

# Algorithms and Data Structures for Data Science

## Graphs

CS 277  
Brad Solomon

April 10, 2023



UNIVERSITY OF  
**ILLINOIS**  
URBANA - CHAMPAIGN

Department of Computer Science

# This week only: Lab room and OH Changes

Friday April 14th: AE3's Celebration of Teaching in 1306 Everitt

**Our lab will be in 2101 Everitt instead!**

**Office Hour Changes:** My OH will be Friday between 3:15 and 4:15

**There will not be OH on Thursday April 13th!**

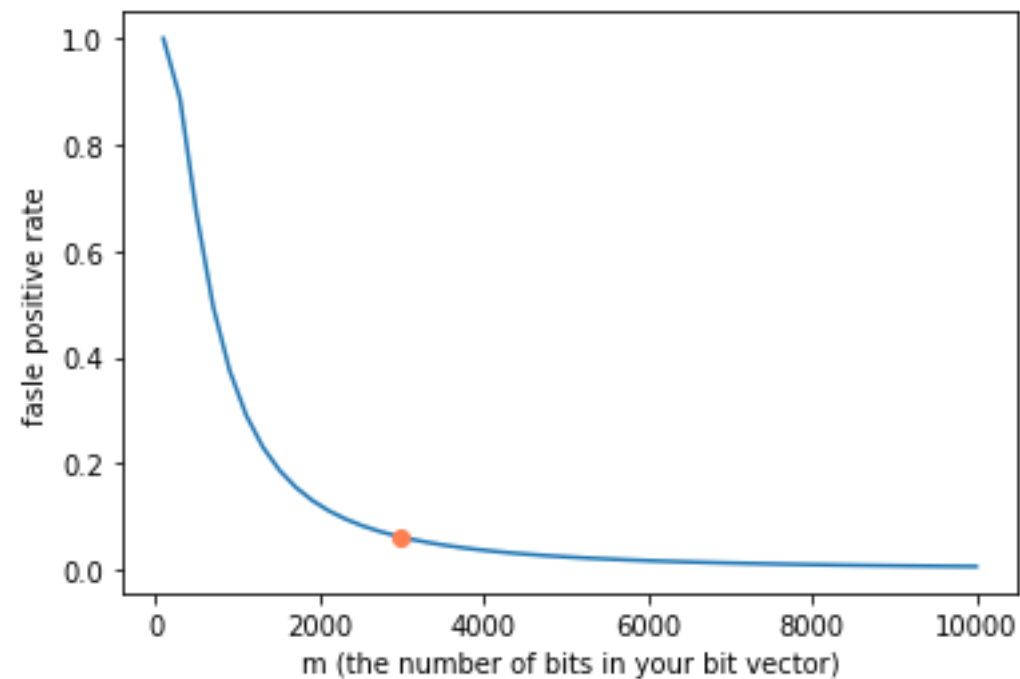
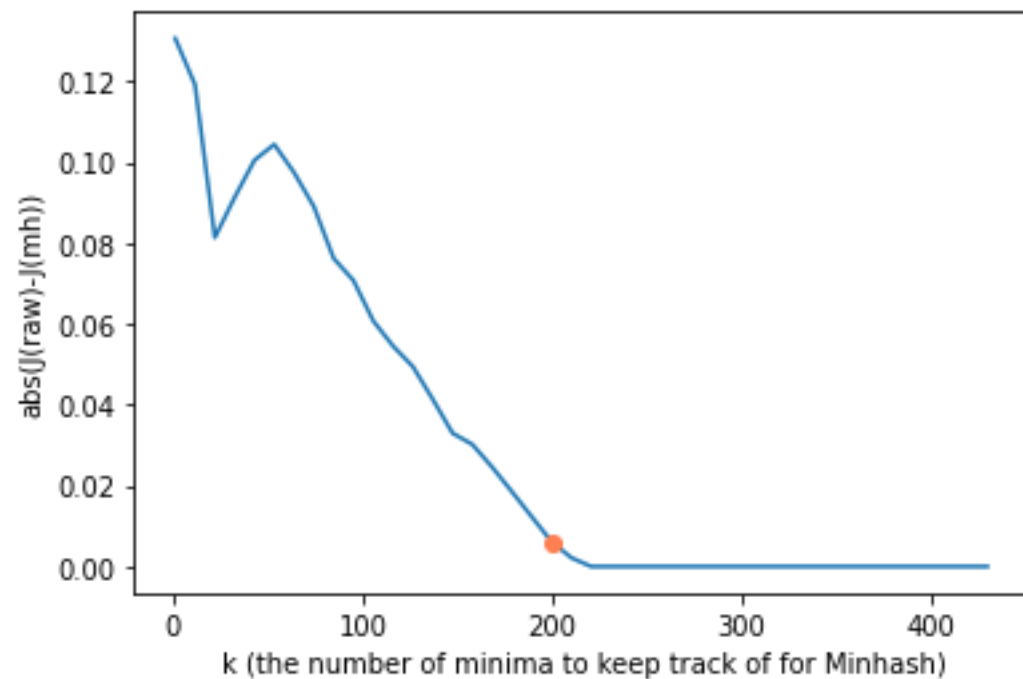
# Learning Objectives

Define graph vocabulary

Discuss graph implementation / storage strategies

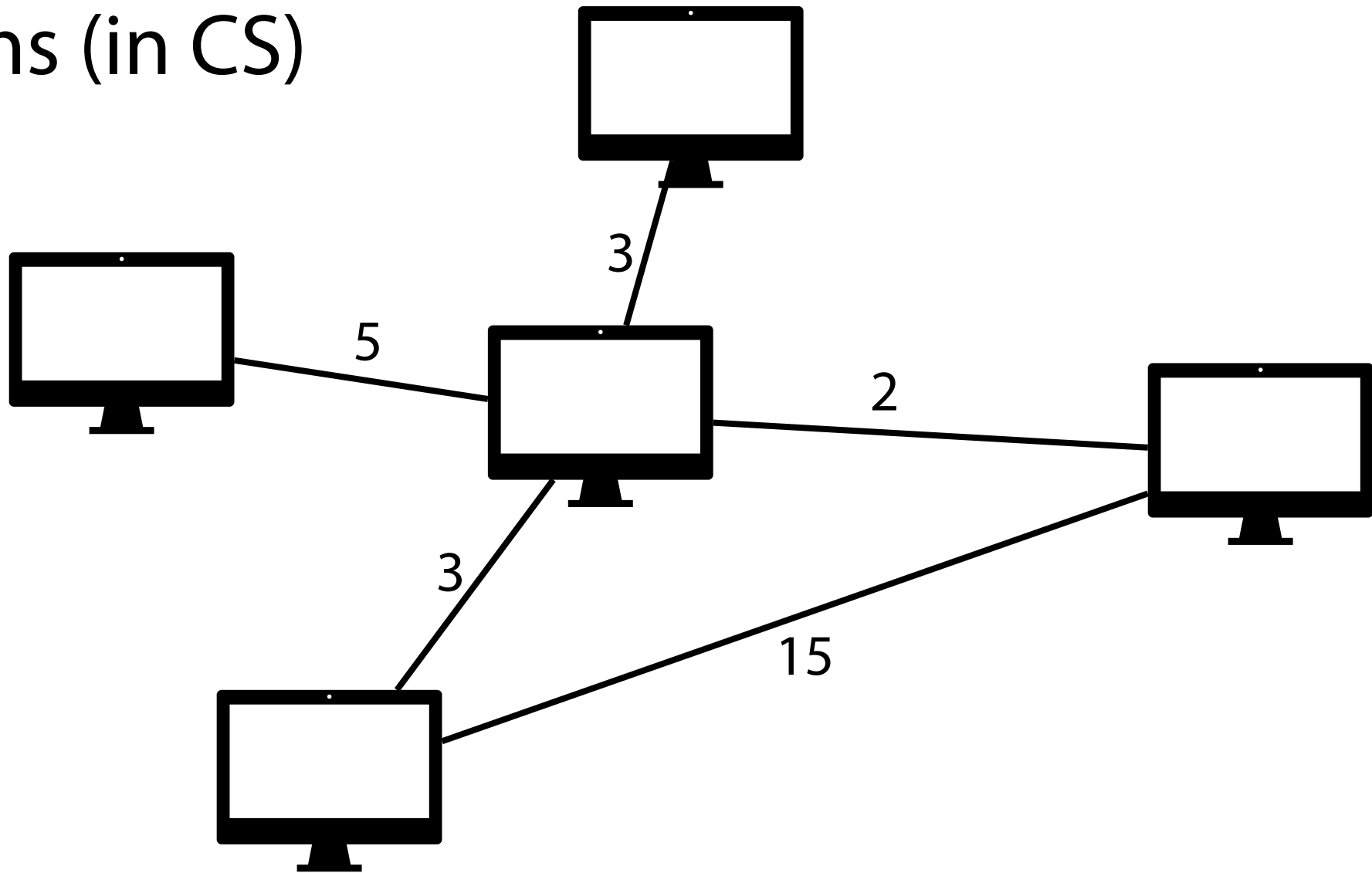
Define key graph functions and discuss implementation details

