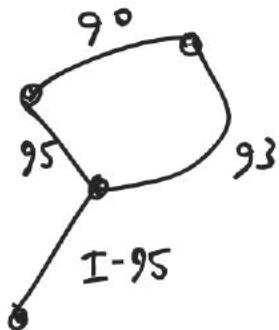


# Graphs

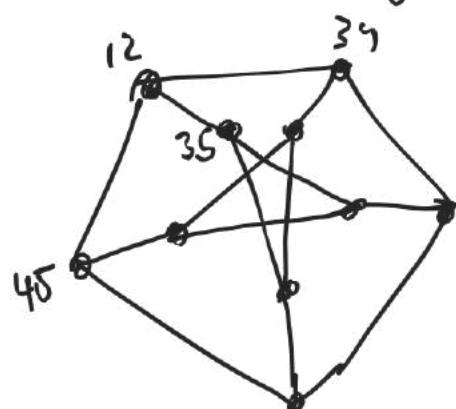
Graphs express relationships between things



family  
tree



routes  
 $PVD \leftrightarrow BOS$



2-element  
subsets of  $\{1, \dots, 5\}$

Connected by disjointness

Petersen graph

Formal definition A graph  $G$  is pair

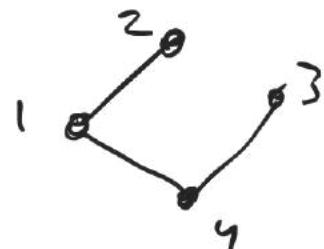
$(V, E)$  where  $V$  is a set and

$E \subset \{\text{2-element subsets of } V\}$

$(V: \text{vertices})$   
 $(E: \text{edges})$

Ex  $V = \{1, 2, 3, 4\}$   $E = \{\{1, 2\}, \{1, 4\}, \{3, 4\}\}$

often just draw pictures



# Rules

1. Our defn excludes



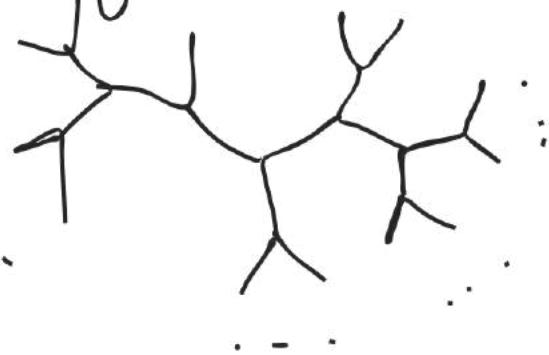
multiple edges



self loops

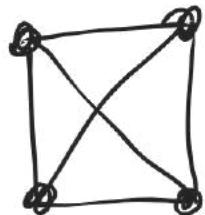
NB:  
different  
from  
West!

2. Only consider  $G$  with  $V$  finite

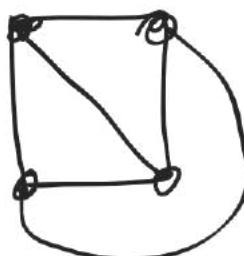


infinite 3-regular  
graph

3. some graphs can be drawn in plane,  
some not.



=



Fact Petersen  
graph not  
planar.

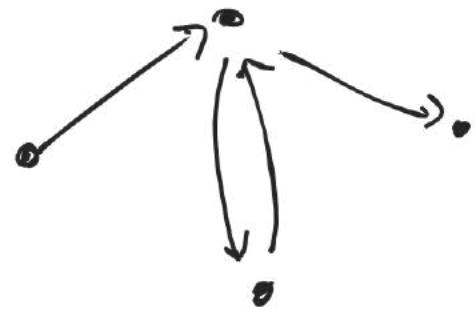
4. A graph can have multiple components

$$G =$$

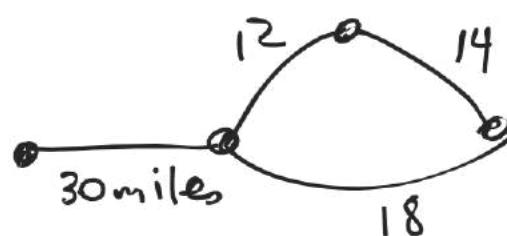


## 5. Variations: (not our main focus)

- directed graphs



- weighted graphs

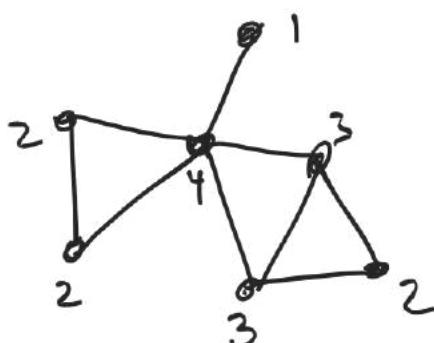


(Next: basic terminology)

### Vertex degrees

For  $v \in V$ ,  $e \in E$  if  $v \in e$  say  $v, e$  are incident. Define  $\deg(v) = \# \text{edges incident to } v$ .

Ex



Q: Does there exist graph with

- 5 vertices each with degree 2
- 5 vertices each w/ degree 3

Lemma For  $G = (V, E)$ ,  $\sum_{v \in V} \deg(v) = 2|E|$ .

Cor In a graph the number of vertices w/ odd degree is even.

$\Rightarrow \nexists$  5 vertex 3-regular graph.

Proof of lemma

Counting each vertex degree counts each edge twice.

More precisely, consider

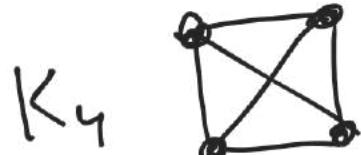
$$\sum_{v \in V} \deg(v) = \sum_{(v, e) \in V \times E} 1 = \sum_{e \in E} 2 = 2|E|.$$

incident pair □

Ex the complete graph  $K_n$

has vertices =  $\{1, \dots, n\}$

edges = all pairs  $\{i, j\}$



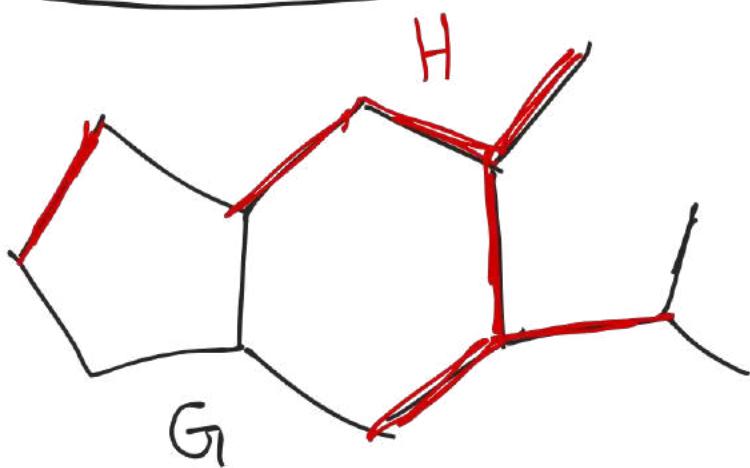
In  $K_n$ ,  $\deg(v) = n-1$  for each  $v$

$|E| = \binom{n}{2} = \# \text{ 2-element subsets of } \{1, \dots, n\}$

$$\text{Lemma} \Rightarrow n(n-1) = 2 \binom{n}{2}.$$

---

### Subgraphs



$H$  is a subgraph of  $G$ .

$$V(H) \subset V(G), E(H) \subset E(G)$$

$K = \square$  is not a  
subgraph of  $G$ .

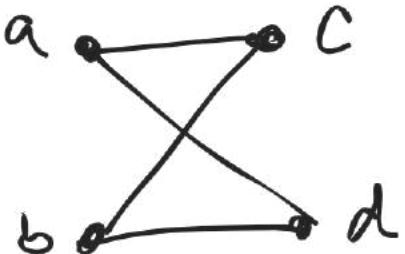
### Isomorphism

graphs  $G_1, G_2$  are isomorphic if

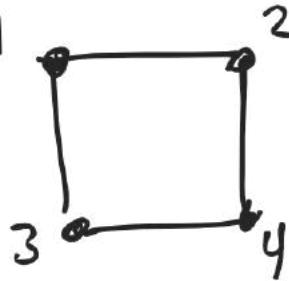
$\exists$  bijection  $V(G_1) \xrightarrow{\varphi} V(G_2)$  so that

$$\{u, v\} \in E(G_1) \iff \{\varphi u, \varphi v\} \in E(G_2)$$

Ex

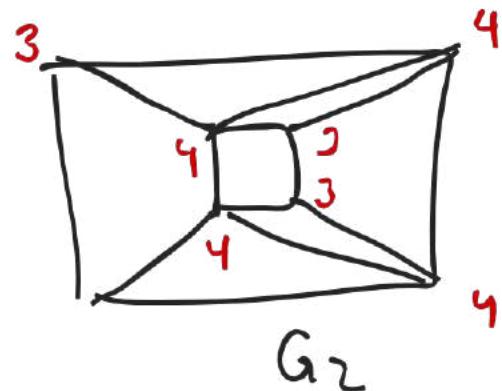
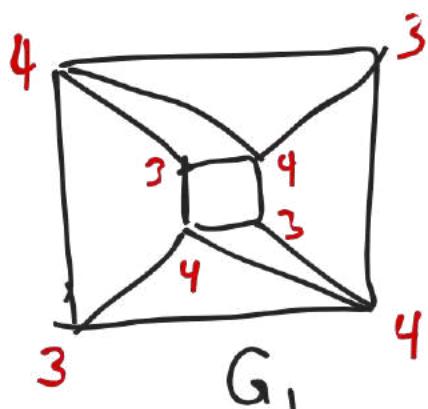


$\cong$



$\varphi: a \mapsto 1, c \mapsto 2, b \mapsto 4, d \mapsto 3$

Ex

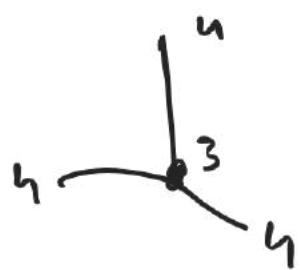


Are  $G_1, G_2$  isomorphic?

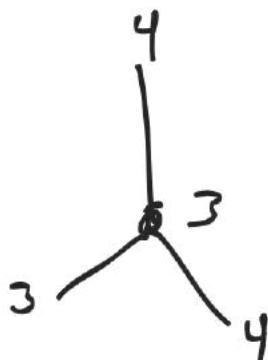
Isomorphism problem hard in general

Look at vertex degrees

in  $G_1$



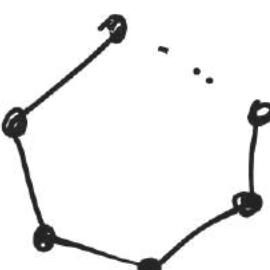
in  $G_2$



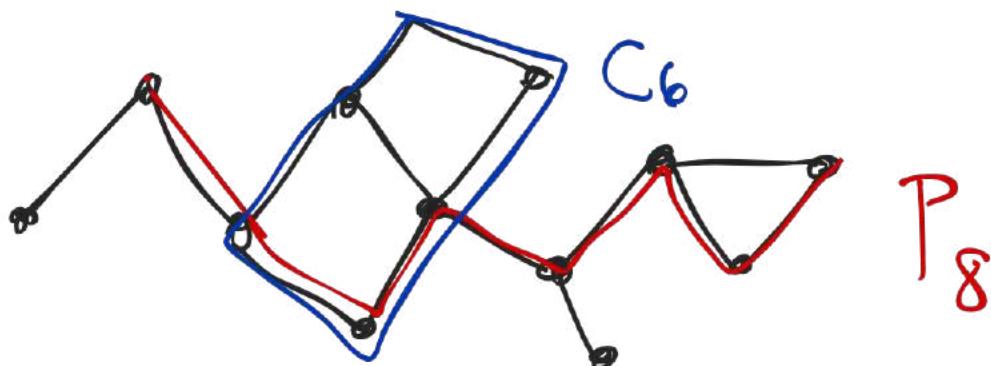
$\Rightarrow G_1 \neq G_2$

# Some special subgraphs

$P_n =$  

$C_n =$  

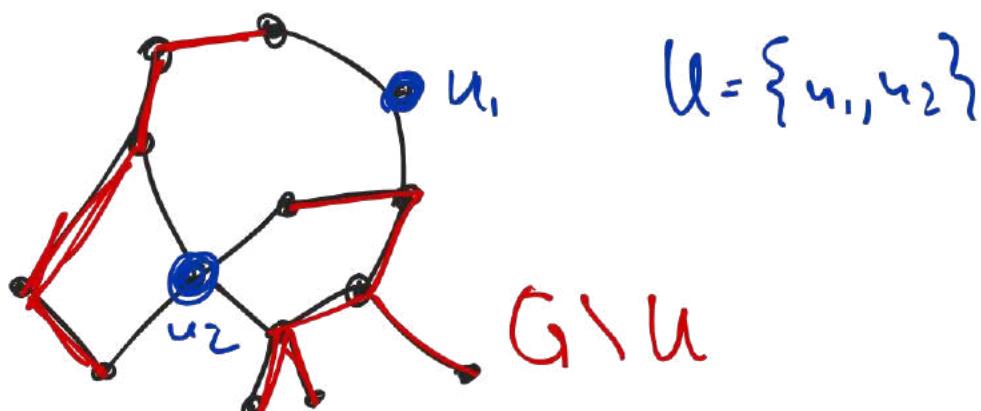
- ① A subgraph isomorphic to  $P_n / C_n$  is called a path / cycle.



- ② Given  $G_i = (V, E)$  and  $U \subset V$

define  $G \setminus U$  graph w/ vertices:  $V \setminus U$   
and edges:  $e \in E$  between vertices in  $V \setminus U$

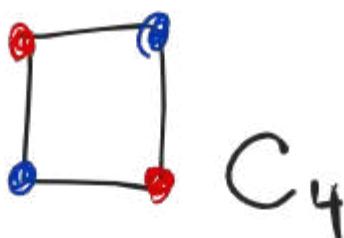
eg



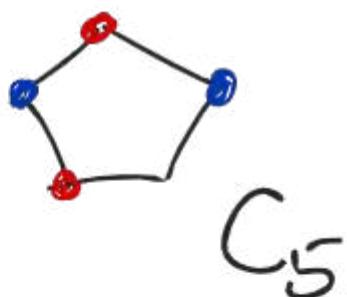
## Bipartite graphs

$G = (V, E)$  is bipartite if its possible to color vertices red/blue so there are no monochromatic edges.

ex



non ex

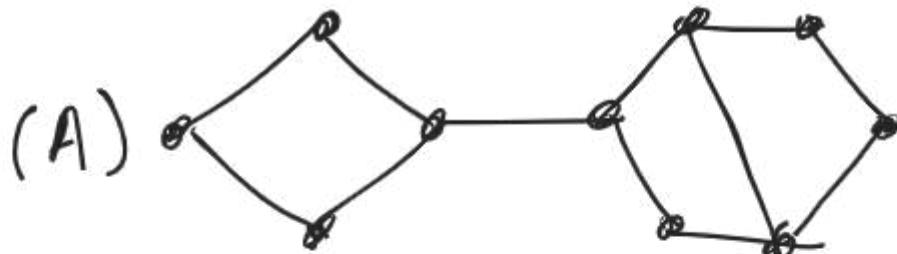


ex

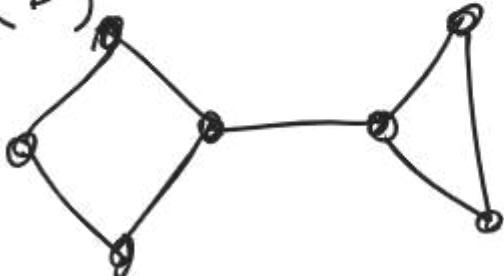


Exercise which of the following are

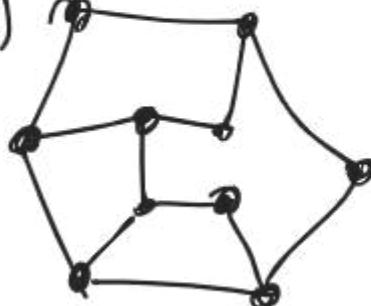
bipartite?



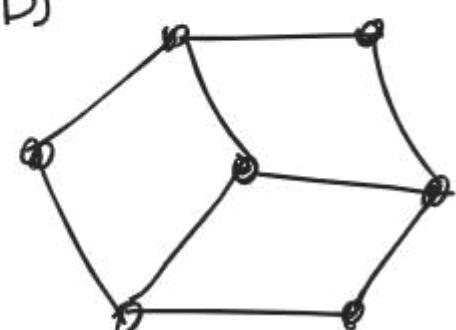
(B)



(C)



(D)



- What went wrong in B, C?
- B, C have cycles of odd length.

$C_{2k+1}$

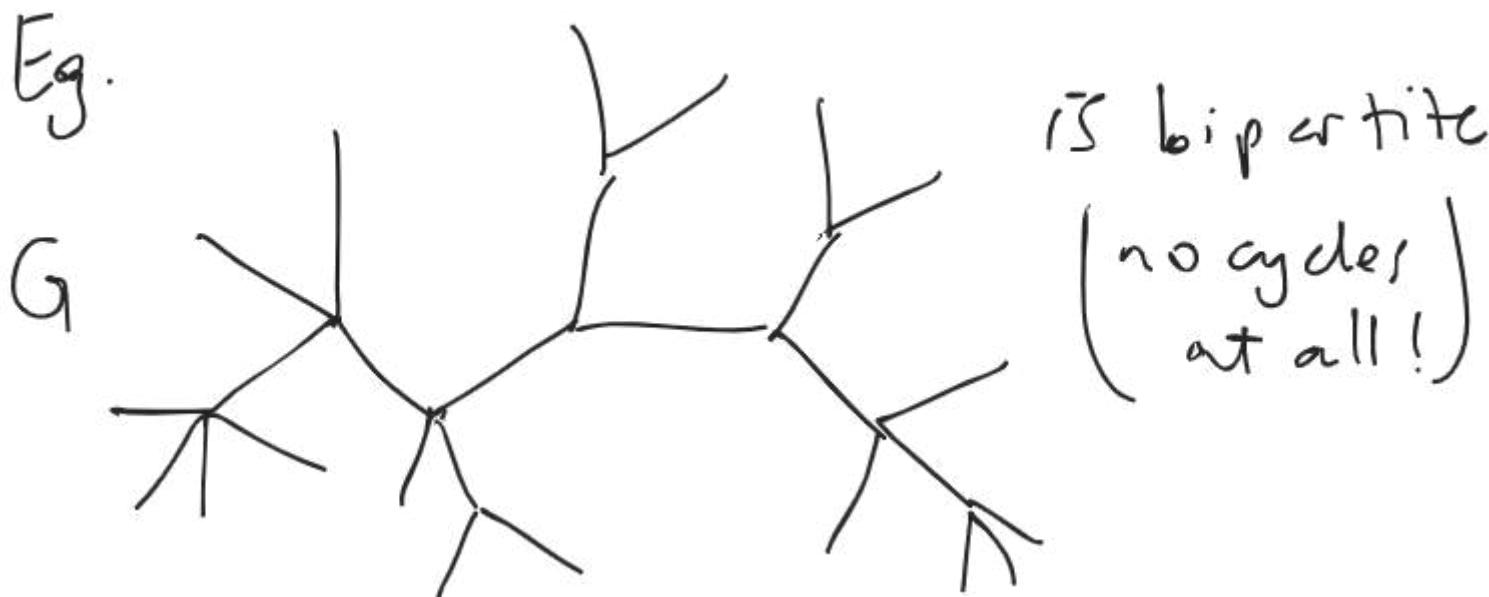
Observation  $C_{2k+1}$  is not bipartite  
and so a graph containing  $C_{2k+1}$   
as a subgraph is also not bipartite.

