
Concurrent Wait-Free Graph Snapshots using Multi-Versioning

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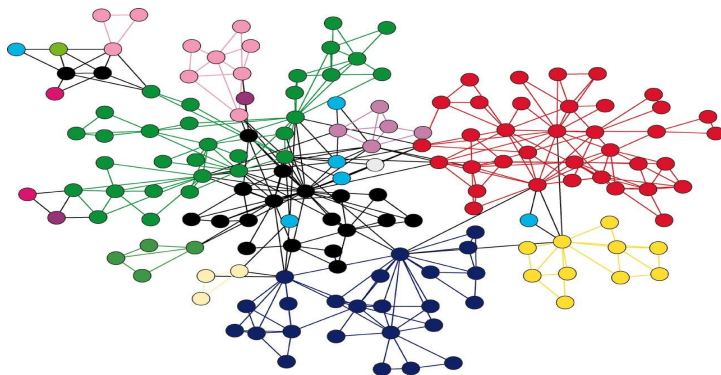
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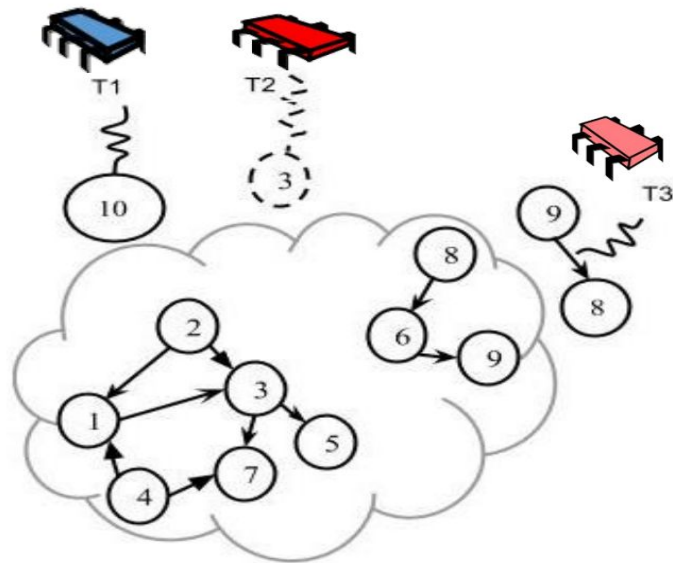
Graphs

- Graphs provide a visual representation of relationships and connections in data, making complex structures easier to understand.
- Graphs are ideal for modeling various relationships such as social networks, web links, and dependencies between tasks.
- Graphs allow for flexible data representation, enabling the modeling of diverse scenarios and real-world interactions.



Concurrent Graphs:

- In applications like social media analytics and network monitoring, concurrent graphs enable real-time analysis of dynamic data.
- Concurrent graphs are essential in large-scale systems, ensuring scalability and efficient processing of data in parallel.
- Concurrent graphs optimize resource utilization in multi-core processors, enhancing the performance of graph-based algorithms.



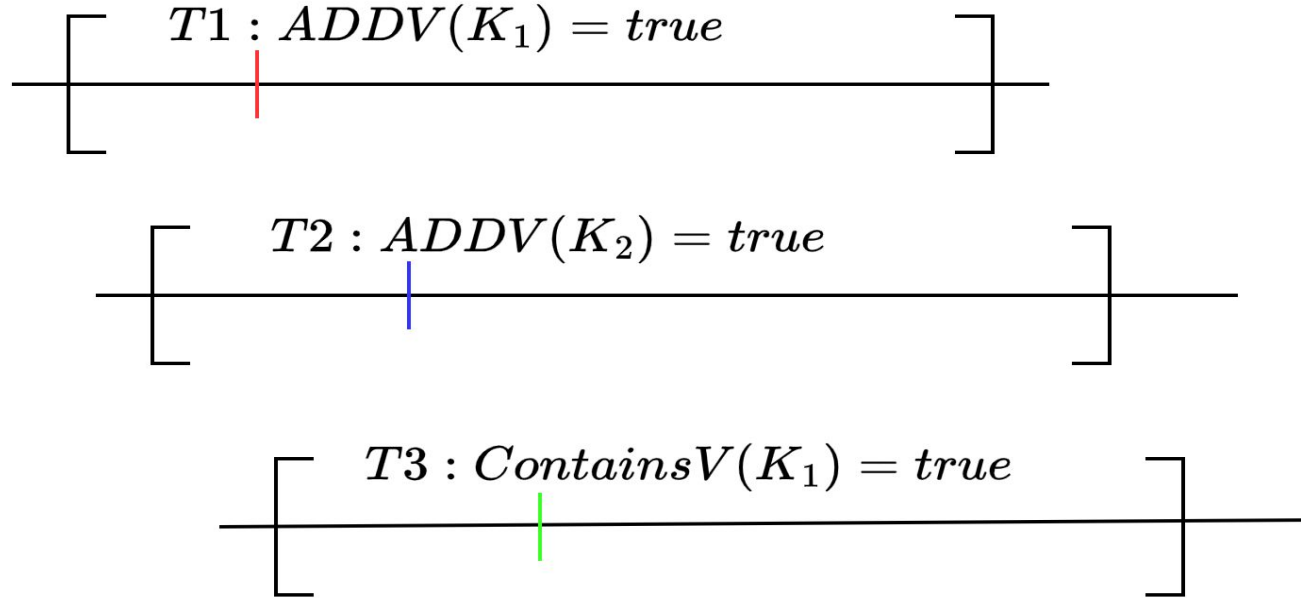
Correctness (Consistency)

- The ADT operations implemented by the data structure are represented by their invocation and return steps.
- For an arbitrary concurrent execution of a set of ADT operations should satisfy the consistency framework **Linearizability**.

Linearizability

- Assign an atomic step as a linearization point (LP) inside the execution interval of each of the operations and show that the data structure invariants are maintained across the LPs.
- An arbitrary concurrent execution is equivalent to a valid sequential execution obtained by ordering the operations by their LPs.

Linearizability Example



Non-Blocking Progress Condition

An execution is said to be Non-Blocking if it doesn't blocks the execution of other threads.

- **Obstruction Free:** A thread is guaranteed to finish in a finite number of steps in isolation.
- **Lock-Freedom:** Atleast one thread should be able to finish in the finite number of steps.
- **Wait-Freedom:** All threads should be able to finish in a finite number of steps.

Related Work

- Chatterjee et al.^a
 - Proposed a Lock-Free dynamic unbounded unweighted graph.
 - Used Lock-Free Linked Lists to store vertices and edges.
 - Used obstruction free method to perform the partial snapshot on the graph.
- Chatterjee et al.^b
 - Extended the previous work for speed up.
 - Proposed a Lock-Free dynamic unbounded weighted graph.
 - Used Lock-Free Hash Tables to store vertices and Binary Search tree to store edges.
 - Used obstruction free method to perform the partial snapshot on the graph.
- Bhardwaj et al.^c
 - Extended the previous work with a wait-free snapshot operation.
 - Used wait-free snapshot algorithm to perform the complete snapshot of the graph.
 - Snapshot of the graph is used to perform the graph analytics operation.

^a **“A Simple and Practical Concurrent Non-blocking Unbounded Graph with Reachability Queries”**, Bapi Chatterjee, Sathya Peri, Muktikanta Sa, Nandini Singhal in the 20th International Conference on Distributed Computing and Networking (ICDCN), Bangalore, India, January 2019.

^b **“Non-blocking dynamic unbounded graphs with worst-case amortized bounds”**, Bapi Chatterjee, Sathya Peri, Muktikanta Sa, Manogana In: International Conference on Principles of Distributed Systems (2021)

^c **“Non-blocking Dynamic Unbounded Graphs with Wait-Free Snapshot”**, Gaurav Bhardwaj, Sathya Peri, and Pratik Shetty: 25th International Symposium on Stabilization, Safety, and Security (2023)

Drawback:

- Current Literature supports obstruction free partial snapshot or wait-free complete snapshot.
- As a result, a partial snapshot operation may continuously get interrupted
 - Hence may never terminate.
- Complete Snapshot is costly as compared to the partial snapshot.
 - Graph analytics operation which requires partial snapshot still has to undergo complete snapshot.

