

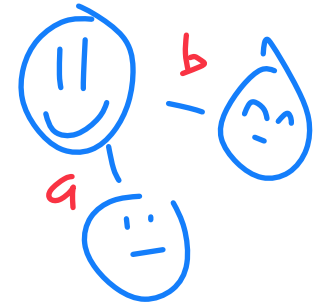
# Data Structures

## Graph Implementations 2

CS 225

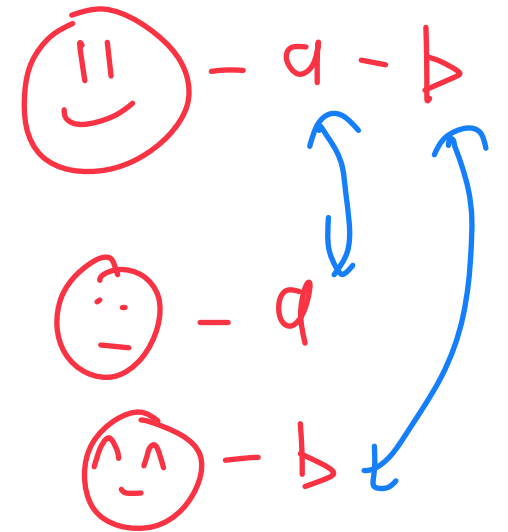
November 15, 2023

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# Announcements

Exam 5 topic list (correctly) posted

→ today! Graph implementation \*

Practice exam released (additional questions will be added) \*

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↳ kmin hash

↳ Skatling

Extra Credit Project check-in deadline modified

→ check if code works

↳ November 20th

→ Scheduled meetings

November 20th?  
21st?

# Learning Objectives

Discuss graph implementation and storage strategies



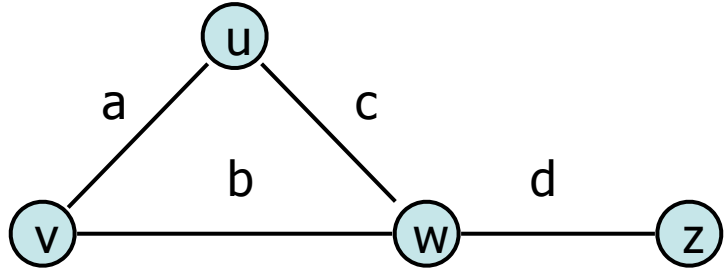
Introduce graph traversals



# Graph Implementation: Edge List

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

$O(n)$  list  
 $O(1)$  array or not LL



Big O

insertVertex(K key):

insertEdge(Vertex v1, Vertex v2, K key):

List Vertices  $|n|$   
 List Edges  $|m|$

removeVertex(Vertex v):

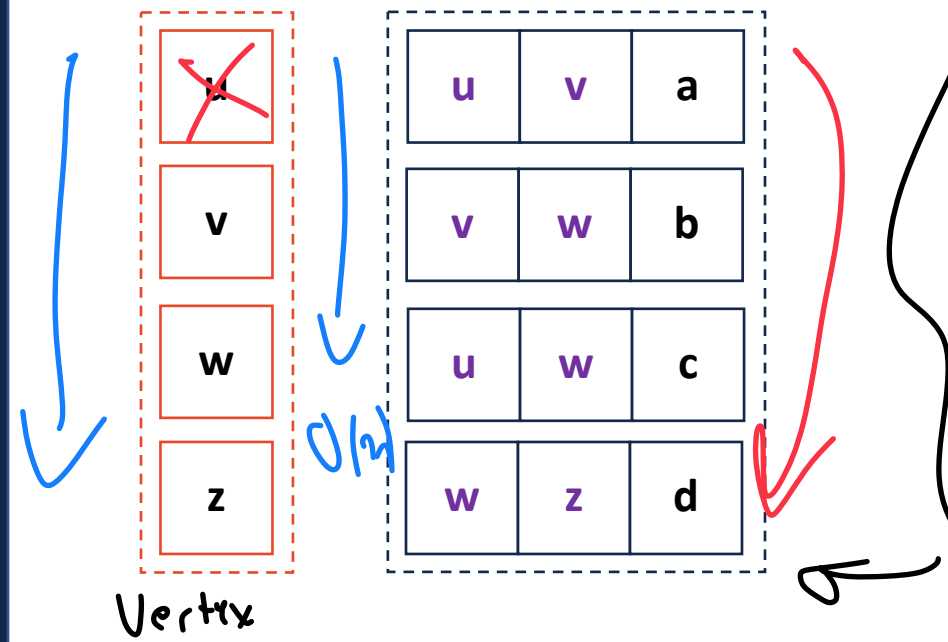
removeEdge(Vertex v1, Vertex v2, K key):

find & remove

incidentEdges(Vertex v):

areAdjacent(Vertex v1, Vertex v2):

$O(m)$



$O(n+m)$

$O(m)$

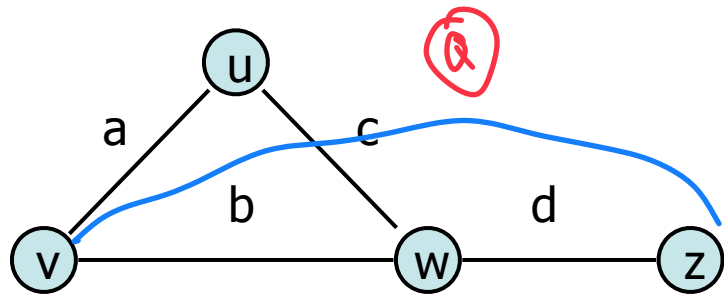
find all edges

$O(m)$

# Graph Implementation: Adjacency Matrix



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



insertVertex(K key):  $O(n)$  *weight*  
 insertEdge(Vertex v1, Vertex v2, K key):  $O(1)$

removeVertex(Vertex v):  $O(n)$   
 removeEdge(Vertex v1, Vertex v2, ~~K key~~):  $O(1)$

incidentEdges(Vertex v):  $O(n)$   
 areAdjacent(Vertex v1, Vertex v2):  $O(1)$   
 Great for dense graphs!

vertex list H.T.

Edges Adj matrix  $O(n^2)$

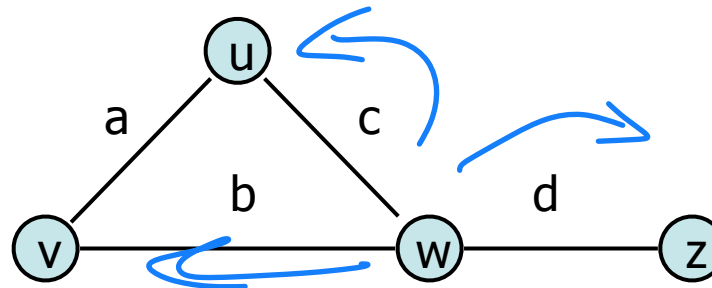
	u	v	w	z
u	-			
v	a	-		
w	b	c	-	
z	d			-

# Graph Implementations

We want something...

Faster than an edge list

*→ good for storage*

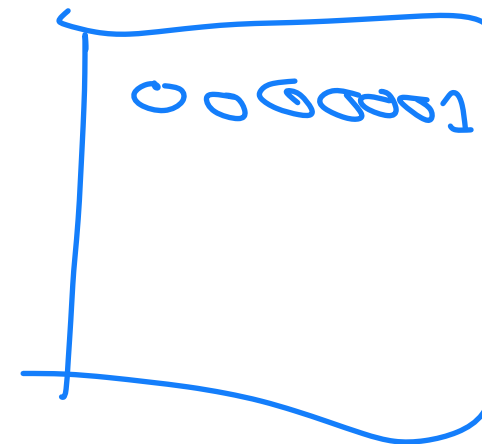


Less space than an adjacency matrix

*→ good for dense graphs  
→ direct edge queries*

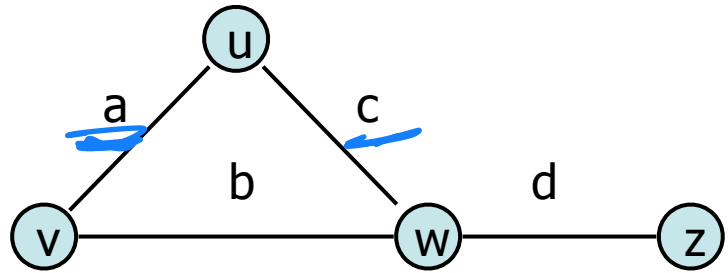
Particularly good at finding adjacent elements

Adj List (vertex)

