



### **Chap 6. Optimal Graph Traversals**



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The sources of most figure images are from the course slides (Graph Theory) of Prof. Gross

### **Outline**

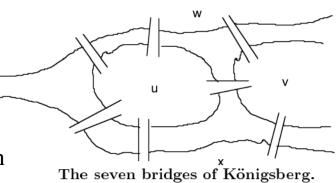
- Eulerian Trails and Tours
- Debruijn Sequences and Postman Problems
- Hamiltonian Paths and Cycles
- Gray Codes and Traveling Salesman Problems



### 6.1 Eulerian Trails and Tours

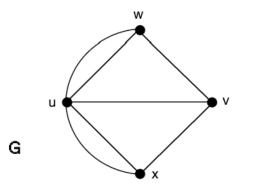
- REVIEW FROM §1.5:
  - ✓ An *eulerian trail* in a graph is a trail that contains every edge of that graph.
  - ✓ An *eulerian tour* is a closed eulerian trail.
  - ✓ An eulerian graph is a graph that has an eulerian tour.
- REVIEW FROM §4.5: [**Eulerian-Graph Characterization**] The following statements are equivalent for a connected graph G.
  - 1. G is eulerian.
  - 2. The degree of every vertex in *G* is even.
  - 3.  $E_G$  is the union of the edge-sets of a set of edge-disjoint cycles in G.
- Königsberg was a town of ancient East Prussia. The two branches of the River Pregel converge and flow through to the Baltic Sea. The townspeople wanted to know if it was possible to take a walk that crossed each of the bridges exactly once before returning to the starting point.

  The Prussian emperor, Frederick the Great, brought the problem to the attention of the famous Swiss mathematician Leonhard Euler (1736).



## Königsberg Bridges Problem

#### ■ Königsberg's Graph



Graph representation of Königsberg.

#### Algo 6.1.1: Eulerian Tour

Input: a conn graph G whose vertices all have even degree. Output: an eulerian tour T.

Start at any vertex v, and construct a closed trail T.

While there are edges of G not already in trail T

Choose a vtx w in T that is endpt of an unused edge.

Starting at vtx w, construct a closed trail D of unused edges.

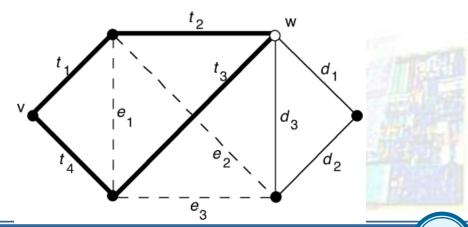
Enlarge trail T by splicing trail D into T at vtx w.

Return T.

By Hierholzer in 1873

- COMPUTATIONAL NOTE: A modified *depth-first search* (§4.2), in which every unused edge remains in the stack, can be used to construct the closed trails.
- **Example 6.1.1:**

$$T = \langle t_1, t_2, t_3, t_4 \rangle, D = \langle d_1, d_2, d_3 \rangle$$
  
 $T' = \langle t_1, t_2, d_1, d_2, d_3, t_3, t_4 \rangle, D = \langle e_1, e_2, e_3 \rangle$ 



### **Open Eulerian Trails**

- **Theorem 6.1.1** A connected graph *G* has an open eulerian trail if and only if it has exactly two vertices of odd degree. Furthermore, the initial and final vertices of an open eulerian trail must be the two vertices of odd degree.
  - ✓ The concept of the proof is to add a new edge to fulfill the characterization of a Eulerian graph.
  - **√** (⇒)
    - Suppose that  $\langle x, e_1, v_1, e_2, \dots, e_m, y \rangle$  is an open eulerian trail in G. Adding a new edge e joining vertices x and y creates a new graph  $G^* = G + e$  with an eulerian tour  $\langle x, e_1, v_1, e_2, \dots, e_m, y, e, x \rangle$ .
    - $\triangleright$  By the eulerian-graph characterization, the degree in the eulerian graph  $G^*$  of every vertex must be even, and thus, the degree in graph G of every vertex except x and y is even.
  - **√** (⇐)
    - Suppose that x and y are the only two vertices of graph G with odd degree. If e is a new edge joining x and y, then all the vertices of the resulting graph  $G^*$  have even degree.
    - It follows from the eulerian-graph characterization that graph  $G^*$  has an eulerian tour T. Hence the trail T e obtained by deleting edge e from tour T is an open eulerian trail of  $G^* e = G$

