

Lecture 3: Paths, Cycles, Trees

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Reminder from last lecture

- A **graph** G is a pair $(V(G), E(G))$, where
 - $V(G)$ is a **nonempty** set of **vertices** (or **nodes**),
 - $E(G)$ is a set of **unordered pairs** uv with $u, v \in V(G)$ and $u \neq v$, called the **edges** of G .
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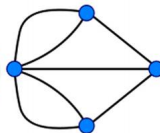
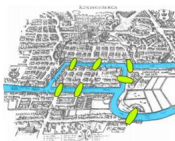
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- When G is clear from the context, we write simply V and E .
- A **path** in G is a sequence v_0, v_1, \dots, v_n of distinct vertices such that $v_i v_{i+1} \in E$ for $i = 0, \dots, n-1$.
- A **cycle** in G is a path v_0, v_1, \dots, v_n such that $v_n v_0 \in E$.
- The **length** of a path or a cycle is the number of edges in it.
- A graph is **connected** if any two vertices in it are connected by a path.

Contents for today's lecture

- Eulerian and Hamiltonian cycles;
- The traveling salesman problem;
- Trees and their properties;
- Applications of trees;
- Examples and exercises.

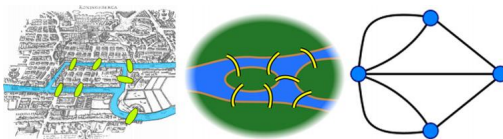
Special circuits/cycles in graphs

- Can we travel along the edges of a given graph G so that we start and finish at the same vertex and traverse **each edge exactly once**?
 - Such a circuit in G is called a **Eulerian** circuit, after Leonhard Euler (1707-83).

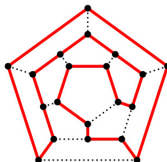


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- Can we travel along the edges of a given graph so that we start and finish at the same vertex and visit **each vertex exactly once**?
 - Such a cycle is called a **Hamiltonian** cycle, after William Hamilton (1805-65).



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Sufficiency (\Leftarrow): **Induction** on the number of vertices in G .

Induction base: $G = K_3$, the claim is obvious.

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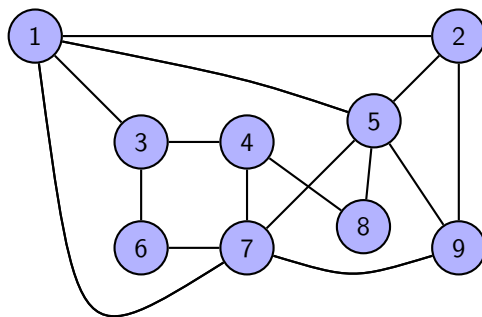
Necessity (\Rightarrow): each time this circuit passes through a vertex v , it contributes 2 to $\deg(v)$. Since each edge is used exactly once, $\deg(v)$ must be even.

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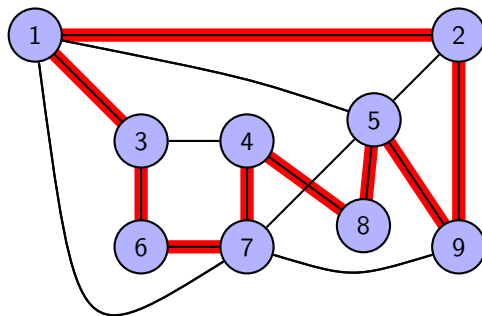
- Start walking from any vertex u along the untraversed edges, and continue by “marking” every edge when you traverse it.
- Stop when you arrive at a vertex where you can’t continue (all edges of it are already traversed). This vertex must be u again (only even-degrees!).
- Hence we have a circuit C . Delete all edges in C from G to obtain a smaller graph H in which all degrees are also even.
- By induction hypothesis, each conn. component of H has an Eulerian circuit.
- Combine C and these circuits to obtain the required circuit for G . (why?)