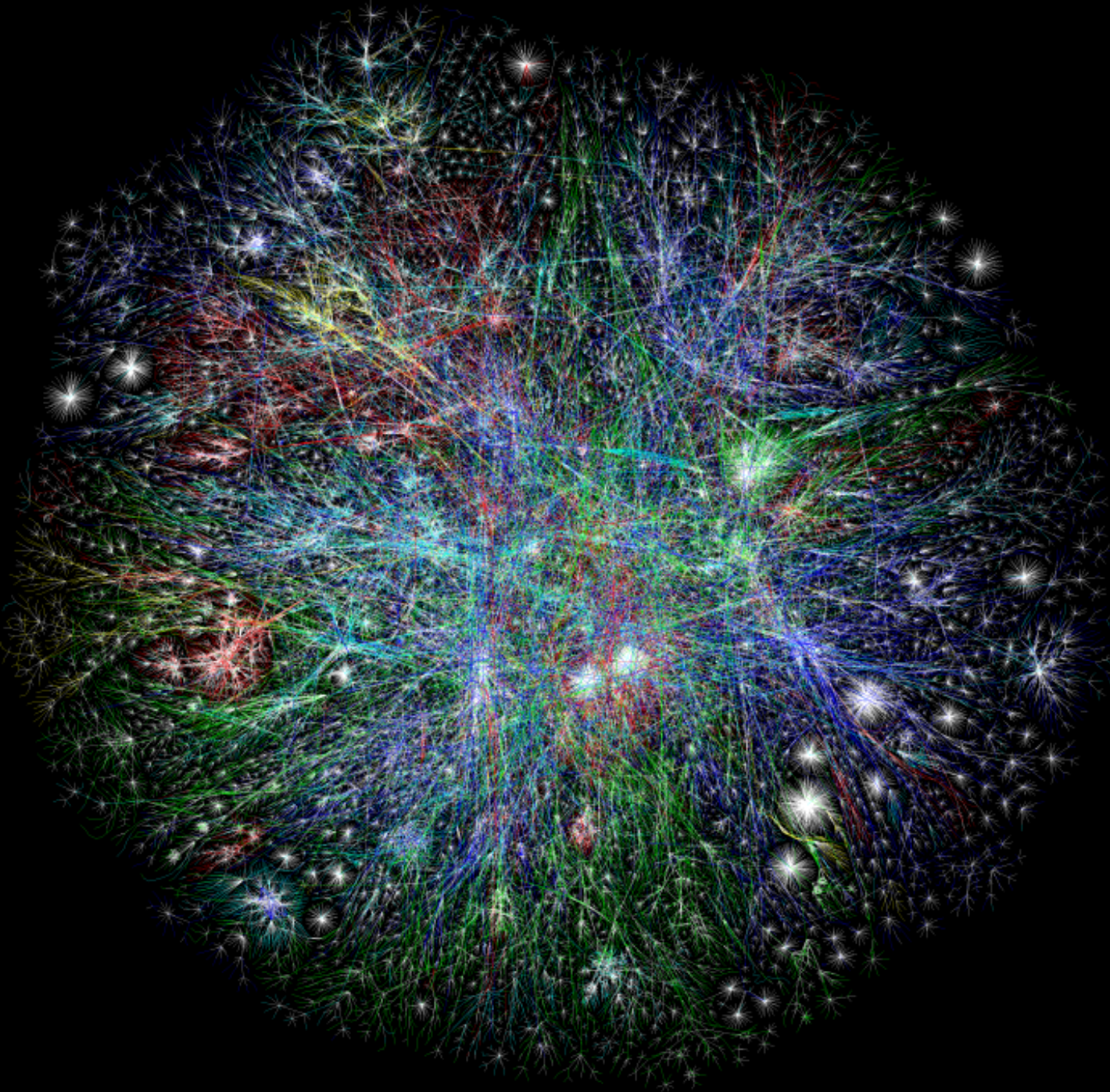
# Graphs (for most people)



This graph was given as part of justification for MP 2: Sketching!

# Graphs (in CS)



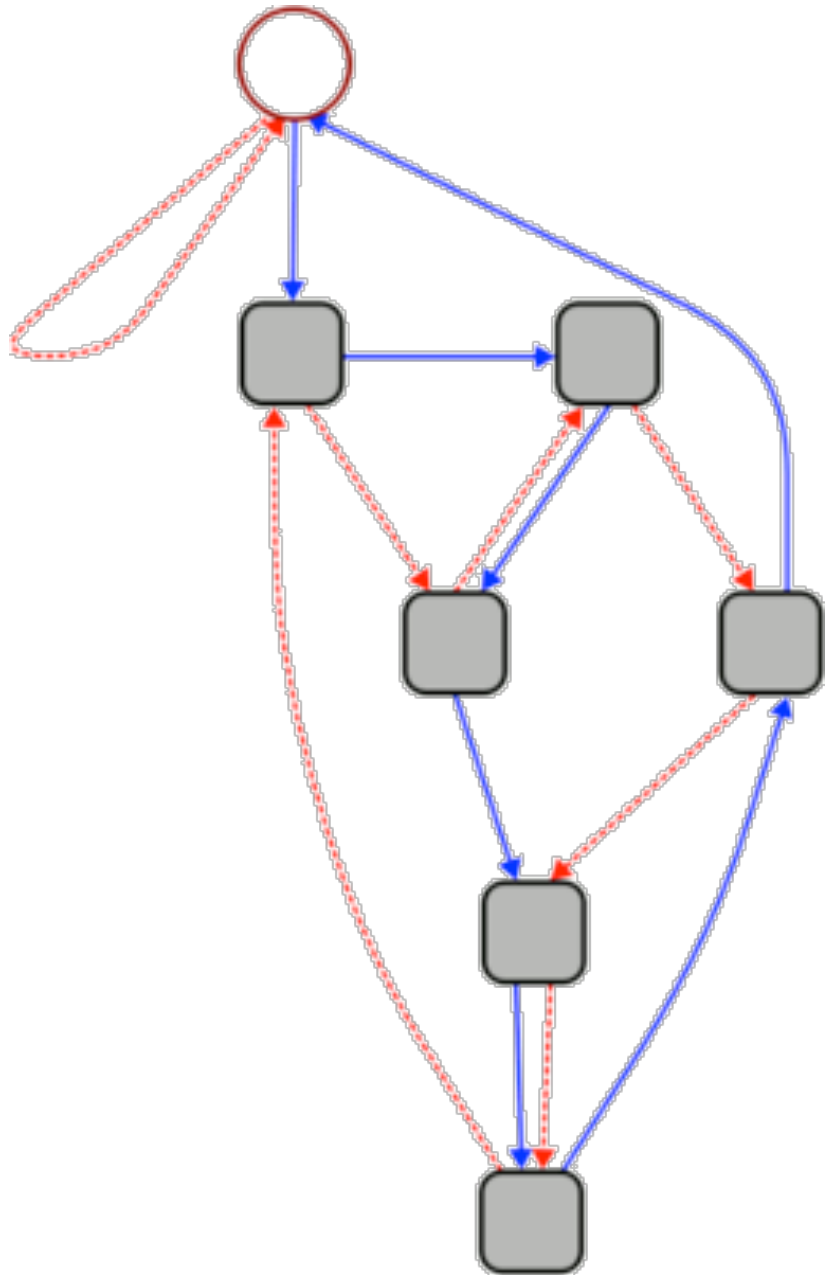


**Nodes:** Routers and servers

**Edges:** Connections

**The Internet 2003**

*[The OPTE Project](#) (2003)*



This graph can be used to quickly calculate whether a given number is divisible by 7.

