

# Algorithms and Data Structures for Data Science

## Graph Implementations 3

CS 277

April 1, 2024

Brad Solomon



UNIVERSITY OF  
**ILLINOIS**  
URBANA - CHAMPAIGN

Department of Computer Science

# Learning Objectives

Practice implementing complex data structures (graphs)

Compare and contrast different implementations

Review Big O concepts in the context of graphs

# Graph ADT

## Find

`getVertices()` — return the list of vertices in a graph

`getEdges(v)` — return the list of edges that touch the vertex  $v$

`areAdjacent(u, v)` — returns a bool based on if an edge from  $u$  to  $v$  exists

## Insert

`insertVertex(v)` — adds a vertex to the graph

`insertEdge(u, v)` — adds an edge to the graph

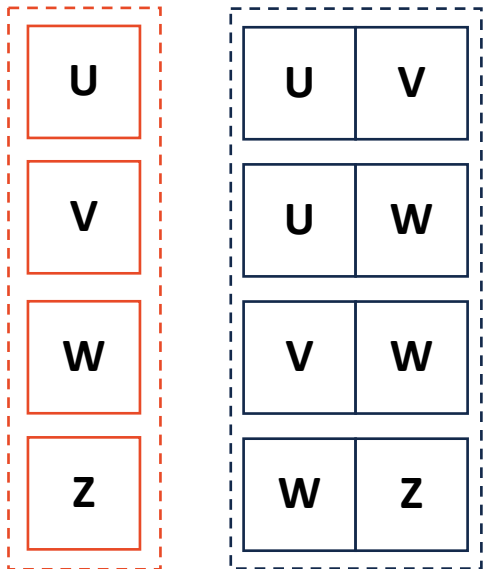
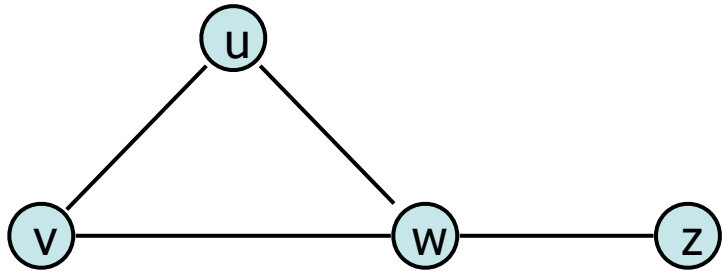
## Remove

`removeVertex(v)` — removes a vertex from the graph

`removeEdge(u, v)` — removes an edge from the graph

# Graph Implementation: Edge List

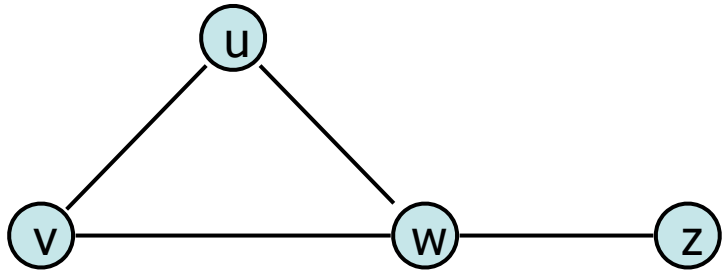
$$|V| = n, |E| = m$$



Expressed as $O(f)$	Edge List
Space	$n+m$
insertVertex(v)	$1^*$
removeVertex(v)	$n+m$
insertEdge(u, v)	$1^*$
removeEdge(u, v)	$m$
getEdges(v)	$m$
areAdjacent(u, v)	$m$

# Graph Implementation: Adjacency Matrix

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



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

Expressed as O(f)	Adjacency Matrix
Space	$n^2$
insertVertex(v)	$n^*$
removeVertex(v)	$n^*$
insertEdge(u, v)	1
removeEdge(u, v)	1
getEdges(v)	n
areAdjacent(u, v)	1

# Graph Implementations

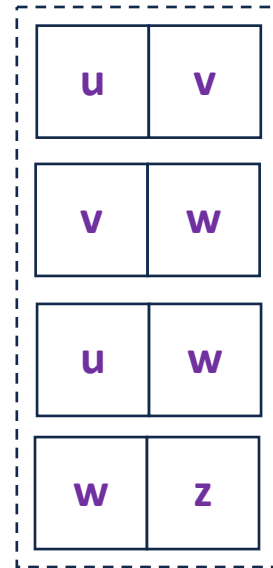
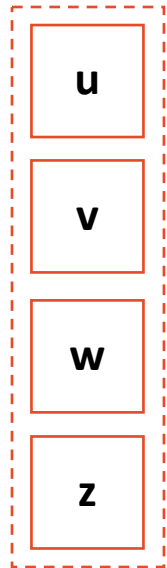
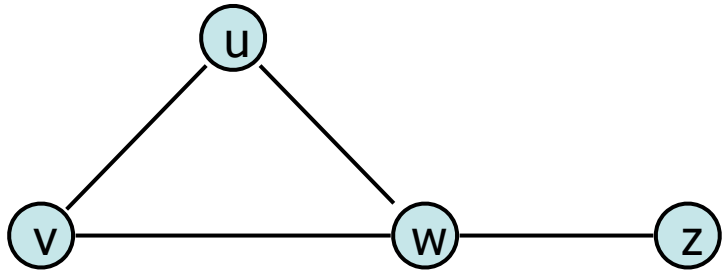
I want a graph that uses the least amount of memory possible