•

### **Eulerian Trails in Digraphs**

- **Theorem 6.1.2** [Eulerian-Digraph Characterization]. The following statements are equivalent for a connected digraph D.
  - 1. *Digraph D* is eulerian.
  - 2. For every vertex v in D, indegree(v) = outdegree(v).
  - 3. The edge set  $E_D$  is the union of the edge-sets of a set of edge-disjoint directed cycles in digraph D.
- **Theorem 6.1.3** A connected digraph has an open eulerian trail from vertex x to vertex y if and only if indegree(x) + 1 = outdegree(x), indegree(y) = outdegree(y) + 1, and all vertices except x and y have equal indegree and outdegree.

#### Tarry's Maze-Searching Algorithm Revisited

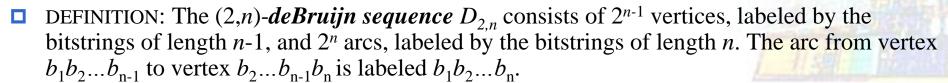
- DEFINITION: A *double tracing* is a closed walk that traverses every edge exactly twice. A double tracing is *bidirectional* if every edge is used once in each of its two directions.
- **Proposition 6.1.4** Every connected graph has a bidirectional double tracing. In a tree, every double tracing is bidirectional.

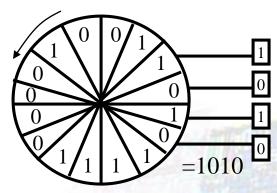
## 6.2 DeBruijn Sequences and Postman Problems

- DEFINITION: A bitstring of length  $2^n$  is called a (2,n)-deBruijn sequence if each of the  $2^n$  possible bitstrings of length n occurs exactly once as a substring, where wraparound is allowed.
- **Example 6.2.1:** (2,1)-deBruijn, (2,2)-deBruijn, (2,3)-deBruijn, (2,4)-deBruijn.

01 0110 01110100 0000100110101111

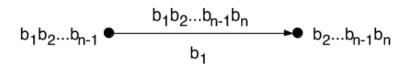
- Application 6.2.1. *Identifying the Position of a Rotating Drum*: Suppose that a rotating drum has 16 different sectors. We can assign a 0 or 1 to each of the 16 sectors by putting conducting material in some of the sectors and nonconducting material in others. Sensors can then be placed in a fixed position to "read" a 4-bit string corresponding to the four sectors that are positioned there. For example, in Figure 6.2.1, the sensors read 1010.
  - ✓ It's more space efficient than writing a 4-bit identifying code in each sector.
  - ✓ Generally, (2,n)-deBruijn sequences can be constructed for any positive integers.
  - ✓ Also can be extended to (p,n)-sequences for any positive integers p and n by finding an Eulerian tour on a digraph.



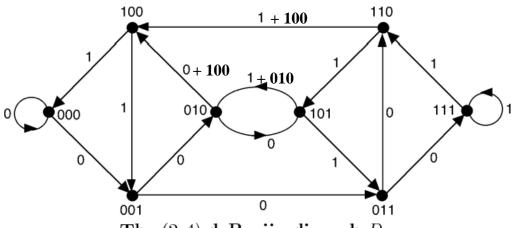


### **DeBruijn Sequences and Postman Problems**

#### **Example 6.2.2:**



edge rule:  $b_1b_2...b_{n-1} \to b_2...b_{n-1}0/1$ 



The (2,4)-deBruijn digraph  $D_{2,4}$ .

