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(A) Algorithm.

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(B) Well ordering principle.

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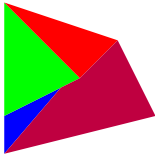
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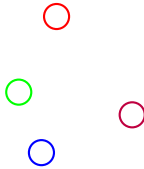
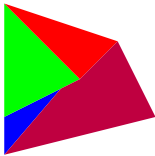
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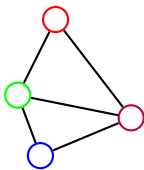
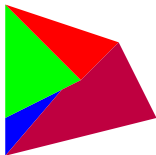
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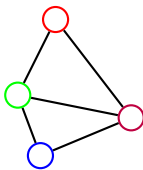
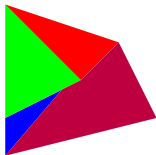
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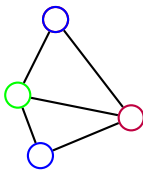
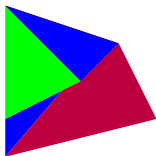


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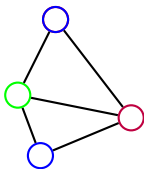
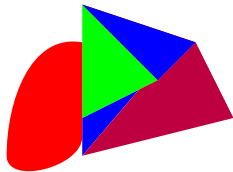
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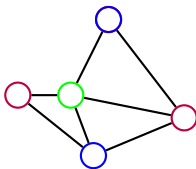
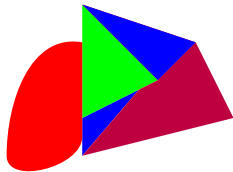


Yes! Three colors.

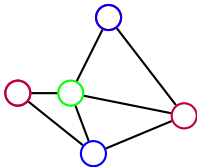
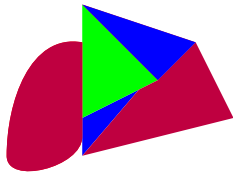
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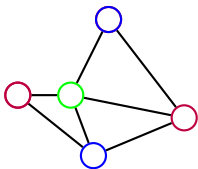
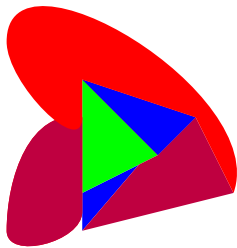
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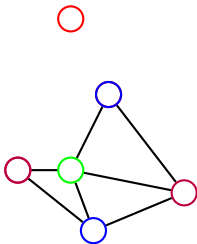
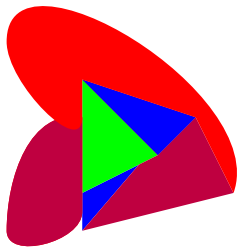
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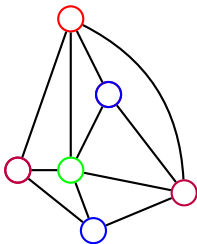
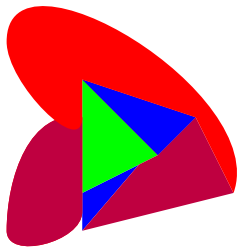
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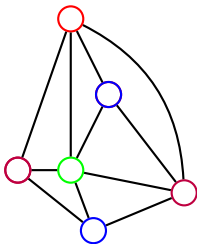
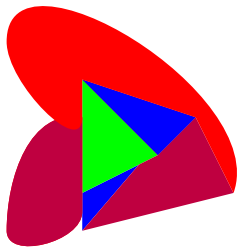
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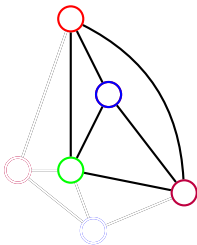
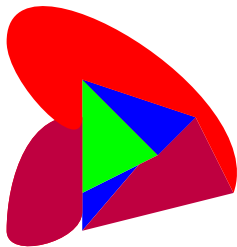


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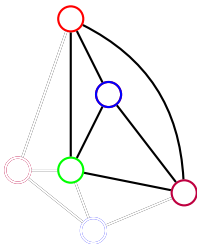
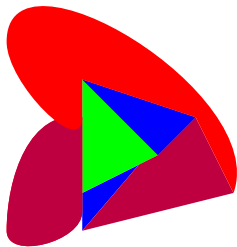


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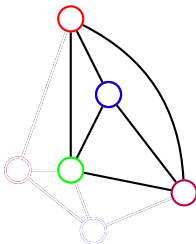
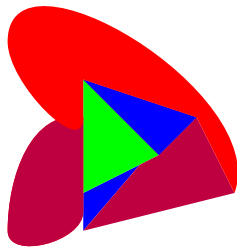


# Map Coloring.



Four colors required!

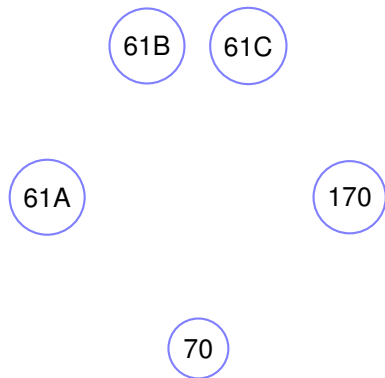
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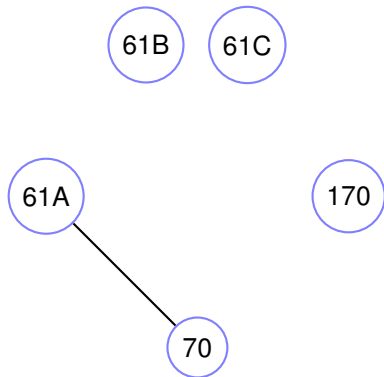
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Theorem: Four colors enough for maps on the plane.

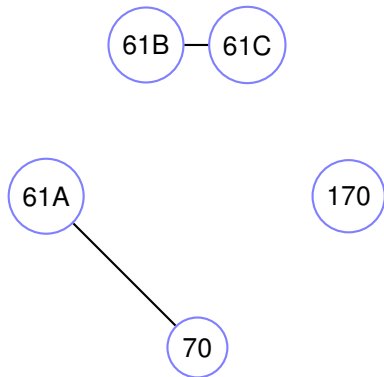
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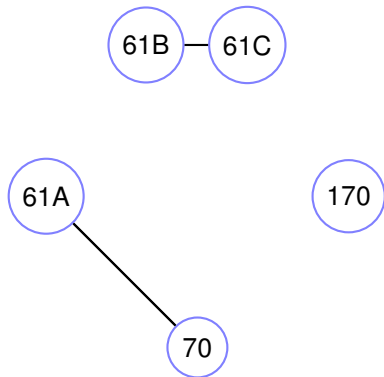
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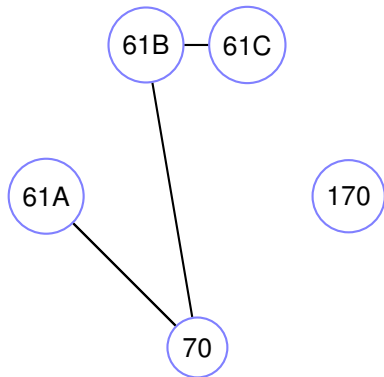
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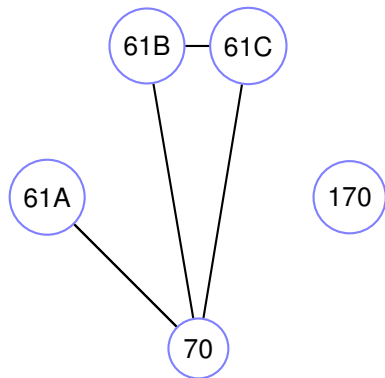
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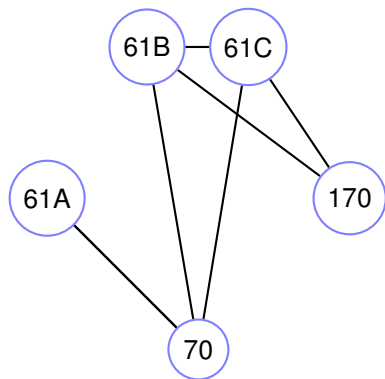
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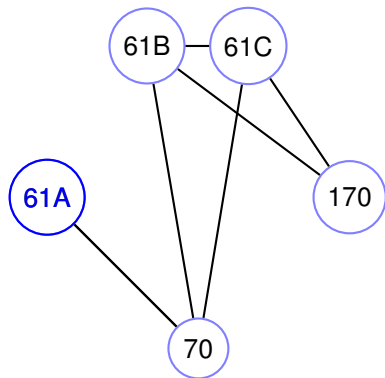
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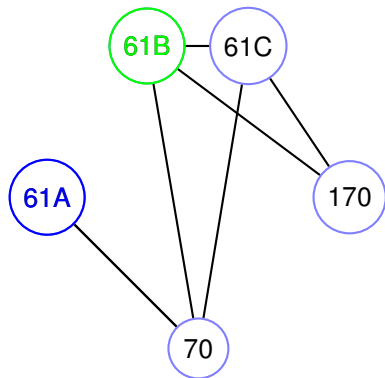
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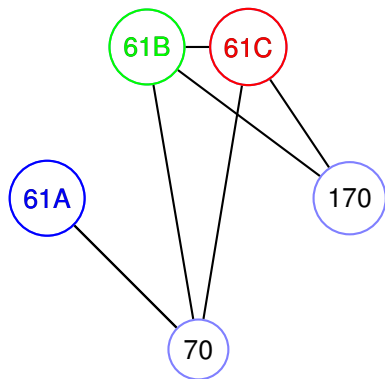
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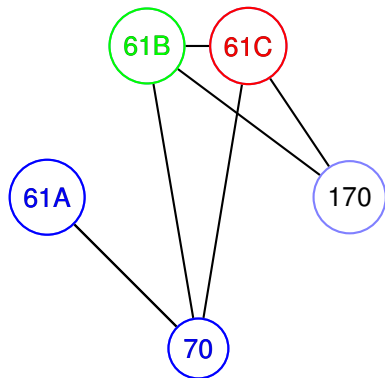
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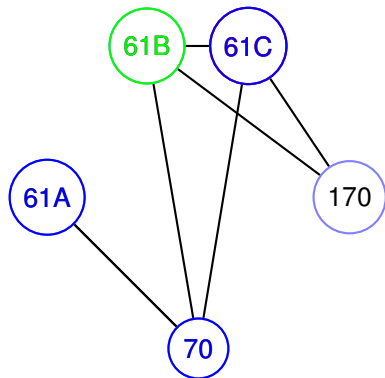
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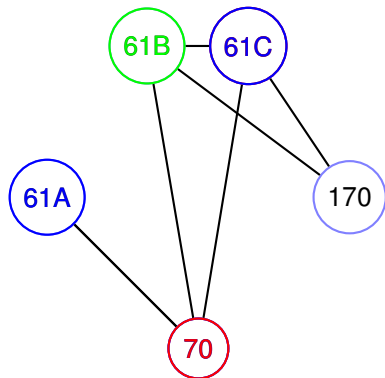
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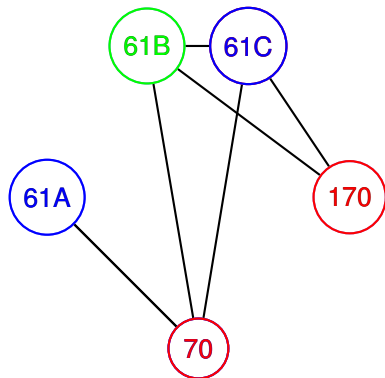
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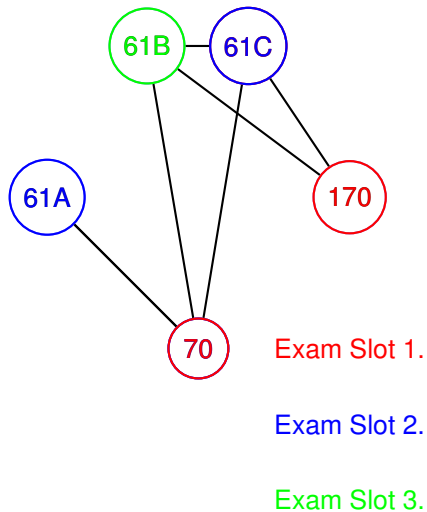
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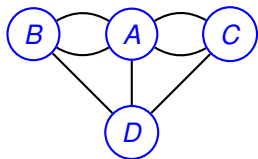
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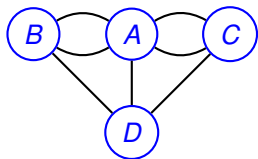


