## 15-251

# Great Theoretical Ideas in Computer Science

#### **Upcoming Events**

Review Session on Saturday (5 pm, Wean 5409)

**Test on Monday** 

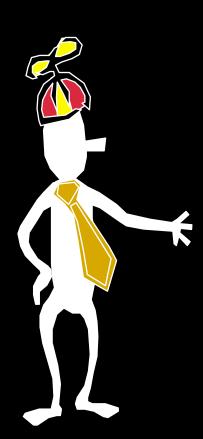
**Election Day** 

## Graphs

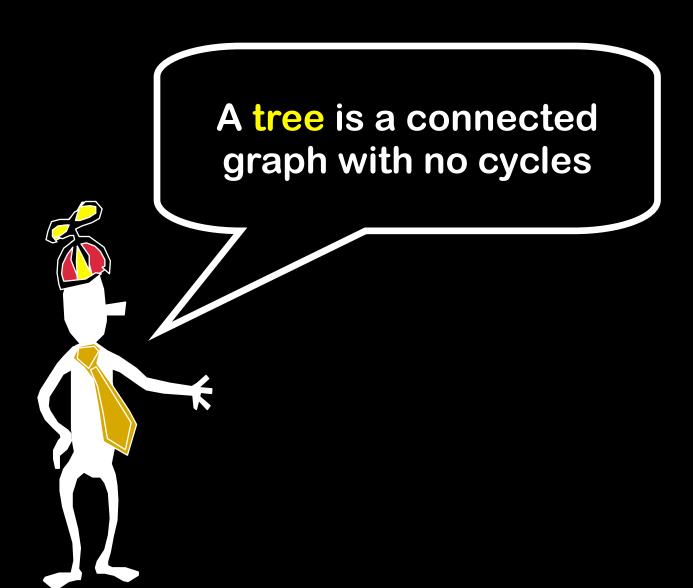
**Lecture 18, October 23, 2008** 

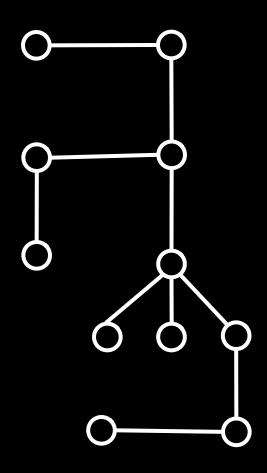


#### What's a tree?

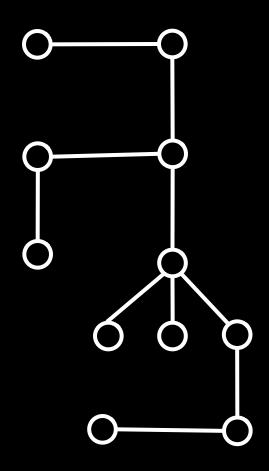


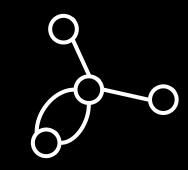
#### What's a tree?



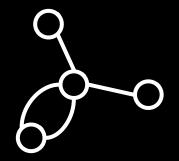


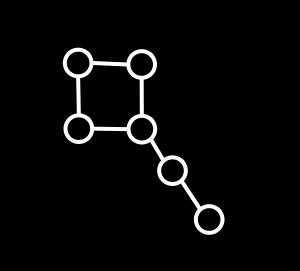
#### Tree



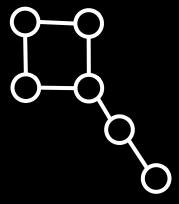


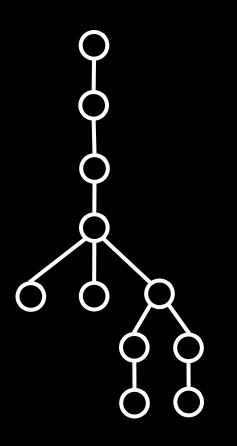
#### Not aTree



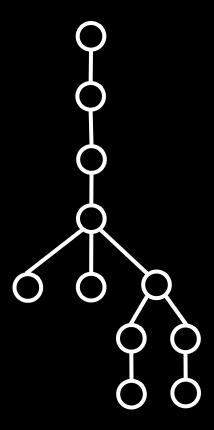


#### Not a Tree





#### Tree



1:

