

# Graph Theory and Complex Networks: An Introduction

Maarten van Steen

VU Amsterdam, Dept. Computer Science  
Room R4.20, steen@cs.vu.nl

## Chapter 04: Network traversal

Version: April 14, 2014

vrije Universiteit amsterdam



1 / 28

## Contents

Chapter	Description
01: Introduction	History, background
02: Foundations	Basic terminology and properties of <a href="#">graphs</a>
03: Extensions	Directed & weighted graphs, colorings
<b>04: Network traversal</b>	Walking through graphs (cf. <a href="#">traveling</a> )
05: Trees	Graphs without <a href="#">cycles</a> ; routing algorithms
06: Network analysis	Basic metrics for analyzing <a href="#">large graphs</a>
07: Random networks	Introduction modeling <a href="#">real-world networks</a>
08: Computer networks	The <a href="#">Internet</a> & <a href="#">WWW</a> seen as a huge graph
09: Social networks	<a href="#">Communities</a> seen as graphs

2 / 28

2 / 28

Network traversal

## Introduction

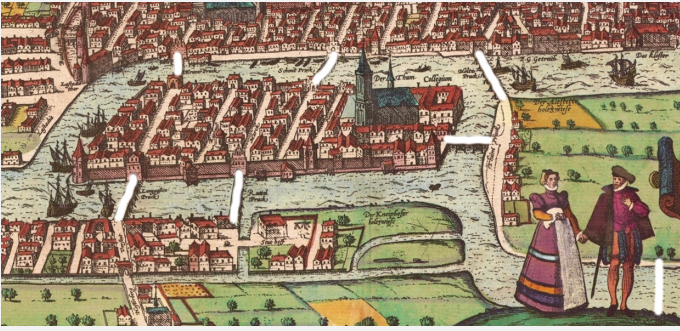
### Algorithms that allow one to move or route through a network

- 1 Euler tours: visit every edge exactly once.
- 2 Hamilton cycles: visit every vertex exactly once.

3 / 28

3 / 28

## The Königsberg problem



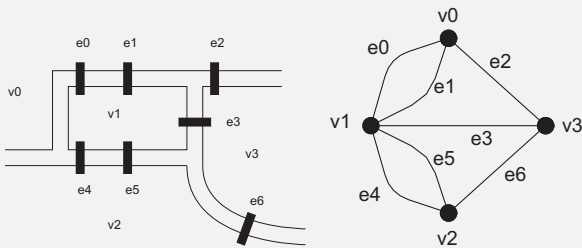
### Question

Can one walk through the city and cross each of the seven bridges exactly once?

4 / 28

4 / 28

## Modeling the problem in terms of graphs



5 / 28

5 / 28

## Euler tours

### Definition

A **tour** of a graph  $G$  is a  $(u, v)$ -walk in which  $u = v$  (i.e., it is a **closed walk**) and that traverses each edge in  $G$ . An **Euler tour** is a tour in which all edges are traversed exactly once.

### Related: Chinese postman problem

- So called because originally formulated by a Chinese mathematician.
- **Issue:** Schedule the round of a postman such that (1) all streets are passed at least once and (2) the total traveled distance is minimal.
- **Solution:** Extend map of streets to a Eulerian graph with minimal weight.

6 / 28

6 / 28

## Necessary and sufficient conditions

**Theorem**

A connected graph  $G$  (with more than one vertex) has an Euler tour iff it has no vertices of odd degree.

**Proof: Euler tour  $\Rightarrow$  no odd-degree vertices**

- Let  $C$  be an Euler tour starting/ending in vertex  $v$ . Let  $u \neq v$
- $u \in V(C)$ ,  $\forall \langle w_{in}, u \rangle \in E(C) : \exists \langle u, w_{out} \rangle \in E(C)$ .
- Every edge is traversed exactly once  $\Rightarrow$  unique pairing of edges  $\langle w_{in}, u \rangle$  and  $\langle u, w_{out} \rangle$
- $\delta(u)$  must be even.

7 / 28

7 / 28

## Necessary and sufficient conditions

**Proof: no odd-degree vertices  $\Rightarrow$  exists Euler tour**

- Select  $v$  and construct trail  $P$  until you need to cross an edge for the second time. Let  $P$  end in  $w$ .
- Assume  $w \neq v \Rightarrow$  entered  $w$  once more than left it  $\Rightarrow \delta(w)$  is odd. Contradiction. Hence  $P$  must end in  $v$ .
- $E(P) = E(G) \Rightarrow$  done. Assume  $E(P) \subset E(G)$ :
  - Let  $u \in V(P)$  be incident with edges not in  $P$ . Consider  $H = G[E(G) - E(P)]$ .
  - $\forall x \in V(P) : \delta(x)$  is even  $\Rightarrow \forall x \in V(H) : \delta(x)$  is even.
  - Let  $u$  lie in component  $H'$   $\Rightarrow$  construct similar largest trail  $P'$
  - $P \leftarrow P \cup P'$  and repeat until  $E(P) = E(G)$ .

