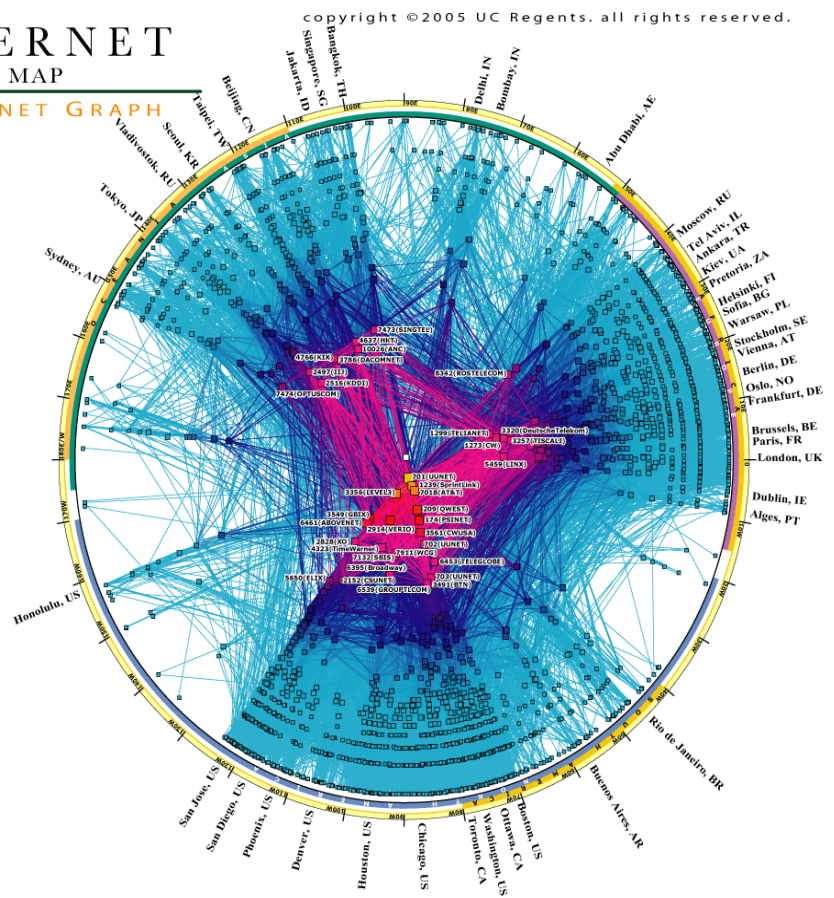
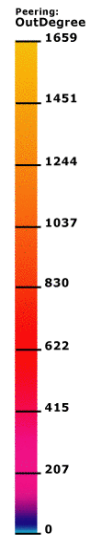


IPv4 INTERNET TOPOLOGY MAP

AS-level INTERNET GRAPH



GRAPHS

Announcements

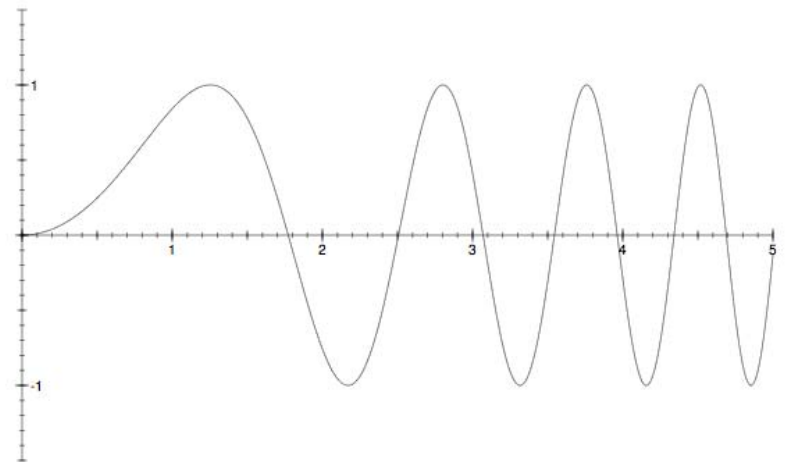
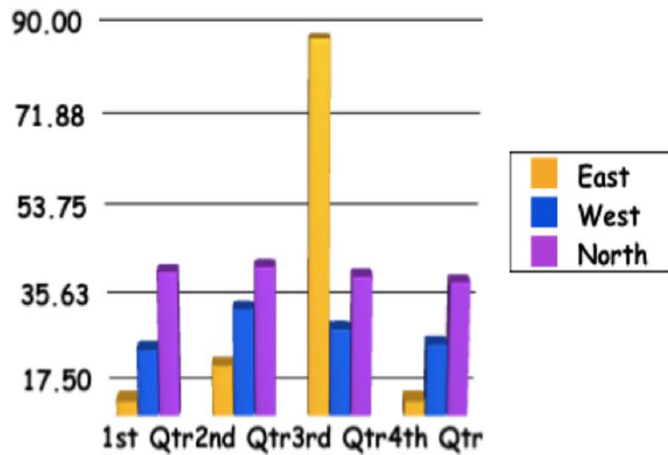
2