**1**: O

1: 0

2:

1: 0

2: 0—0

**1**: O

2: 0—0

3:

1: O

2: 0—0

3: O—O—O

**1**: O

2: 0—0

3: O—O—O

4:

1: 0

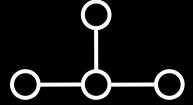
2: 0—0

3: 0—0—0

4: 0-0-0

- **1**: O
- **2**: O—O
- 3: O—O—O



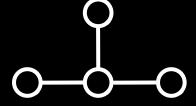


1: O

**2**: O—O

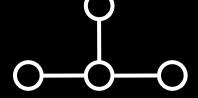
3: O—O—O





5:

- 1: O
- 2: 0—0
- 3: O—O—O



5: 0—0—0—0

1: O

2: 0-0

3: 0—0—0

4: 0—0—0 0—0—0

5: 0-0-0-0-0

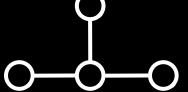
1: O

2: 0—0

3: 0—0—0

4: 0—0—0

5: 0—0—0—0



We'll pass around a piece of paper. Draw a new 8-node tree, and put your name next to it. (There are 23 of them...)

#### The Shy People Party

At the shy people party, people enter one-by-one, and as a person comes in, (s)he shakes hand with only one person already at the party.

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At the shy people party, people enter one-by-one, and as a person comes in, (s)he shakes hand with only one person already at the party.

Prove that at a shy party with n people (n >= 2), at least two people have shaken hands with only one other person.

#### **The Shy People Party**

In this lecture:

In this lecture:

n will denote the number of nodes in a graph

In this lecture:

n will denote the number of nodes in a graph e will denote the number of edges in a graph Theorem: Let G be a graph with n nodes and e edges

The following are equivalent:

1. G is a tree (connected, acyclic)

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- 2. Every two nodes of G are joined by a unique path
- 3. G is connected and n = e + 1
- 4. G is acyclic and n = e + 1
- 5. G is acyclic and if any two non-adjacent points are joined by a line, the resulting graph has exactly one cycle

## To prove this, it suffices to show

- $1 \Rightarrow 2$  1. G is a tree (connected, acyclic)
  - 2. Every two nodes of G are joined by a unique path

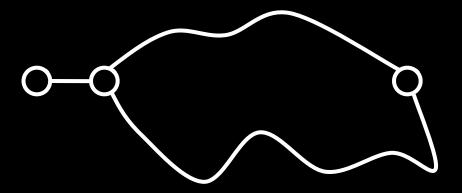
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Assume G is a tree that has two nodes connected by two different paths:

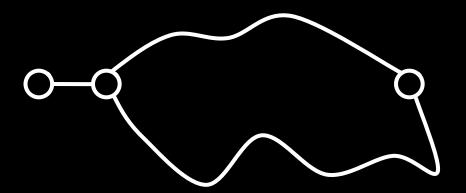
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Then there exists a cycle!

- 2 => 3 2. Every two nodes of G are joined by a unique path
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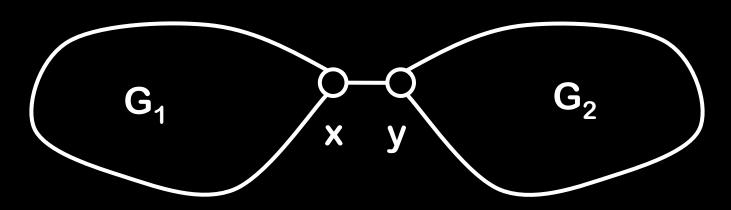
Assume true for every graph with < n nodes