Motivation

- To Construct a **wait-free partial** Snapshot for an Unbounded graph while allowing concurrent non-blocking (lock-free) *update* methods.

Multiversioning:

- A multiversion object maintains its previous versions, so threads can have access to the history of the object.
- Widely used in:
 - Database
 - STM
 - Concurrent Data structure
- Threads can have access to the history of the object.
- Allows to update the data structure without hindering the snapshot.

Graph Data Structure:

- Each vertex in the graph is stored as **Vnode** in a concurrent lock-free resizable hash table.
- Each **Vnode** has a key and a pointer to the **vertex version** list.
- Each node (**Vnode_version**) in the vertex version list contains the pointer to the corresponding edge list stored in a lock-free linked list.
- Each **Vnode_version** node contains the insert timestamp and a delete timestamp.

```
int global_ts

class VNode{
    int k
    Vnode_version* vhead
}
```

```
class Vnode_version{
    int k
    int insert_ts
    int delete_ts
    Enode* elist
    Vnode_version* next_ver
}
```

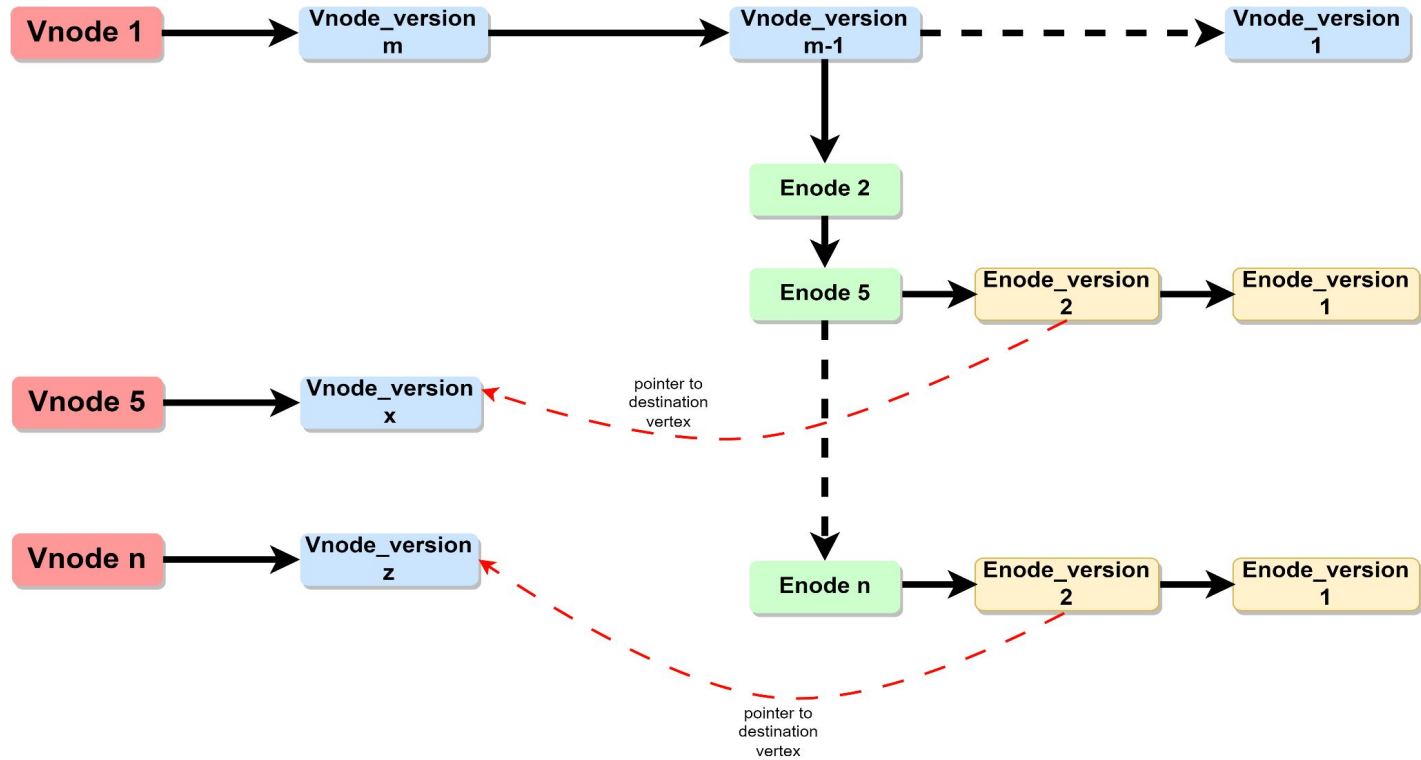
Graph Data Structure:

- Each edge is stored as **ENode** in a concurrent lock-free linked list (edge list) associated with each version node.
- ENode stores the key of the destination vertex and the pointer to the edge version list.
- Each node (ENode_version) in the edge version list contains weight, insert timestamp and delete timestamp.
- ENode_version points to the next version and also stores the reference to the destination Vnode_version.

```
class ENode{  
    int l  
    ENode* enext  
    ENode_version* ehead  
}
```

```
class ENode_version{  
    int weight  
    int insert_ts  
    int delete_ts  
    Vnode_version* dest_ver_node  
    ENode_version* next_ver  
}
```

Graph Data Structure

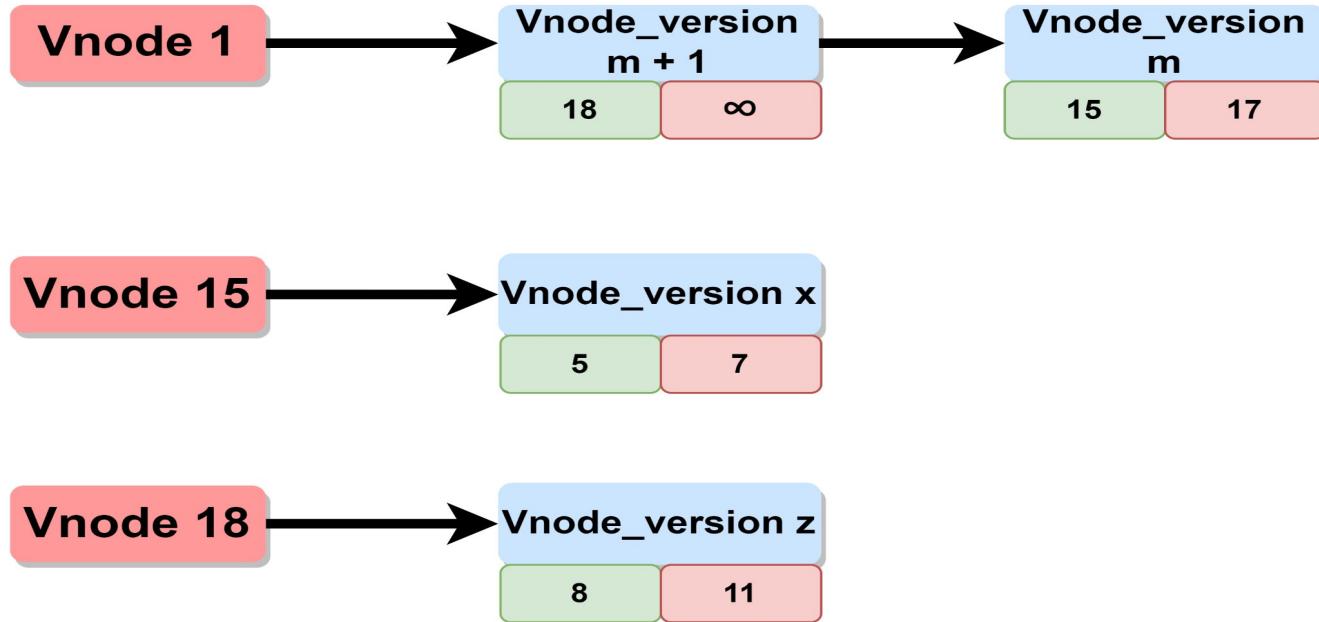


ADT:

- **AddVertex(k)**
- **RemoveVertex(k)**
- **AddEdge(i, j, w)**
- **RemoveEdge(i, j)**
- **ContainsVertex(k)**
- **ContainsEdge(i, j)**
- **BFS(v)**
- **SSSP(v)**
- **Snapshot()**