- **Proposition 6.2.1.** The (2,n)-deBruijn digraph  $D_{2,n}$  is eulerian.
  - ✓ We have to prove (1)  $D_{2,n}$  is connected and (2)  $\forall v$ , indegree(v)=outdegree(v).
  - The deBruijn graph  $D_{2,n}$  is strongly connected, since if  $a_1 a_2 \dots a_{n-1}$  and  $b_1 b_2 \dots b_{n-1}$  are any two vertices of  $D_{2,n}$ , then the vertex sequence:

$$a_1 a_2 \dots a_{n-1}; a_2 \dots a_{n-1} b_1; a_3 \dots a_{n-1} b_1 b_2; \dots; b_1 b_2 \dots b_{n-1}$$
 defines a directed trail from  $a_1 a_2 \dots a_{n-1}$  to  $b_1 b_2 \dots b_{n-1}$ .

Moreover, for every vertex  $b_1b_2...b_{n-1}$  of  $D_{2,n}$ , the only outgoing arcs from  $b_1b_2...b_{n-1}$  are  $b_1b_2...b_{n-1}0$  and  $b_1b_2...b_{n-1}1$ , and the only incoming arcs to  $b_1b_2...b_{n-1}$  are  $0b_1b_2...b_{n-1}$  and  $1b_1b_2...b_{n-1}$ . Thus,  $indegree(b_1b_2...b_{n-1}) = outdegree(b_1b_2...b_{n-1}) = 2$ , which implies, by Theorem 6.1.2, that  $D_{2,n}$  is eulerian.

## **DeBruijn Sequences and Postman Problems**

**Example 6.2.3:** 

 $000 \xrightarrow{0} 0000 \xrightarrow{0} 001 \xrightarrow{0} 010 \xrightarrow{0} 100 \xrightarrow{1} 001$   $\xrightarrow{0} 011 \xrightarrow{0} 110 \xrightarrow{1} 101 \xrightarrow{1} 010 \xrightarrow{0} 101 \xrightarrow{1} 011$   $\xrightarrow{0} 111 \xrightarrow{1} 111 \xrightarrow{1} 110 \xrightarrow{1} 100 \xrightarrow{1} 000$   $\Rightarrow 0000100110101111$ 

Algo 6.2.1: Constructing a (2, n)-deBruijn Sequence

Input: a positive integer n.

Output: a (2, n)-deBruijn sequence S.

Construct the (2,n)-deBruijn digraph  $D_{2,n}$ .

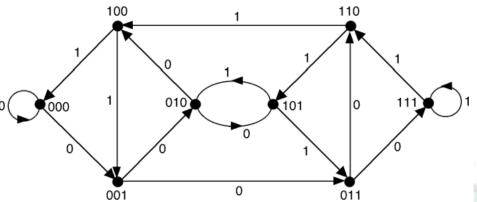
Choose a vertex v.

Construct a directed eulerian tour T of  $D_{2,n}$  starting at v.

Initialize sequence S as the empty sequence  $\langle \rangle$ .

For each arc e in tour T (taken in order of the tour sequence)

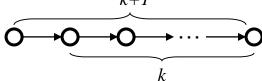
Append the single-bit label of arc e to the right of seq S.



**Remark:** Traversing the tour starting from a vertex different from 000 would result in a (2,4)-deBruijn sequence that is merely a *cyclic shift* of the sequence above. A different (2,4)-deBruijn sequence (i.e., one that is not a cyclic shift) can be obtained by constructing a different eulerian tour in  $D_{2,4}$  (see Exercises).

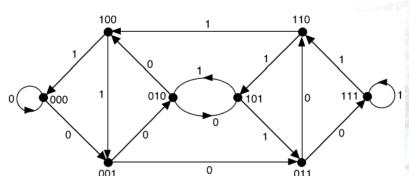
# **DeBruijn Sequences and Postman Problems**

- **Proposition 6.2.2.** The sequence of single-bit arc labels of any directed trail of length  $k, 1 \le k \le n$ , in the (2,n)-deBruijn digraph, is precisely the string of the leftmost k bits of the full label of the initial arc of that trail. k+1
  - ✓ The concept of the proof.