Let G have n nodes and let x and y be adjacent

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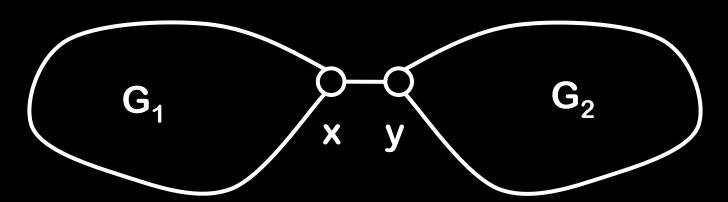
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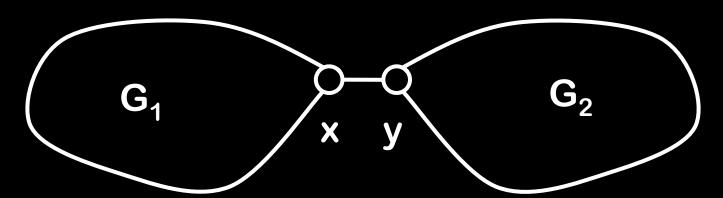


Let n<sub>1</sub>,e<sub>1</sub> be number of nodes and edges in G<sub>1</sub>

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Assume true for every graph with < n nodes

Let G have n nodes and let x and y be adjacent



Let  $n_1, e_1$  be number of nodes and edges in  $G_1$ Then  $n = n_1 + n_2 = e_1 + e_2 + 2 = e + 1$  3 = 4 3. G is connected and n = e + 1

4. G is acyclic and n = e + 1

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**Proof: (by contradiction)** 

3 = 4 3. G is connected and n = e + 1

4. G is acyclic and n = e + 1

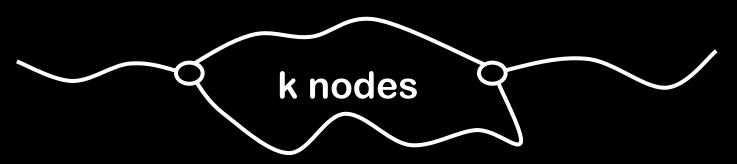
**Proof: (by contradiction)** 

Assume G is connected with n = e + 1, and G has a cycle containing k nodes

4. G is acyclic and n = e + 1

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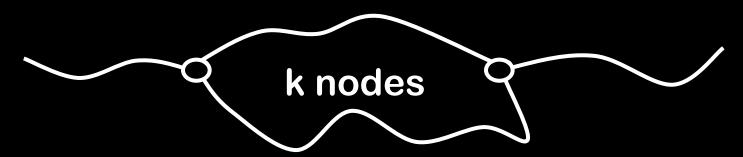
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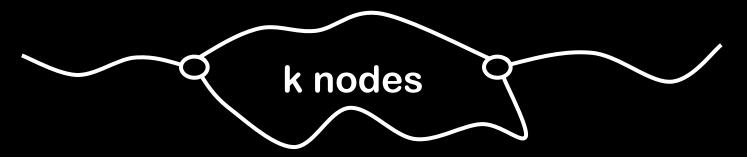


Note that the cycle has k nodes and k edges

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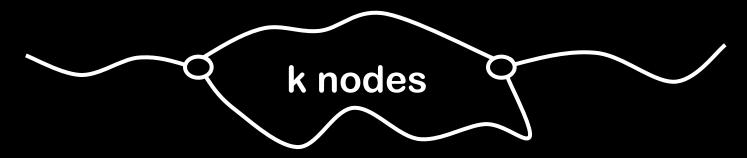
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Start adding nodes and edges until you cover the whole graph

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Assume G is connected with n = e + 1, and G has a cycle containing k nodes



Note that the cycle has k nodes and k edges

Start adding nodes and edges until you cover the whole graph

Number of edges in the graph will be at least n

**Proof:** 

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Assume all but one of the points in the tree have degree at least 2

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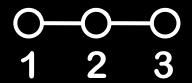
In any graph, sum of the degrees = 2e

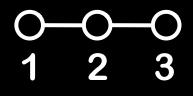
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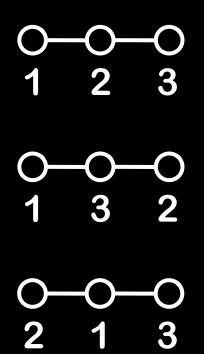
In any graph, sum of the degrees = 2e

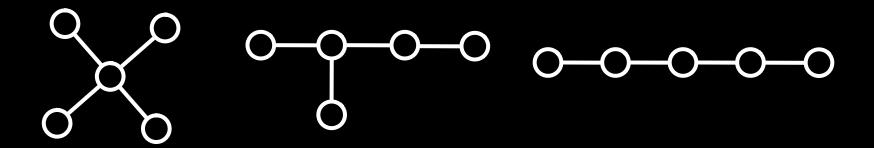
Then the total number of edges in the tree is at least (2n-1)/2 = n - 1/2 > n - 1