- What if G has no odd cycle?

Thm G bipartite  $\Leftrightarrow$

G does not contain any odd cycle

Eg.



A walk in  $G = (V, E)$  is sequence  
 $v_1, \dots, v_m$  with  $v_i \in V$  and

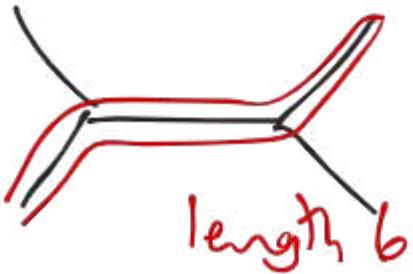
$$\{v_i, v_{i+1}\} \in E \quad i=1, \dots, m-1$$

A closed walk is a walk with  $v_1 = v_m$

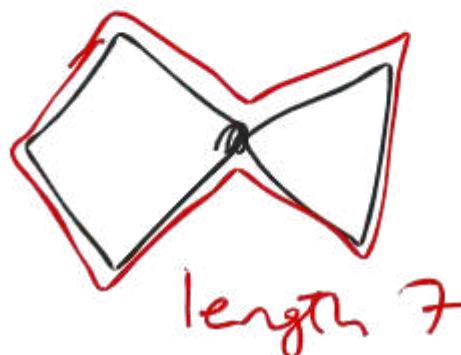
The length of a walk is the # of edges  
 $m-1$

Here edges/vertices may repeat.

eg



length 6



length 7

Lemma A closed walk of odd length contains an odd cycle.

Proof. Let  $w$  be closed walk,  
length  $2l+1$ .

induct on  $l$ .

Base case ( $l=1$ )



$v_1, v_2, v_3$  distinct since  $G$  has no self loops

$\Rightarrow \omega$  is a cycle  $C_3$ .

Induction Step Fix  $\omega$  length  $2lt+1$ .

Assume odd walk of len  $< 2l+1$  has odd cycle.

Case 1 vertices of  $\omega$  don't repeat

$\Rightarrow \omega$  is odd cycle.

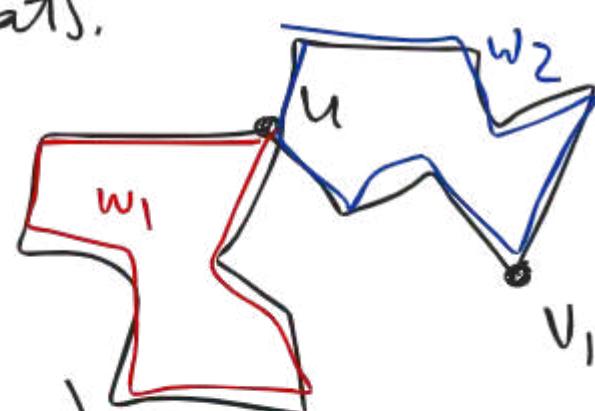


Case 2 some vertex repeats.

Extract closed walks

$w_1, w_2$

$$\text{len}(w_1) + \text{len}(w_2) = \text{len}(\omega)$$



one of  $(\text{len}(w_i))$  odd.  $\Rightarrow$  that

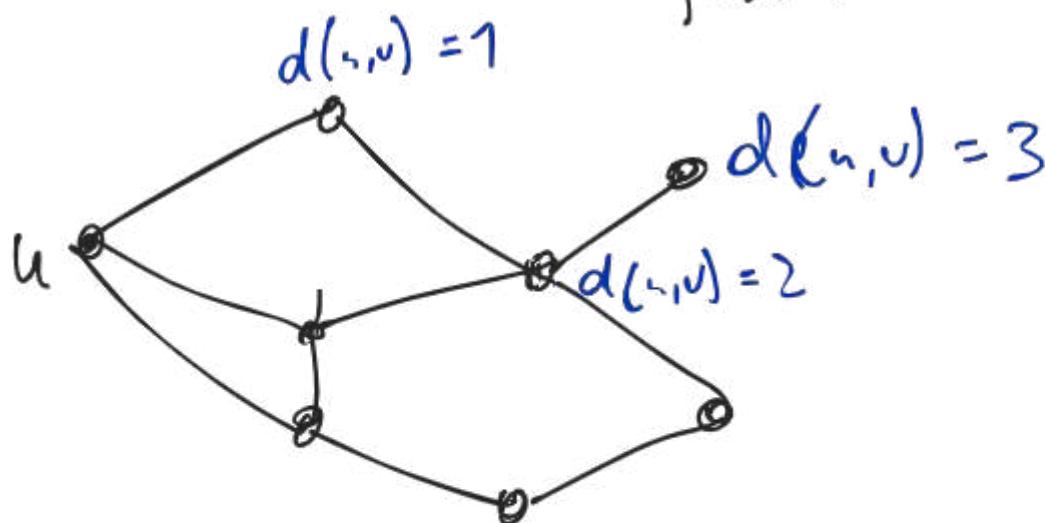
$w_i$  has an odd cycle by induction  $\square$

Proof ( $\Rightarrow$ ) observed above

( $\Leftarrow$ ) We find a coloring:

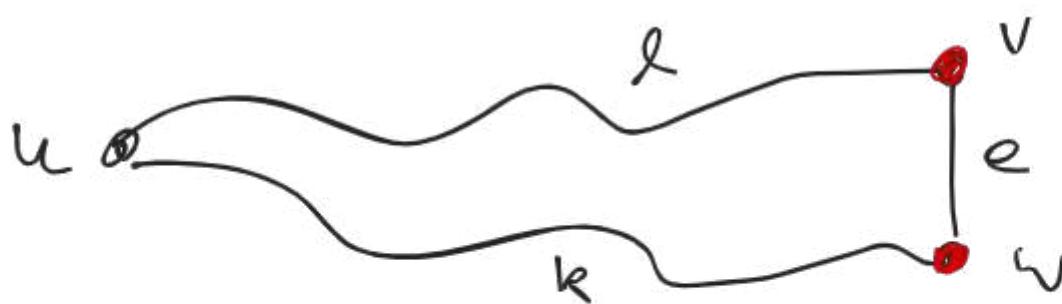
Fix  $u \in V$  and for  $v \in V$  define

$d(u, v)$  = length of shortest path  
from  $u$  to  $v$ .



color  $v$  red/blue if  $d(u,v)$  even/odd.

If  $e \in E$  monochromatic



$v, w$  monochromatic  $\Rightarrow l, k$  both even

$\Rightarrow l+k+1$  odd  $\stackrel{(\text{Lemma})}{\Rightarrow}$  G has odd cycle \*

Then  $\nexists$  monochromatic edge  $\square$

Rank It's possible  $G$  wasn't connected - apply above to each component.

Rank (TONCAS)

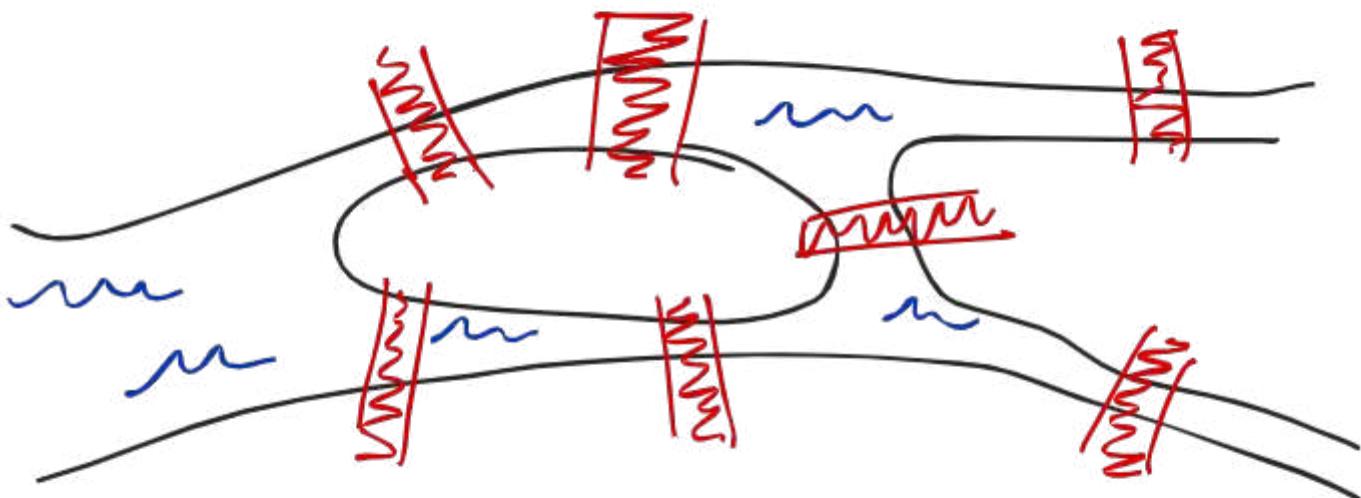
Given property  $P$  of graphs (eg bipartite) may ask if  $G$  has  $P$ .

Often there is an "obvious" necessary condition ( $G \text{ bipartite} \Rightarrow$  no odd cycle) and we'll show this is also sufficient  
( $G$  has no odd cycle  $\Rightarrow$   $G$  bipartite)

TONCAS = "The Obvious Necessary Condition is Also Sufficient"

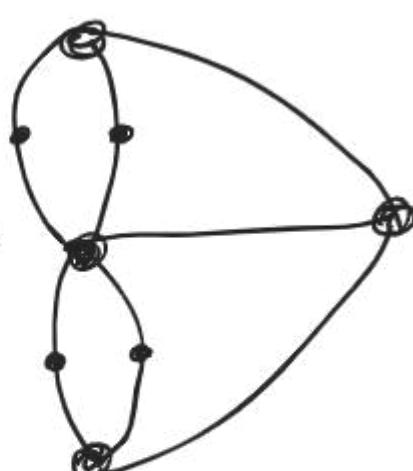
# Eulerian Graphs

Bridges of Königsberg



Q:(Euler) Is it possible to cross every bridge exactly once?

Convert to graph theory:

Does  $G =$   have a closed walk that contains each edge exactly once?

(experiment)

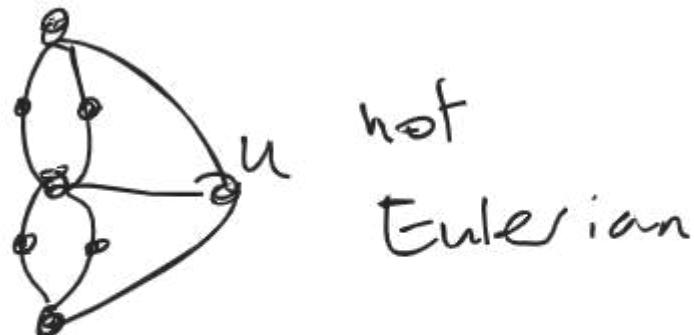
Defn An Euler tour on  $G$

is a closed walk that visits each edge exactly once.

> <  
Assume  $G$  connected (one component)

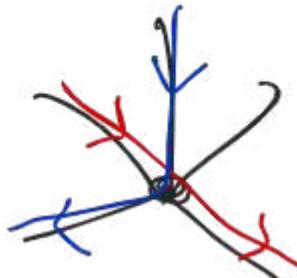
Say  $G$  Eulerian if  $G$  has Euler tour.

Warm-up



b/c  $G$  has vertex  $u$  of odd degree.

In an Euler tour every edge into a  $u$  is followed by edge out  
Edges don't repeat so need even #  
incident to each vertex.



TONC  $G$  Eulerian  $\Rightarrow \deg(v)$  even  $\forall v \in V$ .

Thm TONCAS, If  $G$  connected.

$G$  Eulerian  $\Leftrightarrow \deg(v)$  even  $\forall v \in V$

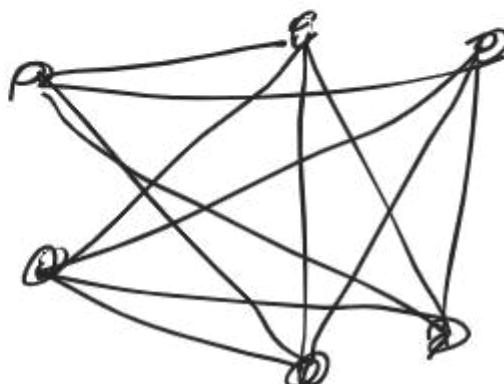
Ex.



not Eulerian remember Euler tours  
are closed walks.

Ex

$$G =$$



Eulerian

b/c  $G$  is  
4-regular

In practice not hard to find

Euler tour : start & keep going.

even vertex degree ensures can't  
get stuck. (illustrate)

Proof Suppose  $G$  has even vertex degrees

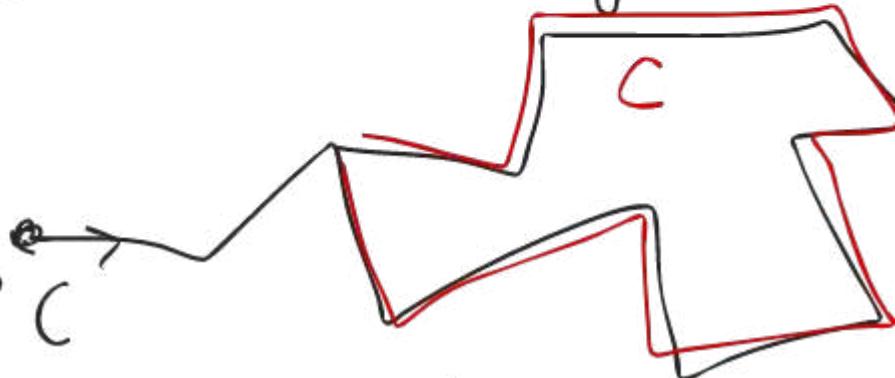
Induction on  $|E|$ .

Base case  $|E|=0 \Rightarrow G = \emptyset$

Then true trivially.

Induction Step Assume that for graphs with  $< |E|$  edges.

Since every vertex has even deg  $G$  contains a cycle



Let  $F = \text{edges of } C$

Consider  $G \setminus F = (V, E \setminus F)$

observe  $G \setminus F$  has even vertex degrees

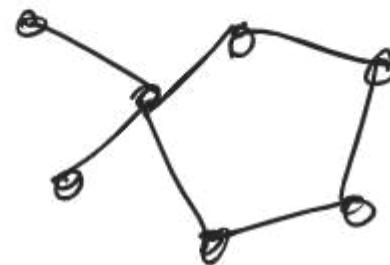
IH  $\Rightarrow G \setminus F$  has Euler tour. Combine with  
to get Euler tour □

## Connected graphs

A graph is connected if any two vertices are joined by a path.



disconnected



connected

Q: Suppose  $G$  connected  
and has  $n$  vertices. What  
is fewest # edges  $G$  can have?  
Is the minimizer unique?

---

(Experiment)

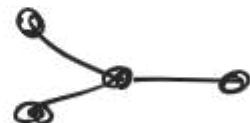
$$n=1$$



$$n=3$$

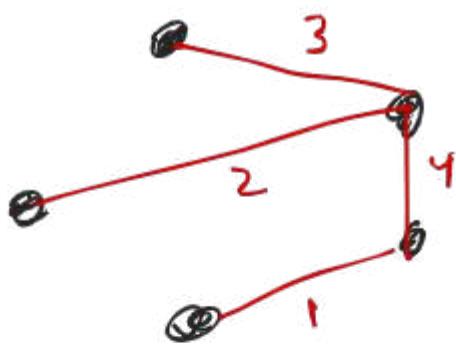


$$n=2$$



Guess  $n-1$  edges.

Indeed start with  $n$  disjoint vertices  
Observe each edge added  
decreases # comp by at most 1.  
So need  $n-1$  edges to get connected  
graph.



Defn A connected graph with  $|V|=n$   
 $|E|=n-1$   
is called a tree.

### Facts about trees

(1)  $G$  tree  $\Rightarrow G \setminus e$  disconnected  
for each  $e \in E$   
(by above.)

(2)  $G$  tree  $\Rightarrow G$  has no cycle.

Prove contrapositive:

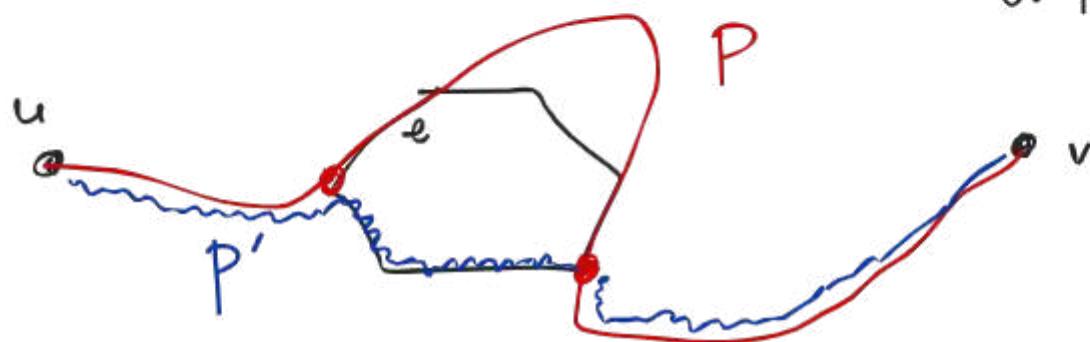
Suppose  $\exists$  cycle  $C \subset G$ . and edge  $e$  of  $C$ .

To show  $G$  not tree

Suffices to show  $G \setminus e$  connected.

Fix  $u, v \in V(G)$ . WTS  $\exists$  path in  $G \setminus e$   
between  $u, v$

$G$  connected.  $\Rightarrow \exists$  path  $P$  in  $G$   
 $u \rightarrow v$ .



