## Learning Goals

- Define Hamiltonian Cycles and Paths
- State the HAMILTONIAN CYCLE/PATH problem
- Understand the reduction from HAMILTONIAN CYCLE to HAMILTONIAN PATH
- Understand the reduction from 3-SAT to HAMILTONIAN CYCLE
- State the TRAVELING SALESMAN problem
- Understand the reduction from HAMILTONIAN PATH to TRAVELING SALESMAN
- Definition of Eulerian paths and cycles
- Criterion for existence of Eulerian path/cycle

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# Classical NP-complete problems

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- Since then, new problems are shown to be NP complete almost every week (if not every day).
- Different classes of NP-complete problems enable us to recognize other NP-complete problems faster.
- Reductions to these problems are exemplary for coming up with reductions.

# Hamiltonian Cycles

### Definition

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In the HAMILTONIAN CYCLE problem, we are given a directed graph and must decide whether there exists a Hamiltonian cycle. In the HAMILTONIAN PATH problem, we are given a directed graph and must decide whether there exists a Hamiltonian path.

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HAMILTONIAN CYCLE is NP-complete.

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#### Proof.

HAMILTONIAN CYCLE is in NP. Certificate for a YES instance: a Hamiltonian cycle. Verifier: verify it is a cycle that visits every node exactly once.

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"Gadget": a fragment of a problem that encodes a fragment from another problem.

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In HAMILTONIAN CYCLE, what is a gadget to represent the TRUE or FALSE assignment to a variable in 3-SAT?

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Gadget representing variables



A gadget for a variable. Starting from  $s_i$  there is one way to traverse all nodes and arrive at  $t_i$  (TRUE); starting from  $t_i$ , there is one way to traverse all nodes and arrive at  $s_i$  (FALSE).

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Connection of two variable gadgets.

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# Adding Clauses



Adding a positive literal to a clause.

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# Adding Clauses



Adding a negative literal to a clause.

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Adding starting and ending points



Given a 3-SAT formula, construct a directed graph G:

- Nodes of G:
  - **1** Add node  $s = s_0$ ,  $t = t_{n+1}$ ;
  - 2 For each variable  $x_i$ , add node  $s_i = u_{i,0}$ ,  $t_i = u_{i,m+1}$ ,  $u_{i,1}$ , ...,  $u_{i,m}$ ;
  - **3** For each clause j, add node  $v_j$ .

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- Edges of *G*:

• For  $i = 0, \ldots, n$ , connect both  $s_i$  and  $t_i$  to both  $s_{i+1}$  and  $t_{i+1}$ ;

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- Edges of *G*:
  - For i = 0,..., n, connect both s<sub>i</sub> and t<sub>i</sub> to both s<sub>i+1</sub> and t<sub>i+1</sub>;
    For i = 1,..., n, j = 0, 1, ..., m, connect u<sub>i,j</sub> to u<sub>i,j+1</sub> and u<sub>i,j+1</sub> to u<sub>i,j</sub>;

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October 21, 2019

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Idea: Refine the construction to prevent such jumping from happening.

# **Refined Construction**



## Formal Description

Given a 3-SAT formula, construct a directed graph G:

- Nodes of *G*:
  - **1** Add node  $s = s_0$ ,  $t = t_{n+1}$ ;
  - 2 For each variable  $x_i$ , add node  $s_i = u_{i,0}$ ,  $t_i = u_{i,3m+1}$ ,  $u_{i,1}$ , ...,  $u_{i,3m}$ ;
  - 3 For each clause j, add node  $v_j$ .
- Edges of *G*:
  - For  $i = 0, \ldots, n$ , connect both  $s_i$  and  $t_i$  to both  $s_{i+1}$  and  $t_{i+1}$ ;
  - 2 For i = 1, ..., n, j = 0, 1, ..., 3m, connect  $u_{i,j}$  to  $u_{i,j+1}$  and  $u_{i,j+1}$  to  $u_{i,j}$ ;
  - Sore ach clause j that includes literal x<sub>i</sub>, connect u<sub>i,3j-2</sub> to v<sub>j</sub> and v<sub>j</sub> to u<sub>i,3j-1</sub>;
  - For each cluase j that includes literals ¬x<sub>i</sub>, connect u<sub>i,3j-1</sub> to v<sub>j</sub> and v<sub>j</sub> to u<sub>i,3j-2</sub>;
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## Hamiltonian Paths

#### Proposition

## HAMILTONIAN CYCLE $\leq_{P}$ HAMILTONIAN PATH.

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### Proof Sketch.

Pick one node and split it into two copies, one with all incoming edges and the other with all outgoing edges.

# Eulerian Tours and Eulerian Circuits

### Definition

Given an undirected graph G, a *Eulerian trail* (or Eulerian path) is a path that traverses each *edge* in G exactly once. A Eulerian trail that is a cycle is called a Eulerian circuit (or Eulerian cycle).

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#### Theorem

Deciding whether a given graph has a Eulerian cycle is in P. Deciding whether a given graph has a Eulerian path is in P.

NP-Complete Sequencing Problems

# Seven Bridges of Königsberg





#### Theorem

A graph G has a Eulerian cycle if and only if all its nodes have even degrees and all the nodes with non-zero degrees are in the same connected component.

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Proof sketch for a graph with two odd-degree nodes: First find a path from one odd degree node to the other, then the rest of the graph has a Eulerian cycle in each of its connected component. Concatenate these cycles to the path forms a Eulerian path.

#### Definition

Given *n* nodes  $v_1, \ldots, v_n$ , a *tour* is a path that starts from  $v_1$ , visits every other node exactly once, and returns to  $v_1$ . In the *Traveling Salesman Problem (TSP)*, we are given *n* nodes and a distance  $d_{i,j}$  from each node  $v_i$  to another one  $v_j$ , and a bound *D*. We are asked to decide whether there is a tour of total distance at most *D*.

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We showed that asymmetric, metric TSP is NP-complete. In fact, symmetric, metric TSP is already NP-complete.

Does the following problem admit a polynomial-time algorithm or is it NP-complete?

• Given a set  $A = \{a_1, \ldots, a_n\}$ , a collection  $B_1, B_2, \cdots, B_m$  of subsets of A, and an integer k > 0. Is there a set  $H \subseteq A$ ,  $|H| \le k$  such that  $H \cap B_i \neq \emptyset$  for  $i = 1, \ldots, m$ ?

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  - Does there exist at least k edge-disjoint paths from s to t?
  - Given m paths  $P_1, \dots, P_m$  from s to t, does there exist at least k 2 paths among  $P_1, \dots, P_m$  that are edge-disjoint?

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