- ✓ The definition of  $D_{2,n}$  implies the assertion for k = 1. Assume for some  $k, 1 \le k \le n-1$ , that the assertion is true for any directed trail of length k.
- ✓ let  $\langle v_0, v_1, ..., v_{k+1} \rangle$  be any directed trail of length k+1. By the induction hypothesis, the single-bit arc labels associated with the subtrail  $\langle v_1, v_2, ..., v_{k+1} \rangle$  match the first k bits of the full label of the arc from  $v_1$  to  $v_2$ .
- Yertex  $v_1$ , which means that they are also bits 2 through k+1 of the full label of the arc from  $v_0$  to  $v_1$ . But the single-bit label on that arc is the leftmost bit of its full label, which completes the induction step.
- **Example 6.2.4:**

$$100 \xrightarrow[1001]{1} 001 \xrightarrow[]{0} 011 \xrightarrow[]{0} 110 \xrightarrow[]{1} 101$$



- Meigu Guan (管梅谷) envisioned a letter carrier who wants to deliver the mail through a network of streets and return to the post office as quickly as possible *Chinese Postman Problem*.
- DEFINITION: A *postman tour* in a graph G is a closed walk that uses each edge of G at least once.
- DEFINITION: In a weighted graph, an *optimal postman tour* is a postman tour whose total edge-weight is a minimum.
- ☐ If every vertex of the graph has even degree, then any eulerian tour is an optimal postman tour.
- REVIEW FROM §4.7: A *matching* in a graph G is a subset M of  $E_G$  such that no two edges in M have an endpoint in common.
- DEFINITION: A *perfect matching* in a graph is a matching in which every vertex is an endpoint of one of the edges.

#### Algorithm 6.2.2: Optimal Postman Tour

*Input*: a connected weighted graph *G*.

Output: an optimal postman tour W.

Find the set *S* of odd-degree vertices of *G*.

For each pair of odd-degree vertices u and v in S

Find a shortest (minimum cost) path *P* in *G* between verices *u* and *v*.

Let  $d_{uv}$  be the length of path P.

Form a complete graph *K* on the vertices of *S*.

For each edge *e* of the complete graph *K* 

Assign to edge e the weight  $d_{uv}$ , where u and v are the endpoints of e.

Find a perfect matching *M* in *K* whose total edge-weight is minimum.

For each edge *e* in the perfect matching *M* 

Let P be the corresponding shortest path in G between the endpoints of edge e.

For each edge *f* on path *P* 

Add to graph G a duplicate copy of edge f, including its edge-weight.

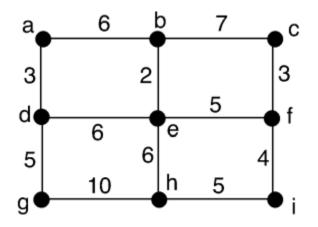
Let  $G^*$  be the eulerian graph formed by adding to graph G the edge duplications from the previous step.

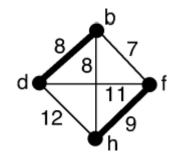
Construct an eulerian tour W in  $G^*$ .

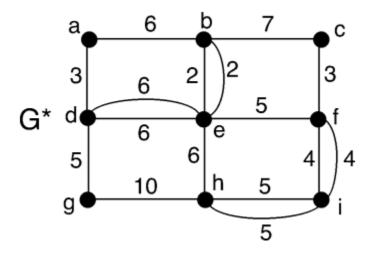
The eulerian tour W corresponds to an optimal postman tour of the original graph G.

- 1. Build a complete graph for all odd-degree vertices.
- 2. Find a minimum edge-weight perfect matching.
- 3. Duplicate all edges in the shortest path between the endpoints of edges.

### **Example 6.2.5:**







 $\langle a, b, c, f, e, b, e, d, e, h, i, f, i, h, g, d, a \rangle$ 

Remark: Edmonds and Johnson's polynomial-time solution applies equally well to the digraph version of the Chinese Postman Problem, but for *mixed graph* (having both undirected and directed edges), the problem becomes NP-hard ([Pa76]). In their same paper, Edmonds and Johnson gave an approximate algorithm for the mixed-graph problem, and G. Frederickson [Fr79] showed that the solution obtained is never worse than twice the optimum. He also proposed some modifications that improved the worst-case performance.