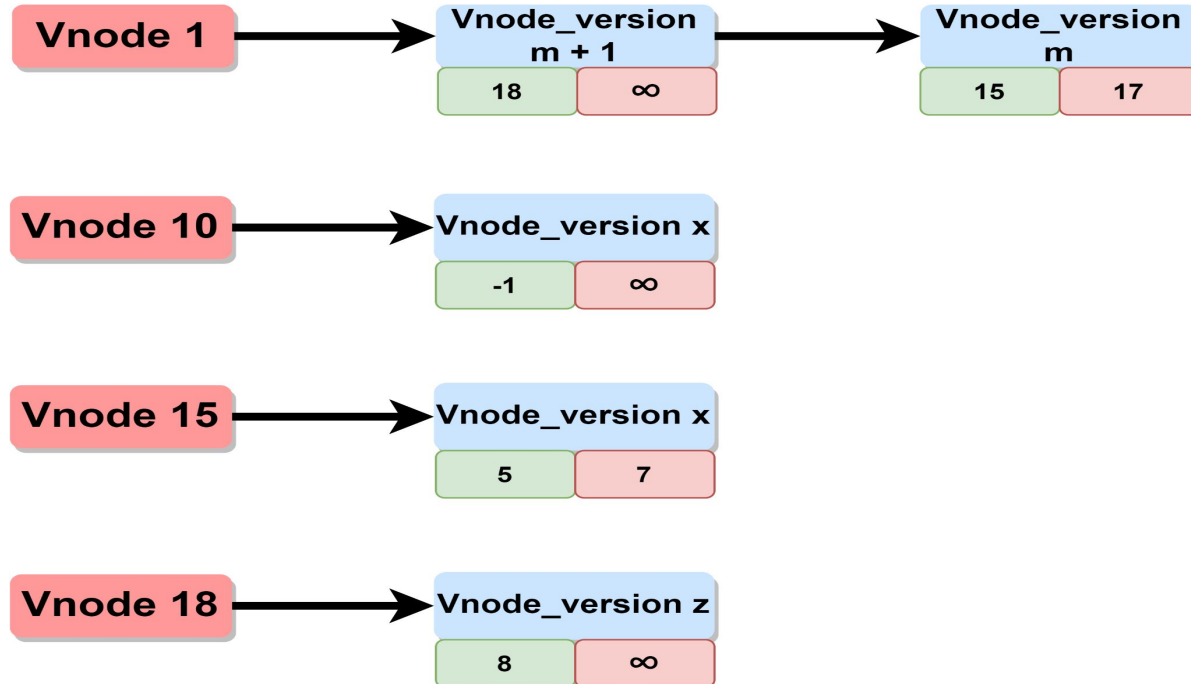
Addvertex(10) : Case-1

- Vnode 10 doesn't Exist



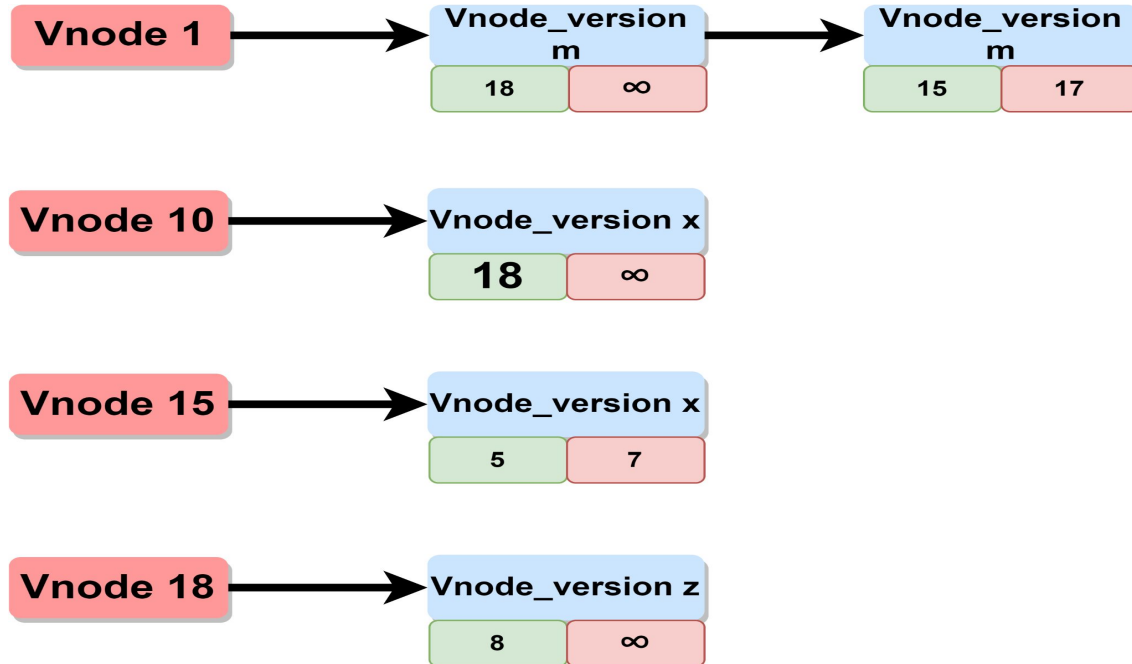
Addvertex(10) : Case-1

- Vnode 10 is inserted with insert_ts initialized to -1



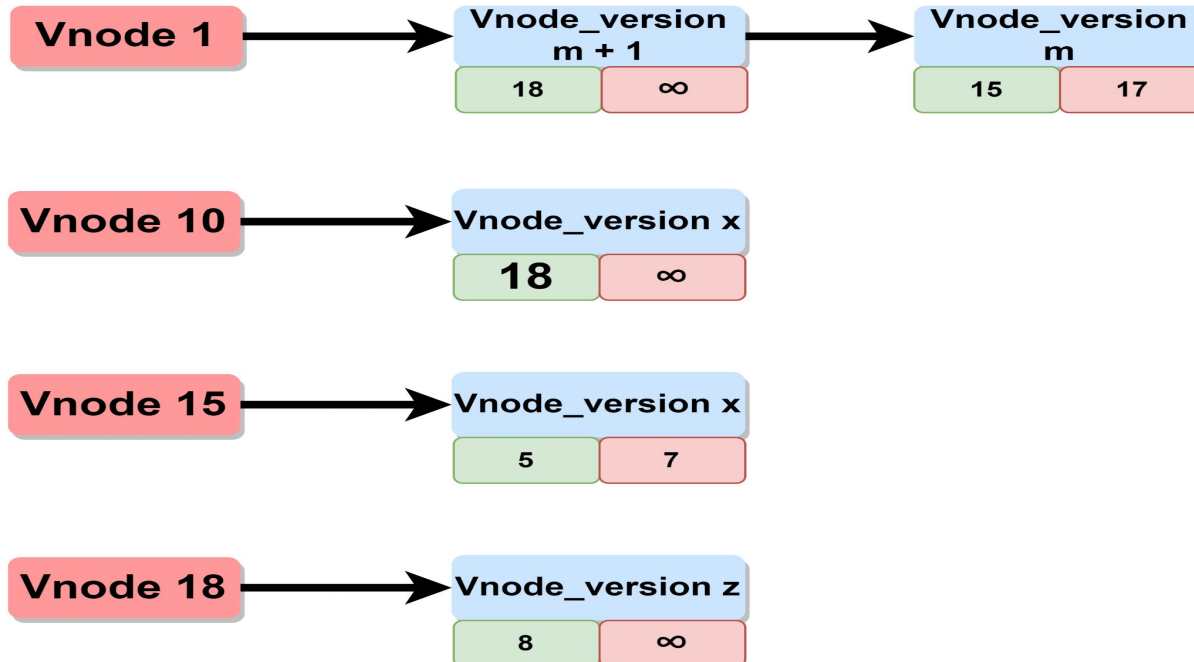
Addvertex(10) : Case-1