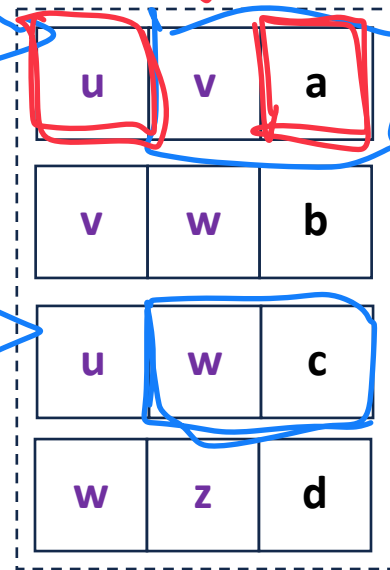
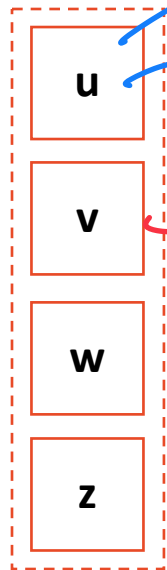


# Graph Implementation: Edge List + ?

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

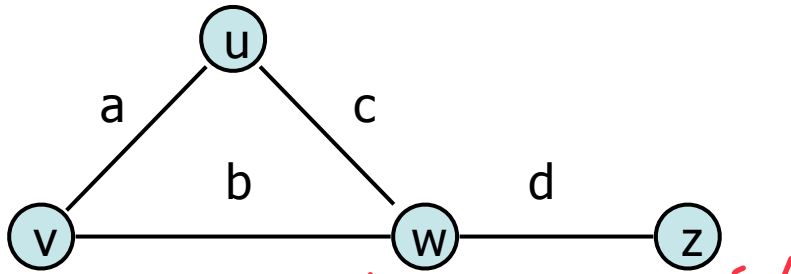


each vertex to know its outgoing edges



# Simple Adjacency List

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

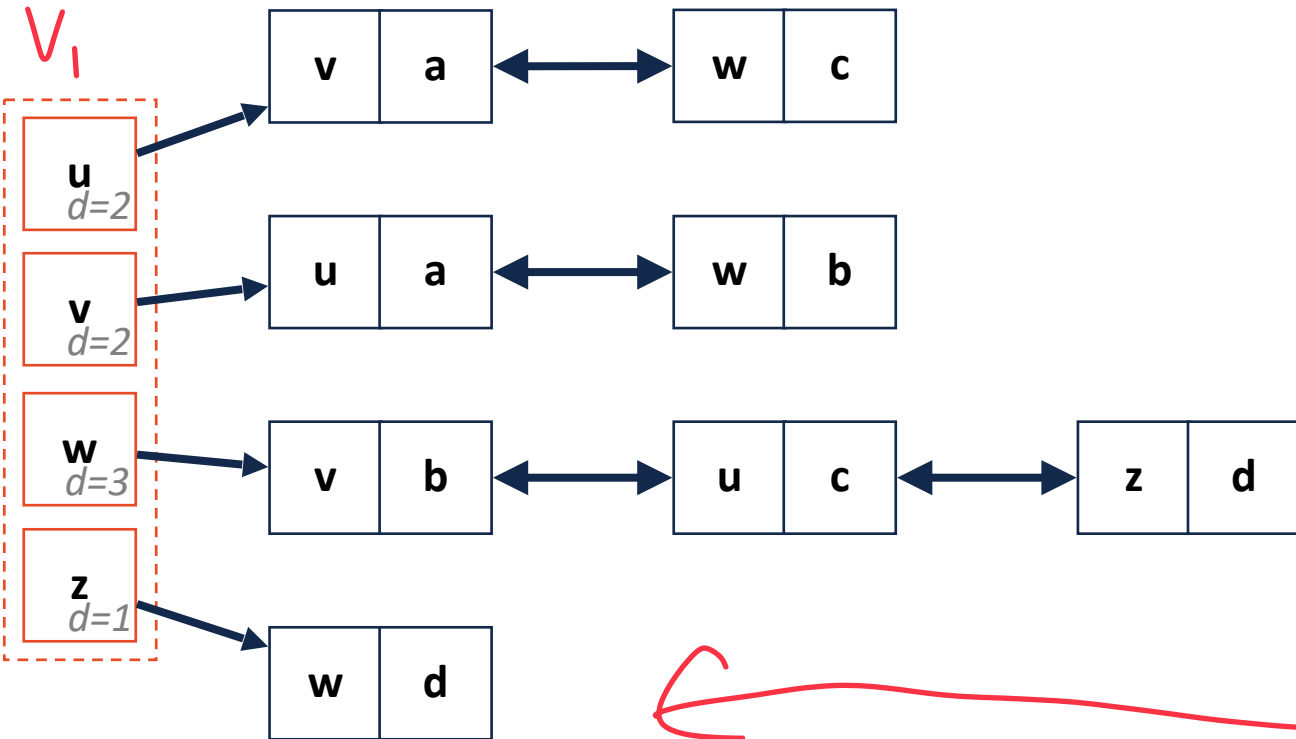


Vertex list  
H.T.

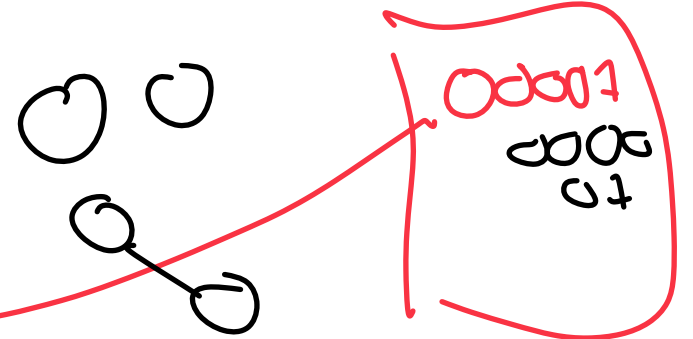
→ Linked list

V<sub>1</sub>

V<sub>2</sub> | w



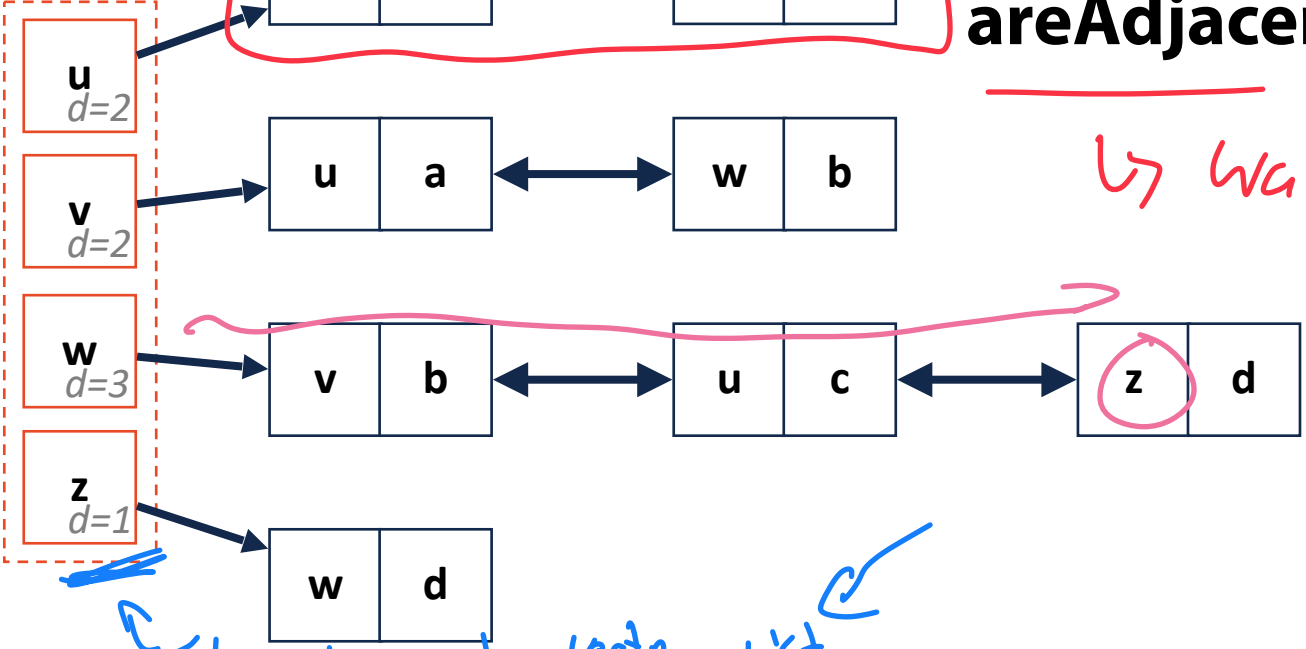
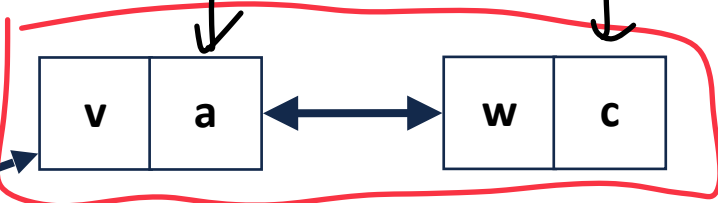
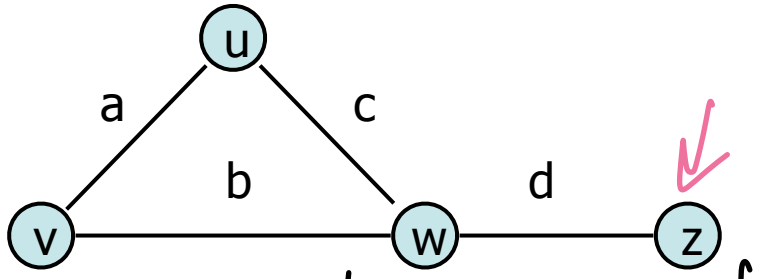
store





# Simple Adjacency List

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



Store degree in vertex list

$[d, c]$  edge weights  
 $[(v,w), (u,w)]$

incidentEdges(Vertex v):

↳ Return LL nodes  $O(1)$

Naive!