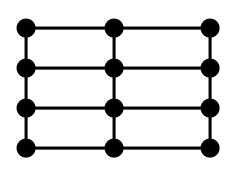
#### **Other Eulerian-Type Applications**

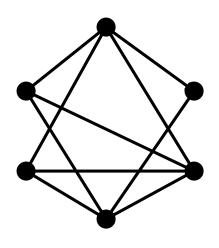
- Application 6.2.2. Street Sweeping: Suppose that the digraph in Figure 6.2.6 below represents a network of one-way streets, with the bold arcs representing streets to be swept. Each edge-weight gives the time required to traverse that street without sweeping (i.e., deadheading the street). The time required to sweep a street is estimated as twice the deadheading time. What route minimizes the total time to sweep all the required streets, starting and ending at vertex z?
  - $\checkmark$  < z, y, x, y, v, u, v, u, x, y, v, w, z >
  - ✓ Total sweeping time = 72
  - $\checkmark$  Deadheading time = 20

Deadheading time

### Other Eulerian-Type Applications

Application 6.2.3. *Mechanical Plotters*: Suppose that a Mechanical Plotter is to plot several thousand copies of the grid shown in Figure 6.2.7, and suppose that it takes twice as long to plot a horizontal edge as it takes to plot a vertical edge. The problem of routing the plotter so that the total time is minimized can be modeled as a postman problem [ReTa81]. (See Exercises).

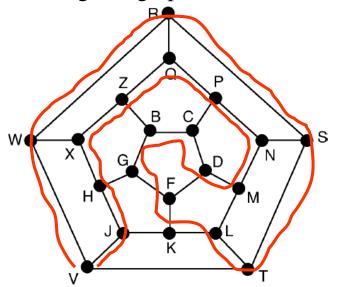




Application 6.2.4. Sequencing Two-Person Conferences: Suppose certain pairs in a department of six people,  $\{A,B,C,D,E,F\}$ , must meet privately in a single available conference room. The matrix above indicates with a 1 each pair that must meet. Is it possible to sequence the two-person conferences so that one of the participants in each conference (except the last one) also participates in the next conference, but no one participates in three consecutive conferences?

# 6.3 Hamiltonian Paths and Cycles

- **DEFINITION**: A *hamiltonian path* (*cycle*) of a graph (cycle) that contains all the vertices. For digraphs, the hamiltonian path or cycle is directed.
- **DEFINITION**: A *hamiltonian graph* is a graph that has a hamiltonian cycle.
- ☐ Irish mathematician Sir William Rowan Hamilton was some of the earliest study of hamiltonian graphs.
- □ A byproduct of his work was the invention of a puzzle known as the *Icosian Game*.
- No characterization such as even degree cheek for Eulerian graph is known, nor is there a quick way of determining whether a given graph is hamiltonian. Actually, it is NP-complete.



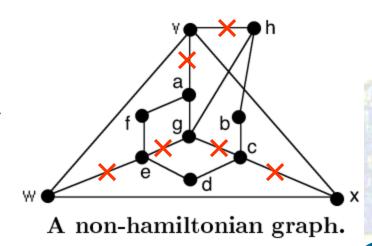
Dodecahedral graph for the Icosian Game.

# **Showing That a Graph Is Not Hamiltonian**

- The following rules are based on the simple observation that any hamiltonian cycle must contain exactly two edges incident on each vertex.
- The strategy for applying these rules is to begin a construction of a hamiltonian cycle and show at some point during the construction that it is impossible to proceed any further.
  - ✓ If a vertex *v* has degree 2, then both of its incident edges must be part of any hamiltonian cycle.
  - ✓ During the construction of a hamiltonian cycle, no cycle can be formed until all the vertices have been visited.
  - $\checkmark$  If during the construction of a hamiltonian cycle two of the edges incident on a vertex v are shown to be required, then all other incident edges can be deleted.

