CS70: Discrete Math and Probability

Fan Ye June 28, 2016

Planar non-planar

A finite graph is planar iff it does not contain a subgraph that is (a subdivision of) \mathcal{K}_5 or $\mathcal{K}_{3,3}$

Planar non-planar

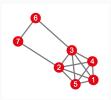
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 K_n complete graph on n vertices.







 K_n complete graph on n vertices. All edges are present.







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Remember sum of degree is 2|E|.

Definitions:

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A connected graph without a cycle.

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A connected graph with |V|-1 edges.

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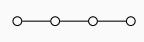
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Some trees.



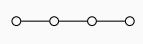


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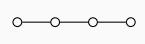


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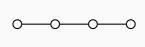
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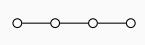
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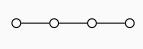


no cycle and connected? Yes. |V|-1 edges and connected? Yes. removing any edge disconnects it.

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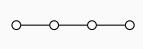
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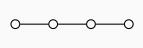
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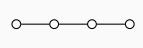
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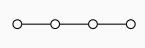
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Theorem:

"G connected and has $|{\it V}|-{\rm 1}$ edges" \equiv "G is connected and has no cycles."

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Lemma: If v is a degree 1 in connected graph G, G - v is connected.

Proof:

For
$$x \neq v, y \neq v \in V$$
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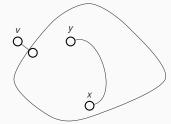
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Equivalence of Definitions.

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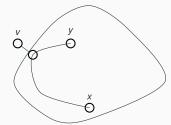
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Thm:

"G connected and has |V|-1 edges" \equiv "G is connected and has no cycles."

Proof of \Longrightarrow :



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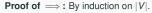
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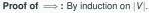
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And no cycle in G since degree 1 cannot participate in cycle.



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Walk from a vertex using untraversed edges.

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Proof of Claim:

Can't visit any vertex more than once since no cycle.

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Entered. Didn't leave.

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New graph is connected.

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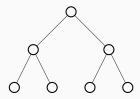
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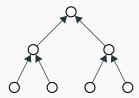
Thm: Can always find a node such that the largest connected component we get by removing it has size at most |V|/2

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Idea of proof.

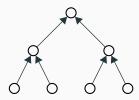
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Idea of proof.

Point edge toward bigger side.

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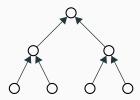


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Point edge toward bigger side.

Remove center node.

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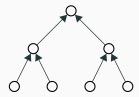
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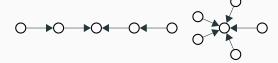
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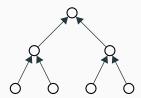
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Tree's fall apart.

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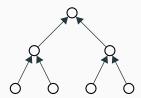






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Complete graphs, really connected!

Complete graphs, really connected! But lots of edges.

$$|V|(|V|-1)/2$$

Complete graphs, really connected! But lots of edges.

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Trees,

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$$|V|(|V|-1)/2$$

Trees, But few edges. (|V|-1)

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Complete graphs, really connected! But lots of edges. \frac{|V|(|V|-1)/2}{\text{Trees, But few edges.}} \left( |V|-1 \right) \\ \text{just falls apart!}
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Hypercubes.

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Hypercubes. Really connected.

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Hypercubes. Really connected. $|V| \log |V|/2$ edges!

just falls apart!

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$$G = (V, E)$$

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$$G = (V, E)$$

 $|V| = \{0, 1\}^n$,

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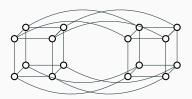
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Restatement: for any cut in the hypercube, the number of cut edges is at least the size of the small side.