↳ Process  $\rightarrow O(\text{deg}(v)) \approx O(n)$

$n-1$  edges

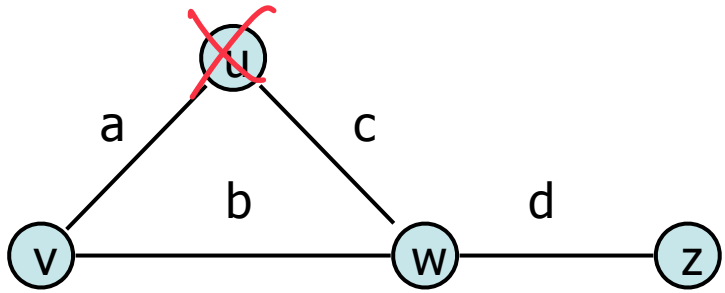
areAdjacent(Vertex v1, Vertex v2):  $(w, z)$

↳ Walk through linked list w/ min degree

$\text{Min}[\text{deg}(v_1), \text{deg}(v_2)] \times O(n)$

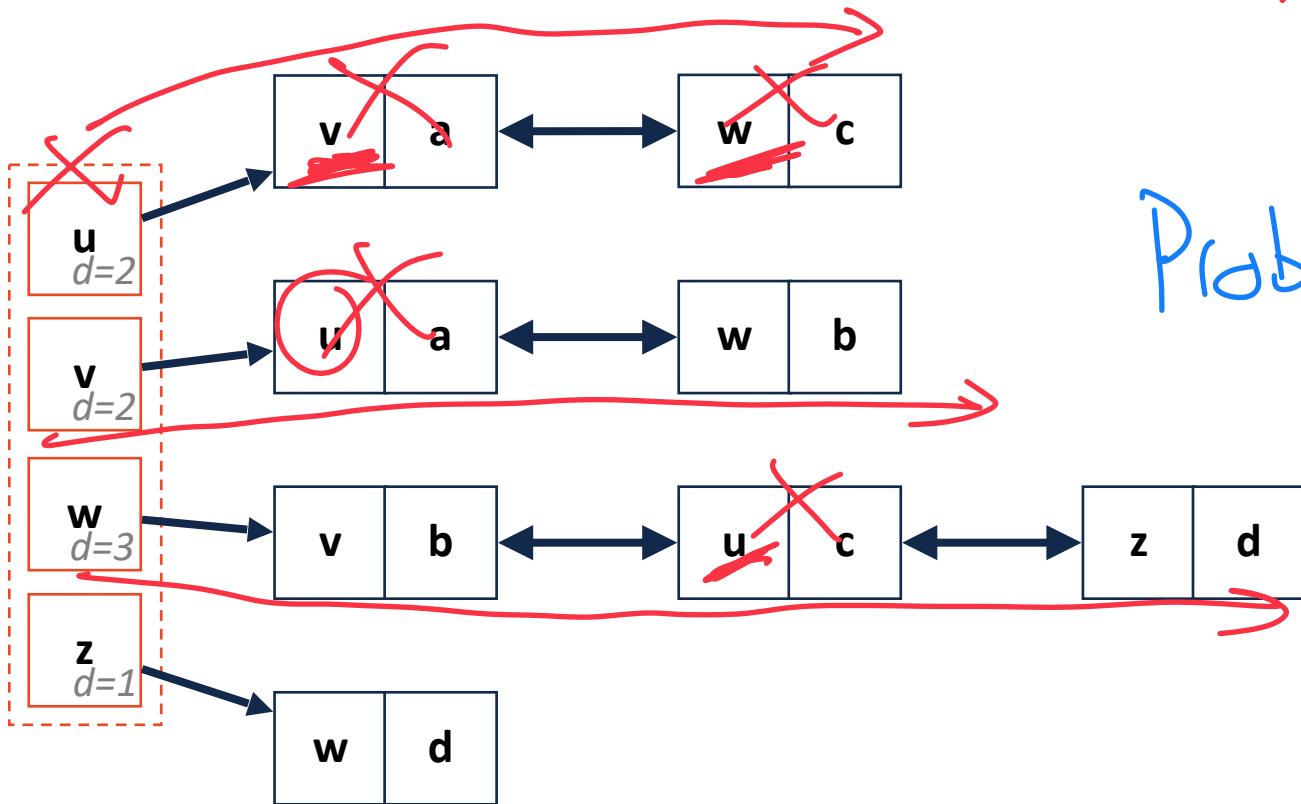
# Simple Adjacency List

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



**removeVertex(Vertex v):**

1) Walk down list Removing every Node  
↳ walk down every node we see & look for v



Problem: I have to walk through

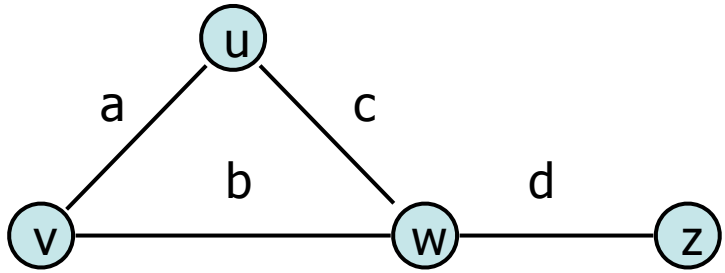
$\deg(v)$  LL. Each LL is  $\deg(v)$

↳  $O(n^2)$

# Simple Adjacency List



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



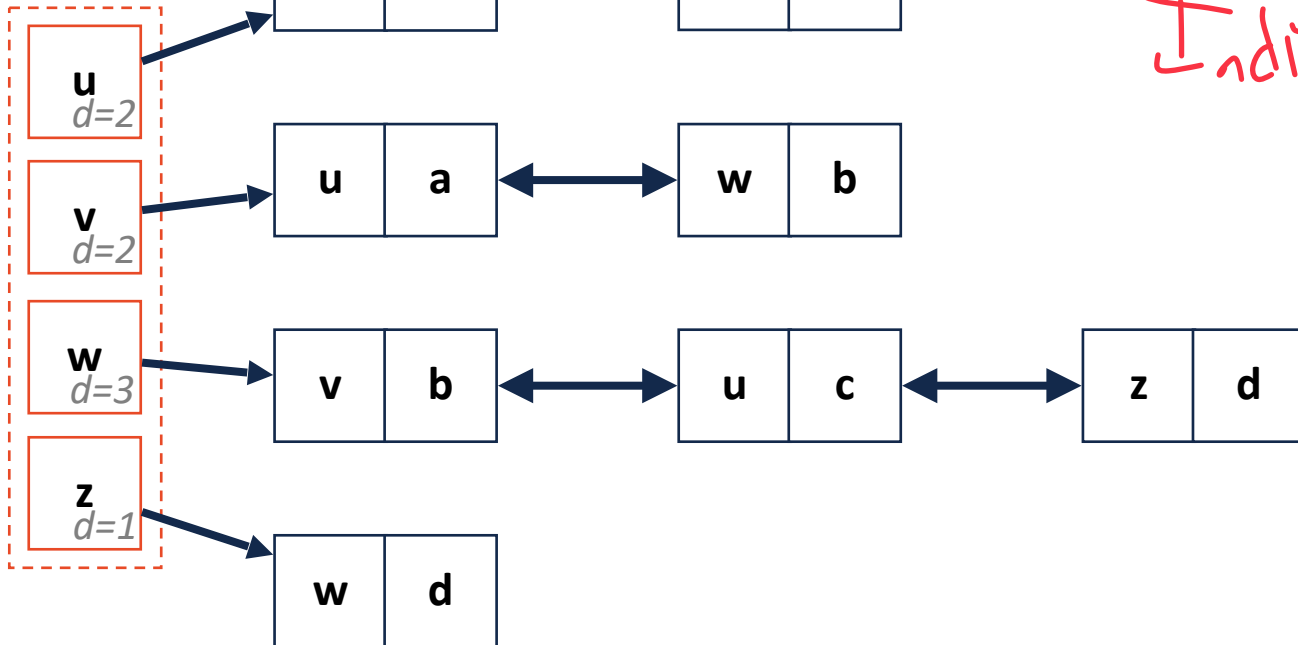
What's wrong with our implementation?

