

Data Structures & Algorithms

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Recap

- Priority Queue
- Binary Heap
- Heapsort
- Mergesort

Objectives

- Graphs
- Graph ADT (What is it and why we need it)
- Graph Representations (Ways to represent graphs)

Graphs

Graphs

- One of the most versatile structures used in computer programming
- *Why do we need graphs, when we already have data structures like trees and hash tables?*

Graphs

- One of the most versatile structures used in computer programming
- *Why do we need graphs, when we already have data structures like trees and hash tables?*
 - ❖ For general kinds of data storage problems, we don't need graphs
 - ❖ But for some problems, **graphs are indispensable**

Graphs

- Architectures of the previous data structures are dictated by the algorithm used on them
 - ❖ **For example**, a binary search tree is shaped the way it is because *it is easy to search and insert data*

Graphs

- Architectures of the previous data structures are dictated by the algorithm used on them
 - ❖ For example, a binary search tree is shaped the way it is because it is easy to search and insert data
- Graphs often have a shape dictated by a physical problem

Graphs

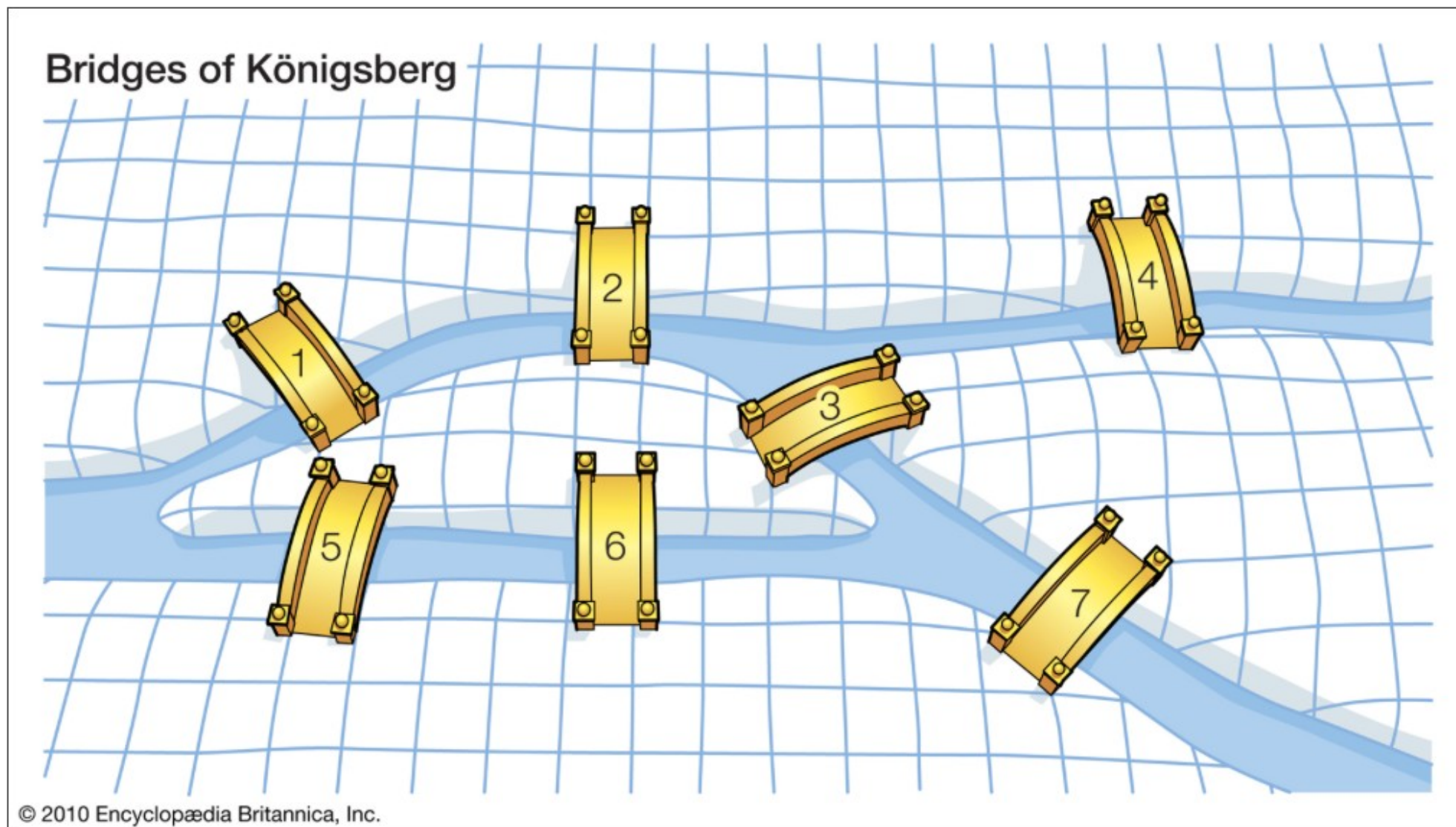
- For example
 - **Road networks**
 - **Internet**
 - **Molecules in chemistry**
 - **Social networks**
 - **Individual tasks necessary to complete a project**
- In all these cases, the shape of a graph arises from the specific real-world situation

Graphs

- The key to resolving problems related to such real-world situations is to think of them in terms of graphs
- Modeling a real-world problem correctly in terms of graphs enables us to take advantage of existing graph algorithms

Graphs

- Historical Note



In the 18th century, the Swiss mathematician Leonhard Euler was intrigued by the question of whether a route existed that would traverse each of the seven bridges exactly once. In demonstrating that the answer is no, he laid the foundation for graph theory.

Encyclopædia Britannica, Inc.

First Some Basic Definitions!

UnOrdered Pair

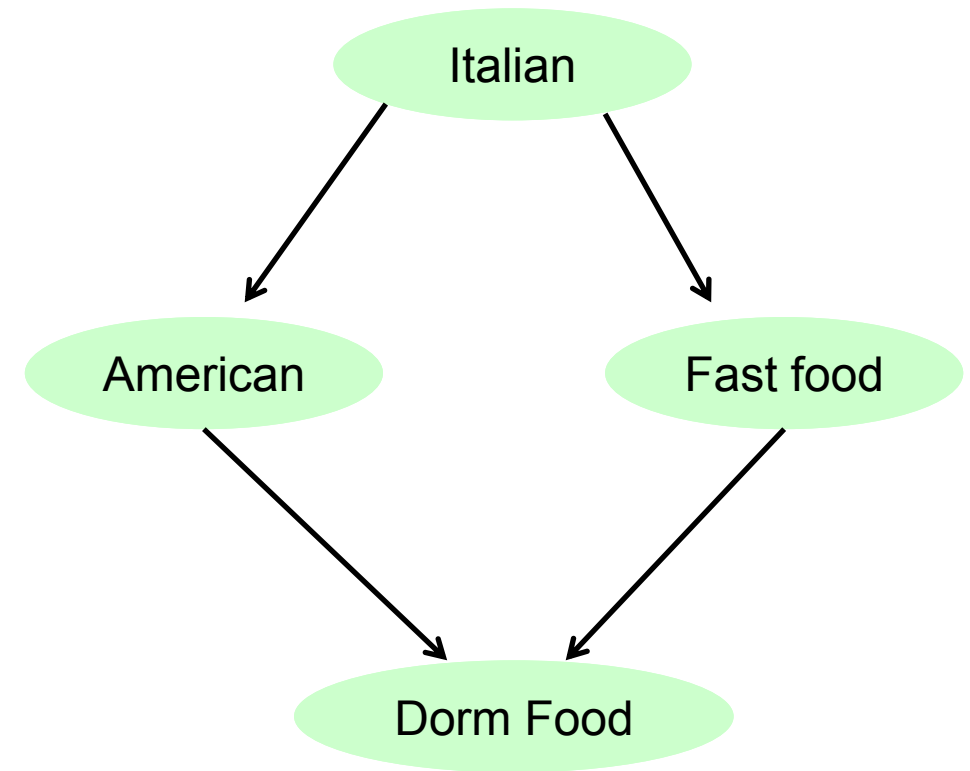
- An unordered pair is a set $\{a, b\}$ representing the two objects a and b

Friendship b/w Alice and Bob $\{Alice, Bob\}$

- Remember $\{a\}$ is also an unordered pair
- Useful if we want to pair objects such that none of them is “first” or “second”

Ordered Pair

- Collection of two objects **a** and **b** in order
- (a, b)
- For example, a graph where each node represents a food



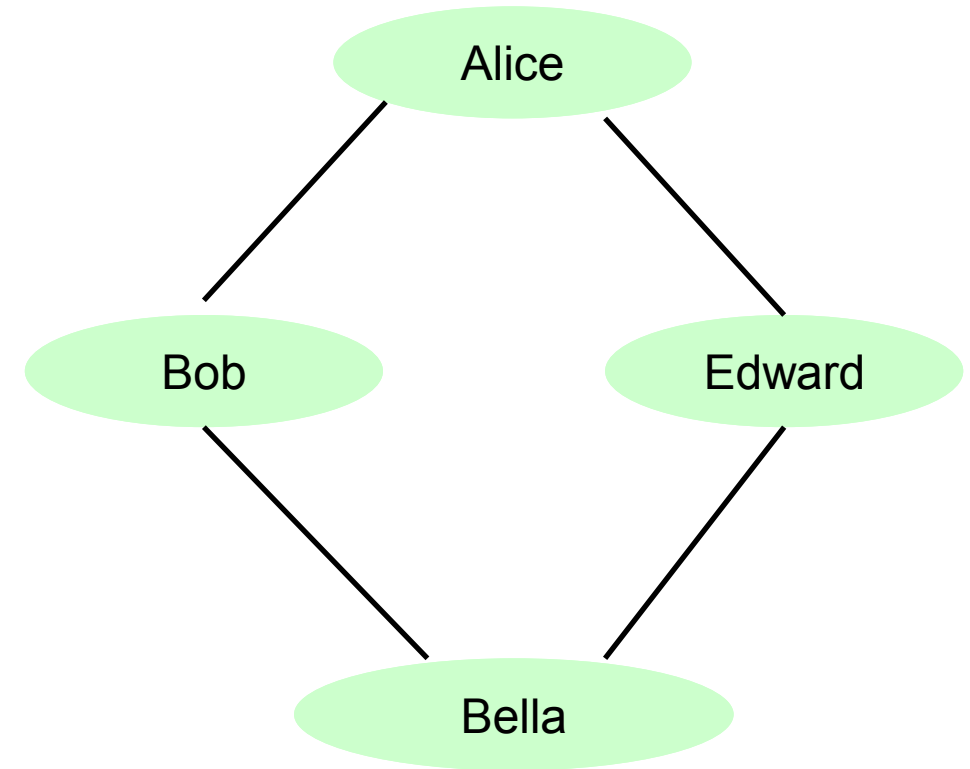
Two ordered pairs (a_0, b_0) and (a_1, b_1) are equal iff $a_0=a_1$ and $b_0=b_1$

Graphs

- A graph is defined as $G = (V, E)$ where
 V is a set of vertices, and
 E is a set of vertex pairs or edges
- **Vertex:** node in a graph
- **Edge:** a pair of vertices representing a connection between two nodes in a graph

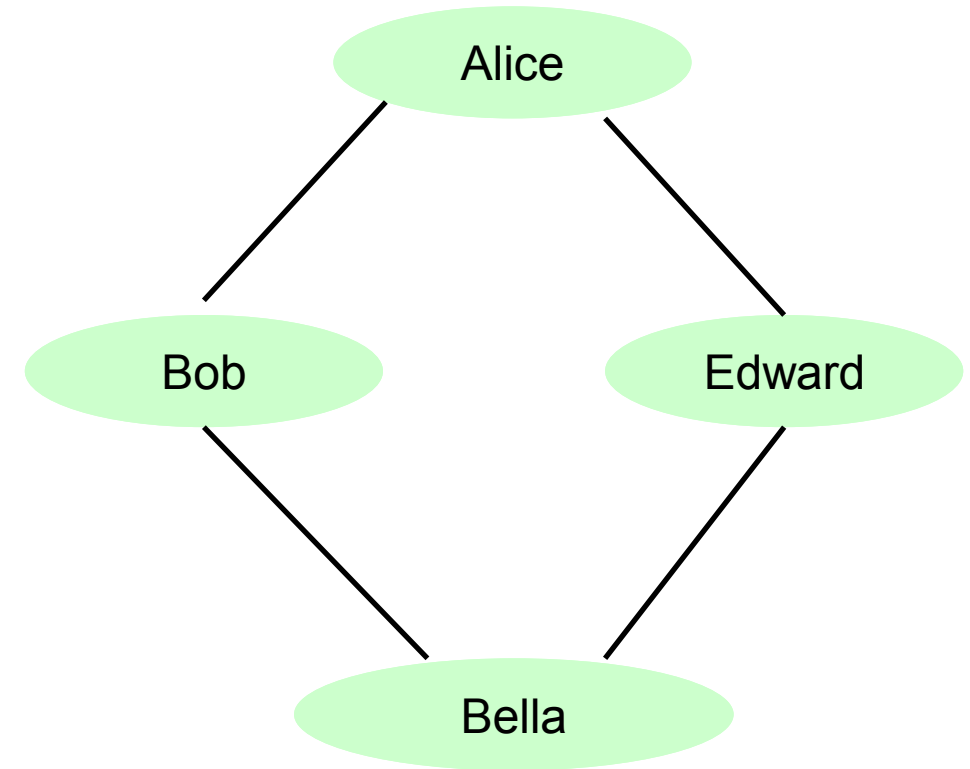
Undirected Graphs

- A graph $G = (V, E)$, where
- V is a set of vertices
- E is a set of unordered pairs



Undirected Graphs

- A graph $G = (V, E)$, where
- V is a set of vertices
- E is a set of unordered pairs



- $V = \{ \text{Alice, Bob, Edward, Bella} \}$
- $E = \{ \{ \text{Alice, Bob} \}, \{ \text{Alice, Edward} \}, \{ \text{Bob, Bella} \}, \{ \text{Edward, Bella} \} \}$

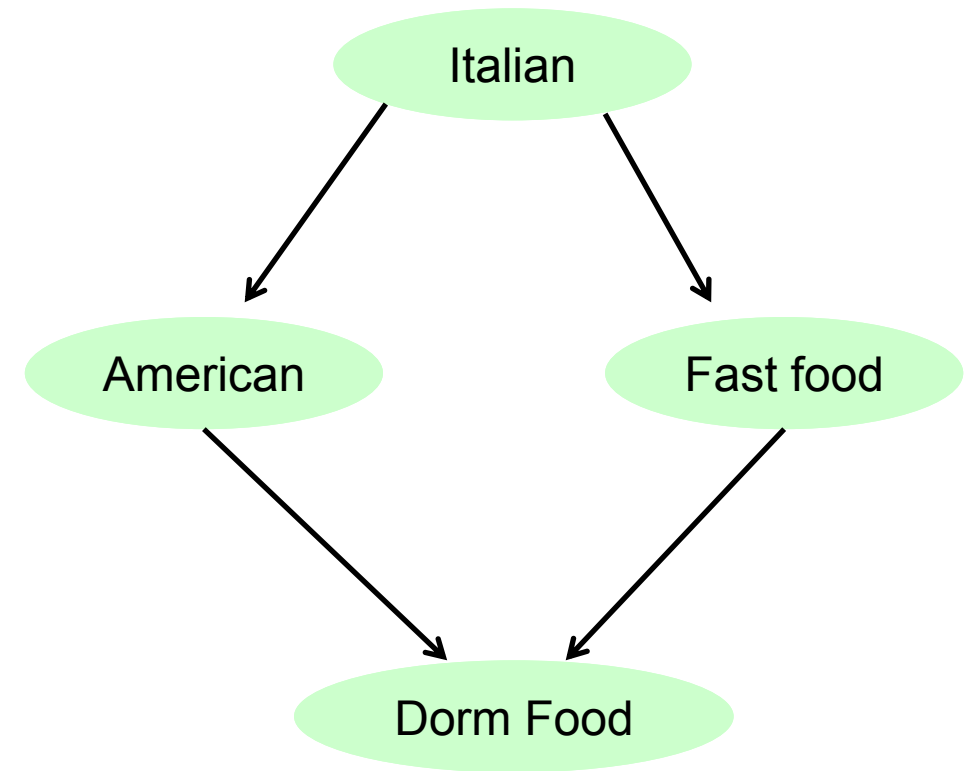
Directed Graphs

- A graph $G = (V, E)$, where

- V is a set of vertices

- E is a set of ordered pairs

- $V = \{ \text{Italian, American, Fast food, Dormfood} \}$



- $E = \{ (\text{Italian, American}), (\text{Italian, Fast Food}), (\text{American, Dorm Food}), (\text{Fast Food, Dorm Food}) \}$



- **Adjacent vertices:** two vertices in a graph that are connected by an edge – **Kazan and Moscow**



- **Path:** a sequence of vertices that connects two vertices – (Kazan, Moscow, Saint Petersburg)



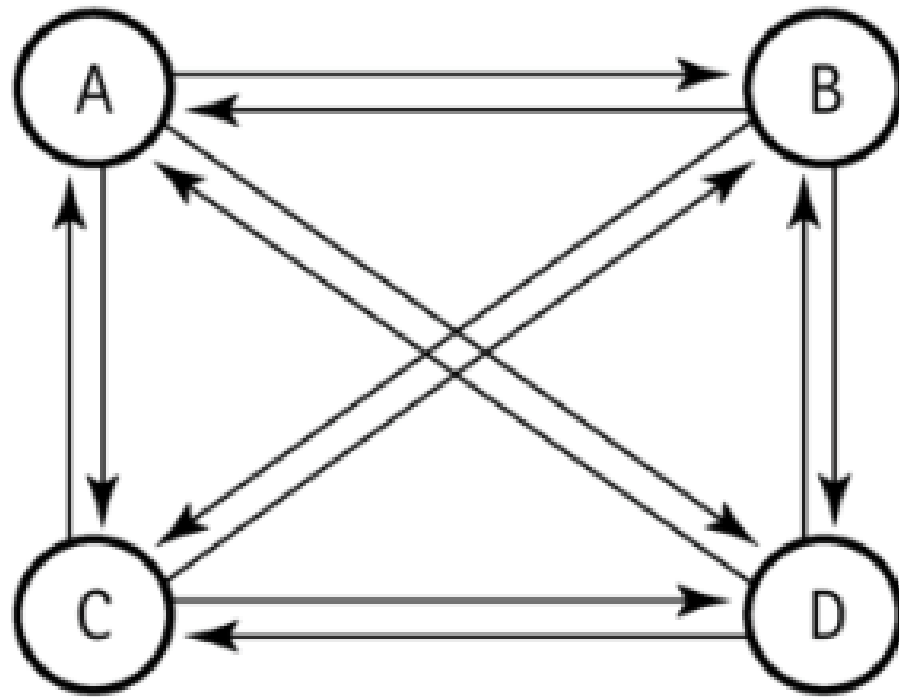
- **Simple Path:** A path with no repeated vertices— For example (Moscow, Kazan, Uman, Ekaterinburg) is a simple path



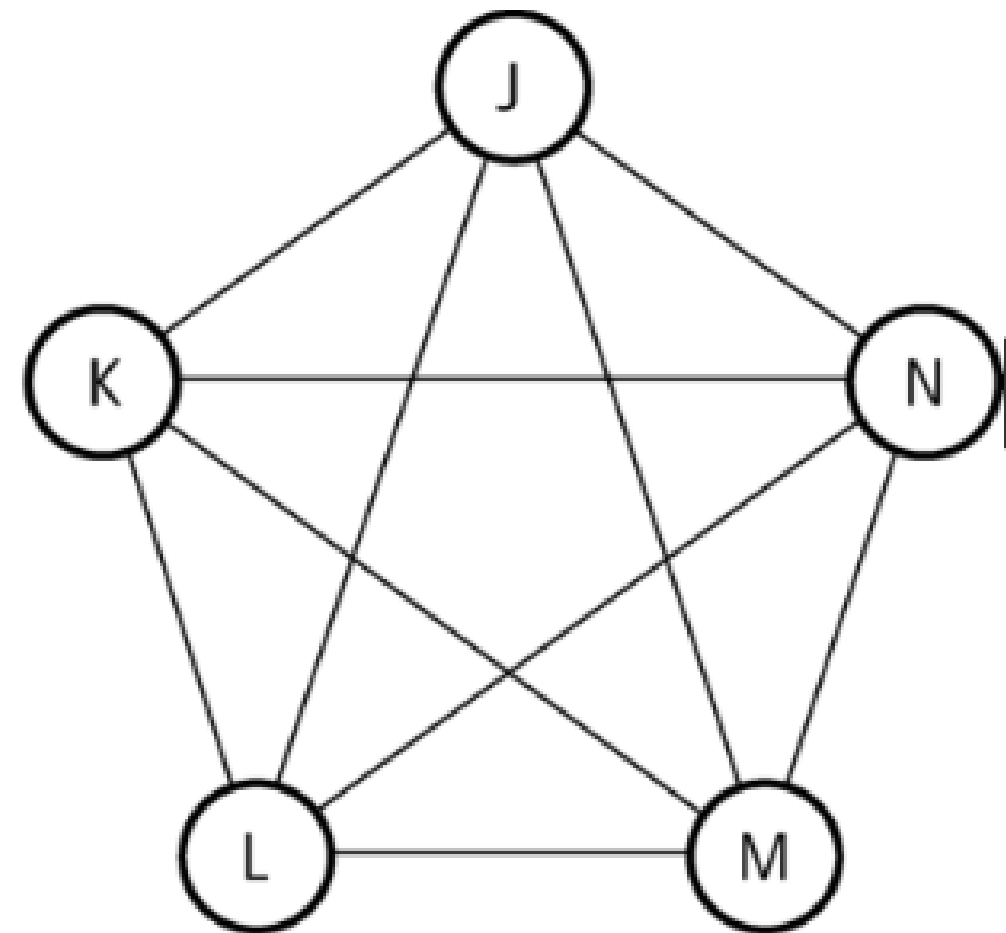
- **Cycle:** A path that starts and ends at the same vertex— (Kazan, Ekaterinburg, Kirov, Jaroslavi, Moscow, Kazan)



- **Simple Cycle:** A cycle that does not contain duplicate vertices – For example (Kazan, Ekaterinburg, Kirov, Ekaterinburg, Kazan) is **not** a simple cycle