8 / 28

8 / 28

## Fleury's algorithm

**Algorithm (Fleury)**

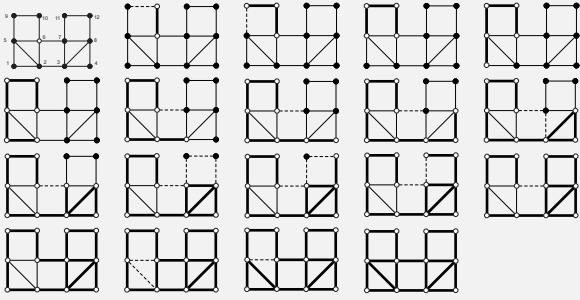
Consider an Eulerian graph  $G$ .

- 1 Choose an arbitrary vertex  $v_0 \in V(G)$  and set  $W_0 = v_0$ .
- 2 Assume that we have constructed a trail  $W_k = [v_0, e_1, v_1, e_2, v_2, \dots, e_k, v_k]$ . Choose an edge  $e_{k+1} = \langle v_k, v_{k+1} \rangle$  from  $E(G) \setminus E(W_k)$  such that, preferably,  $e_{k+1}$  is not a cut edge of the induced subgraph  $G_k = G - E(W_k)$ .
- 3 We now have a trail  $W_{k+1}$ . If there is no edge  $e_{k+2} = \langle v_{k+1}, v_{k+2} \rangle$  to select from  $E(G) \setminus E(W_{k+1})$ , stop. Otherwise, repeat the previous step.

9 / 28

9 / 28

## Fleury's algorithm



10 / 28

10 / 28

## Chinese postman problem

### Problem as a graph

Model city plan as a weighted graph:

- junction as a vertex
- street as edge, length represented by weight

Find a closed walk with minimal total weight.

### Observation

We need to possibly make  $G$  Eulerian first by adding edges leading to  $G^*$  such that  $\sum_{e \in E(G^*) \setminus E(G)} w(e)$  is minimal.

### Question

Why may this be so difficult?

11 / 28

11 / 28

## Postman: example



12 / 28

12 / 28

## Postman: algorithm

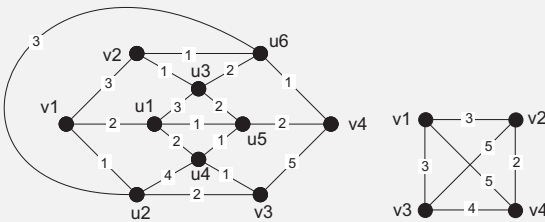
Consider a weighted, connected graph  $G$  with **odd-degree vertices**  $V_{\text{odd}} = \{v_1, \dots, v_{2k}\}$  where  $k \geq 1$ .

- 1 For each pair of distinct odd-degree vertices  $v_i$  and  $v_j$ , find a **minimum-weight  $(v_i, v_j)$ -path**  $P_{i,j}$ .
- 2 Construct a **weighted complete graph** on  $2k$  vertices in which vertex  $v_i$  and  $v_j$  are joined by an edge having weight  $w(P_{i,j})$ .
- 3 Find the set  $E$  of  $k$  edges  $e_1, \dots, e_k$  such that  $\sum w(e_i)$  is minimal and no two edges are incident with the same vertex.
- 4 For each edge  $e \in E$ , with  $e = \langle v_i, v_j \rangle$ , duplicate the edges of  $P_{i,j}$  in graph  $G$ .

13/28

13/28

## Postman: algorithm example

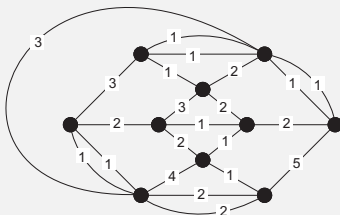


$$\begin{aligned}
 P_{1,2} &= [v_1, v_2] \text{ (weight: 3)} & P_{2,3} &= [v_2, u_3, u_5, u_4, v_3] \text{ (weight: 5)} \\
 P_{1,3} &= [v_1, u_2, v_3] \text{ (weight: 3)} & P_{2,4} &= [v_2, u_6, v_4] \text{ (weight: 2)} \\
 P_{1,4} &= [v_1, u_1, u_5, v_4] \text{ (weight: 5)} & P_{3,4} &= [v_3, u_4, u_5, v_4] \text{ (weight: 4)}
 \end{aligned}$$

14/28

14/28

## Postman: algorithm example



15/28

15/28

## Hamilton cycles

### Definition

A **Hamilton path** of a connected graph  $G$  is a path that contains every vertex of  $G$ . A **Hamilton cycle** is a cycle containing every vertex of  $G$ .  $G$  is called **Hamiltonian** if it has a Hamilton cycle.