#### **Example 6.3.1:**

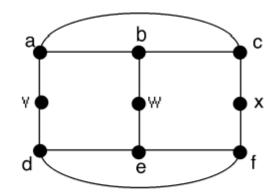
- $\checkmark$  Apply rule 1 to b, d, f
- $\checkmark$  Apply rule 3 to c, e remove gc, cx, ge, and ew.
- $\checkmark$  Form a cycle, wv, vx, xw, before ending rule 2



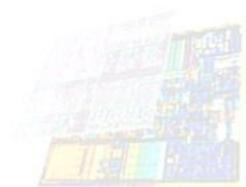
## **Showing That a Graph Is Not Hamiltonian**

#### **Example 6.3.2:**

- $\checkmark$  Apply rule 1 to v, w, x.
- $\checkmark$  We have to select ab or bc to fulfill the the need of b.
- $\checkmark$  But if we select ab, then c can not be selected in hamiltonian cycle.
- $\checkmark$  Similarly for selecting bc.

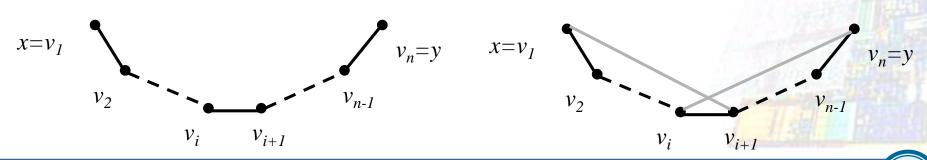


Another non-hamiltonian graph.



# Sufficient Conditions for a Graph to be Hamiltonian

- **Theorem 6.3.1 [Ore, 1960].** Let G be a simple n-vertex graph, where  $n \ge 3$ , such that  $deg(x) + deg(y) \ge n$  for each pair of non-adjacent vertices x and y. Then G is hamiltonian.
  - When  $\checkmark$  By way of contradiction, assume that the theorem is false, and let G be a maximal counterexample. That is, G is non-hamiltonian and satisfies the conditions of the theorem, and the addition of any edge joining two non-adjacent vertices of G results in a hamiltonian graph.
  - ✓ Let *x* and *y* be two non-adjacent vertices of *G*. To reach a contradiction, it suffices to show that  $deg(x) + deg(y) \le n 1$ .
  - ✓ Since graph G+xy contains a hamiltonian cycle, G contains a hamiltonian path whose endpoints are x and y. Let  $< x = v_1, v_2, ..., v_n = y >$  be such a path.
  - For each i = 2,...,n-1, at least one of the pairs  $v_1, v_{i+1}$  and  $v_i, v_n$  is non-adjacent, since otherwise,  $\langle v_1, v_2,..., v_i, v_n, v_{n-1},..., v_{i+1}, v_1 \rangle$  would be a hamiltonian cycle in G. This means that if  $(a_{i,j})$  is the adjacent matrix for G, then  $a_{1,i+1} + a_{i,n} \le 1$ , for i = 2,...,n-2.



### Sufficient Conditions for a Graph to be Hamiltonian

Thus,

$$deg(x) + deg(y) = \sum_{i=2}^{n-1} a_{1,i} + \sum_{i=2}^{n-1} a_{i,n} = a_{1,2} + \sum_{i=3}^{n-1} a_{1,i} + \sum_{i=2}^{n-2} a_{i,n} + a_{n-1,n} = 1 + \sum_{i=2}^{n-2} a_{1,i+1} + \sum_{i=2}^{n-2} a_{i,n} + 1$$

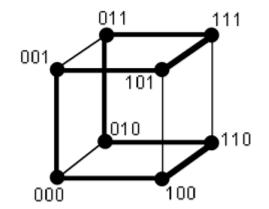
$$= 2 + \sum_{i=2}^{n-2} (a_{1,i+1} + a_{i,n}) \le 2 + n - 3 = n - 1$$

which establishes the desired contradiction.

- **Corollary 6.3.2[Dirac, 1952].** *Let* G *be a simple n-vertex graph, where*  $n \ge 3$ , *such that deg*(v) ≥n/2 *for each vertex* v. *Then* G *is hamiltonian.*
- **Theorem 6.3.3.** Let D be a simple n-vertex digraph. Suppose that for every pair of vertices v and w for which there is no arc from v to w, outdeg(v) + indeg(w)  $\geq n$ . Then D is hamiltonian.
- **Corollary 6.3.4.** Let D be a simple n-vertex digraph such that for every vertex v, outdeg(v)  $\geq n/2$  and index(v)  $\geq n/2$ . Then D is hamiltonian.