- Insert timestamp is set to current global timestamp



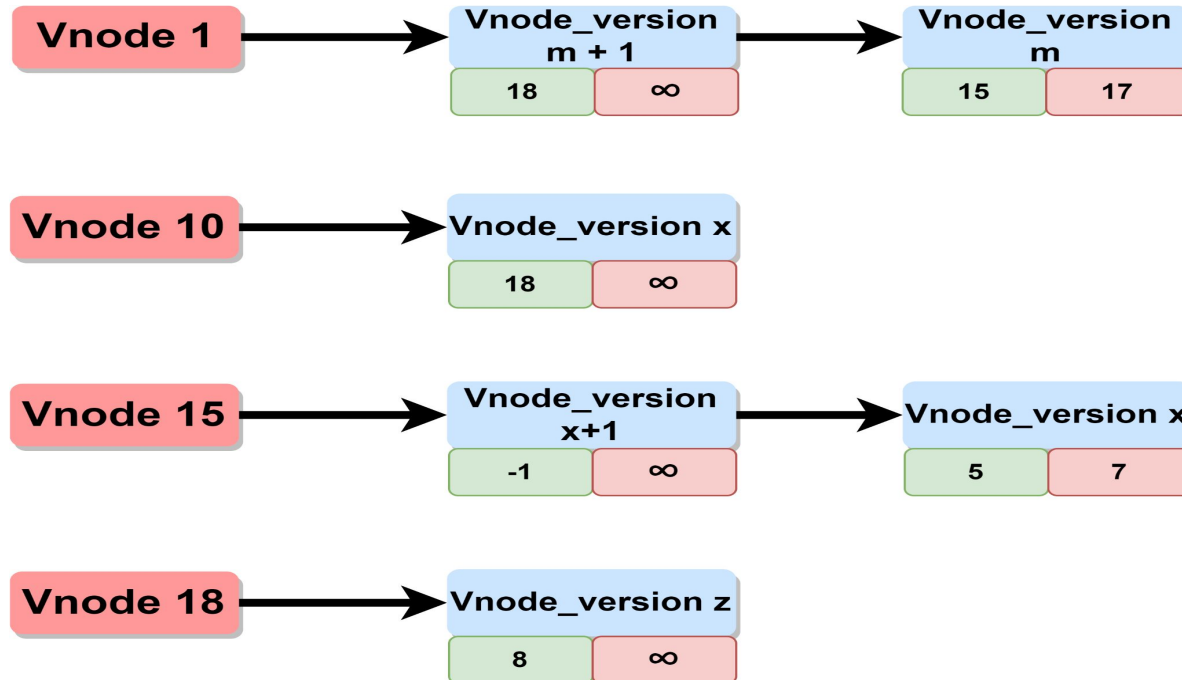
Addvertex(15) : Case-2

- Case2: When Vnode exists but there is no active version.



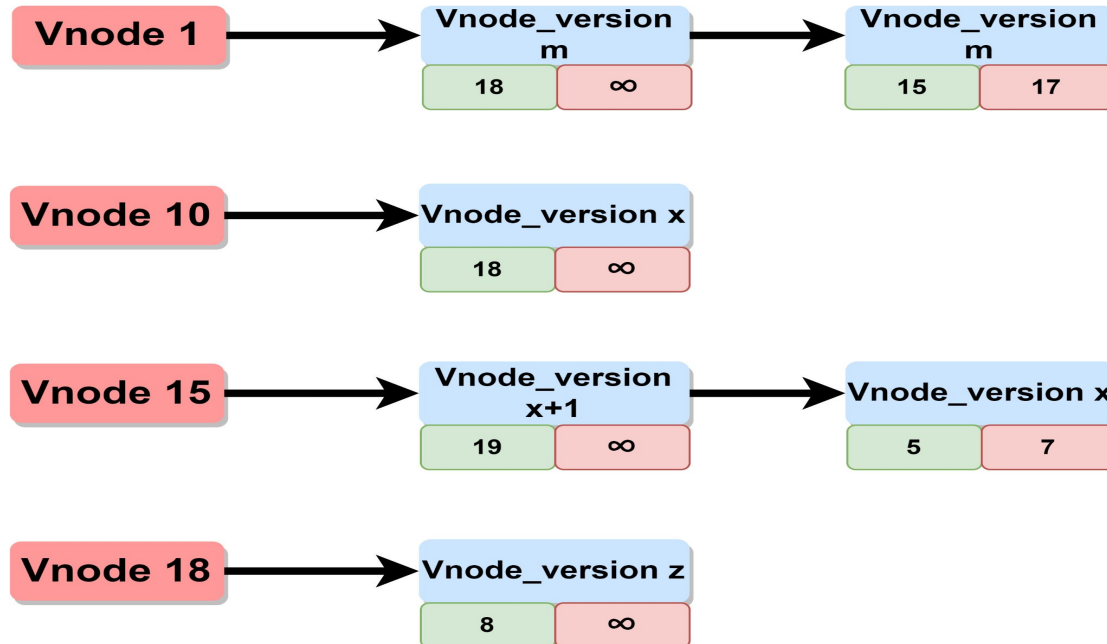
Addvertex(15) : Case-2

- A new Vnode_version is added on the top of the list with insert timestamp as -1