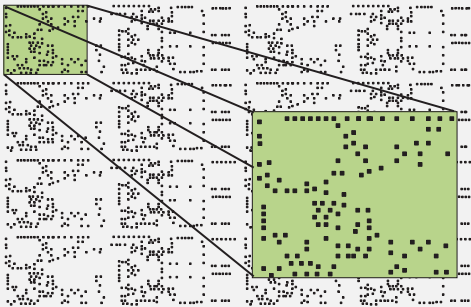
### Important note

There is no known **efficient** algorithm to determine whether a graph is Hamiltonian. Yet, finding Hamilton cycles is important: **Traveling Salesman Problem (TSP)**.

16 / 28

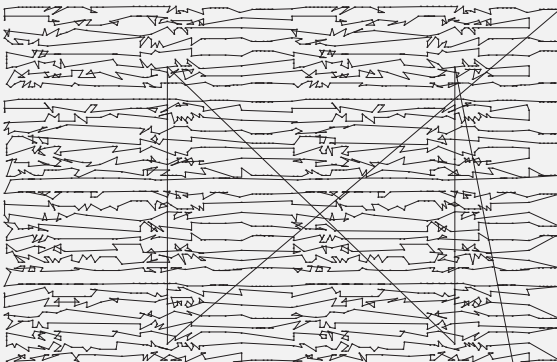
## TSP: Example

**Drilling holes:** Consider a board for electrical circuits. To fasten the components, we need to drill holes. **Issue:** Which track should the drilling machine follow?



17 / 28

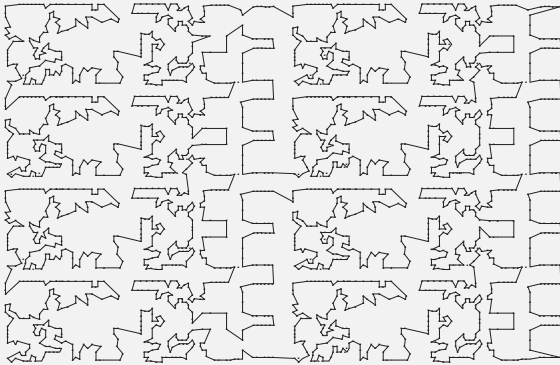
## TSP: Example



18 / 28

18 / 28

## TSP: Example



19 / 28

19 / 28

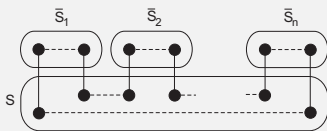
## Some formal properties

## Theorem

$G$  Hamiltonian  $\Rightarrow \forall S \subset V(G), S \neq \emptyset : \omega(G - S) \leq |S|$ .

## Proof

- Let  $C$  be a Hamilton cycle  $\Rightarrow$  every vertex is visited exactly once  $\Rightarrow \omega(C - S) \leq |S|$ .
- $V(C) = V(G) \Rightarrow \omega(G - S) \leq \omega(C - S)$ .



20 / 28

20 / 28

## Some formal properties: Dirac

## Theorem (Dirac)

$G$  is simple with  $n \geq 3$  vertices and  $\forall v : \delta(v) \geq n/2 \Rightarrow G$  is Hamiltonian.

## Proof: by induction

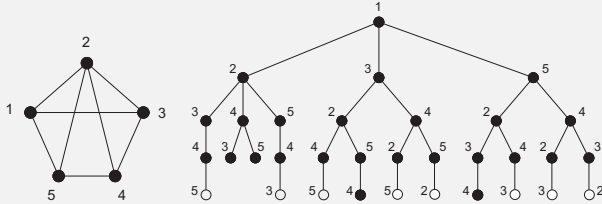
- For  $n = 3$  vertices: trivial. Assume the theorem has been proven correct for graphs with  $k \geq 3$  vertices.
- Let  $G$  have  $k + 1$  vertices, constructed from **any** graph  $G^*$  with  $k$  vertices, by adding a vertex  $u$  and joining  $u$  to at least  $(k + 1)/2$  other vertices.
- Let  $C^* = [v_1, v_2, \dots, v_k]$  be a Hamilton cycle in  $G^*$ .
- Vertex  $u$  is joined to at least  $(k + 1)/2$  vertices from  $C^*$   $\Rightarrow$  there is at least a pair  $v_i$  and  $v_{i+1}$  that are adjacent in  $C^*$
- Construct a new cycle  $C = [v_1, \dots, v_i, u, v_{i+1}, v_k]$

21 / 28

21 / 28

## Finding Hamilton cycles

**Brute force:** Select a vertex  $v$ , and explore all possible Hamilton paths **originating** from  $v$ , and check whether they can be expanded to a cycle:



22 / 28

22 / 28

## Posa: applying rotational transformations

### Algorithm (Posa)

Randomly select  $u \in V(G)$ , forming the starting point of path  $P$ . Let  $\text{last}(P) = u$  denote the current end point of  $P$ .