# 6.4 Gray Codes and Traveling Salesman Problems

- The word "code" is no longer referred to as secrecy as digital techniques have been applied routinely to represent analog signals in digital form.
- **DEFINITION**: A *Gray code of order* n is an ordering of the  $2^n$  length-n bitstrings such that consecutive bitstrings ( and the first and last bit string) differ in precisely one bit position.
- **Example 6.4.1:** The sequence <000, 100, 110, 010, 011, 111, 101, 001> is a Gray code of order 3.
- **REVIEW FROM Sec.** 1.2: The *n*-dimensional hypercube  $Q_n$  is the graph whose vertex set is the set of length-n bitstrings, such that there is an edge between two vertices if and only if they differ in exactly one bit.
- $\square$  A Gray code of order *n* corresponds to a hamiltonian cycle in the hypercube graph  $Q_n$ .



A hamiltonian cycle in the hypercube  $Q_3$ .

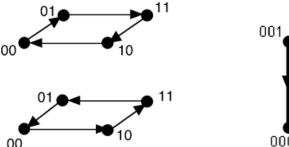
# **Gray Codes and Traveling Salesman Problems**

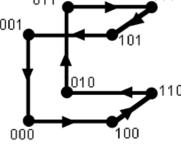
- $\square$   $Q_n$  is hamiltonian for all n, thereby proving that Gray codes of all orders exits.
  - ✓ The (n+1)-dimensional hypercube  $Q_{n+1}$  can be obtained from two copies of the n-dimensional hypercube  $Q_n$ .
  - ✓ Adjoin a 0 to the right/left of each *n*-bit sequence of one of the copies of  $Q_n$ .
  - ✓ Adjoin a 1 to the right/left of each sequence of the other copy.
  - ✓ Join by an edge the two vertices labeled by corresponding sequences.
- How to obtain a hamiltonian traverse one  $Q_n$  first, and then go to the second  $Q_n$ , traverse the second  $Q_n$ , and finally go back to the first  $Q_n$ .
- **□ Theorem 6.4.1.** *The* n-dimensional hypercube  $Q_n$  is hamiltonian for all  $n \ge 2$ .
  - $\checkmark$   $Q_2$  is a 4-cycle and, hence hamiltonian. Assume for some  $n \ge 2$  that there exists a

hamiltonian cycle  $\langle b_1, b_2, ..., b_{2^n}, b_1 \rangle$  in  $Q_n$ . Then

$$< b_1 0, b_2 0, ..., b_{2^n} 0, b_{2^n} 1, b_{2^n-1} 1, ..., b_1 1, b_1 0 >$$

■ **Application 6.4.1** *Transmitting Photographs from a Spacecraft – value with single-bit error is very close to true value.* 





Gray code of order 3 from a Gray code of order 2.

# **Traveling Salesman Problem**

- $\square$  *Traveling Salesman Problem (TSP)* is to minimize the total airfare for a traveling salesman who wants to make a tour of n cities, visiting each city exactly once before returning home.
- The problem of finding a minimum-weight hamiltonian cycle appears to have been first posed as a TSP by H. Whitney in 1934.
- TSP is a NP-hard problem.
- □ A provably optimal solution to a 318-city problem.
  - ✓ To evaluate  $10^{655}$  tours at the rate of 1 billion tours per second takes a computer  $10^{639}$  years.
  - ✓ The Crowder-Padberg solution took about 6 minutes by computer.
- **DEFINITION**: A *heuristic* is a guideline that helps in choosing from among several possible alternative for a decision step.
- **DEFINITION**: A *heuristic algorithm* is an algorithm whose steps are guided by heuristics. In effect, the heuristic algorithm is forfeiting the guarantee of finding the best solution, so that it can terminate quickly.

