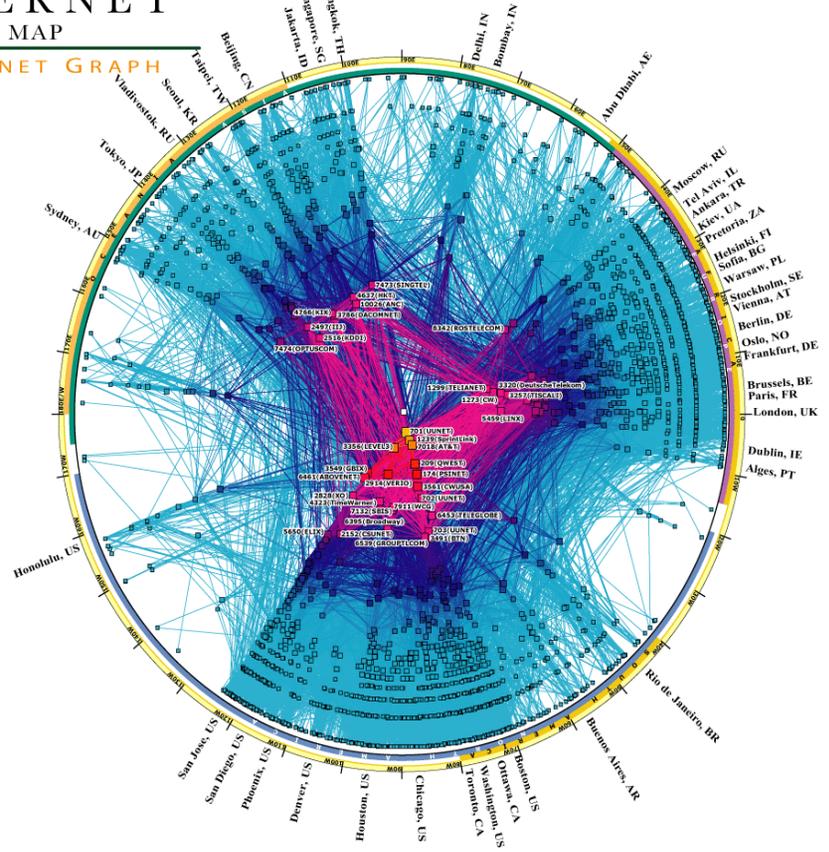
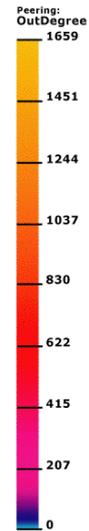


# IPv4 INTERNET TOPOLOGY MAP

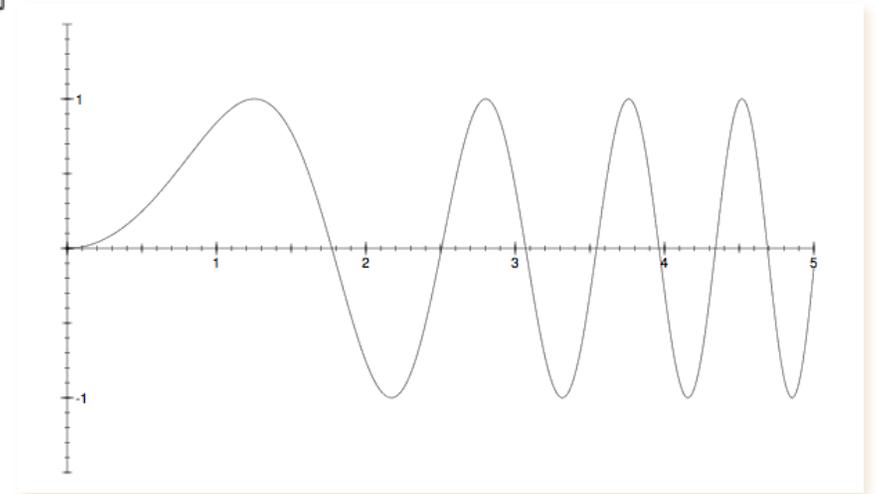
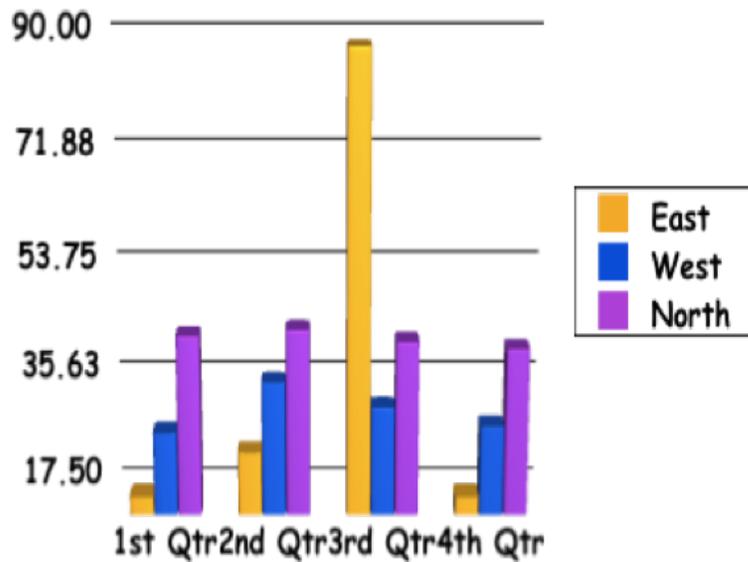
## AS-level INTERNET GRAPH

