

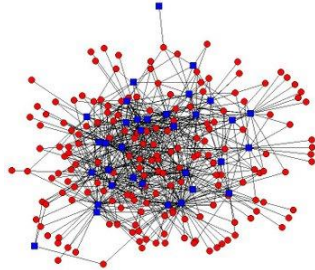
## CSE 421: Algorithms

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Winter 2014

Lecture 4: Graphs and graph traversal

Reading: Sections 3.1-3.2



## undirected graphs

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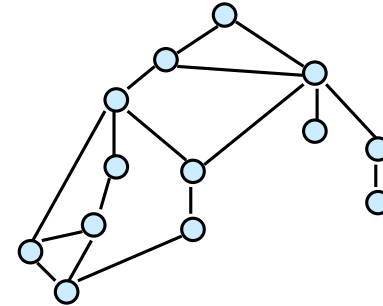
Graphs can be used to model all sorts of things:  
 Networks (computer, social, transportation), similarity  
 (e.g. proteins, genes, Amazon users, web pages, ...).  
 Anything with pairwise relationships.



## undirected graphs

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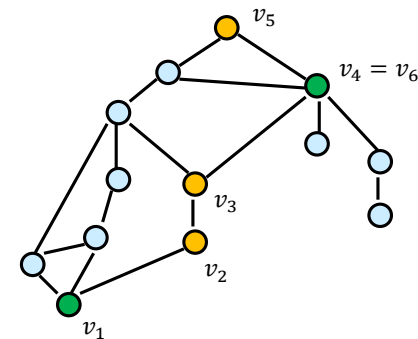
Mathematically, a graph is a pair  $G = (V, E)$  of vertices ( $V$ ) and edges ( $E$ ). The edges are simply unordered pairs of vertices, i.e.  $\{u, v\}$  for  $u, v \in V$ .



## paths

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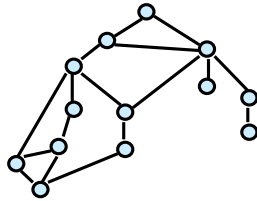
A path in a graph is a sequence of nodes  $v_1, v_2, \dots, v_k$  such that consecutive pairs  $\{v_i, v_{i+1}\}$  are connected by an edge.



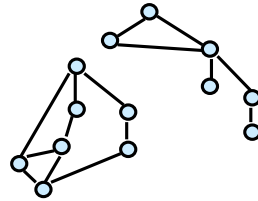
## connectivity

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An undirected graph is *connected* if every pair of vertices is connected by some path.



connected



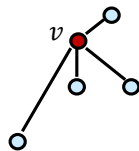
not connected

## handshaking lemma

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Let's look at some simple facts about graphs.

**Definition:** The *degree* of a vertex  $v$  is the number of edges touching  $v$ .



$$\deg(v) = 4$$

**Theorem:** For any undirected graph  $G = (V, E)$ ,

$$\sum_{v \in V} \deg(v) = 2|E|$$

## exercise!

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Prove that every connected graph with  $n$  vertices has at least  $n - 1$  edges.

## handshaking lemma

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**Theorem:** For any undirected graph  $G = (V, E)$ ,

$$\sum_{v \in V} \deg(v) = 2|E|$$

**Proof:**

The LHS counts every edge twice (once from each endpoint).

## handshaking lemma

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Theorem: For any undirected graph  $G = (V, E)$ ,

$$\sum_{v \in V} \deg(v) = 2|E|$$

Proof:

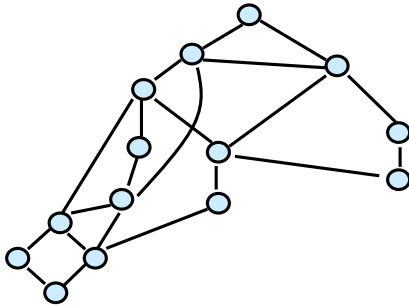
The LHS counts every edge twice (once from each endpoint).

Consequence: Every graph has an even number of odd degree vertices. (Why?)