- Prelim 2: Two and a half weeks from now
 - Tuesday, April 16, 7:30-9pm, Statler

- Exam conflicts?
 - We need to hear about them and can arrange a makeup
 - It would be the same day but 5:30-7:00

- Old exams available on the course website

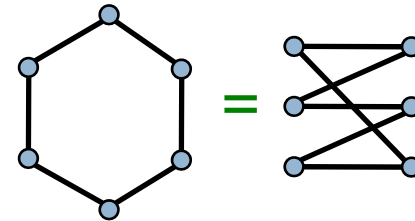
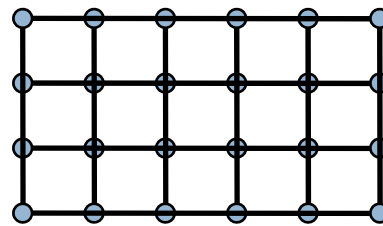
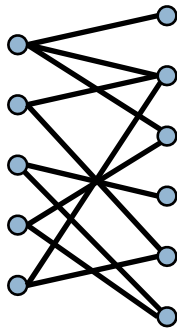
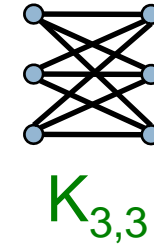
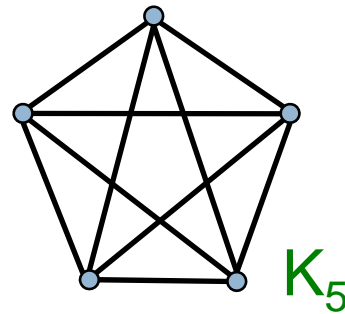
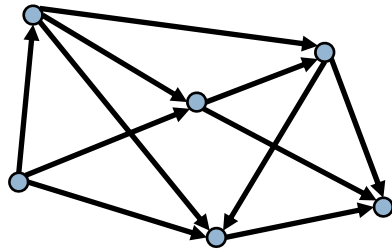
These are not Graphs



...not the kind we mean, anyway

These are Graphs

4



Applications of Graphs

5

- Communication networks
- Routing and shortest path problems
- Commodity distribution (flow)
- Traffic control
- Resource allocation
- Geometric modeling
- ...

Graph Definitions

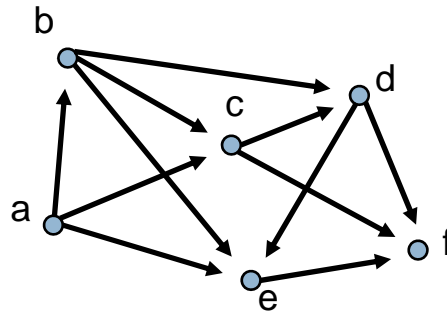
6

- A **directed graph** (or **digraph**) is a pair (V, E) where
 - V is a set
 - E is a set of ordered pairs (u, v) where $u, v \in V$
 - Usually require $u \neq v$ (i.e., no self-loops)
- An element of V is called a **vertex** (pl. **vertices**) or **node**
- An element of E is called an **edge** or **arc**

- $|V|$ = size of V , often denoted **n**
- $|E|$ = size of E , often denoted **m**

Example Directed Graph (Digraph)

7



$$V = \{a,b,c,d,e,f\}$$

$$E = \{(a,b), (a,c), (a,e), (b,c), (b,d), (b,e), (c,d), (c,f), (d,e), (d,f), (e,f)\}$$

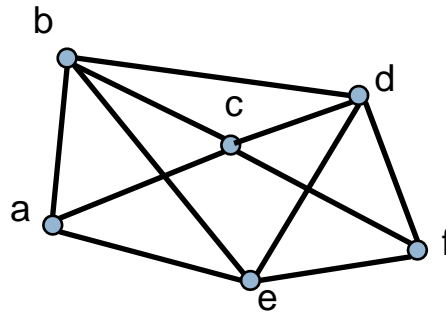
$$|V| = 6, |E| = 11$$

Example *Undirected Graph*

8

An *undirected graph* is just like a directed graph, except the edges are *unordered pairs (sets)* $\{u,v\}$

Example:



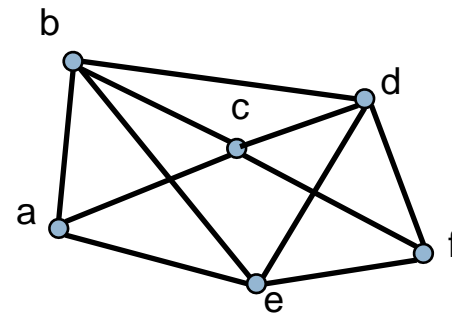
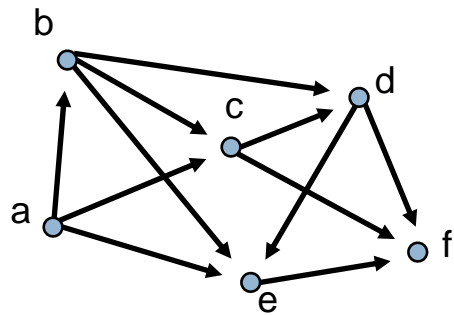
$$V = \{a,b,c,d,e,f\}$$

$$E = \{\{a,b\}, \{a,c\}, \{a,e\}, \{b,c\}, \{b,d\}, \{b,e\}, \{c,d\}, \{c,f\}, \\ \{d,e\}, \{d,f\}, \{e,f\}\}$$