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# GRAPHS

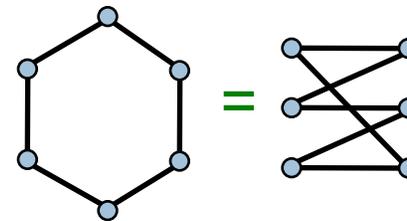
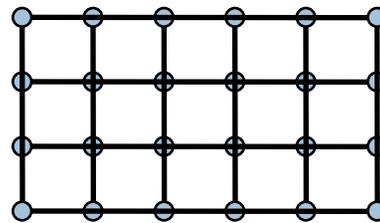
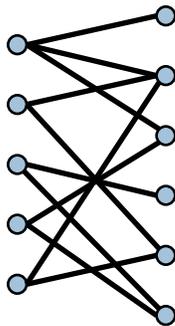
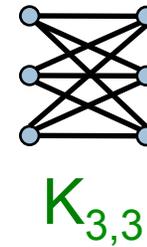
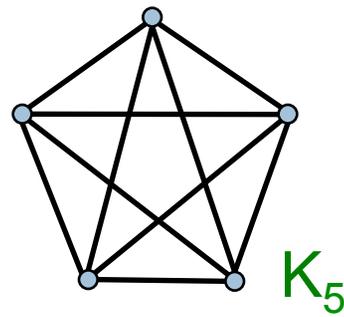
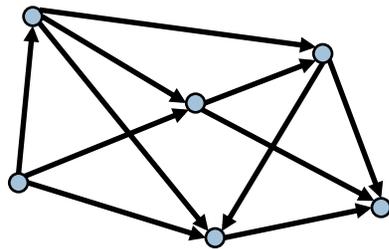
# These are not Graphs



...not the kind we mean, anyway

# These are Graphs

3



# Applications of Graphs

4

- Communication networks
- The internet is a huge graph
- Routing and shortest path problems
- Commodity distribution (flow)
- Traffic control
- Resource allocation
- Geometric modeling
- ...

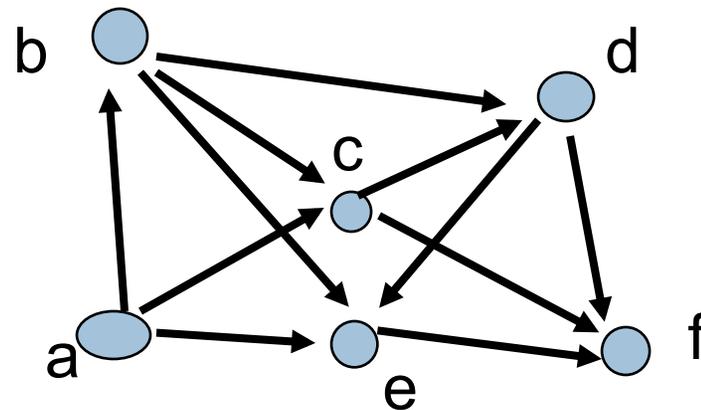
# Graph Definitions

5

- 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  $u, v \in V$ 
    - Sometimes 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**
- $|V|$  is the size of  $V$ , often denoted by  **$n$**
- $|E|$  is size of  $E$ , often denoted by  **$m$**

# Example Directed Graph (Digraph)

6



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

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

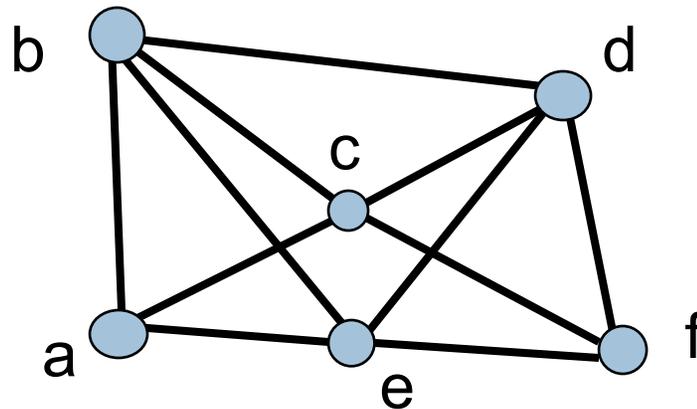
$|V| = 6, |E| = 11$

# Example *Undirected Graph*

7

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

Example:



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

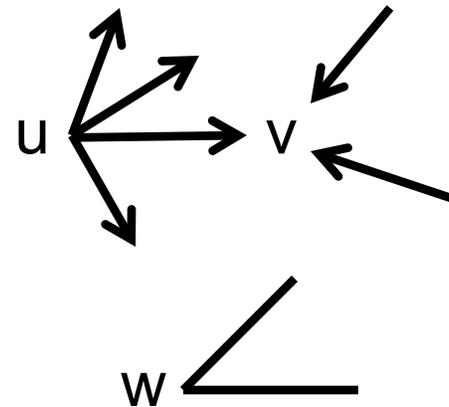
$$E = \{\{a,b\}, \{a,c\}, \{a,e\}, \{b,c\}, \{b,d\}, \{b,e\}, \{c,d\}, \{c,f\}, \{d,e\}, \{d,f\}, \{e,f\}\}$$

# Some Graph Terminology

8

- $u$  is the **source**,  $v$  is the **sink** of  $(u,v)$   $u \longrightarrow v$
  - $u, v, b, c$  are the **endpoints** of  $(u,v)$  and  $(b, c)$   $b \text{ --- } c$
  - $u, v$  are **adjacent** nodes.  $b, c$  are **adjacent** nodes
- 