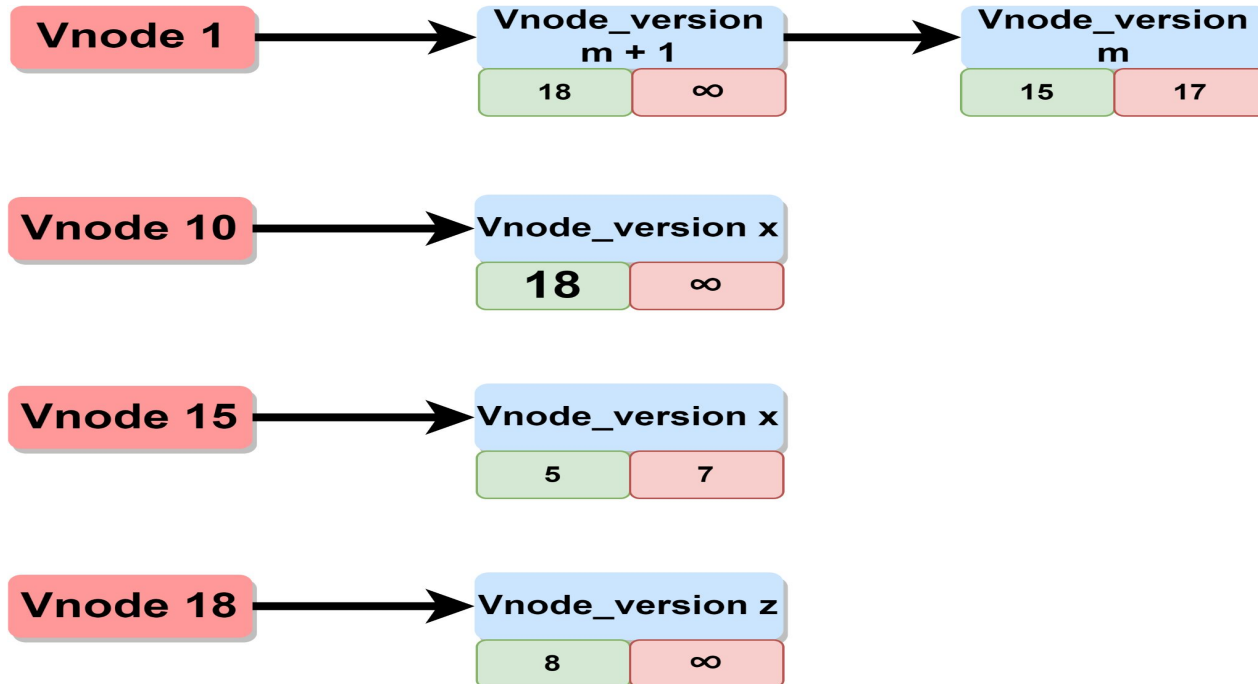
Addvertex(15) : Case-2

- Insert timestamp is set to current global timestamp



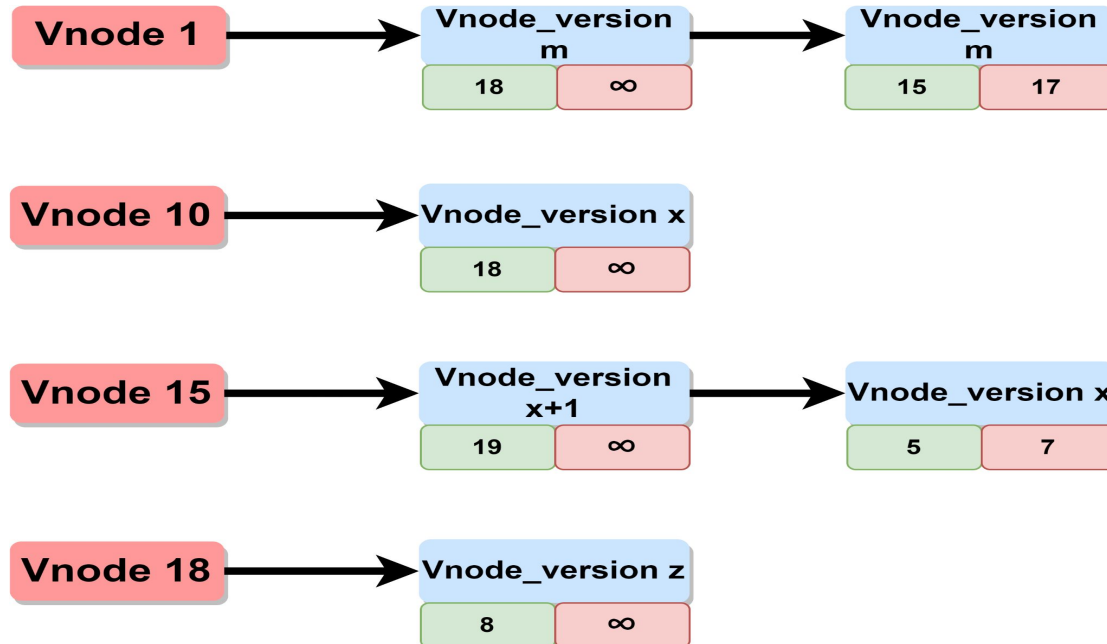
Addvertex(18) : Case-3

- Already exists.



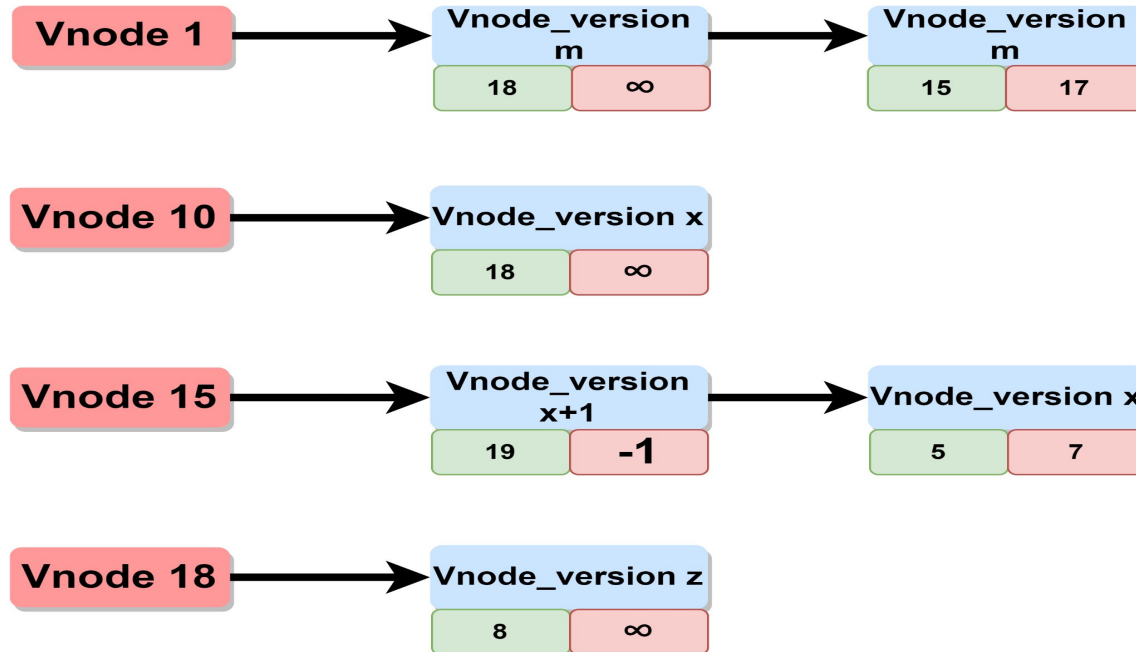
Remove Vertex(15) : Case-1

- Active version_vertex exists.



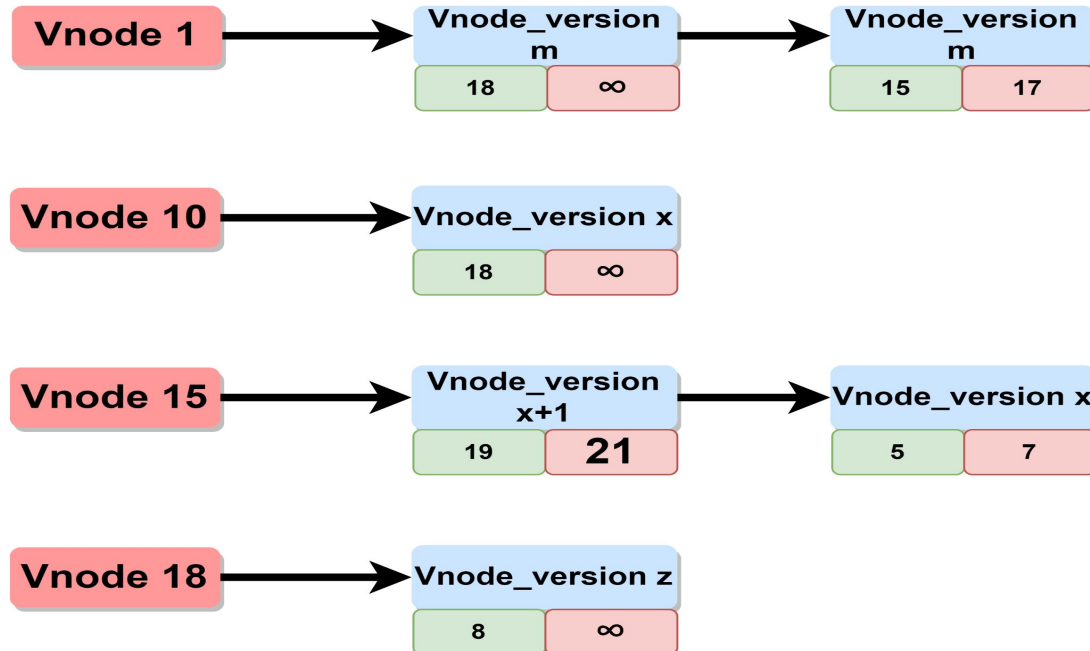
Remove Vertex(15) : Case-1

- Set the delete timestamp to - 1.