I want a graph that has the fastest lookup for specific edges

I want a graph that is efficient for a sparse dataset

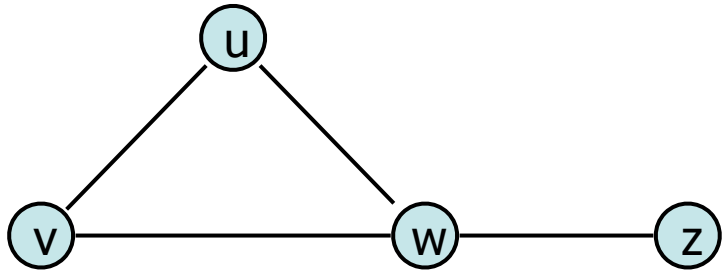
# Graph Implementation: Edge List + ?

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

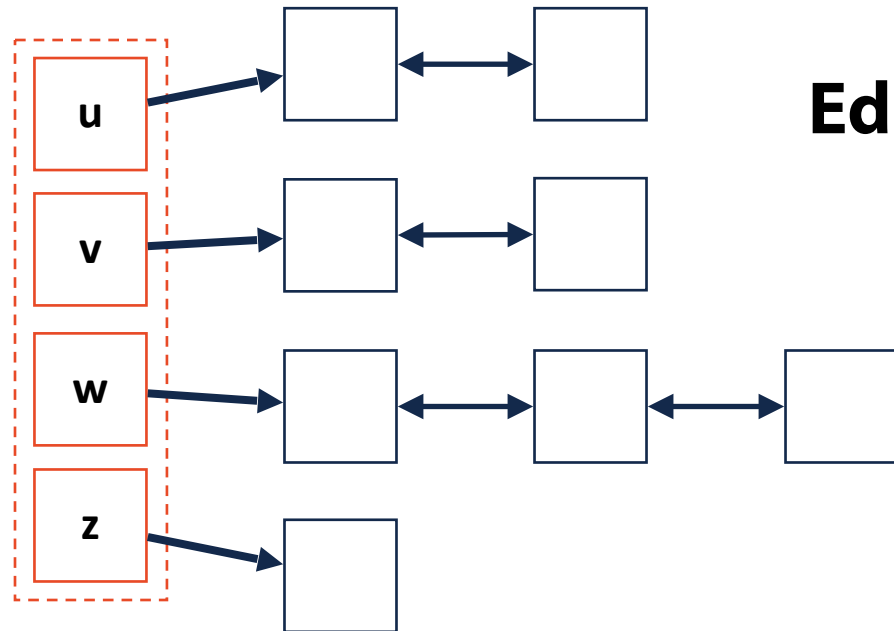


# Adjacency List

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