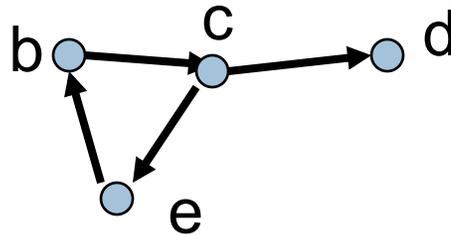
- **outdegree** of  $u$  in directed graph:  
number of edges for which  $u$  is source
- **indegree** of  $v$  in directed graph:  
number of edges for which  $v$  is sink
- **degree** of vertex  $w$  in undirected graph:  
number of edges of which  $w$  is an endpoint



outdegree of  $u$ : 4    indegree of  $v$ : 3    degree of  $w$ : 2

# More Graph Terminology

- **path**: sequence of adjacent vertexes
- **length of path**: number of edges
- **simple path**: no vertex is repeated



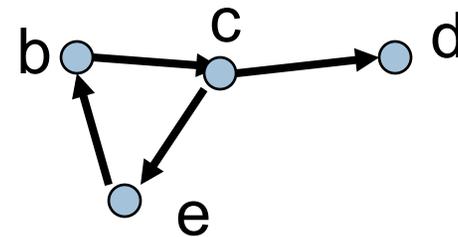
simple path of length 2: (b, c, d)

simple path of length 0: (b)

not a simple path: (b, c, e, b, c, d)

# More Graph Terminology

- **cycle**: path that ends at its beginning
- **simple cycle**: only repeated vertex is its beginning/end
- **acyclic graph**: graph with no cycles
- **dag**: **d**irected **a**cylic **g**raph



**cycles:** (b, c, e, b)      (b, c, e, b, c, e, b)

**simple cycle:**              (c, e, b, c)

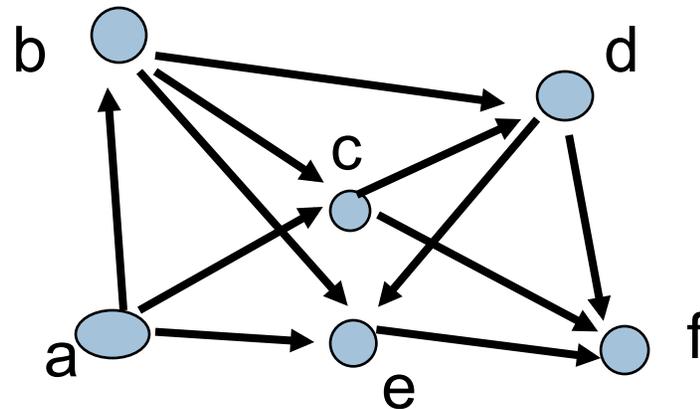
**graph shown is not a dag**

**Question:** is (d) a cycle?

No. A cycle must have at least one edge

# Is this a dag?

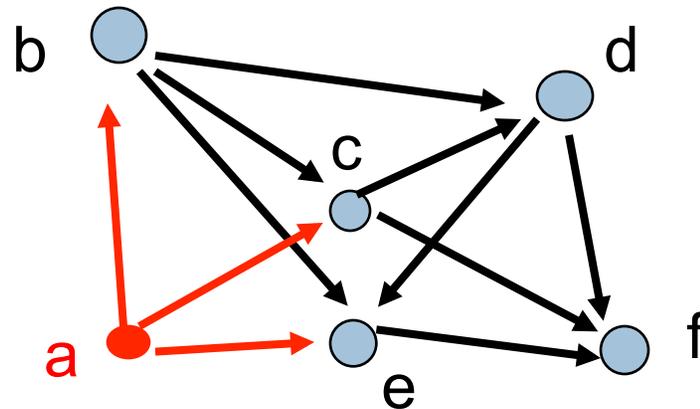
11



- Intuition: A dag has a vertex with indegree 0. **Why?**
- This idea leads to an algorithm:  
A digraph is a dag if and only if one can iteratively delete indegree-0 vertices until the graph disappears

# Is this a dag?

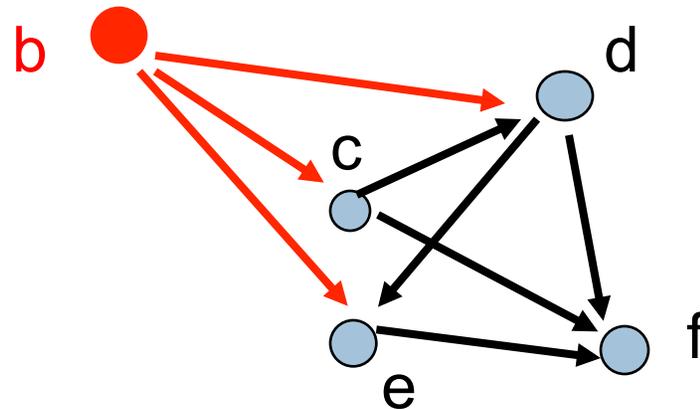
12



- Intuition: A dag has a vertex with indegree 0. **Why?**
- This idea leads to an algorithm:  
A digraph is a dag if and only if one can iteratively delete indegree-0 vertices until the graph disappears

# Is this a dag?

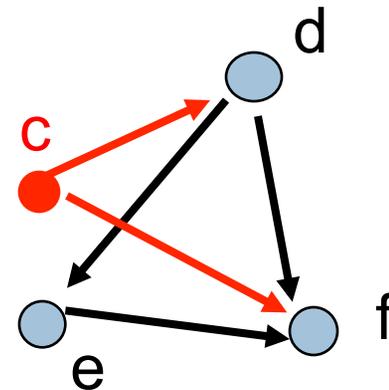
13



- Intuition: A dag has a vertex with indegree 0. **Why?**
- This idea leads to an algorithm:  
A digraph is a dag if and only if one can iteratively delete indegree-0 vertices until the graph disappears