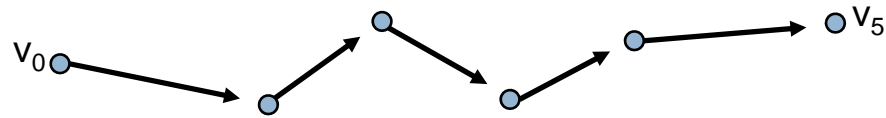
Some Graph Terminology

9

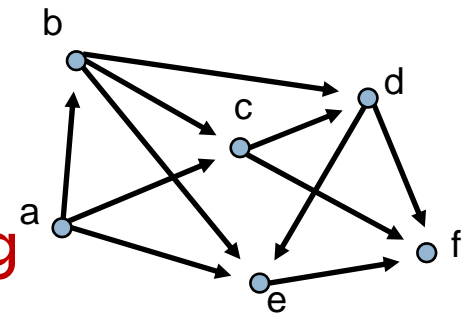
- Vertices u and v are called the **source** and **sink** of the directed edge (u,v) , respectively
- Vertices u and v are called the **endpoints** of (u,v)
- Two vertices are **adjacent** if they are connected by an edge
- The **outdegree** of a vertex u in a directed graph is the number of edges for which u is the source
- The **indegree** of a vertex v in a directed graph is the number of edges for which v is the sink
- The **degree** of a vertex u in an undirected graph is the number of edges of which u is an endpoint



More Graph Terminology

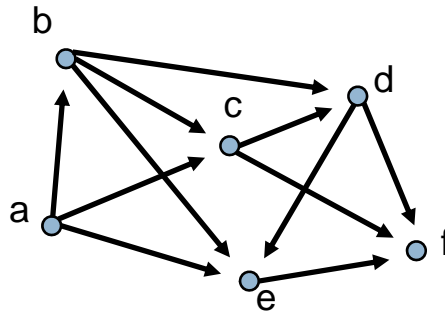


- A **path** is a sequence $v_0, v_1, v_2, \dots, v_p$ of vertices such that $(v_i, v_{i+1}) \in E, 0 \leq i \leq p - 1$
- The **length of a path** is its number of edges
 - ▣ In this example, the length is 5
- A path is **simple** if it does not repeat any vertices
- A **cycle** is a path $v_0, v_1, v_2, \dots, v_p$ such that $v_0 = v_p$
- A cycle is **simple** if it does not repeat any vertices except the first and last
- A graph is **acyclic** if it has no cycles
- A directed acyclic graph is called a **dag**



Is This a Dag?

11



□ Intuition:

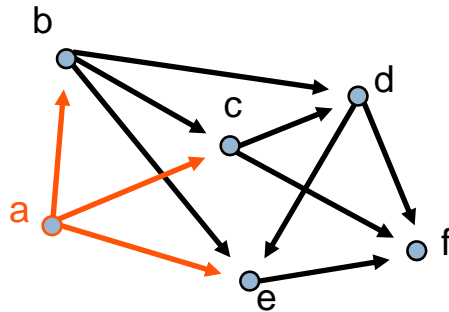
- If it's a dag, there must be a vertex with indegree zero – why?

□ This idea leads to an algorithm

- A digraph is a dag if and only if we can iteratively delete indegree-0 vertices until the graph disappears

Is This a Dag?

12



□ Intuition:

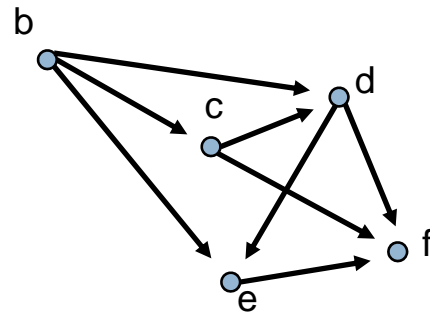
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Is This a Dag?

13



□ Intuition:

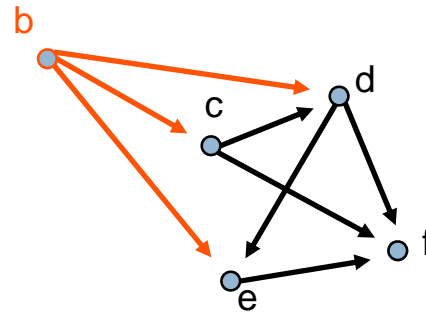
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Is This a Dag?

14



□ Intuition:

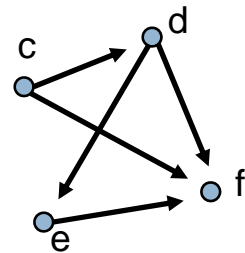
- If it's a dag, there must be a vertex with indegree zero – why?

□ This idea leads to an algorithm

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Is This a Dag?