## Graphs: formally.



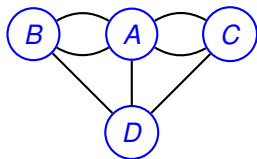
Graph:

## Graphs: formally.



Graph:  $G = (V, E)$ .

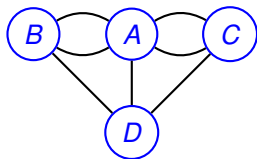
## Graphs: formally.



Graph:  $G = (V, E)$ .

$V$  - set of vertices.

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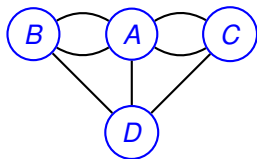


Graph:  $G = (V, E)$ .

$V$  - set of vertices.

$\{A, B, C, D\}$

# Graphs: formally.



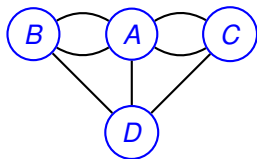
Graph:  $G = (V, E)$ .

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$E \subseteq V \times V$  -

# Graphs: formally.



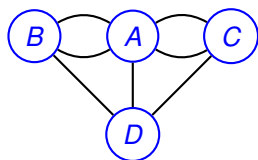
Graph:  $G = (V, E)$ .

$V$  - set of vertices.

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# Graphs: formally.



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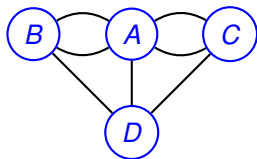
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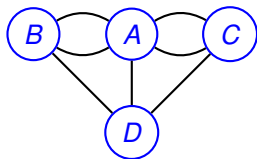
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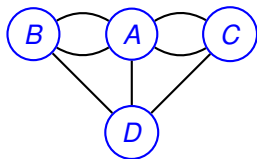
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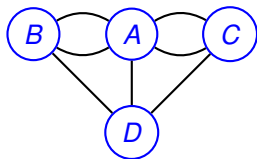
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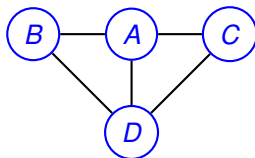
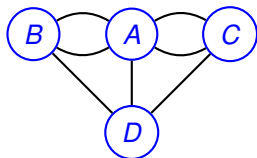
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For CS 70, usually simple graphs.

# Graphs: formally.



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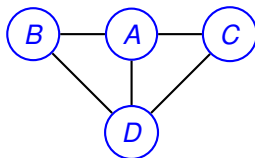
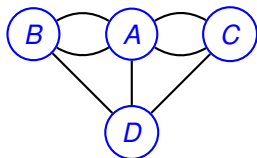
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For CS 70, usually simple graphs.

No parallel edges.

# Graphs: formally.



Graph:  $G = (V, E)$ .

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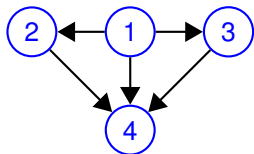
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For CS 70, usually simple graphs.

No parallel edges.

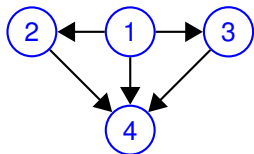
Multigraph above.

# Directed Graphs



$$G = (V, E).$$

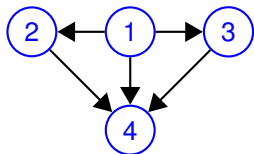
# Directed Graphs



$$G = (V, E).$$

$V$  - set of vertices.

# Directed Graphs

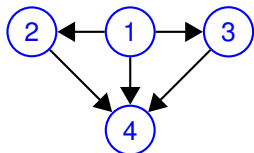


$G = (V, E)$ .

$V$  - set of vertices.

$\{1, 2, 3, 4\}$

# Directed Graphs



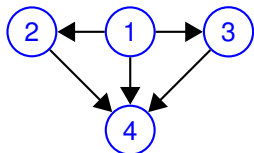
$G = (V, E)$ .

$V$  - set of vertices.

$\{1, 2, 3, 4\}$

$E$  ordered pairs of vertices.

# Directed Graphs



$G = (V, E)$ .

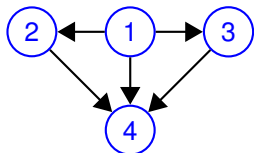
$V$  - set of vertices.

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$\{(1, 2),$

# Directed Graphs



$G = (V, E)$ .

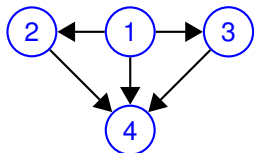
$V$  - set of vertices.

$\{1, 2, 3, 4\}$

$E$  ordered pairs of vertices.

$\{(1, 2), (1, 3),$

# Directed Graphs



$G = (V, E)$ .

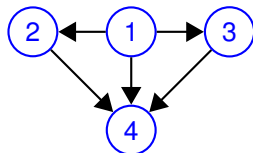
$V$  - set of vertices.

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# Directed Graphs



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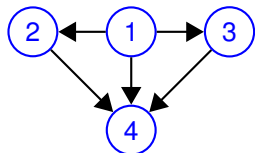
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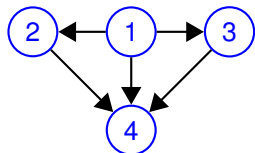
$\{1, 2, 3, 4\}$

$E$  ordered pairs of vertices.

$\{(1, 2), (1, 3), (1, 4), (2, 4), (3, 4)\}$

One way streets.

# Directed Graphs



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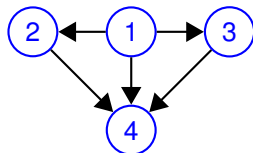
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$\{(1, 2), (1, 3), (1, 4), (2, 4), (3, 4)\}$

One way streets.

Tournament:

# Directed Graphs



$G = (V, E)$ .

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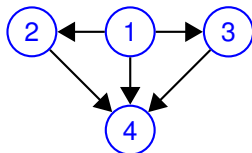
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$\{(1, 2), (1, 3), (1, 4), (2, 4), (3, 4)\}$

One way streets.

Tournament: 1 beats 2,

# Directed Graphs



$G = (V, E)$ .

$V$  - set of vertices.

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$E$  ordered pairs of vertices.

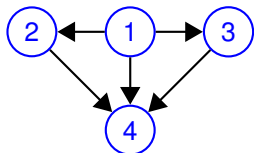
$\{(1, 2), (1, 3), (1, 4), (2, 4), (3, 4)\}$

One way streets.

Tournament: 1 beats 2, ...

Precedence:

# Directed Graphs



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$\{1, 2, 3, 4\}$

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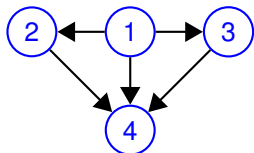
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One way streets.

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Precedence: 1 is before 2,

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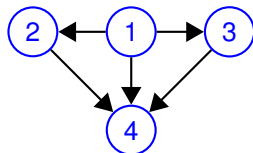
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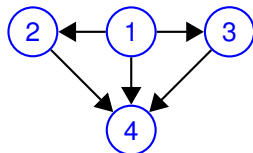
One way streets.

Tournament: 1 beats 2, ...

Precedence: 1 is before 2, ..

Social Network:

# Directed Graphs



$G = (V, E)$ .

$V$  - set of vertices.

$\{1, 2, 3, 4\}$

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$\{(1, 2), (1, 3), (1, 4), (2, 4), (3, 4)\}$

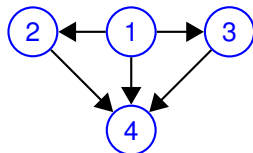
One way streets.