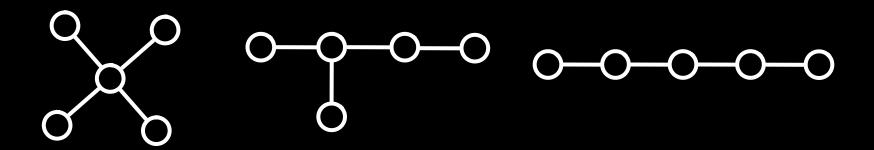




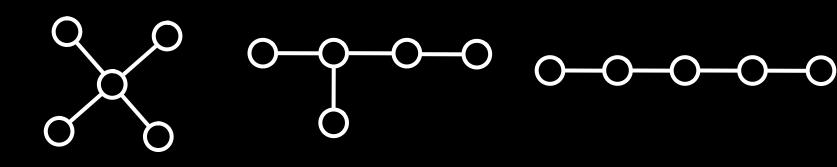








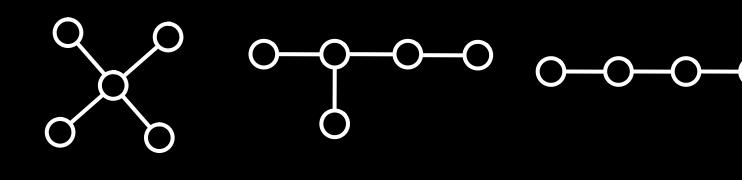
5 labelings



5 labelings

 $5 \times 4 \times 3$ 

labelings



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 $5 \times 4 \times 3$ 

5!/2

labelings

labelings

125 labeled trees

3 labeled trees with 3 nodes

3 labeled trees with 3 nodes

16 labeled trees with 4 nodes

3 labeled trees with 3 nodes

16 labeled trees with 4 nodes

125 labeled trees with 5 nodes

3 labeled trees with 3 nodes

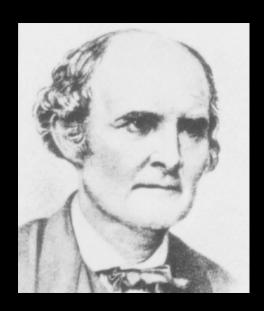
16 labeled trees with 4 nodes

125 labeled trees with 5 nodes

n<sup>n-2</sup> labeled trees with n nodes

#### Cayley's Formula

The number of labeled trees on n nodes is n<sup>n-2</sup>



The proof will use the correspondence principle

#### The proof will use the correspondence principle

Each labeled tree on n nodes corresponds to

A sequence in {1,2,...,n}<sup>n-2</sup> (that is, n-2 numbers, each in the range [1..n])

How to make a sequence from a tree?

Let L be the degree-1 node with the lowest label

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Define the i<sup>th</sup> element of the sequence as the label of the node adjacent to L

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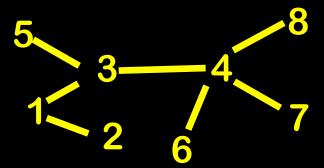
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Delete the node L from the tree

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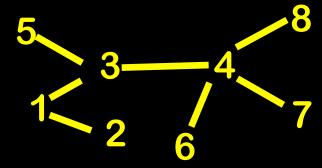
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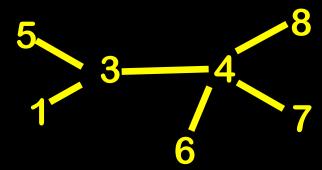
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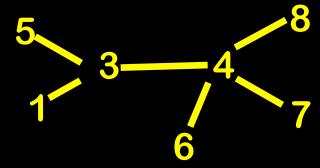


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**Example:** 



1 3

How to make a sequence from a tree?