↳ No connections between vertices

↳ Everything is stored twice

How can we fix it?

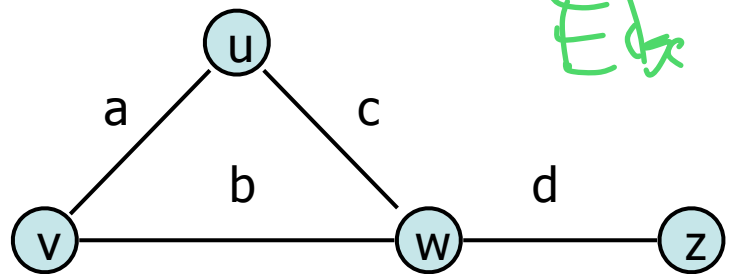
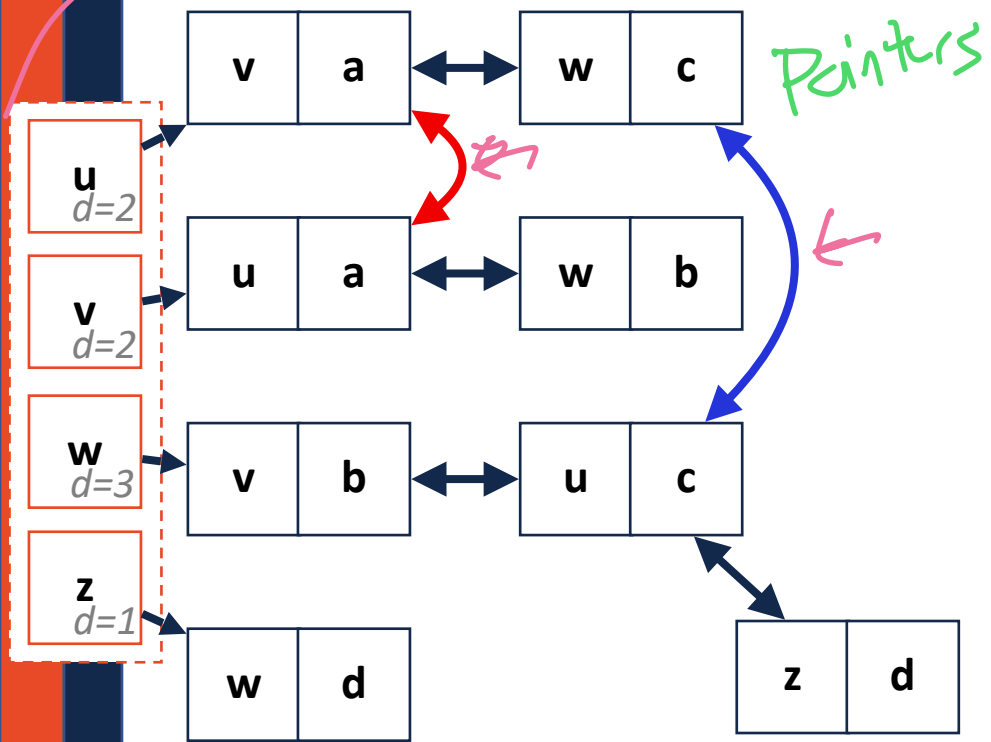
Indirection! (Pointers)