Tournament: 1 beats 2, ...

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Social Network: Directed?

# Directed Graphs



$G = (V, E)$ .

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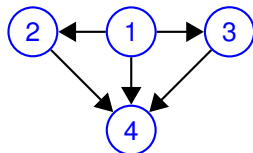
One way streets.

Tournament: 1 beats 2, ...

Precedence: 1 is before 2, ..

Social Network: Directed? Undirected?

# Directed Graphs



$G = (V, E)$ .

$V$  - set of vertices.

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One way streets.

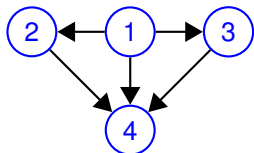
Tournament: 1 beats 2, ...

Precedence: 1 is before 2, ..

Social Network: Directed? Undirected?

Friends.

# Directed Graphs



$G = (V, E)$ .

$V$  - set of vertices.

$\{1, 2, 3, 4\}$

$E$  ordered pairs of vertices.

$\{(1, 2), (1, 3), (1, 4), (2, 4), (3, 4)\}$

One way streets.

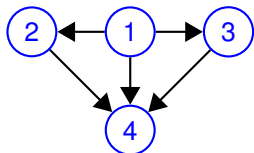
Tournament: 1 beats 2, ...

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Social Network: Directed? Undirected?

Friends. Undirected.

# Directed Graphs



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$E$  ordered pairs of vertices.

$\{(1, 2), (1, 3), (1, 4), (2, 4), (3, 4)\}$

One way streets.

Tournament: 1 beats 2, ...

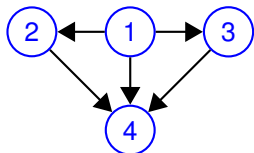
Precedence: 1 is before 2, ..

Social Network: Directed? Undirected?

Friends. Undirected.

Likes.

# Directed Graphs



$G = (V, E)$ .

$V$  - set of vertices.

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$E$  ordered pairs of vertices.

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One way streets.

Tournament: 1 beats 2, ...

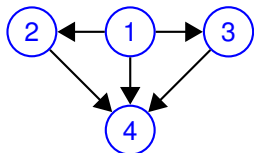
Precedence: 1 is before 2, ..

Social Network: Directed? Undirected?

Friends. Undirected.

Likes. Directed.

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# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

# Graph Concepts and Definitions.

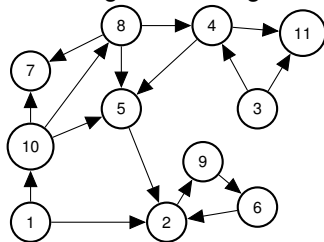
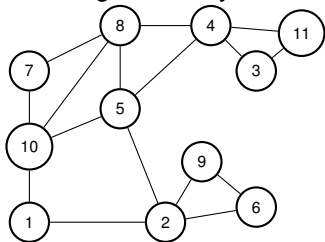
Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree

# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree

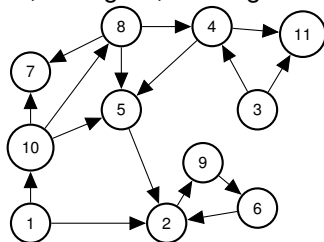
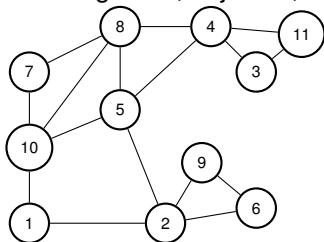


Neighbors of 10?

# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree

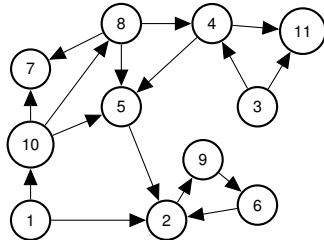
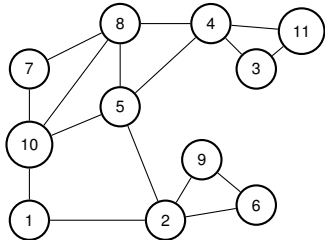


Neighbors of 10? 1,

## Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree

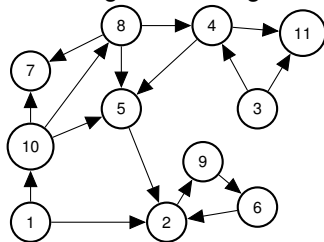
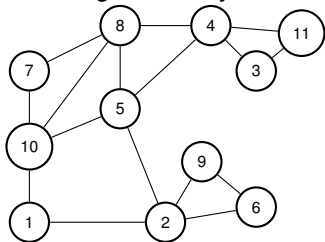


Neighbors of 10? 1,5,

# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree

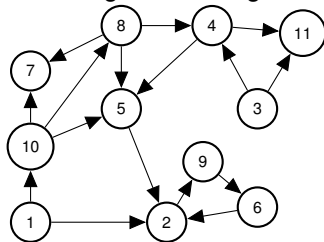
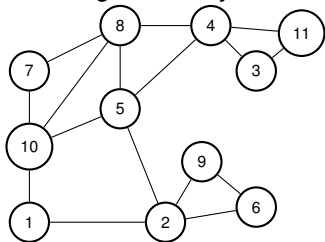


Neighbors of 10? 1,5,7,

# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree

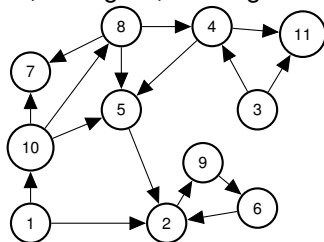
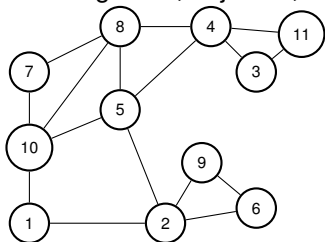


Neighbors of 10? 1, 5, 7, 8.

# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree



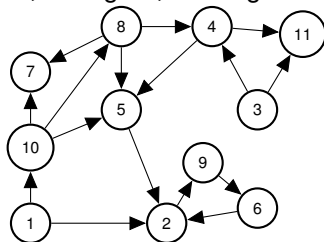
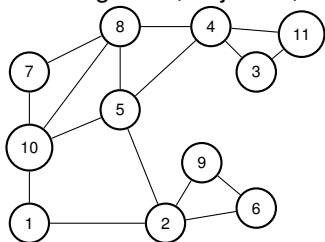
Neighbors of 10? 1,5,7, 8.

$u$  is neighbor of  $v$  if  $\{u, v\} \in E$ .

# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree



Neighbors of 10? 1, 5, 7, 8.

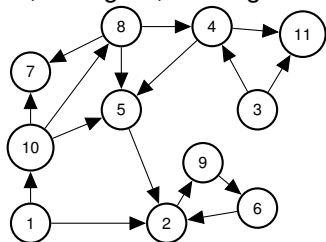
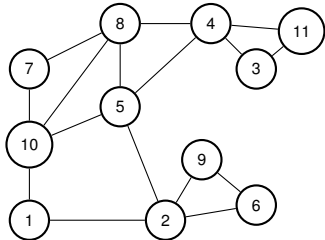
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Edge  $\{10, 5\}$  is incident to

# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree



Neighbors of 10? 1, 5, 7, 8.

$u$  is neighbor of  $v$  if  $\{u, v\} \in E$ .

Edge  $\{10, 5\}$  is incident to vertex 10 and vertex 5.

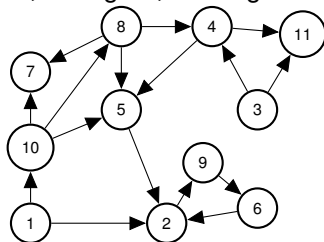
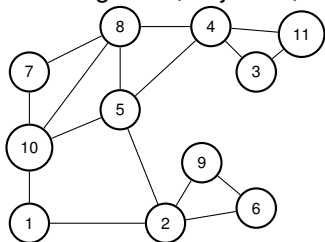
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# Graph Concepts and Definitions.