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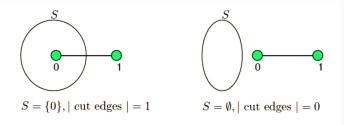
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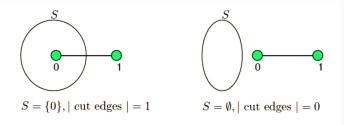


11

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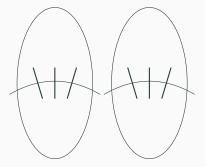
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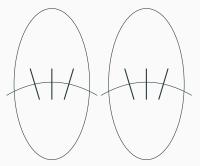
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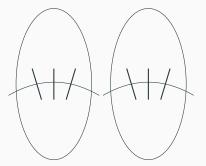


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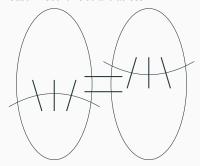
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Proof: Induction Step. Case 2. $|S_0| \ge |V_0|/2$.

$$\begin{split} & \text{Recall Case 1: } |S_0|, |S_1| \leq |V|/2 \\ |S_1| \leq |V_1|/2 \text{ since } |S| \leq |V|/2. \\ & \Longrightarrow \geq |S_1| \text{ edges cut in } E_1. \\ |S_0| \geq |V_0|/2 \Longrightarrow |V_0 - S| \leq |V_0|/2 \\ & \Longrightarrow \geq |V_0| - |S_0| \text{ edges cut in } E_0. \end{split}$$

Edges in E_x connect corresponding nodes.

$$\implies \ge |S_0| - |S_1|$$
 edges cut in E_x .

$$\geq |S_1| + |V_0| - |S_0|$$

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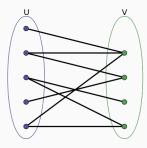
Edges in E_x connect corresponding nodes.

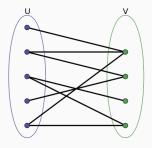
$$\implies \ge |S_0| - |S_1|$$
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Total edges cut:

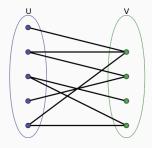
$$\geq |S_1| + |V_0| - |S_0| + |S_0| - |S_1| = |V_0| |V_0| = |V|/2 \geq |S|.$$

Also, case 3 where $|S_1| \ge |V|/2$ is symmetric.

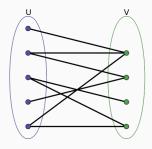




Bipartite graph:

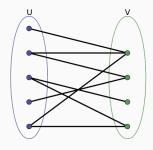


Bipartite graph: a bipartite graph is a graph whose vertices can be divided into two disjoint sets U and V such that every edge connects a vertex in U to one in V.



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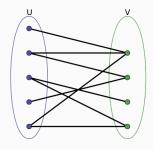
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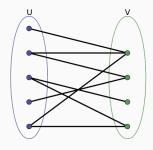
Coloring?



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Coloring? How many colors do we need?



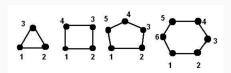
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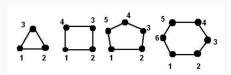
Coloring? How many colors do we need? 2!

Which of the following graphs are bipartite?

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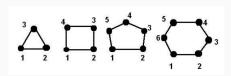


Which of the following graphs are bipartite?



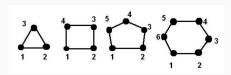
No

Which of the following graphs are bipartite?



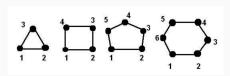
No Yes

Which of the following graphs are bipartite?



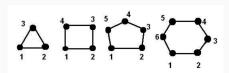
No Yes No

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No Yes No Yes

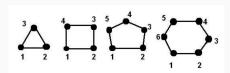
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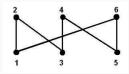
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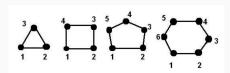


No Yes No Yes

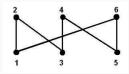


A graph is a bipartite graph if and only if it does not contain any odd-length cycles.

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No Yes No Yes



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Only if: trivial

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Start at a node v in one part, say V, the cycle must be like leaving V, entering V, . . .

Only if: trivial

Start at a node ν in one part, say V, the cycle must be like leaving V, entering V, ... Also the cycle must end at ν , so the cycle must end with "entering V".

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We have a bipartite graph if A and B are disjoint.

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We have a bipartite graph if A and B are disjoint.

What if a vertex in both sets? Odd length cycle! Contradiction

Graphs!

Graphs!

Eulerian tour:

Graphs!

Eulerian tour: DNA sequence reconstructing

Graphs!

Eulerian tour: DNA sequence reconstructing

Coloring:

Graphs!

Eulerian tour: DNA sequence reconstructing

Coloring: Cellular tower frequency assignment

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Trees: Immense applications.......

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Trees: Immense applications.......

Modeling reality:

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Modeling reality:

Internet?

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