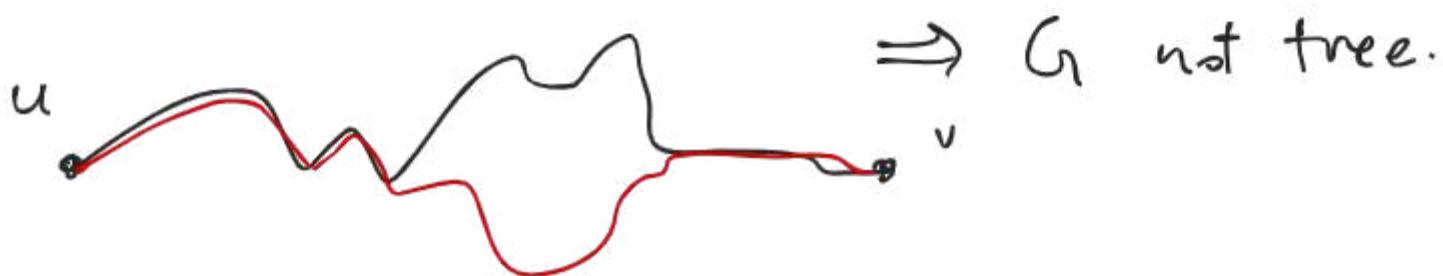
Let  $w_1, w_2$  first/last vertices of  $P \cap C$

$\exists$  path in  $C \setminus e$   $w_1 \rightarrow w_2$ .

Use to obtain path  $P'$  in  $G \setminus e$   
from  $u$  to  $v$ . ✓

(3) A tree  $\Rightarrow \exists!$  path between  
any two  $u, v \in V$

$\exists$  two path  $u \rightarrow v$ .  $\xrightarrow{\text{exclu}} G$  has cycle



Rank (extremal problems)

General kind of graph theory prob:  
among graphs with property P  
(connected, n vertices) which  
graphs minimize property Q  
(# edges)

# Graphs and matrices

$$G = (V, E)$$

enumerate  $V = \{v_1, \dots, v_n\}$   $E = \{e_1, \dots, e_m\}$

incidence matrix  $B = (b_{ij})$  where

$$b_{ij} = \begin{cases} 1 & v_i \text{ incident to } e_j \\ 0 & \text{else} \end{cases}$$

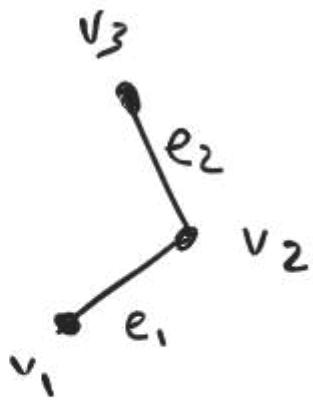
adjacency matrix  $A = (a_{ij})$  where

$$a_{ij} = \begin{cases} 1 & \{v_i, v_j\} \in E \\ 0 & \text{else} \end{cases}$$

degree matrix  $D = (d_{ij})$  where

$$d_{ij} = \begin{cases} \deg(v_i) & i=j \\ 0 & i \neq j \end{cases}$$

Ex



$$B: \begin{matrix} & e_1 & e_2 \\ v_1 & 1 & 0 \\ v_2 & 1 & 1 \\ v_3 & 0 & 1 \end{matrix}$$

$$A: \begin{matrix} & v_1 & v_2 & v_3 \\ v_1 & 0 & 1 & 0 \\ v_2 & 1 & 0 & 1 \\ v_3 & 0 & 1 & 0 \end{matrix}$$

$$D: \begin{matrix} & v_1 & v_2 & v_3 \\ v_1 & 1 & 0 & 0 \\ v_2 & 0 & 2 & 0 \\ v_3 & 0 & 0 & 1 \end{matrix}$$

What info about  $G$  can we extract from  $B, A, D$ ?

Example (powers of  $A$ )

$$(A^2)_{ij} = \sum_{r=1}^n a_{ir} a_{rj} = \text{\# walks length } 2 \text{ from } v_i \text{ to } v_j$$

$$a_{ir} a_{rj} = 1 \iff$$

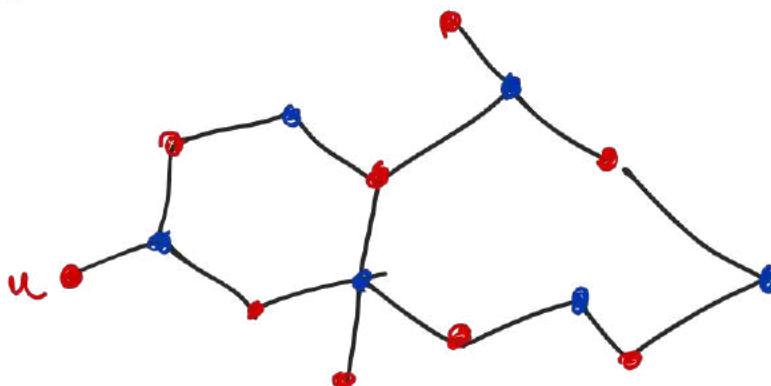


Similarly  $(A^d)_{ij} = \# \text{ walks length } d$   
from  $v_i$  to  $v_j$

Last time:

- $G$  bipartite  $\Leftrightarrow G$  has no odd cycle

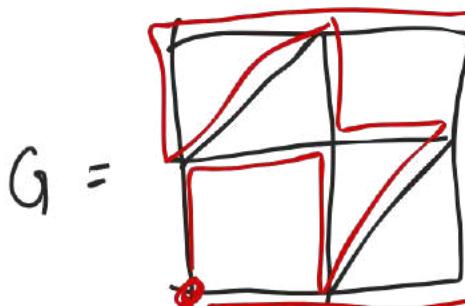
eg



- $G$  is Eulerian if  $\exists$  closed walk

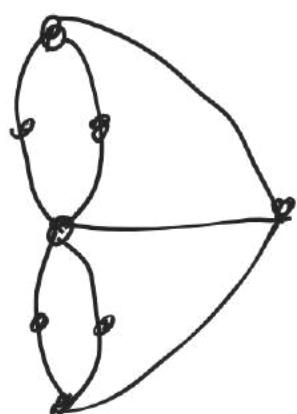
on  $G$  that visits every edge exactly once  
(call such a walk an Euler tour)

eg



is Eulerian

Ex Königsberg graph

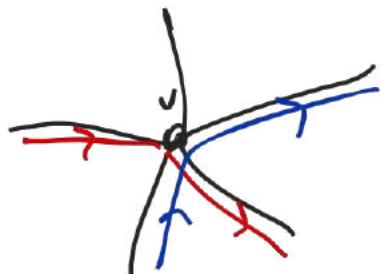


is NOT Eulerian

because it has  
vertices of odd  
degree.

Observation: if  $G = (V, E)$  is Eulerian then  
(TONC)  $\deg(v)$  even for each  $v \in V$ .

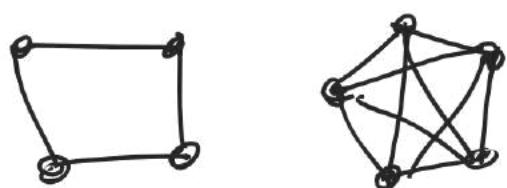
Indeed, a closed walk gives a pairing of  
edges incident to  $v$ .



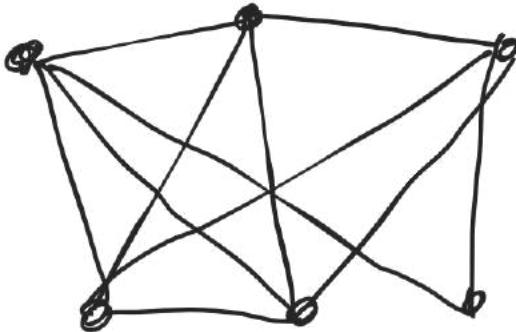
Theorem TONCAS: Assume  $G$  connected  
 $G$  Eulerian  $\Leftrightarrow$  every vertex  
has even degree.

connected means any two vertices  
joined by path. A disconnected

graph  
can't be Eulerian



Ex



Eulerian by  
Thm

In practice, not hard to find an  
Euler tour as proof will show.

Proof of Thm WTS ( $\Leftarrow$ )

use induction on  $|E|$  number of edges

Base case  $|E| = 0 \Rightarrow G = \cdot$

This graph is Eulerian (vacuously)

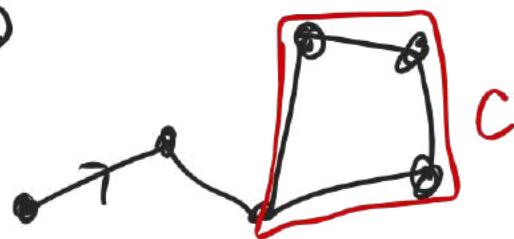
Inductive step Fix  $G = (V, E)$

with  $\deg(v)$  even  $\forall v \in V$ .

Assume true for graphs with  $< |E|$  edges.

Observe: even degrees  $\Rightarrow$

$G$  has a cycle  $C$



Let  $F = \{\text{edges of } C\} \subset E$

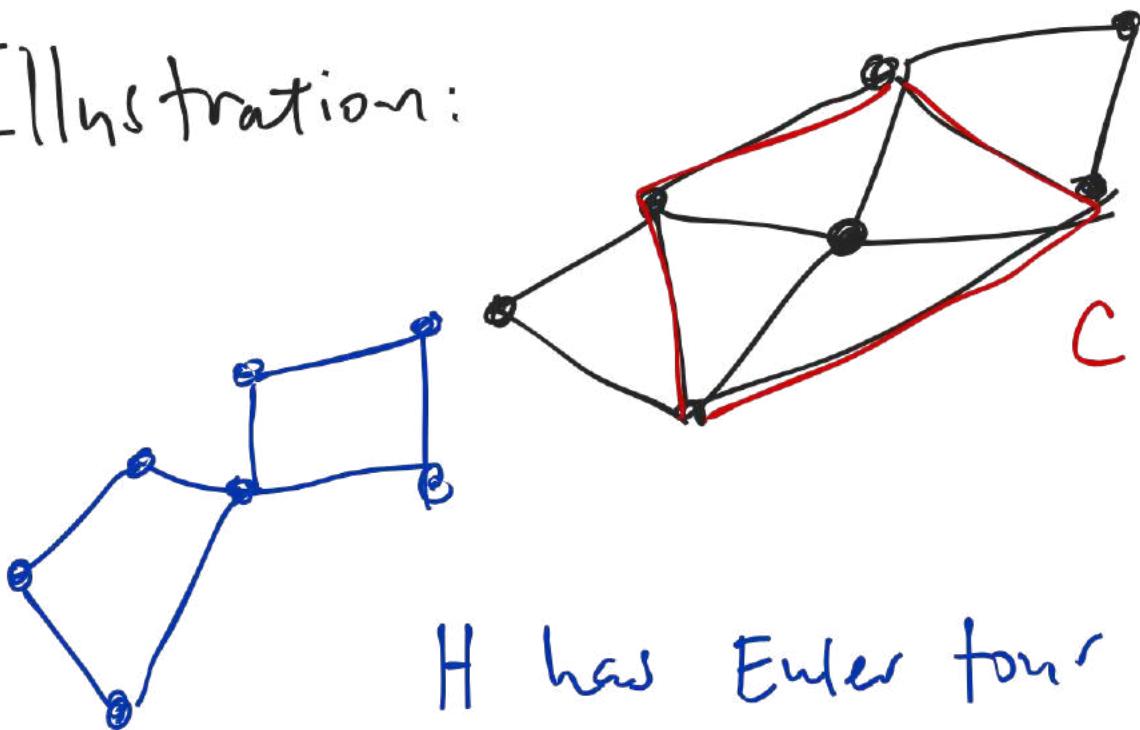
Consider subgraph  $H := (V, E \setminus F)$

Each  $v \in V$  has even degree in  $H$

$\Rightarrow H$  has an Euler tour  $w$

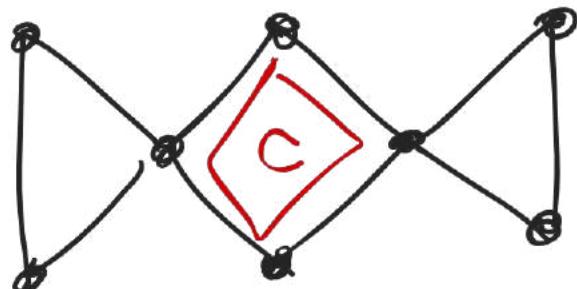
Combine  $w$  and  $C$  to get  
Euler tour of  $G$ .

Illustration:

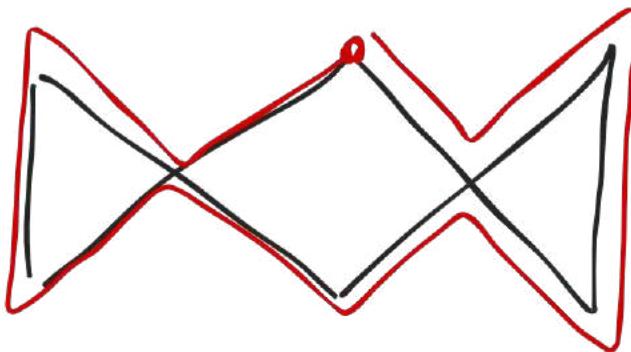


Potential issue:  $H$  may not be connected.

Eg



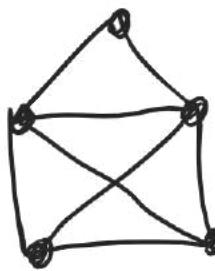
•  
 $H$



To combine  $H, C$  into a Euler tour

start walking along  $C$ , and take detours at each vertex part of a nontrivial component of  $H$ , following the Euler tour given by the induction step. □

Example

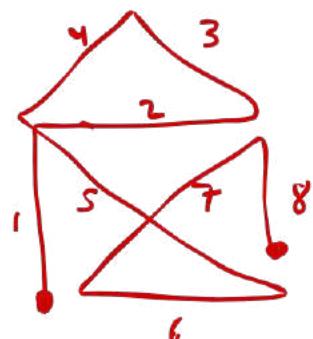


Not Eulerian

and deg 3

But here's a walk visiting every edge once

Why doesn't this  
contradict the  
theorem?



(Not a closed walk)

Connected graphs

G connected if any two  
edges are joined by a path

Any graph is union of connected  
graphs "connected components"

Question What's the fewest number of edges in a connected graph with  $n$  vertices?

Ans:  $n - 1$

e.g.  $P_n$  is connected w/  
 $n$  vertices,  $n - 1$  edges.

This is the best possible

• • Start w/  
• •  $n$  points  
• • Each edge  
decreases  
# components  
by at most  
1.

After  $k$  edges

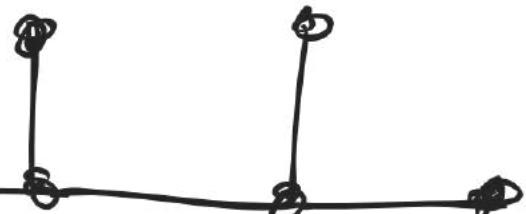
there are  $\geq n - k$  components

So need at least  $n - 1$  edges

to get 1 component.

---

Examples w/  $n$  vertices,  $n - 1$  edges  
(minimizers) These are called  
trees



Rmk Above question is simple example of extremal problem.

Such problems ask : Among graphs with property P (<sup>con.</sup>  
<sub>n vertices</sub>) which graphs minimize property Q (#edges) ?

Next time

Thm (characterization of trees)

Fix connected G. TFAE

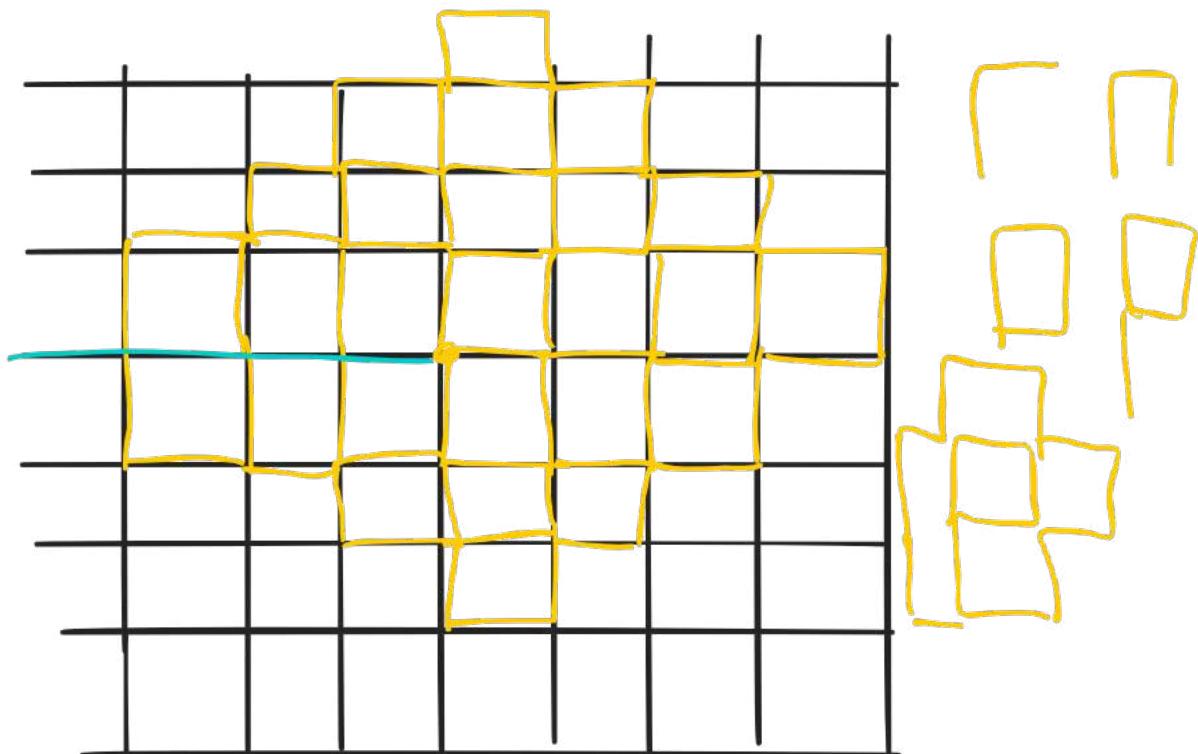
- 1) G has  $n$  vert,  $n-1$  edges
- 2) removing any edge disconnects G
- 3) G contains no cycle
- 4) Between  $u, v \in V$   $\exists!$  path.

# Euler tours on infinite graphs

Last time  $G$  Eulerian  $\Leftrightarrow$  vertex deg  
are even

What about infinite graphs? ( $|V| = \infty$ )

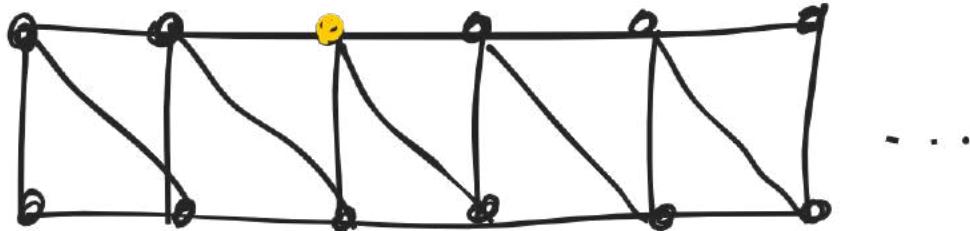
e.g. infinite grid



An  $\infty$  graph is Eulerian if  $\exists$   
walk  $(\dots w_{-2}, w_{-1}, w_0, w_1, w_2, \dots)$   
that visits every edge once.