Graph:  $G = (V, E)$

neighbors, adjacent, degree, incident, in-degree, out-degree



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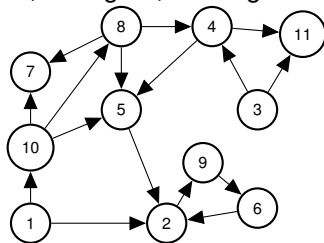
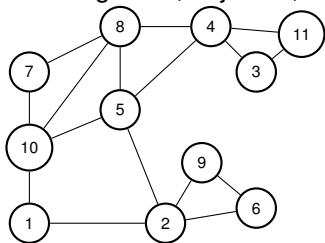
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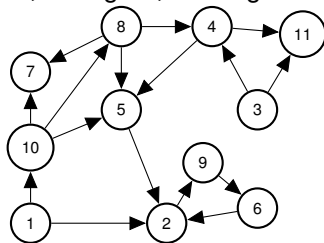
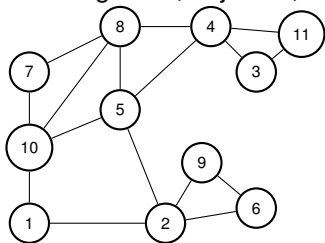
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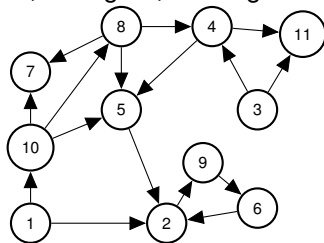
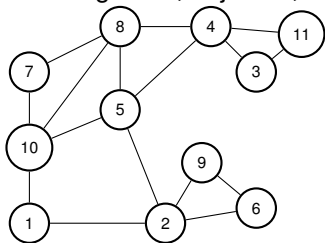
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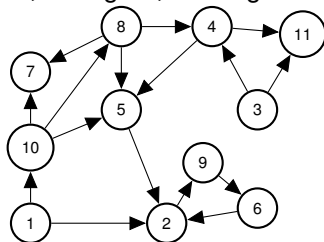
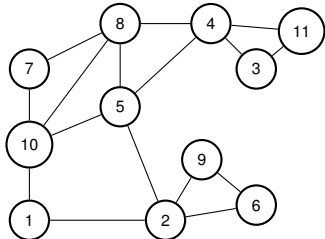
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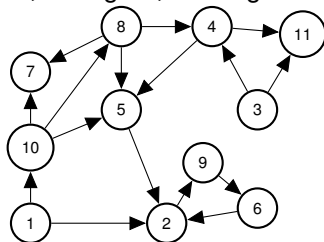
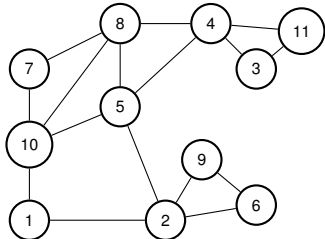
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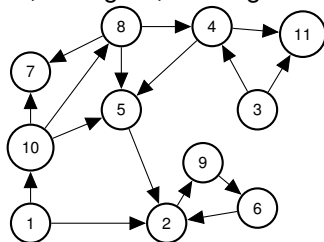
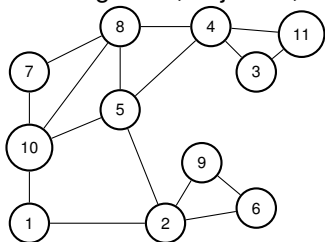
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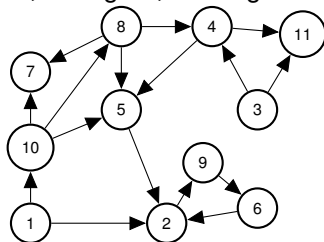
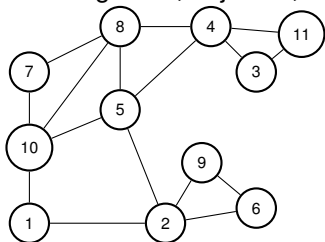
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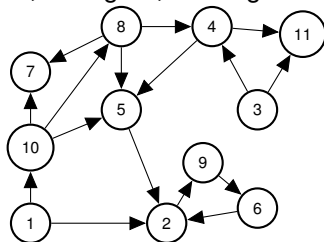
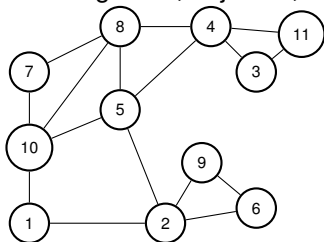
Directed graph?

In-degree of 10? 1    Out-degree of 10?

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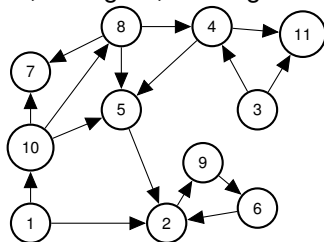
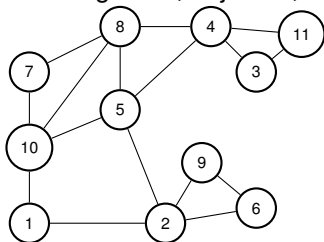
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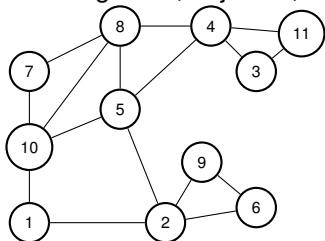
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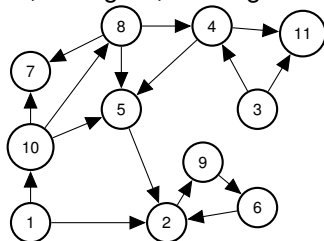
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**Edge (8,5) is incident to:**

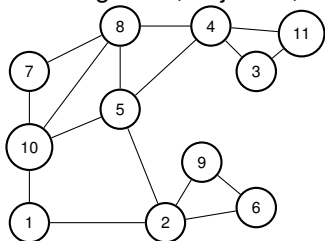
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- (E) Vertex 10.



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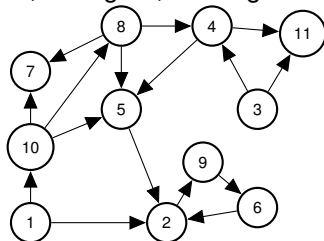
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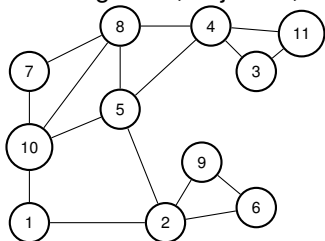
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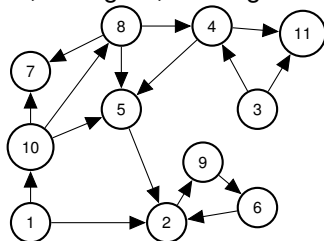
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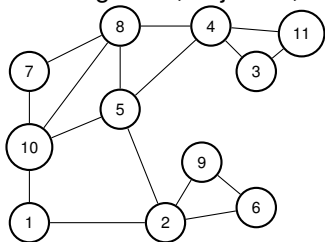
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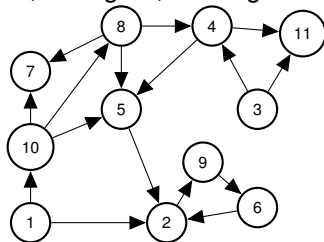
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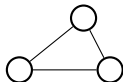
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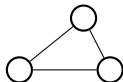
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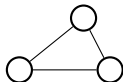
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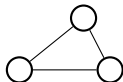
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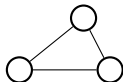
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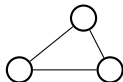
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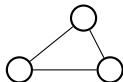
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What? For triangle number of edges is 3, the sum of degrees is 6.

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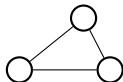
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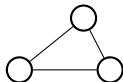
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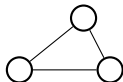
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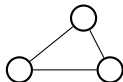
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Let's count incidences in two ways.

How many **incidences** does each edge contribute? 2.

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The sum of the vertex degrees is equal to ??

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Total Incidences? The sum over vertices of degrees!

**Thm:** Sum of vertex degree is  $2|E|$ .

## Poll: Proof of “handshake” lemma.

### What's true?

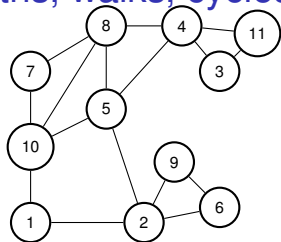
- (A) The number of edge-vertex incidences for an edge  $e$  is 2.
- (B) The total number of edge-vertex incidences is  $|V|$ .
- (C) The total number of edge-vertex incidences is  $2|E|$ .
- (D) The number of edge-vertex incidences for a vertex  $v$  is its degree.
- (E) The sum of degrees is  $2|E|$ .
- (F) The total number of edge-vertex incidences is the sum of the degrees.

# Poll: Proof of “handshake” lemma.

## What's true?

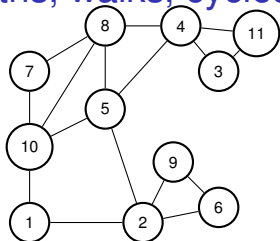
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- (A),(C), (D), (E), and (F).

## Paths, walks, cycles, tour.



A path in a graph is a sequence of edges.

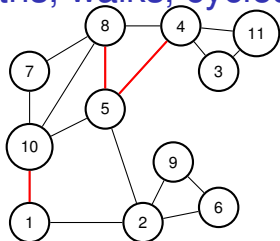
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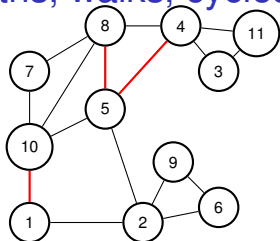
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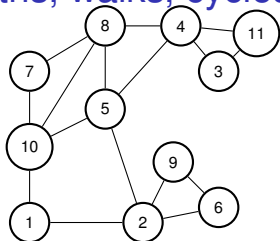
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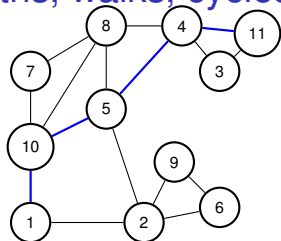


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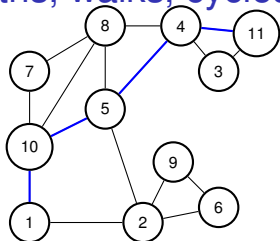


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## Paths, walks, cycles, tour.

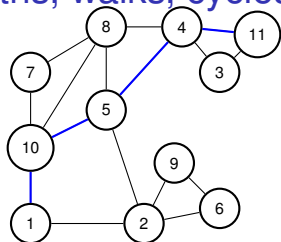


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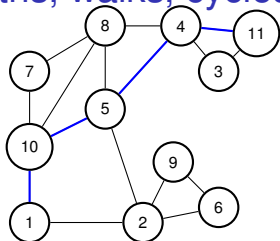
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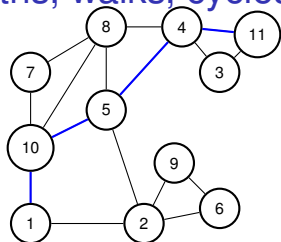
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Quick Check!

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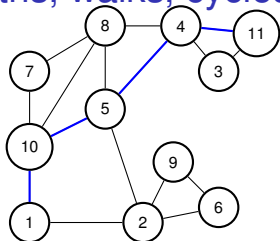
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Quick Check! Length of path?

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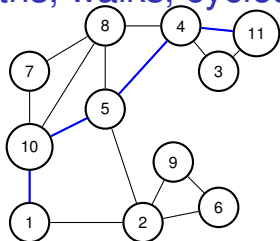
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Quick Check! Length of path?  $k$  vertices

# Paths, walks, cycles, tour.



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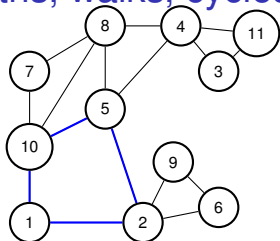
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Quick Check! Length of path?  $k$  vertices or  $k - 1$  edges.