Hamiltonian cycles



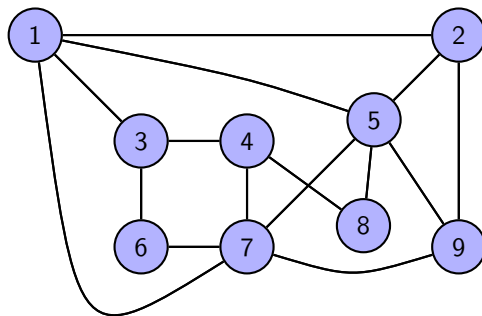
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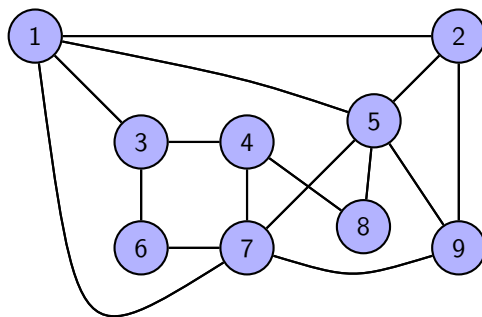
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- Detecting Eulerian circuits algorithmically is easy. (How?)
- Detecting Hamiltonian cycles is hard (NP-complete).

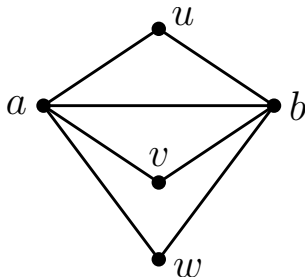
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Exercise 1: Which of the graphs Q_3 , Q_4 , K_3 , K_4 are Eulerian? Hamiltonian? (that is, contains the corresponding circuit/cycle).

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What about this graph?



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- A salesman should visit cities c_1, c_2, \dots, c_n in some order, visiting each city exactly once and returning to the starting point
- A (positive integer) cost $d(i, j)$ of travel between each pair (c_i, c_j) is known.
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Given a graph G with set V of vertices ($|V| = n$) and set E of edges,

- for each vertex v , create a city c_v ;
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Then detecting a Hamiltonian cycle in G can be viewed as TSP:

- if G has a Hamiltonian cycle then the cycle is a route of cost exactly n .
- if there is a route of cost n then it can't use pairs with cost 2 (why?)
and so goes through edges of G and hence is a Hamiltonian cycle.

Trees

We now turn to a special graph class that has many applications in many areas.

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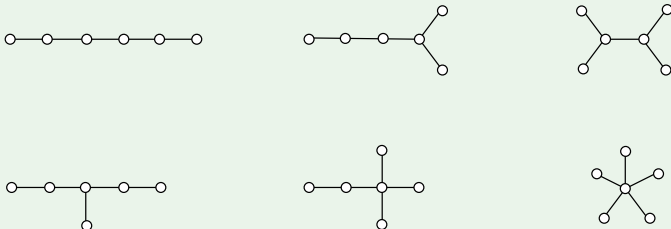
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Examples

The different trees on 6 vertices are shown below.



We can also consider this as a **forest** on 36 vertices.

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Finding **minimum-weight spanning trees** in edge-weighted graphs is an important task in practice: we will learn **fast** algorithms for it in a few lectures.

Leaves in trees

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Can a tree have exactly one leaf?

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 - If $\deg(v) \geq 2$, then there is a cycle.
 - The same also holds for the second end vertex u of P
- $\Rightarrow \deg(u) = \deg(v) = 1$



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- Take a tree T on n vertices, for some $n \geq 3$.
- T contains a leaf v . Consider the graph $T - v$, it has one vertex less and one edge less than T .
- $T - v$ is still connected and (still) acyclic.
- $T - v$ is a tree with $n - 1$ vertices, by induction hypothesis it has $n - 2$ edges.
- T has one edge more, so $n - 1$ edges.

Edges of trees, cont'd

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- By the first part of the proof, T contains exactly $n - 1$ edges.
- T is a subgraph of G , and it has the same number of edges as G .
- Hence, T and G are the same.
- In particular, G is a tree.



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By **contradiction**.

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- Let x and y in $V(T)$ be distinct and chosen in such a way that x and y are on both P and Q , but between x and y the vertices on P and Q are disjoint. (It is possible that $x = u$ and $y = v$, but this is not necessarily the case.)
- Then the segments of P and Q between x and y together form a cycle.
- This contradicts that T is a tree. Hence there is a unique (u, v) -path in T .