15



□ Intuition:

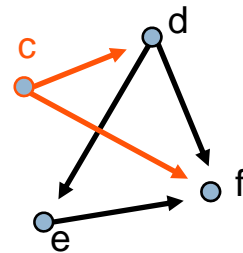
- If it's a dag, there must be a vertex with indegree zero – why?

□ This idea leads to an algorithm

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Is This a Dag?

16



□ Intuition:

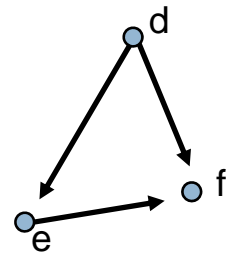
- If it's a dag, there must be a vertex with indegree zero – why?

□ This idea leads to an algorithm

- A digraph is a dag if and only if we can iteratively delete indegree-0 vertices until the graph disappears

Is This a Dag?

17



□ Intuition:

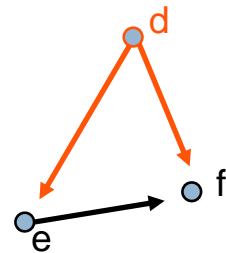
- If it's a dag, there must be a vertex with indegree zero – why?

□ This idea leads to an algorithm

- A digraph is a dag if and only if we can iteratively delete indegree-0 vertices until the graph disappears

Is This a Dag?

18



□ Intuition:

- If it's a dag, there must be a vertex with indegree zero – why?

□ This idea leads to an algorithm

- A digraph is a dag if and only if we can iteratively delete indegree-0 vertices until the graph disappears

Is This a Dag?

19



□ Intuition:

- If it's a dag, there must be a vertex with indegree zero – why?

□ This idea leads to an algorithm

- A digraph is a dag if and only if we can iteratively delete indegree-0 vertices until the graph disappears

Is This a Dag?

20



□ Intuition:

- If it's a dag, there must be a vertex with indegree zero – why?

□ This idea leads to an algorithm

- A digraph is a dag if and only if we can iteratively delete indegree-0 vertices until the graph disappears

Is This a Dag?

21

o f

□ Intuition:

- If it's a dag, there must be a vertex with indegree zero – why?

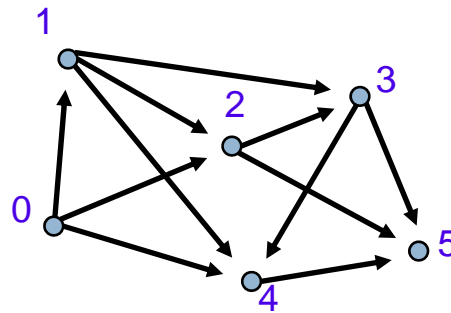
□ This idea leads to an algorithm

- A digraph is a dag if and only if we can iteratively delete indegree-0 vertices until the graph disappears

Topological Sort

22

- We just computed a **topological sort** of the dag
 - ▣ This is a numbering of the vertices such that all edges go from lower- to higher-numbered vertices

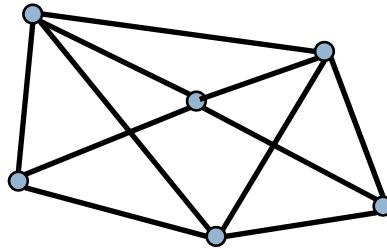


- Useful in job scheduling with precedence constraints

Graph Coloring

23

- A **coloring** of an undirected graph is an assignment of a color to each node such that no two adjacent vertices get the same color

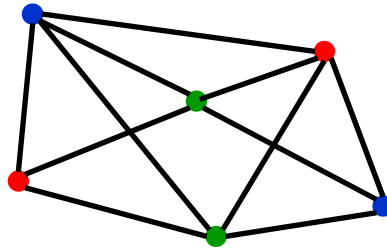


- How many colors are needed to color this graph?

Graph Coloring

24

- A **coloring** of an undirected graph is an assignment of a color to each node such that no two adjacent vertices get the same color

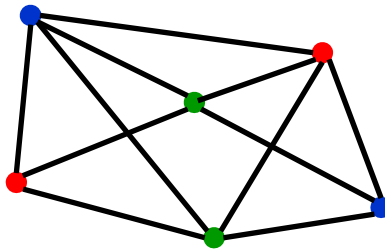


- How many colors are needed to color this graph?
 - 3

An Application of Coloring

25

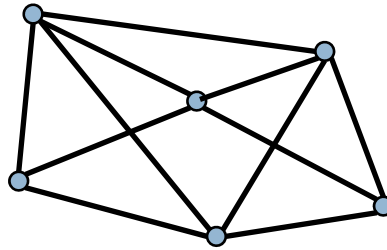
- Vertices are jobs
- Edge (u,v) is present if jobs u and v each require access to the same shared resource, and thus cannot execute simultaneously
- Colors are time slots to schedule the jobs
- Minimum number of colors needed to color the graph = minimum number of time slots required



Planarity

26

- A graph is **planar** if it can be embedded in the plane with no edges crossing

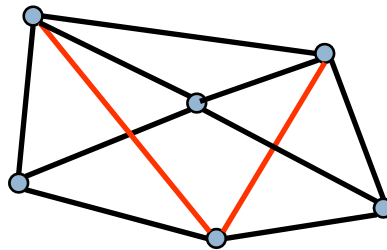


- Is this graph planar?