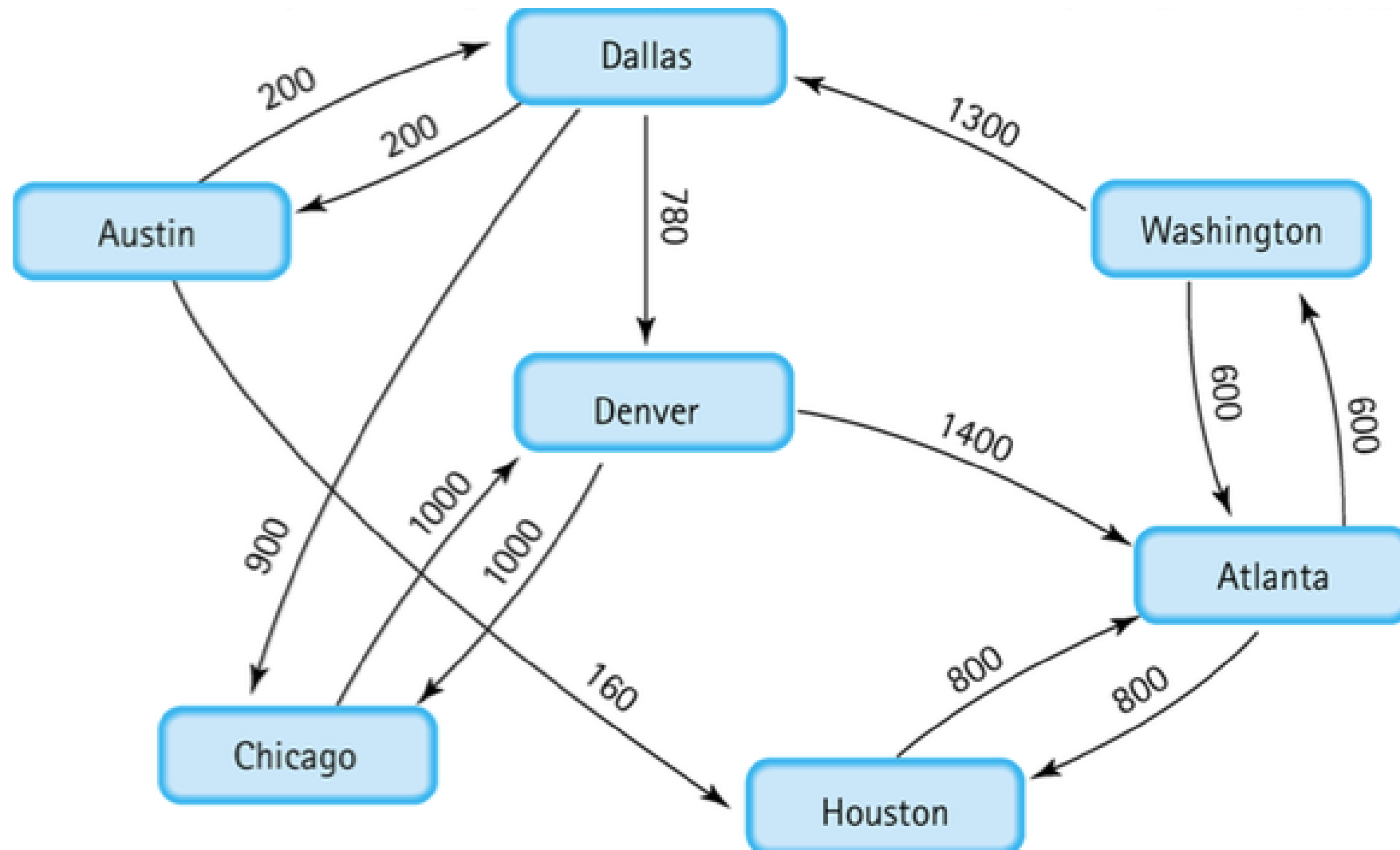


A complete directed graph G



A complete undirected graph G

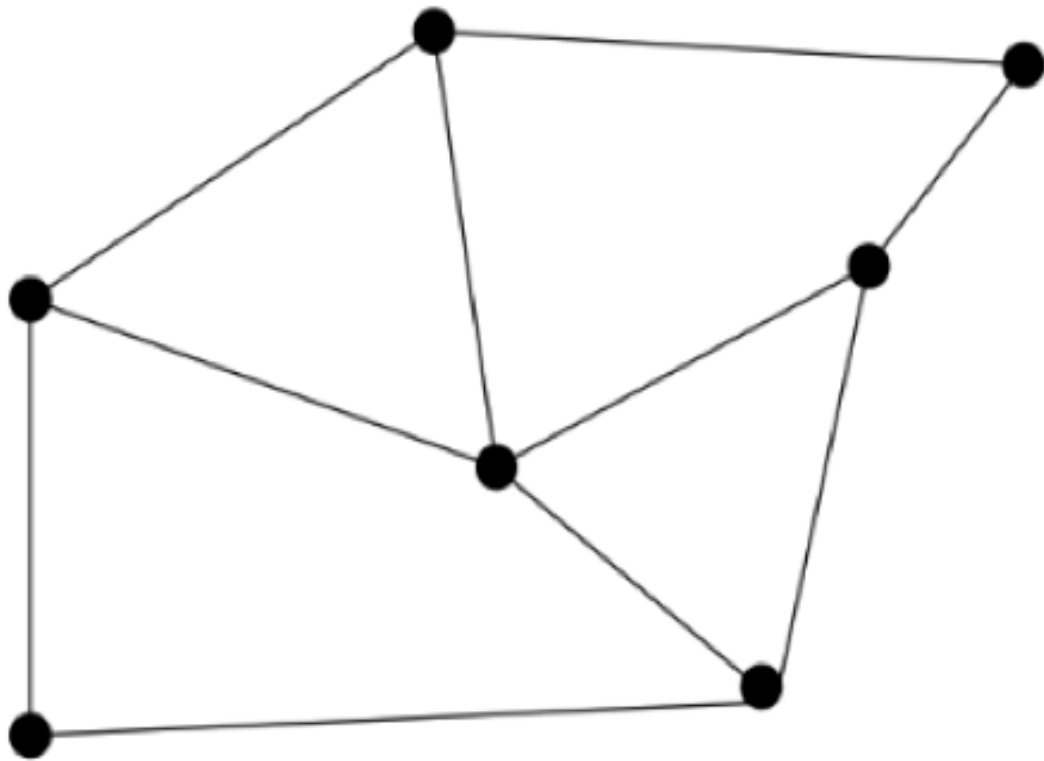
- **Complete:** A graph in which every vertex is directly connected to every other vertex



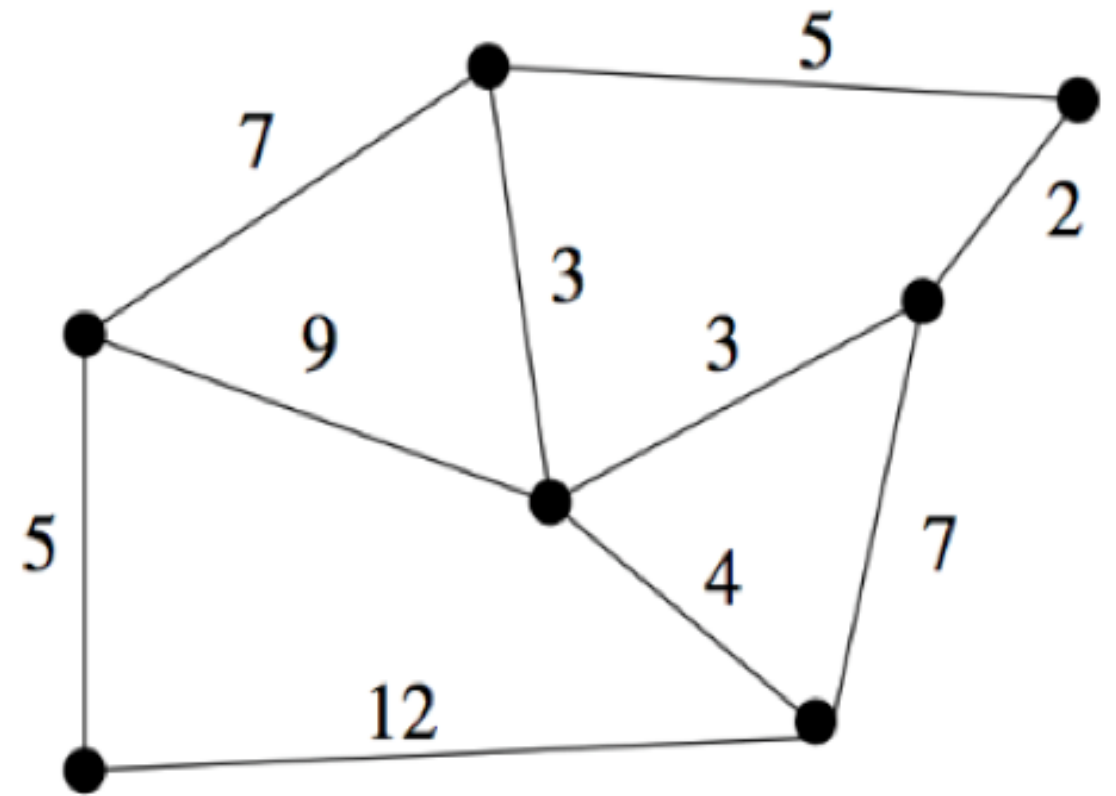
A weighted graph G

- **Weighted graph:** a graph in which each edge carries a value (weight)

Shortest Path



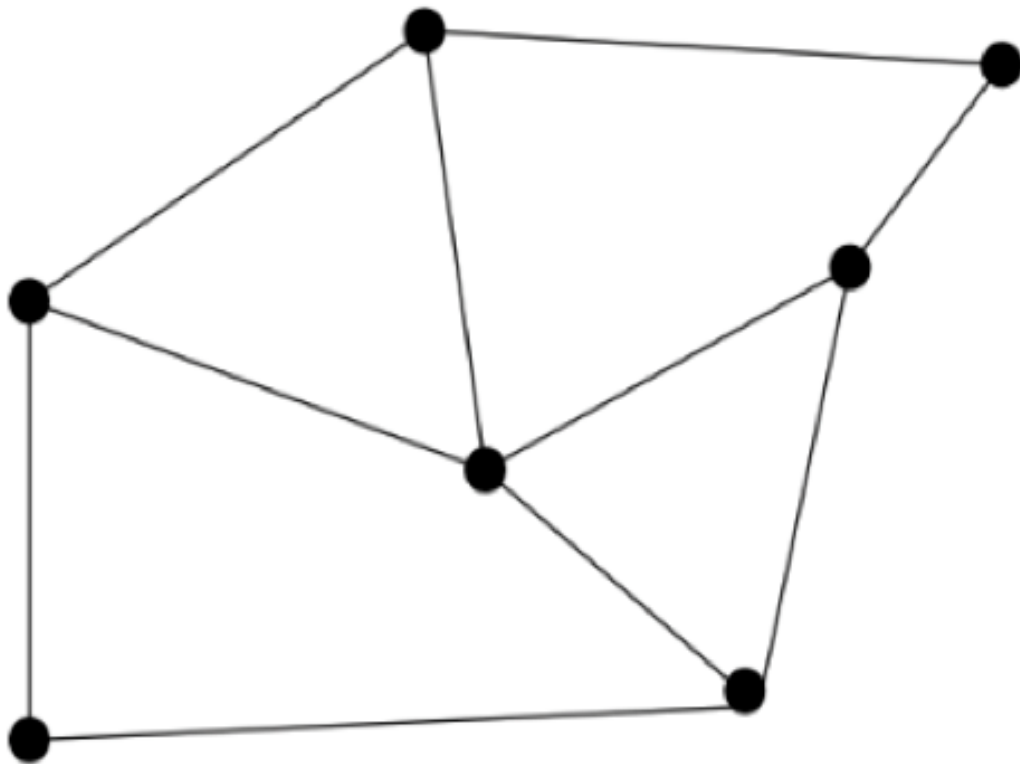
unweighted



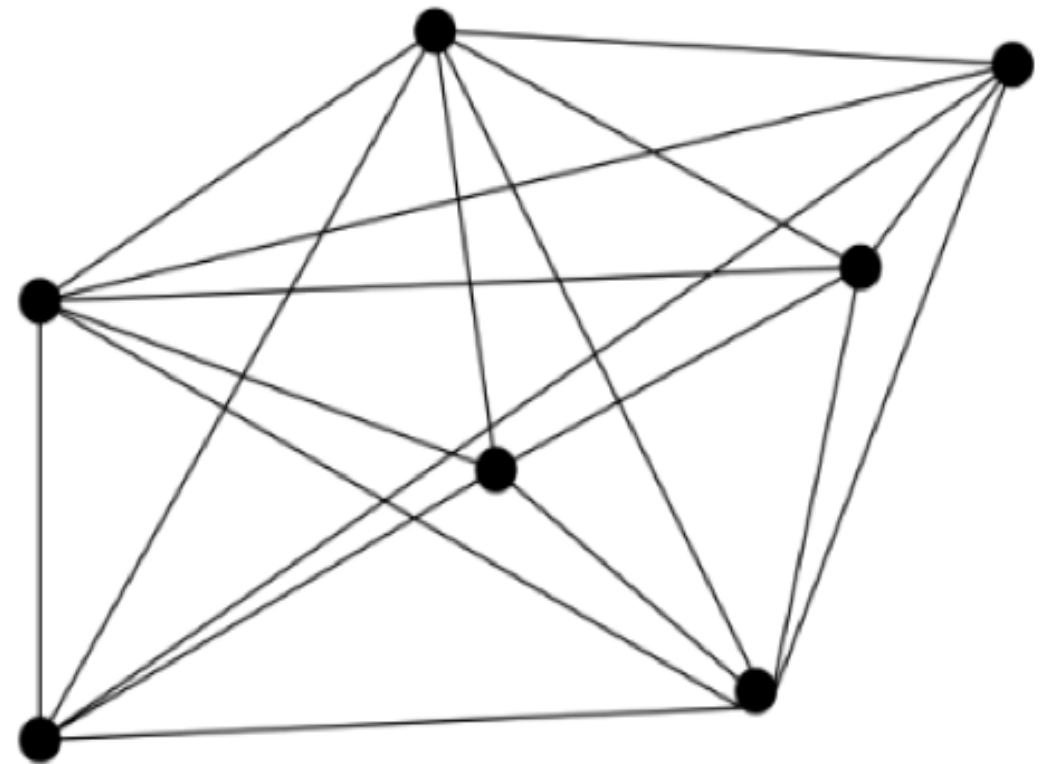
weighted

- For unweighted graphs, it's a path with the fewest number of edges – can be found using BFS or DFS
- For weighted graphs, more sophisticated algorithms are required

Sparse vs. Dense



sparse



dense

- There are maximum $n(n-1)/2$ total pair of vertices (edges) in an undirected graph of n vertices, with no self loops and no multiple edges

Graphs

- You are expected to know more about graphs, their properties, theorems and proofs associated with those properties in your “Discrete Math” course
- For this course, we will focus on how to implement them as an abstract data type

Main Methods of the Graph ADT

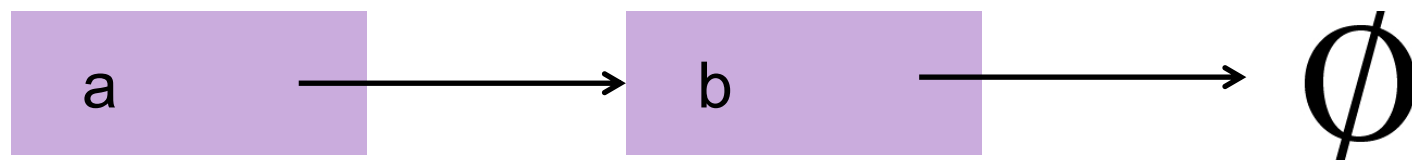
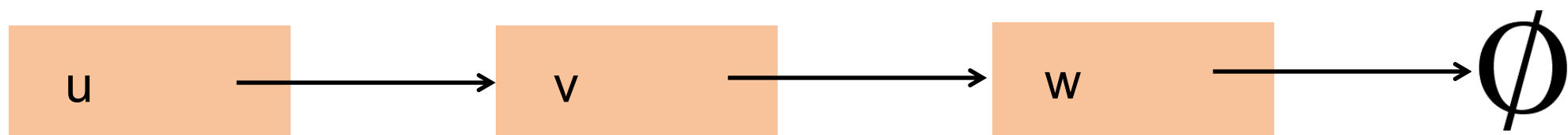
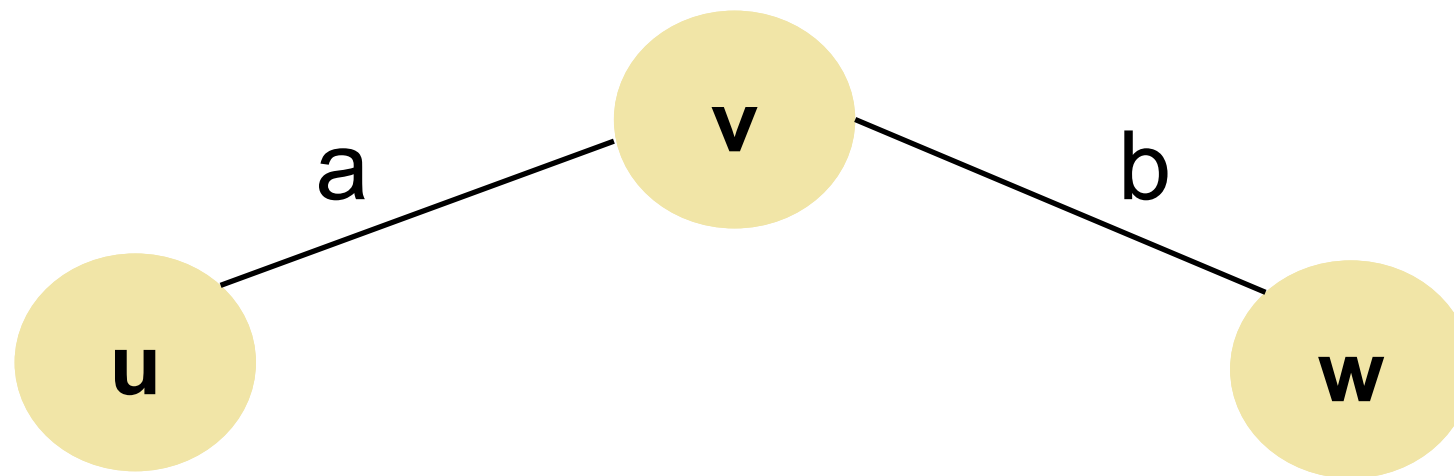
- `endVertices(e)`: an array of the two endvertices of e
- `opposite(v, e)`: the vertex opposite of v on e
- `areAdjacent(v, w)`: true iff v and w are adjacent
- `degree(v)`: # of incident edges
- `insertVertex(o)`: insert a vertex storing element o
- `insertEdge(v, w, o)`: insert an edge (v, w) storing element o
- `removeVertex(v)`: remove vertex v (and its incident edges)
- `removeEdge(e)`: remove edge e
- `incidentEdges(v)`: edges incident to v

Graph Representations

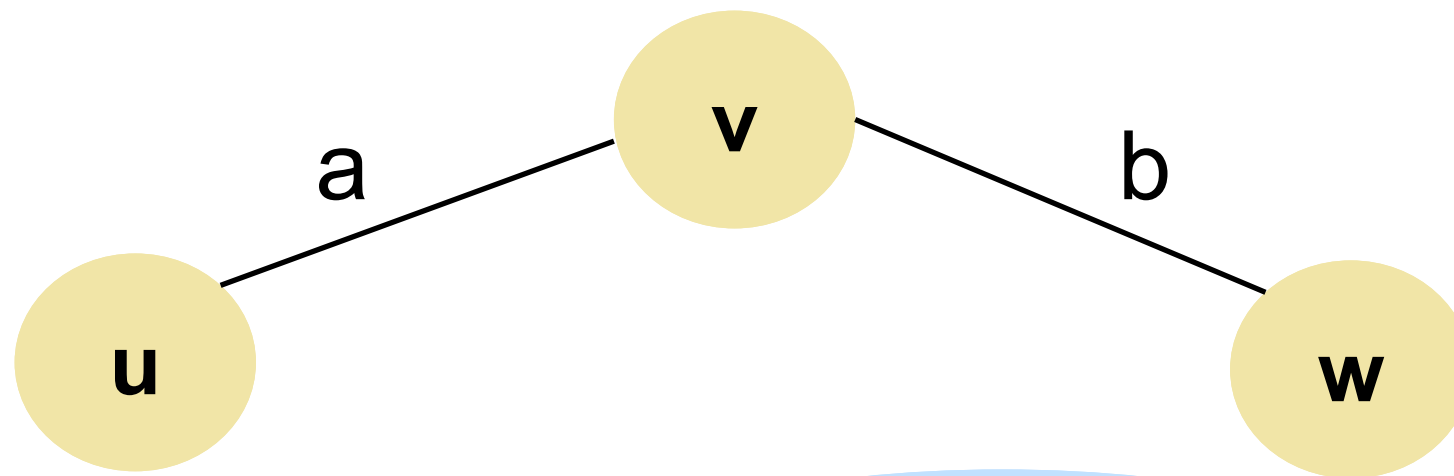
Using Linked List

- As we know $G = (V, E)$
- Let's use singly linked lists to store vertices and edges
 - **Vertex List:** stores vertices
 - **Edge List:** s
- Referred to as the *Edge List Structure*

Edge List Structure



Edge List Structure



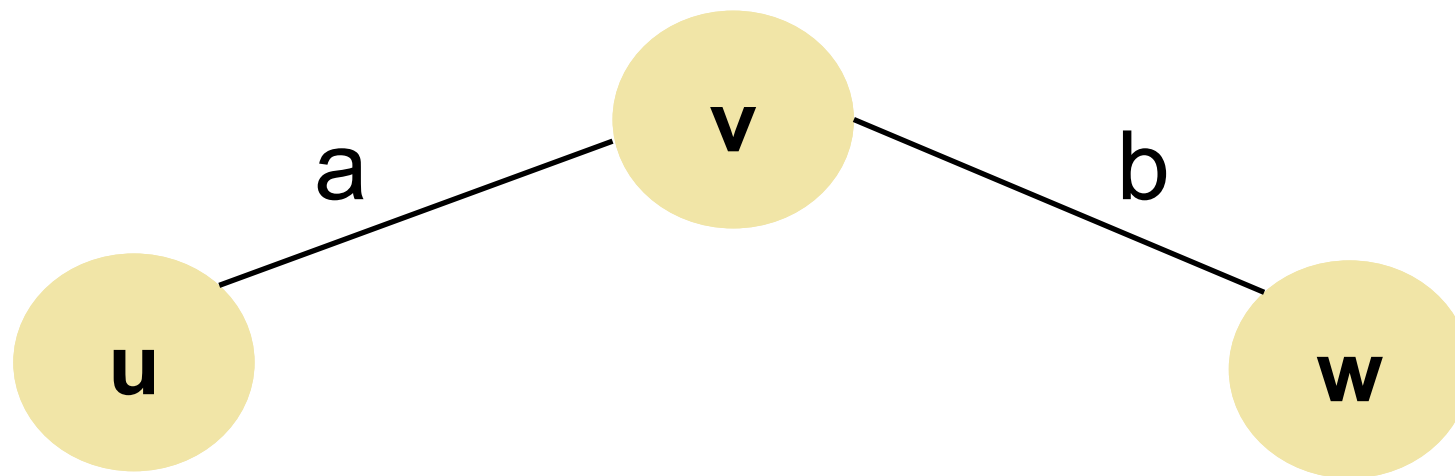
u

a

Let's analyze this structure!