**Vertex Storage:**

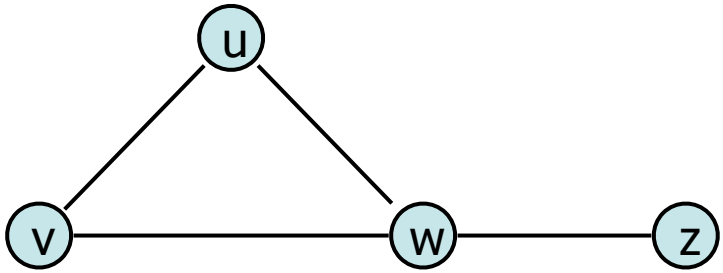


**Edge Storage:**

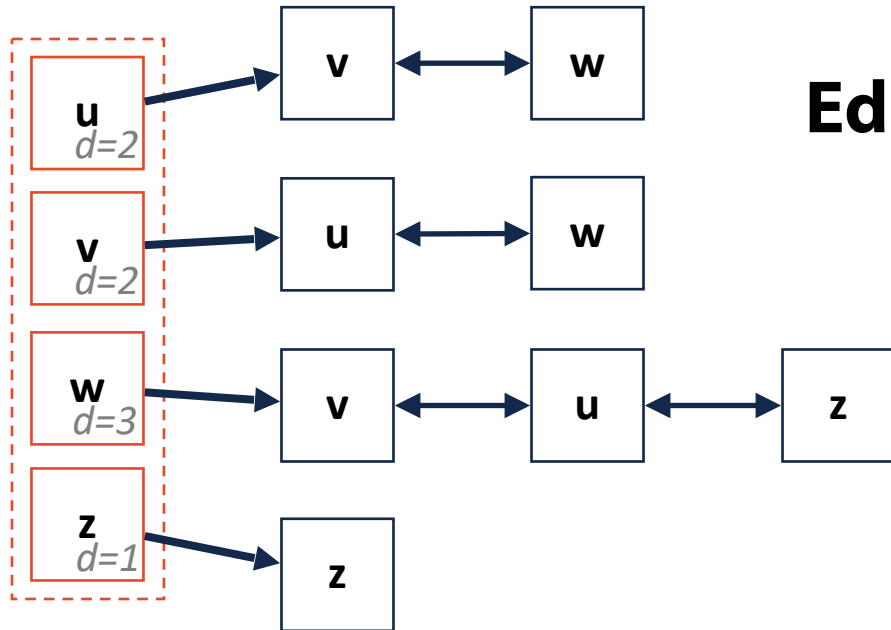


# Adjacency List

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



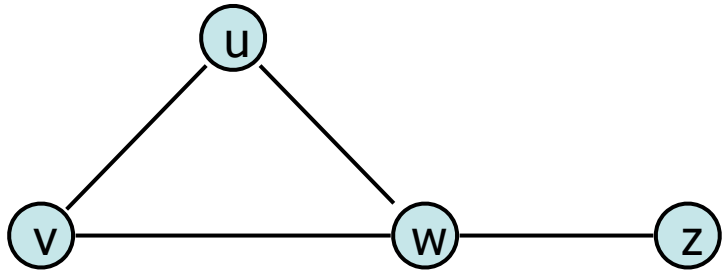
**Vertex Storage:**



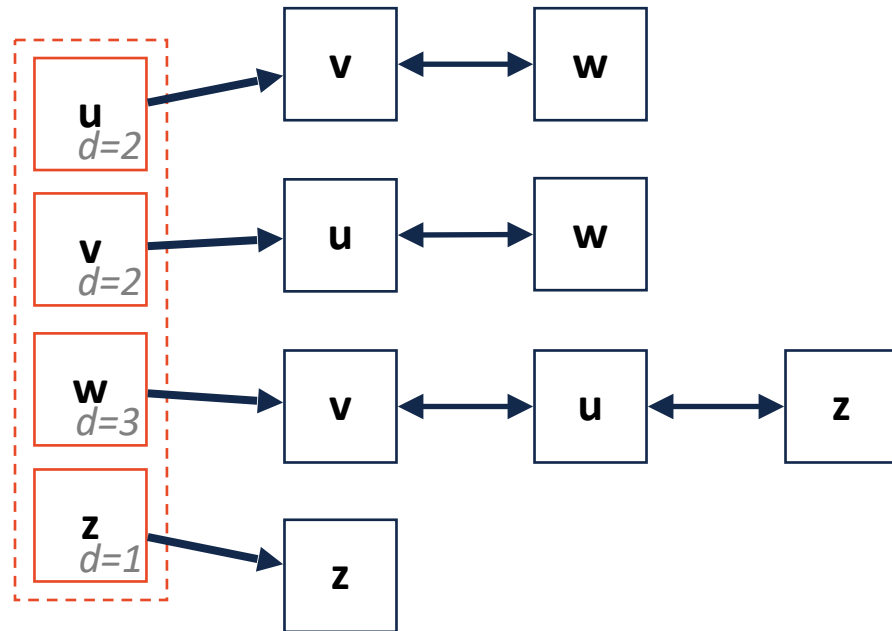
**Edge Storage:**

# Adjacency List

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

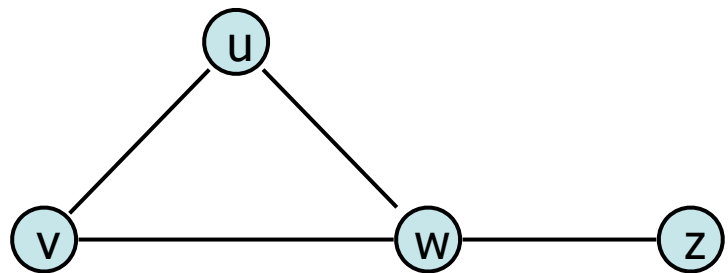