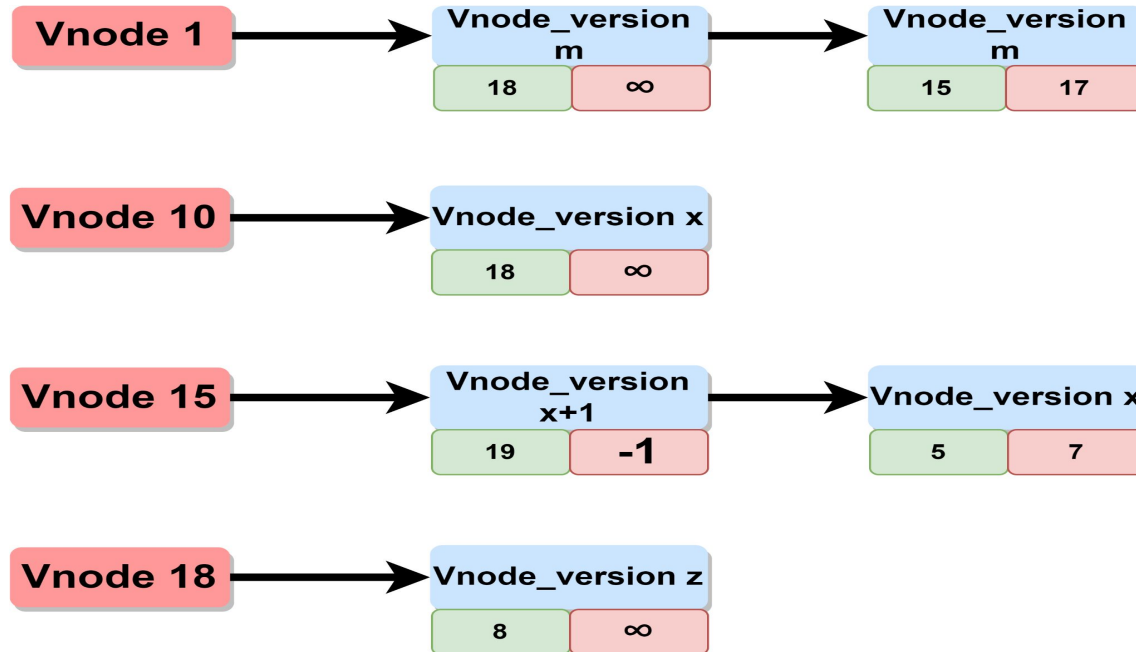
Remove Vertex(15) : Case-1

- Set the delete timestamp to current global timestamp.



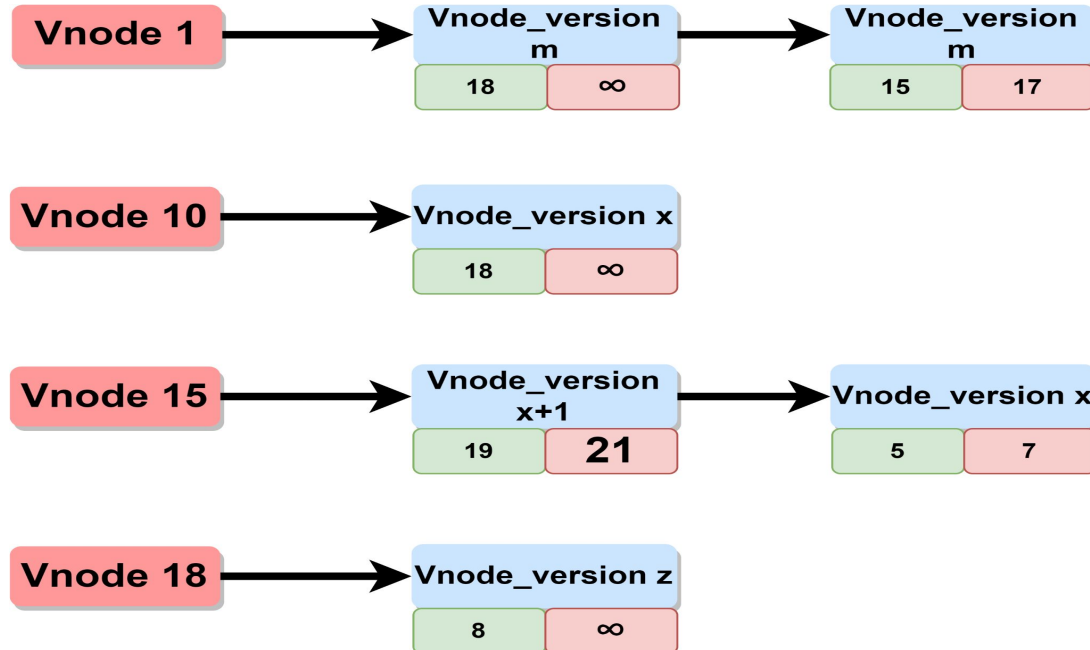
Remove Vertex(15) : Case-2

- Set TS if -1.



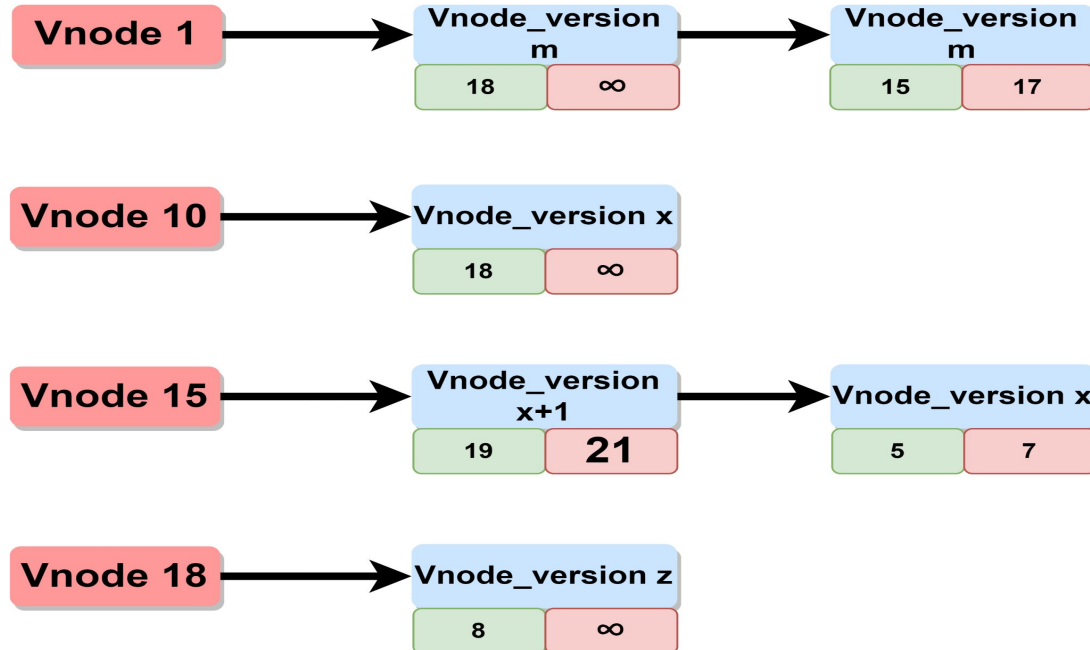
Remove Vertex(15) : Case-2

- Set the delete timestamp to current global timestamp.