Ex

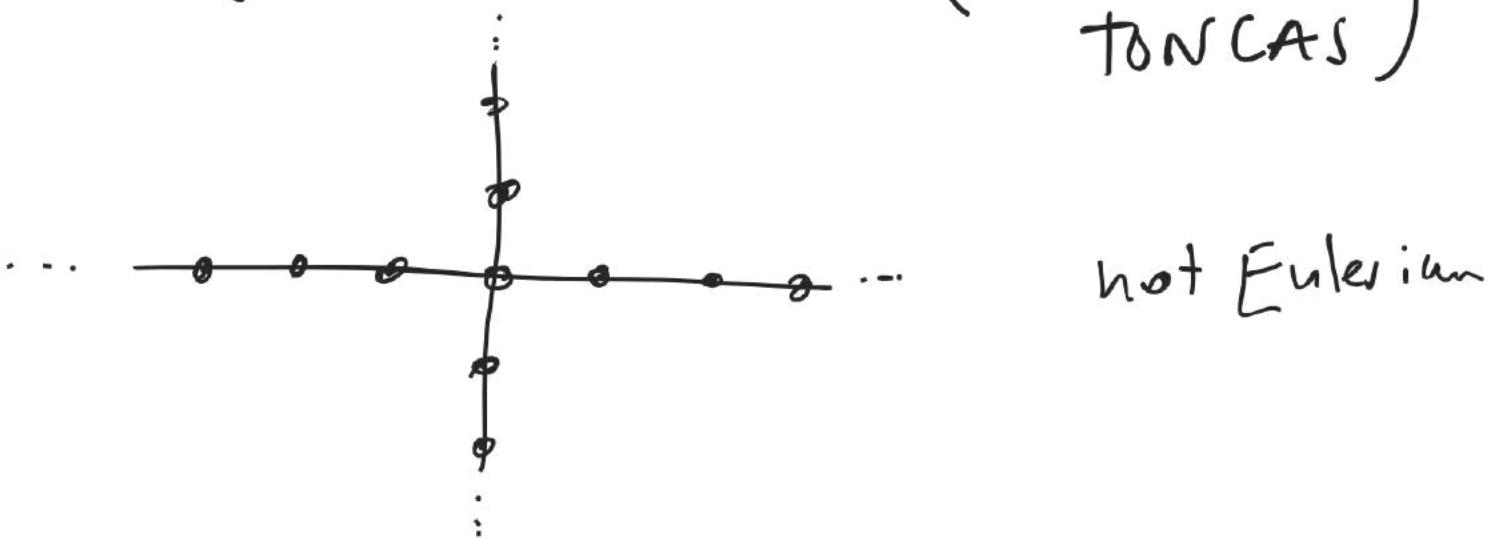
$G_1 = \dots$



is Eulerian

Example the infinite grid is Eulerian!

Ex Having even vertex deg is not enough to be Eulerian (TONC but not TONCAS)



Possible final project: characterize infinite Eulerian graphs  
(Erdoes - Grünwald - Weiszfeld)

# Trees

A tree is a connected graph with  $n$  vertices and  $n-1$  edges.

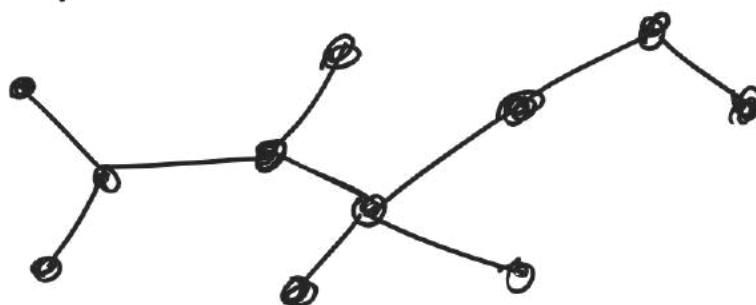
Thm (characterization of trees)

Let  $G$  be a connected graph w/  $n$  vertices

TFAE

- (i)  $G \setminus e$  disconnected for each edge  $e$
- (ii)  $G$  has  $n-1$  edges
- (iii)  $G$  does not contain a cycle
- (iv) Any two vertices are joined by unique path.

Ex



Can take any of these as definition of tree.

Will be easier to prove TFAE

for connected graphs  $G = (V, E)$

- (1)  $\exists$  edge  $e$  st.  $G \setminus e$  connected
- (2)  $|E| > |V| - 1$
- (3)  $G$  has a cycle
- (4)  $\exists u, v \in V(G)$  that are joined by two different paths

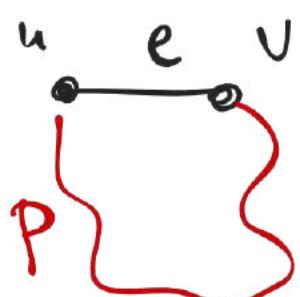
easy implications (do quickly write for exercise)

(1) implies (2), (3), (4)

• (1)  $\Rightarrow$  (2) by last time min # edges  
for conn. graph w/  $n$  vert. is  $n-1$   
(gives contrapositive)

• (1)  $\Rightarrow$  (3)  $G \setminus e$  connected

$C = P \cup e$  cycle



- $(1) \Rightarrow (4)$   $G \setminus e$  connected  
 $e, P$  (above) are paths joining  $u, v$ .  


---

To finish proof, show

$$(3) \Rightarrow (1)$$

$$(4) \Rightarrow (3)$$

$$(2) \Leftrightarrow (1) \Rightarrow (4)$$

$$(2) \Rightarrow (1)$$



$$(3) \Rightarrow (1) : \text{last time}$$

if  $C \subset G$  cycle with

$e \in E(C)$ , then  $G \setminus e$  connected.

$$(4) \Rightarrow (3) : \text{Assume paths not unique.}$$

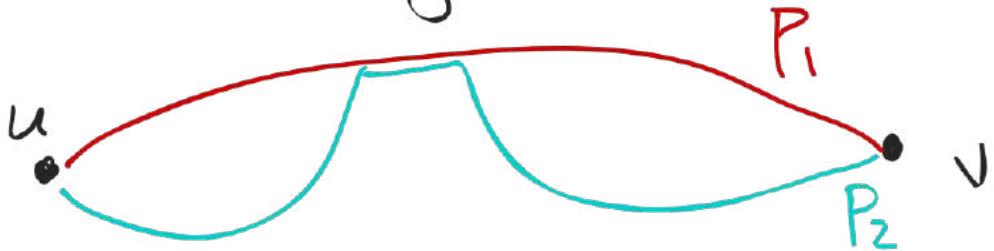
Choose vertices  $u, v$  s.t

(i)  $\exists$  two paths  $P_1, P_2 \subset G$  between  $u, v$

(ii)  $d(u, v)$  minimal among all examples satisfying (i)

Claim  $P_1 \cup P_2$  form a cycle.

if not



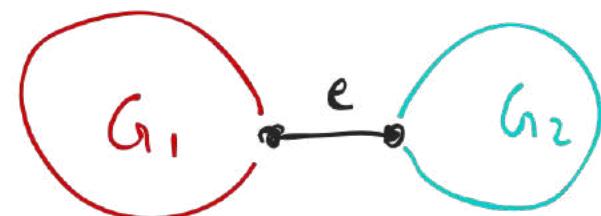
this would contradict (ii).

(2)  $\Rightarrow$  (1): Contrapositive

$G \setminus e$  disconnected  $\forall e \Rightarrow |E| = |V| - 1$

Proof by induction on  $|E|$

- Base case:  $|E| = 0 \Rightarrow G = \emptyset$   $|V| = 1$   $|E| = 0$  ✓
- Induction step:  $|E(G)| = m$



$$m-1 = |E(G_1)| + |E(G_2)|$$

$$= |V(G_1)| - 1 + |V(G_2)| - 1 \quad (\text{induction})$$

$$= |V(G)| - 2$$

$$\Rightarrow |E(G)| = m = |V(G)| - 1 \quad \square$$

## Counting trees

Fix  $n$  and let  $V = \{1, \dots, n\}$ .

Q Among graphs  $G = (V, E)$  how many are trees?

Rmk total # graphs is  $2^{\frac{n(n-1)}{2}}$   
(choose edges)

Here we are not counting up to 150.

Exercise (1) Answer Q for  $2 \leq n \leq 5$

(2) Make a conjecture about the general case.

$n=2$



1 graph

$n=3$



3 graphs

$n=4$



$$\frac{4!}{2} = 12 \text{ graphs}$$



4 graphs

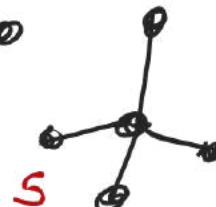
$n=5$



$$\frac{5!}{2} = 60$$



$$5 \cdot 4 \cdot 3 = 60$$



5

$n$	trees
2	$1 = 2^0$
3	$3 = 3^1$
4	$16 = 4^2$
5	$25 = 5^2$

Guess  $n^{n-2}$

Thm (Cayley) Among graphs  $G = (V, E)$  with  $V = \{1, \dots, n\}$  there are  $n^{n-2}$  trees.

Strategy: To count fingers on left hand:

- $\exists$  bijection Left/Right
- count fingers on right hand.

Consider sequences  $(a_1, \dots, a_{n-2})$  with

$$a_i \in \{1, \dots, n\}$$

Observe that there are  $n^{n-2}$  of these.

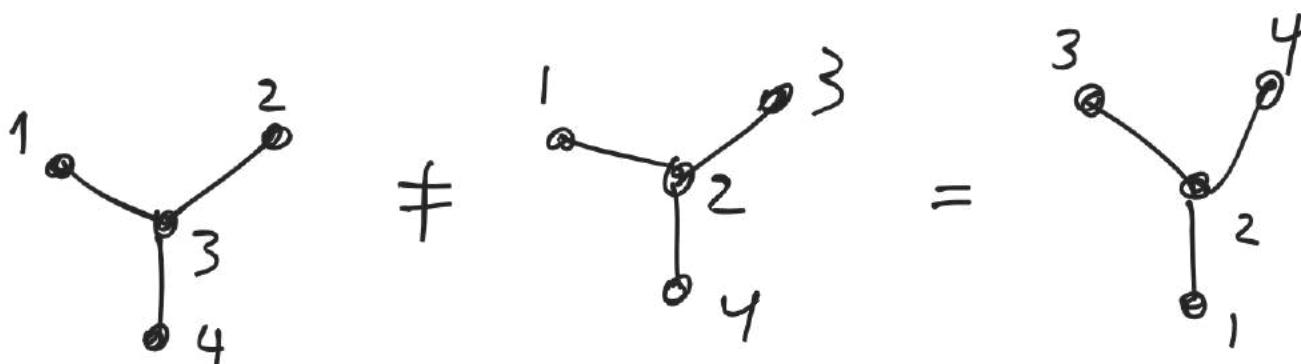
To prove Cayley's Thm we find bijection

Trees with  $V(T) = \{1, \dots, n\} \quad \xleftrightarrow{\text{1-1}} \quad \begin{array}{l} \text{Sequences} \\ (a_1, \dots, a_{n-2}) \\ \text{as above} \end{array}$

"Prüfer code"

# Trees and Prüfer codes

T tree with vertices  $1, \dots, n$

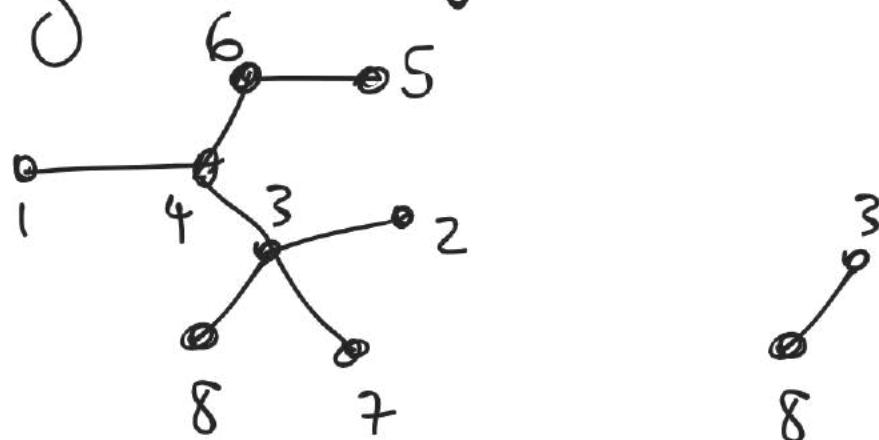


The Prüfer code  $P(T) = (a_1, \dots, a_{n-1})$

obtained inductively by

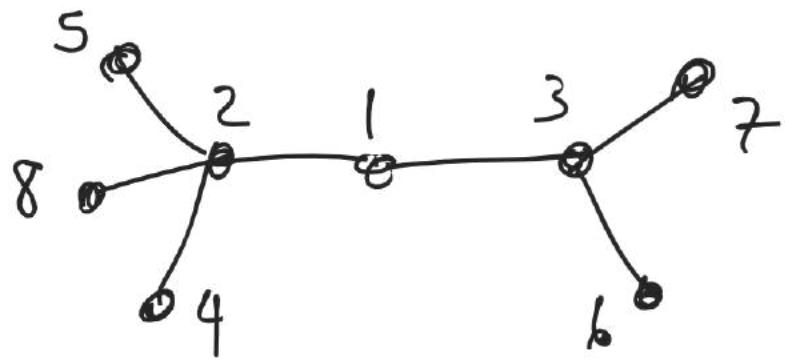
deleting smallest valence 1 vertex  
and adding its neighbor to the sequence

Ex  $T =$



$$P(T) = (4, 3, 6, 4, 3, 3)$$

Ex  $T =$



$$P(T) = (2, 2, 3, 3, 1, 2)$$

### Observations

- degree - 1 vertices of  $T$  (leaves) don't appear in  $P(T)$
- $v \in T$  appears  $\deg(v) - 1$  times in  $P(T)$ : each  $v$  had valence 1 at some pt in algorithm to get to this pt,  $\deg(v) - 1$  of its nbrs. have been deleted.

## Working backwards :

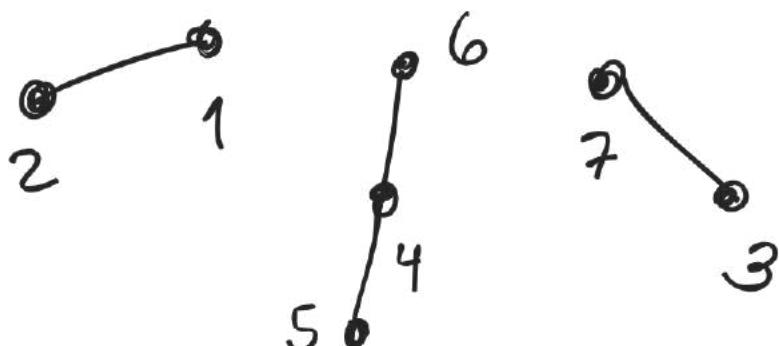
given  $P = (1, 7, 4, 6, 1)$  find  $T$  with  
 $P(T) = P$ .

- $T$  will have 7 vertices
- 2, 3, 5 don't appear in  $P$   
so they're leaves of  $T$
- The smallest was deleted first



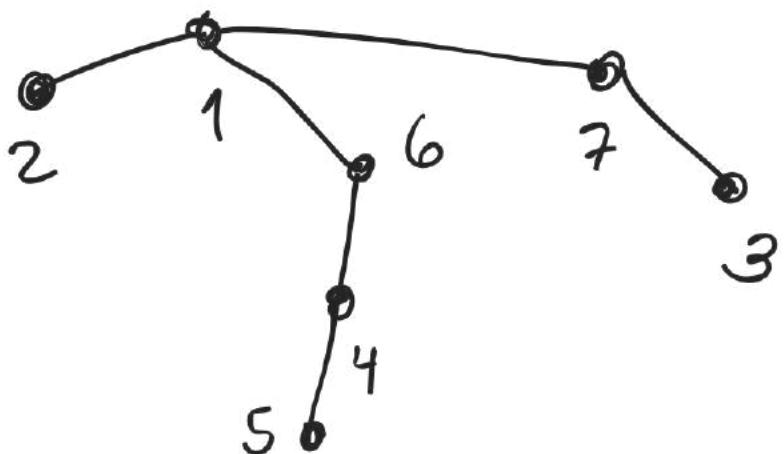
- continue : have graph w/ verts  
 $1, \cancel{2}, \cancel{3}, \cancel{4}, \cancel{5}, 6, 7$  and code  $(\cancel{7}, \cancel{4}, \cancel{6}, 1)$

Continue

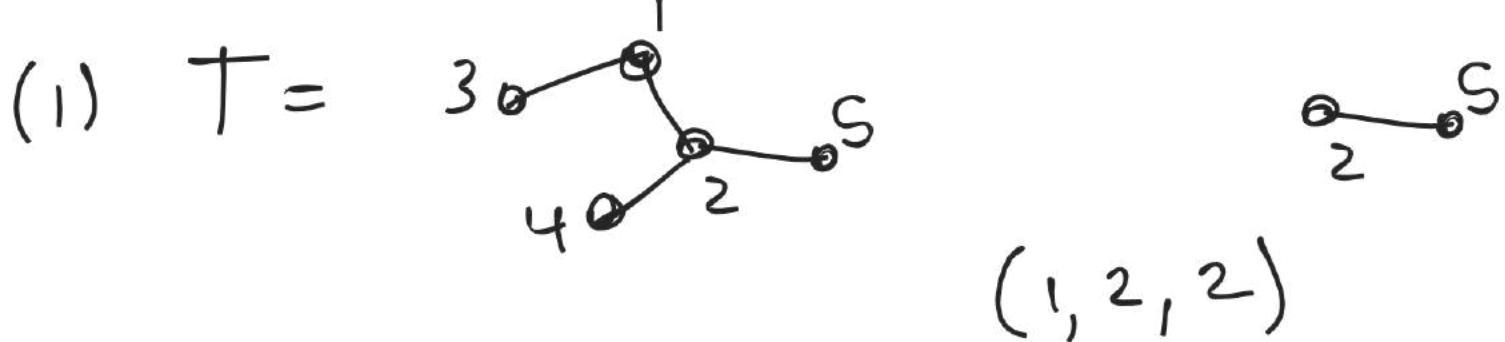


- Final step: want graph with

Vertices 1, 6, 7 and code (1)

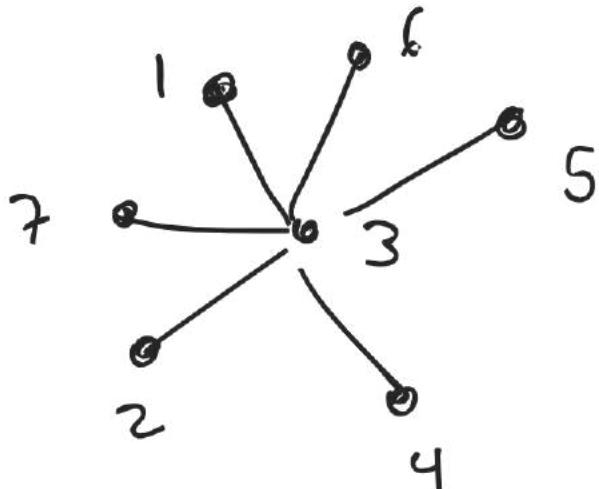


Exercise Give the code for graphs



Exercise draw trees with code

- $(3, 3, 3, 3, 3)$



- $(2, 3, 4, 5, 6)$

graph w/ vert and code

1 2 3 4 5 6 7

2 3 4 5 6



Thm  $T \mapsto P(T)$  gives a bijection

$$\left\{ \begin{array}{l} \text{trees with} \\ \text{vertices } \{1, \dots, n\} \end{array} \right\} \longleftrightarrow \left\{ \begin{array}{l} \text{sequences} \\ (a_1, \dots, a_{n-2}) \quad a_i \in \{1, \dots, n\} \end{array} \right\}$$

Cor LHS set has  $n^{n-2}$  elements

Proof of Thm By induction on  $n$

Base case ( $n=2$ ) There is only one tree 

There is only one sequence  $(1)$ .

