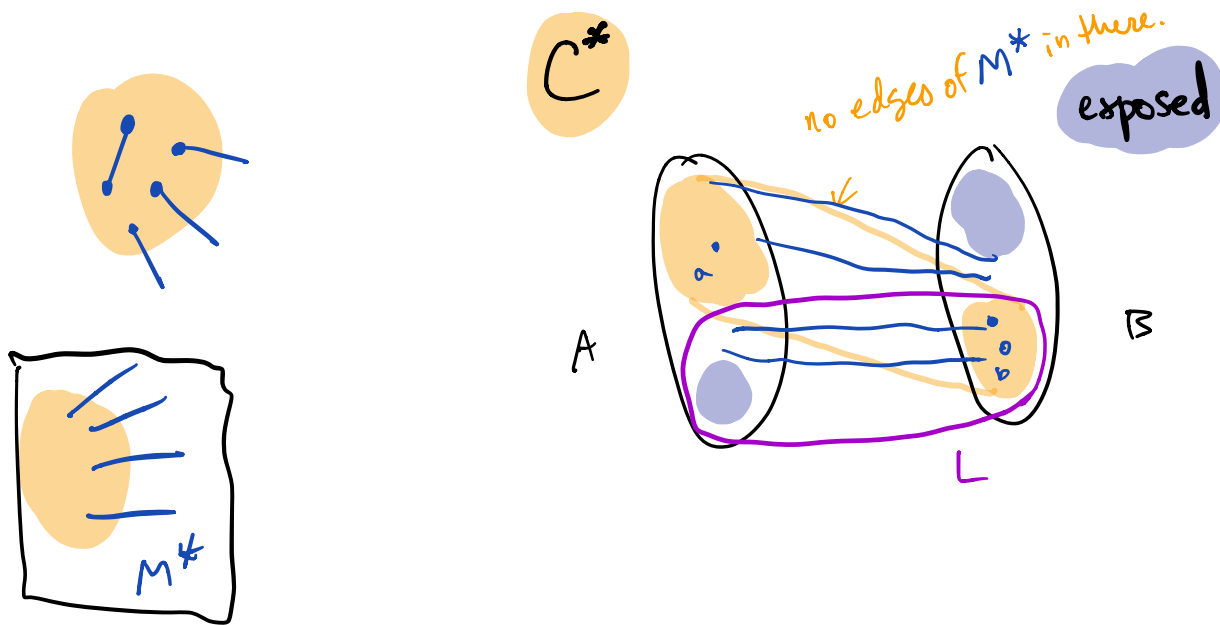
Now to prove  $|M^*| = |C^*|$ .

\* Enough to show  $|C^*| \leq |M^*|$ .  
#verts                      #edges

Weak duality:  $|M^*| \leq |C^*|$ .

To prove, \* observe:

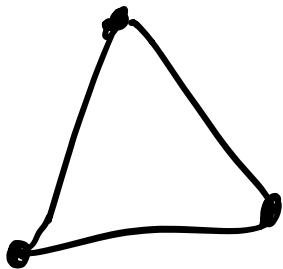
- No vertex in  $A-L$  exposed  
(or else would be reachable, i.e. in  $L$ ).
- No vertex in  $B \cap L$  exposed  
(else algorithm wouldn't have terminated)
- No edge of  $M$  b/w  $a \in A-L, b \in B \cap L$



Conclude: every vertex in  $C^*$  matched,  
and no edge of  $M$  fully within  $C^*$ .  
hence  $|C^*| \leq |M^*|$ .  $\square$