Planarity

27

- A graph is **planar** if it can be embedded in the plane with no edges crossing

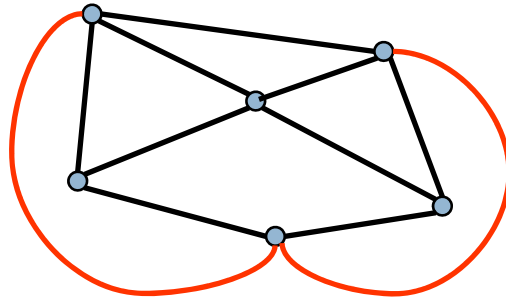


- Is this graph planar?
 - Yes

Planarity

28

- A graph is **planar** if it can be embedded in the plane with no edges crossing

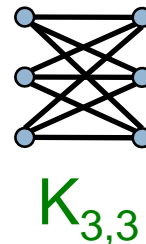
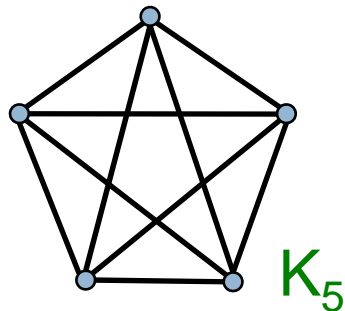


- Is this graph planar?
 - Yes

Detecting Planarity

29

□ Kuratowski's Theorem



- A graph is planar if and only if it does not contain a copy of K_5 or $K_{3,3}$ (possibly with other nodes along the edges shown)

The Four-Color Theorem

30

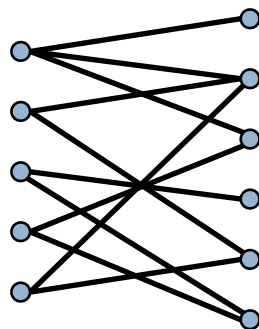
Every planar graph
is 4-colorable
(Appel & Haken, 1976)



Bipartite Graphs

31

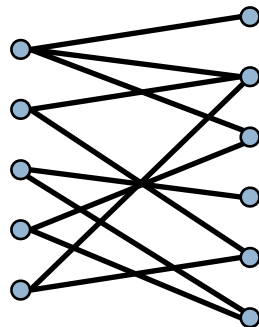
- A directed or undirected graph is **bipartite** if the vertices can be partitioned into two sets such that all edges go between the two sets



Bipartite Graphs

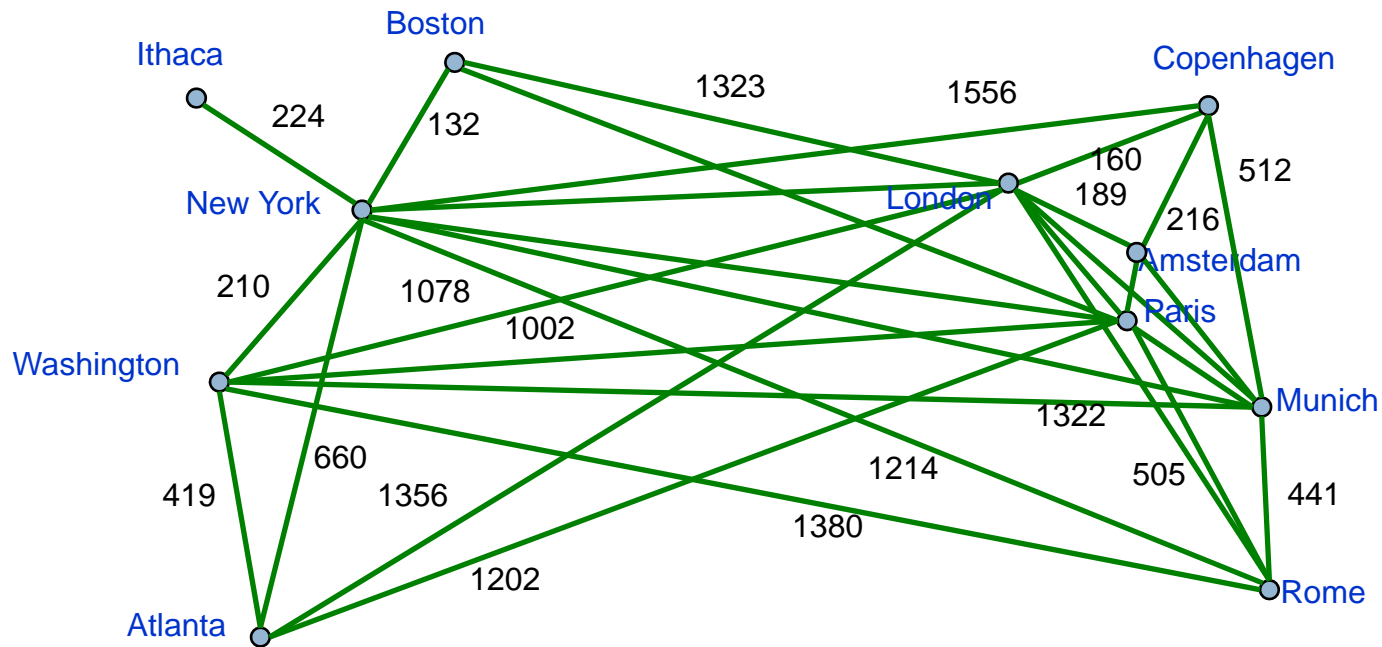
32

- The following are equivalent
 - G is bipartite
 - G is 2-colorable
 - G has no cycles of odd length