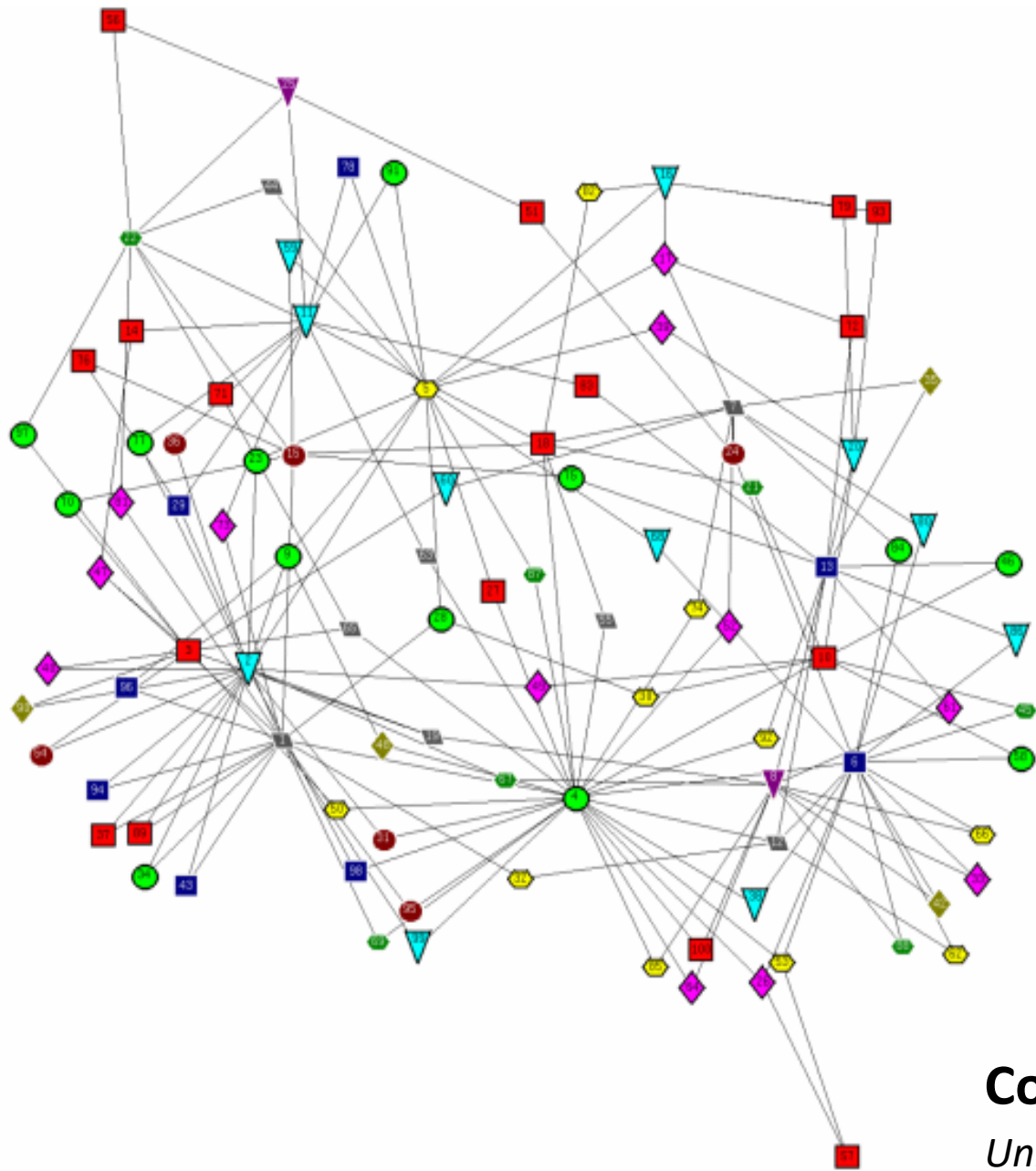
1. Start at the circle node at the top.
2. For each digit  $d$  in the given number, follow  $d$  blue (solid) edges in succession. As you move from one digit to the next, follow  $1$  red (dashed) edge.
3. If you end up back at the circle node, your number is divisible by 7.