# Is this a dag?

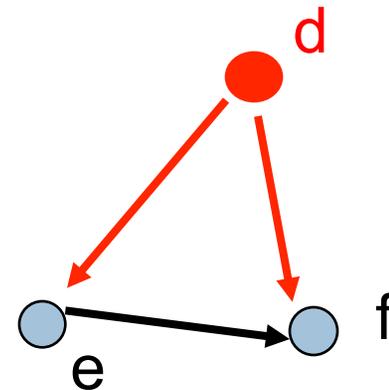
14



- Intuition: A dag has a vertex with indegree 0. **Why?**
- This idea leads to an algorithm:  
A digraph is a dag if and only if one can iteratively delete indegree-0 vertices until the graph disappears

# Is this a dag?

15



- Intuition: A dag has a vertex with indegree 0. **Why?**
- This idea leads to an algorithm:  
A digraph is a dag if and only if one can iteratively delete indegree-0 vertices until the graph disappears

# Is this a dag?

16



- Intuition: A dag has a vertex with indegree 0. **Why?**
- This idea leads to an algorithm:  
A digraph is a dag if and only if one can iteratively delete indegree-0 vertices until the graph disappears

# Is this a dag?

17

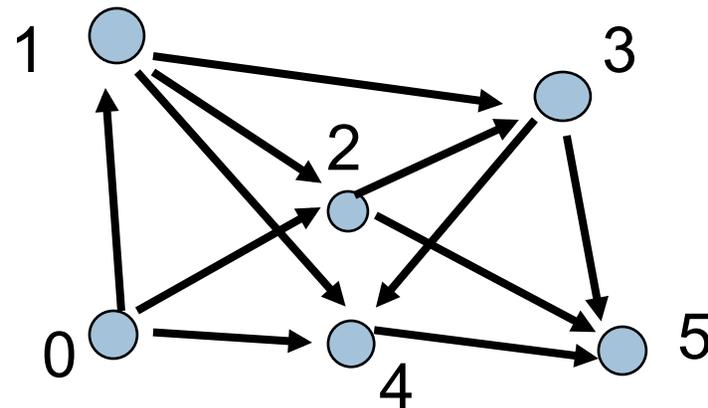


- Intuition: A dag has a vertex with indegree 0. **Why?**
- This idea leads to an algorithm:  
A digraph is a dag if and only if one can iteratively delete indegree-0 vertices until the graph disappears

# Topological Sort

18

- 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

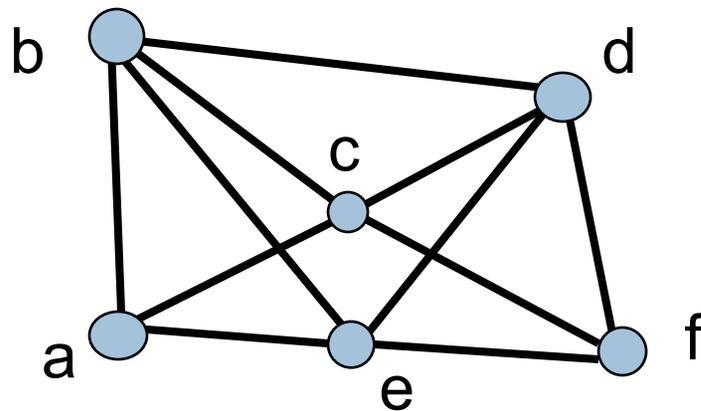


- Useful in job scheduling with precedence constraints

# Graph Coloring

19

**Coloring** of an undirected graph: an assignment of a color to each node such that no two adjacent vertices get the same color

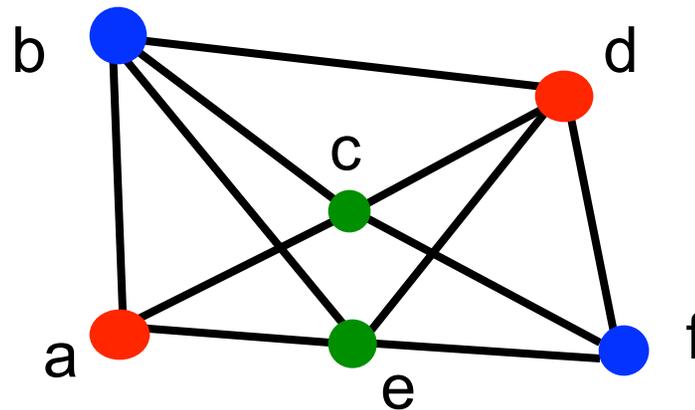


How many colors are needed to color this graph?

# Graph Coloring

20

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



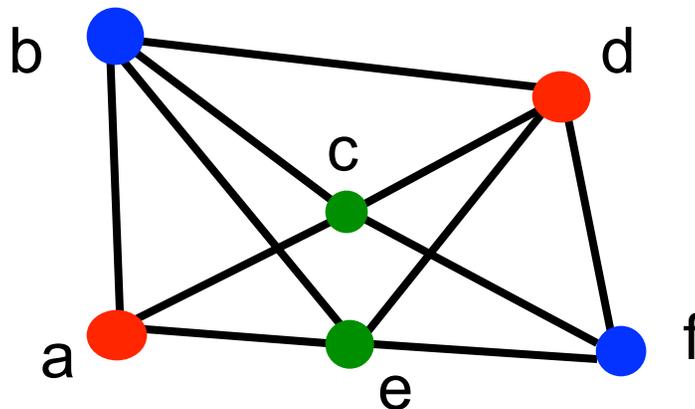
How many colors are needed to color this graph?