(alternatively do  $n=3$ , have 3 graphs



and 3 seq  $(1), (2), (3)$

Inductive Step Focus on surjective. Inj. will follow  
given  $P = (a_1, \dots, a_{n-2})$  let  $x$  smallest  
index not in  $P$ .

Key observation if  $P(T) = P$  then <sup>①</sup> $x$  is a leaf,  
<sup>②</sup>  $x$  is an edge, and <sup>③</sup> deleting  $x$   
leaves tree with vertices  $\{1, \dots, n\} \setminus \{x\}$  and  
code  $(a_1, \dots, a_{n-2})$

By induction  $\exists!$  tree  $T_1$  with

$$P(T_1) = (a_2, \dots, a_{n-2})$$

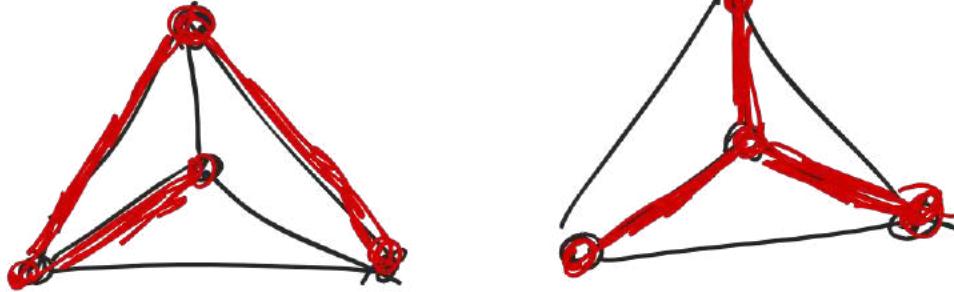
Then  $T = \{ \text{---} \cup \{a_1\} \cup T_1 \}$  is tree

with  $P(T) = P$ . Uniqueness of  $T_1$  and <sup>key</sup> observation  
 $\Rightarrow T$  unique tree with  $P(T) = P$   $\square$

## Spanning Trees

Defn Given a graph  $G$ , a spanning tree is a subgraph  $T \subset G$  that is a tree and contains every vertex of  $G$ .

Ex.



Motivation (extremal problem) Smallest <sup>connected</sup> subgraphs containing all vertices

- networks. fewest roads to keep open during construction.

so ppl can still travel to diff parts of town.

Prop Every graph has a spanning tree.

Proof Recall that we proved:

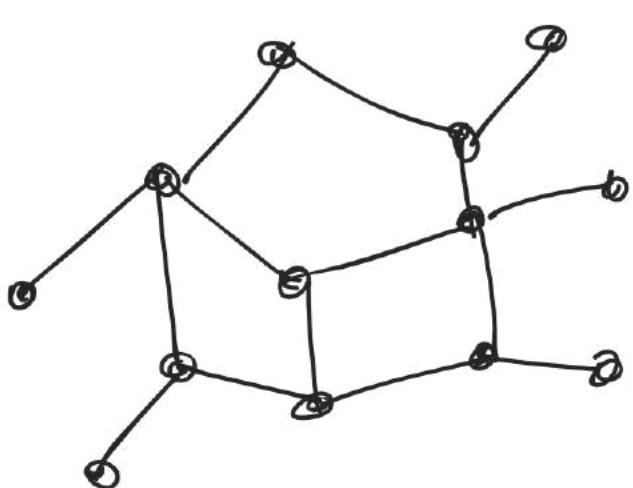
if  $G$  has a cycle  $C$ , then  $G \setminus e$  connected  
for each edge  $e$  of  $C$ .

Inductively find cycle of  $G$  and  
remove an edge.

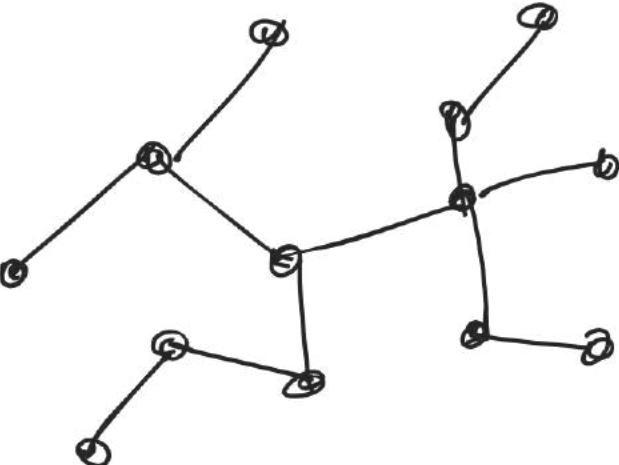
Eventually arrive at tree (no cycles)

w/ same vertex set

□



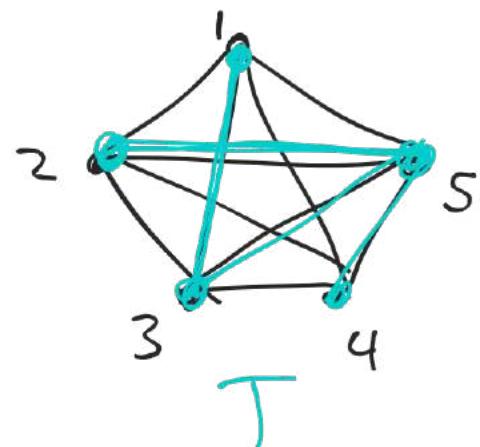
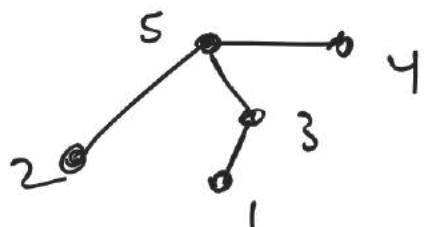
→



## Two problems

① Given graph  $G$ , how many spanning trees.

Eg  $G = K_n$  complete.

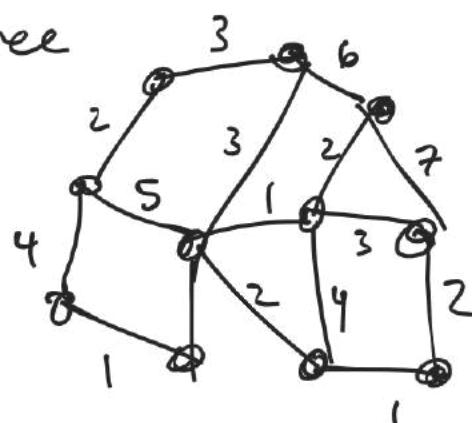


# spanning trees is  $n^{n-2}$  by Cayley

generalization?

② Given weighted graph find minimal spanning tree

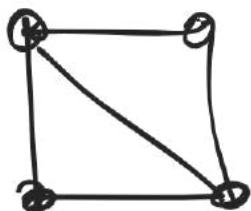
tree with smallest total edge weight.



Problem Given graph  $G$  how many spanning trees.

Examples

①  $G =$

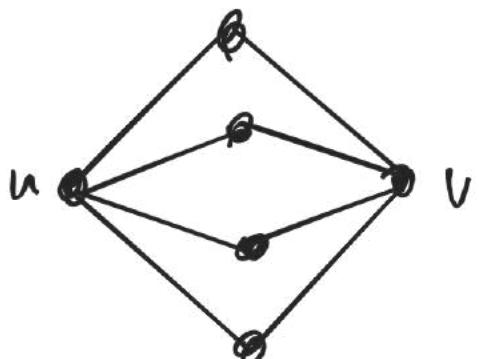


has Spanning trees

$\square \quad \square \cup \square$   
 $\square \downarrow \quad \sum \quad N$   
(8)

②  $G =$

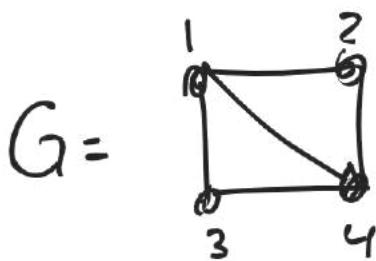
$G =$



Has  $4 \cdot 2^3$  span. trees:

a spanning tree contains a unique path  $u, v$  (4 choices) and there are  $2^3$  choices for rest of tree.

# Matrix tree theorem (Kirchhoff)



$$M := \begin{pmatrix} 3 & 2 & 0 \\ 2 & 2 & -2 \\ 0 & -2 & 3 \end{pmatrix} - \begin{pmatrix} 1 & 2 & 3 & 4 \\ 0 & 1 & 1 & 1 \\ 0 & 0 & 1 & 1 \\ 0 & 0 & 0 & 1 \end{pmatrix} = \begin{pmatrix} 3 & -1 & -1 & -1 \\ -1 & 2 & 0 & -1 \\ -1 & 0 & 2 & -1 \\ -1 & -1 & -1 & 3 \end{pmatrix}$$

degree matrix      adjacency matrix       $M_{11}$

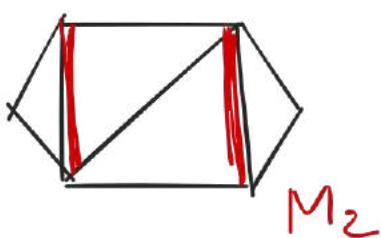
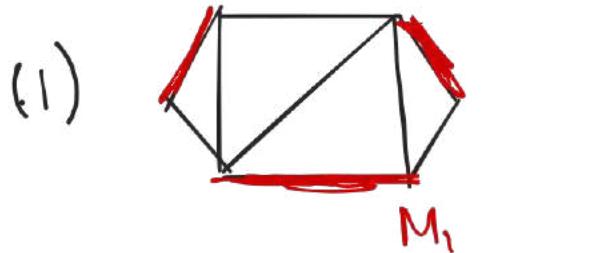
$$\det(M_{11}) = 2(6-1) - 1(2) = 10 - 2 = 8$$

Theorem  $\det(M_{11}) = \# \text{ spanning trees.}$

## Matchings

Defn A matching in  $G = (V, E)$  is a subset  $M \subseteq E$  so that no two edges of  $M$  share a vertex.

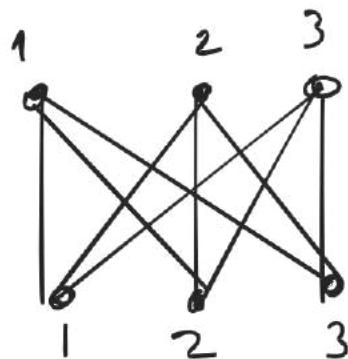
### Examples



For  $U \subseteq V$  say  $M$  saturates  $U$  if every vertex in  $U$  is incident to some edge in  $M$ .

A matching that saturates  $V$  is called perfect.

(2)  $K_{n,n}$



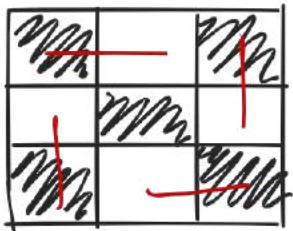
perfect  
matchings of  $K_{n,n}$



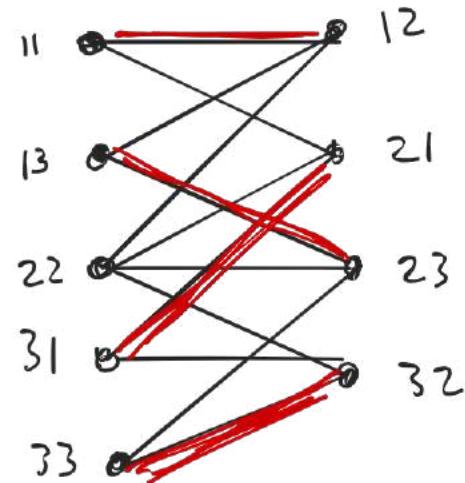
bijections  
 $\{1, \dots, n\} \rightarrow \{1, \dots, n\}$

There are  $n!$  of these.

(3)



A tiling of board by  
tiles gives

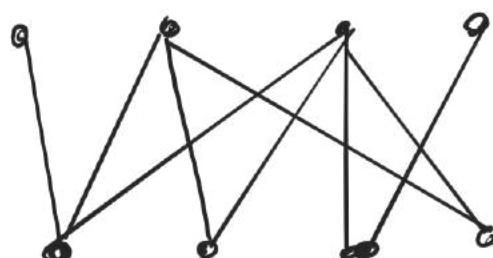


a matching of associated bipartite graph.

(HW2): A bipartite graph  $V = A \cup B$  where  $|A| \neq |B|$  doesn't have a perfect matching.

(4) jobs

applicants



Q: Let  $G = (V, E)$  be a bipartite graph  $V = X \sqcup Y$ . Does there exist a matching  $M \subset E$  that saturates  $X$ ?

Want: TONC and TONCAS.

Exercise Determine if  $G$

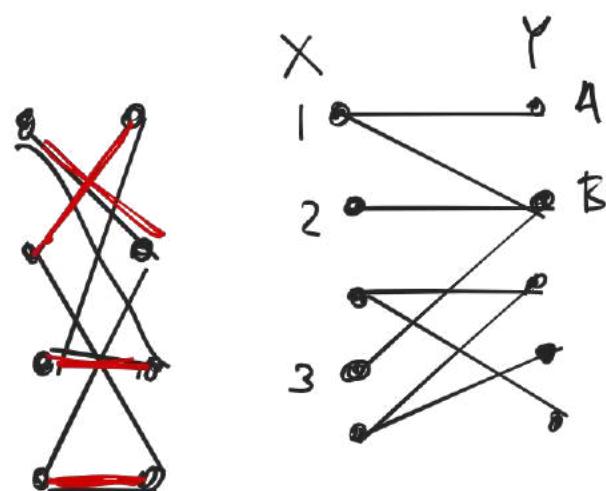
has matching that saturates  $X$



No. 4 applicants  
competing for 3 jobs



Yes



Yes

No. 3 applicants  
(1,2,3) competing  
for 2 jobs (A,B)

For  $S \subset X$  define  $N(S) = \{y \in Y \mid \exists \text{ edge from } \{y \text{ to some } s \in S\}$   
neighbors of  $S$ .

TONC If  $G = (X \cup Y, E)$  has a matching  
that saturates  $X$ , then  $|N(S)| \geq |S|$   
for each  $S \subset X$ .

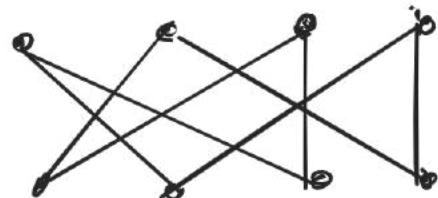
Thm (Hall's matching) TONCAS.

For  $G = (X \cup Y, E)$  bipartite

$G$  has matching  
separating  $X$   $\iff$   $|N(S)| \geq |S|$   
for every  $S \subset X$ .

Cor Fix  $k \geq 1$ . A  $k$ -regular bipartite graph  $G$   
has a perfect matching

Example graph above  
is 2-regular



Proof of Cor Write  $G = (X \cup Y, E)$ .

Step 1 Show  $|X| = |Y|$ .

$$k|Y| = \sum_{u \in Y} \deg(u) = |E| = \sum_{v \in X} \deg(v) = k|X|$$

Step 2 Since  $|X| = |Y|$ , to show there is  
perfect matching suffices to show  $\exists$   
matching that saturates  $X$ .

Apply Hall: Fix  $S \subset X$ .

$$\underbrace{\# \text{ edges leaving } S}_{k|S|} \leq \underbrace{\# \text{ edges entering } N(S)}_{\leq |N(S)|}.$$

$$\Rightarrow |S| \leq |N(S)|. \quad \checkmark \quad \square$$

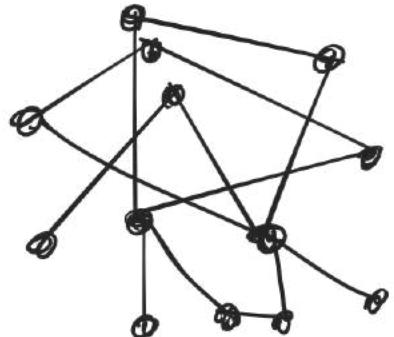
Prove Hall next time

---

### Maximum matching

Let  $G$  be any graph.

Q: What's the max size  
of a matching?



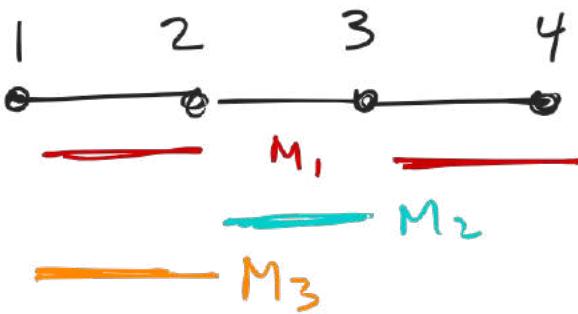
Defn Say  $M$  is a maximal matching if  
# matching  $M'$  with  $M \subsetneq M'$ .

Say  $M$  is a maximum matching if  $\nexists$   
matching  $M'$  with  $|M| < |M'|$ .