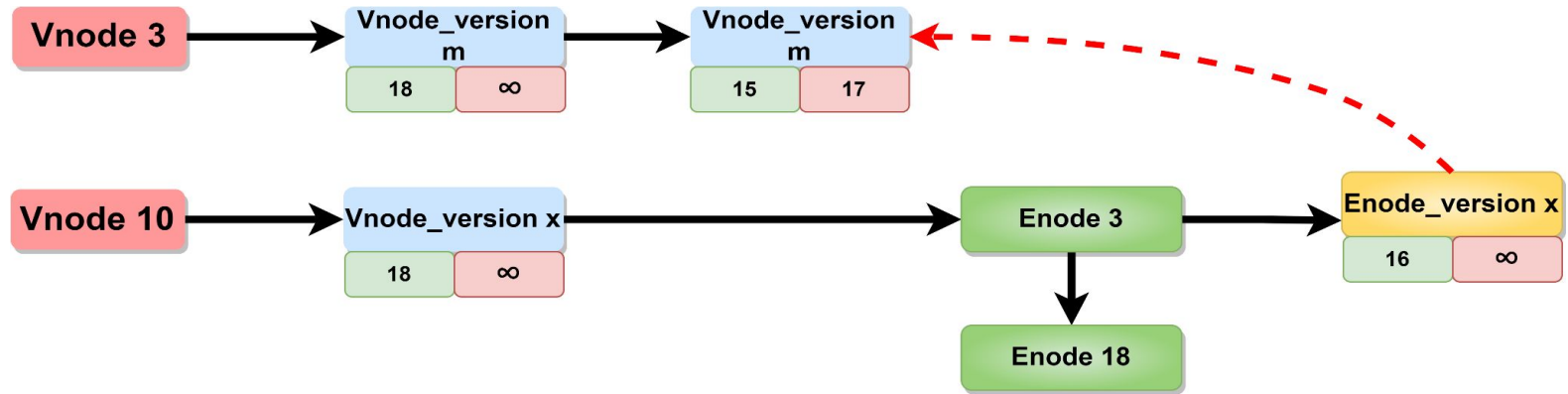
Remove Vertex(15) : Case-3

- Delete Timestamp of the vertex is already set



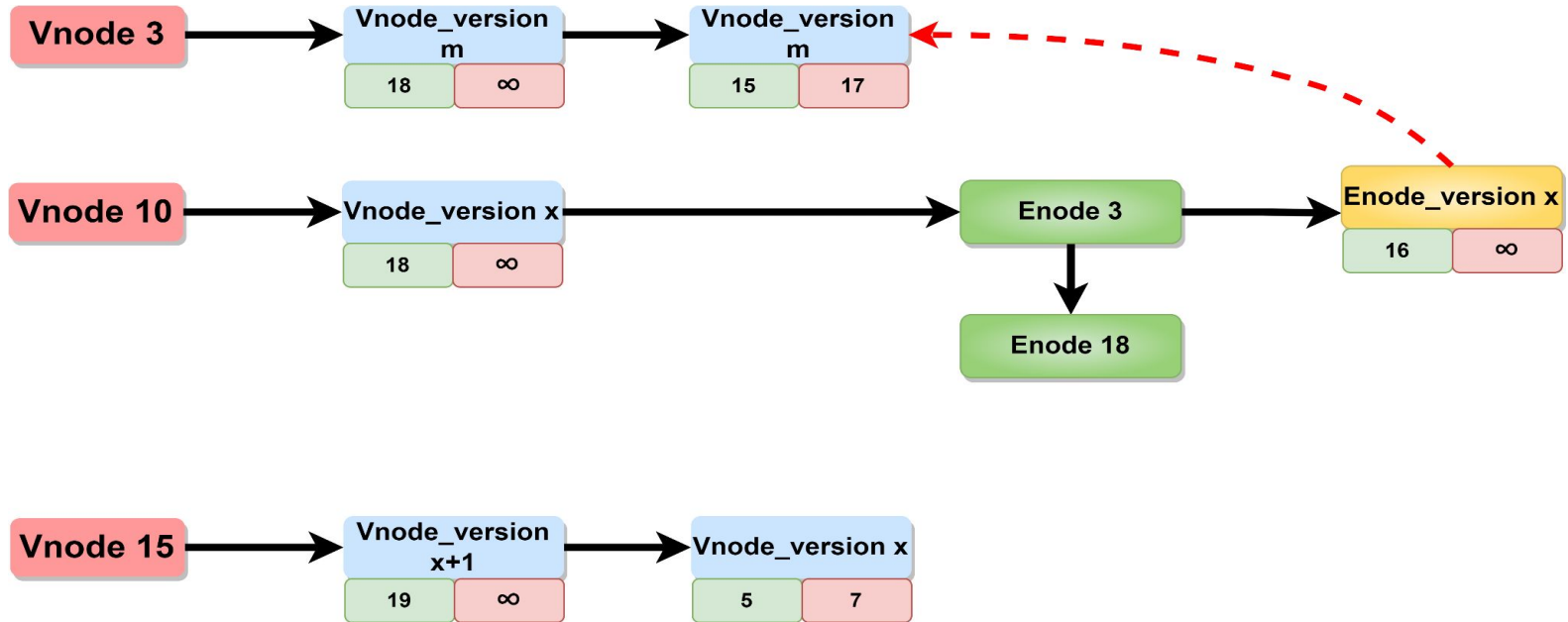
Add Edge(10,15) : Case-1

Case1: Vertex 15 doesn't exists.



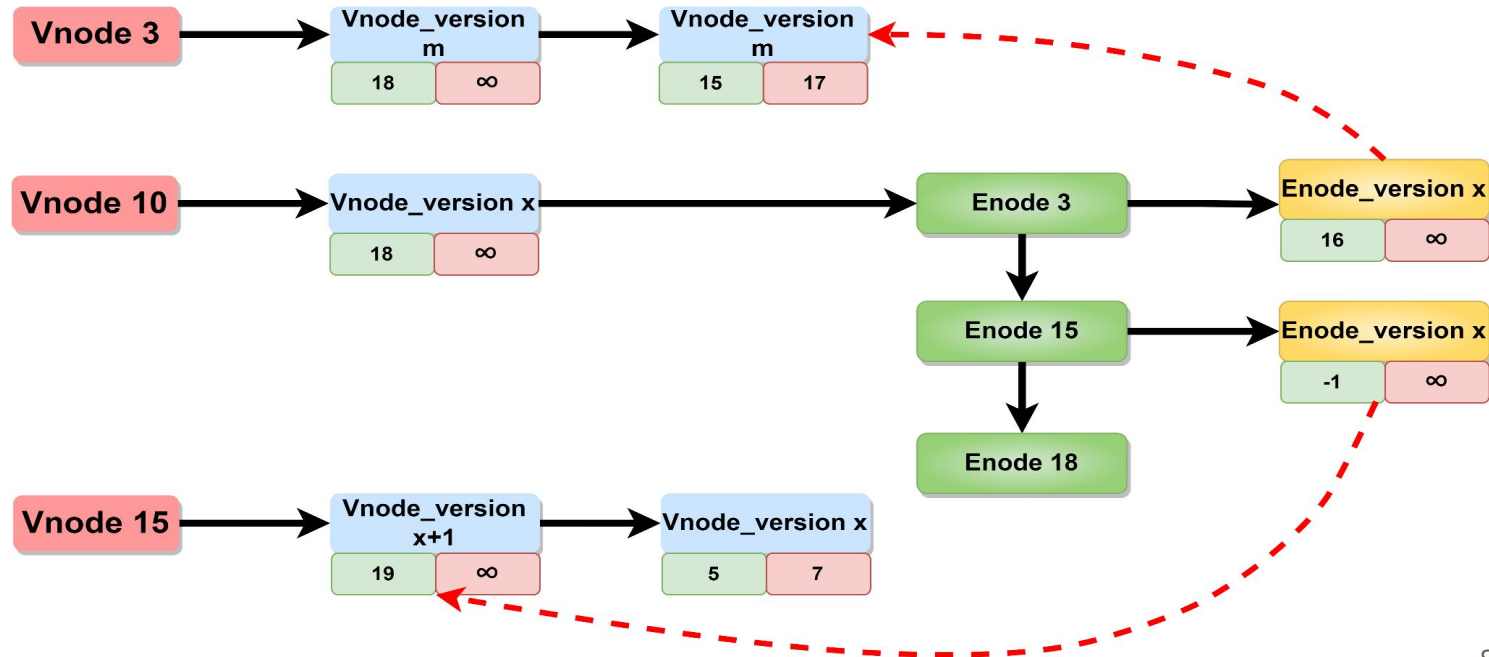
Add Edge(10,15) : Case-2

Case2: Enode(10,15) doesn't exist.