Loop through i from 1 to n-2

Let L be the degree-1 node with the lowest label

Define the i<sup>th</sup> element of the sequence as the label of the node adjacent to L

Delete the node L from the tree

Example: 5

1 3

Let L be the degree-1 node with the lowest label

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Example: 5 3 4 7 6

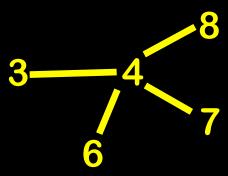
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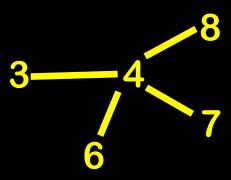
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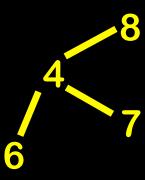
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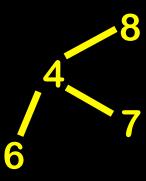
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#### How to reconstruct the unique tree from a sequence S:

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Let  $I = \{1, 2, 3, ..., n\}$ 

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Loop until S is empty

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Loop until S is empty

Let i = smallest # in I but not in S

Let s = first label in sequence S

Add edge {i, s} to the tree

Delete i from I

Delete s from S

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Add edge  $\{a,b\}$ , where  $I = \{a,b\}$ 

Let 
$$I = \{1, 2, 3, ..., n\}$$

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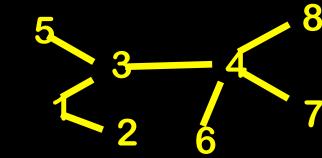
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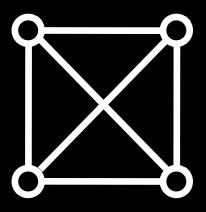
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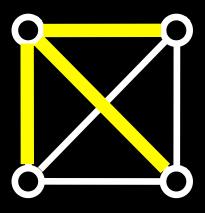
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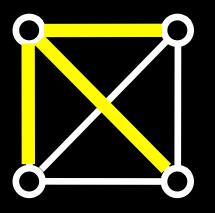
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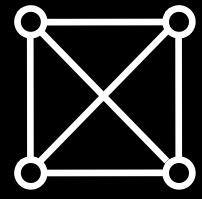


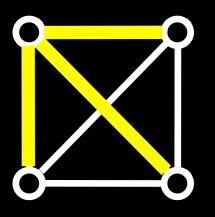
1 3 3 4 4 4

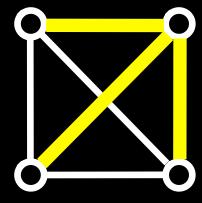




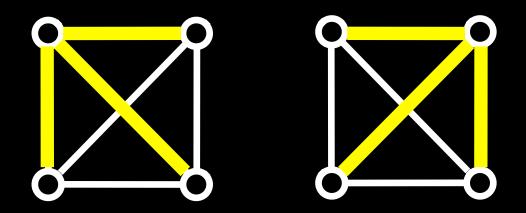






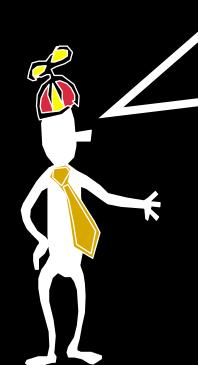


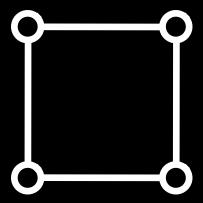
A spanning tree of a graph G is a tree that touches every node of G and uses only edges from G

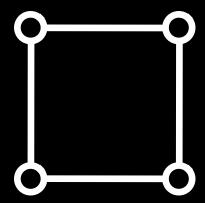


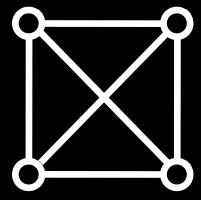
Every connected graph has a spanning tree

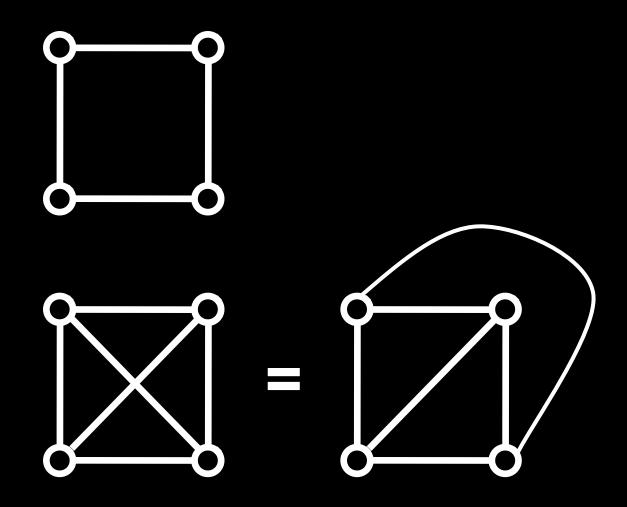
A graph is planar if it can be drawn in the plane without crossing edges