(Maximum  $\Rightarrow$  Maximal)

Example

$$G = P_4$$

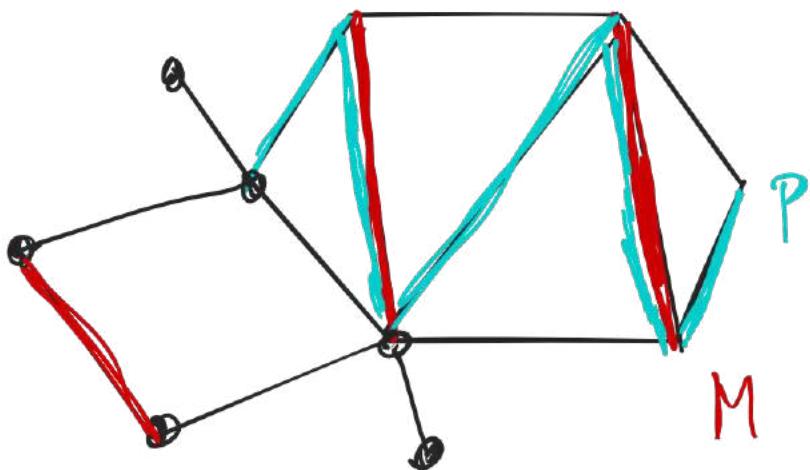


$$M_1 = \{12, 34\} \quad \text{maximum}$$

$$M_2 = \{23\} \quad \text{maximal not maximum.}$$

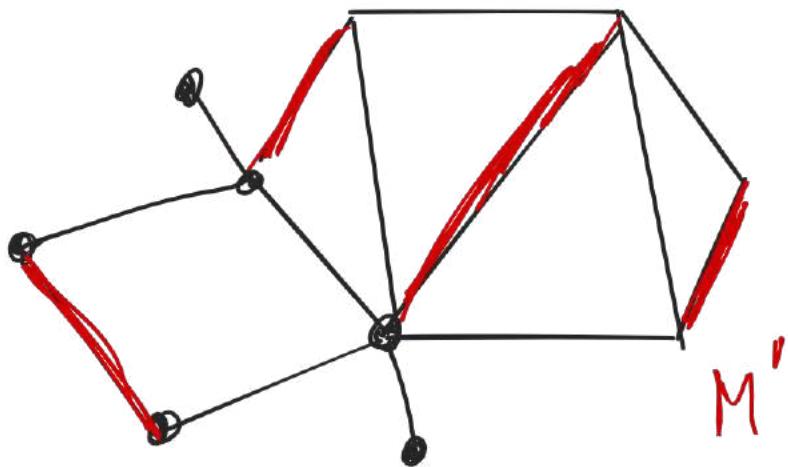
$$M_3 = \{12\} \quad \text{not maximal}$$

Ex (how to show a matching is not maximum)



Consider path  
P whose edges  
alternate between  
 $E \setminus M$  and  $M$ .

Here the endpoints aren't incident to  
any edge of  $M$  so we can use  $P$   
to get a larger matching



Call  $P$  an  $M$ -augmenting path.

TONC If  $M$  is a matching of  $G$  and  $G$  has an  $M$ -augmenting path, then  $M$  is not a maximum matching.

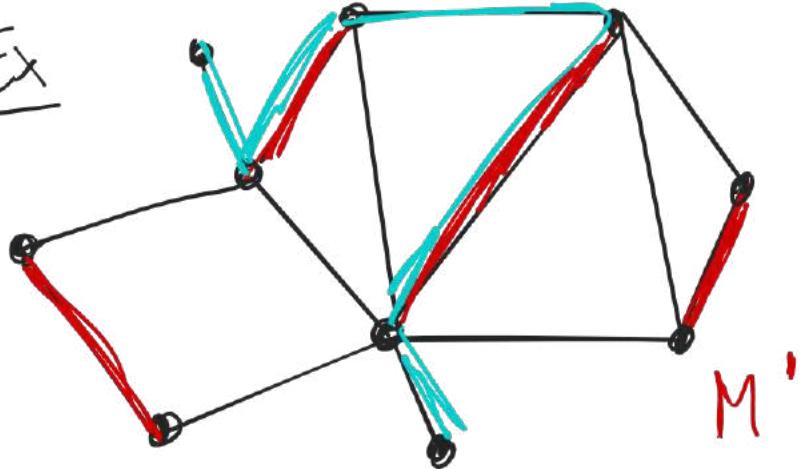
Thm (maximum matchings) TONCAS

$M$  is maximum matching of  $G \iff$

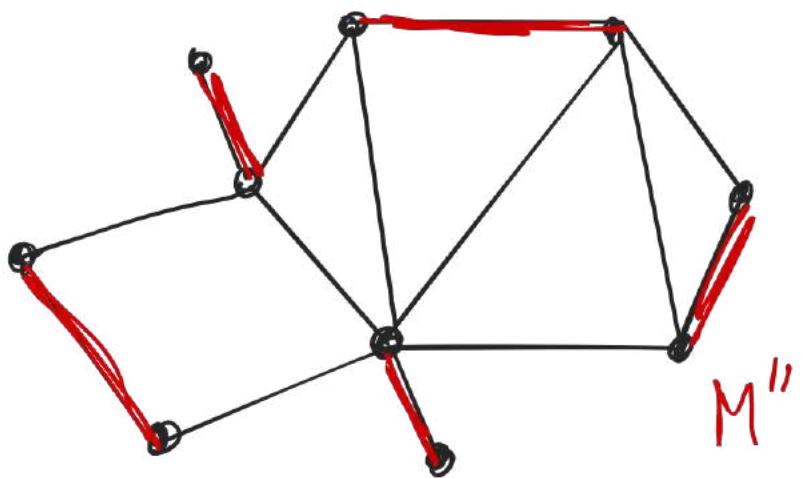
$G$  has no  $M$  augmenting paths.

Rank Thus to find a maximum matching we could start w/ any matching  $M$  and look for  $M$ -augmenting paths to replace  $M$  with larger matching, until  $\nexists M$ -aug path.

Ex



$M'$



$M''$

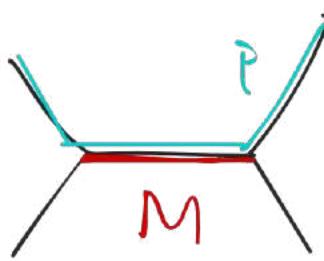
$M''$  has  
no  $M'$ -aug  
paths.

( indeed every vertex is  $M''$ -saturated)

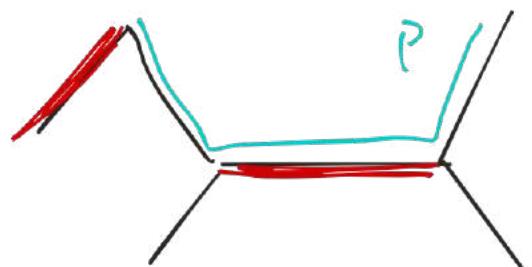
## Maximum matchings

Recall  $G = (V, E)$

- $M \subseteq E$  is matching if no  $e, e' \in M$  have common vertex
- a matching  $M$  is maximum if it has most edges of any matching
- for matching  $M$ , an  $M$ -augmenting path  $P \subset G$  has edges alternating between  $M$  and  $E \setminus M$  and endpts of  $P$  not incident to any edge of  $M$ .



$P$  is  $M$ -aug



$P$  not  $M$ -aug.

- TONC:

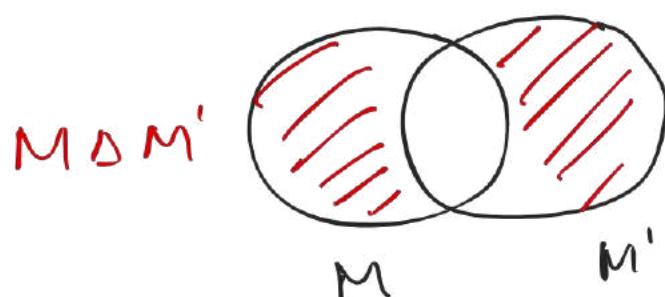
if  $M$  maximum, then  $\nexists$   $M$ -aug path.

Then (maximum matchings) TONCAS

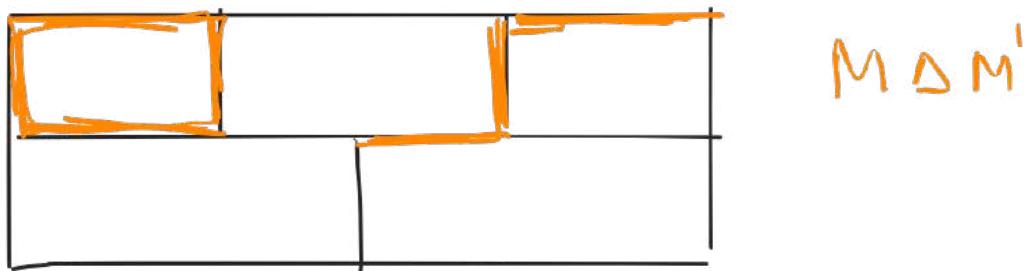
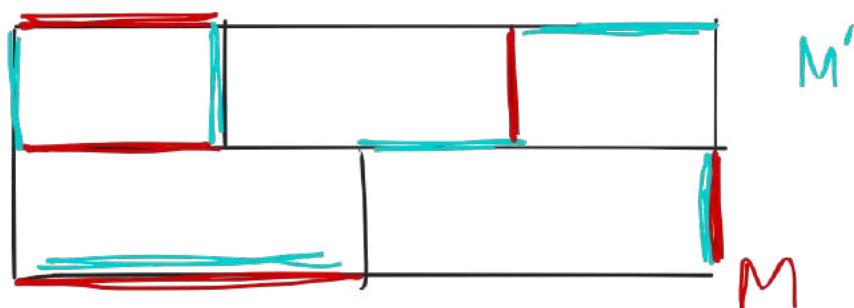
if  $M$  not maximum, then  $\exists$   $M$ -aug path

Toward proof: if  $M$  not maximum  $\exists M'$  with more edges. consider symmetric diff

$$M \Delta M' := (M \setminus M') \cup (M' \setminus M)$$



Example



Lemma  $M, M'$  matchings of  $G$ .

Then  $M \Delta M'$  is union of paths and even cycles

Proof (sketch)

- Vertices of  $M \Delta M'$  have degree 1 or 2



- graphs with vertex degrees  $\leq 2$   
are unions of  $P_n$ 's and  $C_m$ 's.  
(compare to HW2 #3)
- cycles are even length b/c ...  
They alternate b/wn  $M$  and  $M'$ . □

Proof of maximum matchings Then

---

WTS if  $M$  is not maximum then  $G$  has  
 $M$ -augmenting path.

Let  $M'$  be a matching with more edges than  $M$ .

By lemma  $M \Delta M'$  union of paths and  
even cycles. Since  $|M'| > |M|$ ,  $M \Delta M'$  must  
have a component



Endpts are not incident to  $M$  by construction  
So this is an  $M$ -augmenting path. □

## Hall's Theorem

$G = (X \cup Y, E)$  bipartite

$\exists$  matching  $M$   
Saturating  $X$

$$|S| \leq |N(S)|$$

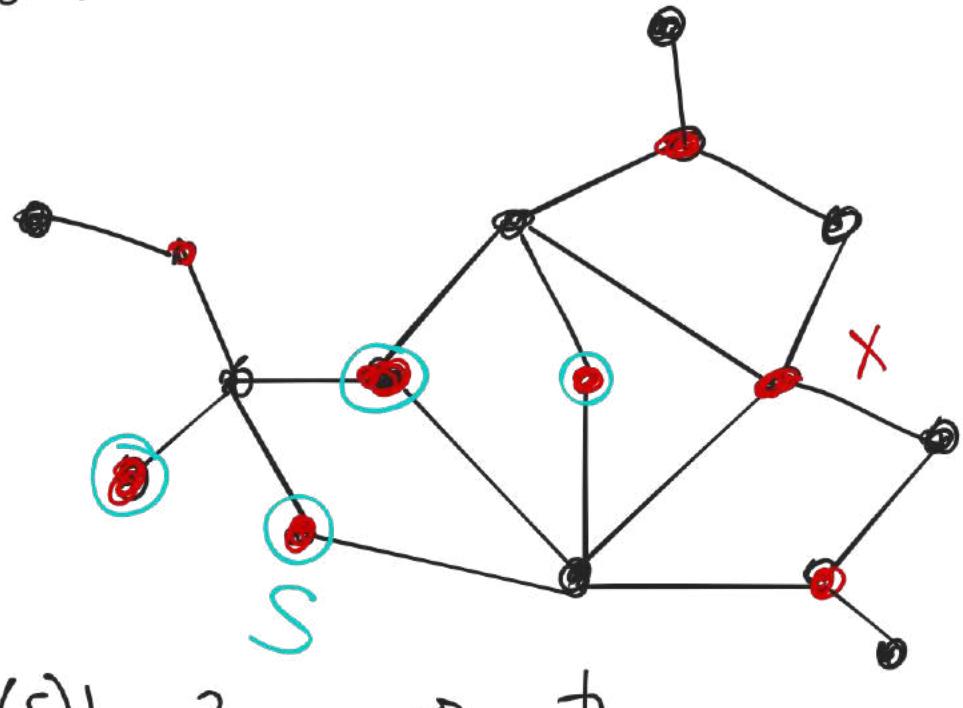
$\forall S \subset X$ .

( $\Rightarrow$ ) is "obvious"

### Example

Bipartite

$$|X| = |Y|$$



$$|S| = 4 \quad |N(S)| = 3 \quad \Rightarrow \quad \text{not}$$

matching saturating  $X$ .

Pre-proof Assume  $|S| \leq |N(S)| \quad \forall S \subset X$ .

Let  $M$  be a maximum matching and suppose  
for a contradiction that  $M$  doesn't saturate  $X$ .

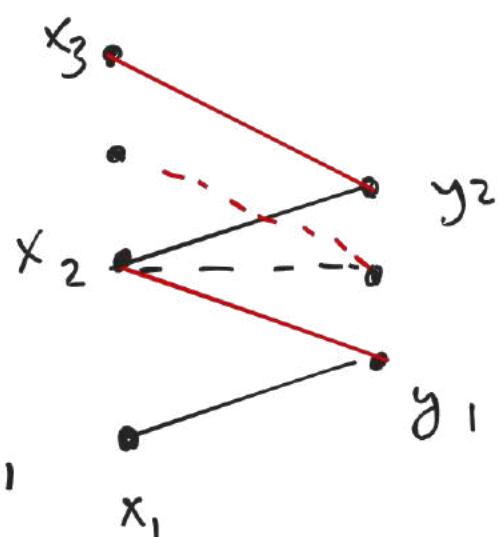
What goes wrong?

Choose  $x_1 \in X$  not saturated by  $M$

$$|N(\{x_1\})| \geq |N(x_1)| = 1 \Rightarrow \exists y_1$$

$M_{\max} \Rightarrow y_1$  saturated  
 $\Rightarrow \exists x_2$

$$|N(\{x_1, x_2\})| \geq 2 \Rightarrow \exists y_2 \neq y_1$$



$M_{\max} \Rightarrow y_2$  saturated  $\Rightarrow \exists x_3$

$G$  is finite so eventually this process ends. If it ends at  $y_n$  then we found  $M$ -ang path contradicting  $M_{\max}$ .  
If it ends at  $x_k$  would like to conclude  $|N(S)| < |S|$  for some  $S \subset X \dots$

Proof Consider  $M$ -alternating paths starting at  $x_1$ . Let

$X' = \{x \in X \text{ end point of } M \text{ alt. path starting at } x_1\}$

$Y' = \{\text{penultimate vertex of these paths}\}$

Observe  $M$  gives matching  $X'$  to  $Y'$

$$\Rightarrow |X'| = |Y'|$$

Consider  $S = X' \cup \{x_1\}$

By assumption  $|N(S)| > |S|$

$$\Rightarrow \exists y \in N(S) \setminus Y'.$$



Key  $y \notin Y' \Rightarrow y$  not saturated by  $M$ .

Case 1  $S = x_1 \Rightarrow$

$sy$  is  $M$  alt. path.  $\times$ .

Case 2  $s \in X'$

Take <sup>alt</sup> path  $P$  from

$x_1$  to  $s$ . Then  $P \cup \{sy\}$

is  $M$ -augmenting path.  $\times$ .



From this conclude  $x_1$  doesn't exist

i.e  $M$  saturates  $X$ .

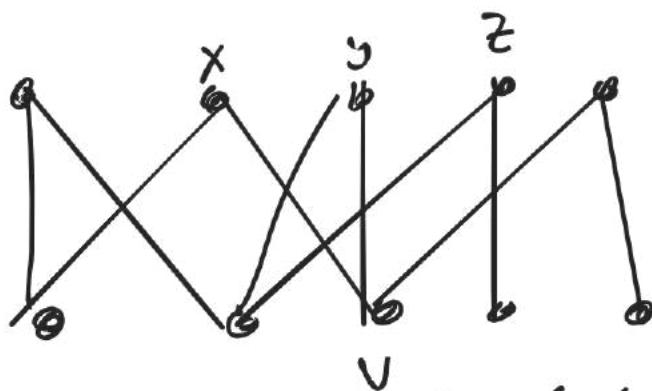
□

---

## Stable Marriage Problem

men

women



a bipartite graph.  $G = (V, E)$

Goal Find matching incorporating preferences

For each  $v \in V$ , given an ordering  $\prec_v$  on  $N(v)$ .

$$x \prec_v z \prec_v y.$$

A matching  $M$  is stable if no unmatched pair is motivated to change their matching eg.

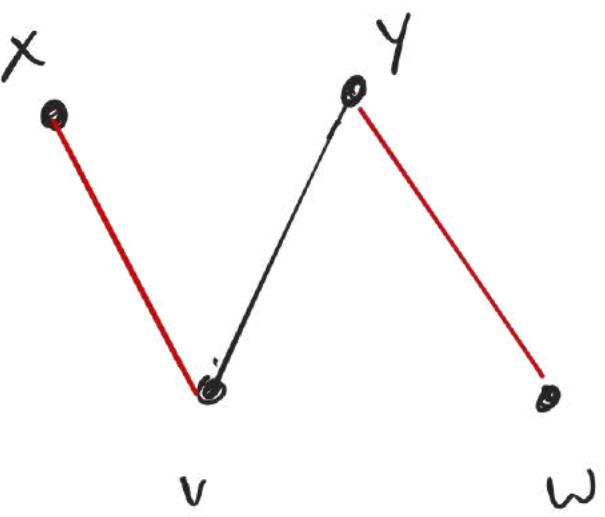
don't have



with

$$x \prec_v y \text{ and}$$

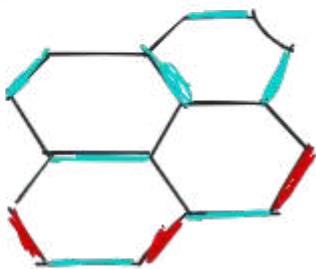
$$w \prec_y v.$$



## Konig's Theorem on maximum matchings

Q: Given  $G = (V, E)$  what is size of maximum matching?