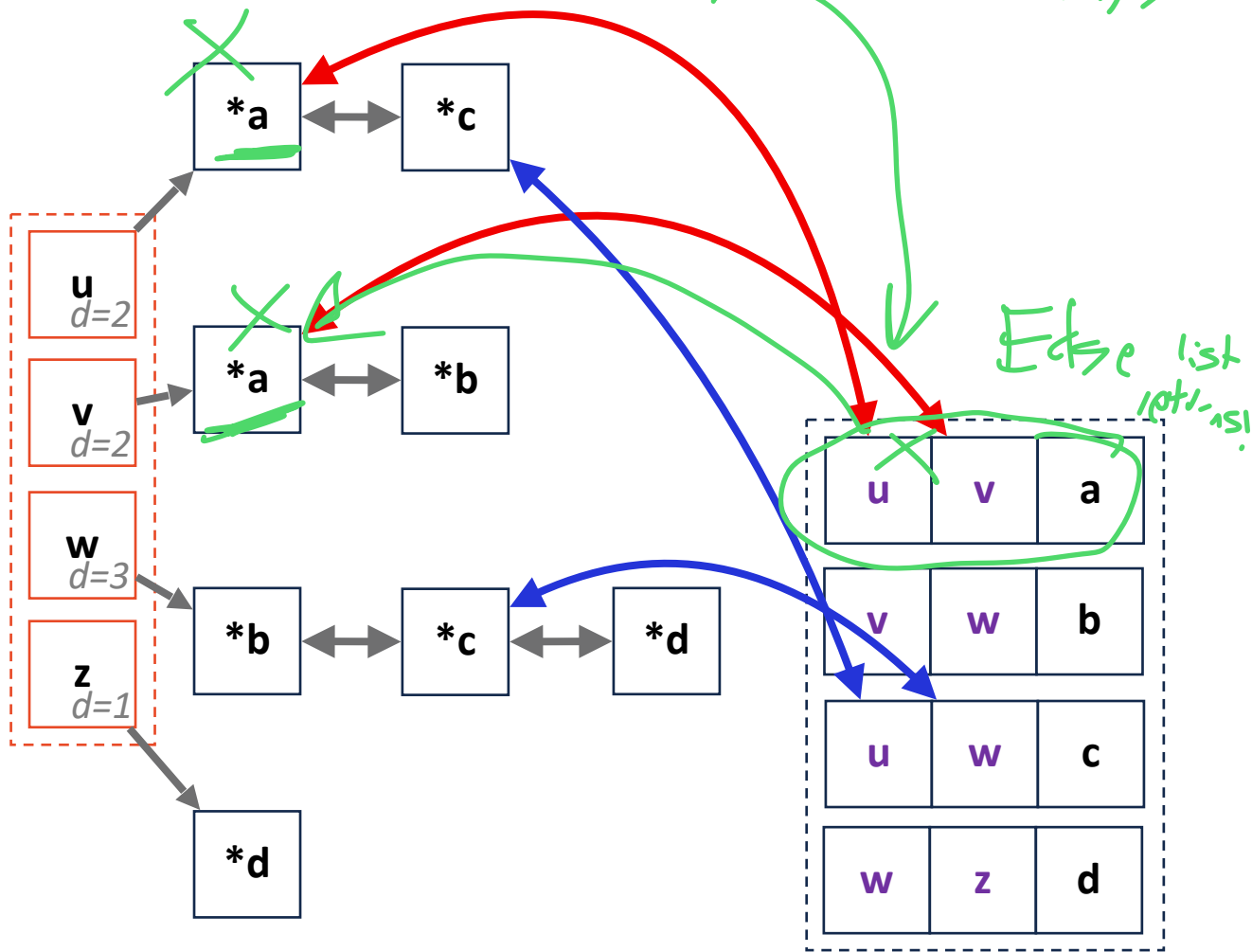
# Adjacency List

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

We had this

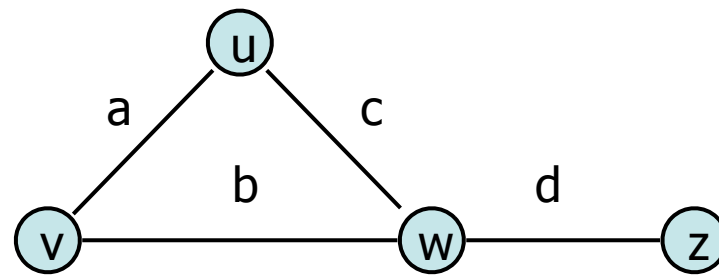


Edge list w/ pointers to end from edges



# Adjacency List

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

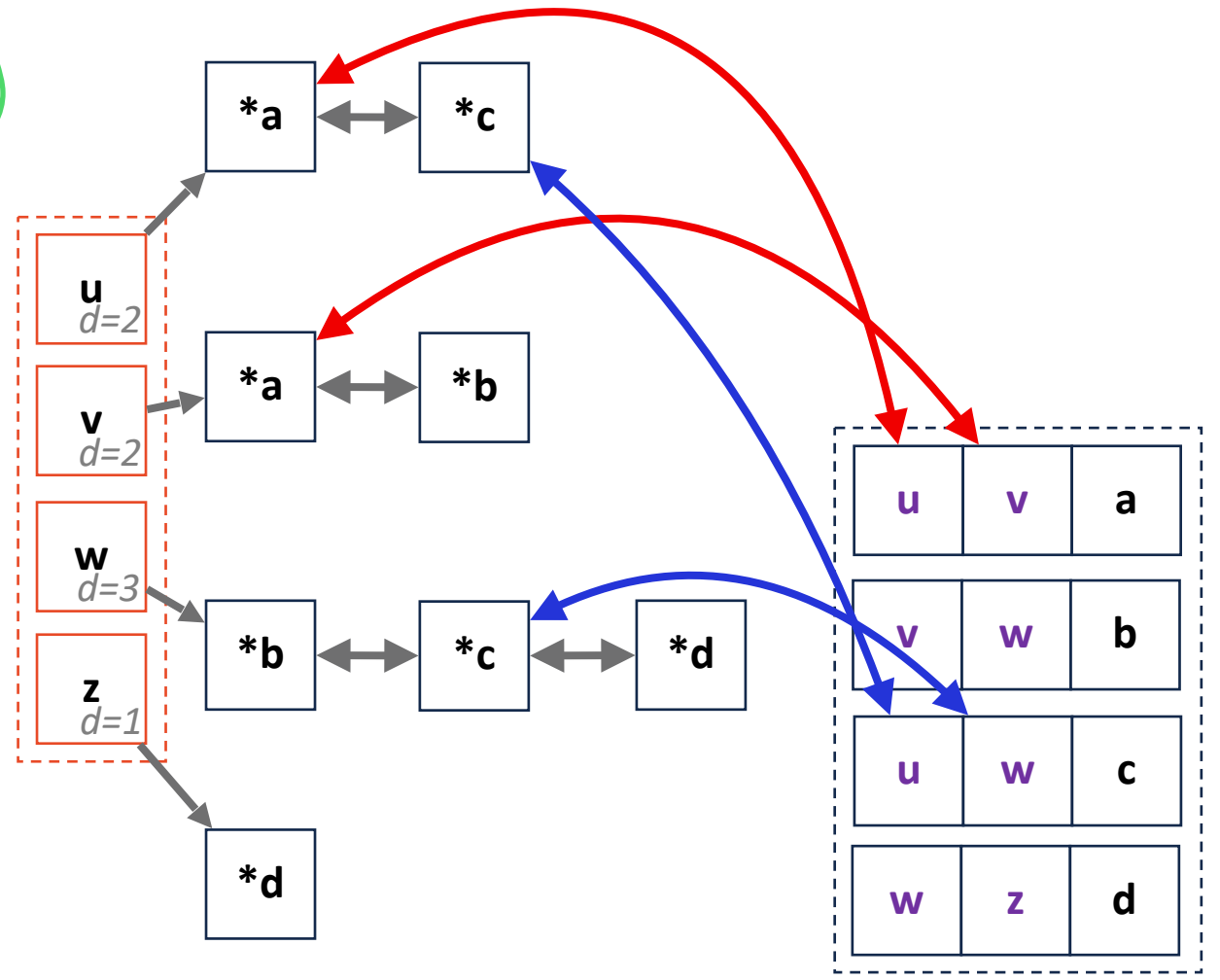


Adj List Node: Bidirectional LL (w/ tail pointer)  
3 pointers

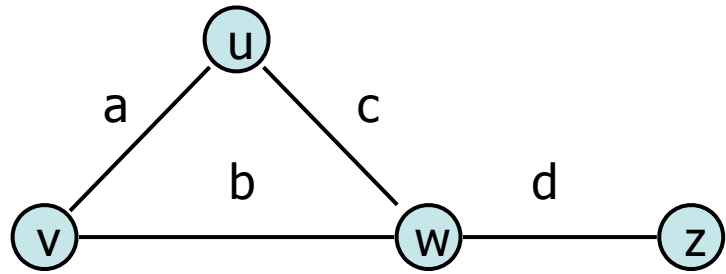
Prev	Edge	Next
------	------	------

Edge List: Edge list + 2 pointers

V1	V2	Weight
*V1	*V2	



# Adjacency List



## Vertex Storage:

↳ Hash table

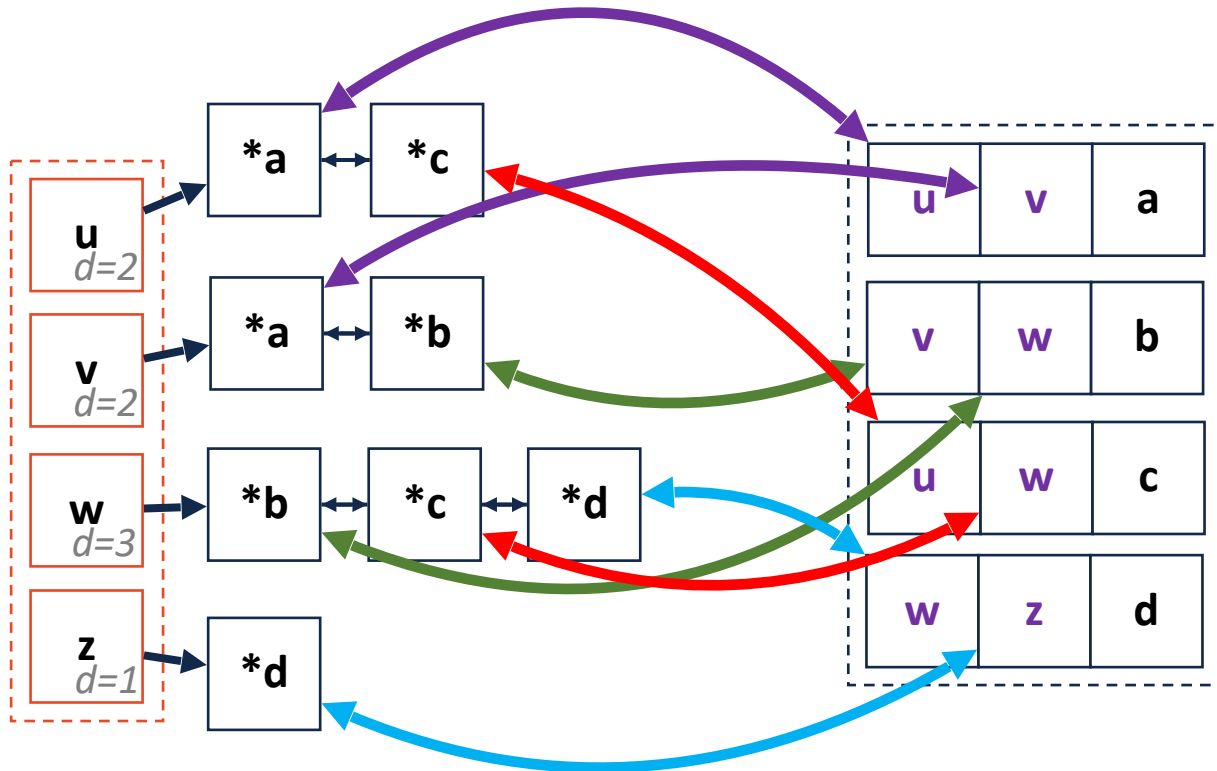
(Key = Vertex label, Val = adj List)