## eulerian graphs

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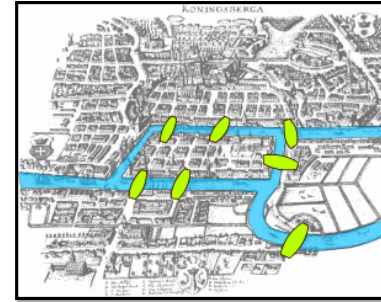
A graph is *Eulerian* if there exists a tour that crosses every edge exactly once.



## euler tours

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(Glorious Königsberg)

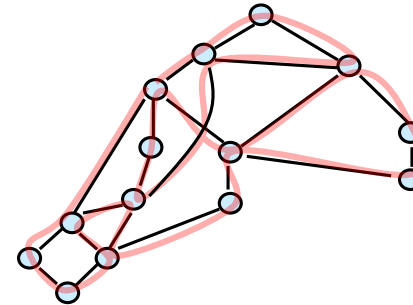


Euler: Is it possible to walk over each bridge exactly once and then return to the starting point?

## eulerian graphs

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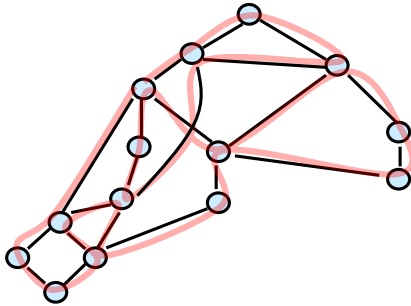
A graph is *Eulerian* if there exists a tour that crosses every edge exactly once.



## eulerian graphs

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**Theorem:** An undirected graph is Eulerian if and only if it is connected and every vertex has even degree!



## eulerian graphs

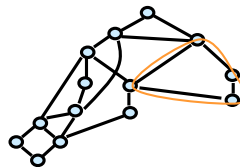
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**Theorem:** An undirected graph is Eulerian if and only if every vertex has even degree!

**Proof.**

Harder direction: connected and all degrees  $\rightarrow$  Eulerian

Strategy: Find a simple cycle (no vertex repeated) in the graph. Then remove it and induct!



## eulerian graphs

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**Theorem:** An undirected graph is Eulerian if and only if every vertex has even degree!

**Proof.**

Easier direction: Eulerian  $\rightarrow$  connected and all degrees even. Why?

## eulerian graphs

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**Theorem:** An undirected graph is Eulerian if and only if every vertex has even degree!

**Proof.**

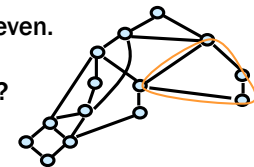
Harder direction: connected and all degrees  $\rightarrow$  Eulerian

Strategy: Find a simple cycle (no vertex repeated) in the graph. Then remove it and induct!

After cycle removed, degrees still even.

Why can we patch cycles together?

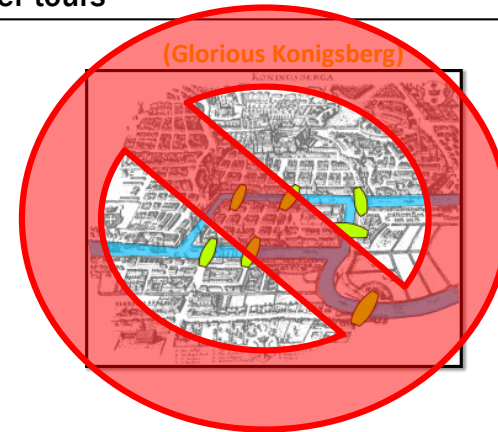
Base case?



## exercise!

Prove that every graph with all degrees even contains a simple cycle (i.e. with no vertices repeated).

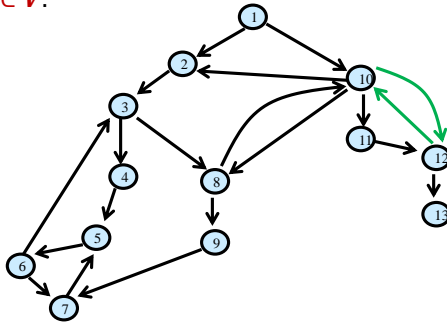
## euler tours



NO: There are odd degree vertices.