Recall  $M$  maximum  $\iff$   
 $G$  has no  $M$ -aug - path

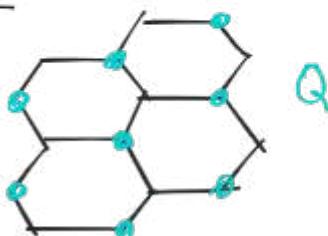


Can use this to find maximum  $M$   
but testing for  $M$ -aug path can be tedious.

Better way:

Defn A vertex cover of  $G = (V, E)$  is  
subset  $Q \subset V$  s.t. every  $e \in E$  has  
at least one endpt in  $Q$ .

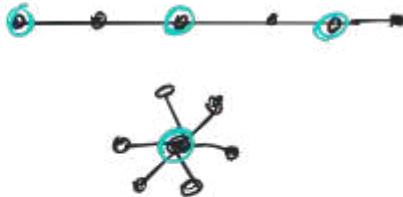
Ex



Note  $Q = V$  is always  
a vertex cover. We're  
interested in small  
covers

Ex Social network

efficient way to  
spread a message.



Connection to matchings

Lemma  $M$  max matching of  $G$ .

Then (i) every vertex cover  $Q \subset V$   
has  $\geq |M|$  vertices

(ii)  $\exists$  vertex cover w/  $2|M|$   
vertices

Proof

(i) For each  $e \in M$   $\geq 1$  endpoint in  $Q$   
so  $|Q| \geq |M|$ . (no  $e, e' \in M$   
share endpoint)

(ii) Take  $Q = \text{endpts of edges of } M$ .  
(so  $|Q| = 2|M|$ )

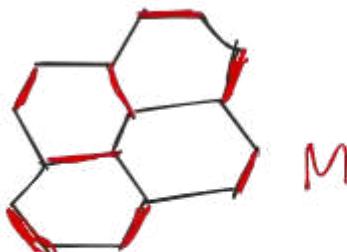
$Q$  is vertex cover:

For  $e \in E$  either one of both endpt  
saturated by  $M$ , since  $M$  maximum.  $\square$

Eg



$\Rightarrow G$  does not have  
a matching w/  
8 edges.



$\Rightarrow M$  is maximum  
(easy!)

Theorem (König)  $G$  bipartite.

Max size of matching = Min size of  
vertex cover.

Proofs ① Given lemma, main part is to  
show  $G$  has vertex cover w/  $|M|$   
vertices.

② It's important that  $G$  bipartite!

eg



max size matching = 2

min size of vertex cover = 3

③ König's Theorem example of min/max relation.

Consider problems of max matching  
& min vertex cover

to be dual problems

This differs from TONCAS.

Proving min/max relation can save work.

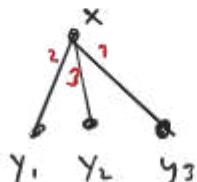
More examples later.

---

## Stable Matchings

setup:  $G = (X \cup Y, E)$  bipartite

For  $v \in V$  given ordering  $\prec_v$  on  $N(v)$



A matching  $M \subseteq E$  is stable if for each edge  $\{x, y\} \notin M$   $\exists$  either

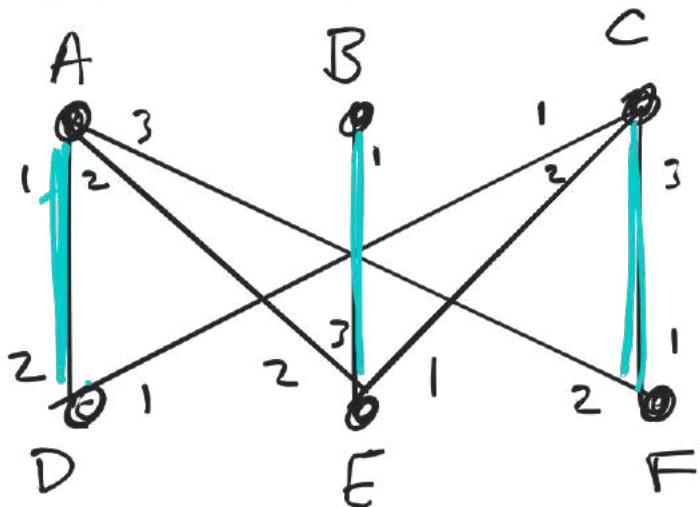
$$\{x, y\} \in M \text{ so } y \prec_x y'$$

$$\text{or } \{x', y\} \in M \text{ so } x \prec_y x'$$

If either  $x$  or  $y$  is matched to someone/thing they prefer more.

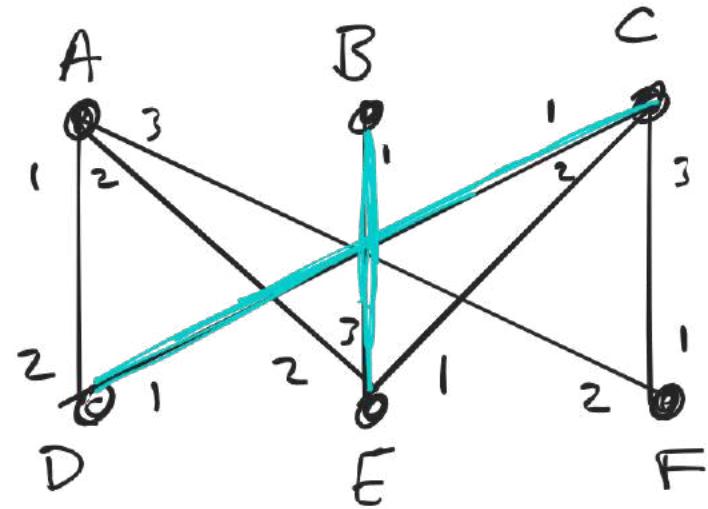
Examples (Add from prev  
lecture)

## Example



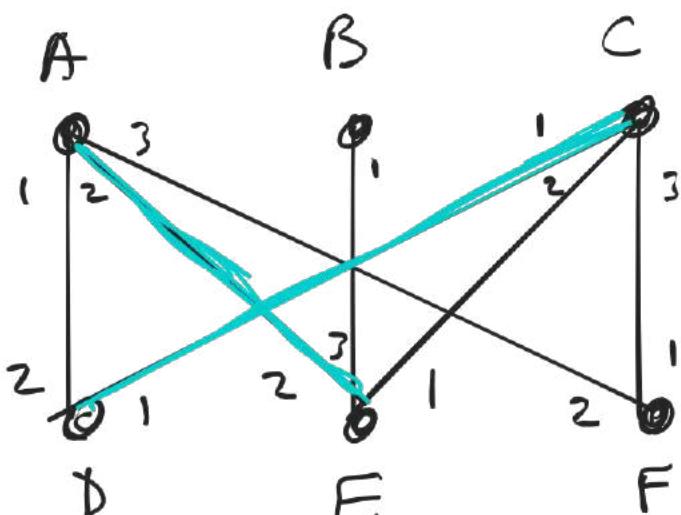
eg Unstable

- D prefers C to A
- C prefers D to F



also unstable

- A prefers E to nothing
- E prefers A to B.



Stable

- eg
  - A prefers D but D prefers C
  - E prefers C but C prefers D.
  - B prefers E but E prefers A.

# Gale-Shapley proposal algorithm

Theorem (Gale-Shapley)

Stable matchings always exist!

Idea

Build stable matching inductively.

- 1st round: each  $x \in X$  proposes to top choice,  $y \in Y$  matches w/  
best offer. Remaining  $x \in X$   
are unmatched.
- Subsequent rounds: each  
unmatched  $x \in X$  proposes to  
top choice they have not yet  
proposed to. Each  $y \in Y$  compares

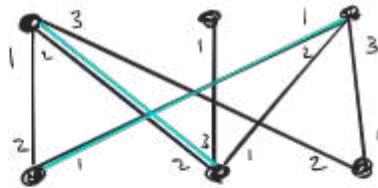
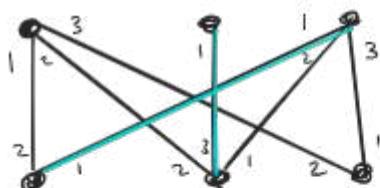
any new offer to previous  
and matches w/ top choice.

Remaining x remain/become  
unmatched.

- Repeat until each  $x \in X$   
either matched or has  
proposed to full list.

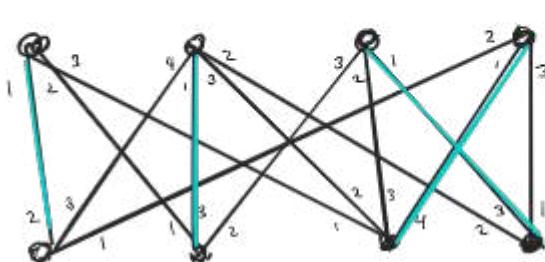
---

### Example



Stage

Example (we algorithm, check it's stable)



X

X proposes

Y

Y proposes

## Features

- algorithm stops :  
at most  $|E|$  proposals made,  
none made twice

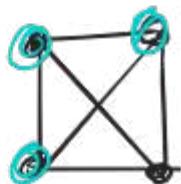
- Matching is end stable
- proposers end up w/  
best possible match  
(among all stable matchings) and  
proposees get worst possible  
match

Rank algorithm used for  
med school residencies.

## König's Thm

Recall  $G = (V, E)$ . A vertex cover is  
 $Q \subset V$  s.t. every edge has  $\geq 1$  endpoint in  $Q$ .

Ex  $G = K_n$



Every two vertices connected by edge  $\Rightarrow$  a vertex cover must have  $\geq n-1$  vertices

Thm (König)  $G$  bipartite.

min size of vertex cover = max size of matching.

Last time:  $\geq$  (each edge of  $M$  has  $\geq 1$  endpoint in  $Q$ )

Ex  $G = K_n$  max size of matching is  $\left\lfloor \frac{n}{2} \right\rfloor$   
(generally max size is  $\leq \frac{n}{2}$ )

So in general diff. b/wn  
min vertex cov size & max matching size  
Can be arb. large.

Proof  $G = (X \cup Y, E)$

Fix  $M \subseteq E$  maximum matching.

WTF: vertex cover  $Q \Leftrightarrow |M|$  vertices

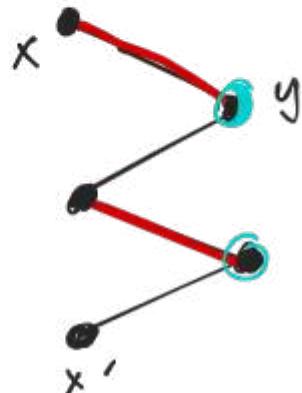
idea <sup>try to</sup> use one vertex from each edge of  $M$

Fix  $e = \{x, y\} \in M$ . How to decide:  
 $x \in Q \text{ or } y \in Q?$

Case 1:  $\exists$  alternating path from unsaturated  
 $x' \in X$  ending in edge  $e$ .

Then choose  $y \in Q$ .

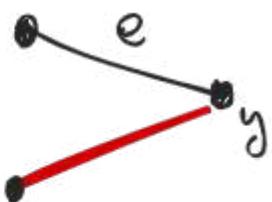
Case 2 Otherwise  $x \in Q$ .



Check  $Q$  is a vertex cover.

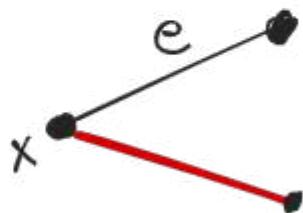
Fix edge  $e = \{x, y\} \in E$ . If  $e \in M$ , we  
If  $e \notin M$ , one endpt is saturated.

case



by defn,  $y \in Q$ .  $\checkmark$

case

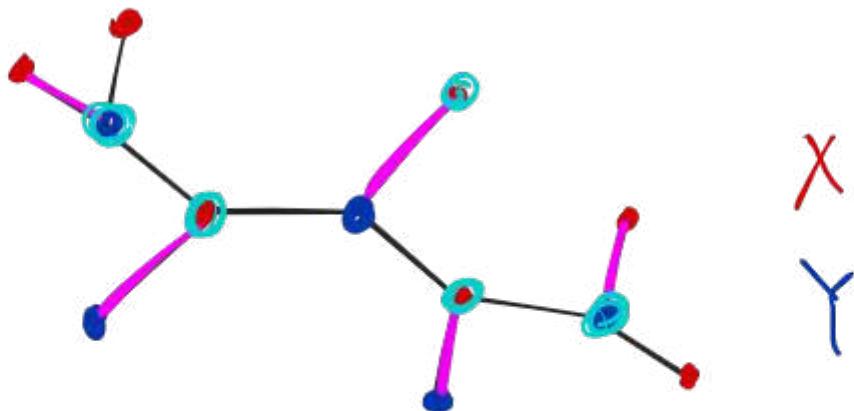


$x \in Q$

$(M \text{ maximum})$   
 $\Rightarrow \nexists \text{ Aug path}$

$\square$

Ex



Application:

Hall's Thm  $G = (X \cup Y, E)$  has matching

Saturating  $X \iff |S| \leq |N(S)| \quad \forall S \subseteq X$ .

## Proof of ( $\Leftarrow$ ) using König

By contrapositive. Let  $M$  be a maximum matching. Suppose it doesn't saturate  $X$ .

Let  $Q$  be a min vertex cover.

$$|Q| = |M| < |X|.$$

$$|Q| = |Q \cap X| + |Q \cap Y|$$

Observe all edges from  $x \in X \setminus Q$

land in  $Q \cap Y$  since  $Q$  vertex cover.

Ie for  $S = X \setminus Q$ ,  $N(S) \subset Q \cap Y$ .

$$|S| = |X \setminus Q| = |X| - |X \cap Q| > |Q \cap Y| \geq |N(S)|$$

□

## Gale-Shapley Theorem

Given bipartite  $G = (X \cup Y, E)$  with preferences

A matching  $M \subseteq E$

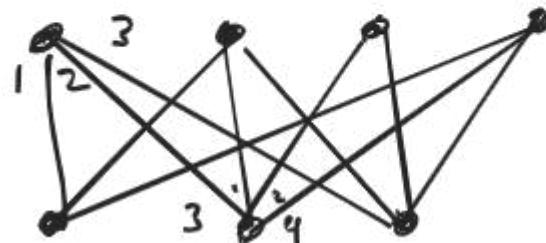
is stable if never have  $\{x, y\} \in E$  st

- $x$  prefers  $y$  to  $x$ 's match and  $y$  prefers  $x$  to  $y$ 's match.
- $x$  unmatched and  $y$  prefers  $x$  to  $y$ 's match. Same switching  $x, y$ .
- $x, y$  both unmatched.

Thm (Gale-Shapley) For any

bipartite  $G$  w/ preferences,  $\exists$  stable matching.

Proof by construction



Short Summary of proposal algorithm  
Vertices in  $X$  propose to top  
choice that they haven't proposed to.  
Vertices in  $Y$  accept their best offer.  
Stop when all  $x \in X$  matched or  
have no more proposals to make.

(all this matching  $M_X$ )

Claim  $M_X$  is stable.

Key property if  $\{x, y\} \in M_X$  then  
 $x$  has been rejected by each  $y' \in Y$   
that  $x$  prefers. Also  $y$  has not been  
proposed to by any  $x' \in X$  that  $y$  prefers.

---

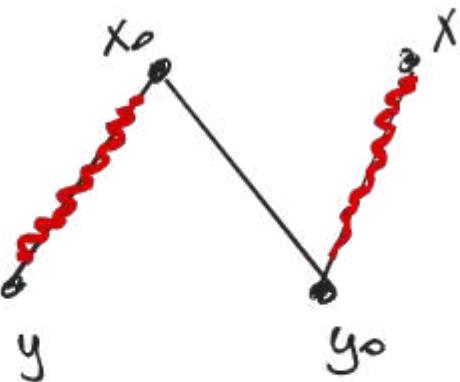
Proof of claim Fix  $\{x_0, y_0\} \in E \setminus M_X$

There are several cases

- $x_0, y_0$  both matched  
if  $x_0$  prefers  $y_0$  to  $y$   
(o.w. we're done)  
then  $x_0$  was rejected  
by  $y_0$  which means

$y_0$  rejected  $x_0$ , so  $y_0$  prefers  $x$  to  $x_0$ .

- other cases similar.




---

## Further properties / comments

- (1) Can't cheat algorithm by lying.  
eg if  $x \in X$  puts #1 choice at bottom  
of list that pairing becomes less likely.  
as it gives all  $x$ 's other choices a  
chance to accept first.

(2) Algorithm optimal for proposers

let  $M$  any other stable matching.

For each  $x \in X$  if  $x$  paired w/

$y$  in  $M_x$  and  $y' \in M$  then

$x$  prefers  $y$  to  $y'$ . ( $\text{or } y=y'$ )

Proof Sketch

By contradiction. Suppose  $\exists M$ ,

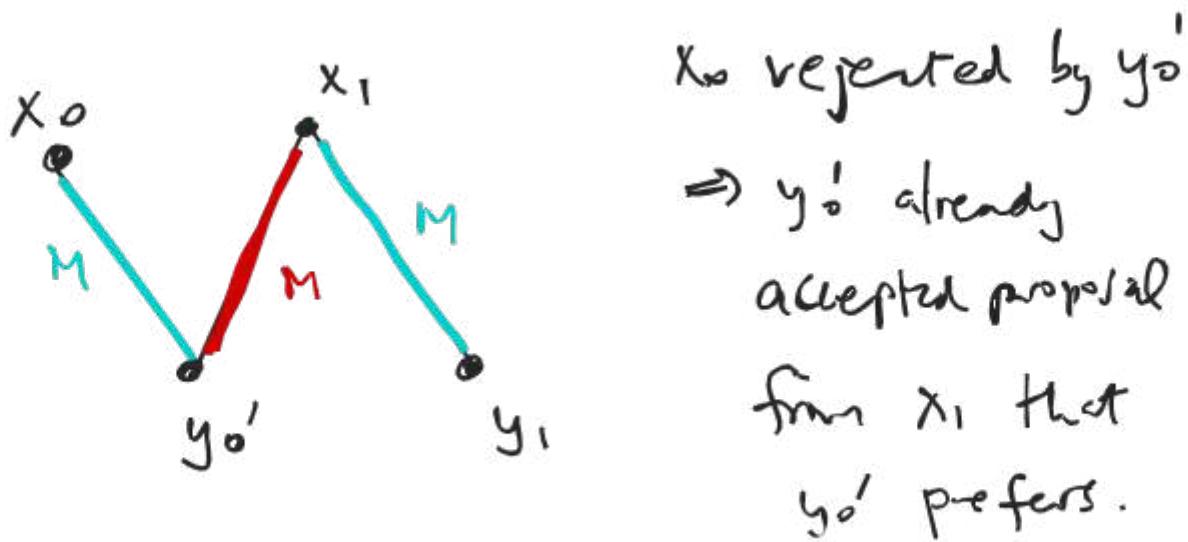
$x_0 \in X$ ,  $\{x_0, y_0\} \in M_x$   $\{x_0, y'_0\} \in M$ ,

and  $x_0$  prefers  $y'_0$  to  $y_0$ .