3703

**“Rule of 7”**

*Unknown Source*

*Presented by Cinda Heeren, 2016*

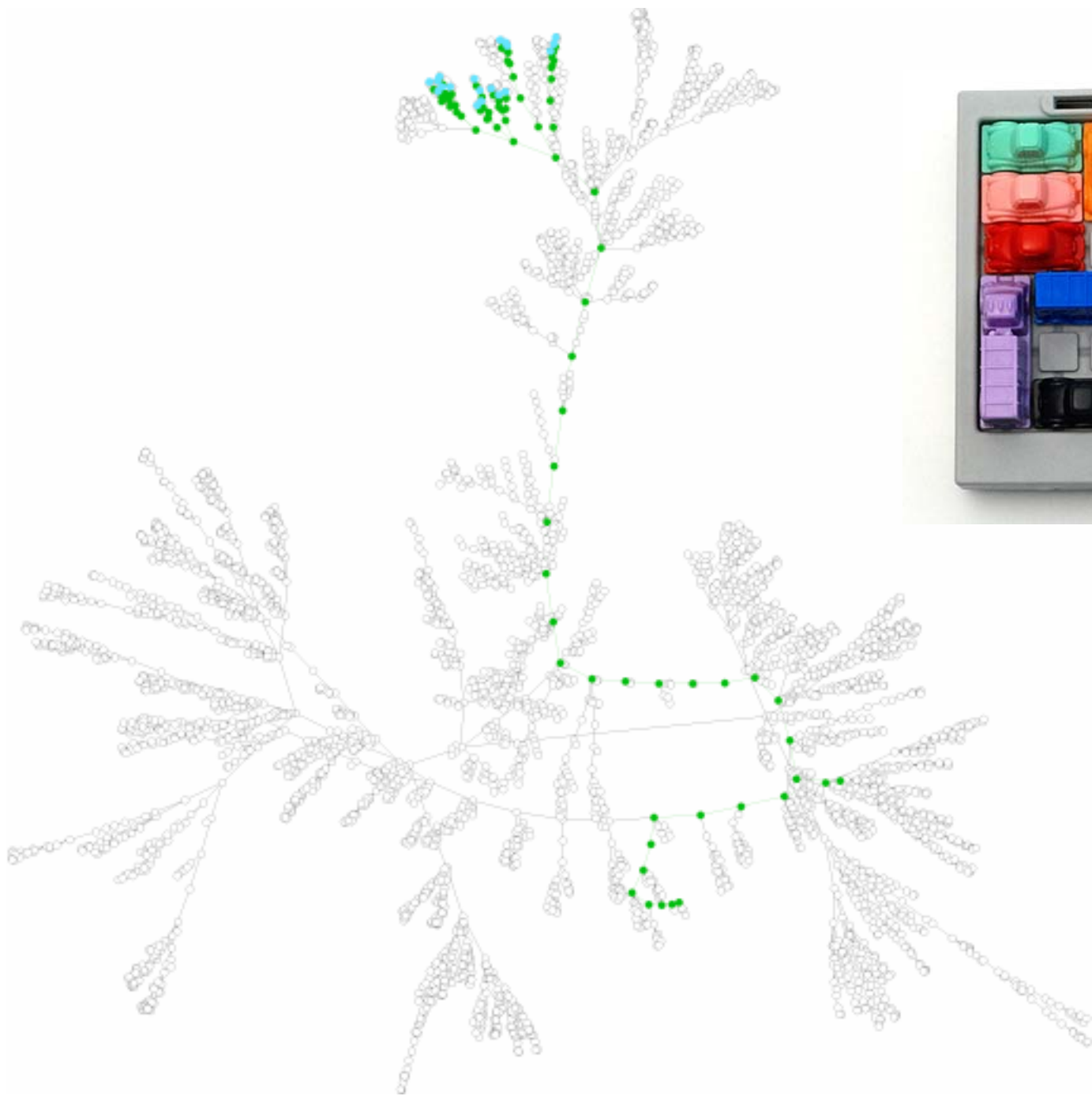


## Conflict-Free Final Exam Scheduling Graph

*Unknown Source*

*Presented by Cinda Heeren, 2016*

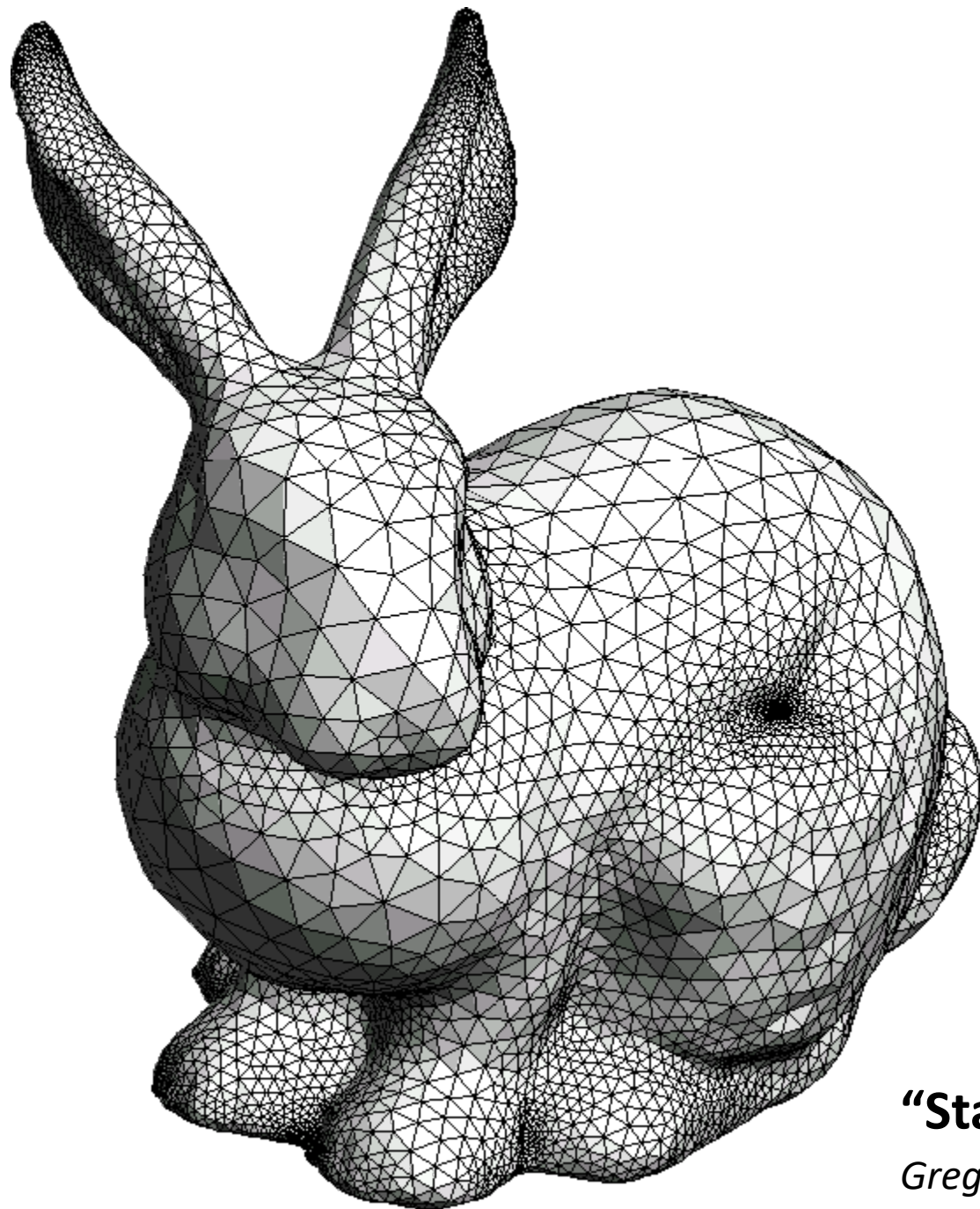




## “Rush Hour” Solution

*Unknown Source*

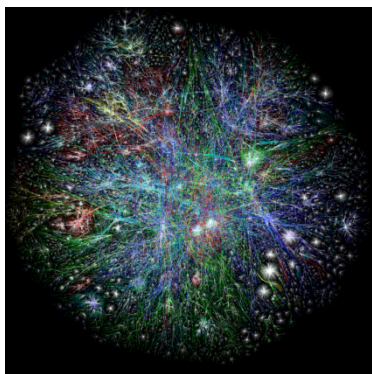
*Presented by Cinda Heeren, 2016*



**“Stanford Bunny”**

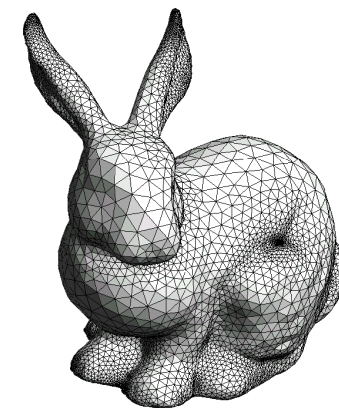
*Greg Turk and Mark Levoy (1994)*

# Graphs



**To study all of these structures:**

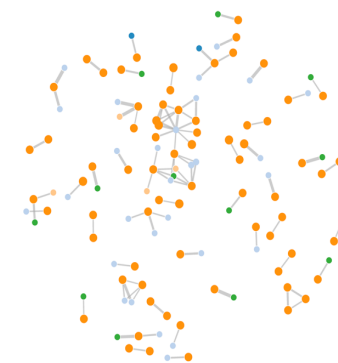
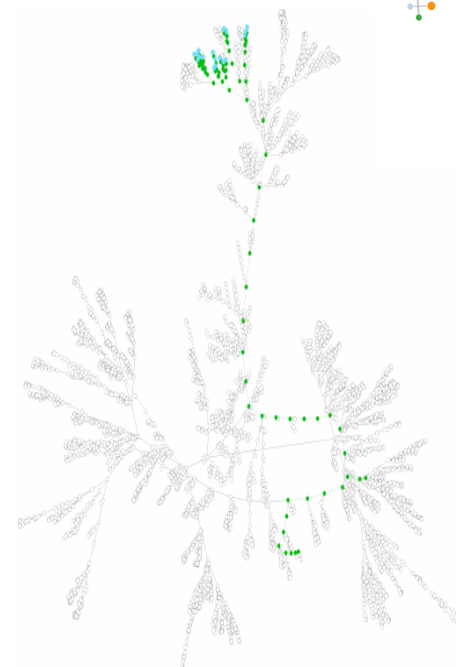
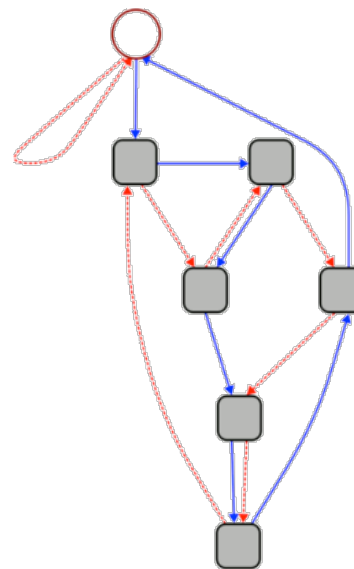
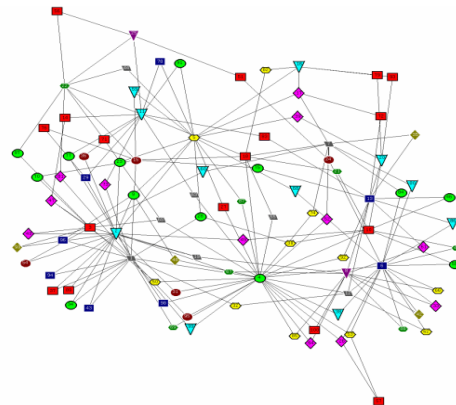
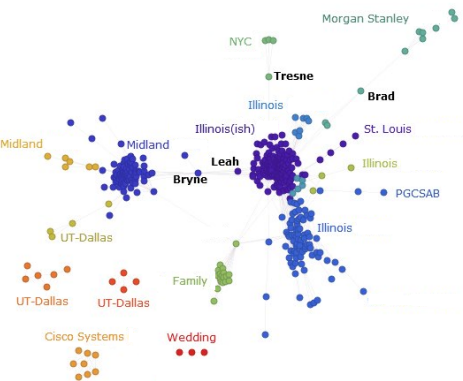
1. A common vocabulary
2. Graph implementations
3. Graph traversals
4. Graph algorithms