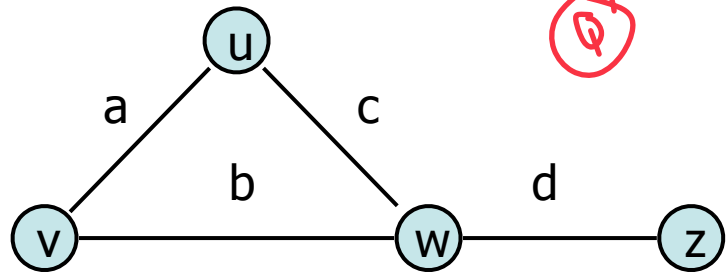
↳ Knows size of linked list

## Edge Storage:

Edge list + 2 pointers



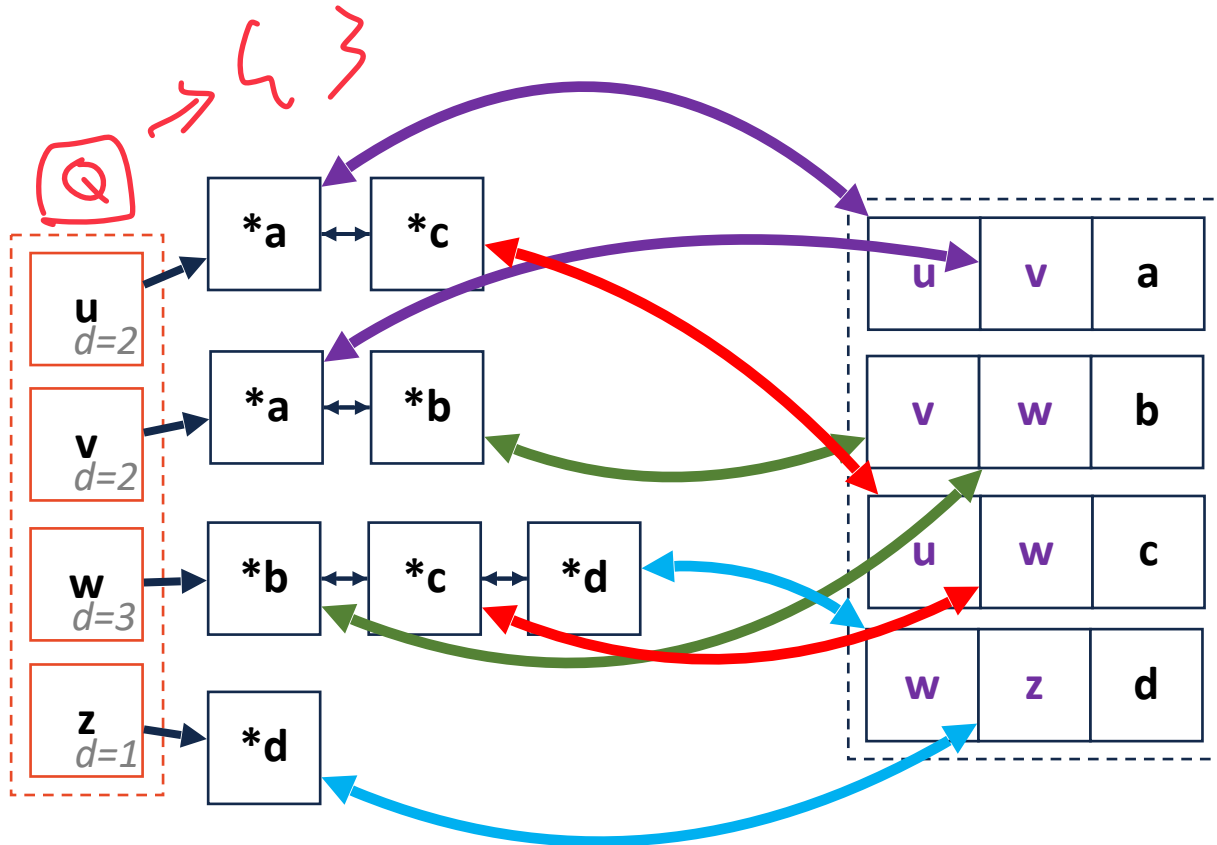
# Adjacency List



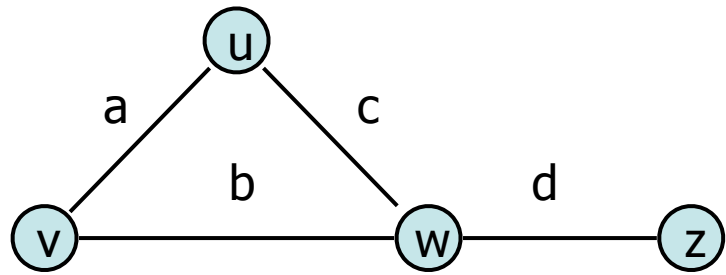
insertVertex(K key):

H.T.

$O(1)$



# Adjacency List

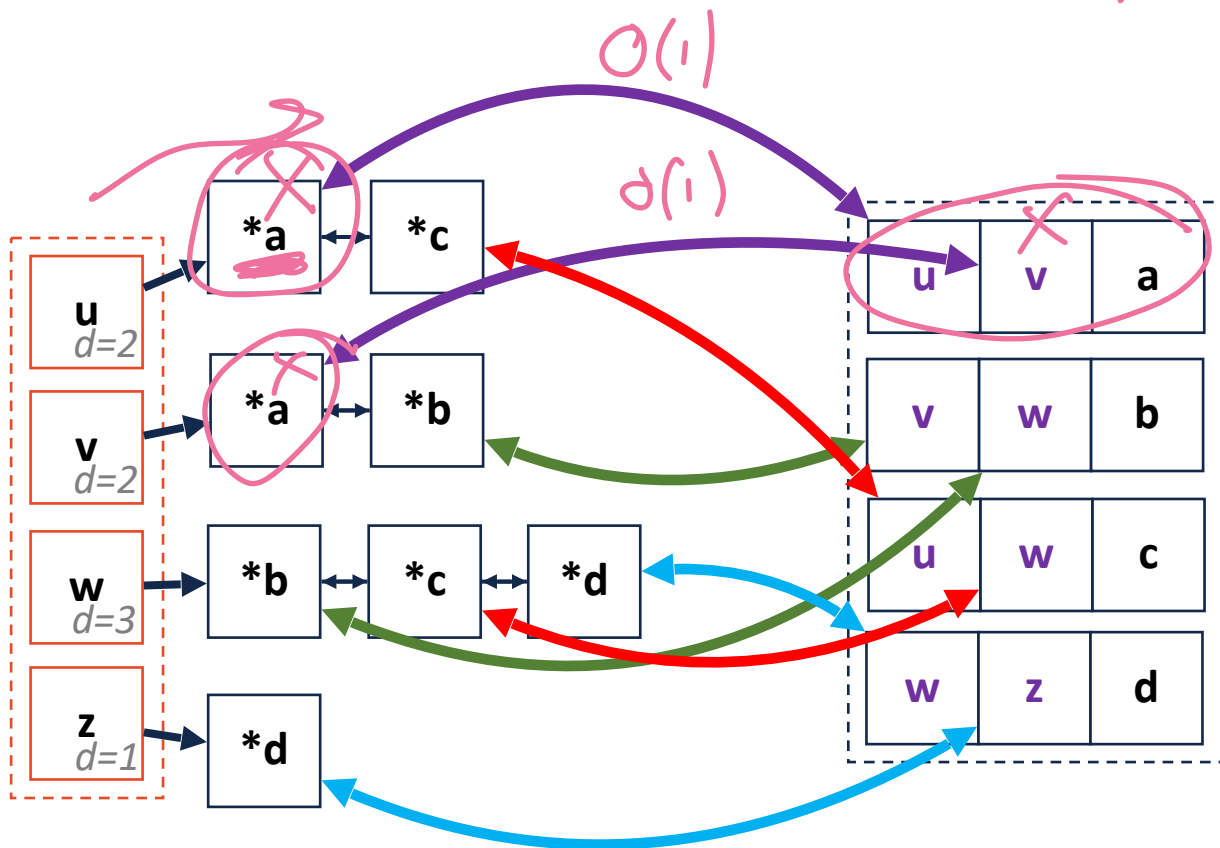


## removeVertex(Vertex v):

1) Remove every adj list node in  $V$

2) Look at edge & find match in other vertex LL

3) Remove edge



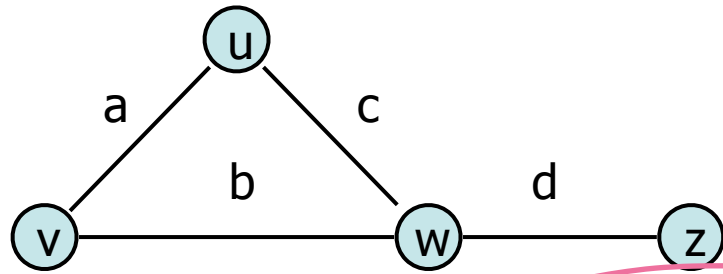
Connections are all  $O(1)$   
 $\geq$  things at most  
 Each edge is  $O(1)$  to remove

