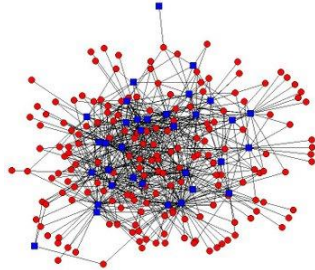


CSE 421: Algorithms

Winter 2014

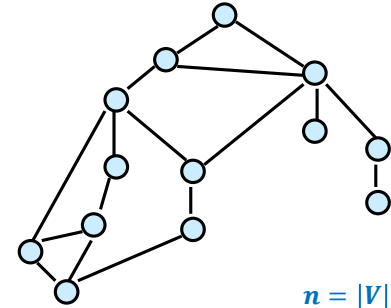
Lecture 5: Graphs and graph traversal II

Reading: Sections 3.1-3.2



undirected graphs

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 $u, v \in V$.



$$n = |V|, m = |E|$$

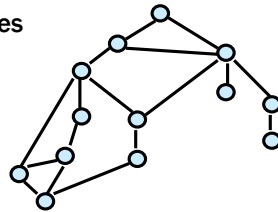
undirected graphs

Two representations:

- adjacency list
- adjacency matrix

Dense graphs vs. sparse graphs

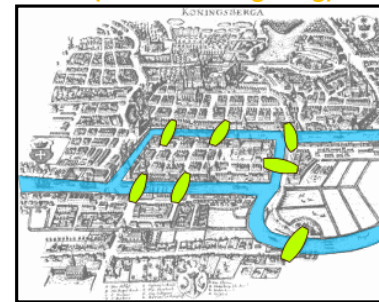
$\theta(n^2)$ edges $O(n)$ edges



$$n = |V|, m = |E|$$

euler tours

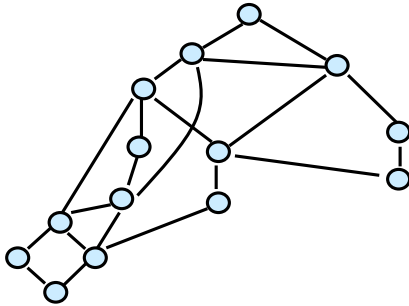
(Glorious Königsberg)



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

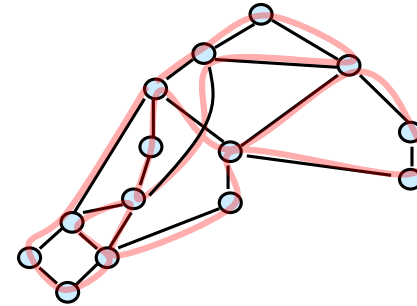
eulerian graphs

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



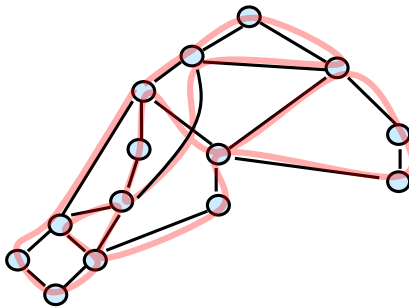
eulerian graphs

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



eulerian graphs

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



eulerian graphs

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

Proof.

Easier direction:

Eulerian \rightarrow connected and all degrees even.

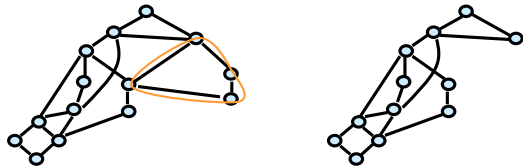
eulerian graphs

Theorem: An undirected graph is Eulerian if and only if it is connected and 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

Theorem: An undirected graph is Eulerian if and only if it is connected and 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?

eulerian graphs

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

Proof.

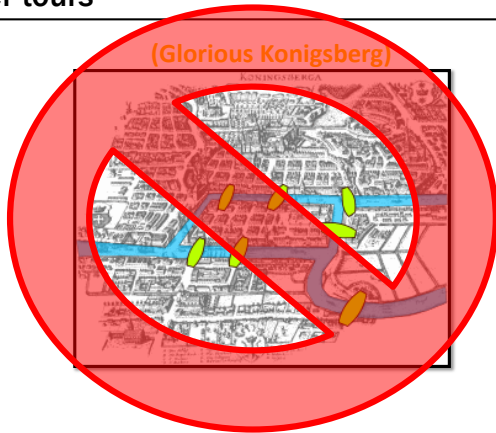
Harder direction: connected and all degrees \rightarrow Eulerian

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

one last step...