HAMLET



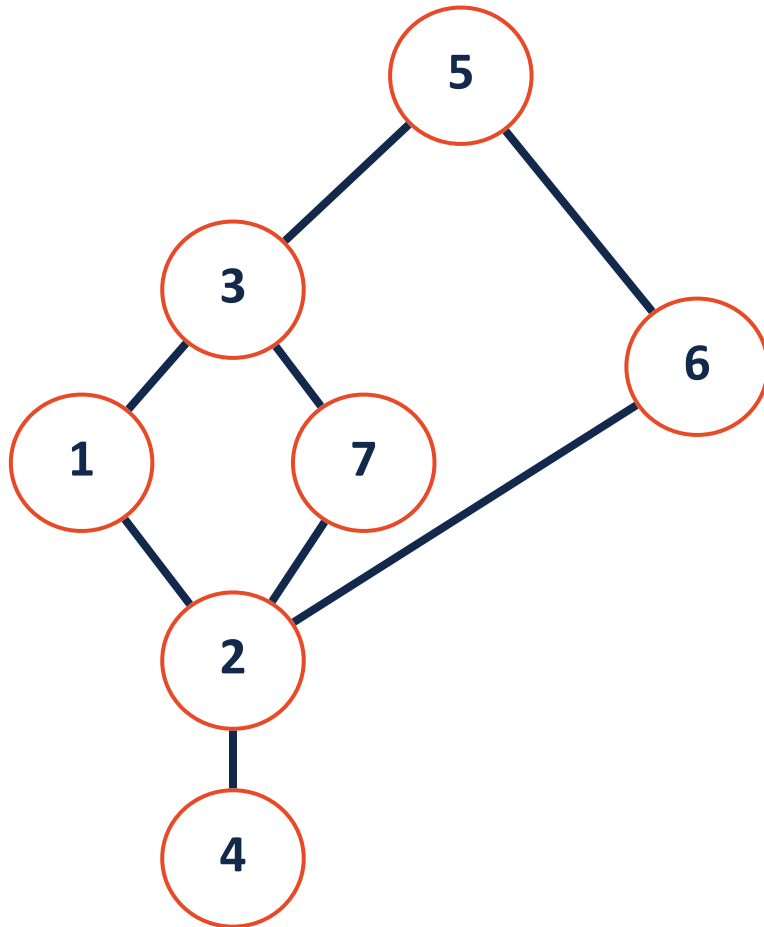
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# Graph Vocabulary

$$G = (V, E)$$

A **graph** is a data structure containing a set of vertices and a set of edges

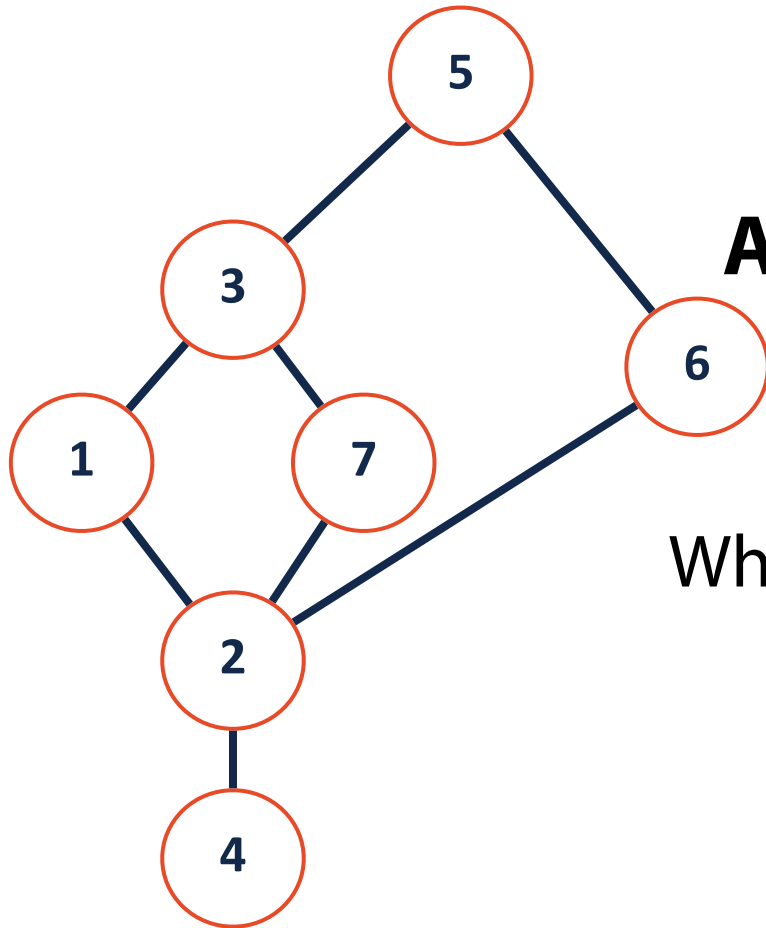


**Vertex:**

**Edges:**

# Graph Vocabulary

Each vertex can have many edges



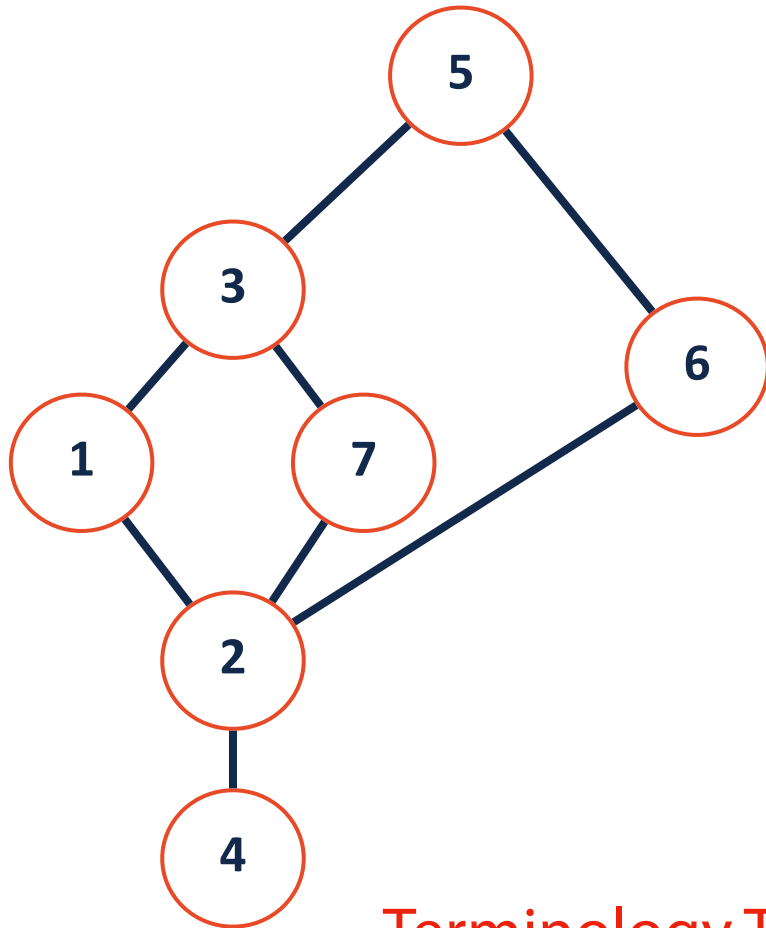
**Degree:** # of edges touching a vertex

**Adjacency:** Two vertices are adjacent if they are connected by an edge

What edges are adjacent to 4? To 2?