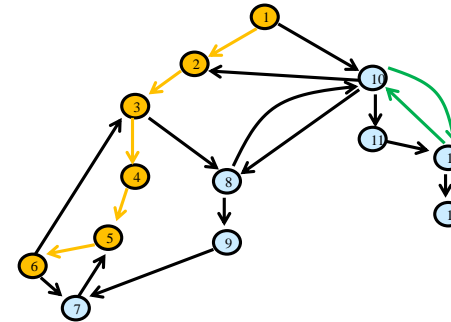
## directed graphs

A *directed graph (digraph for short)* is a pair  $G = (V, E)$  of vertices ( $V$ ) and edges ( $E$ ). The edges are now ordered pairs of vertices, i.e.  $(u, v)$  for  $u, v \in V$ .



## directed path

A *path* in a directed graph is a sequence of nodes  $v_1, v_2, \dots, v_k$  such that  $(v_i, v_{i+1})$  are connected by an edge for  $i = 1, 2, \dots, k - 1$ .



## graph traversal

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We are interested in *algorithmic* questions like:  
How can we determine if a graph is connected (and do it fast)?

Goal of traversal:

- Learn the basic structure of a graph
- Walk from a fixed starting vertex  $s$  to find all vertices reachable from  $s$

Three states of vertices

- **unvisited**
- **visited/discovered**
- **fully-explored**

## generic traversal always works

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**Claim:**

At termination  $R$  is the set of nodes reachable from  $s$

**Proof:**

$\subseteq$ : For every node  $v \in R$  there is a path from  $s$  to  $v$

$\supseteq$ : Suppose there is a node  $w \notin R$  reachable from  $s$  via a path  $P$

Take first node  $v$  on  $P$  such that  $v \notin R$

Predecessor  $u$  of  $v$  in  $P$  satisfies

$$\begin{aligned} u &\in R \\ (u, v) &\in E \end{aligned}$$

But this contradicts the fact that the algorithm exited the while loop.

## generic graph traversal algorithm

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**Find:** Set  $R$  of vertices reachable from  $s \in V$

Reachable( $s$ ):

$$R \leftarrow \{s\}$$

While there is an edge  $(u, v) \in E$  with  $u \in R$  and  $v \notin R$

Add  $v$  to  $R$

## generic graph traversal algorithm

---

**Find:** Set  $R$  of vertices reachable from  $s \in V$

Reachable( $s$ ):

$$R \leftarrow \{s\}$$

While there is an edge  $(u, v) \in E$  with  $u \in R$  and  $v \notin R$

Add  $v$  to  $R$

We didn't specify the order in which to check the edges.  
Different orders lead to algorithms with different properties.  
Two main examples:  
BFS (breadth-first search) and DFS (depth-first search)

## breadth-first search

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- Completely explore the vertices in order of their distance from  $s$
- Naturally implemented using a queue

## properties of BFS

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- **BFS( $s$ )** visits  $x$  if and only if there is a path in  $G$  from  $s$  to  $x$ .
- Edges followed to undiscovered vertices define a “breadth first spanning tree” of  $G$
- Layer  $i$  in this tree,  $L_i$ 
  - those vertices  $u$  such that the shortest path in  $G$  from the root  $s$  is of length  $i$ .
- On undirected graphs
  - All non-tree edges join vertices on the same or adjacent layers

## BFS

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Global initialization: mark all vertices “unvisited”

**BFS( $s$ )**

```

mark  $s$  “visited”;  $R \leftarrow \{s\}$ ; layer  $L_0 \leftarrow \{s\}$ 
while  $L_i$  not empty
   $L_{i+1} \leftarrow \emptyset$ 
  For each  $u \in L_i$ 
    for each edge  $\{u, v\}$ 
      if ( $v$  is “unvisited”)
        mark  $v$  “visited”
        Add  $v$  to set  $R$  and to layer  $L_{i+1}$ 
    mark  $u$  “fully-explored”
   $i \leftarrow i+1$ 

```

## properties of BFS

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On undirected graphs

– All non-tree edges join vertices on the same or adjacent layers

– Suppose not

Then there would be vertices  $(x, y)$  such that  $x \in L_i$  and  $y \in L_j$  and  $j > i+1$

Then, when vertices incident to  $x$  are considered in BFS  $y$  would be added to  $L_{i+1}$  and not to  $L_j$

## BFS application: shortest paths

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Tree gives shortest paths from start vertex