3

# An Application of Coloring

21

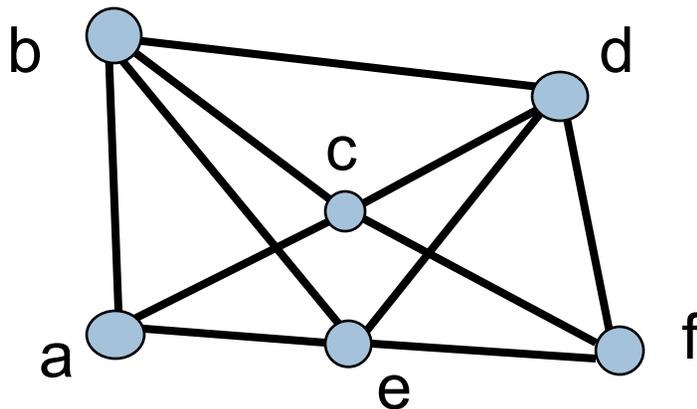
- Vertices are jobs
- Edge  $(u,v)$  is present if jobs  $u$  and  $v$  each require access to the same shared resource, so they cannot execute simultaneously
- Colors are time slots to schedule the jobs
- Minimum number of colors needed to color the graph = minimum number of time slots required



# Planarity

22

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

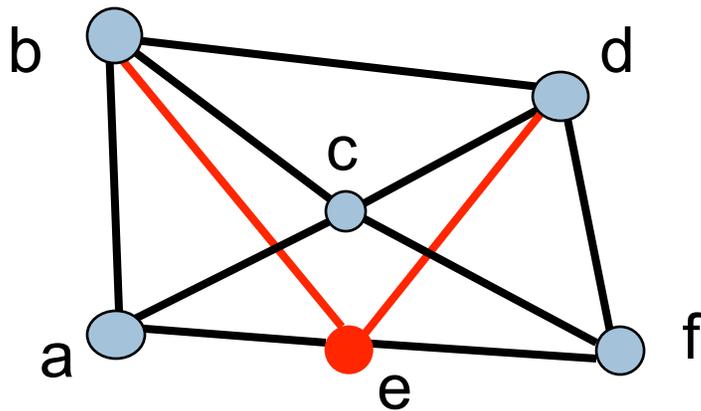


Is this graph planar?

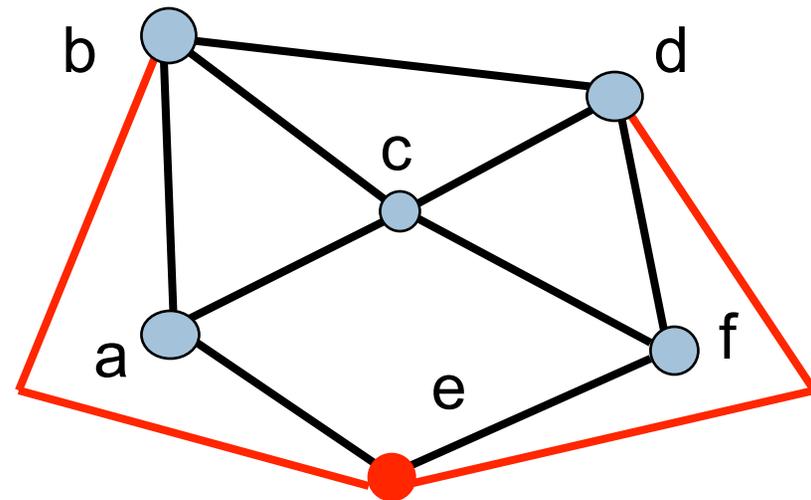
# Planarity

23

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



Is this graph planar?

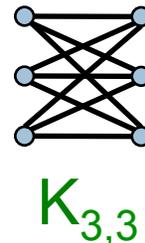
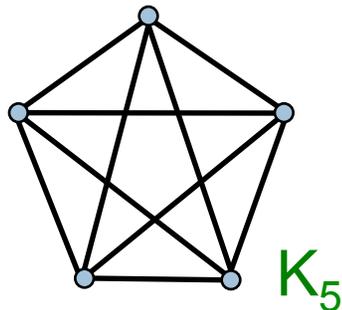


YES

# Detecting Planarity

24

## 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)

# Detecting Planarity

25

Early 1970's John Hopcroft spent time at Stanford, talked to grad student Bob Tarjan (now at Princeton). Together, they developed a linear-time algorithm to test a graph for planarity. Significant achievement.

Won Turing Award

# The Four-Color Theorem

26

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

Interesting history. “Proved” in about 1876 and published, but ten years later, a mistake was found. It took 90 more years for a proof to be found.

Countries are nodes; edge between them if they have a common boundary. You need 5 colors to color a map —water has to be blue!



# The Four-Color Theorem

27

Every planar graph is  
4-colorable

(Appel & Haken, 1976)

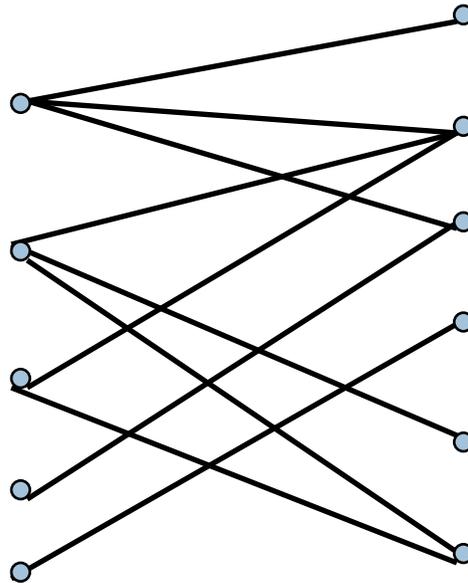
Proof rests on a lot of computation!  
A program checks thousands of  
“configurations”, and if none are  
colorable, theorem holds.