**getVertices():**

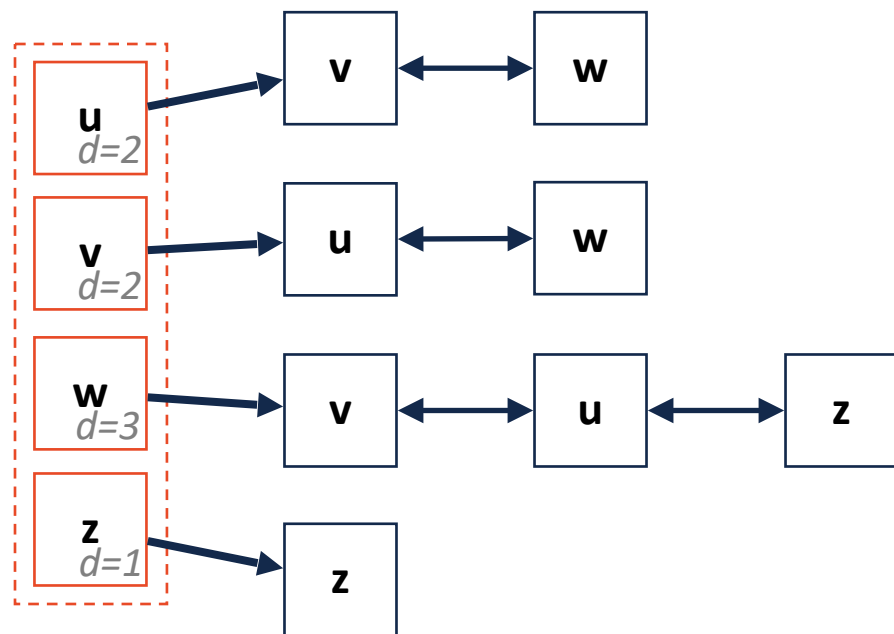


# Adjacency List

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



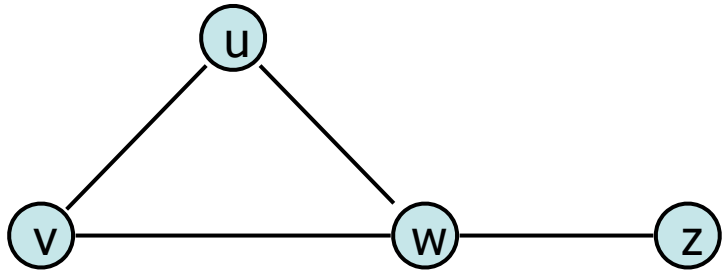
**getEdges(v):**



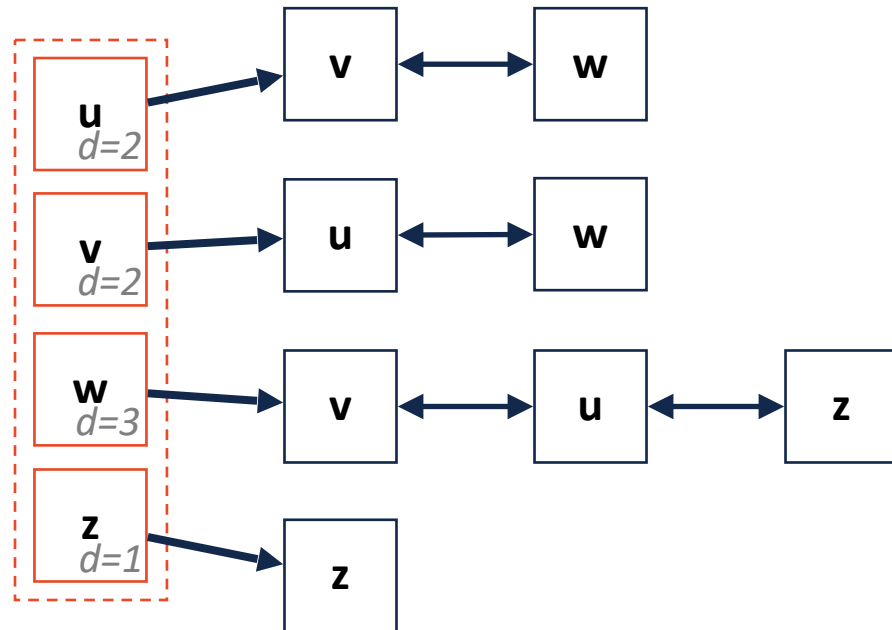


# Adjacency List

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

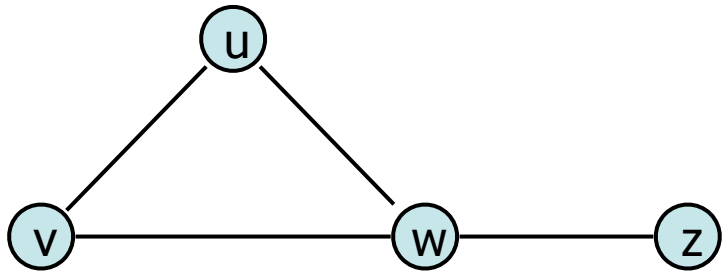