There may be many  $x$ 's like this

Choose  $x_0$  that is rejected by

corresponding  $y'_0$  earliest in proposal algorithm.



$\{x_0, y_0'\} \in M$  and  $y_0'$  prefers  $x_1$ ,  
 and  $M$  stable  $\Rightarrow \{x_1, y_1\} \in M$  with  
 $x_1$  preferring  $y_1$  to  $y_0'$ .

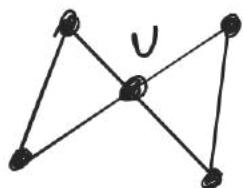
$\{x_1, y_1\} \notin M \Rightarrow x_1$  rejected by  $y_1$ .  
 This happened before  $x_1$  proposed to  $y_0'$   
 and hence before  $y_0'$  rejected  $x_0$ .

(3) This algorithm used for  
 med school residency matching.  
 Initially w/ schools proposing.  
 Later switched to students proposing.  
 (algorithm ethics / bias)

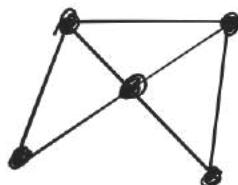
# I. Graph Connectivity

"Some graphs are more connected than others"

Ex



vs

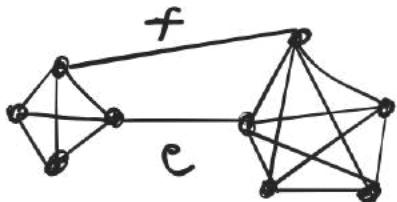


$G \setminus v$  disconnected

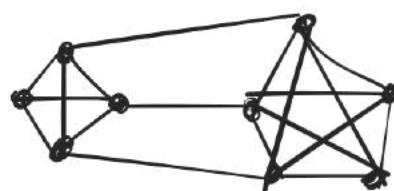
$G \setminus v$  connected

$\forall v \in V$

Ex



vs



$G \setminus \{e, f\}$

disconnected

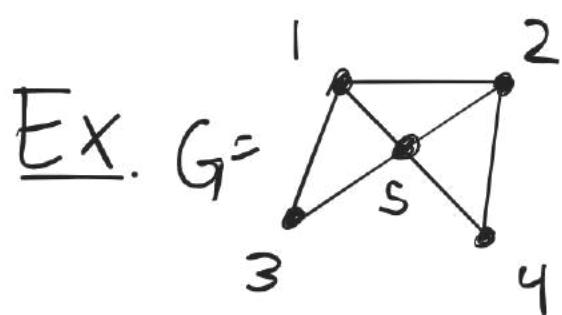
$G \setminus \{e, f\}$

Connected  $\forall e, f \in E$

Defn A vertex cut of  $G = (V, E)$

is subset  $S \subset V$  st.  $G \setminus S$  disconnected

The vertex connectivity  $\kappa(G)$  is  
the smallest size of a vertex cut.



$S = \{1, 5\}$  is  
vertex cut

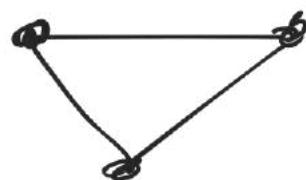
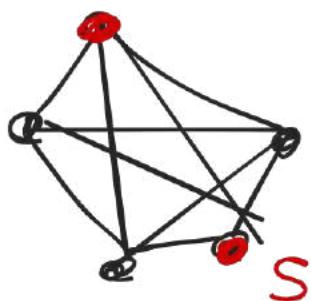
$S = \{3, 4\}$  not  
vertex cut

Since  $G \setminus \{v\}$  connected  $\forall v$

$$k(G) = 2.$$

Ex  $G = K_n$  For any  $S \subset V$

$$K_n \setminus S \cong K_{n-|S|}$$



So  $k(K_n) = \dots$  (what's min of  
empty set?)

Leave  $k(K_n)$  undefined for now.

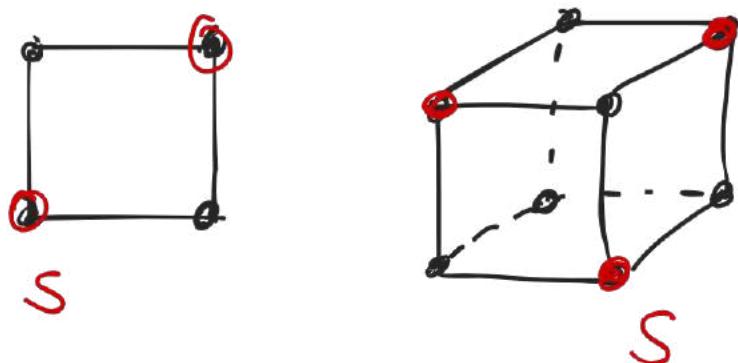
Lemma Fix  $G = (V, E)$ . If  $G \neq K_n$ ,  
then  $G$  has a vertex cut.

Pf.  $G \neq K_n \Rightarrow \exists u, v \in V$

s.t.  $\{u, v\} \notin E$ . Take  $S = V \setminus \{u, v\}$ .

Then  $G \setminus S = \begin{matrix} \bullet & \bullet \\ u & v \end{matrix}$  □

Ex  $k(Q_n) = n$

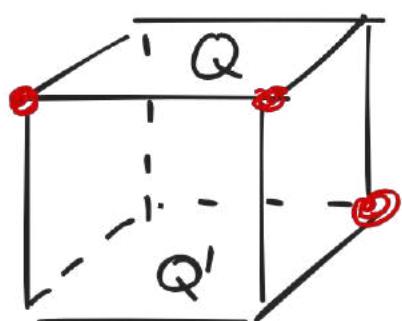


$Q_n$  has vertex cut obtained by  
removing all neighbors of  $(0, \dots, 0)$

There are  $n$ . Thus  $k(Q_n) \leq n$

Harder: any vertex cut has at least  $n$  vertices.

Prove this by induction on  $n$ .



$$Q \cong Q_{n-1} \cong Q'$$

(cf. HW4 # 2)

Induction step Fix vertex cover  $S$  of  $Q_n$ .

Case 1  $Q \cap S, Q' \cap S$  both connected

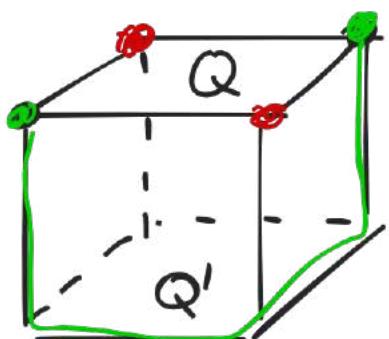
Then  $S$  must contain one vertex from each edge connecting  $Q, Q'$

$$\Rightarrow |S| \geq 2^k$$

Case 2 (wlog)  $Q \cap S$  disconnected.

Then  $|Q \cap S| \geq n - 1$ .

If  $|Q' \cap S| = 0$  then  $Q \setminus S$



connected

$$\text{so } |Q' \cap S| \geq 1$$

$$\Rightarrow |Q| \geq k. \quad \square$$

### Remarks

① Want effective way to compute  $k(G)$ .

Upper bounds are "easy": to show

$k(G) \leq m$  need only to find

vertex cut of size  $m$ .

Lower bounds are harder.

(Similar to finding size of max matching.)

② Similarly can define edge cuts,  
edge connectivity.

Ex submarine cable map

---

### K-connectedness

Say  $G$  is m-connected if

$k(G) \geq m$  i.e.  $G \setminus S$  connected

for any  $S \subset V$  with  $|S| < m$ .

Eg Every graph is 0-connected.

$\underbrace{1\text{-connected}}_{S=\emptyset \text{ is not}} \iff \underbrace{\text{Connected}}_{\substack{\text{every pair} \\ \text{of vertices}}} \text{Connected by path}$

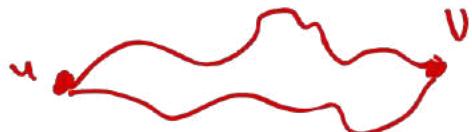
Thm (Whitney) Fix  $G = (V, E)$  w/  $|V| \geq 3$

TFAE

- ① 2-connected
- ②  $\forall u, v \in V \exists 2 \text{ disjoint } \underline{(u, v) \text{-paths}}$  (\*)
- ③  $G$  has an ear decomposition  
(+)      (++)

(\*) paths  $u$  to  $v$  sharing no interior vertices

vertices



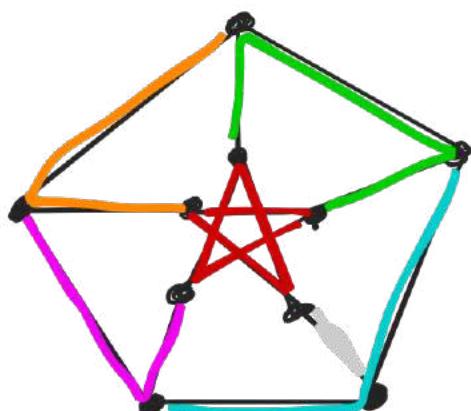
(+) paths whose internal vertices have  $\deg = 2$

(++) obtained from  $C_n$  by adding ears.

eg



eg Petersen graph



Easier  $\textcircled{3} \Rightarrow \textcircled{2} \Rightarrow \textcircled{1}$ . (exercise)

Proof of  $\textcircled{1} \Rightarrow \textcircled{2}$

Assume  $G$  2-connected.

Want : disjoint  $(u,v)$ -paths. for each pair  $u, v \in V$ .

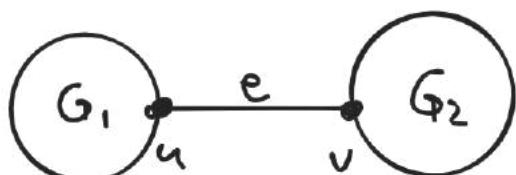
use induction on  $d(u,v)$

base case  $d(u,v) = 1$ .



- Observe that  $G \setminus e$  is connected:

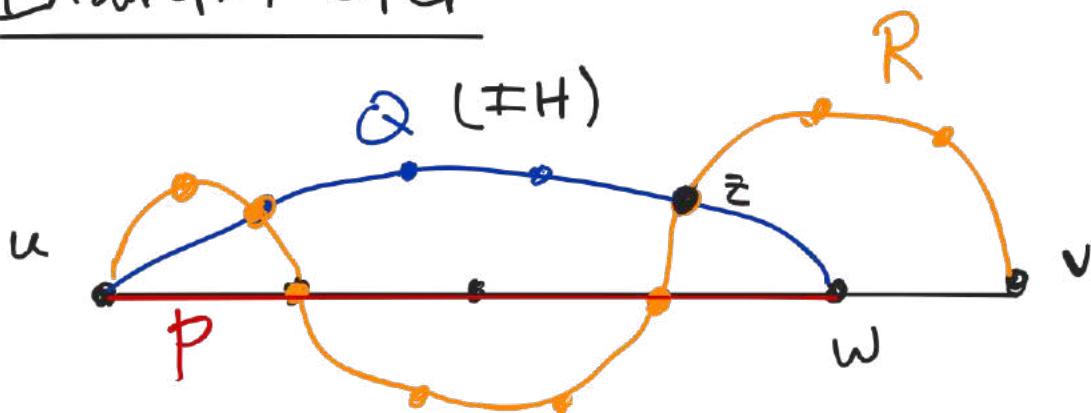
O.W.



wlog  $G_1$  has  $\geq 2$  vertices  $\Rightarrow G \setminus u$  disconnected  $\times$ .

- $G \setminus e$  connected  $\Rightarrow \exists$  disjoint  $(u,v)$  paths.

## Induction Step



$G \setminus w$  connected  $\Rightarrow \exists$  path  $R$  from  $v$  to  $u$  missing  $w$ .

if  $R$  disjoint from  $P$  or  $Q$ , done

else  $z := 1^{\text{st}}$  contact of  $R$  w/  
 $P \cup Q$ . wlog  $z \in Q$ .

define  $P_1 = \text{follow } R \text{ to } z$ , then  
follow  $Q$

$P_2 = v \rightarrow w \rightarrow P$ .

□

Menger's Theorem

$$G = (V, E)$$

$$\kappa(G) = \min \left\{ |S| : S \subset V, G \setminus S \text{ disconnected} \right\}$$

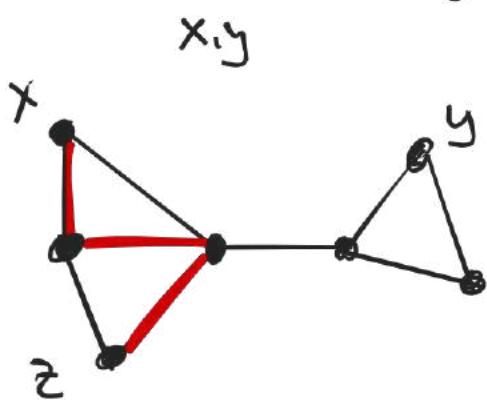
(vertex) connectivity.

For  $x, y \in V$  define  $S \subset V \setminus \{x, y\}$

$$K(x, y) = \min \left\{ |S| : \begin{array}{l} x, y \text{ in diff} \\ \text{comp. of } G \setminus S \end{array} \right\}$$

Then  $k(g) = \min k(x_{ig})$ . cover

eg



(not every path is part of maximum family)

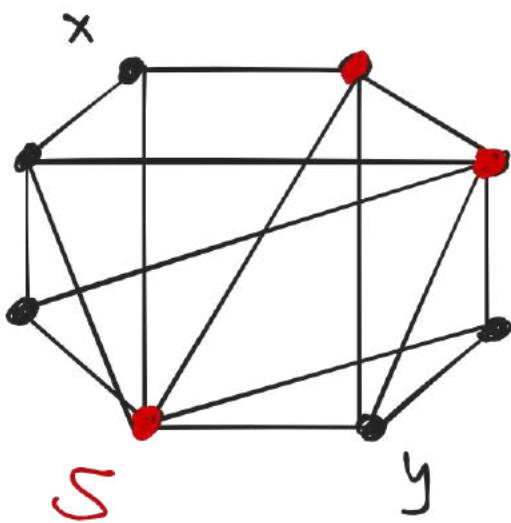
$$k(x,y) = k(z,y) = 1 \quad , \quad k(x,z) = 2.$$

Rmk  $\{x,y\} \in E \Rightarrow k(x,y) = \min(\phi)$ .

As with  $k(G)$  not obvious

how to efficiently compute  $k(x,y)$ .

Ex.



G1S

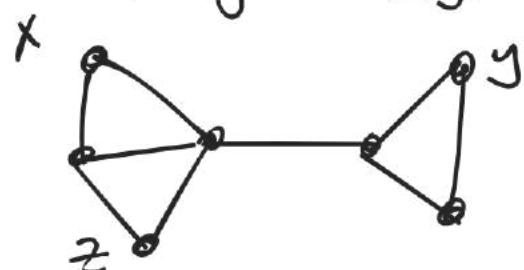
$$\text{so } k(x,y) \leq 3.$$

But how do we show

$$k(x,y) \geq 3 \text{ without casework?}$$

Define  $\lambda(x,y) = \max \# \text{ of pairwise disjoint } (x,y) \text{-paths.}$

In example



$$\lambda(x,y) = 1 = \lambda(z,y), \lambda(x,z) = 2.$$

Thm (Menger) Fix  $G = (V, E)$

$x, y \in V$  s.t.  $\{x, y\} \notin E$ . Then  
 $k(x, y) = \lambda(x, y)$ .

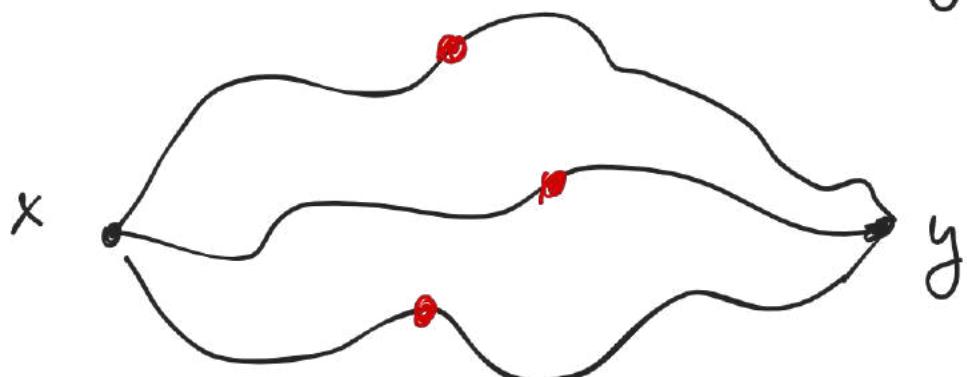
Proofs

(1) This is like König's Thm

max matching  $\leftrightarrow$  min vertex cover

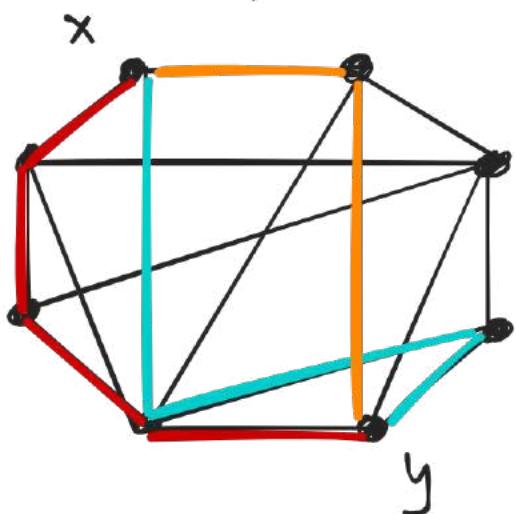
Here max disjoint  $\begin{matrix} \leftrightarrow \\ (x, y)-\text{paths} \end{matrix}$   $\min_{\text{vertex cut.}} \lambda(x, y)$

(2)  $k(x, y) \geq \lambda(x, y)$  easy:



if  $S$  is an  $(x, y)$ -vertex cut  
then  $S$  must meet each path  
from  $x$  to  $y$ .

(3) Example above.  $k(x,y) \leq 3$ .



$$\Rightarrow \lambda(x,y) \geq 3$$

$$\Rightarrow k(x,y) = 3$$

(Menger)

$$(4) k(G) = \min_{x,y} k(x,y) = \min_{x,y} \lambda(x,y)$$

gives way to compute  $k$ .

$$\text{eg } k(Q_3) = 3 \quad (\text{last time})$$

$$k(Q_3) \leq 3 \text{ easy. For } k(Q_3) \geq 3$$

show between any two pts  $\exists$

3 disjoint paths.