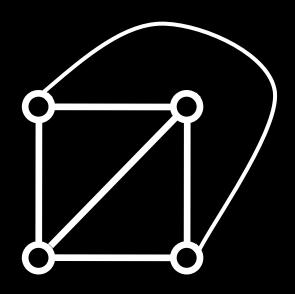






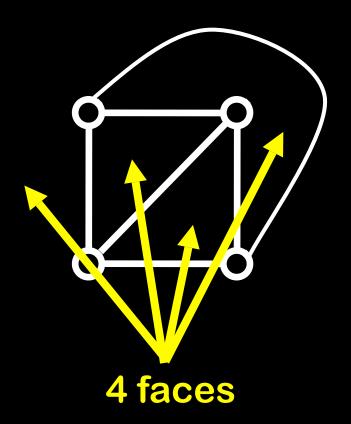
#### http://www.planarity.net

## Faces



#### Faces

A planar graph splits the plane into disjoint faces



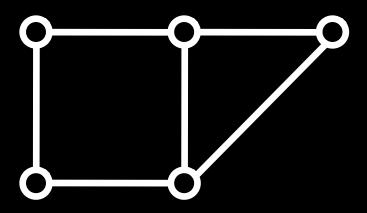
#### Faces

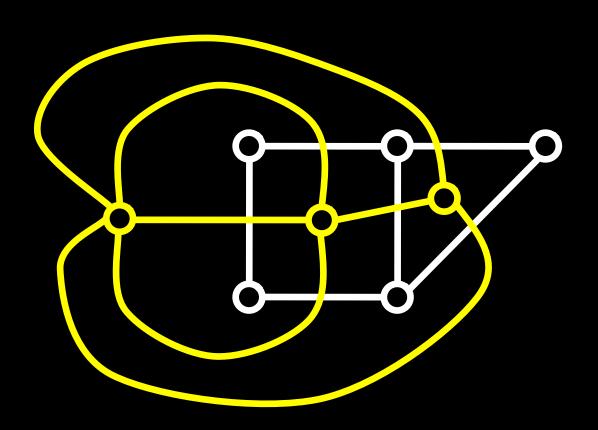
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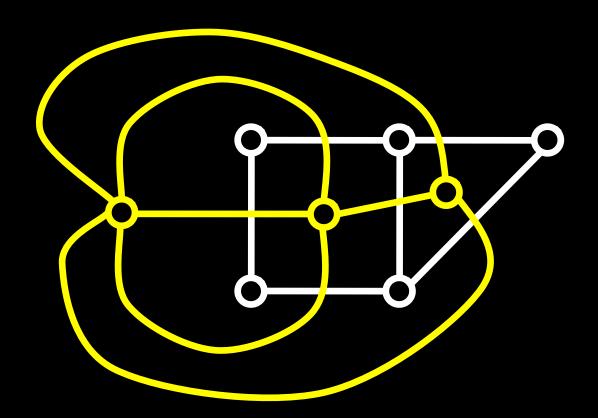
#### Euler's Formula

If G is a connected planar graph with n vertices, e edges and f faces, then n-e+f=2