**areAdjacent(u, v):**

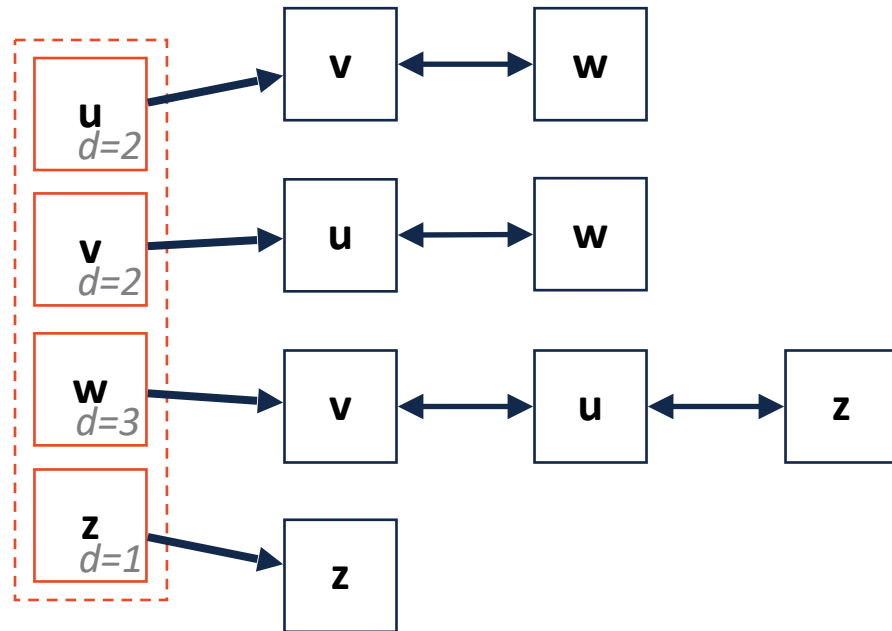


# Adjacency List

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

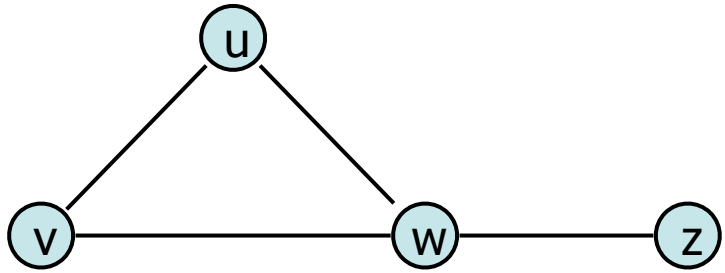


**removeVertex(v):**



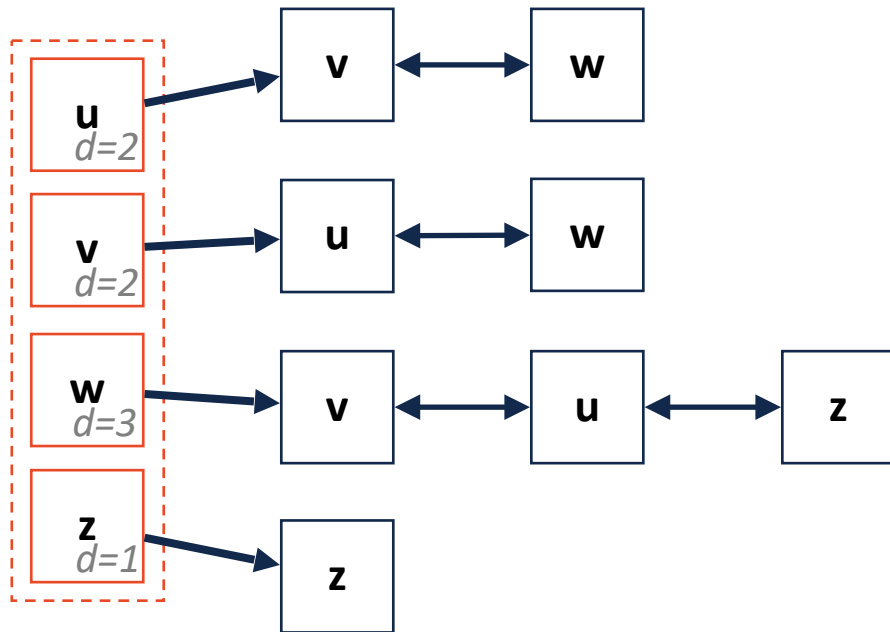
# Simple Adjacency List

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



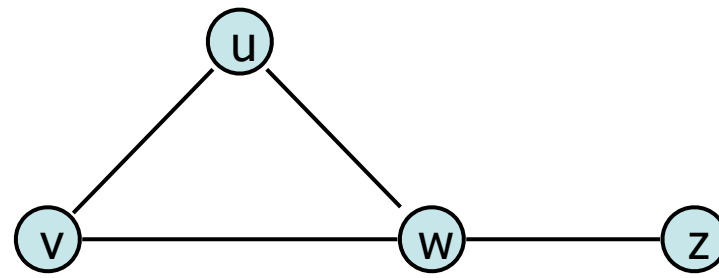
What's wrong with our implementation?

How can we fix it?