Traveling Salesperson

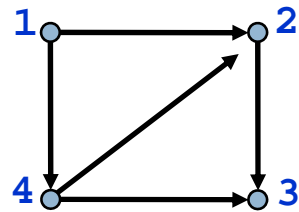
33



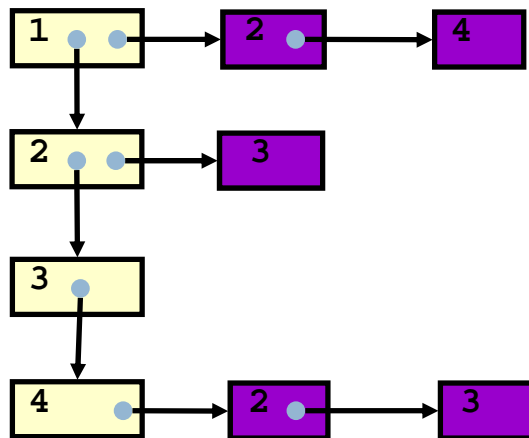
- Find a path of minimum distance that visits every city

Representations of Graphs

34



Adjacency List



Adjacency Matrix

	1	2	3	4
1	0	1	0	1
2	0	0	1	0
3	0	0	0	0
4	0	1	1	0

Adjacency Matrix or Adjacency List?

35

- n = number of vertices
- m = number of edges
- $d(u)$ = degree of u = number of edges leaving u

□ Adjacency Matrix

- Uses space $O(n^2)$
- Can iterate over all edges in time $O(n^2)$
- Can answer “Is there an edge from u to v ?” in $O(1)$ time
- Better for **dense** graphs (lots of edges)

• Adjacency List

- Uses space $O(m+n)$
- Can iterate over all edges in time $O(m+n)$
- Can answer “Is there an edge from u to v ?” in $O(d(u))$ time
- Better for **sparse** graphs (fewer edges)

Graph Algorithms

36

- Search
 - depth-first search
 - breadth-first search
- Shortest paths
 - Dijkstra's algorithm
- Minimum spanning trees
 - Prim's algorithm
 - Kruskal's algorithm

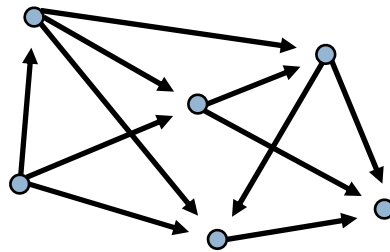
Depth-First Search

37

- Follow edges depth-first starting from an arbitrary vertex r , using a stack to remember where you came from
- When you encounter a vertex previously visited, or there are no outgoing edges, retreat and try another path
- Eventually visit all vertices reachable from r
- If there are still unvisited vertices, repeat
- $O(m)$ time