  Start 0100000
- □ Algorithm 6.4.1: Nearest Neighbor

## **Traveling Salesman Problem**

- **Theorem 6.4.2.** If there exists a polynomial-time approximate algorithm whose solution to every instance of the general TSP is never worse than some constant r times the optimum, then P = NP.
- **DEFINITION**: Let G be a weighted simple graph with vertices labeled 1, ..., n, such that edge ij has weight  $c_{ij}$ . Then G is said to satisfy the triangle inequality if  $c_{ij} \le c_{ik} + c_{kj}$  for all i, j, and k.
- **Theorem 6.4.3.** For every r > 1, there exists an instance of the TSP, obeying the triangle inequality, for which the solution obtained by the nearest-neighbor algorithm is at least r times the optimal value.

#### Algorithm 6.4.2: Double the tree

*Input*: a weighted complete graph *G*.

Output: a sequence of vertices and edges that forms a hamiltonian cycle.

Find a minimum spanning tree  $T^*$  of G.

Create an eulerian graph H by using two copies of each edge of  $T^*$ .

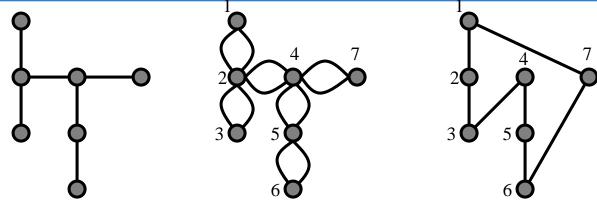
Construct an eulerian tour W of H.

Construct a hamiltonian cycle in *G* from *W* as follows:

Follow the sequence of edges and vertices of W until the next edge in the sequence is joined to an already visited vertex. At that point, skip to the next unvisited vertex by taking a shortcut, using an edge that is not part of W. Resume the traversal of W, taking shortcuts whenever necessary, until all the vertices have been visited. Complete the cycle by returning to the starting vertex via the edge joining it to the last vertex.

### Two Heuristic Algorithms that Have Performance Guarantees

**Example 6.4.2:** 



- **Theorem 6.4.4.** For all instances of the TSP that obey the triangle inequality, the solution produced by Algorithm 6.4.2 is never worse than twice the optimal value.
  - ✓ Let C be the hamiltonian cycle produced by Algorithm 6.4.2, and let  $C^*$  and  $T^*$  be a minimum-weight hamiltonian cycle and a minimum-weight spanning tree, respectively.
  - ✓ The total edge-weight of the eulerian tour is  $2 \times wt(T^*)$ , and since each shortcut is an edge that joins the initial and terminal points of a path of length at least 2, the triangle inequality implies that  $wt(C) \le 2 \times wt(T^*)$ .
  - ✓ But  $C^*$  minus one of its edges is a spanning tree, which implies  $2 \times wt(T^*) \le 2 \times wt(C^*)$ .
- □ Algorithm 6.4.3: Tree and Matching better way to yield eulerian tour
- **Theorem 6.4.5.** For all instances of the TSP that obey the traingle inequality, the solution produced by Christofides' algorithm is never worse than  $\frac{3}{2}$  times the optimal.

### **Two Heuristic Algorithms that Have Performance Guarantees**

#### Algorithm 6.4.3: Tree and matching

*Input*: a weighted complete graph *G*.

Output: a sequence of vertices and edges that forms a hamiltonian cycle.

Find a minimum spanning tree  $T^*$  of G.

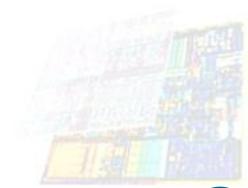
Let O be the subgraph of G induced on the odd-degree vertices in  $T^*$ .

Find a minimum-weight perfect matching  $M^*$  in O.

Create an Eulerian graph H by adding the edges in  $M^*$  to  $T^*$ .

Construct an Eulerian tour *W* of *H*, as in Algorithm 6.4.2.

Construct a Hamiltonian cycle in G from W, as in Algorithm 6.4.2.



# TSP's in Disguise

- □ **Variation 1.** Find a minimum-weight hamiltonian path.
- **Variation 2.** Find a minimum-weight hamiltonian path in digraph G, from a specified vertex s to a specified vertex t.
- $lue{\Box}$  Variation 3. Find a minimum-weight closed walk in digraph G that visits each vertex at least