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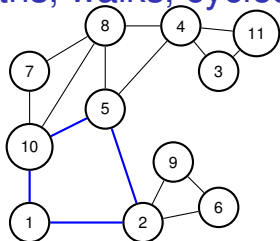
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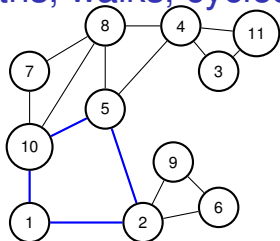
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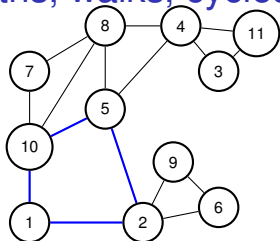
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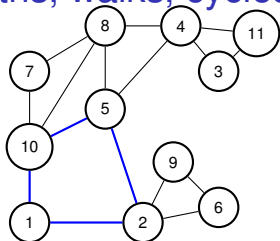
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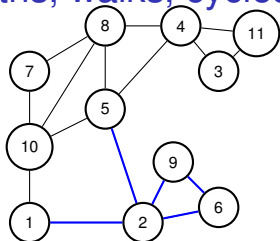
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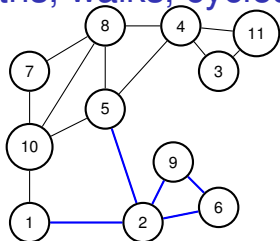
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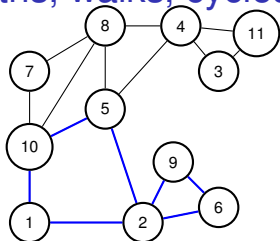
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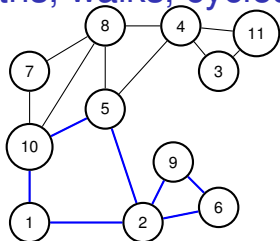
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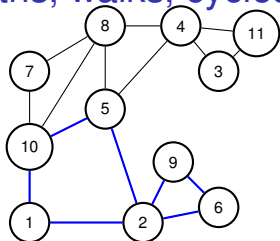
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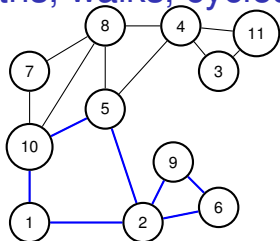
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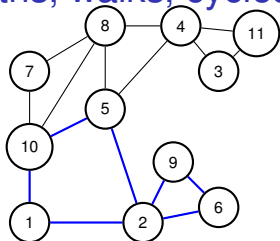
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Path is to Walk as Cycle is to ??

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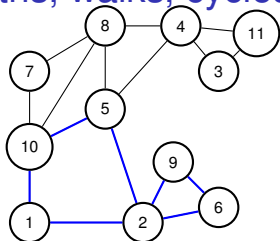
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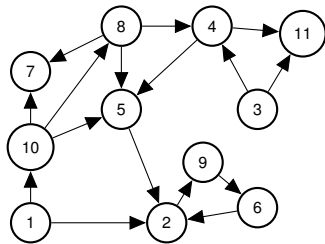
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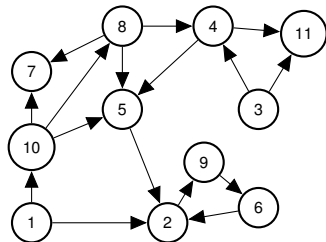
Quick Check!

Path is to Walk as Cycle is to ?? Tour!

## Directed Paths.

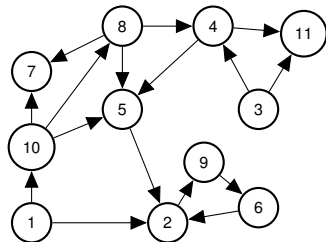


# Directed Paths.



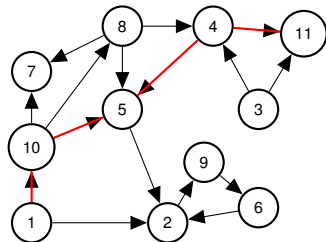
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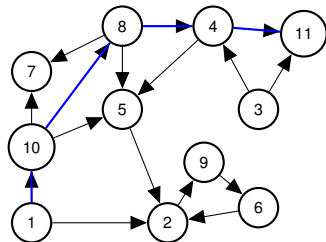
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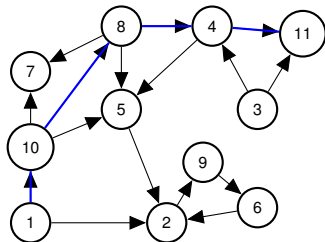
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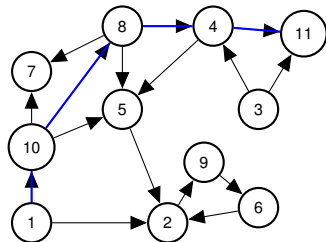
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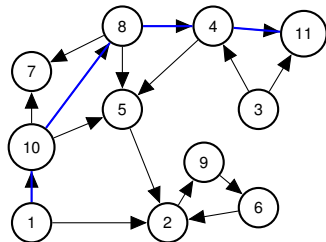
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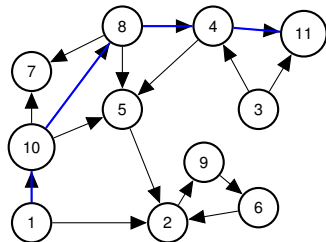
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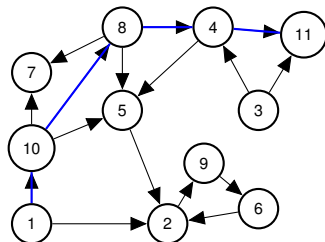
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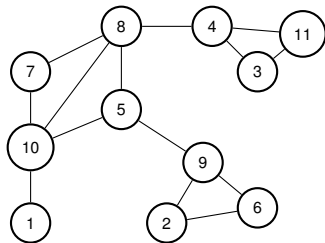
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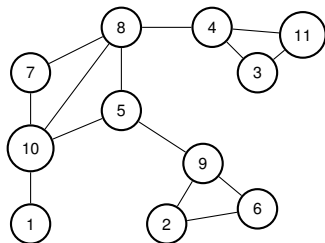
Paths, walks, cycles, tours ... are analogous to undirected now.

## Connectivity: undirected graph.



$u$  and  $v$  are **connected** if there is a path between  $u$  and  $v$ .

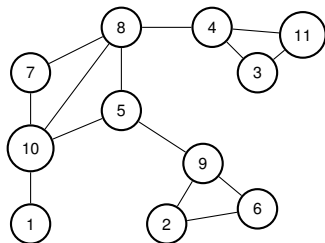
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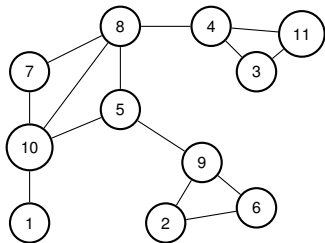


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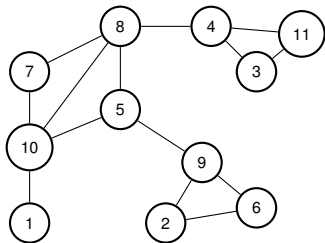
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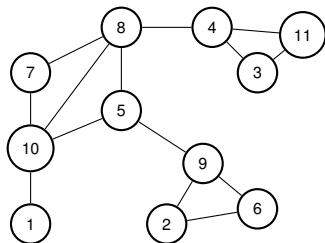
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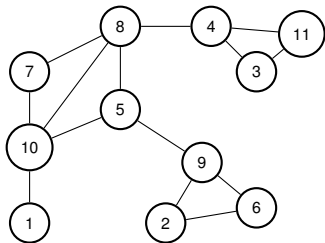
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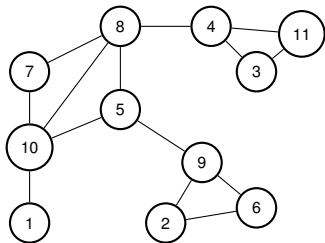
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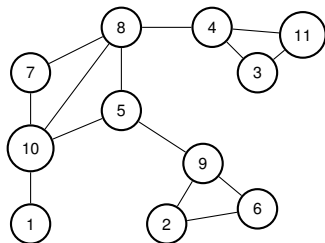
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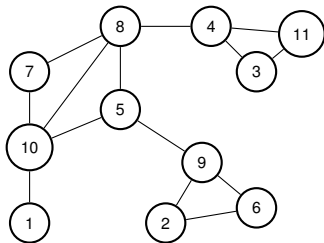
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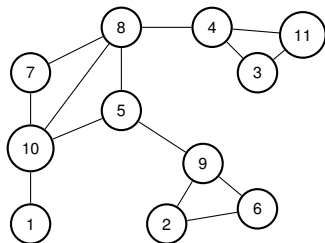
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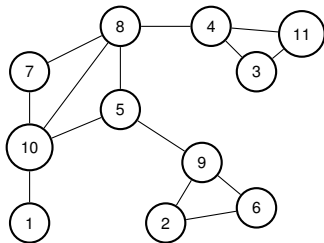
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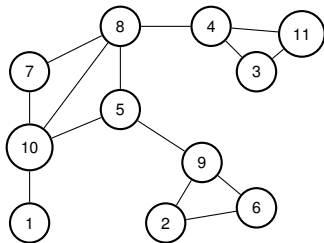


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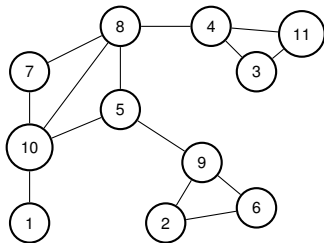


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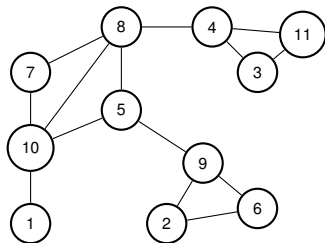


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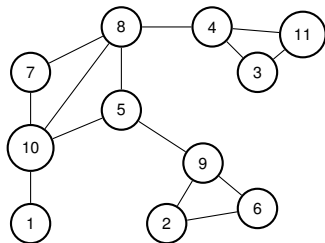
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## Connected Components: Quiz.