What about general graphs?  
Still have weak duality,  
but not strong duality:

max  
matching



min vertex  
cover

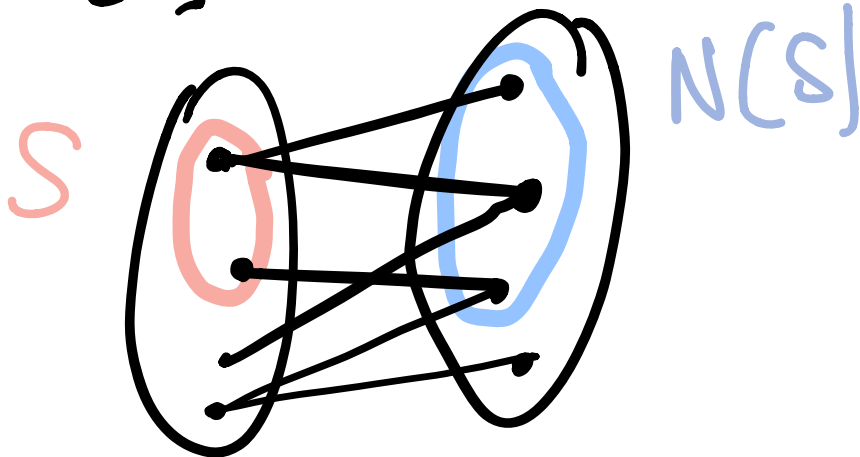
Need Tutte's theorem from  
lec 1; we'll discuss later.



# Hall's theorem

Hall's theorem is another "duality" characterization of the existence of a perfect matching.

**Def:** neighborhood  $N(S)$  of a set  $S$  is  $\{b \text{ st. } \exists a \in S \text{ w/ } (a, b) \in E\}$



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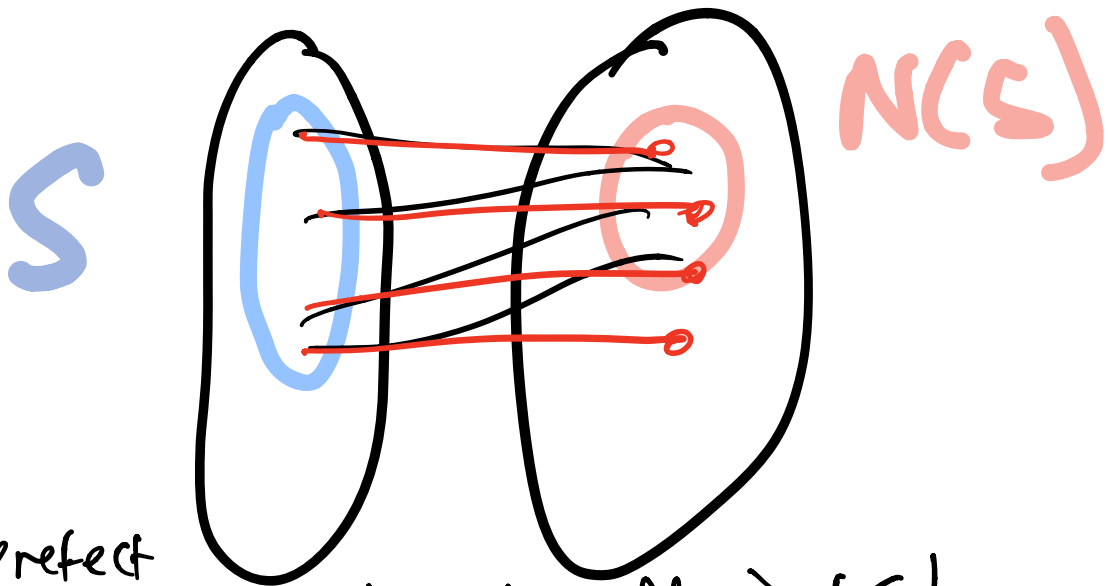
THM (Hall) Bipartite  $G$   
with bipartition  $A, B$  has  
perfect matching

$\Leftrightarrow$

$$\forall S \subseteq A, |N(S)| \geq |S|.$$

---

Clearly,  $|N(S)| \geq |S|$  necessary;



(if perfect matching, then  $|N(S)| \geq |S|$ .)

i.e.  $|N(S)| < |S|$  obstructs p.m.'s;  
weak duality. Hall says  
strong duality here also.

Hall's follows from König's  
(relate  $S, N(S)$  to vertex cover) theorem.

See exercises in source.

Ex 1-9 is to prove Hall's theorem  
from König's  
theorem.