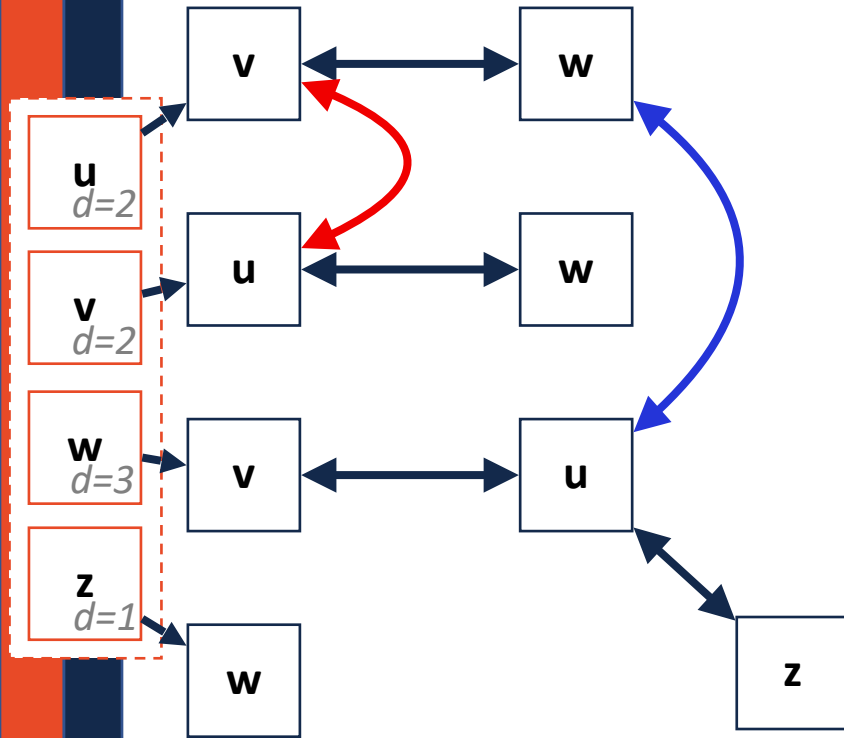
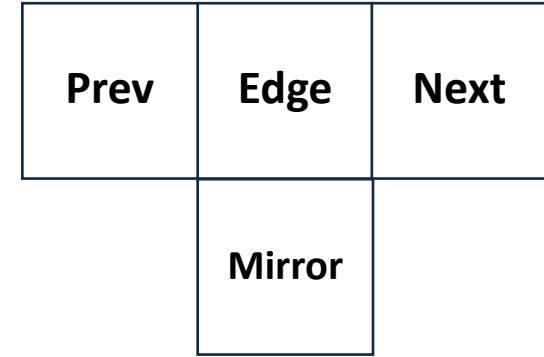


# Adjacency List

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

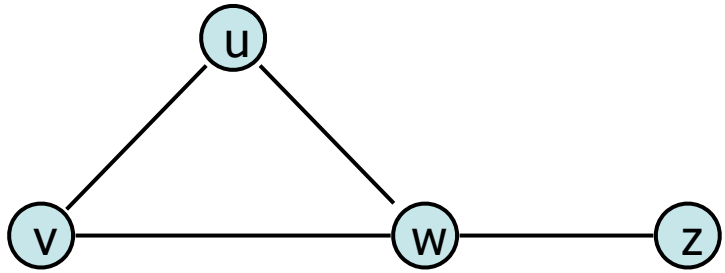


Adj List Node:

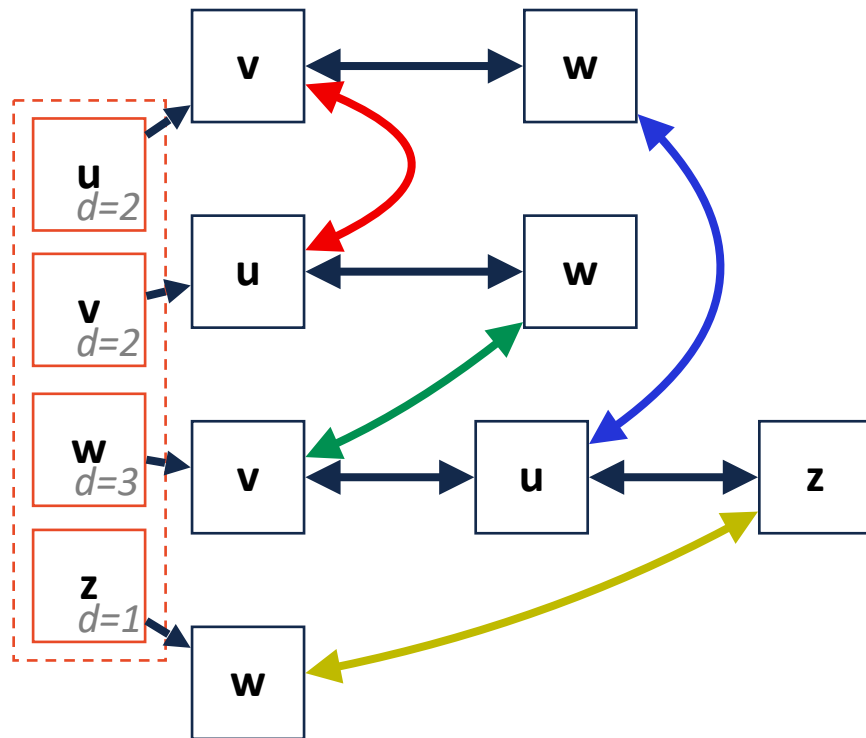


This is still a 'lie' but a more accurate one!