# Graph Vocabulary

A graph has **no root** and **may contain cycles**



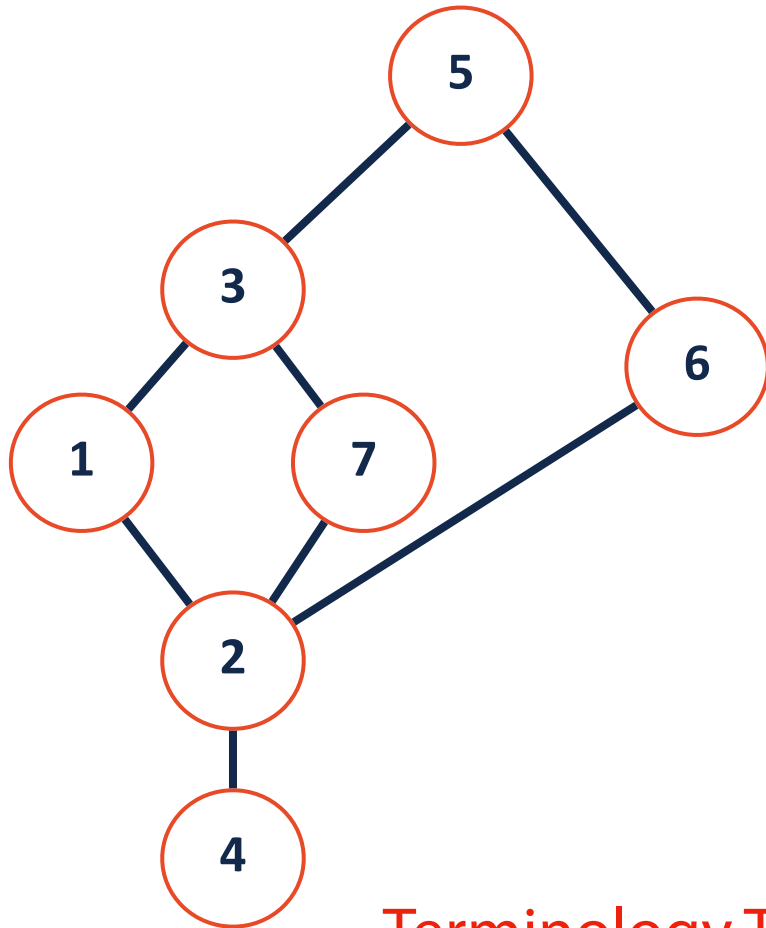
**Path:** A sequence of vertices (or edges) between two nodes

What is a path between 4 and 3?

Terminology Trivia: Every tree is a graph but not every graph is a tree

# Graph Vocabulary

A graph has **no root** and **may contain cycles**



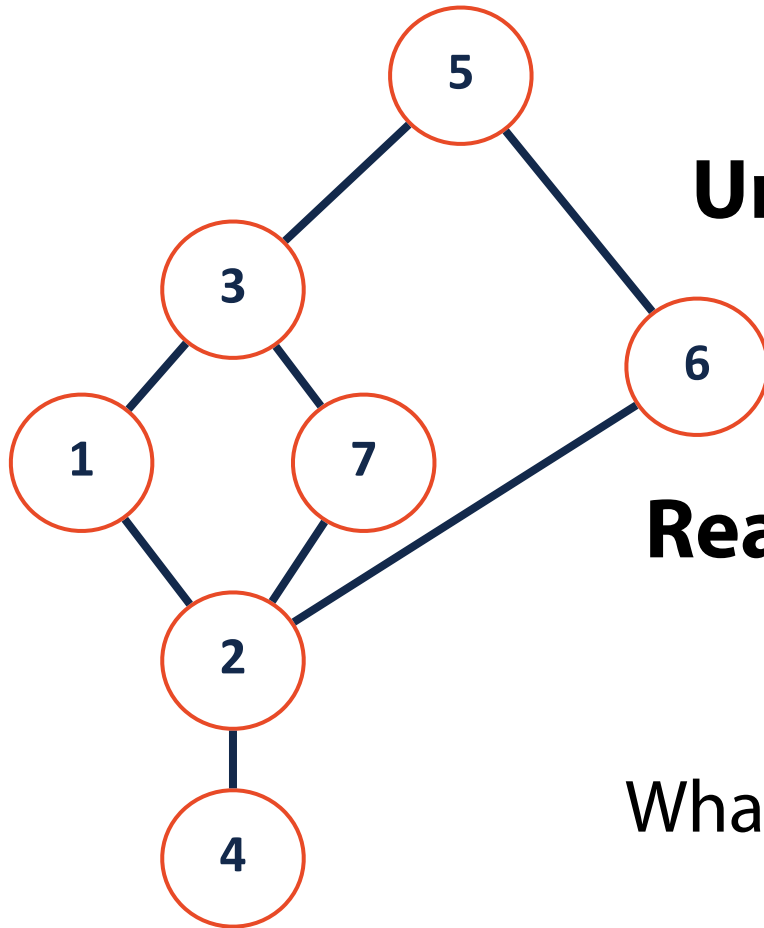
**Cycle:** A path from a node back to itself

What are some of the cycles in this graph?

Terminology Trivia: Every tree is a graph but not every graph is a tree

# Graph Vocabulary

A graph may be **directed** or **undirected**



**Directed:** Edges are one way connections

**Undirected:** Traversable in either direction

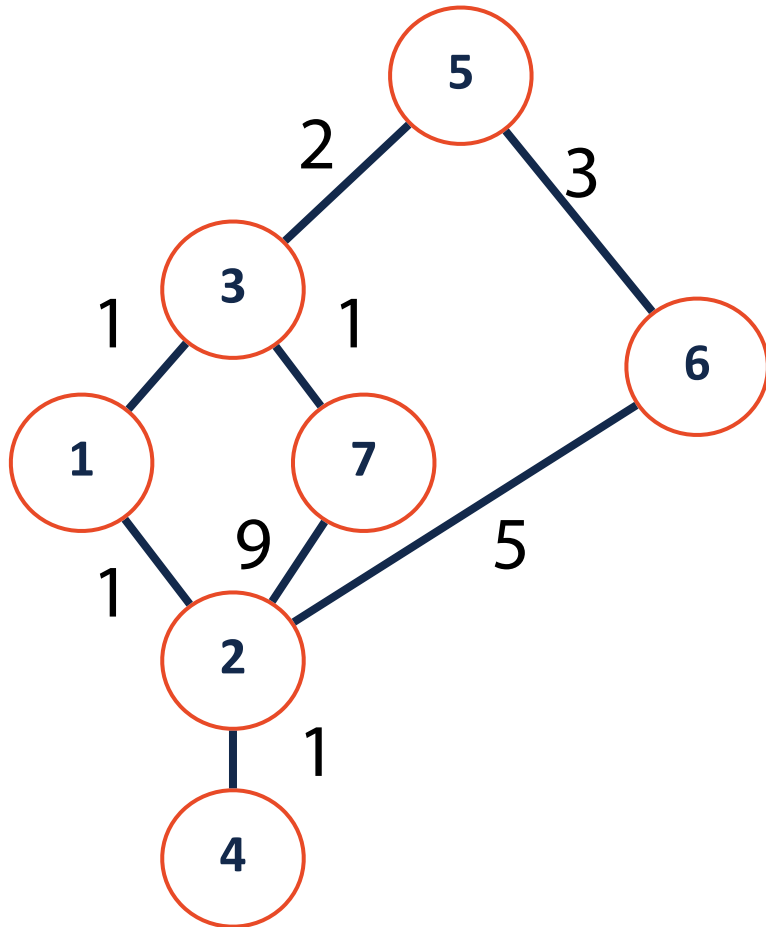
**Reachability:**  $v_2$  is reachable from  $v_1$  if there is a path from  $v_1$  to  $v_2$

What nodes are not reachable from 4?