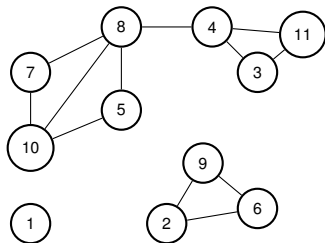
Is graph above connected?

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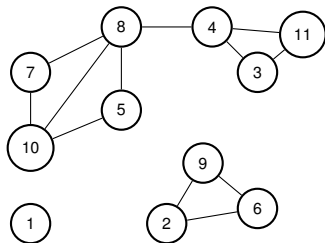
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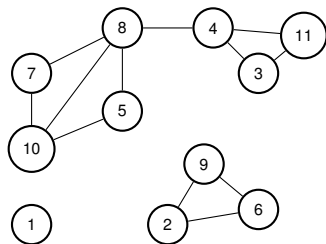
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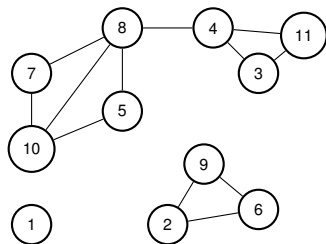


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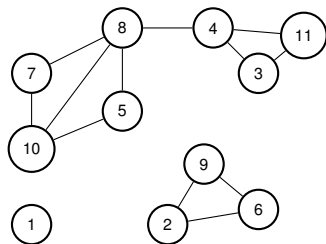


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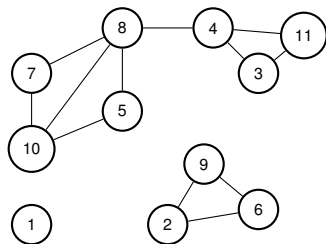
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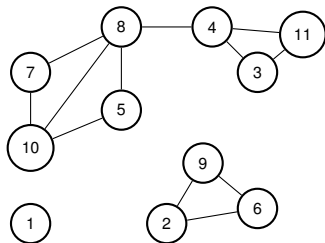
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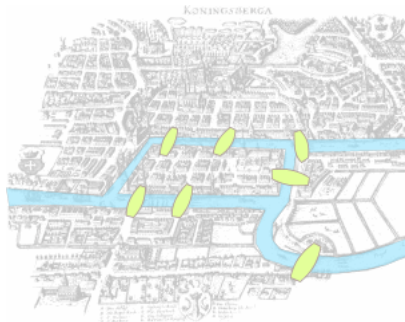
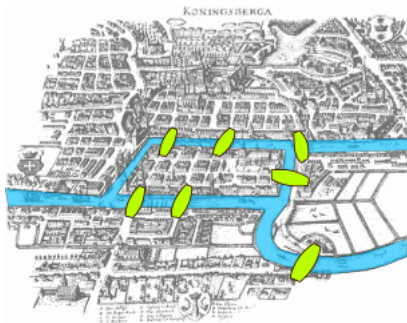
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# Konigsberg bridges problem.

Can you make a tour visiting each bridge exactly once?

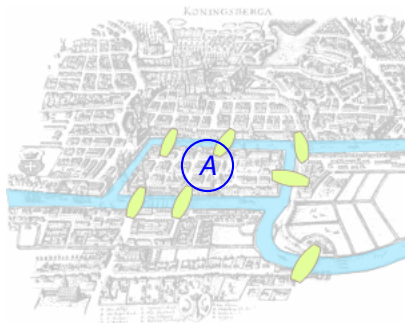
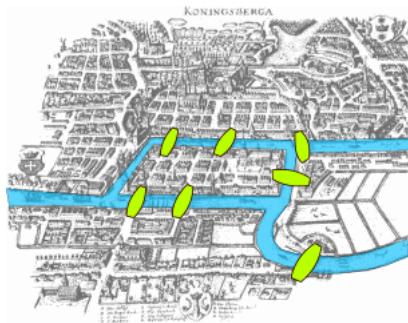
"Konigsberg bridges" by Bogdan Giuscă - [License](#).



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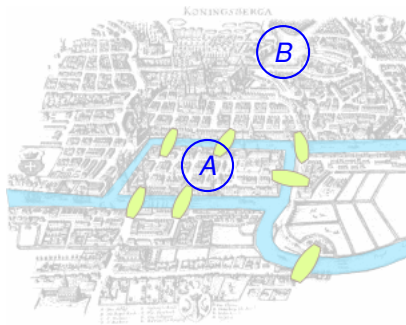
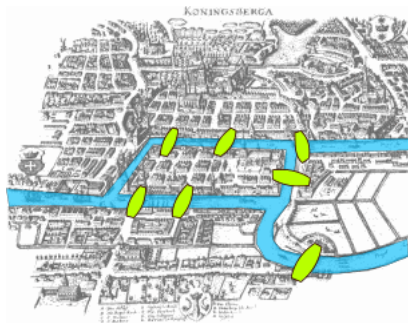
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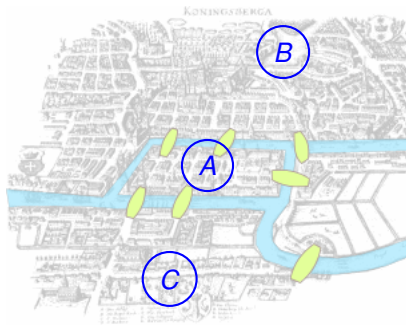
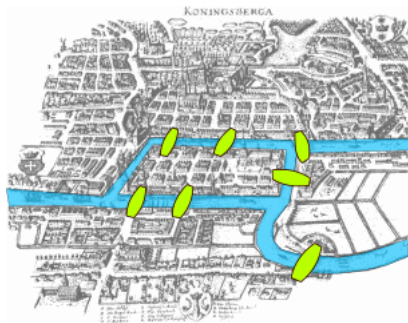
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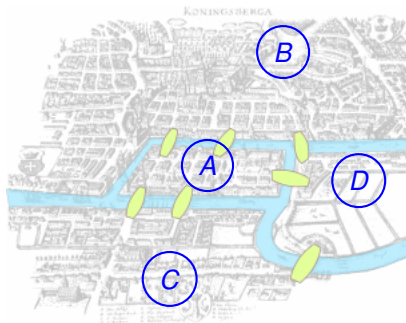
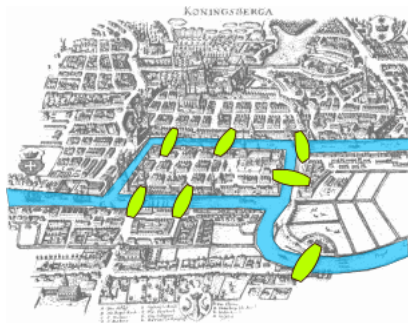
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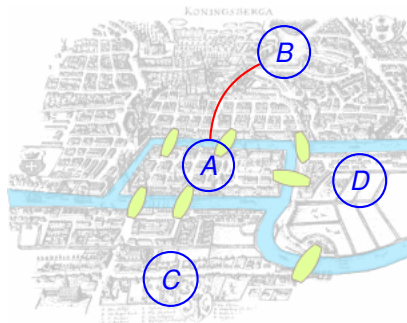
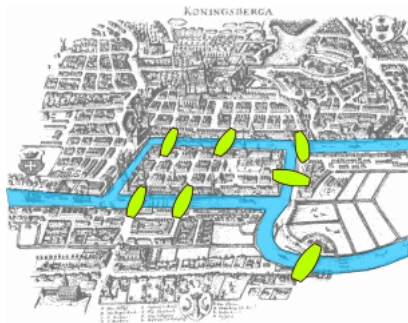
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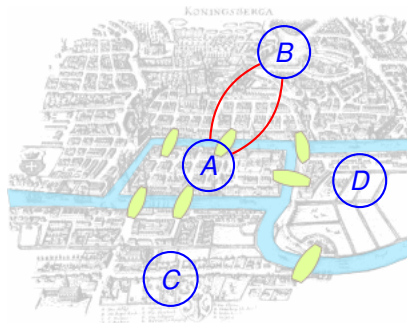
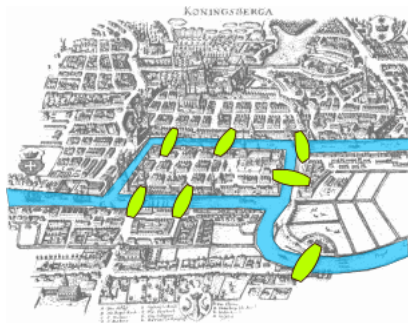
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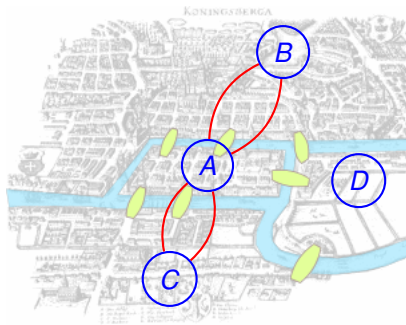
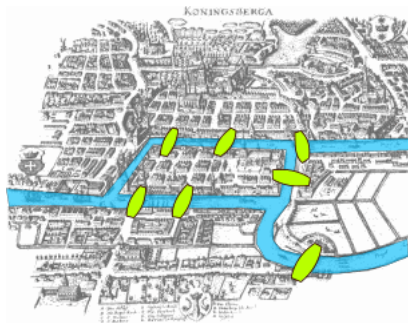
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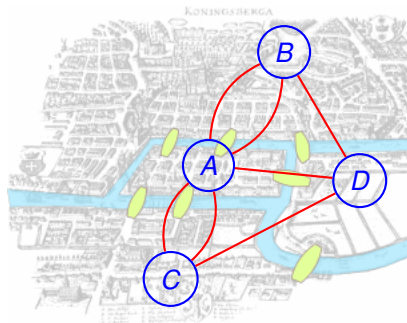
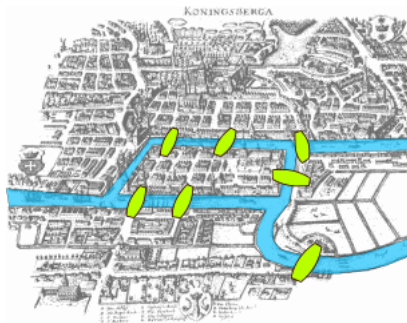
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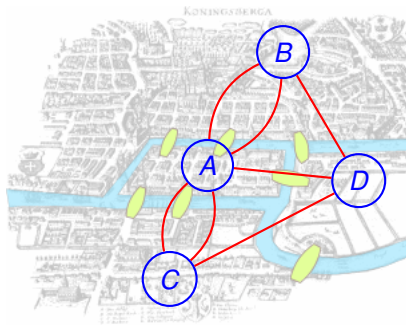
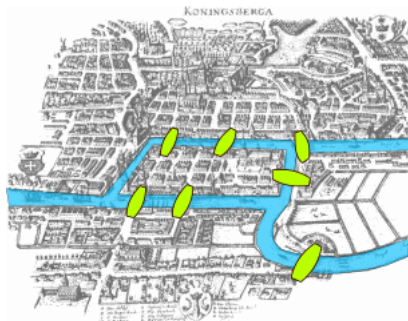
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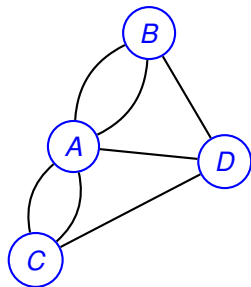
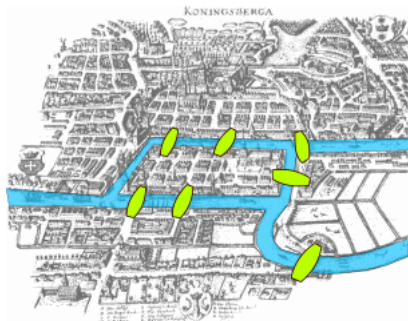