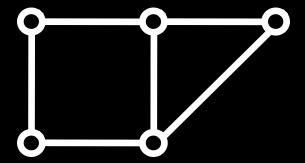


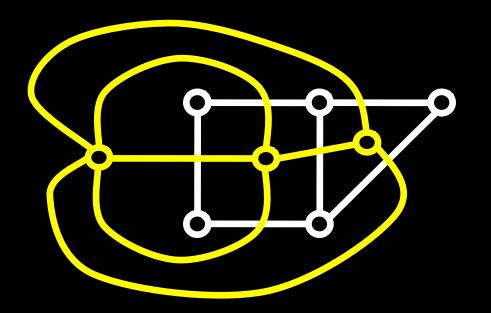


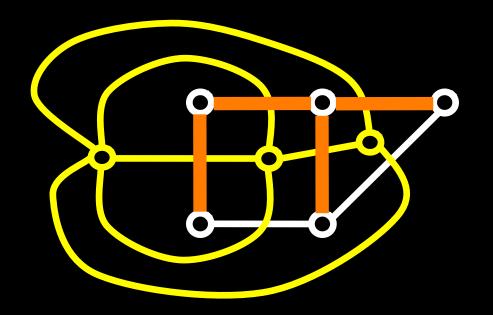




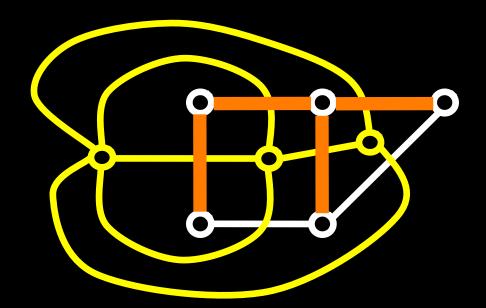
Dual = put a node in every face, and an edge between every adjacent face





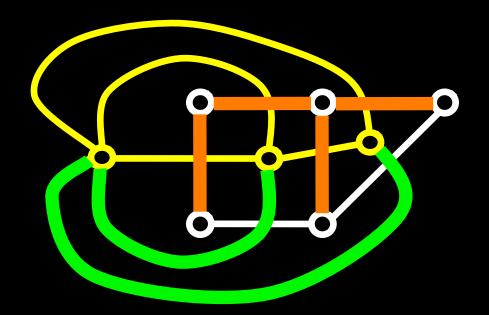


Let T be a spanning tree of G



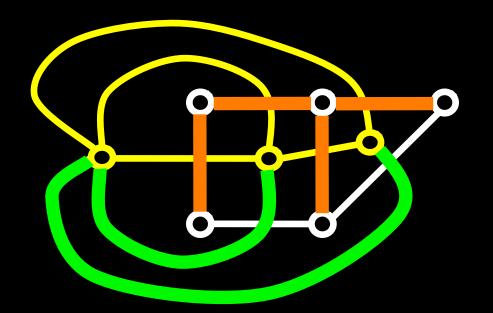
Let T be a spanning tree of G

Let T\* be the graph where there is an edge in dual graph for each edge in G – T



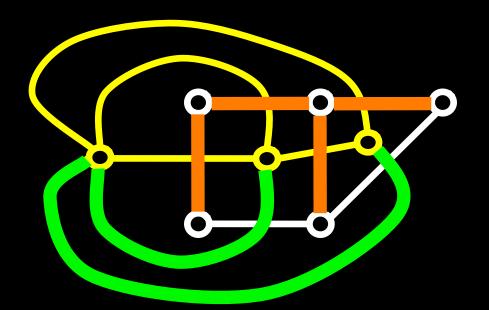
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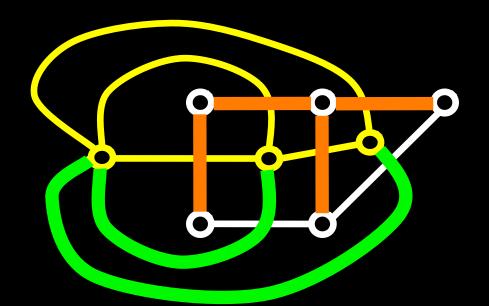
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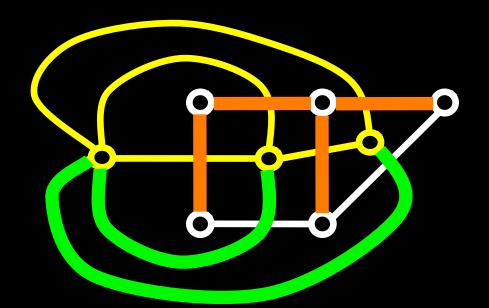
$$n = e_T + 1$$