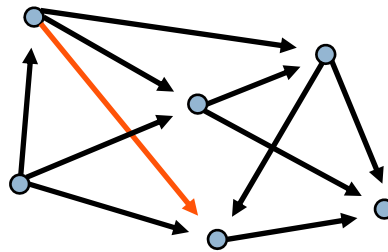
Depth-First Search

38



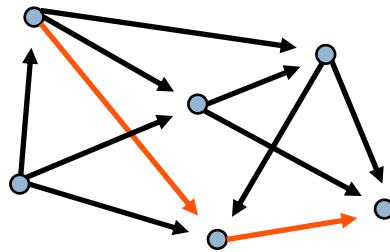
Depth-First Search

39



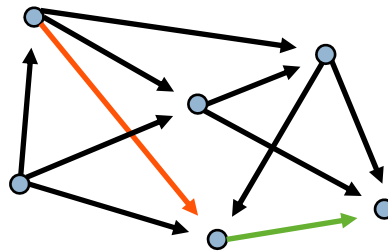
Depth-First Search

40



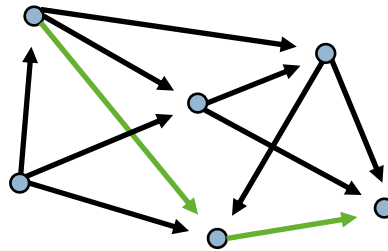
Depth-First Search

41



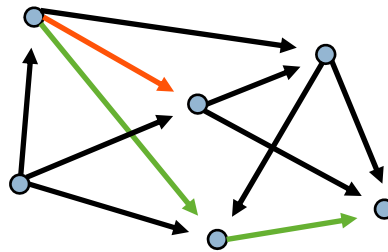
Depth-First Search

42



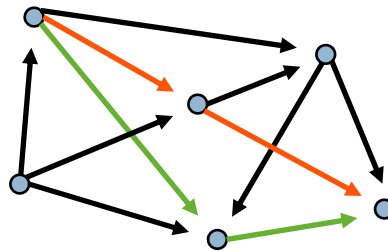
Depth-First Search

43



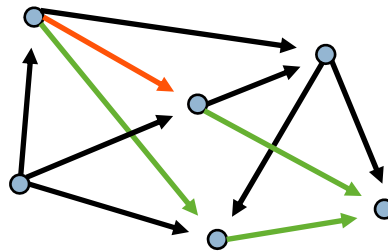
Depth-First Search

44



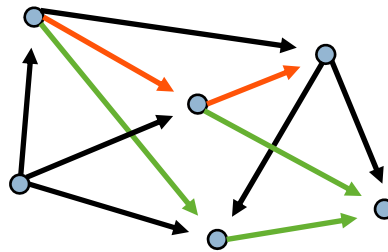
Depth-First Search

45



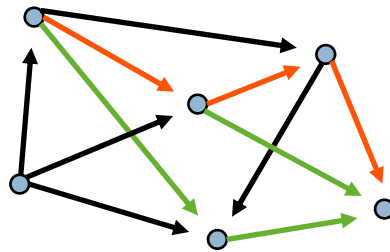
Depth-First Search

46



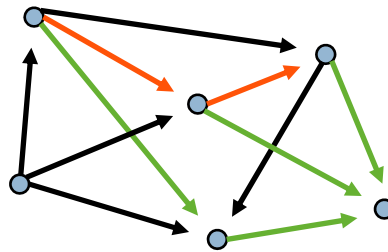
Depth-First Search

47



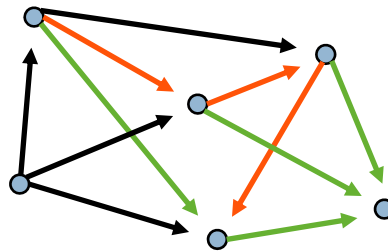
Depth-First Search

48



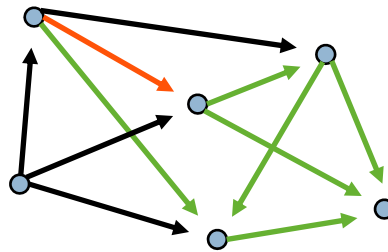
Depth-First Search

49



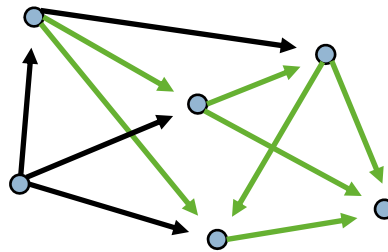
Depth-First Search

50

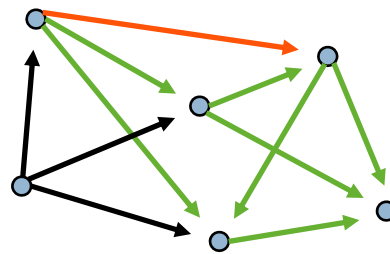


Depth-First Search

51

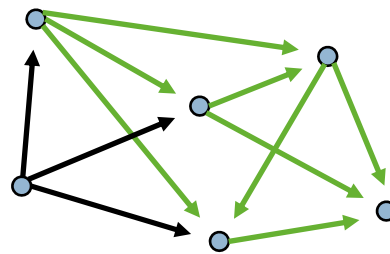


Depth-First Search



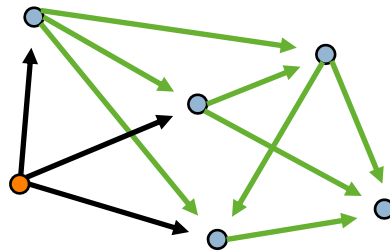
Depth-First Search

53

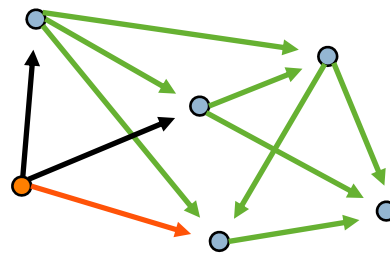


Depth-First Search

54

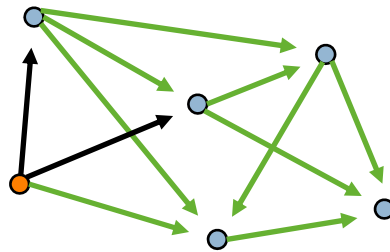


Depth-First Search

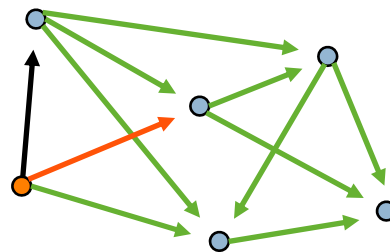


Depth-First Search

56

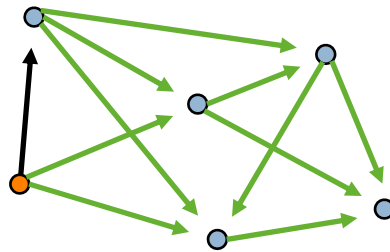


Depth-First Search



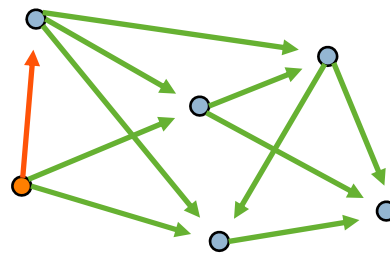
Depth-First Search

58