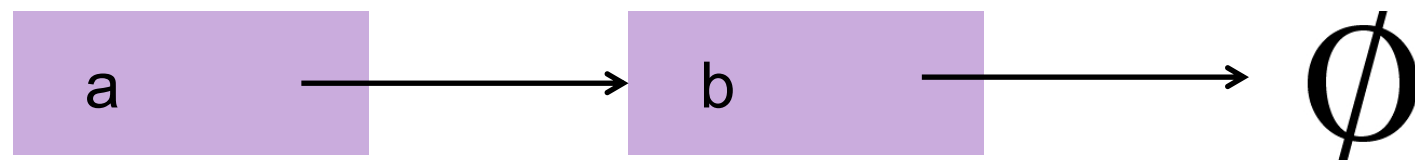
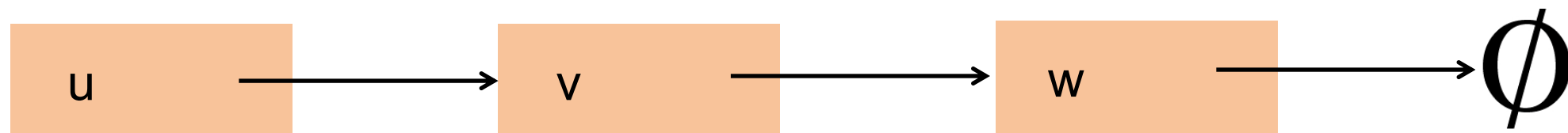
→ \emptyset

Edge List Structure

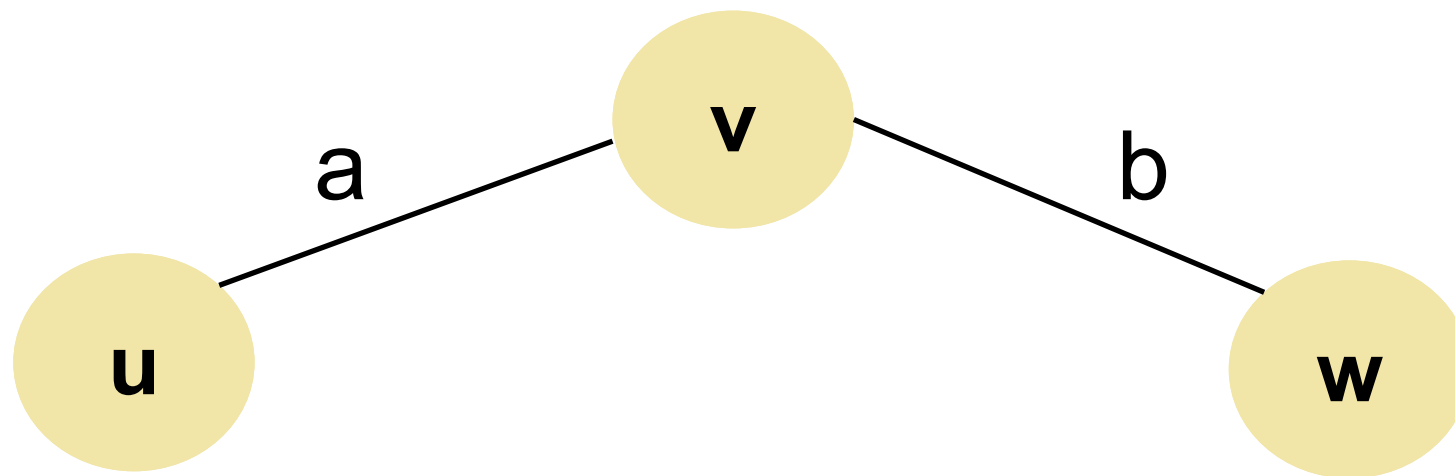


Insertion of a new
vertex

$O(1)$

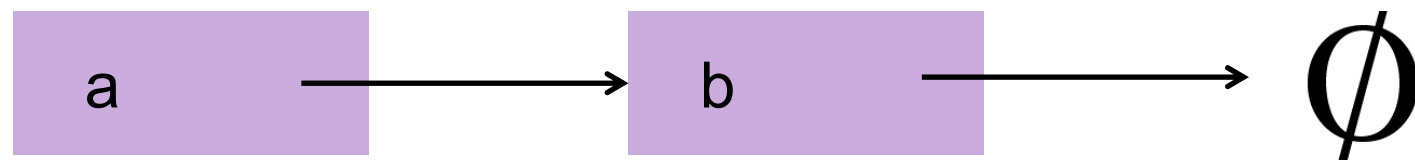
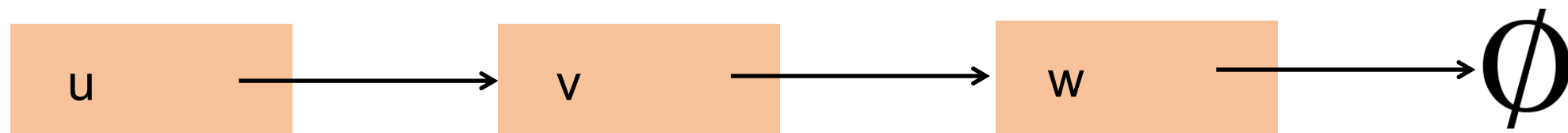


Edge List Structure

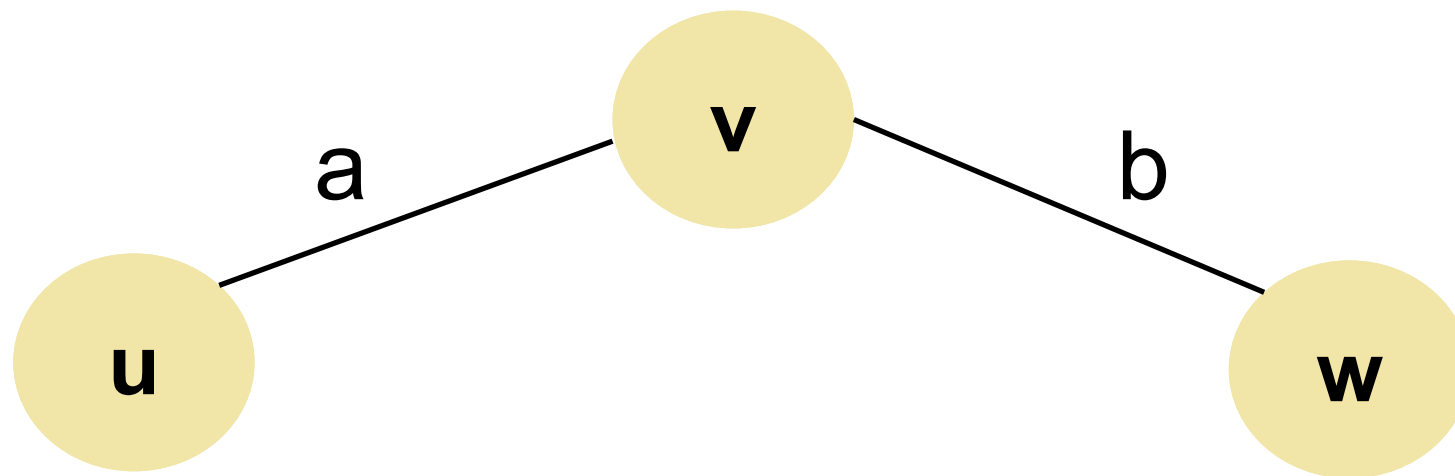


Insertion of a new
edge

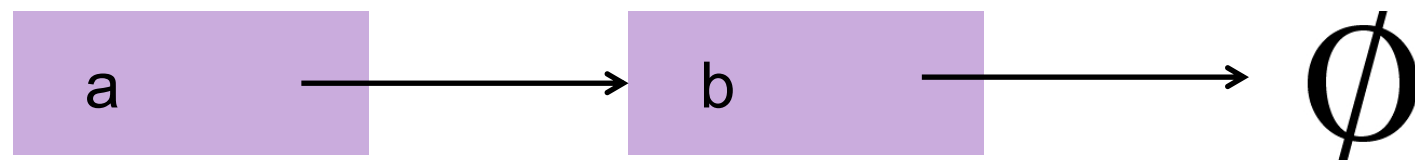
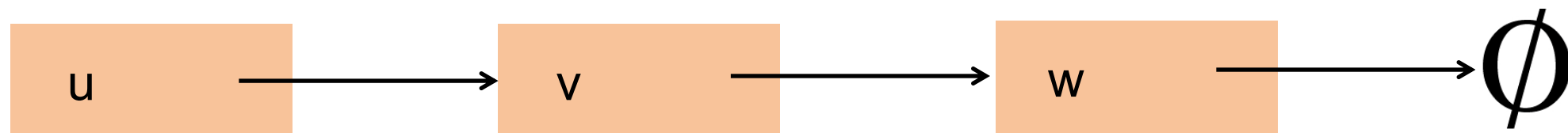
$O(1)$



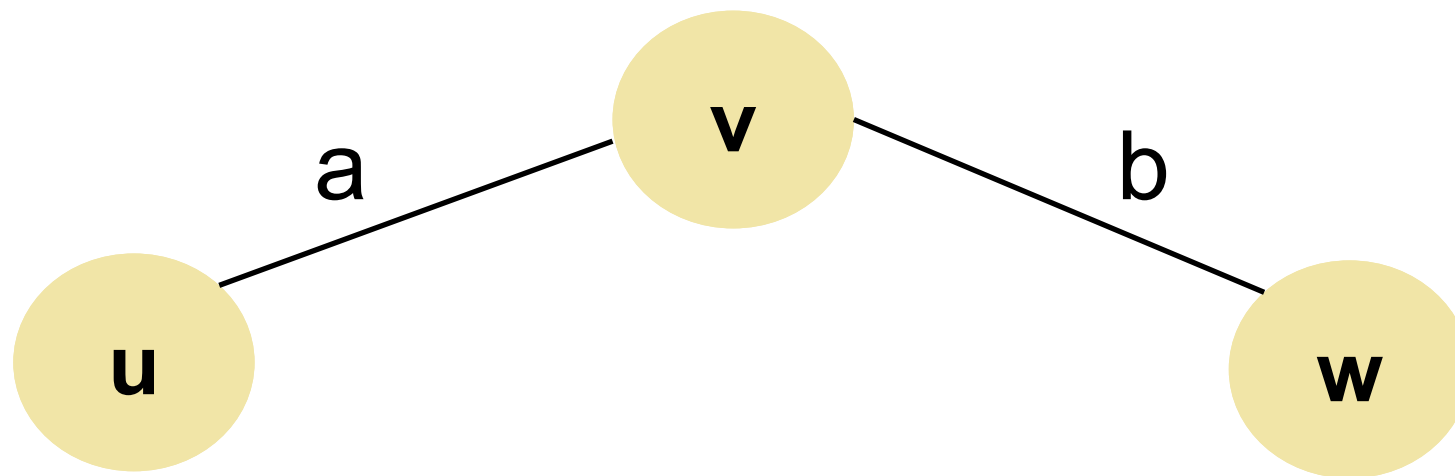
Edge List Structure



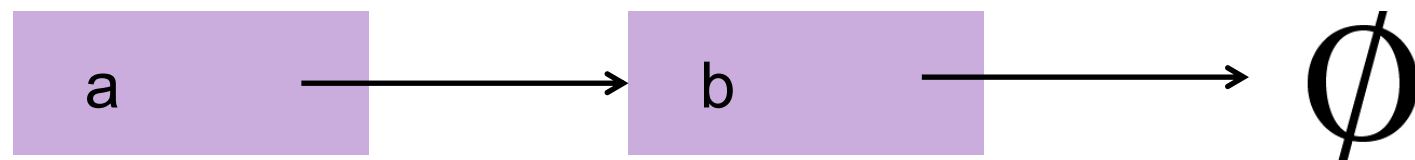
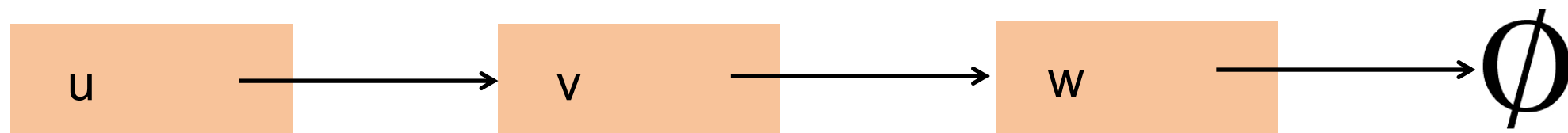
But can you find
whether two
vertices are
adjacent?



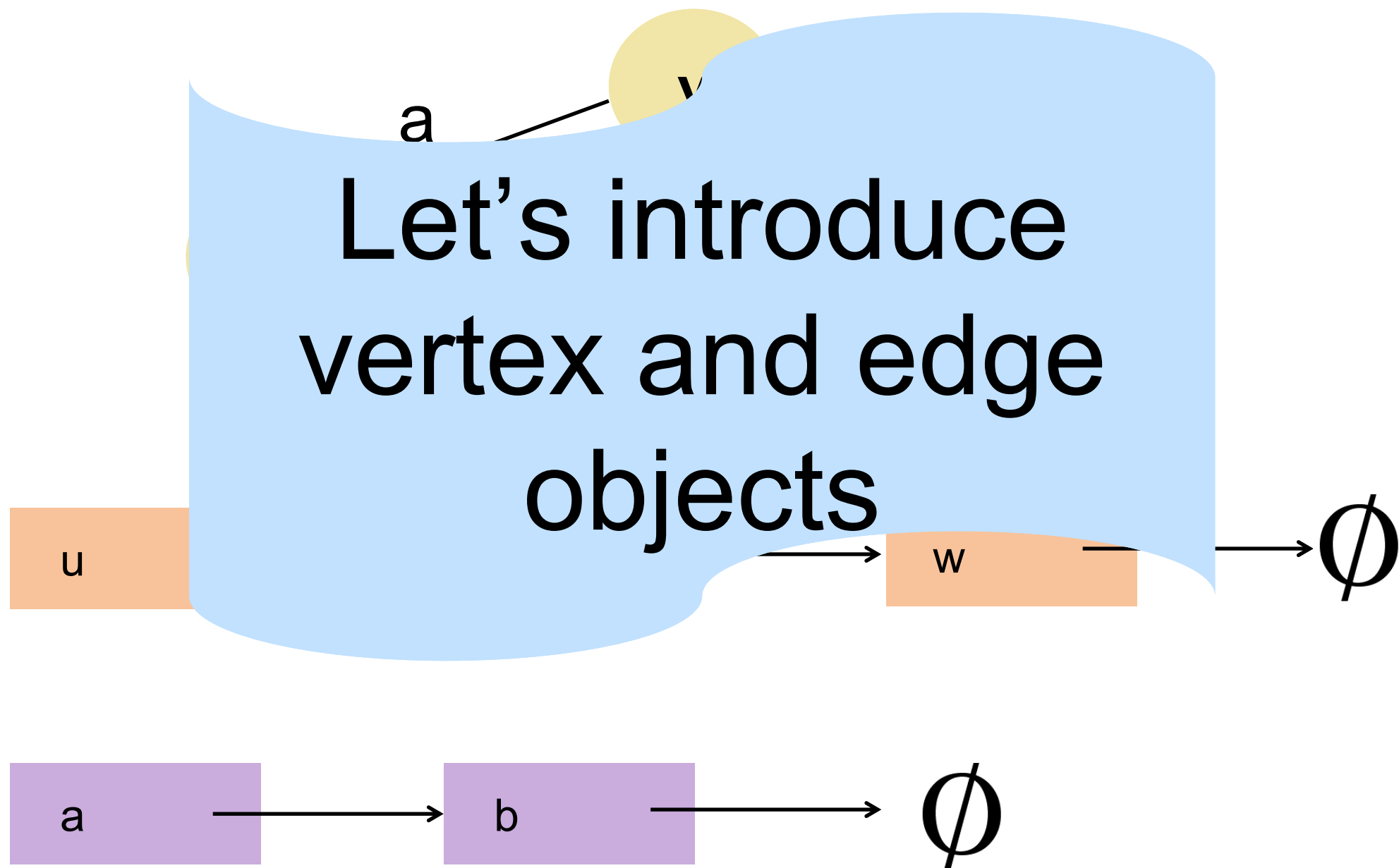
Edge List Structure



Identify some more problems!



Edge List Structure

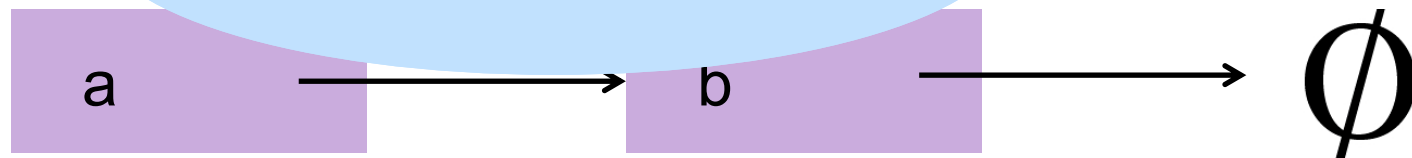


Edge List Structure

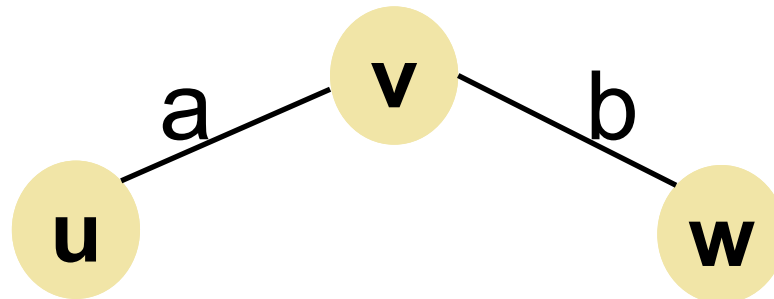
Vertex object stores **element**!

Edge Object stores **element, origin, and destination**

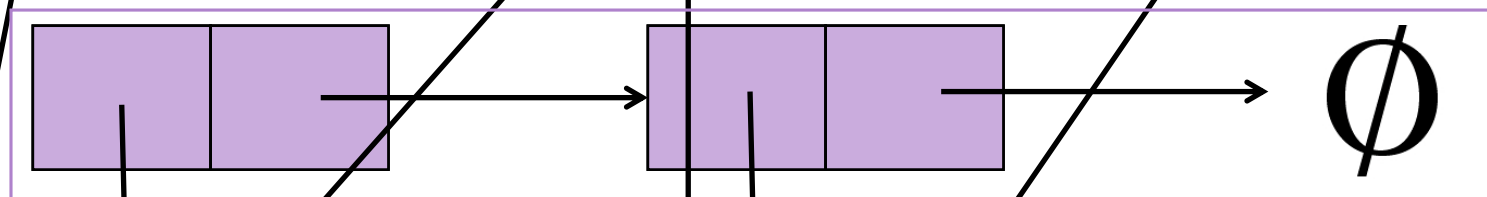
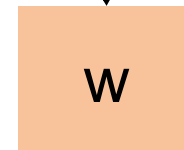
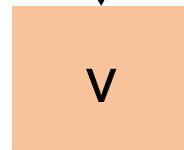
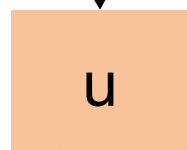
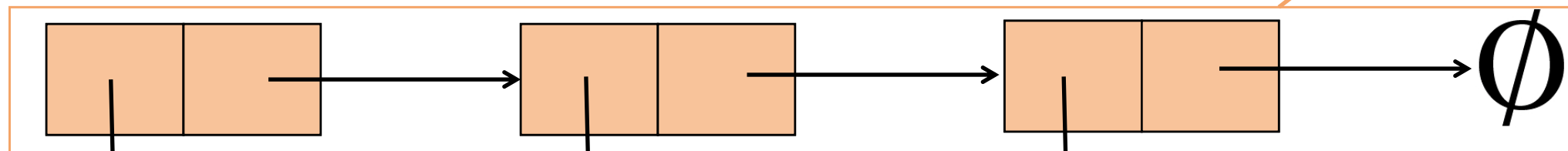
Both Vertex and Edge lists store **pointers to these objects**



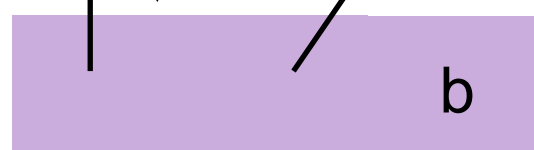
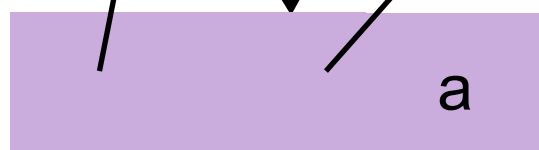
Edge List Structure



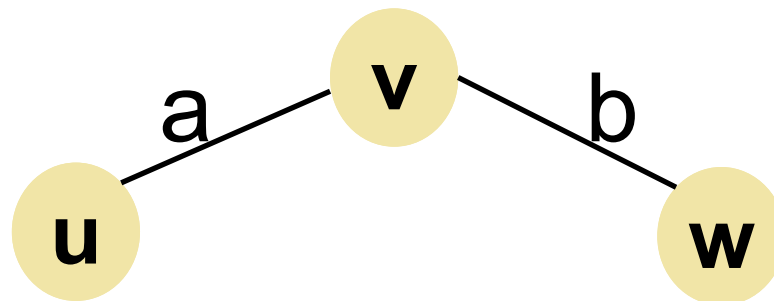
Vertex List



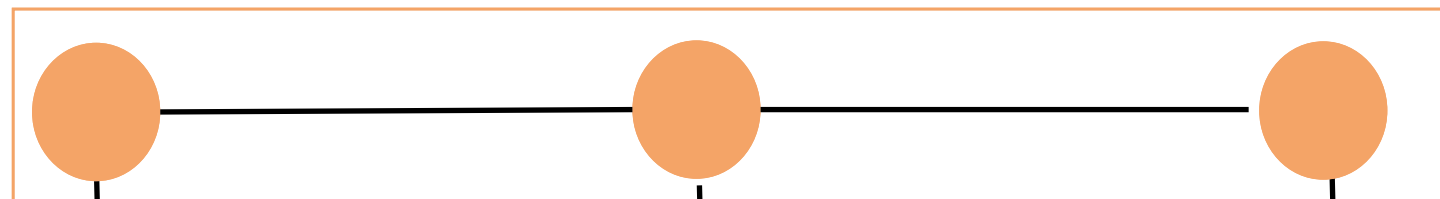
Edge List



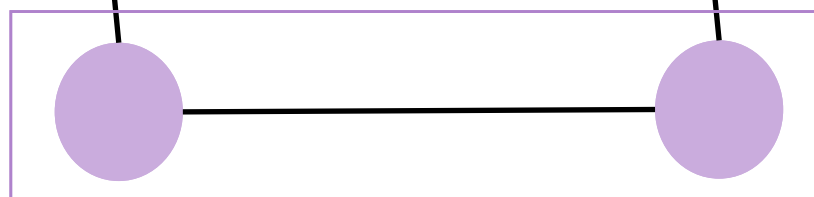
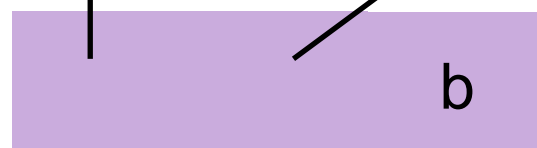
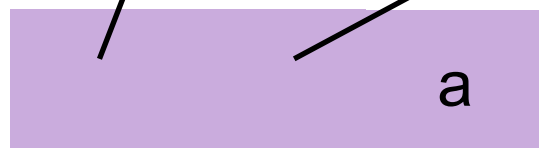
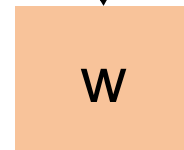
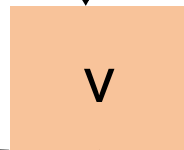
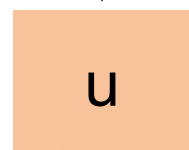
Edge List Structure