# Graph Vocabulary

A graph may be **weighted** or **unweighted**



**Weights:** A value associated with an edge

What is the shortest path from 4 to 5?

# Graphs

Given a collection of individual DMs between individuals, you want to build a graph of connections in a social network.

What is a vertex?

What is an edge?

Are the edges directed or undirected?

Are the edges weighted or unweighted?

# Graphs

Given a collection of roads between cities in Illinois, you want to build a graph of the transportation infrastructure in the state.

What is a vertex?

What is an edge?

Are the edges directed or undirected?

Are the edges weighted or unweighted?

# Graphs



It is important to be able to describe the structure of a graph given input.

Some other common questions:

Does your graph have cycles?

What is the largest / smallest / average degree in your graph?

What is the total number of edges?

...

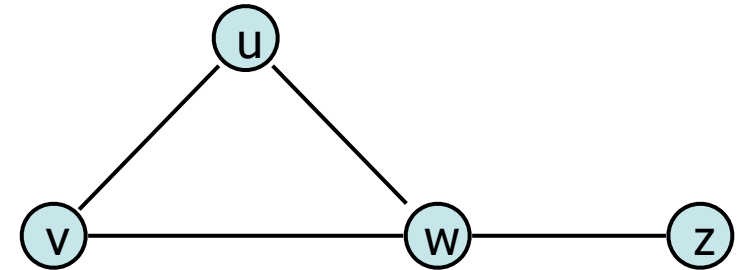
Of course, we also have to understand the graph as a **data structure**

# Graph Implementation

What information do we need to store to fully define a graph?


Vertex:

Edge:



What information do we want to be able to find out quickly?

What operations do we want to prioritize?



# Graph ADT

**Find**

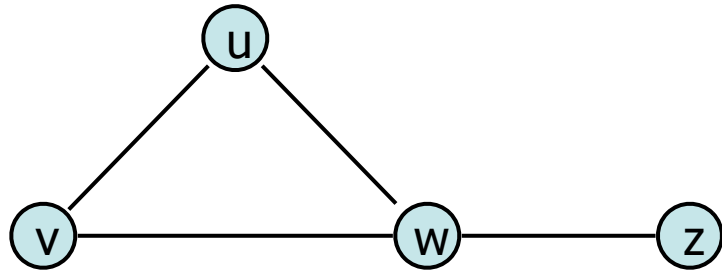
**Insert**

**Remove**

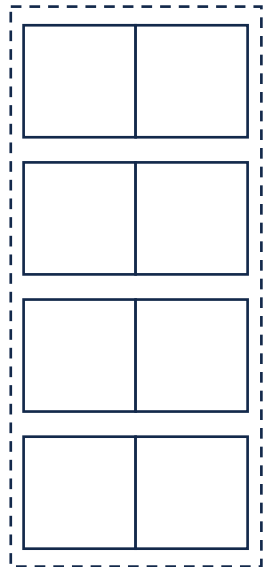
# Graph Implementation: Edge List

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

*The equivalent of an 'unordered' data structure*



**Vertex Storage:**

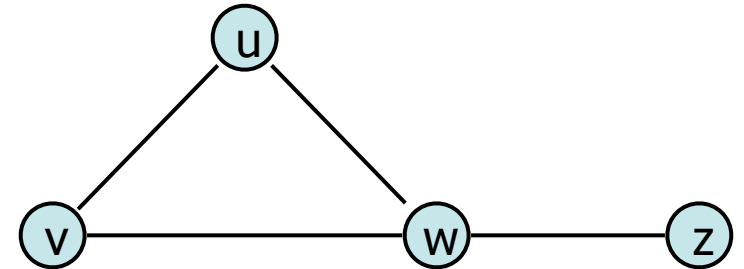


**Edge Storage:**

# Graph Implementation: Edge List $|V| = n, |E| = m$

*The equivalent of an 'unordered' data structure*

```
1 class edgeList:  
2     def __init__(self, inList):  
3         self.edges=[]  
4         for e in inList:  
5             v1 = e.split(" ")[0]  
6             v2 = e.split(" ")[1]  
7             self.edges.append( (v1, v2) )
```



Most graph inputs are line separated lists of edges:

```
u v  
u w  
v w  
w z
```



# Graph Implementation: Edge List $|V| = n, |E| = m$

*The equivalent of an 'unordered' data structure*

```
1 class edgeList:
2     def __init__(self, inList):
3         self.edges=[]
4         for e in inList:
5             v1 = e.split(" ")[0]
6             v2 = e.split(" ")[1]
7             self.edges.append( (v1, v2) )
```

```
BA,1355,SIN,3316,LHR,507,,0,744,777
BA,1355,SIN,3316,MEL,3339,Y,0,744
TOM,5013,ACE,1055,BFS,465,,0,320
```

## **Airline**

2-letter (IATA) or 3-letter (ICAO) code of the airline.

## **Airline ID**

Unique OpenFlights identifier for airline (see [Airline](#)).

## **Source airport**

3-letter (IATA) or 4-letter (ICAO) code of the source airport.

## **Source airport ID**

Unique OpenFlights identifier for source airport (see [Airport](#))

## **Destination airport**

3-letter (IATA) or 4-letter (ICAO) code of the destination airport.

## **Destination airport ID**

Unique OpenFlights identifier for destination airport (see [Airport](#))

## **Codeshare**

"Y" if this flight is a codeshare (that is, not operated by Airline, but another carrier), empty otherwise.

## **Stops**

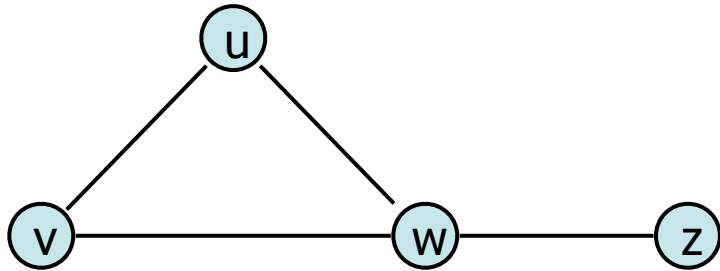
Number of stops on this flight ("0" for direct)

## **Equipment**

3-letter codes for plane type(s) generally used on this flight, separated by spaces

# Graph Implementation: Edge List

**getVertices()**



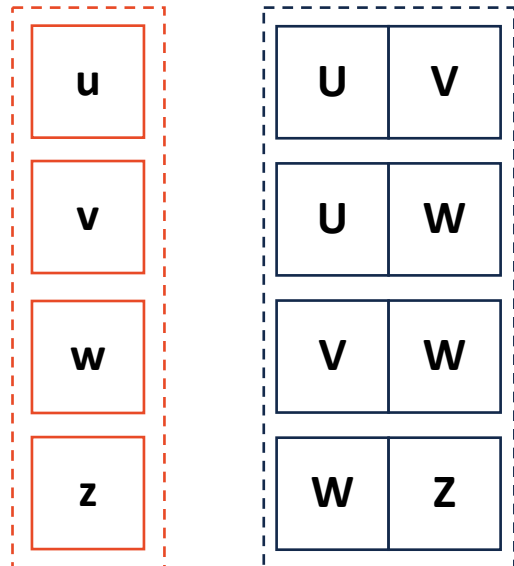
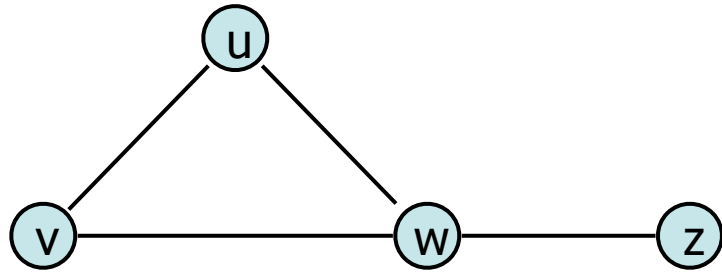
**getEdge(v)**