- 1 Randomly select  $v \in N(\text{last}(P))$ , such that
  - 1 Preferably,  $v \notin V(P)$
  - 2 If  $v \in V(P) \Rightarrow v$  has not been previously selected as neighbor of an end point before.
- If no such vertex exists, stop.
- 2 If  $v \notin V(P)$ , set  $P \leftarrow P + \langle \text{last}(P), v \rangle$ .

23 / 28

23 / 28

## Posa: applying rotational transformations

### Algorithm (Posa - cntd)

- 3 If  $v \in V(P)$ , apply a **rotational transformation of  $P$**  using edge  $\langle \text{last}(P), v \rangle$ :



leading to  $P^*$ . If  $\text{last}(P^*)$  has not yet been end point for paths of the current length,  $P \leftarrow P^*$ .

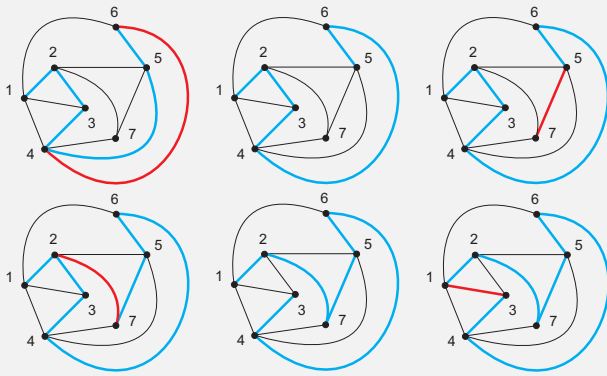
- 4  $V(P) = V(G)$  and  $\langle u, \text{last}(P) \rangle \in E(G) \Rightarrow$  found a Hamilton cycle. Otherwise, continue with step 1.

24 / 28

24 / 28



## Posa example

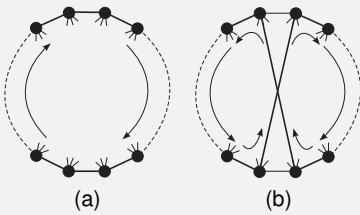


25 / 28

## Optimal Hamilton cycle

## Basic idea

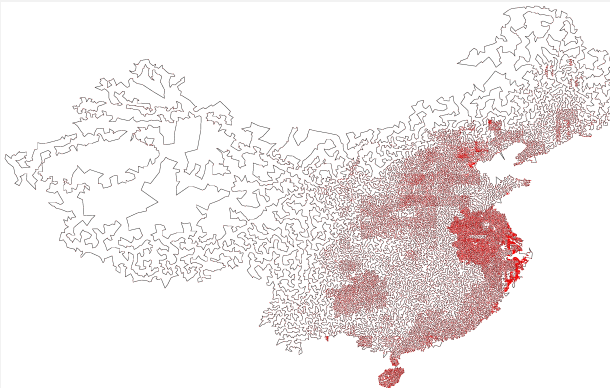
We want to find a Hamilton cycle with **minimal weight**  $\Rightarrow$  extend graph to a complete one in which distance between two vertices reflects real-world distance.



- (a) Start with an arbitrary cycle
- (b) If swapping edges improve weight  $\Rightarrow$  better cycle

26 / 28

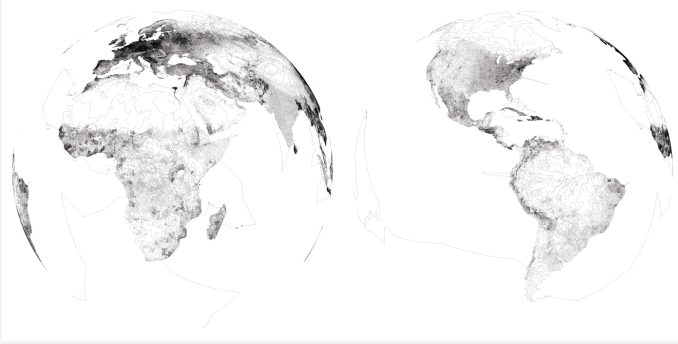
## Hamilton example: China



71,000 cities, 4,566,563 edges  $\leq 0.024\%$  longer than optimal one.

27 / 28

## Hamilton example: The world



1,904,711 cities, 7,516,353,779 edges  $\leq 0.076\%$  longer than optimal one.