Simplified

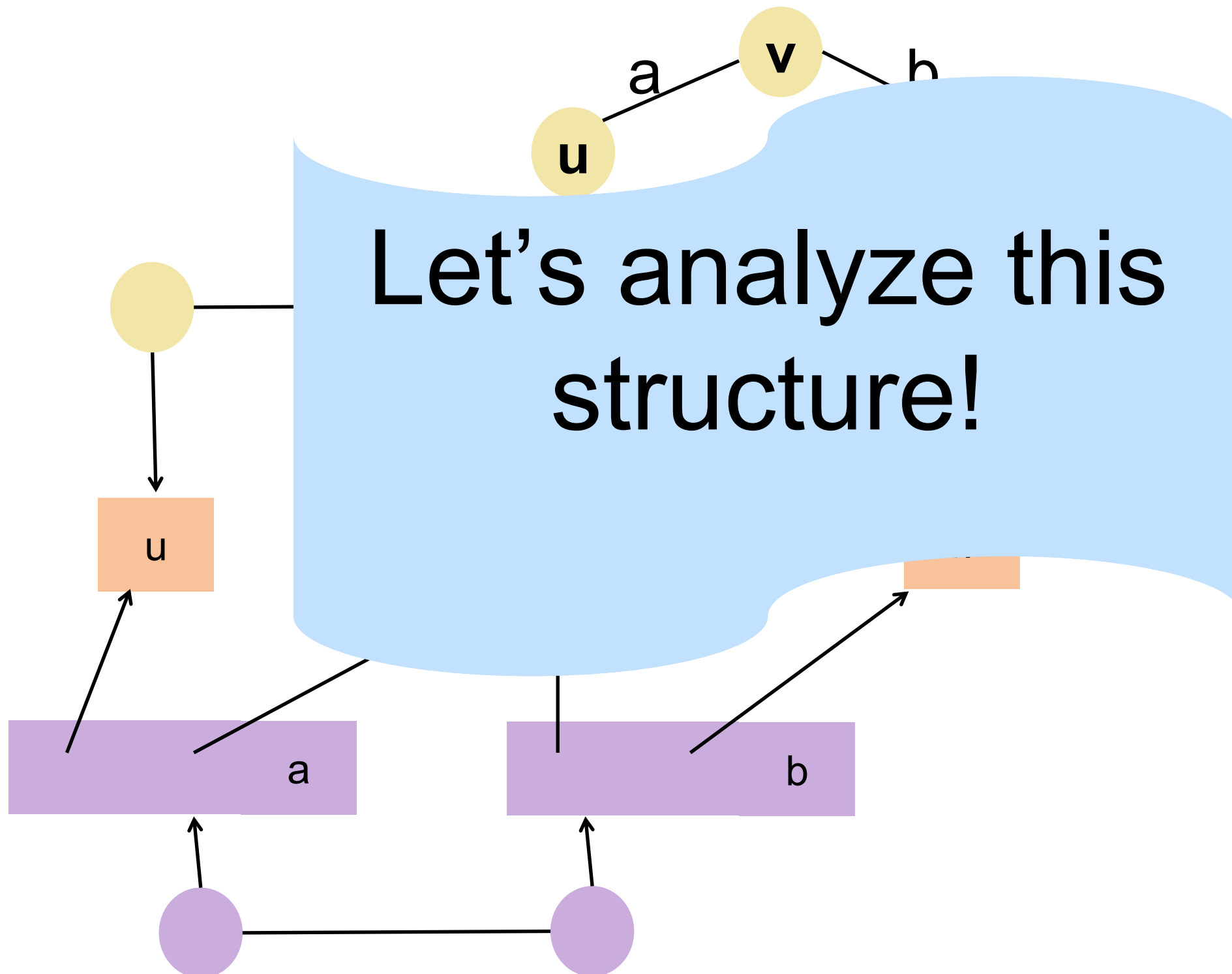


Vertex List

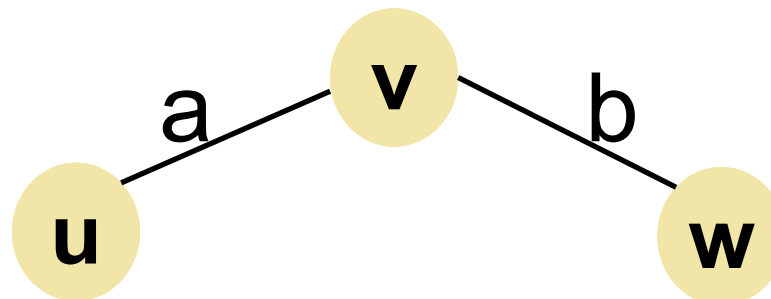


Edge List

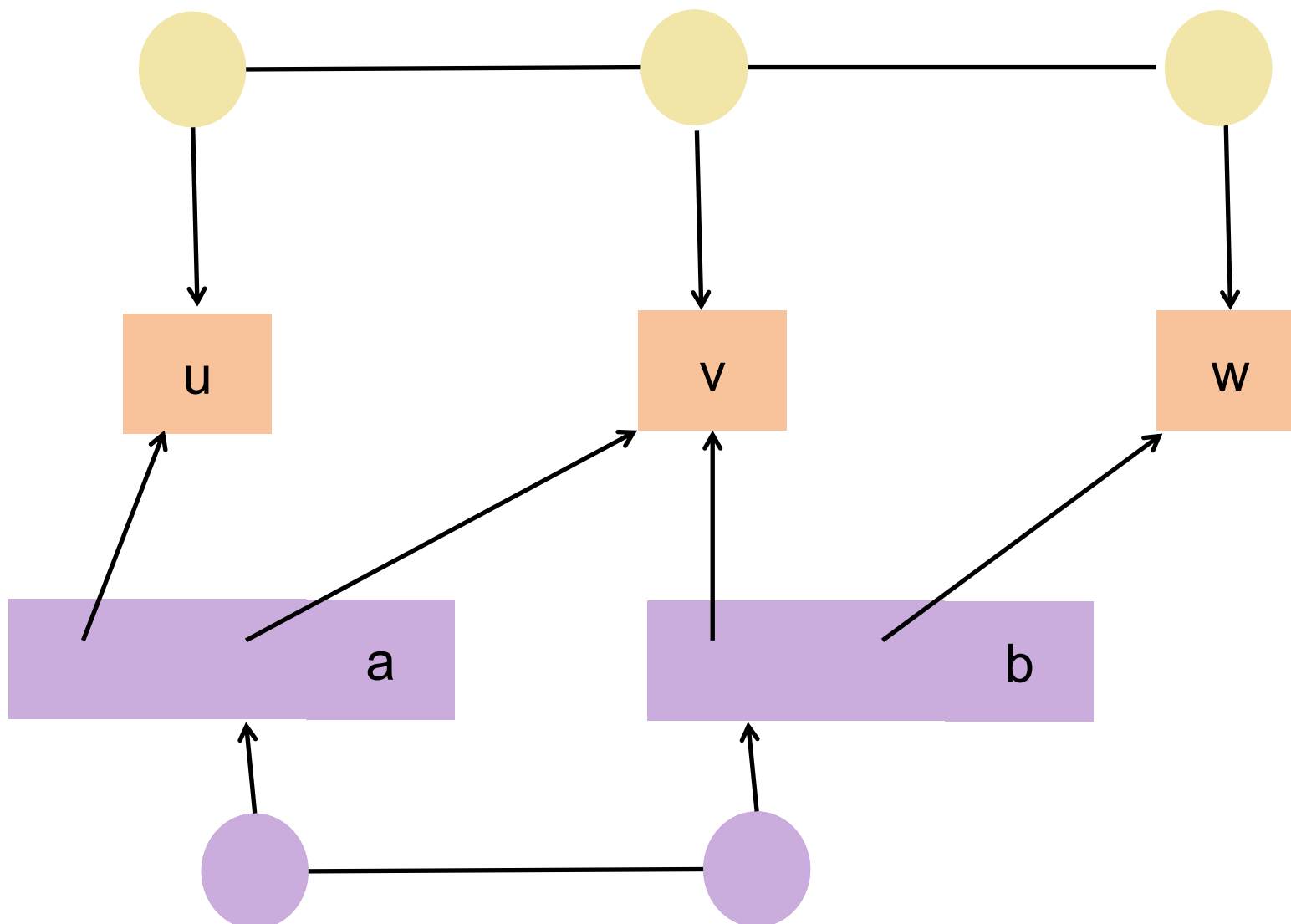
Edge List Structure



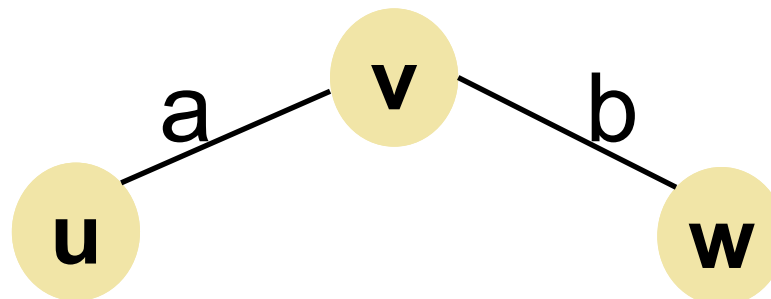
Edge List Structure



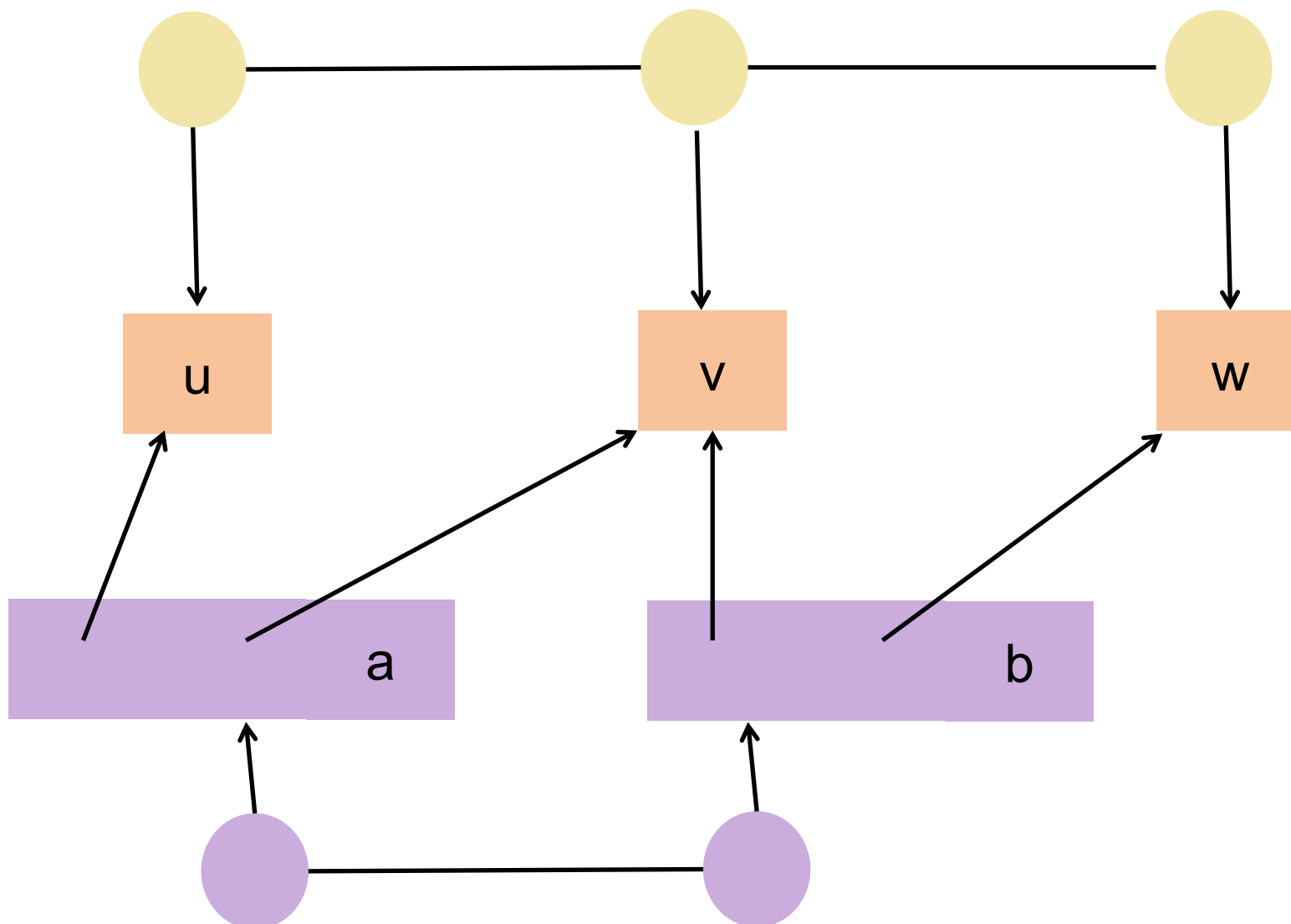
insertVertex(v)
 $O(1)$



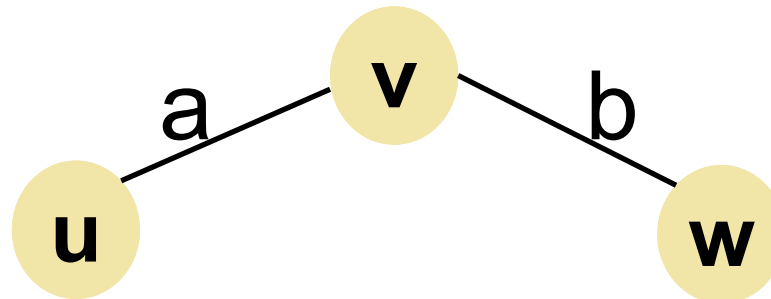
Edge List Structure



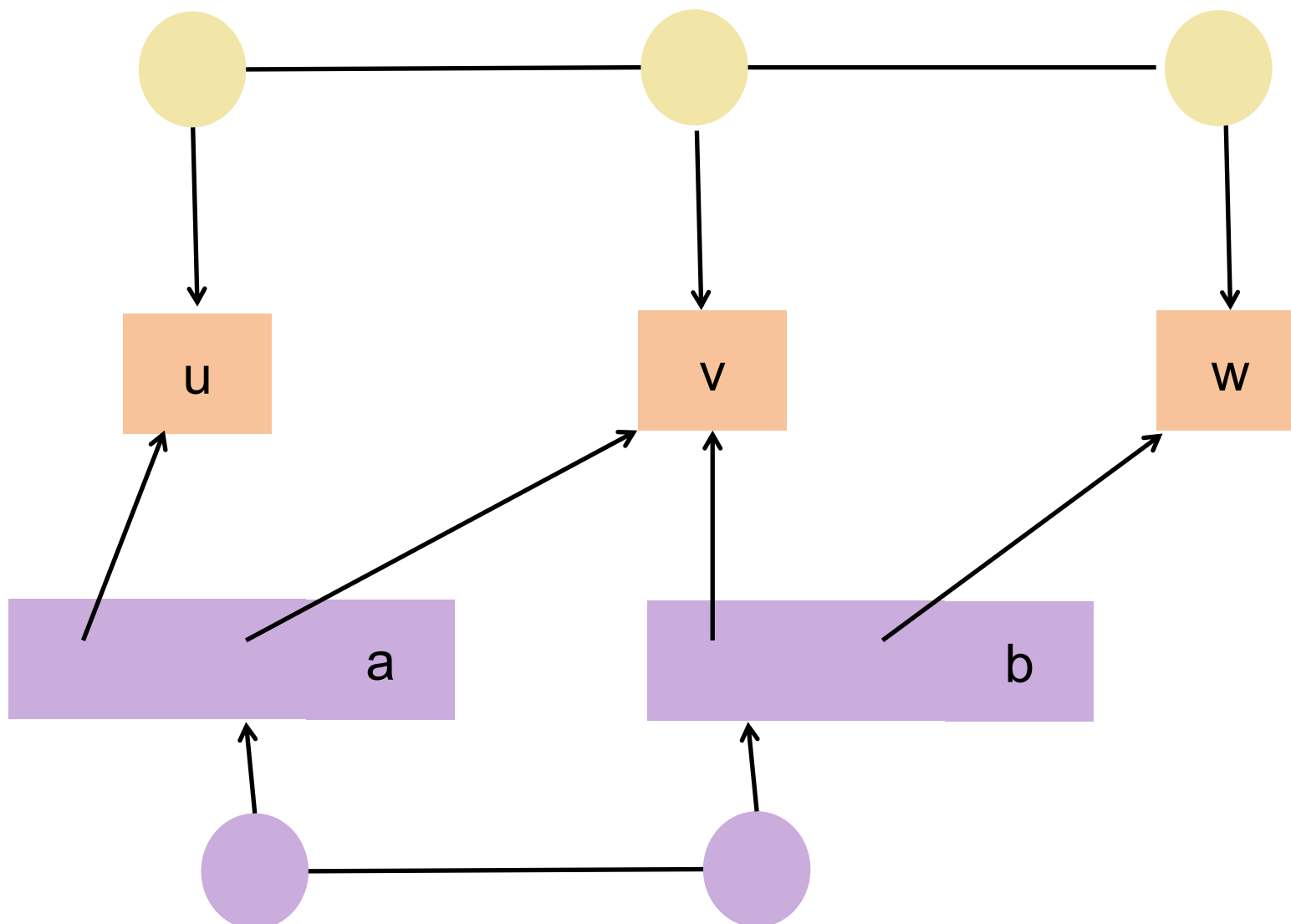
insertEdge(e, origin, dest)
 $O(1)$



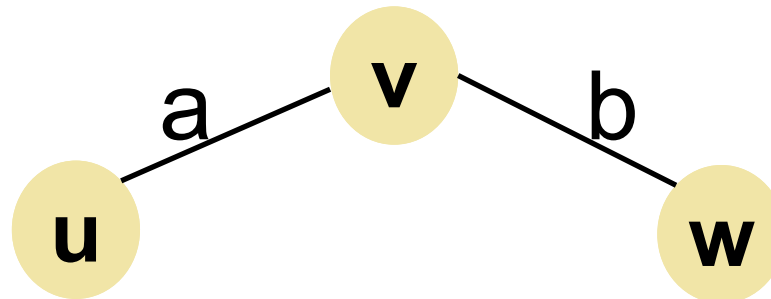
Edge List Structure



areAdjacent($v1, v2$)
 $O(\# \text{ of edges})$

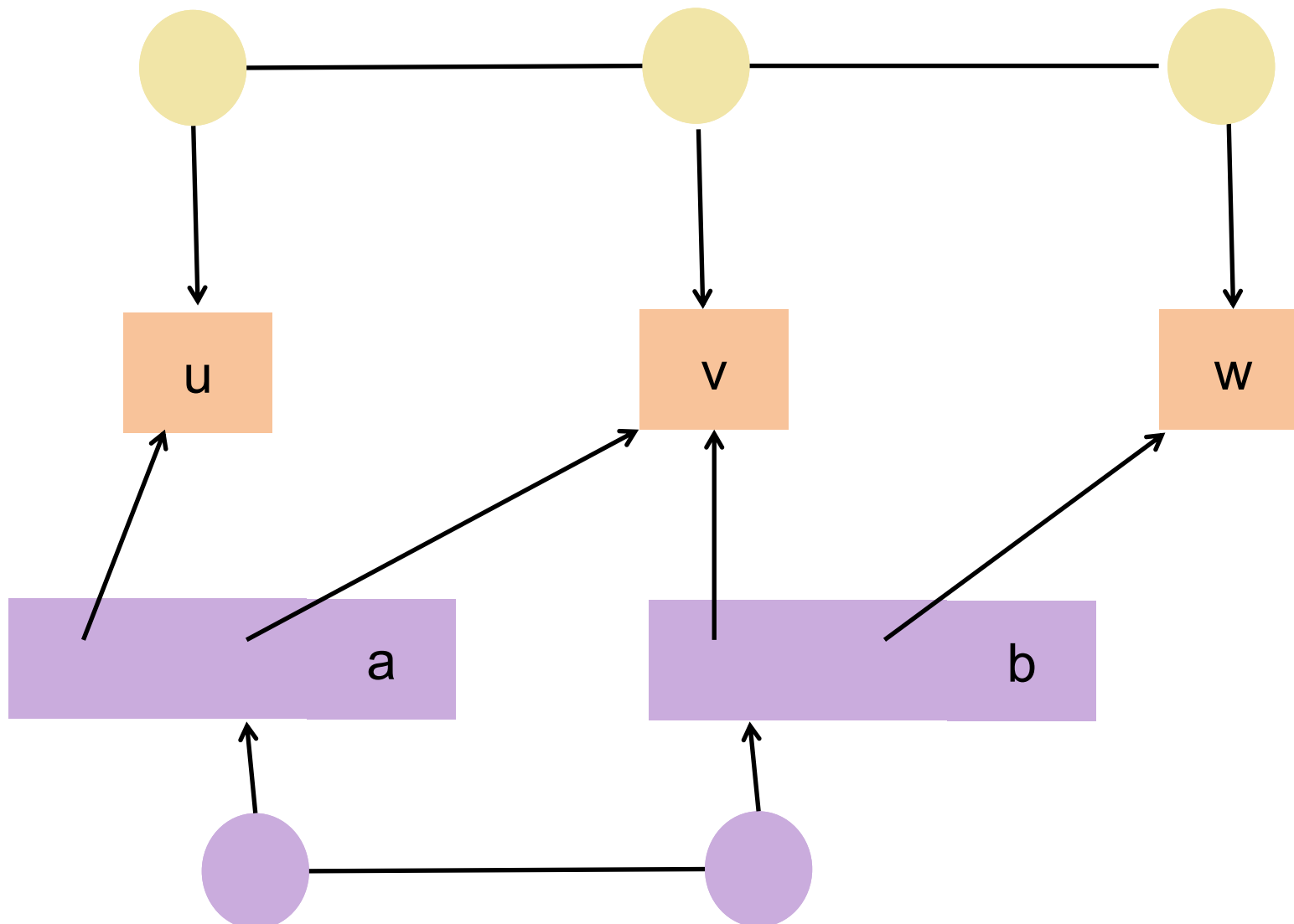


Edge List Structure

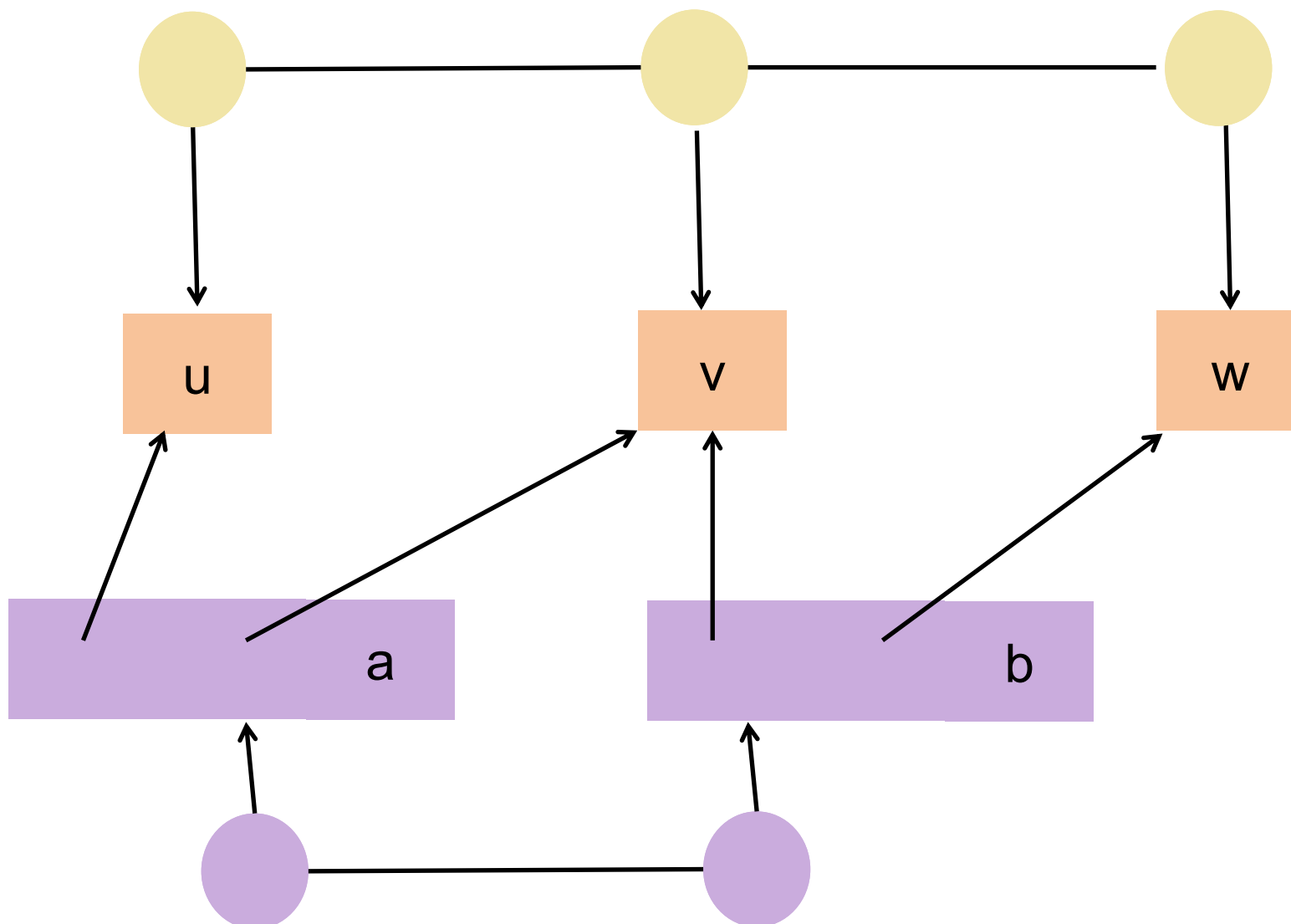
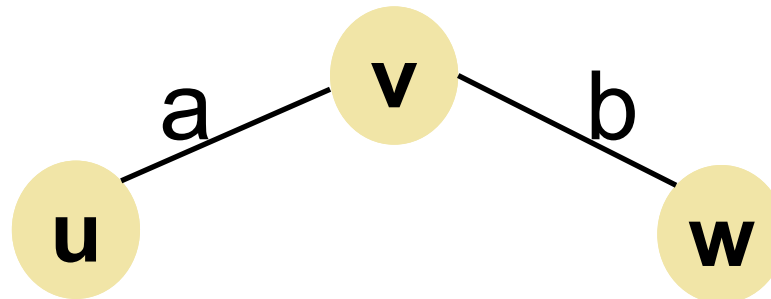


removeEdge(e)