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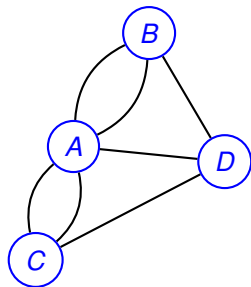
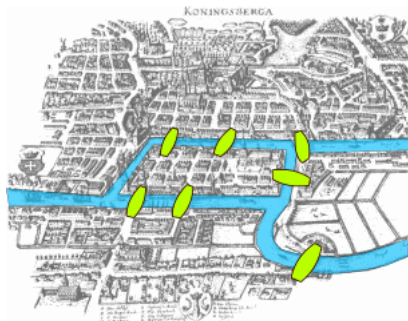


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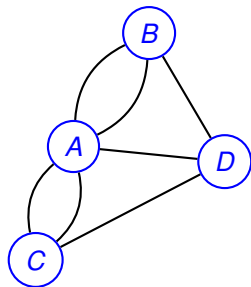
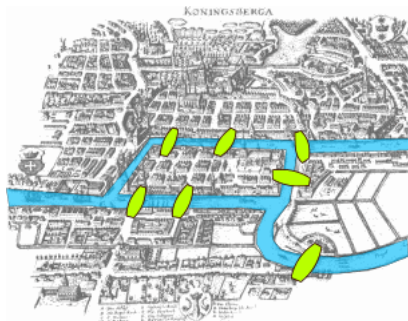


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Yes? No?  
We will see!

# Eulerian Tour

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Therefore  $v$  has even degree.

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Therefore  $v$  has even degree. □

# Eulerian Tour

**Eulerian Tour** visits every vertex using each edge exactly once.

**Theorem:** Any undirected graph has an Eulerian tour if and only if all vertices have even degree and is connected.

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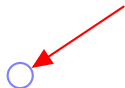
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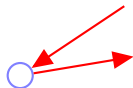
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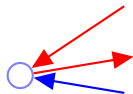
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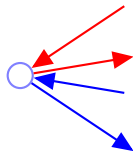
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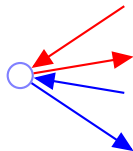
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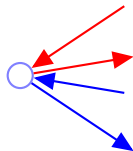
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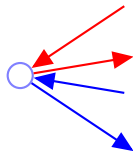
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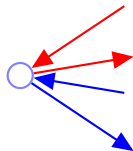
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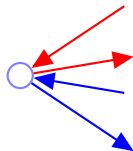
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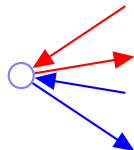
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(Timestamp: 4:02).

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We will give an algorithm.

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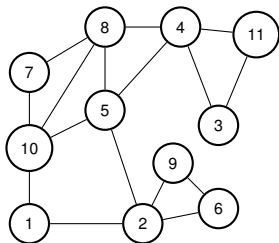
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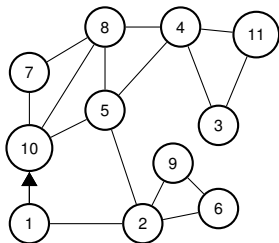


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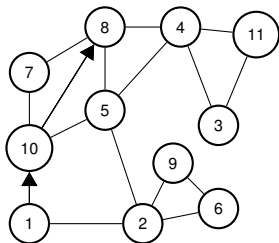


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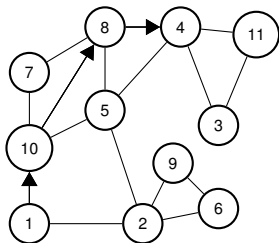


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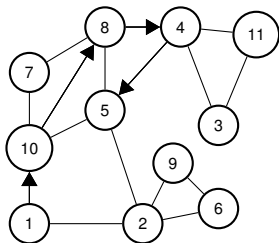


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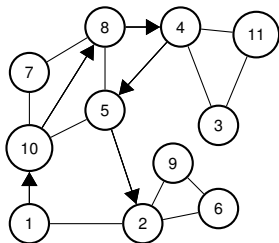


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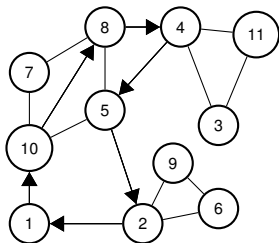


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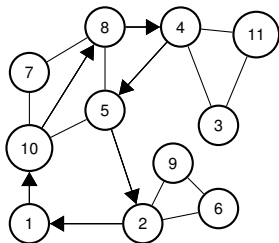
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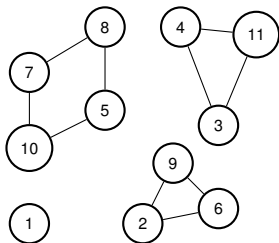


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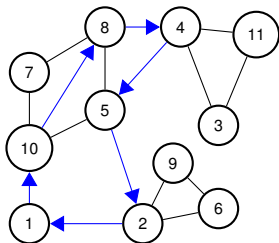


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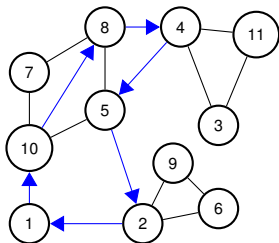


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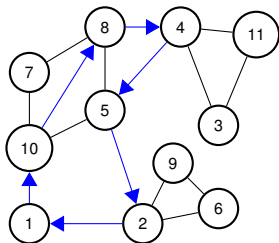


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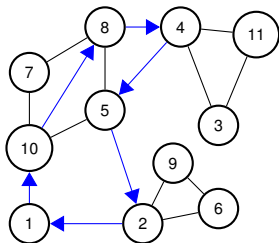


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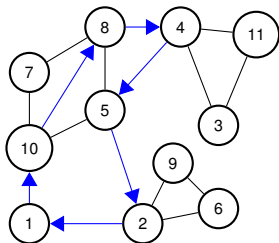


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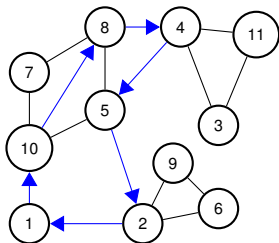
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Example:  $v_1 = 1$ ,

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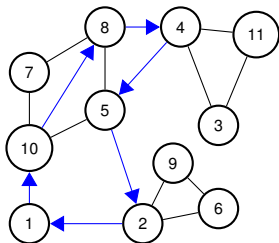


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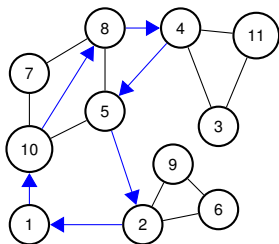
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Example:  $v_1 = 1$ ,  $v_2 = 10$ ,  $v_3 = 4$ ,

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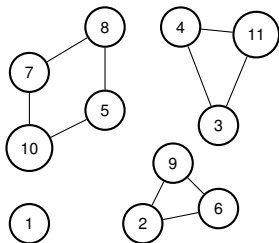
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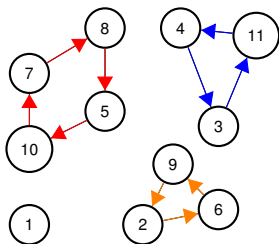
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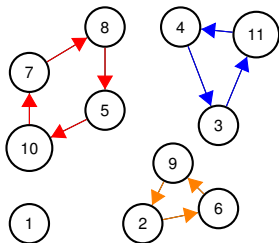
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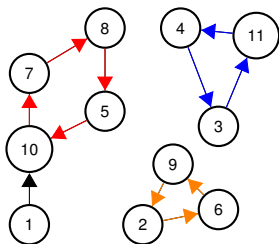
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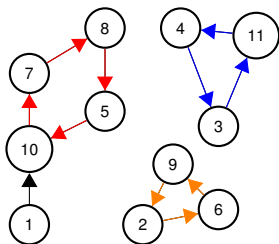
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1,10

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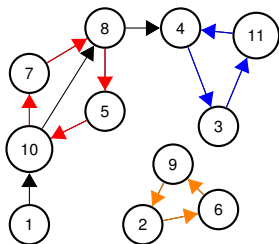
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1, 10, 7, 8, 5, 10

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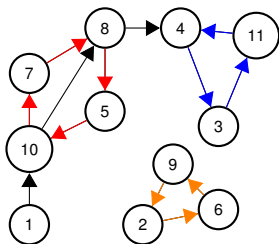
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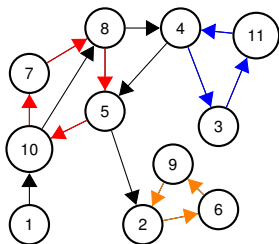
5. Splice together.