Program written in assembly  
language. Recursive, contorted, to  
make it efficient. Gries found an  
error in it but a “safe kind”: it might  
say a configuration was colorable  
when it wasn't.



# Bipartite Graphs

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

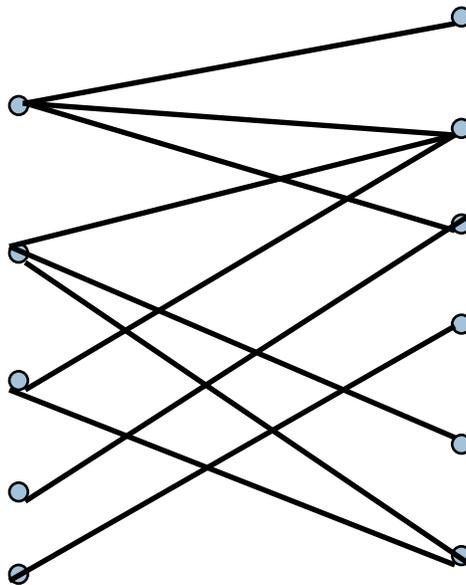


# Bipartite Graphs

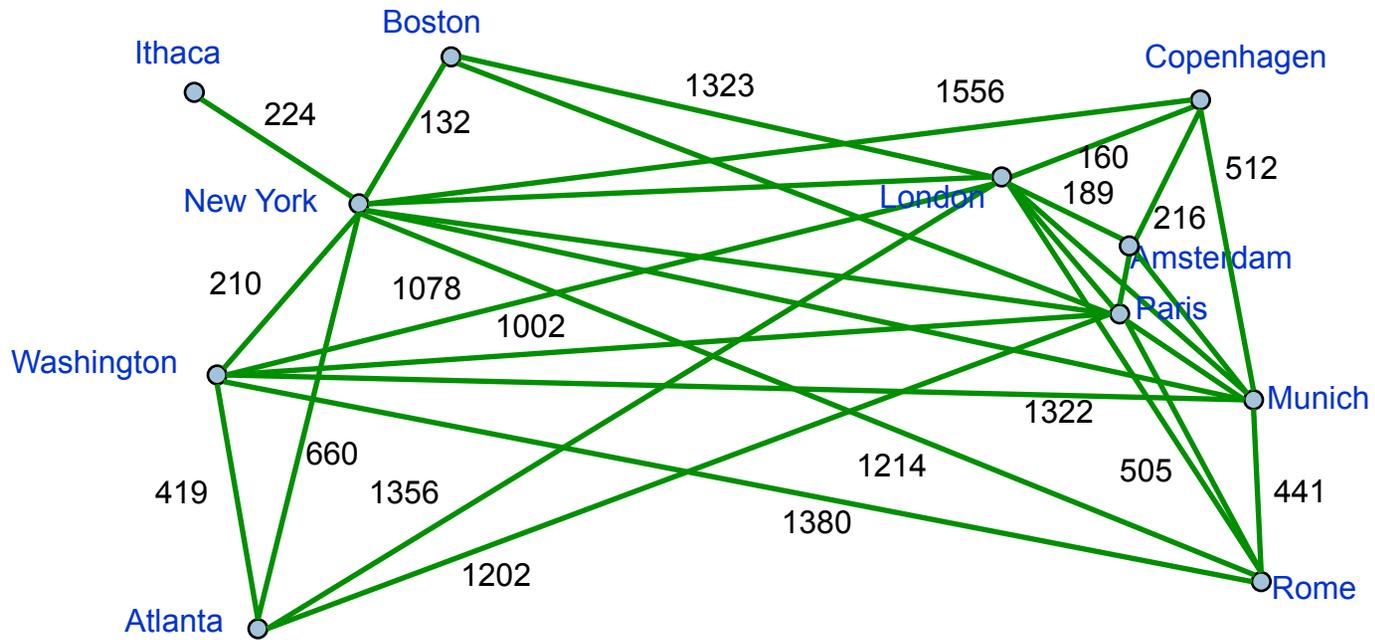
29

The following are equivalent

- $G$  is bipartite
- $G$  is 2-colorable
- $G$  has no cycles of odd length



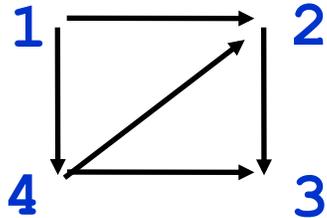
# Traveling Salesperson



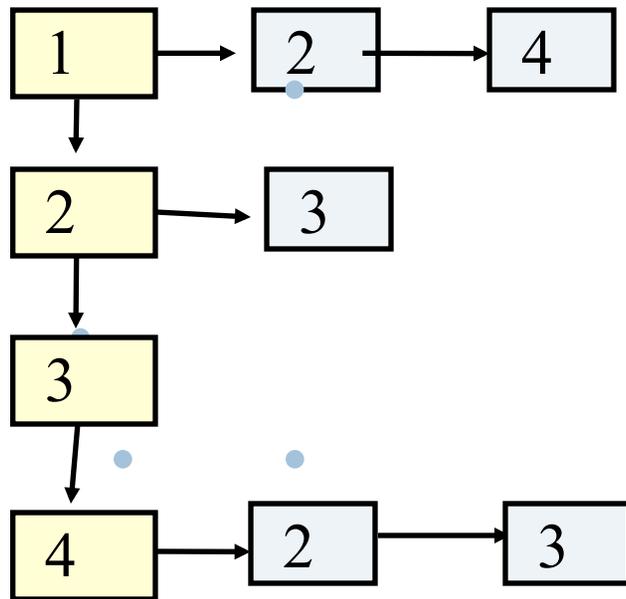
Find a path of minimum distance that visits every city

# Representations of Graphs

31



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?