$O(\# \text{ of edges})$



Edge List Structure



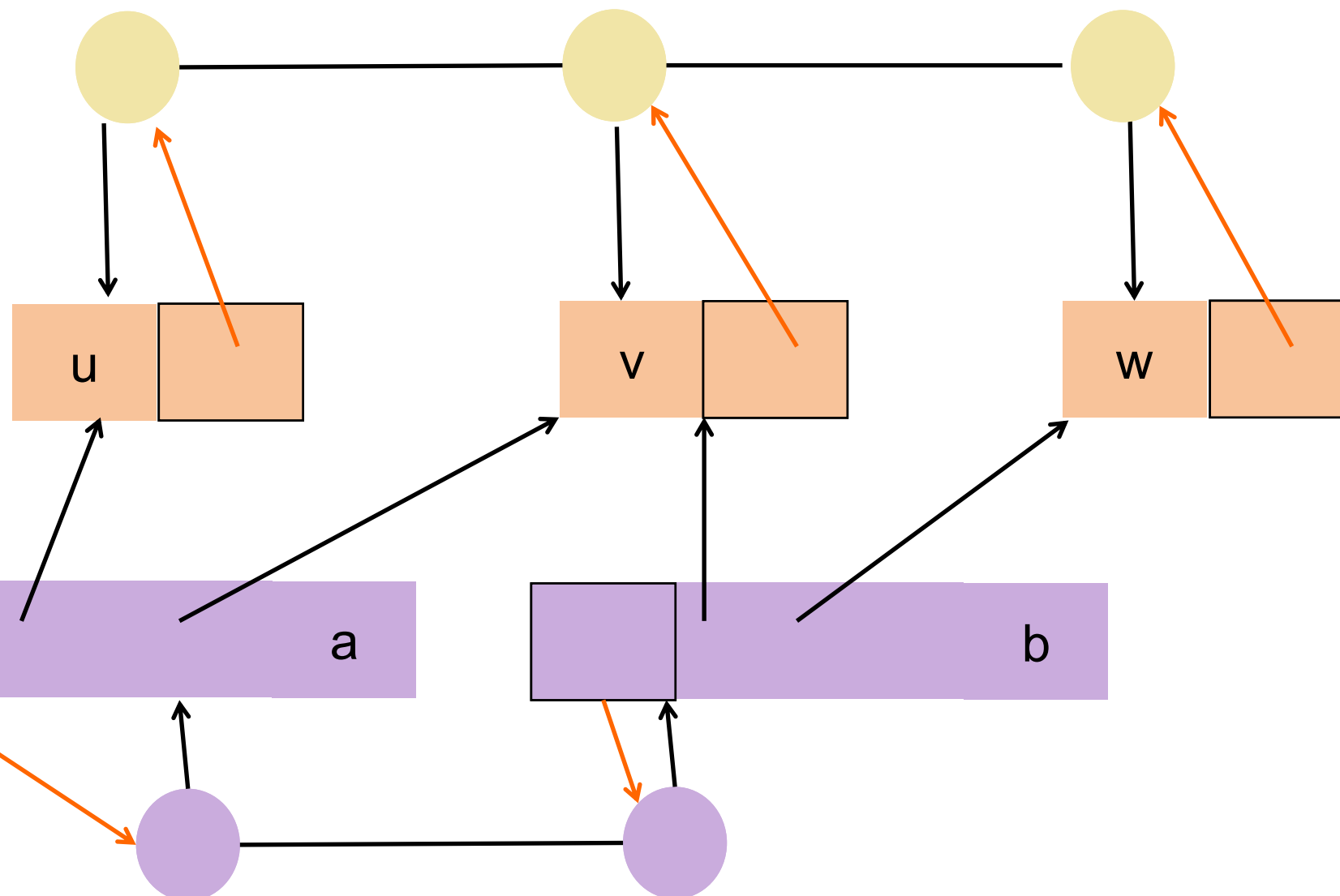
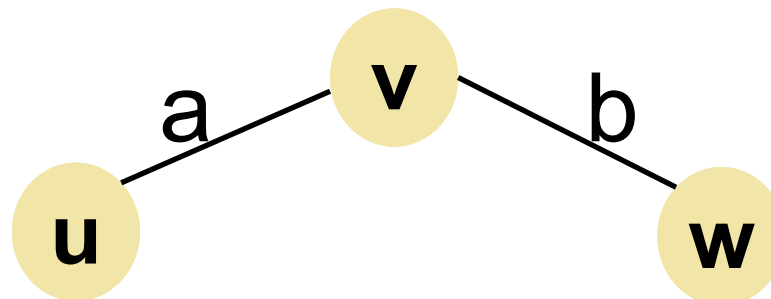
Interesting one!
removeVertex(v)

$O(?)$

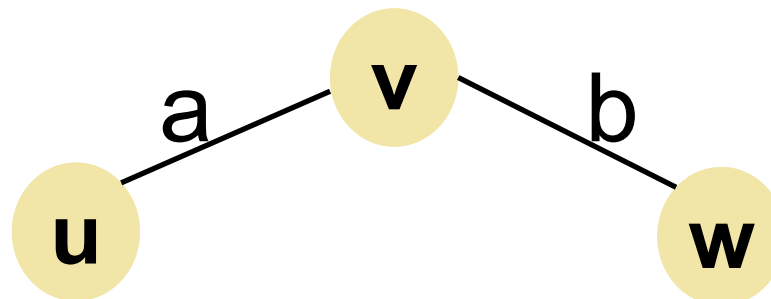
Edge List Structure

- Let's do one more change to improve the efficiency of `removeVertex` and `removeEdge`
- Let each vertex and edge object know where they are in their respective lists
 - ❖ `Vertex object`: element, where am I in the vertex list
 - ❖ `Edge Object`: element, origin, destination, where am I in the edge list

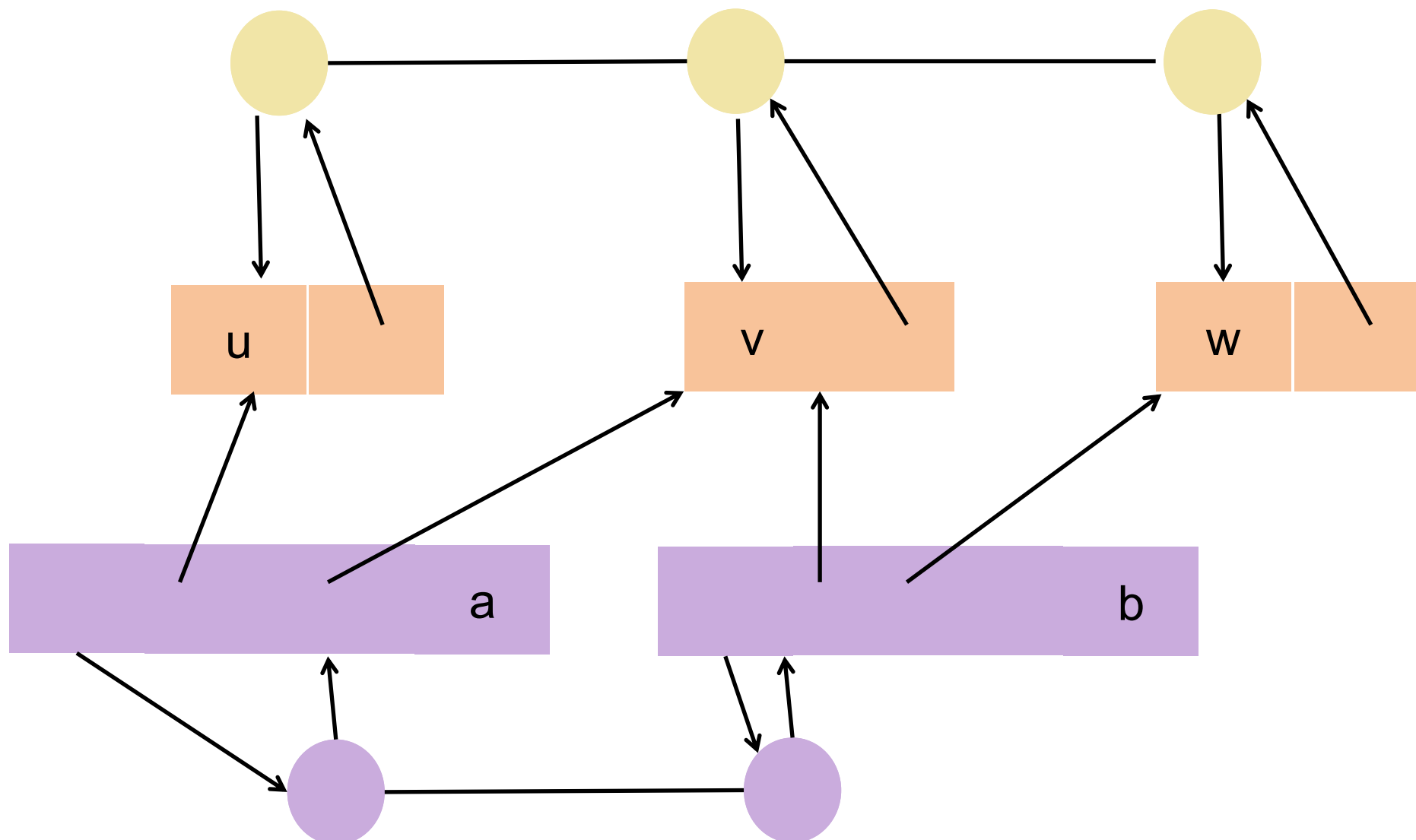
Edge List Structure



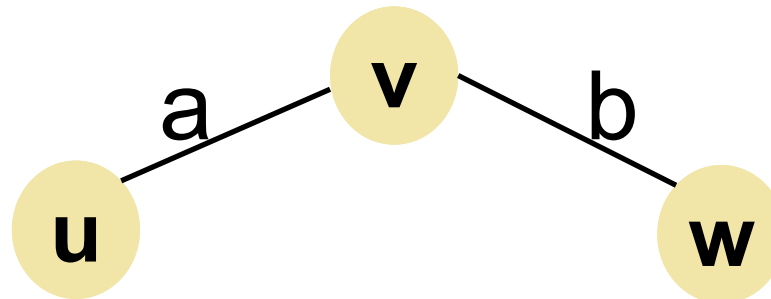
Edge List Structure



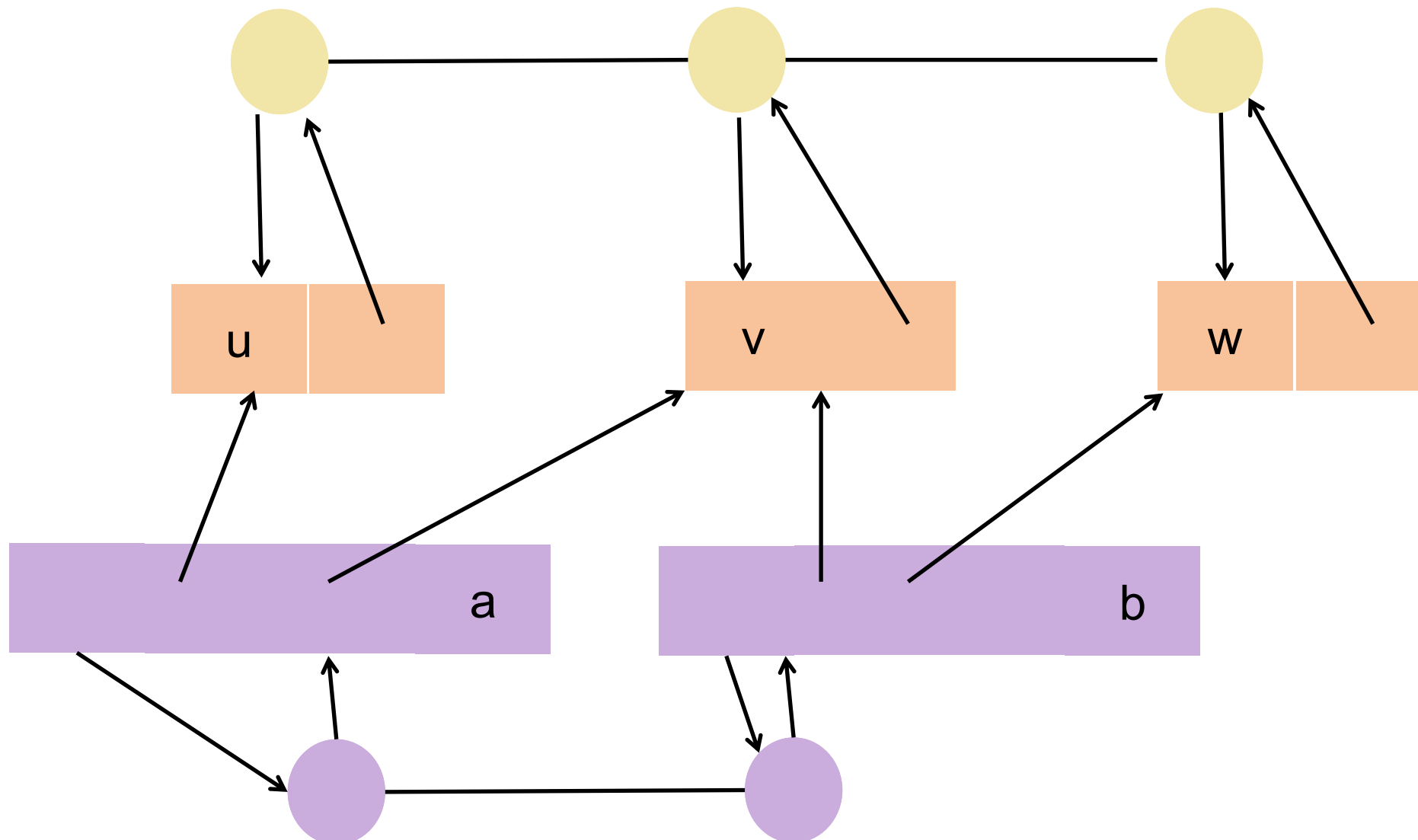
removeEdge(e)
 $O(1)$



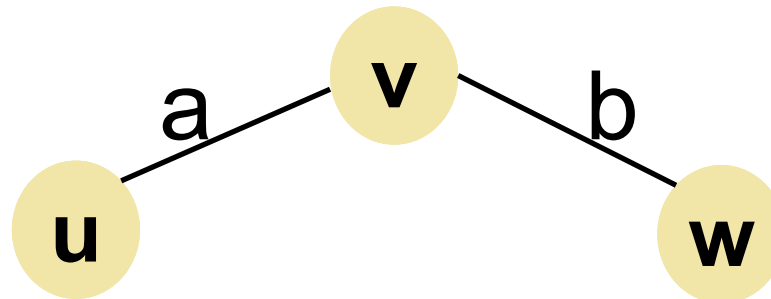
Edge List Structure



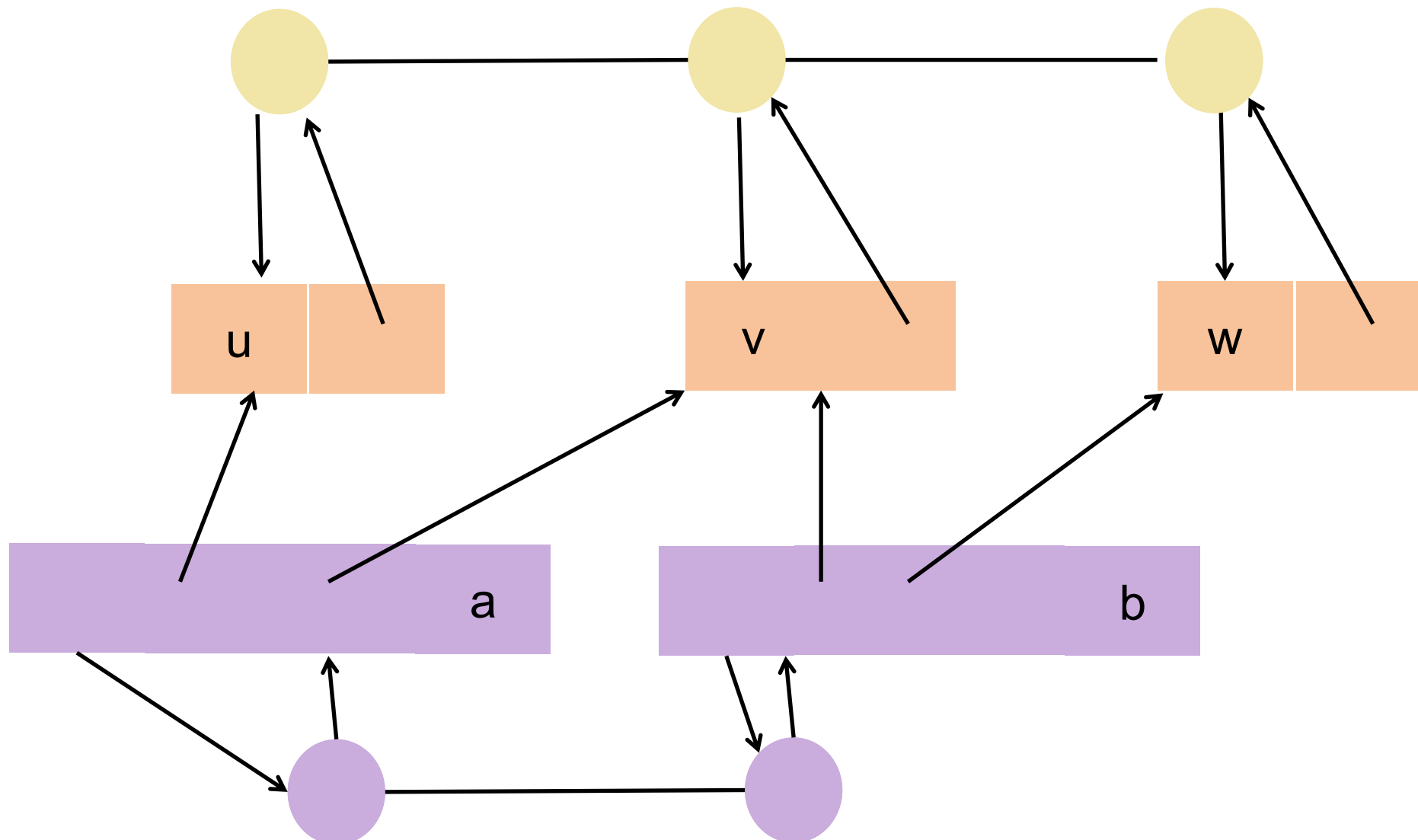
What about
`removeVertex(v)`?



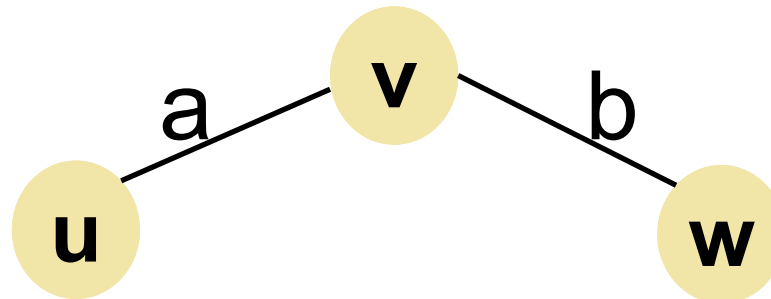
Edge List Structure



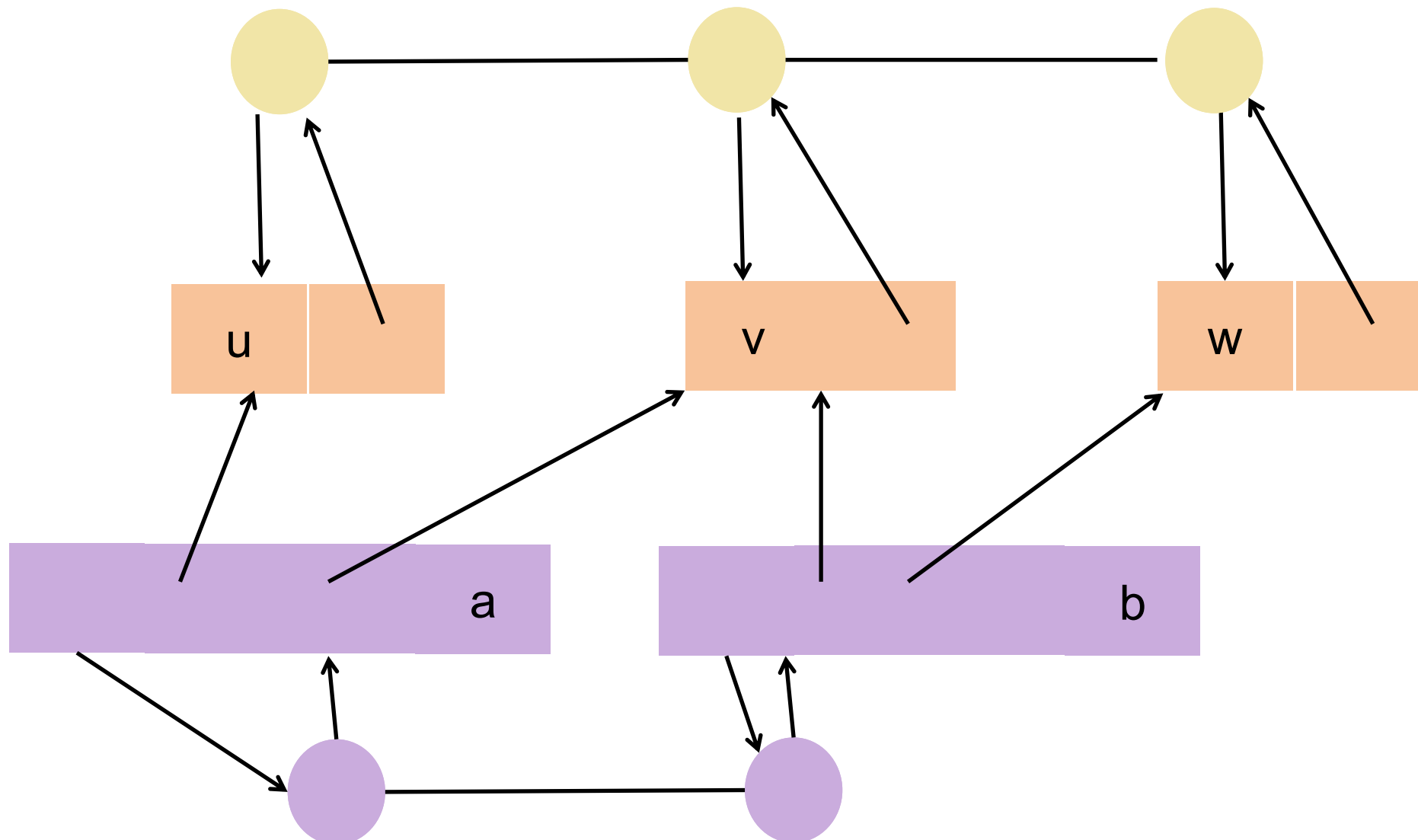
What about $\text{degree}(v)$?