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## Proof of if: Even + connected $\implies$ Eulerian Tour.

We will give an algorithm. First by picture.



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... till you get back to  $v$ .

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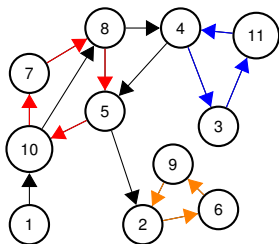
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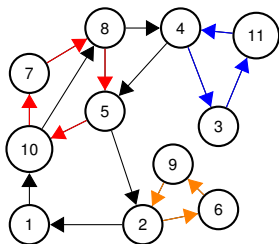
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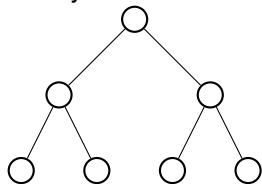
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Only (F) is false.

# A Tree, a tree.

Graph  $G = (V, E)$ .  
Binary Tree!



More generally.

# Trees.

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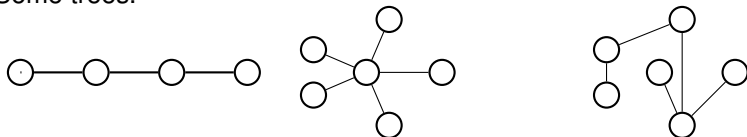
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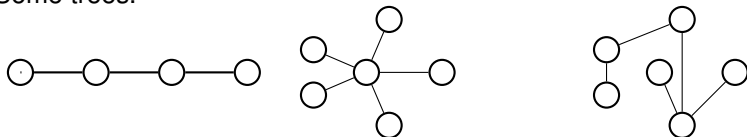
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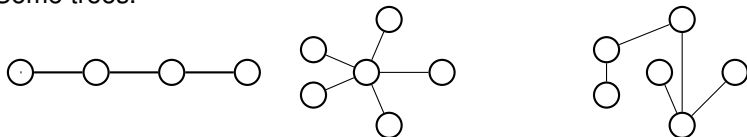
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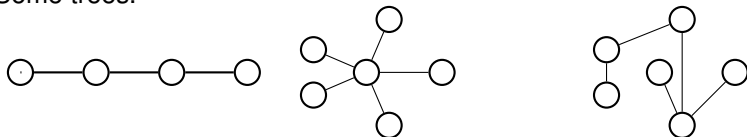
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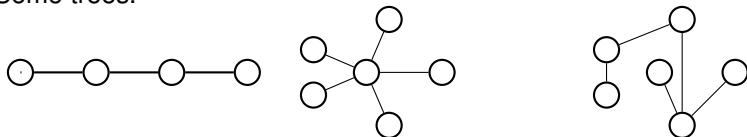
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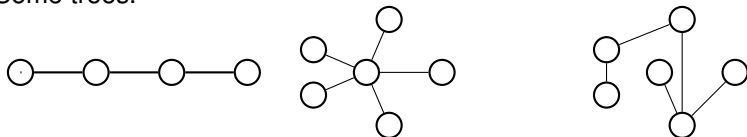
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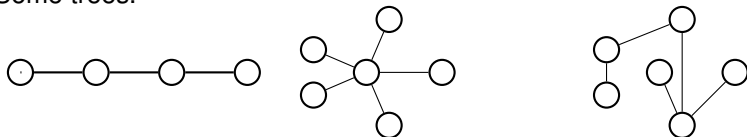
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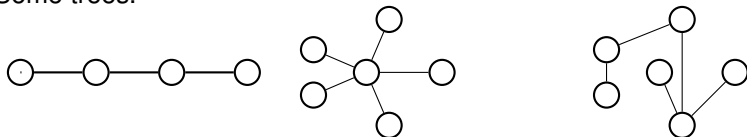
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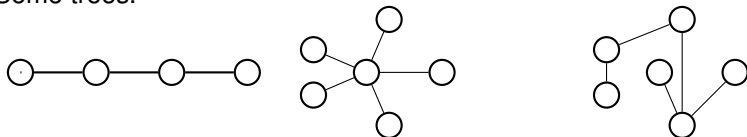
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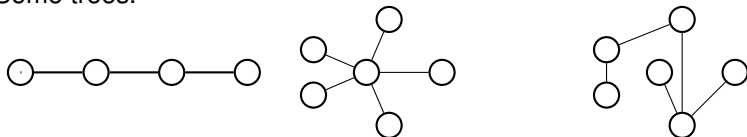
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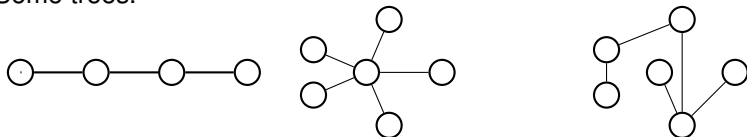
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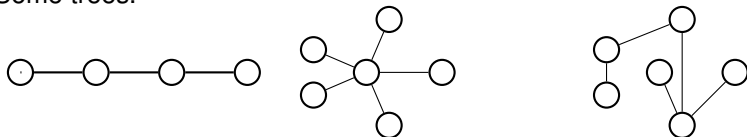
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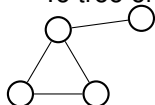
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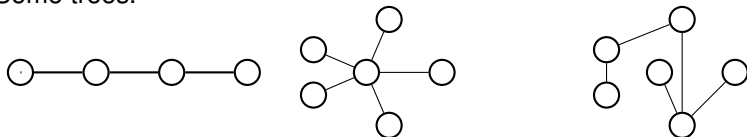
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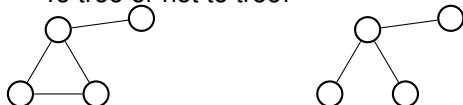
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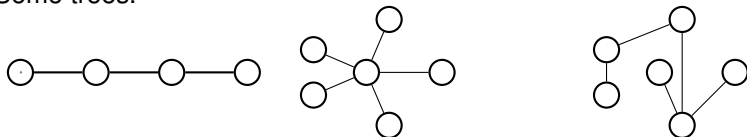
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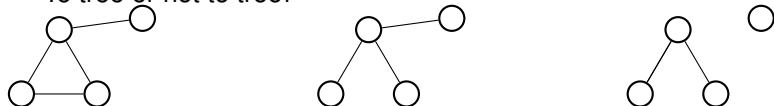
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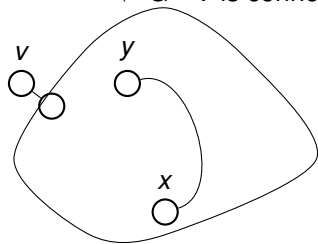
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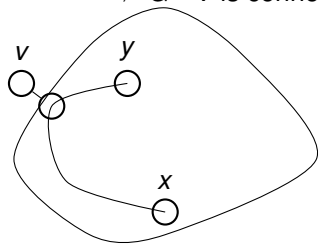
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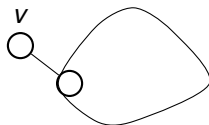


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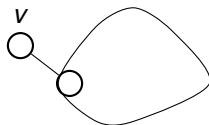


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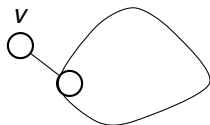
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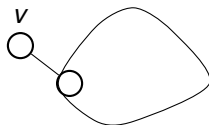
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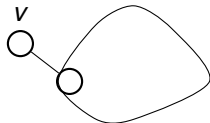
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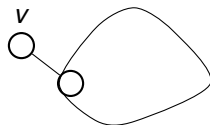
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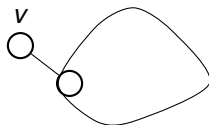
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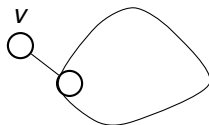
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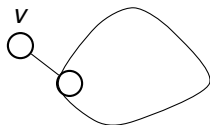
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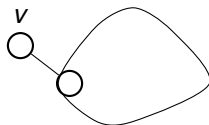
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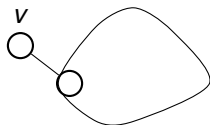
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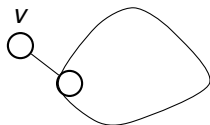
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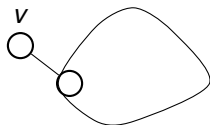
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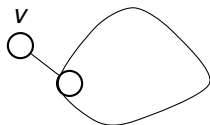
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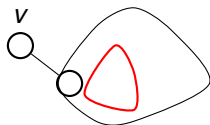
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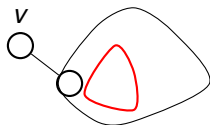
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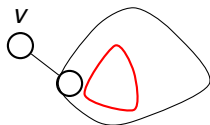
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**Proof:**

Walk from a vertex using untraversed edges.

# Proof of if

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**Let  $G$  be a connected graph with  $|V| - 1$  edges.**

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- (A) Removing a degree 1 vertex can disconnect the graph.
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- (C) The average degree is  $2 - 2/|V|$ .
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  - (D) There is a hotel california: a degree 1 vertex.
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- (B), (C), (D) are true

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