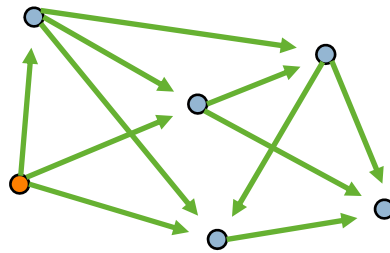
Depth-First Search

59



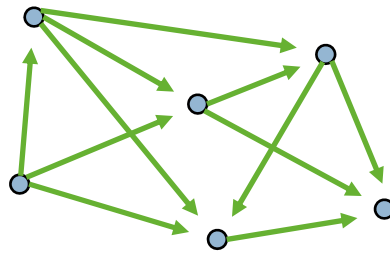
Depth-First Search

60



Depth-First Search

61



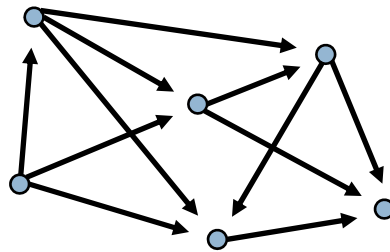
Breadth-First Search

62

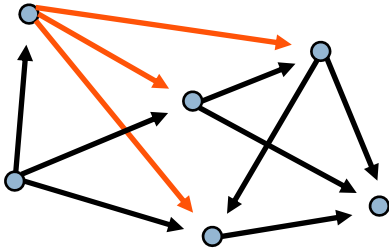
- Same, except use a queue instead of a stack to determine which edge to explore next
 - ▣ Recall: A stack is last-in, first-out (LIFO)
 - ▣ A queue is first-in, first-out (FIFO)

Breadth-First Search

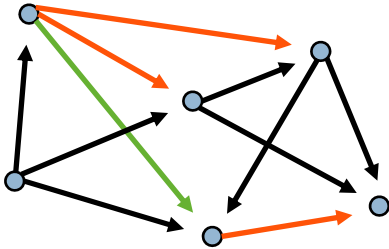
63



Breadth-First Search

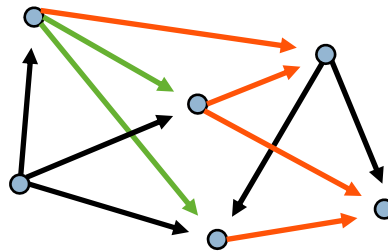


Breadth-First Search



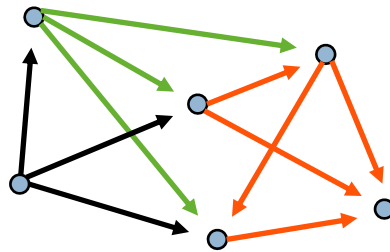
Breadth-First Search

66

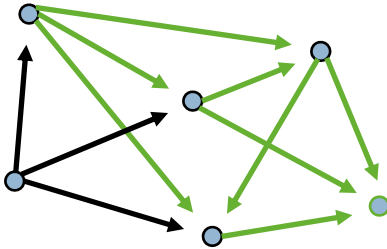


Breadth-First Search

67

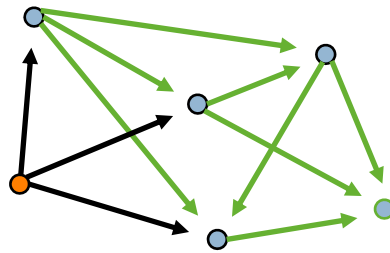


Breadth-First Search

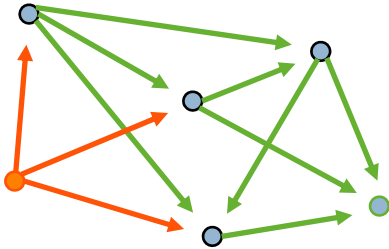


Breadth-First Search

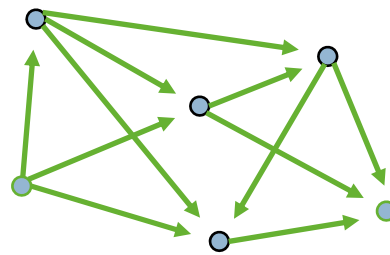
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Breadth-First Search



Breadth-First Search



Summary

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- We've seen an introduction to graphs and will return to this topic next week on Tuesday
 - Definitions
 - Testing for a dag
 - Depth-first and breadth-first search
- On Thursday Ken and David will be out of town.
 - Dexter Kozen will do a lecture on induction
 - We use induction to prove properties of graphs and graph algorithms, so the fit is good