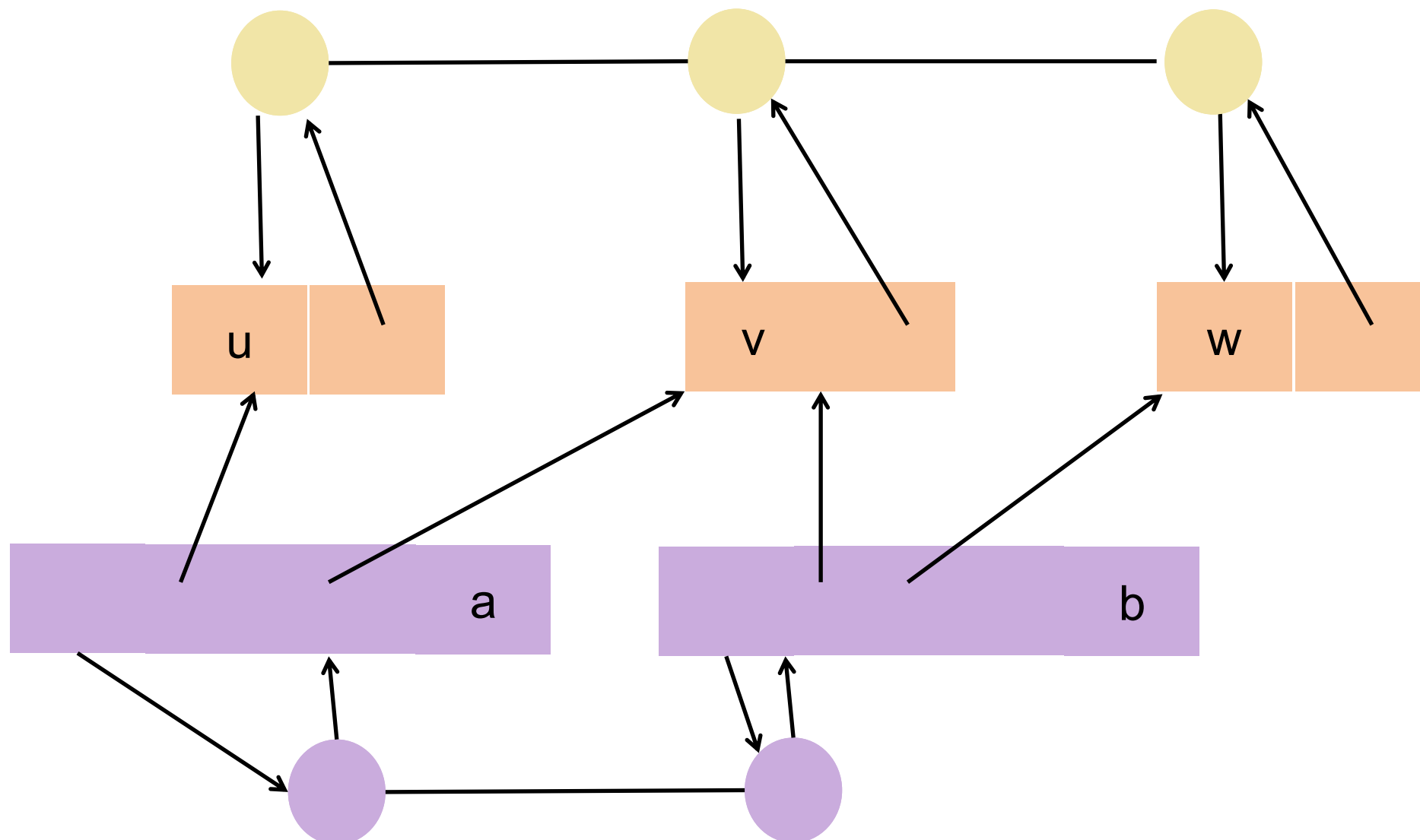
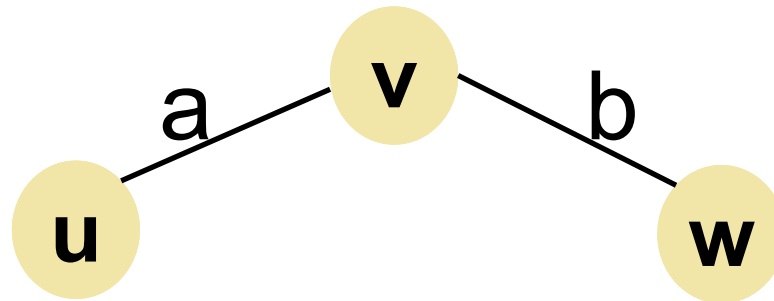
Edge List Structure



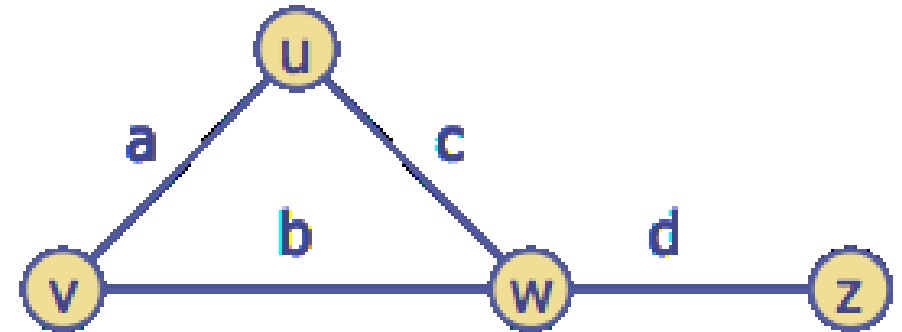
What about `areAdjacent(v1, v2)`?



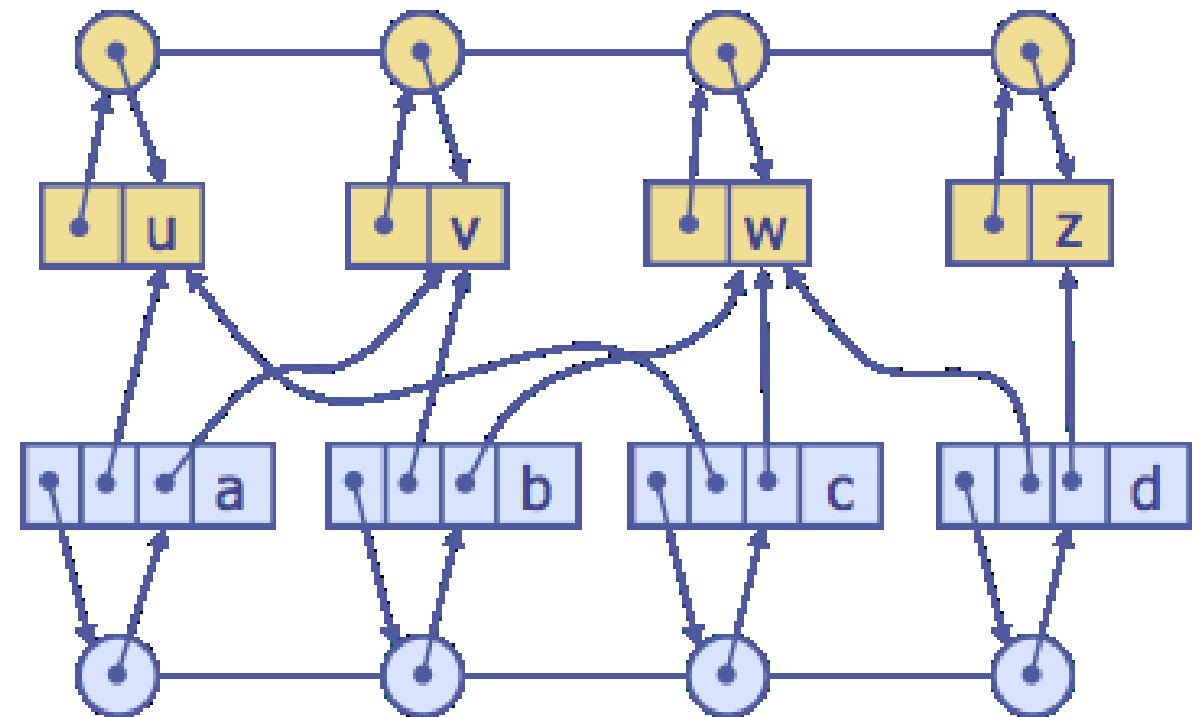
Summary: Edge List Structure



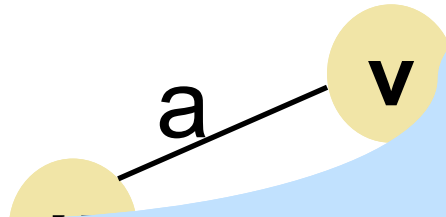
Another Example



- Another example for practice



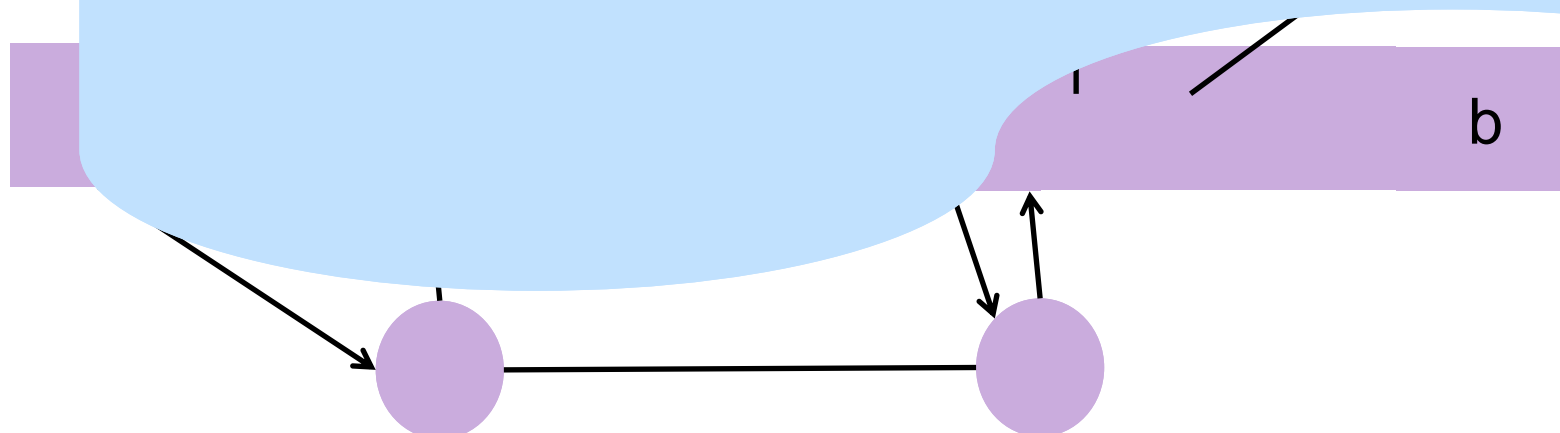
Edge List Structure



Let's try to improve this structure

More specifically, we are interested in improving the time of operations related to vertices

For example, $\text{degree}(v)$, $\text{removeVertex}(v)$, $\text{areAdjacent}(v1, v2)$



Improvement

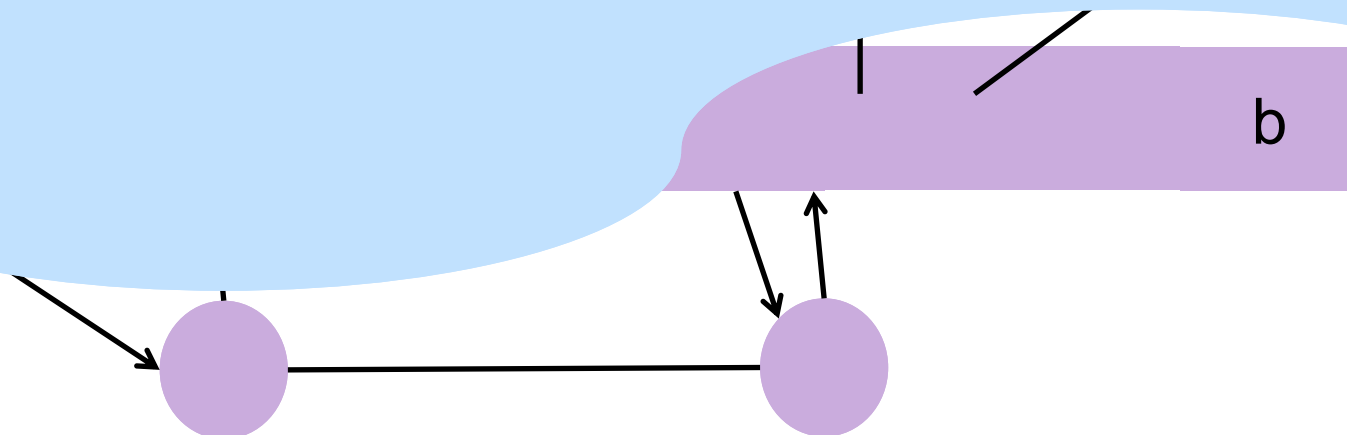


Vertex object is given more information

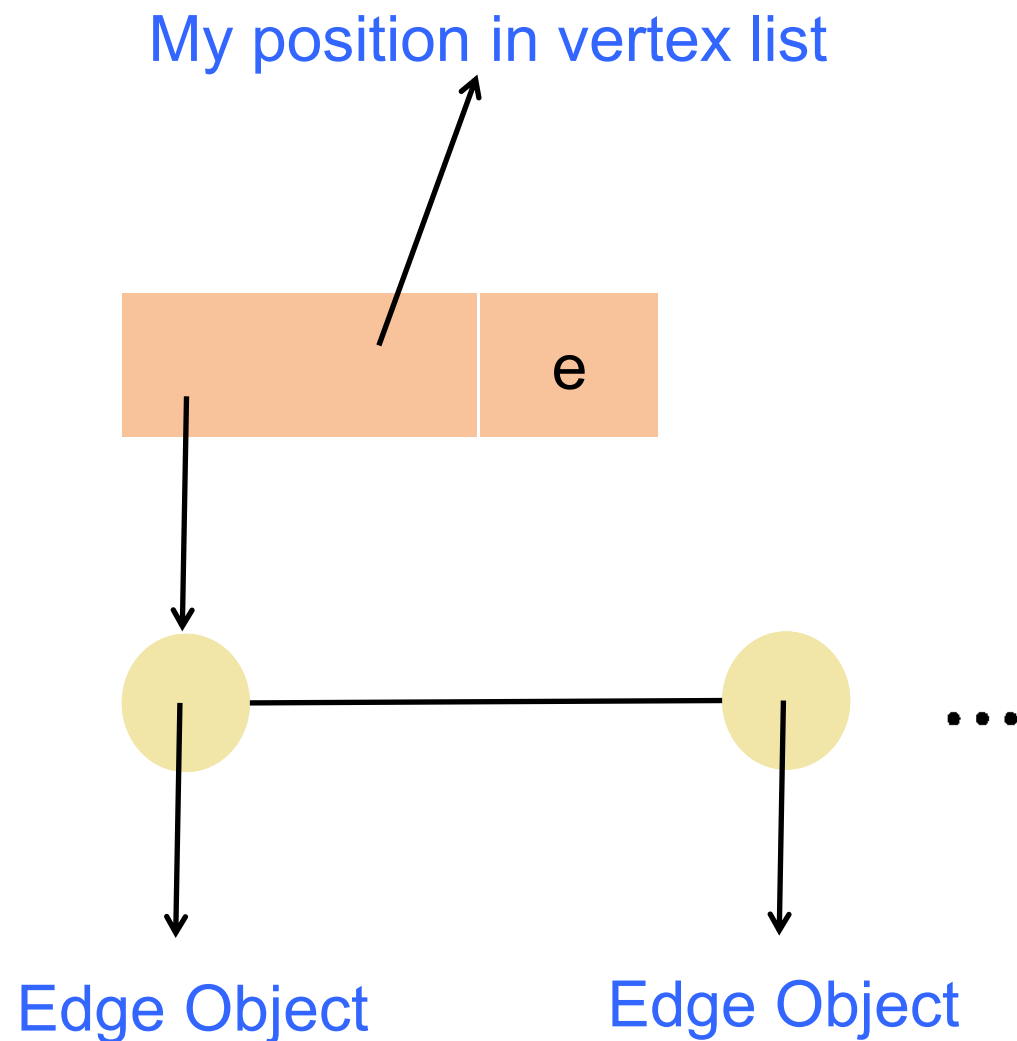
The diagram shows a light blue irregular shape representing a vertex. Two yellow semi-circles on its top edge represent incident edges. A line segment labeled 'a' connects the two yellow semi-circles.

Each vertex now knows which edges are incident on it!

This information is stored as a LIST of pointers pointing to incident edges



Arbitrary Vertex Object with Two Incident Edges

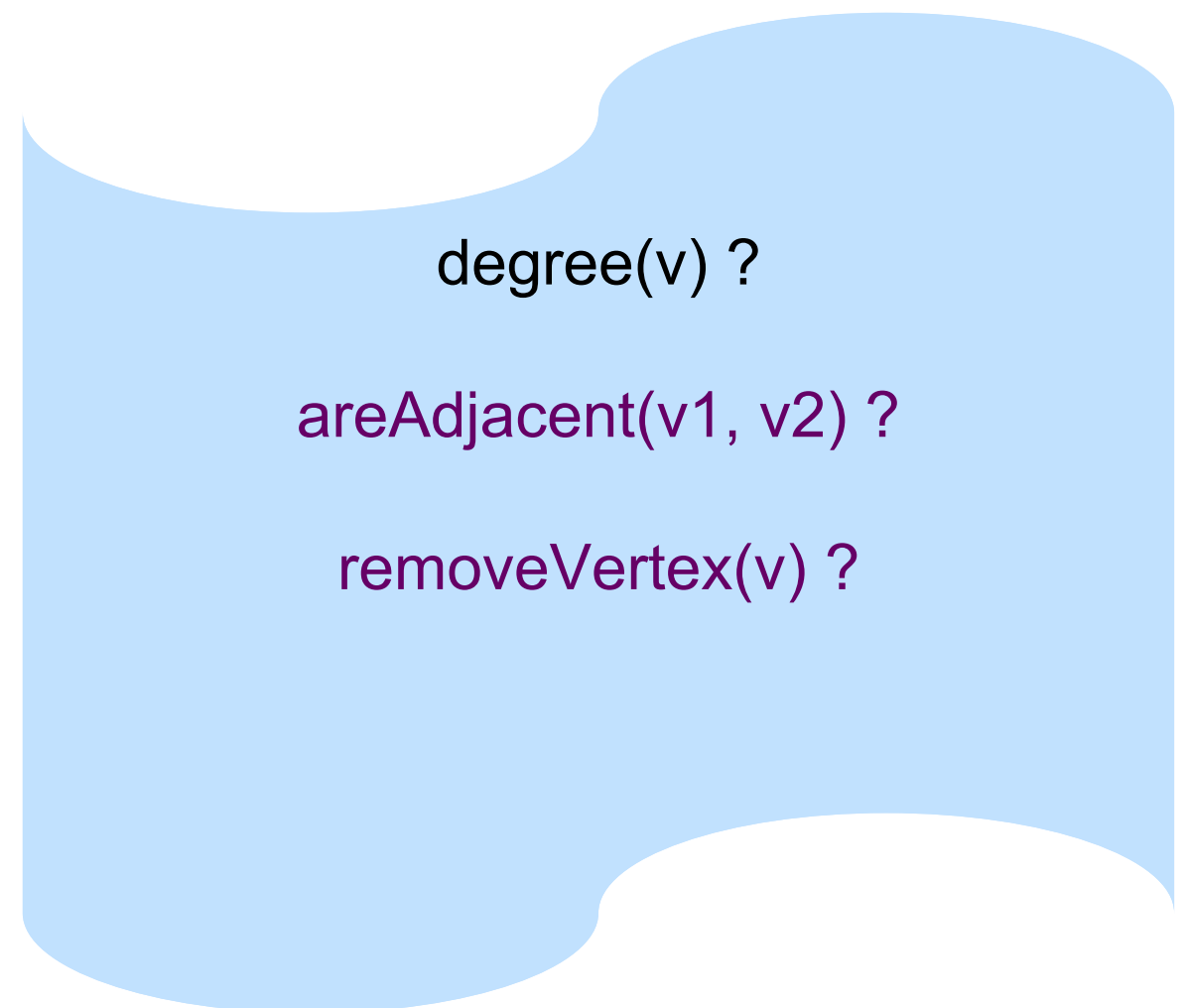
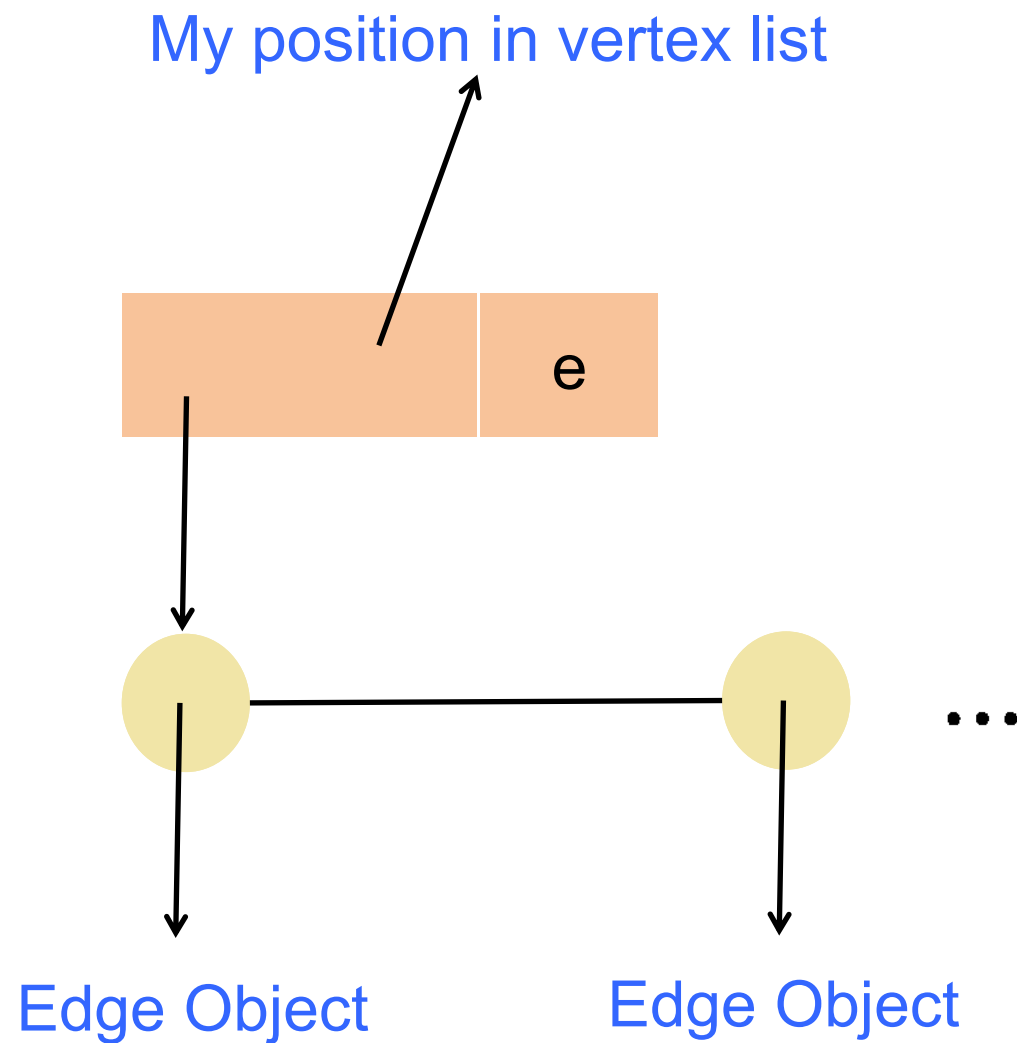