$\downarrow$   
 $\text{deg}(v)$  edges  $O(\text{deg}(v))$

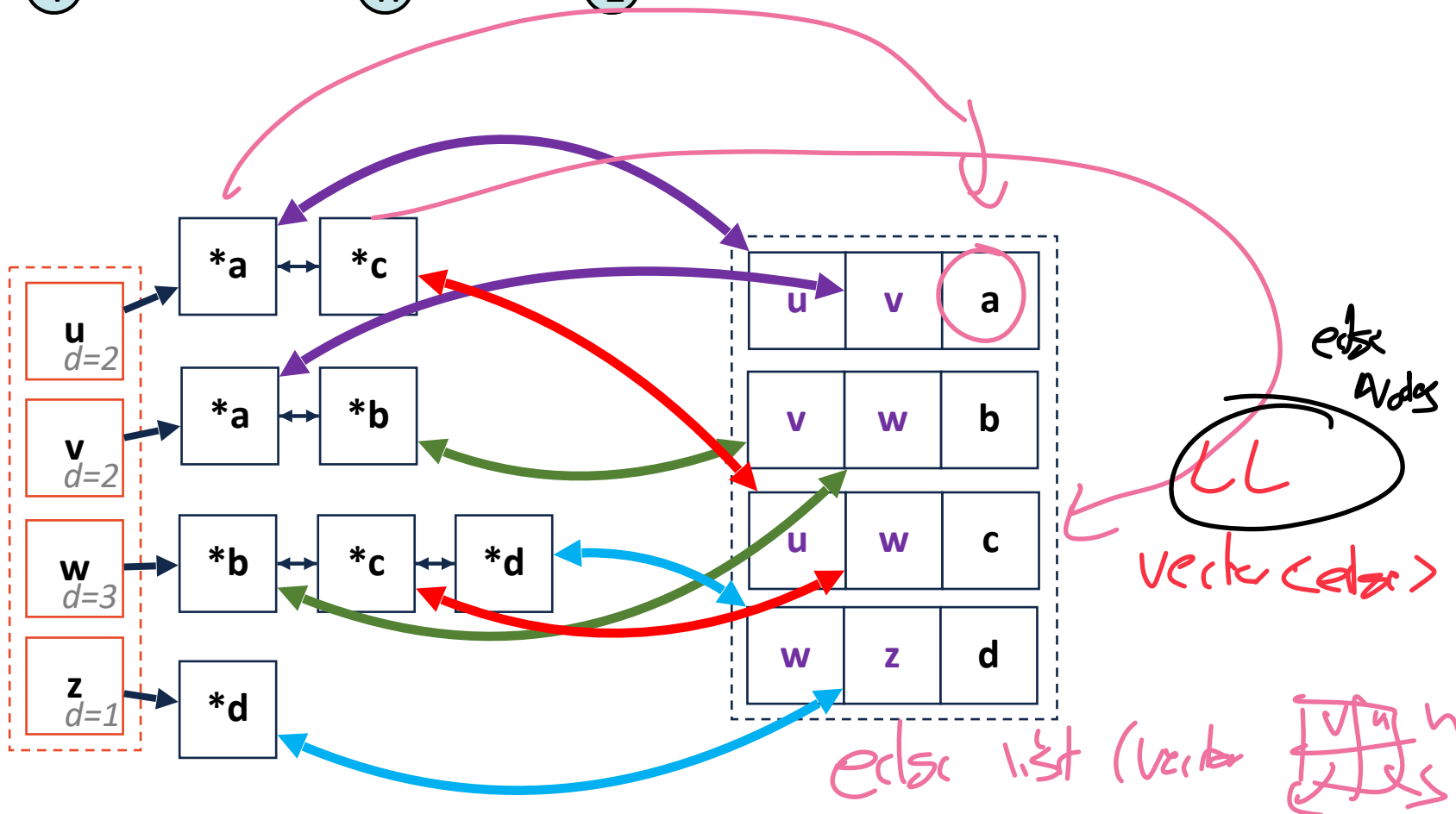


# Adjacency List

incidentEdges(Vertex v):



↳ unchanged btwn simple  
↳ deg(v)



$O(\text{deg}(v))$   
 $\ll$   
 $O(n)$

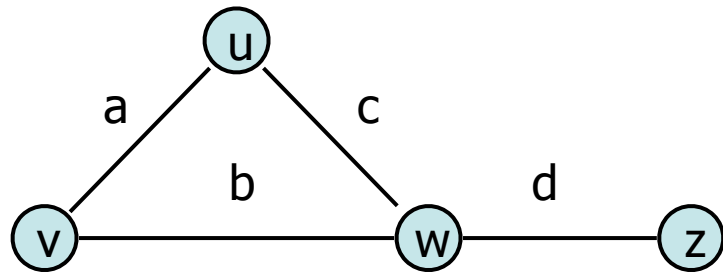
edges v deg  
 LL  
 vertex color

edges list (vertex 

v	w
u	z

)

# Adjacency List

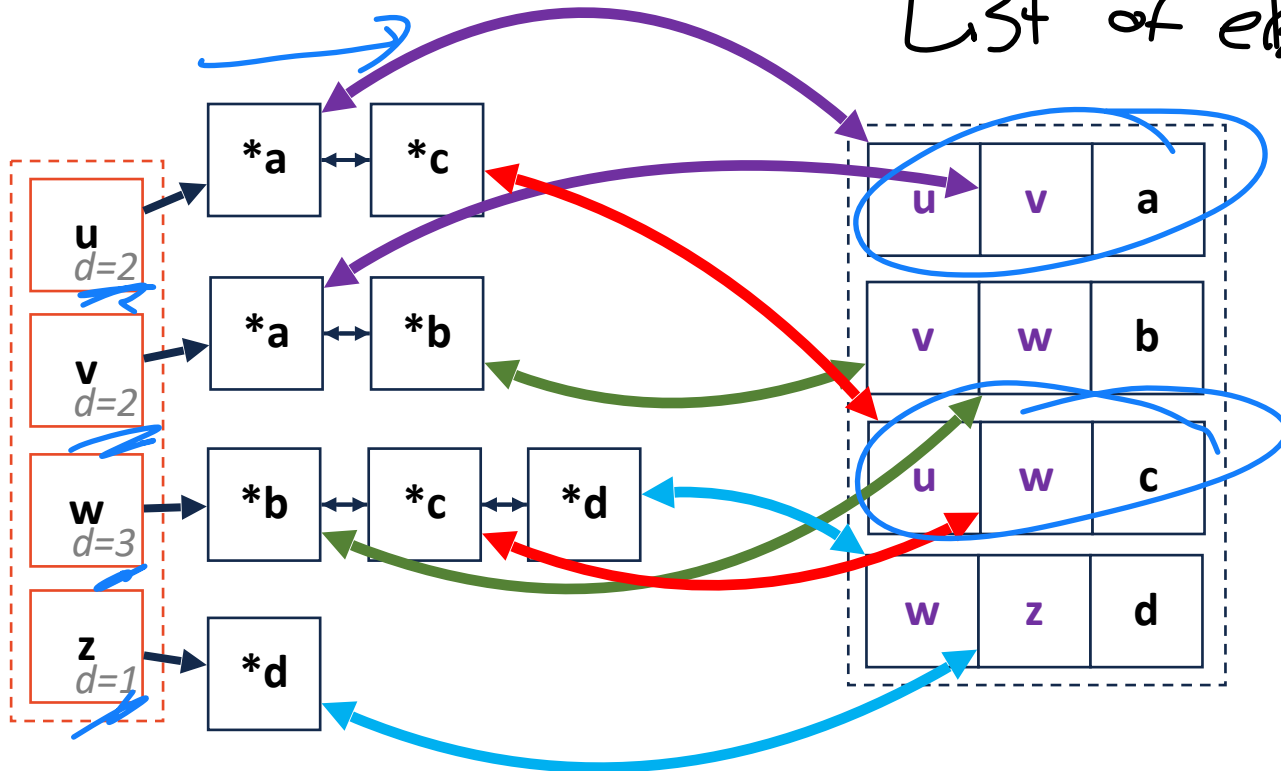


areAdjacent(Vertex v1, Vertex v2):