Exercises

We have shown that, for a graph G on n vertices, the following conditions are equivalent:

- 1 G is tree;
- 2 G is connected and has $n - 1$ edges.

Exercise 2: Show that these conditions are also equivalent to each of the following:

- 3 G is acyclic and has $n - 1$ edges;
- 4 any two distinct vertices of G are connected by a unique path;
- 5 for any distinct $u, v \in V$, if $uv \notin E(G)$ then the graph $G + uv$ contains a unique cycle.

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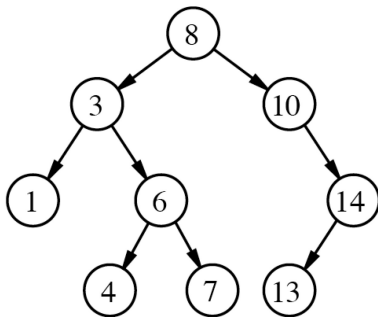
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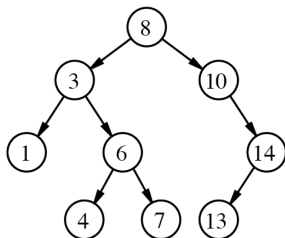
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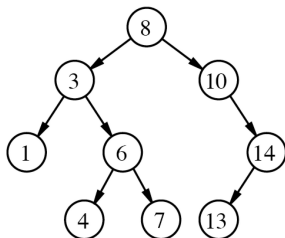
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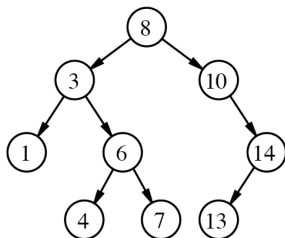


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- The neighbours of v in the next level are called the **children** of v .

Rooted trees, children and parents

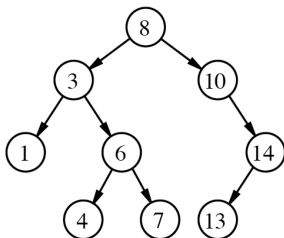


Definitions

Let v be a vertex in a rooted tree T .

- The neighbours of v in the next level are called the **children** of v .
- the (unique) neighbour of v in the previous level (if v is not the root) is called the **parent** of v .

Rooted trees, children and parents

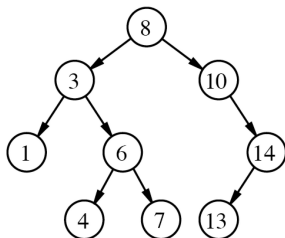


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Rooted trees, children and parents



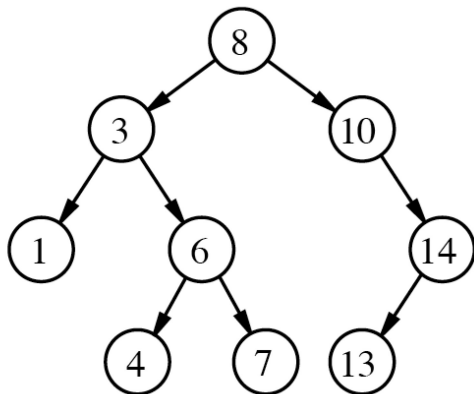
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- If v has children, then it is an **internal** vertex.

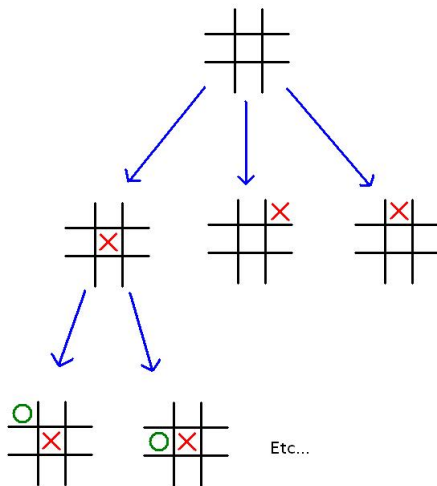
Some applications of trees

- Binary search trees (we have seen these earlier in ADS)



Some applications of trees

- Search trees (more on this in [AI Search](#))



Some applications of trees

- Phylogenetic trees (Bioinformatics)