Vertex object is given more information

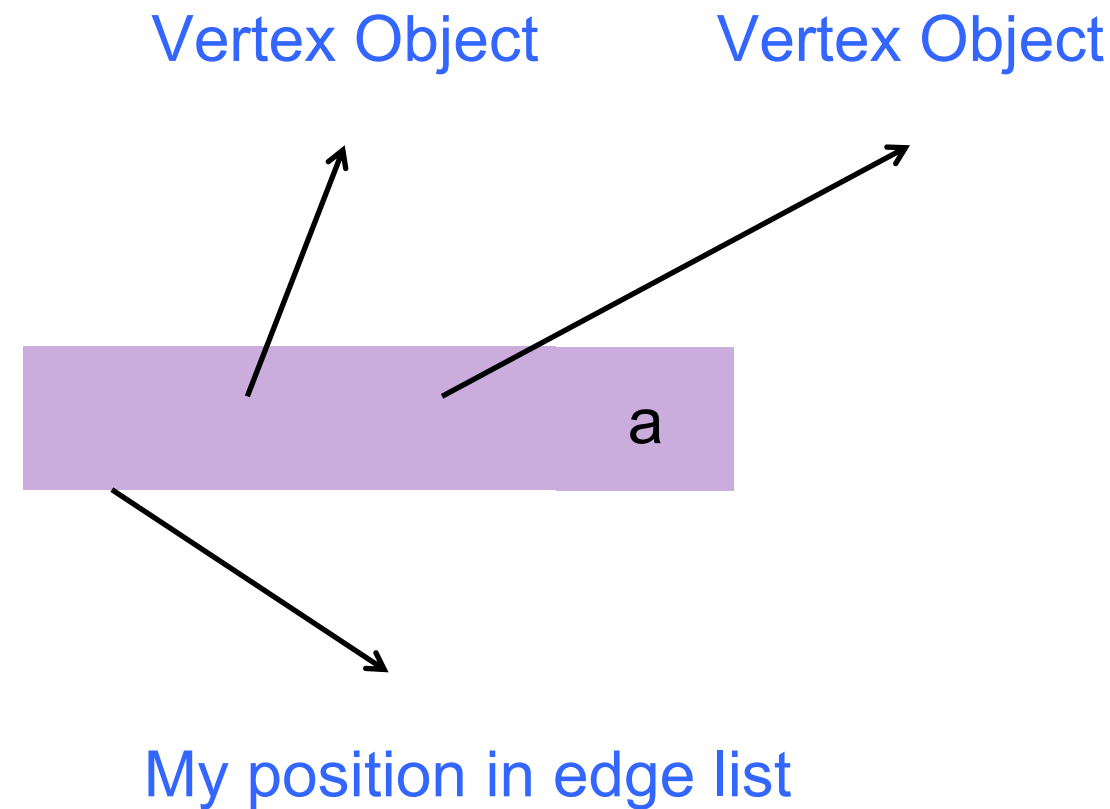
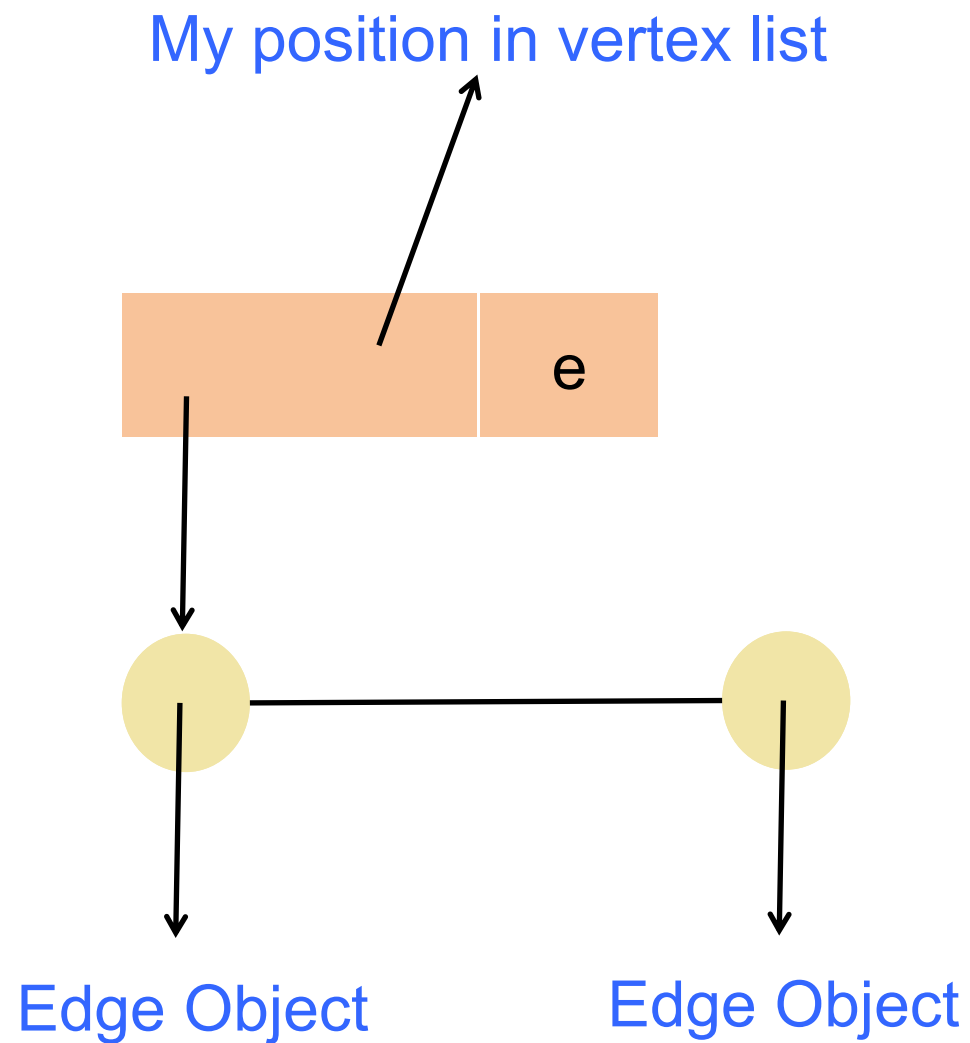
Each vertex now knows which edges are incident on it!

This information is stored as a LIST of pointers pointing to incident edges – called Adjacency List – why name it like that?

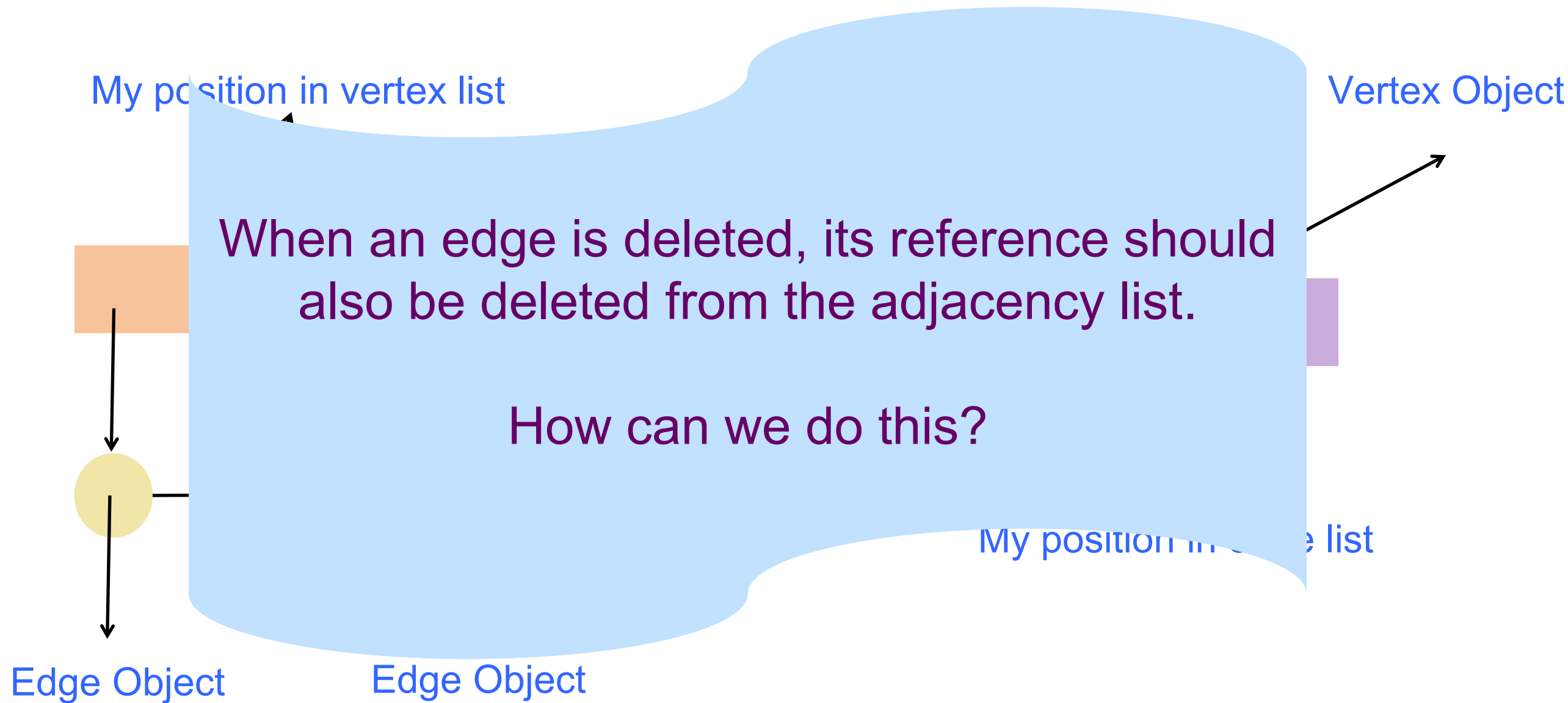
Let's Analyze



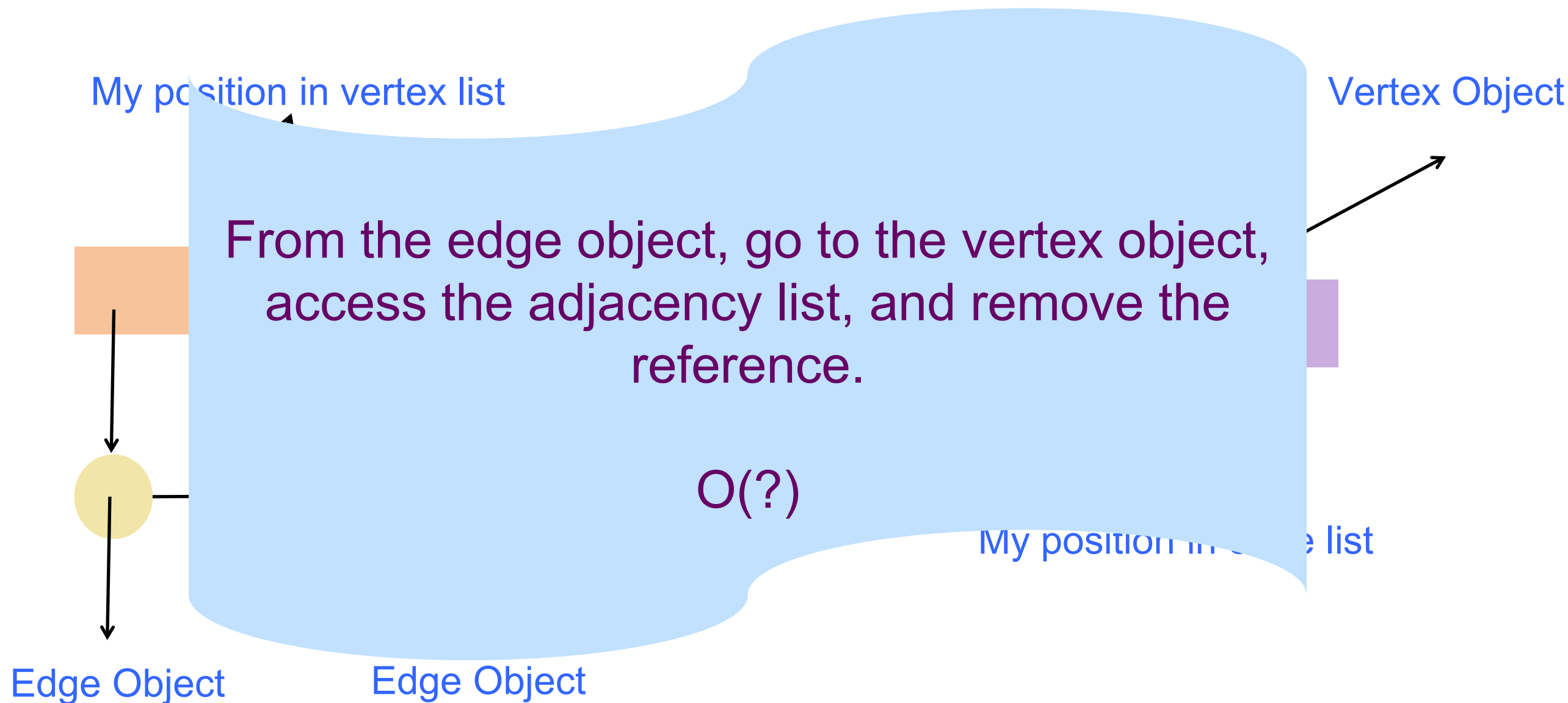
New Vertex with Previous Edge Object



Edge Removal



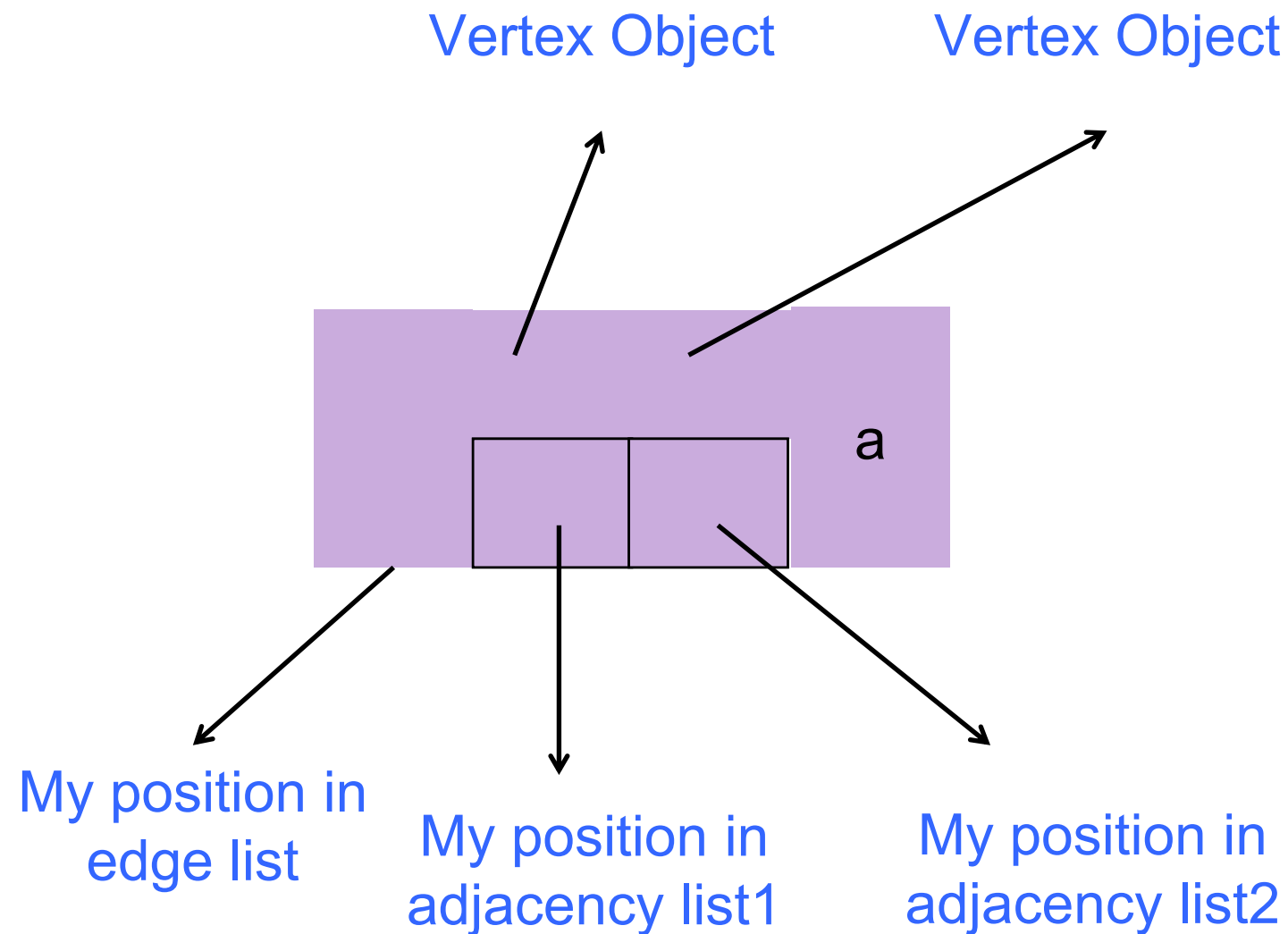
Removing Edge Reference from Adjacency List



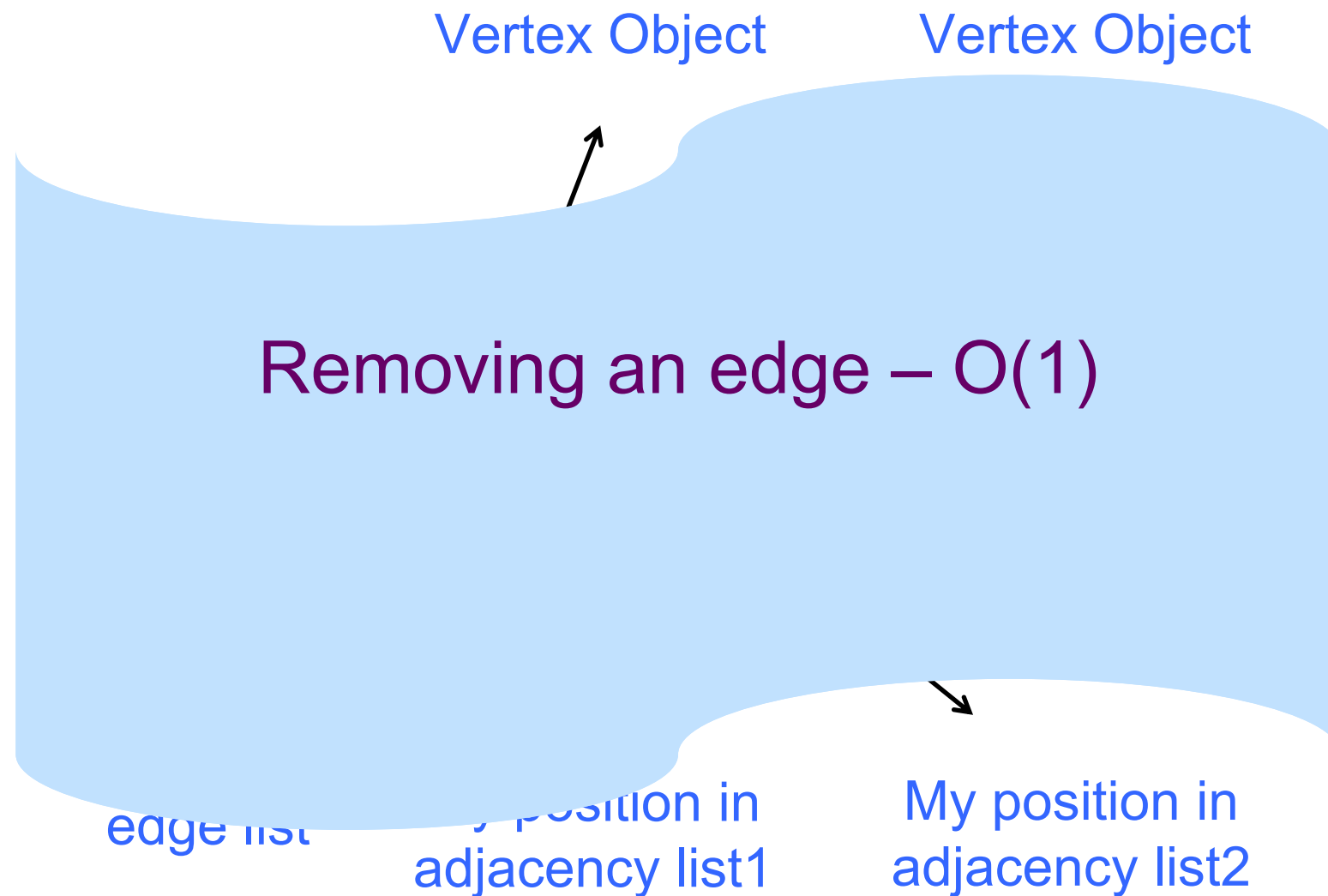
Removing Edge Reference from Adjacency List (2)



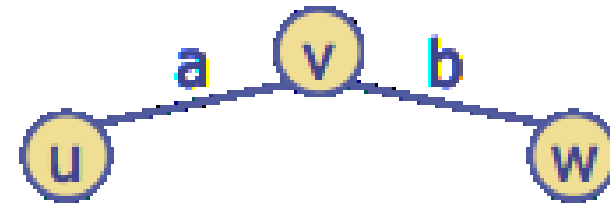
Updated Edge Object



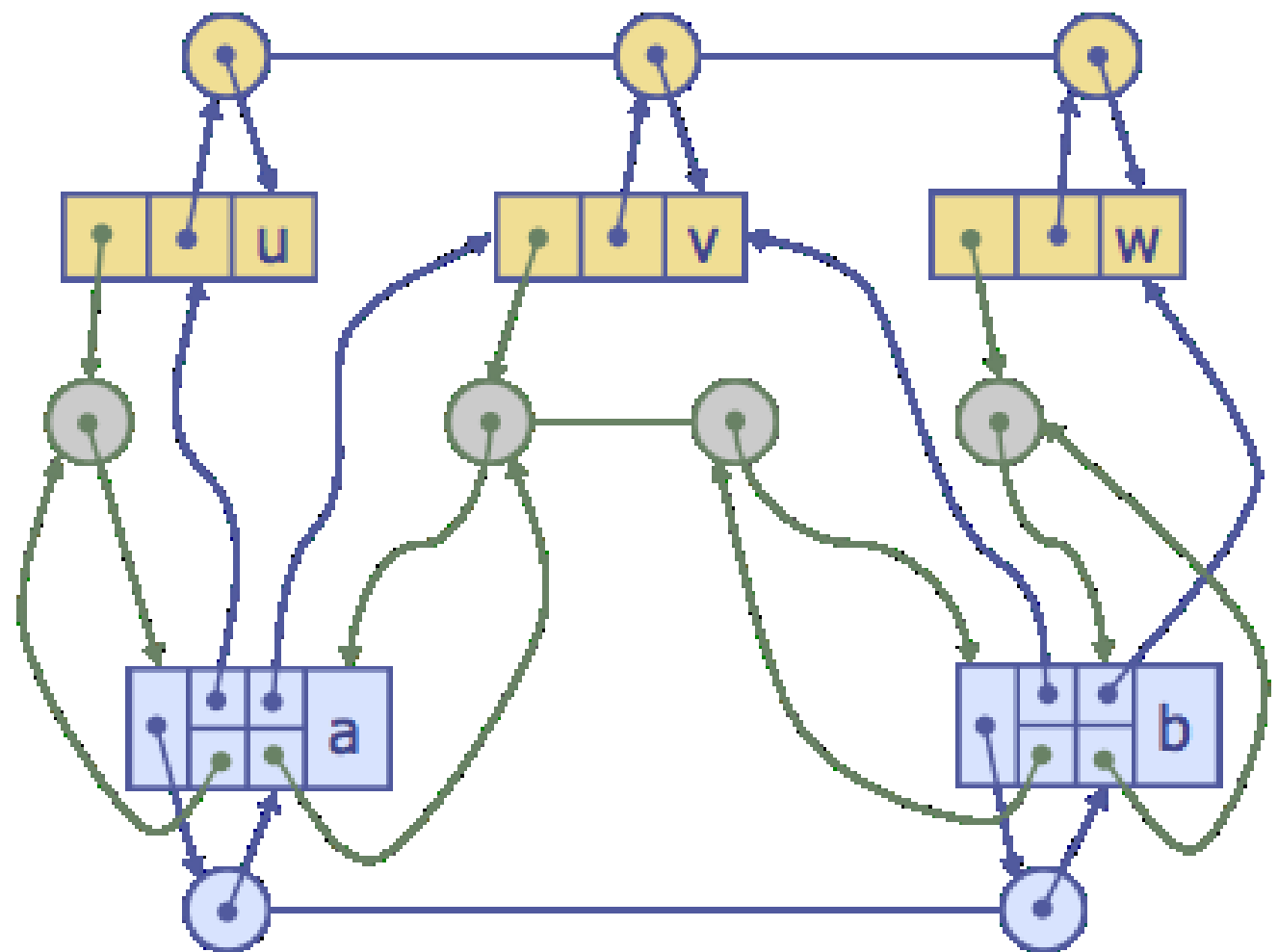
Updated Edge Object (2)



Adjacency List Structure



- The entire structure!