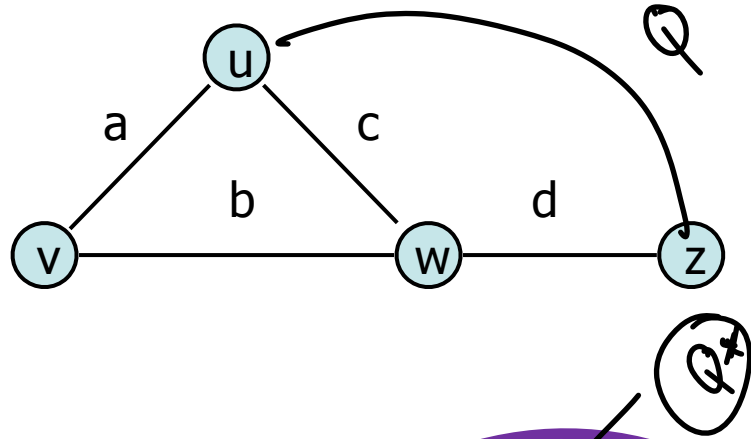
$\hookrightarrow \text{deg}(u)$

$\text{Min}(\text{deg}(v_1), \text{deg}(v_2))$

List of edges

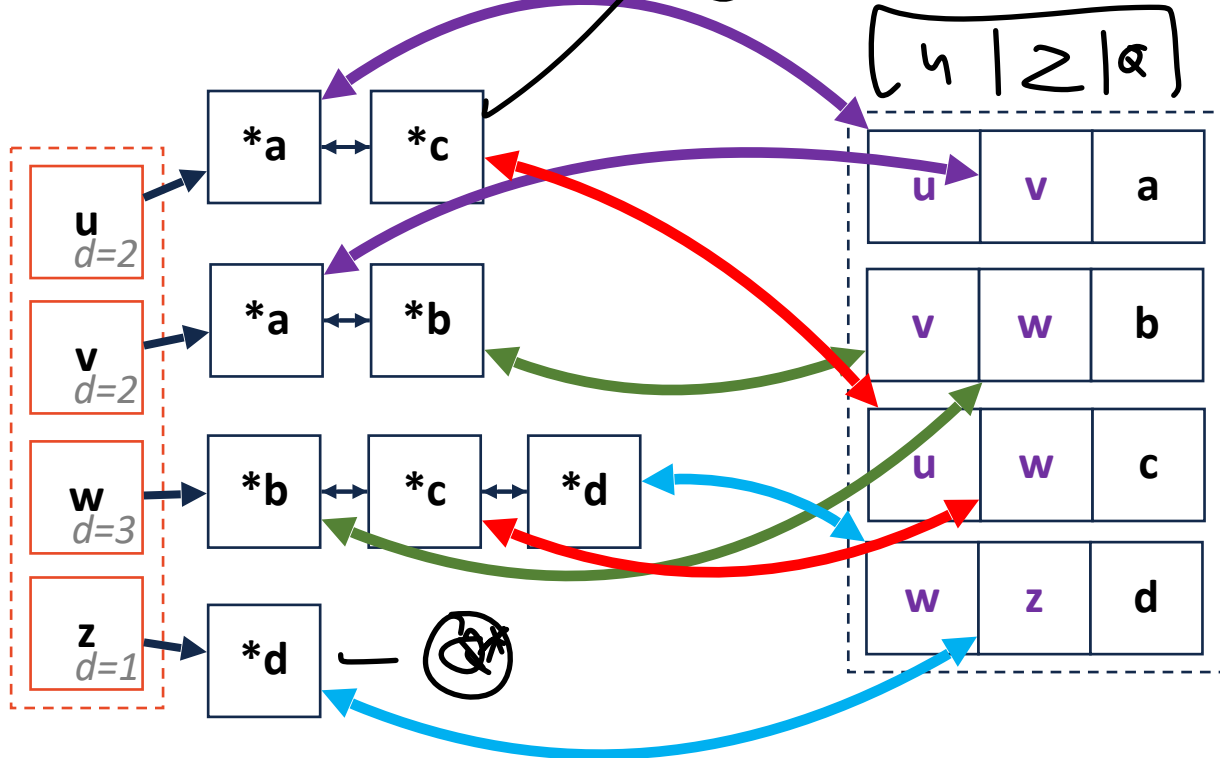


# Adjacency List



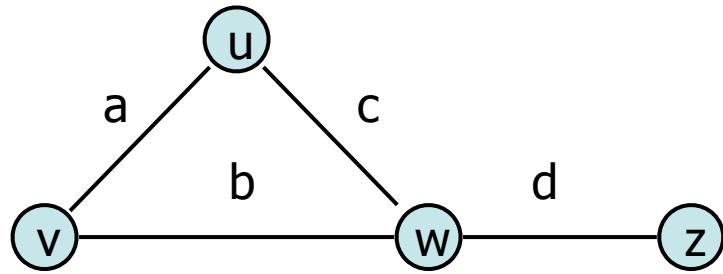
**insertEdge(Vertex v1, Vertex v2, K key):**

2 key pointers insert  $O(1)$   
 +  
 1 edge insert  $O(1)^*$

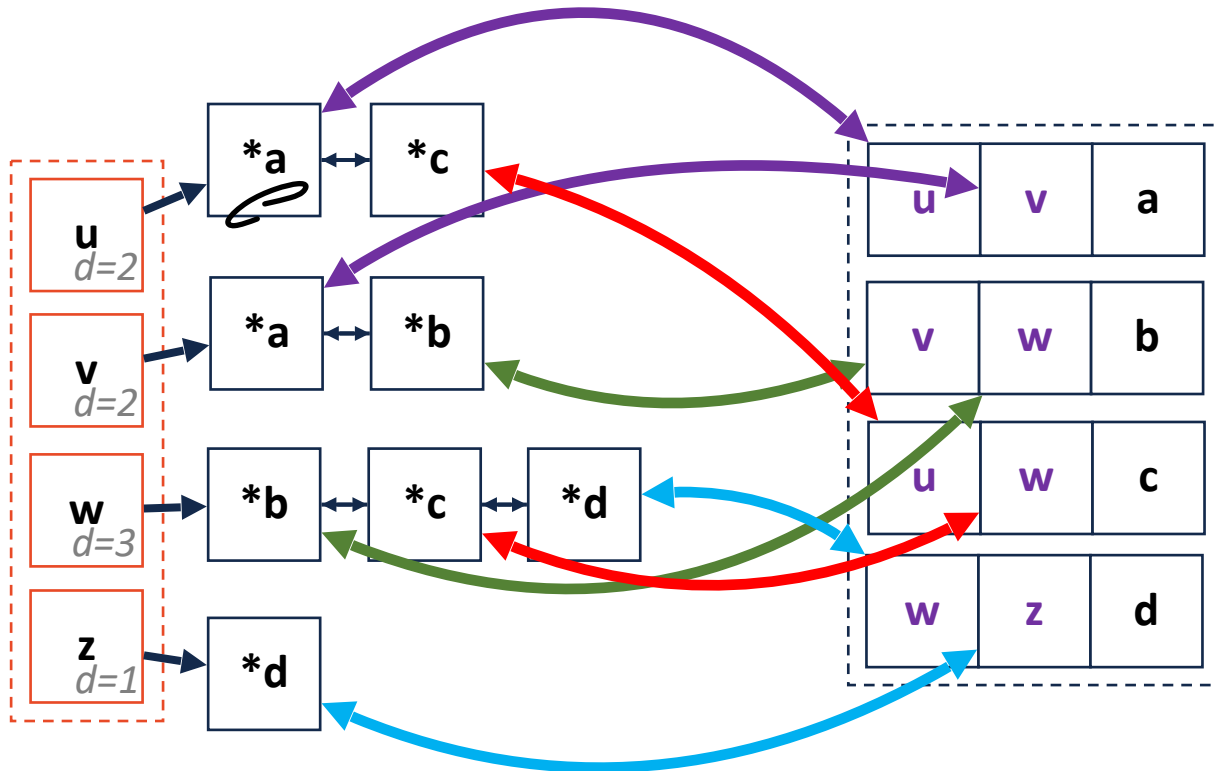


# Adjacency List

`removeEdge(Vertex v1, Vertex v2, key):`



$$\min(\text{deg}(v_1), \text{deg}(v_2))$$



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

we will review on Friday



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

tail pointer or amortized

Min otherwise hash table for vertex

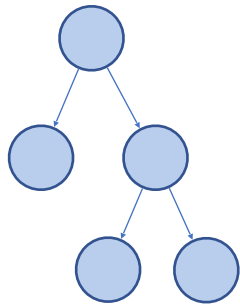
SPARSE

# Graph Traversals

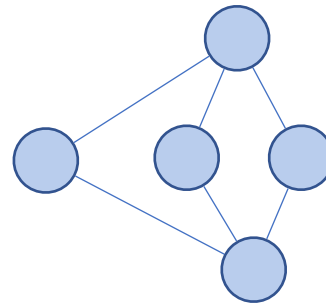
There is no clear order in a graph (even less than a tree!)

How can we systematically go through a complex graph in the fewest steps?

Tree traversals won't work — lets compare:

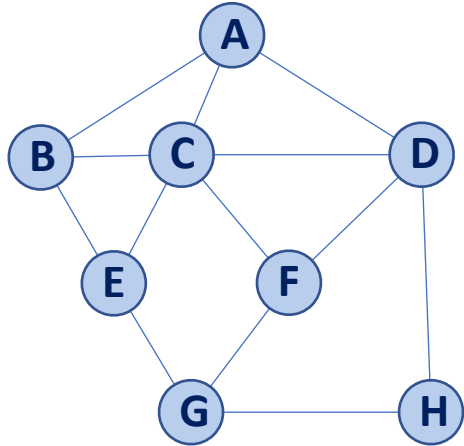


- Rooted
- Acyclic
- 

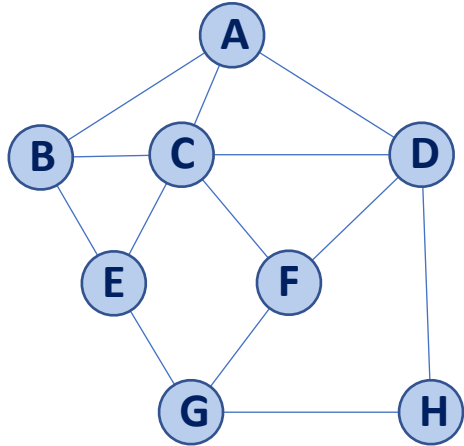


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# Traversal: BFS



# Traversal: BFS



v	d	P	Adjacent Edges
A			B C D
B			A C E
C			A B D E F
D			A C F H
E			B C G
F			C D G
G			E F H
H			D G

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