32

$n$ : number of vertices

$m$ : number of edges

$d(u)$ : outdegree of  $u$

## 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

33

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

# Depth-First Search

34

- 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

Difficult to understand!

Let's write a recursive procedure

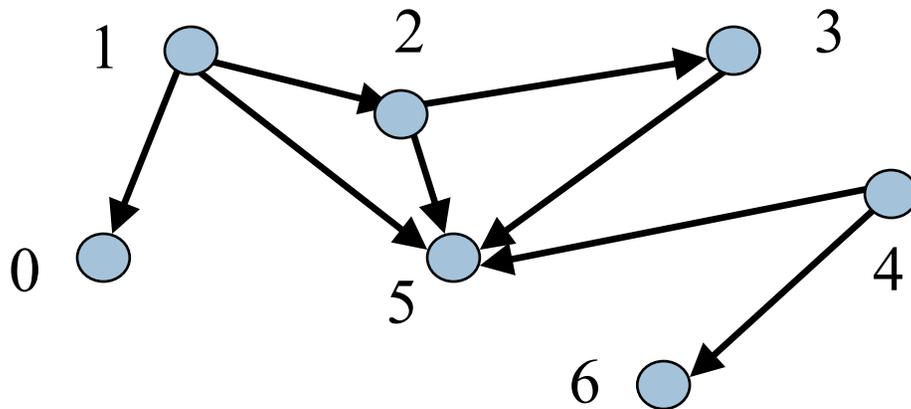
# Depth-First Search

35

boolean[] visited;

node  $u$  is visited means:  $visited[u]$  is true  
To visit  $u$  means to: set  $visited[u]$  to true

Node  $u$  is **REACHABLE** from node  $v$  if there is a path  $(u, \dots, v)$  in which all nodes of the path are unvisited.



Suppose all nodes are unvisited.

The nodes that are **REACHABLE** from node 1 are 1, 0, 2, 3, 5

The nodes that are **REACHABLE** from 4 are 4, 5, 6.

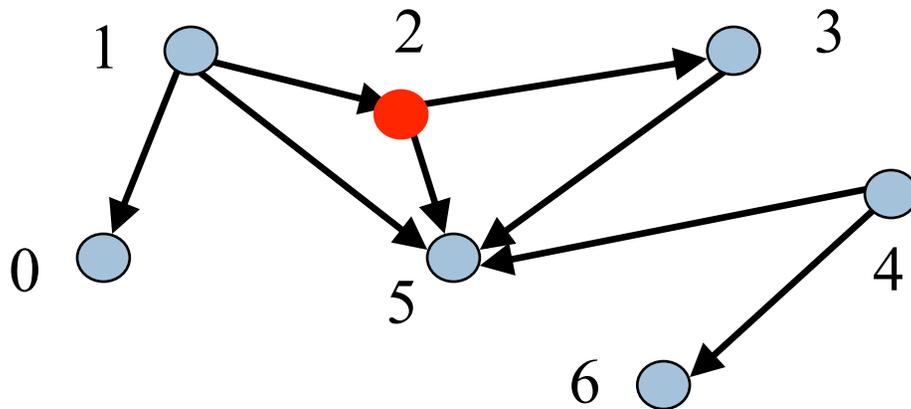
# Depth-First Search

36

`boolean[] visited;`

To “visit” a node  $u$ : set `visited[u]` to `true`.

Node  $u$  is **REACHABLE** from node  $v$  if there is a path  $(u, \dots, v)$  in which all nodes of the path are unvisited.



Suppose 2 is already visited, others unvisited.

The nodes that are **REACHABLE** from node 1 are 1, 0, 5

The nodes that are **REACHABLE** from 4 are 4, 5, 6.

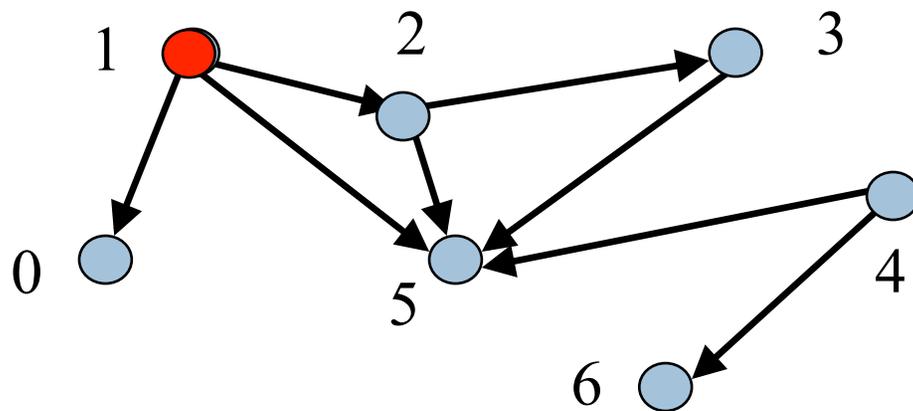
# Depth-First Search

37

```
/** Node u is unvisited. Visit all nodes  
that are REACHABLE from u. */
```

```
public static void dfs(int u) {  
    visited[u]= true;
```

```
}
```



Let  $u$  be 1  
The nodes that are  
REACHABLE  
from node 1 are  
1, 0, 2, 3, 5