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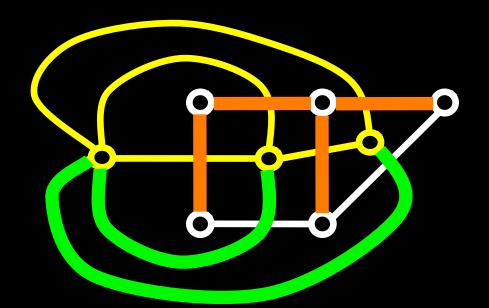
$$n = e_T + 1$$
  
 $f = e_{T*} + 1$ 



Let T be a spanning tree of G

Let T\* be the graph where there is an edge in dual graph for each edge in G – T

$$n = e_T + 1$$
  $n + f = e_T + e_{T^*} + 2$   
 $f = e_{T^*} + 1$ 



Let T be a spanning tree of G

Let T\* be the graph where there is an edge in dual graph for each edge in G – T

$$n = e_T + 1$$
  $n + f = e_T + e_{T^*} + 2$   
 $f = e_{T^*} + 1$   $= e + 2$ 

Corollary: Let G be a simple planar graph with n > 2 vertices. Then:

1. G has a vertex of degree at most 5

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- 2. G has at most 3n 6 edges

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In any graph, (sum of degrees) = 2e

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Then  $e \ge 3n$ 

Furthermore, since G is simple, 3f ≤ 2e

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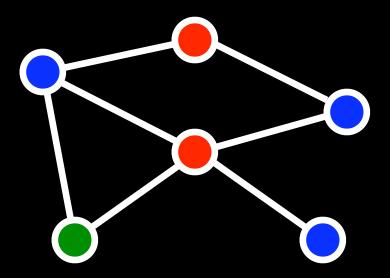
Then  $e \ge 3n$ 

Furthermore, since G is simple, 3f ≤ 2e

So  $3n + 3f \le 3e \Rightarrow 3(n-e+f) \le 0$ , contradiction.

A coloring of a graph is an assignment of a color to each vertex such that no neighboring vertices have the same color

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Arises surprisingly often in CS

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Register allocation: assign temporary variables to registers for scheduling instructions. Variables that interfere, or are simultaneously active, cannot be assigned to the same register

### Instructions

Live variables

a

$$b = a+2$$

a,b

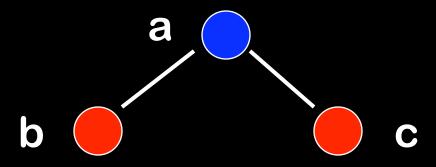
$$c = b*b$$

a,c

$$b = c+1$$

a,b

return a\*b



**Proof Sketch (by induction):** 

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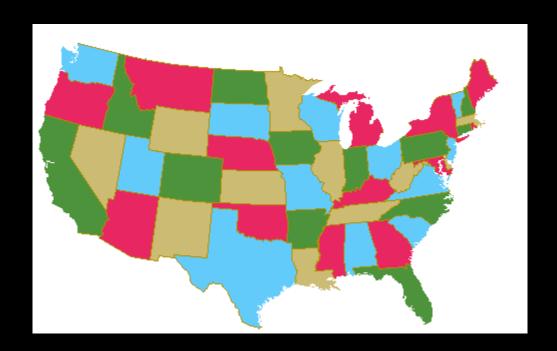
Since G is planar, it has some node v with degree at most 5

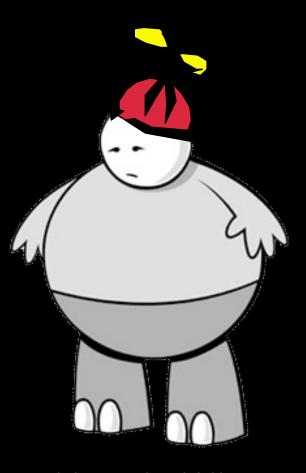
Remove v and color by Induction Hypothesis

Not too difficult to give an inductive proof of 5-colorability, using same fact that some vertex has degree  $\leq 5$ 

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4-color theorem remains challenging!





Here's What You Need to Know...

## **Trees**

- Counting Trees
- Different Characterizations
- Cayley's formula

## **Planar Graphs**

- Definition
- Euler's Theorem
- Coloring Planar Graphs