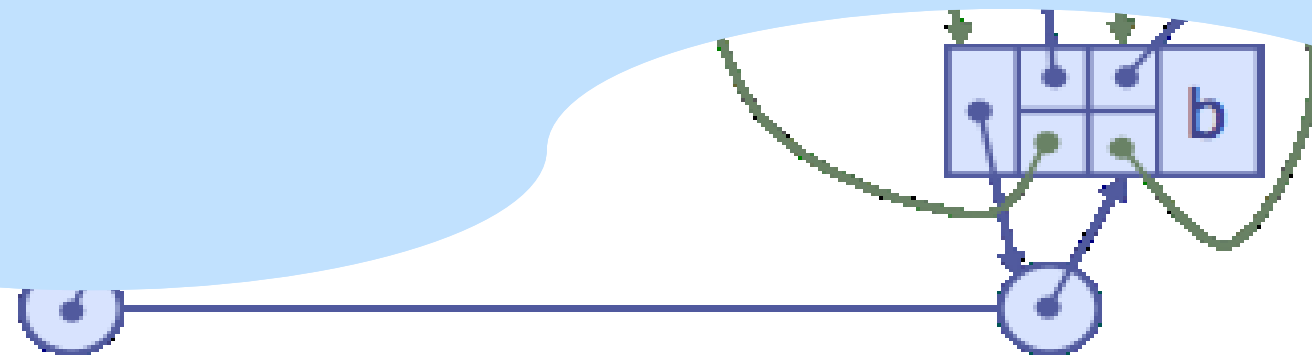


Adjacency List Structure (2)

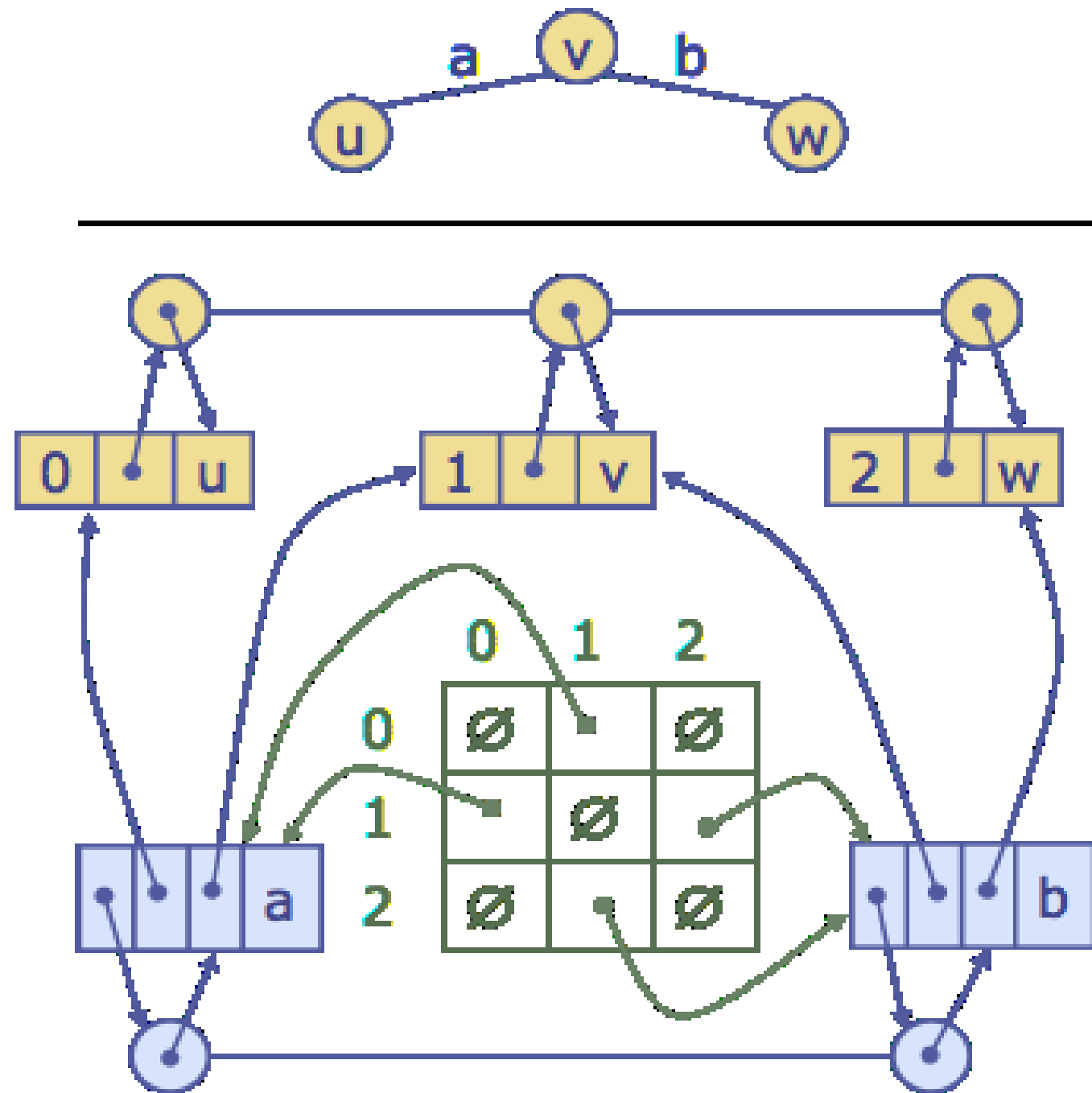
Adjacency list structure is complete (in terms of Graph ADT operations), and efficient (**more on efficiency later**)

But it is complex

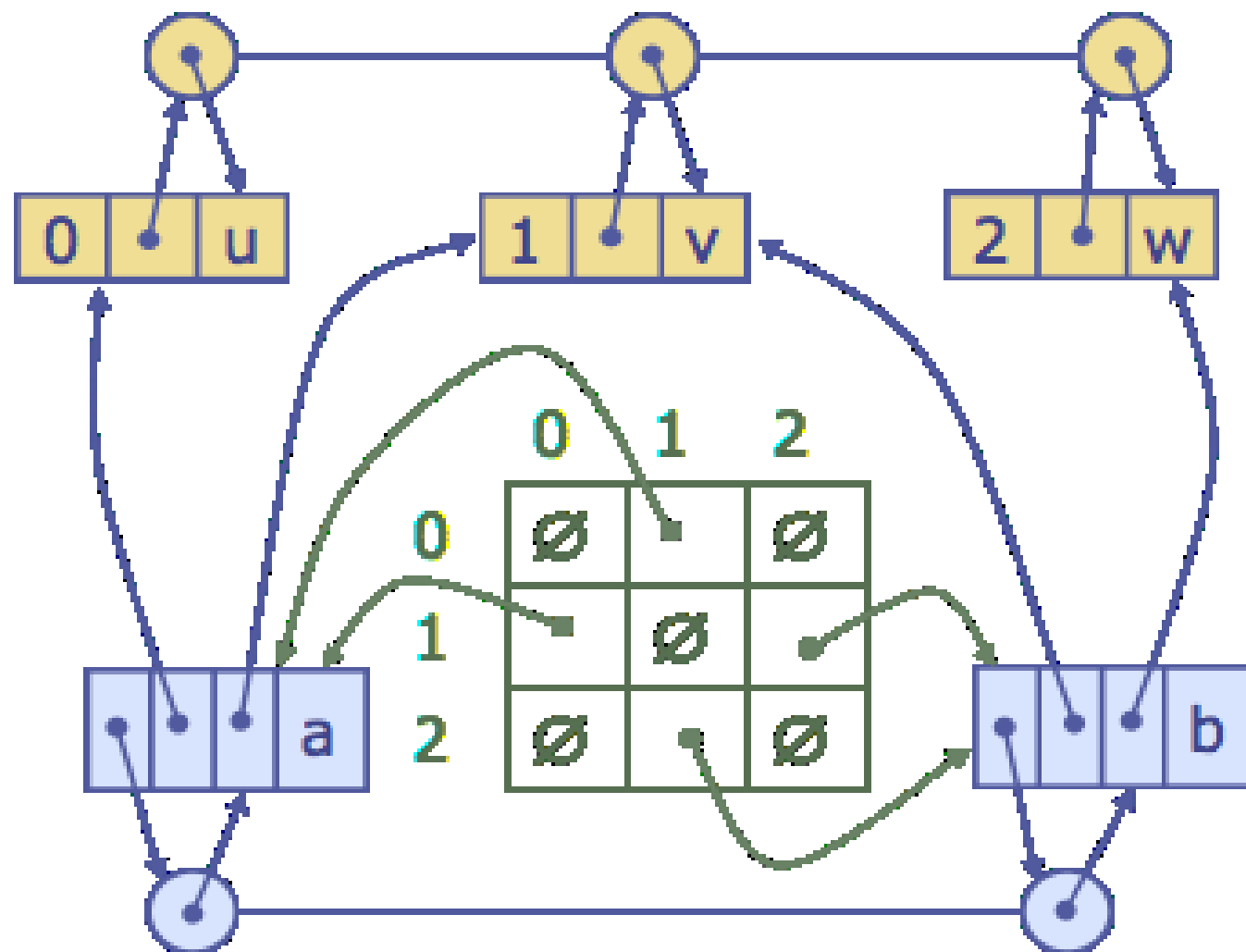
There is another simpler structure with some compromises



Adjacency Matrix Structure



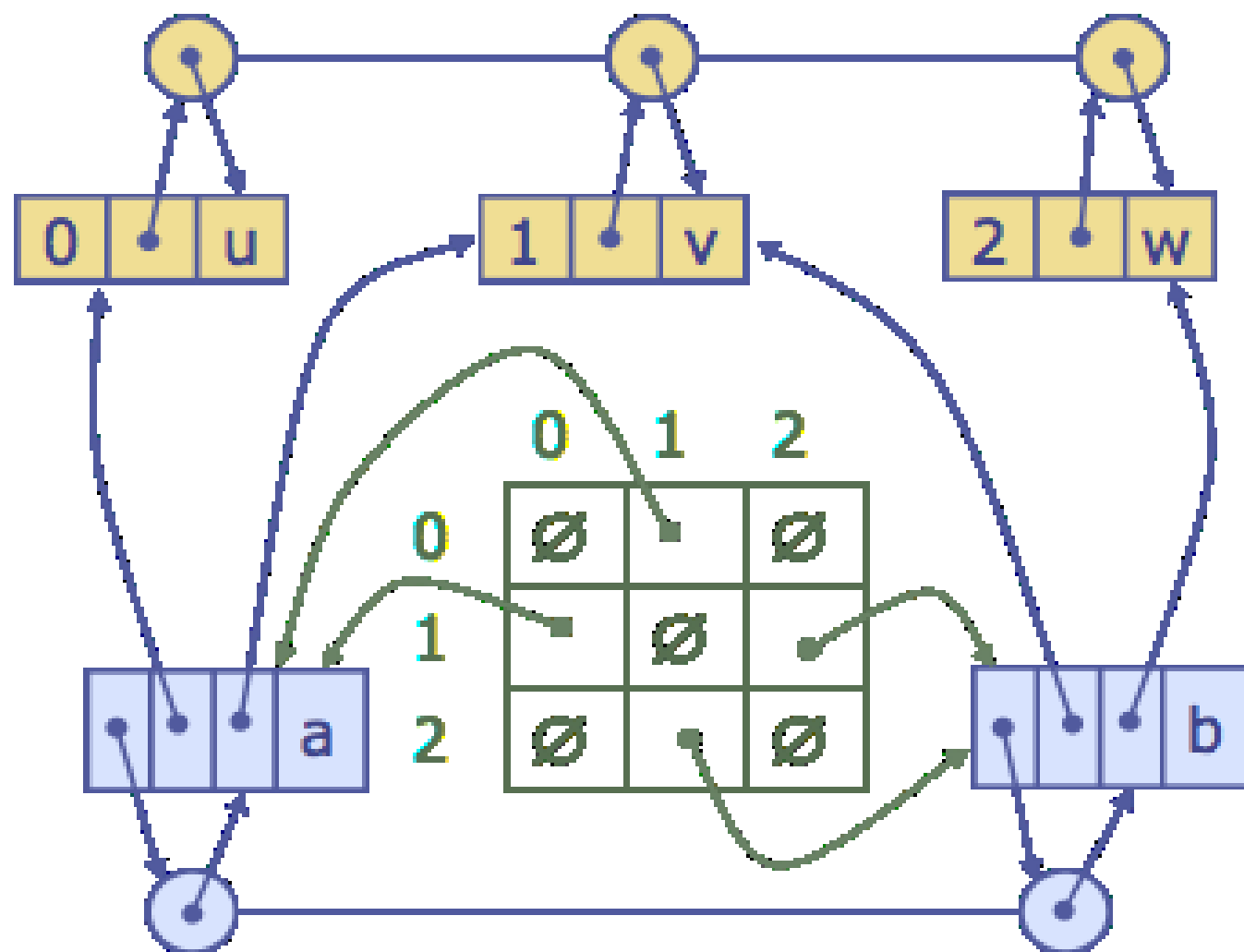
Adjacency Matrix Structure (2)



Edge object goes back to
“Edge List” stage!

Only knows four things!

Adjacency Matrix Structure (3)

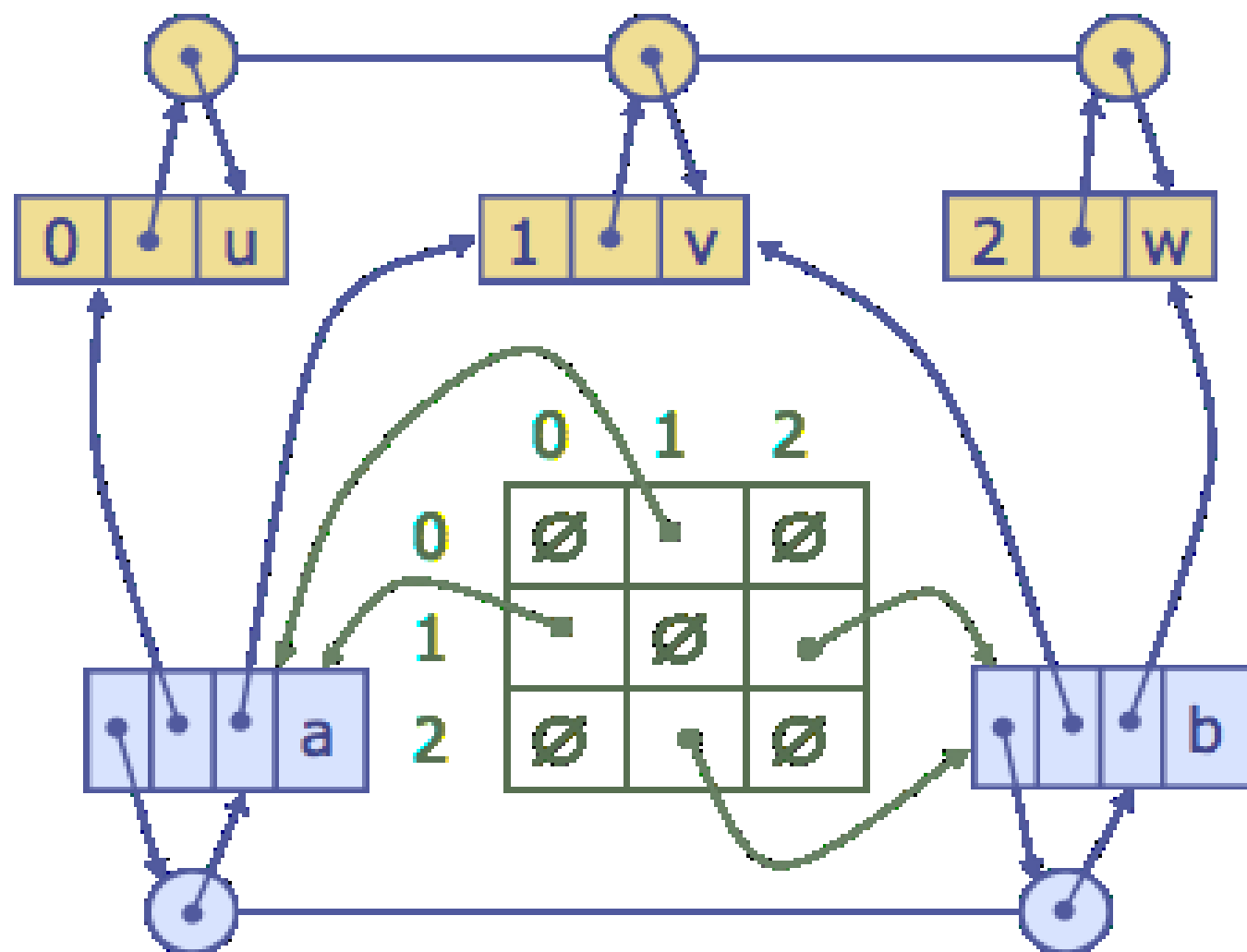


A $n \times n$ matrix is introduced –
Adjacency Matrix

Each cell stores a reference to an edge object

Cell (0,1) refers to the edge between vertex0 and vertex1

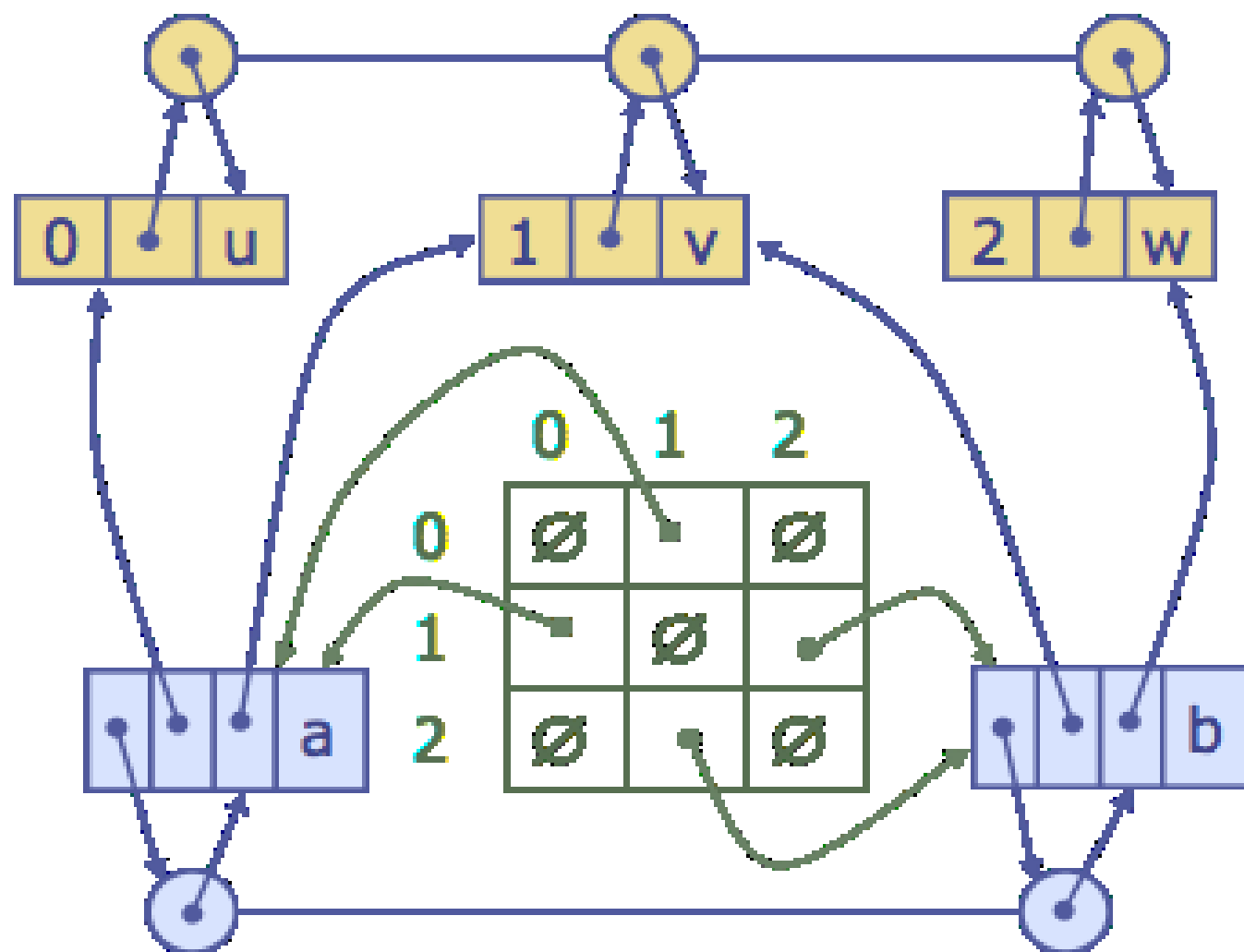
Adjacency Matrix Structure (4)



Finally, each vertex object now stores a number associated with it

It is used to refer to its position (index) in the adjacency matrix

Adjacency Matrix Structure (5)



$\text{incidentEdges}(v) - O(?)$
 $\text{areAdjacent}(v_0, v_1) - O(?)$
 $\text{insertVertex}(v) - O(?)$
 $\text{insertEdge}(e, o, d) - O(?)$
 $\text{removeVertex}(v) - O(?)$
 $\text{removeEdge}(e) - O(?)$

Graph Representations

| | | | |
|---|-----------|-----------------------------|------------------|
| <ul style="list-style-type: none"> ▪ n vertices, m edges ▪ no parallel edges ▪ no self-loops | Edge List | Adjacency List | Adjacency Matrix |
| Space | $n + m$ | $n + m$ | n^2 |
| incidentEdges(v) | m | deg(v) | n |
| areAdjacent (v, w) | m | min(deg(v), deg(w)) | 1 |
| insertVertex(o) | 1 | 1 | n^2 |
| insertEdge(v, w, o) | 1 | 1 | 1 |
| removeVertex(v) | m | deg(v) | n^2 |
| removeEdge(e) | 1 | 1 | 1 |

Remember: $m = n(n-1)/2$ in worst case

Did we achieve today's Objectives?

- Graphs
- Graph ADT (What is it and why we need it)
- Graph Representations (ways to represent Graphs)