# Adjacency List

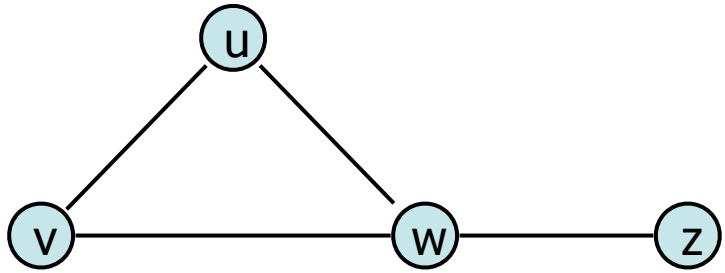


**insertVertex(v):**

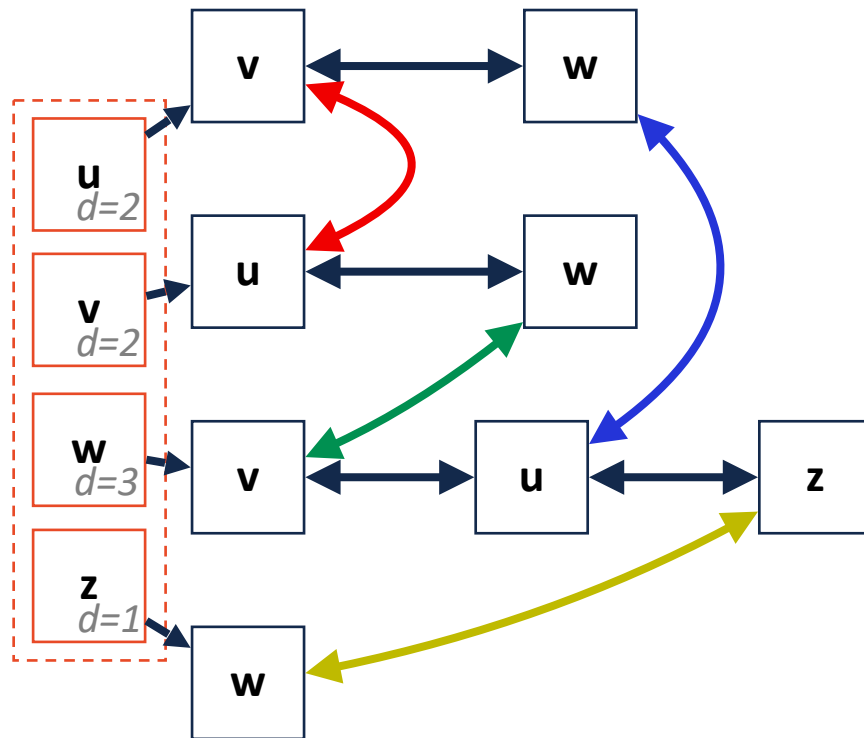




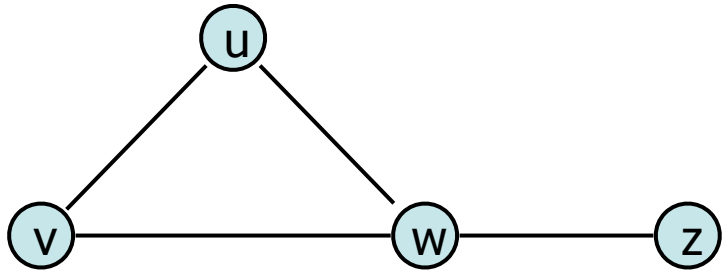
# Adjacency List



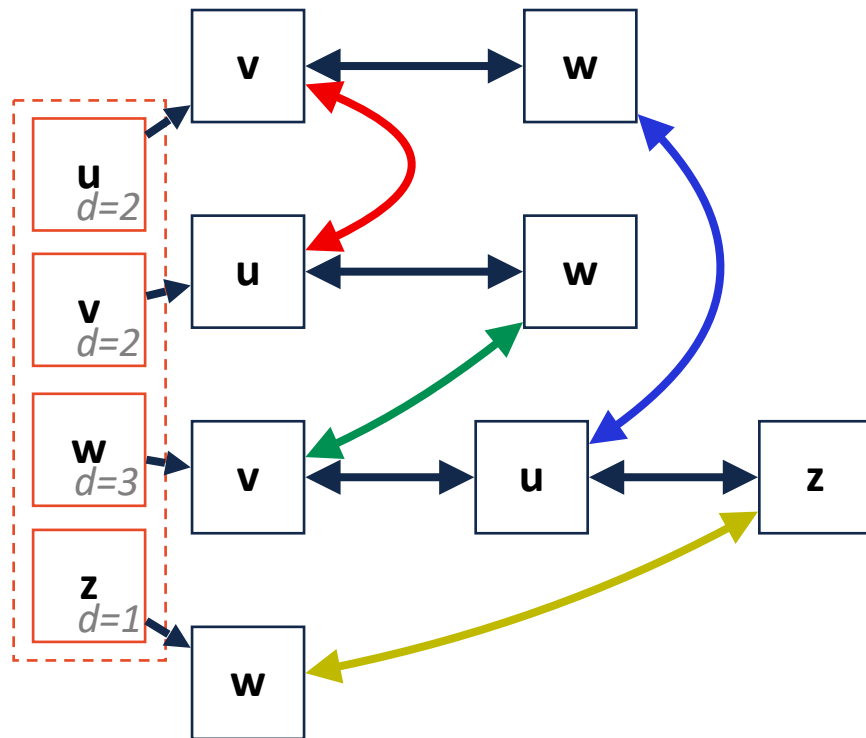
**insertEdge(u, v):**



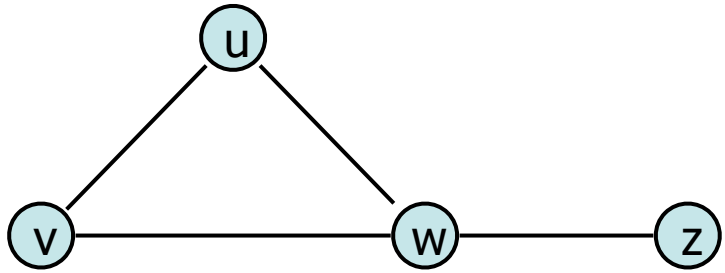
# Adjacency List



**removeEdge(u, v):**

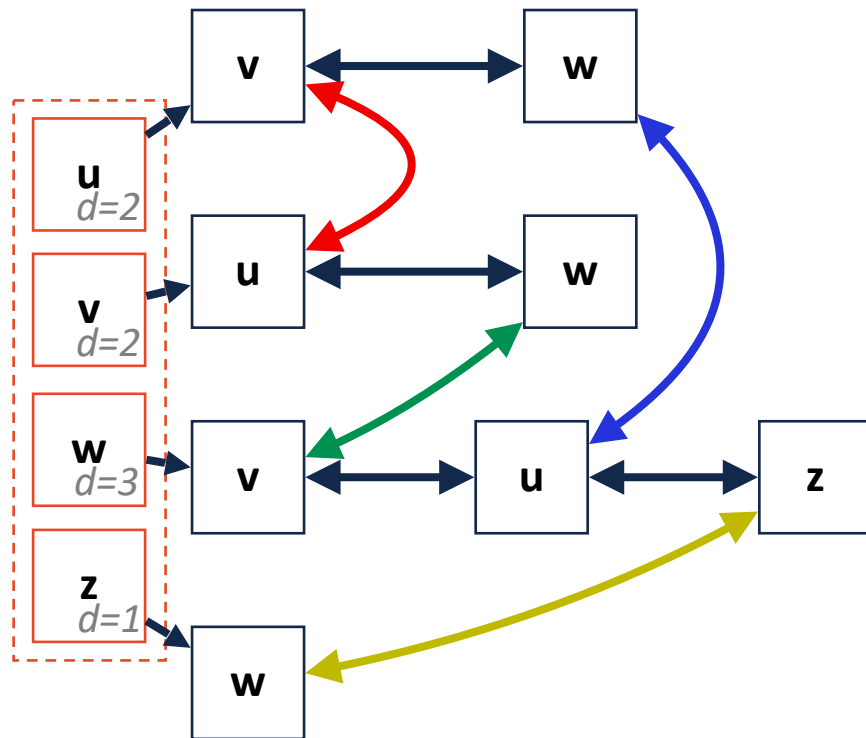


# Adjacency List



**Pros:**

**Cons:**



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


Expressed as O(f)	Edge List	Adjacency Matrix	Adjacency List
Space	$n+m$	$n^2$	
insertVertex(v)	$1^*$	$n^*$	
removeVertex(v)	$m^{**}$	$n^*$	
insertEdge(u, v)	$1$	$1$	
removeEdge(u, v)	$m$	$1$	
getEdges(v)	$m$	$n$	
areAdjacent(u, v)	$m$	$1$	

# Where do we go from here?

**Consider:** How does our implementation change for weights?  
for directed edges?

**Consider:** How can we implement traversal on graphs?

**Consider:** What are some common graph algorithms / uses?

# Graphs in Python: NetworkX Package

NetworkX uses concepts from all three implementation methods

A graph can be built from an edge list, adjacency matrix, or adjacency list

A graph can be saved or output as any of the three formats

Many algorithms (and traversals) are built-in.