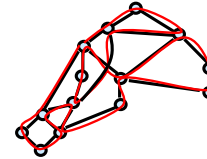
Prove that every graph with all degrees even contains a simple cycle (i.e. with no vertices repeated).

euler tours



NO: There are odd degree vertices.

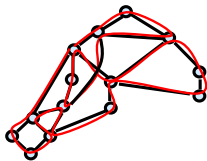
the profundity of algorithms



find a tour that visits every **edge** exactly once

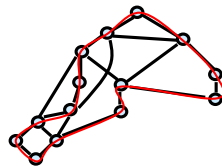
<< 1 second on 100,000 node graph
(fastest algorithm, 1 op/nanosec)

the profundity of algorithms



find a tour that visits every **edge** exactly once

<< 1 second on 100,000 node graph
(fastest algorithm, 1 op/nanosec)

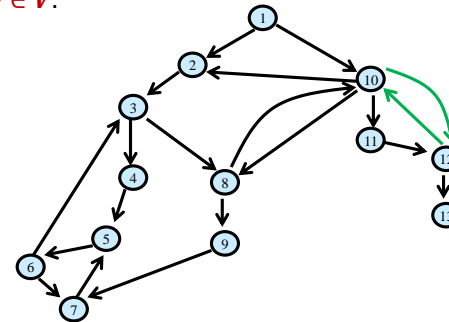


find a tour that visits every **vertex** exactly once

fastest known algorithm on 100
node graph takes >> 1,000,000 years

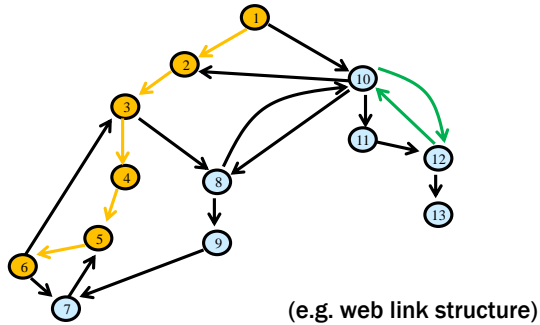
directed graphs

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

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

Goal of traversal:

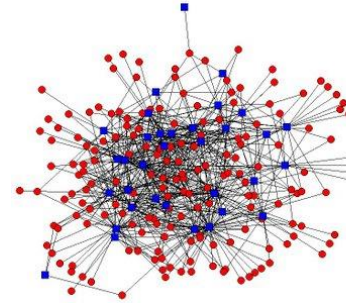
- Learn the basic structure of a graph
- Walk from a fixed starting vertex s to find all vertices reachable from s

Three states of vertices

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

graph traversal

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



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

generic traversal always works

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

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.

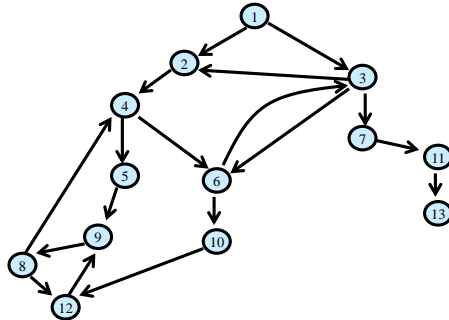
Different orders lead to algorithms with different properties.

Two main examples:

BFS (breadth-first search) and DFS (depth-first search)

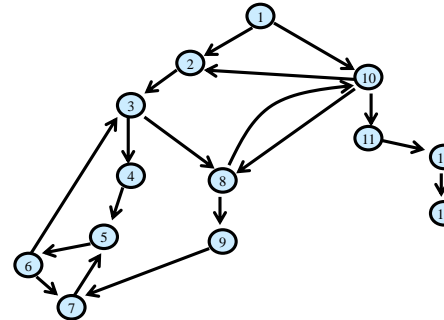
breadth-first search

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



depth-first search

- Completely explore the vertices in DFS order (duh)
- Naturally implemented using recursion



BFS

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

- **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

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”

$i \leftarrow i+1$

total running time:

$O(m + n)$

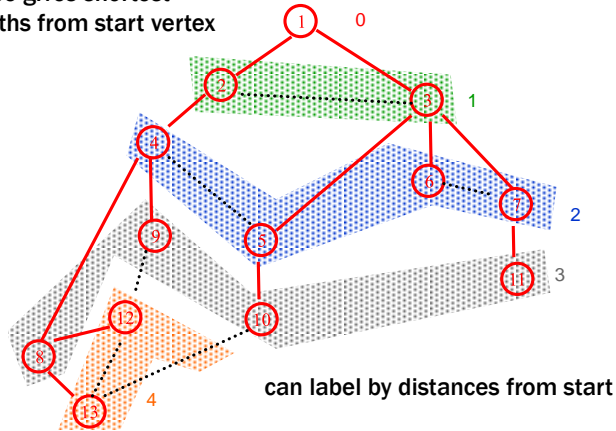
properties of BFS

On undirected graphs:

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

BFS application: shortest paths

Tree gives shortest paths from start vertex



connected components

Want to answer questions of the form:

- Given: vertices u and v in G
- Is there a path from u to v ?

connected components

Want to answer questions of the form:

- Given: vertices u and v in G
- Is there a path from u to v ?

Idea: create array A such that

$A[u]$ = smallest numbered vertex
that is connected to u

- question reduces to whether $A[u] = A[v]$?

connected components

Want to answer questions of the form:

- Given: vertices u and v in G
- Is there a path from u to v ?

Idea: create array A such that

$A[u]$ = smallest numbered vertex
that is connected to u

- question reduces to whether $A[u] = A[v]$?

Q: Why
not create
an array
 $\text{Path}[u,v]$?

connected components

- initial state: all v unvisited
 for $s \leftarrow 1$ to n do
 if $\text{state}(s) \neq \text{"fully-explored"}$ then
 BFS(s): setting $A[u] \leftarrow s$ for each u found
 (and marking u visited/fully-explored)
 endif
 endfor
- Total cost: $O(n + m)$
 - each vertex is touched once in this outer procedure and the edges examined in the different BFS runs are disjoint
 - works also with depth first search

properties of DFS(s)

- Like BFS(s):
 - DFS(s) visits x if and only if there is a path in G from s to x
 - Edges into undiscovered vertices define a "depth first spanning tree" of G
- Unlike the BFS tree:
 - the DFS spanning tree isn't minimum depth
 - its levels don't reflect min distance from the root
 - non-tree edges never join vertices on the same or adjacent levels
- but...

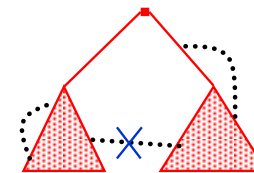
DFS(u) – recursive version

Global Initialization: mark all vertices "unvisited"

```
DFS(u)
  mark u "visited" and add u to R
  for each edge (u,v)
    if (v is "unvisited")
      DFS(v)
  mark u "fully-explored"
```

non-tree edges

- All non-tree edges join a vertex and one of its descendants/ancestors in the DFS tree
- No cross edges.



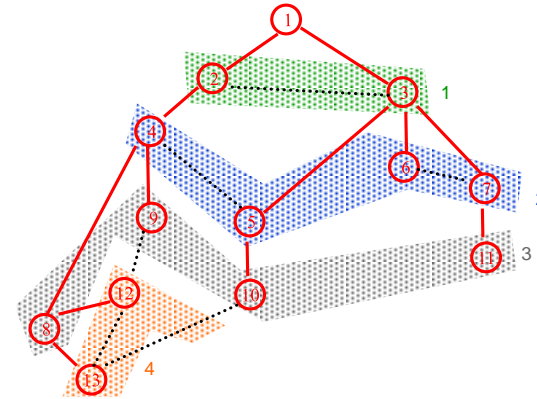
bipartite graph

Definition:

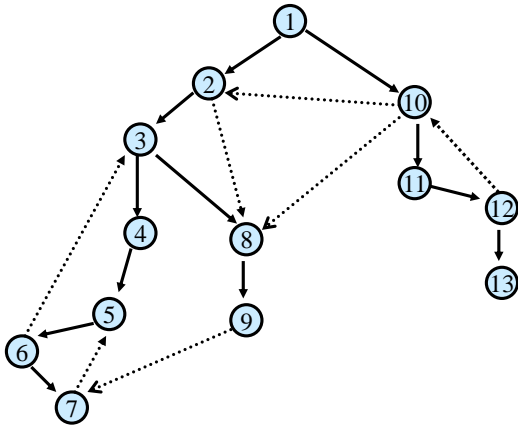
Theorem:

Graph is bipartite iff does not contain an odd cycle.

BFS for bipartite testing



DFS(v) for a directed graph



DFS(v)