u	v
u	w
v	w
w	z

**areAdjacent(u, v)**

# Graph Implementation: Edge List

**insertVertex(v)**

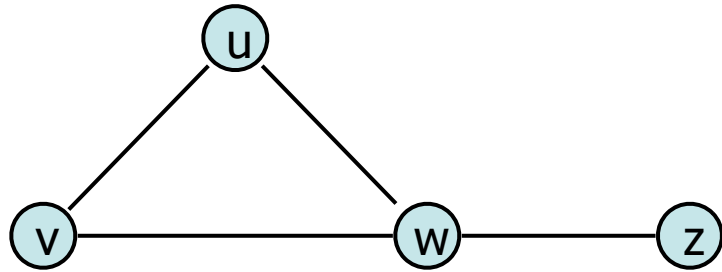


**insertEdge(u, v)**

# Graph Implementation: Edge List



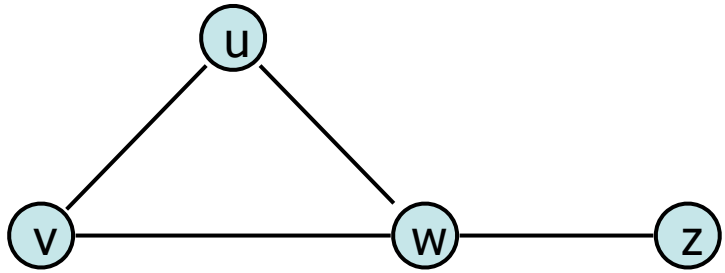
**Pros:**



**Cons:**

u	v
u	w
v	w
w	z

# Graph Implementation: Adjacency Matrix



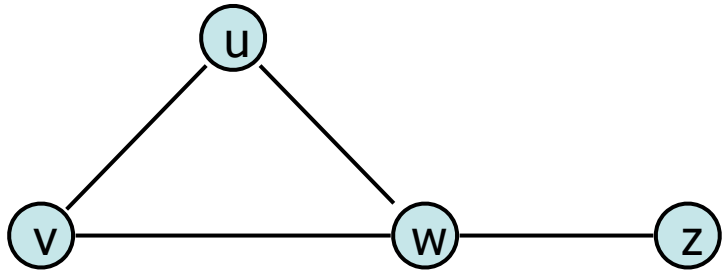
**Vertex Storage:**

**Edge Storage:**

u	
v	
w	
z	

	u	v	w	z
u				
v				
w				
z				

# Graph Implementation: Adjacency Matrix

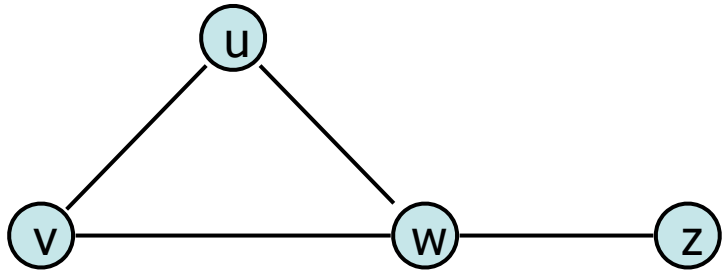


**getVertices():**

u	0
v	1
w	2
z	3

	u	v	w	z
u	0	1	1	0
v	1	0	1	0
w	1	1	0	1
z	0	0	1	0

# Graph Implementation: Adjacency Matrix

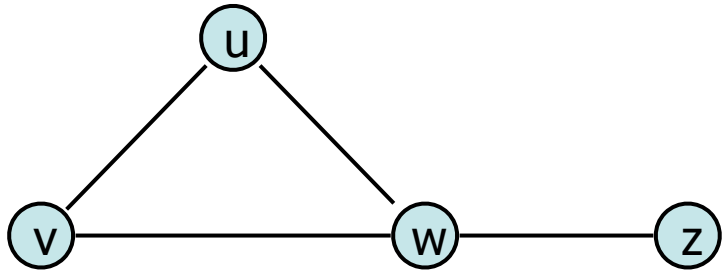


**getEdges(v):**

u	0
v	1
w	2
z	3

	u	v	w	z
u	0	1	1	0
v	1	0	1	0
w	1	1	0	1
z	0	0	1	0

# Graph Implementation: Adjacency Matrix



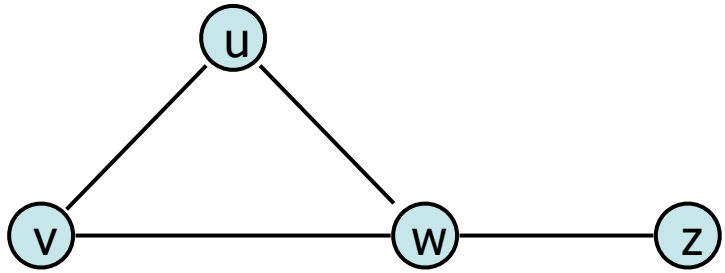
**areAdjacent(u, v):**

u	0
v	1
w	2
z	3

	u	v	w	z
u	0	1	1	0
v	1	0	1	0
w	1	1	0	1
z	0	0	1	0



# Graph Implementation: Adjacency Matrix

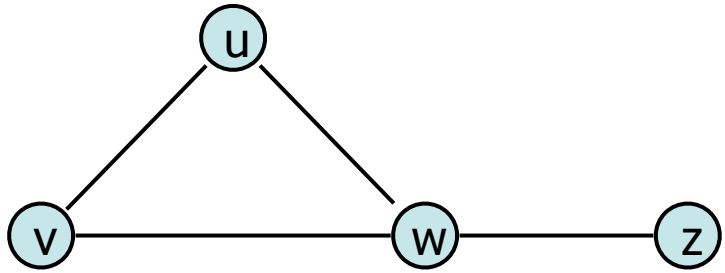


**insertVertex(v):**

u	0
v	1
w	2
z	3

	u	v	w	z
u	0	1	1	0
v	1	0	1	0
w	1	1	0	1
z	0	0	1	0

# Graph Implementation: Adjacency Matrix

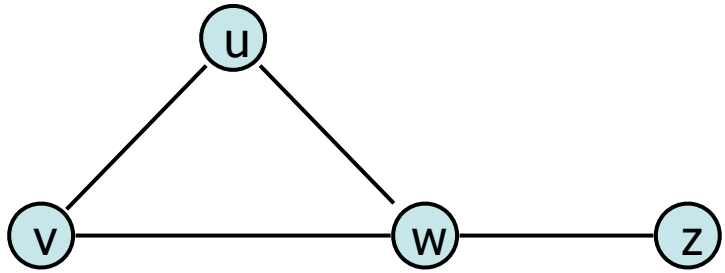


**insertEdge(u, v):**

u	0
v	1
w	2
z	3

	u	v	w	z
u	0	1	1	0
v	1	0	1	0
w	1	1	0	1
z	0	0	1	0

# Graph Implementation: Adjacency Matrix



**removeVertex(v):**

u	0
v	1
w	2
z	3

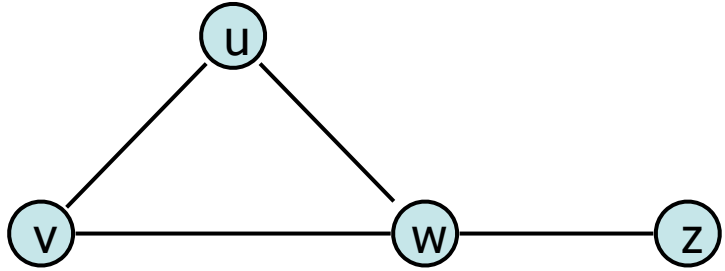
	u	v	w	z
u	0	1	1	0
v	1	0	1	0
w	1	1	0	1
z	0	0	1	0

**removeEdge(u, v):**

# Graph Implementation: Adjacency Matrix



**Pros:**



**Cons:**

u	0
v	1
w	2
z	3

	u	v	w	z
u	0	1	1	0
v	1	0	1	0
w	1	1	0	1
z	0	0	1	0