# Depth-First Search

38

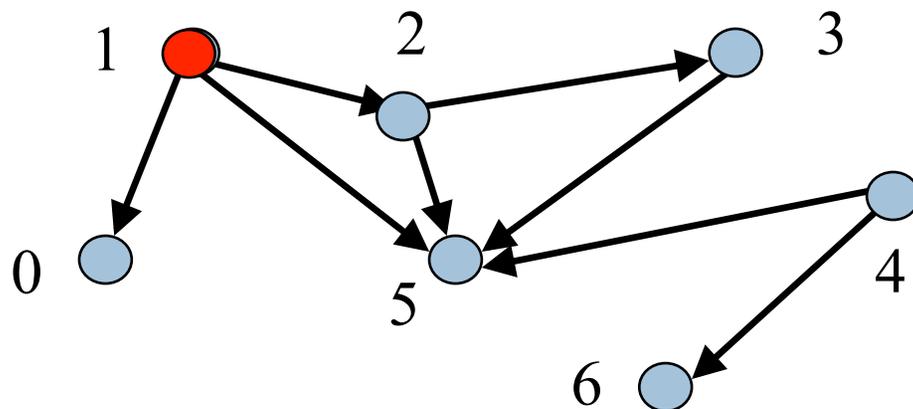
```
/** Node u is unvisited. Visit all nodes  
that are REACHABLE from u. */
```

```
public static void dfs(int u) {
```

```
    visited[u]= true;
```

```
    for each edge (u, v)  
        if v is unvisited then dfs(v);
```

```
}
```



Let **u** be 1  
The nodes to be  
visited are  
0, 2, 3, 5

Have to do dfs on  
all unvisited  
neighbors of u

# Depth-First Search

39

```
/** Node u is unvisited. Visit all nodes  
that are REACHABLE from u. */
```

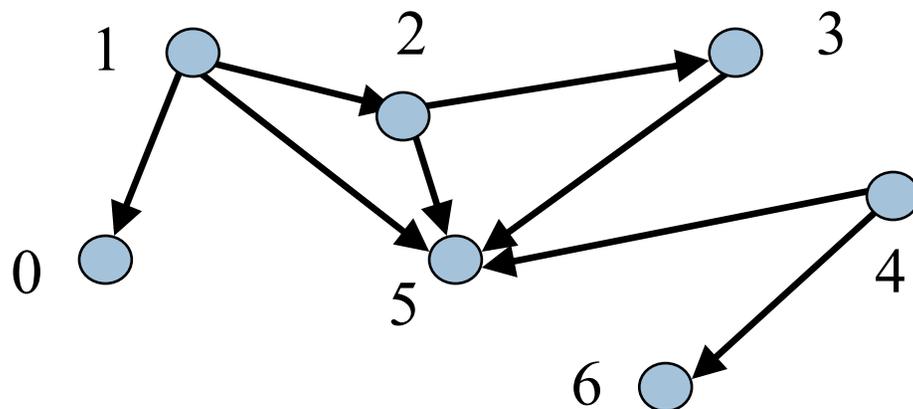
```
public static void dfs(int u) {
```

```
    visited[u]= true;
```

```
    for each edge (u, v)
```

```
        if v is unvisited then dfs(v);
```

```
}
```



Let **u** be 1  
The nodes to be  
visited are  
0, 2, 3, 5

Suppose the **for**  
**each** loop visits  
neighbors in  
numerical order.  
Then dfs(1) visits  
the nodes in this  
order:  
1, 0, 2, 3, 5

# Depth-First Search

40

```
/** Node u is unvisited. Visit all nodes  
    that are REACHABLE from u. */  
public static void dfs(int u) {  
    visited[u]= true;  
    for each edge (u, v)  
        if v is unvisited then dfs(v);  
}
```

That's all there is  
to the basic dfs.  
You may have to  
change it to fit a  
particular situation.

**Example:** There may be a different way (other than array **visited**) to know whether a node has been visited

**Example:** Instead of using recursion, use a loop and maintain the stack yourself.

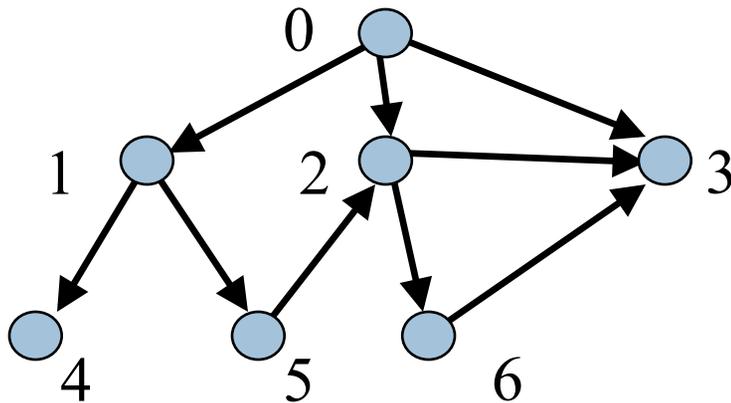
# Breadth-First Search (BFS)

41

BFS visits all neighbors first before visiting their neighbors. It goes level by level.

Use a queue instead of a stack

- ▣ stack: last-in, first-out (LIFO)
- ▣ queue: first-in, first-out (FIFO)



dfs(0) visits in this order:  
0, 1, 4, 5, 2, 3, 6

bfs(0) visits in this order:  
0, 1, 2, 3, 4, 5, 6

Breadth-first not good for the Bfly: too much flying back and forth

# Summary

42

- We have seen an introduction to graphs and will return to this topic on Thursday
  - ▣ Definitions
  - ▣ Testing for a dag
  - ▣ Depth-first and breadth-first search