# Creating a NetworkX graph

```
G = nx.Graph()
```

```
G = nx.Graph(edgeList)
```

```
G.add_node(label, **kwargs)
```

```
G.add_edge(v1, v2, **kwargs)
```

# NetworkX Example

```
1 import networkx as nx
2
3 G = nx.Graph()
4
5 G.add_edge("A", "B")
6
7 G.add_edge("B", "C", weight=5)
8
9 G.add_edge("A", "C", anything="Bob", I="was", want="here")
10
11
12 print(G.nodes())
13
14
15 print(G.edges())
16
17
18 print(G.edges(data=True))
19
20
21
22
```



# NetworkX Example

```
1 import networkx as nx
2
3 G = nx.Graph()
4
5 G.add_node("A")
6
7 G.add_node("B", name="Bob")
8
9 G.add_node("C", anything="Bob", I="was", want="here")
10
11 print(G.nodes())
12
13 print(G.nodes(data=True))
14
15
16
17
18
19
20
21
22
```

# NetworkX Example

```
1 G=nx.random_regular_graph(3, 6)
2
3 nx.draw(G, edge_color='k', width=2, with_labels=True)
4
5 plt.show()
6
7 m = nx.adjacency_matrix(G)
8 print(m.todense())
9
10
11
12
13
14
15 adjL = nx.generate_adjlist(G)
16 for line in adjL:
17     print(line)
18
19
20
21
22
```

# Graphs in Python: NetworkX Package

Networkx (and Python packages in general) can do a lot for you!

But they can sometimes make design decisions that don't work for you.

**Ex:** An adjacency list in NetworkX doesn't duplicate edges!