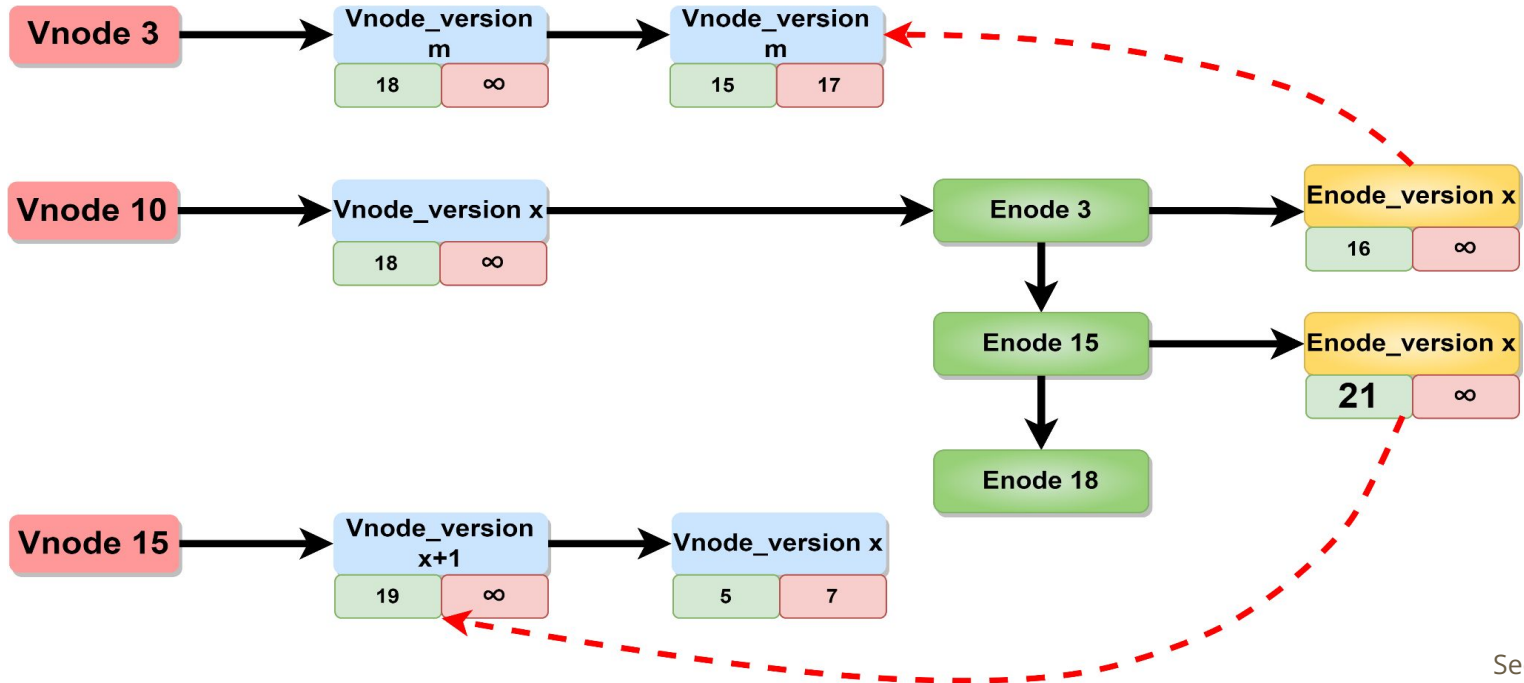
Add Edge(10,15) : Case-2

Case2: New Enode is created with insert timestamp as -1.



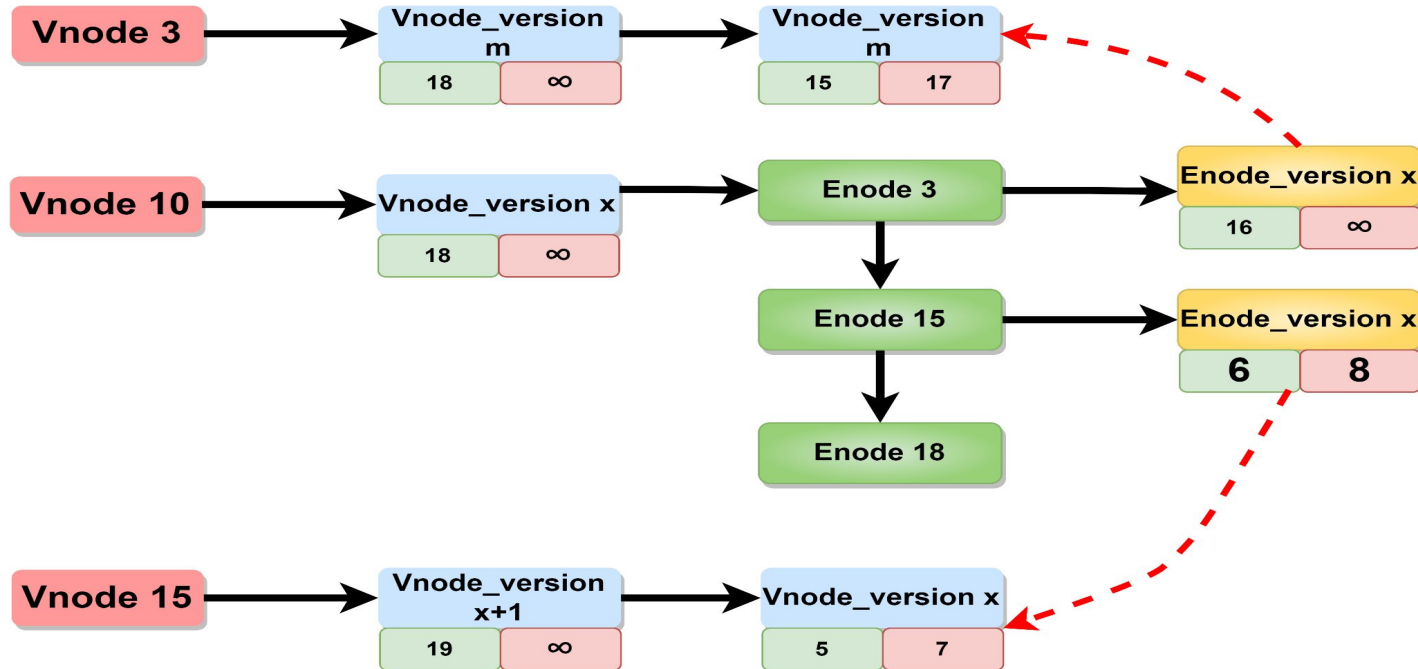
Add Edge(10,15)

Case2: Set insert timestamp to current timestamp.



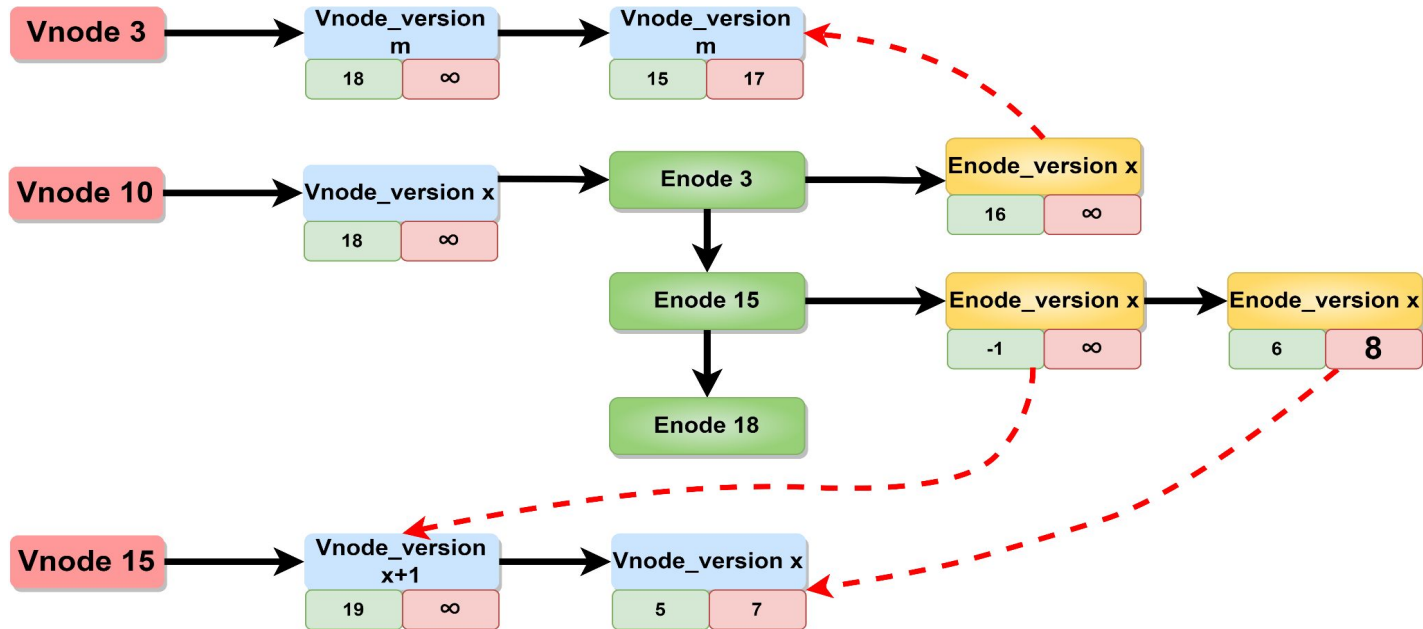
Add Edge(10,15) : Case-3

Case3: Adding a new Edge Version.



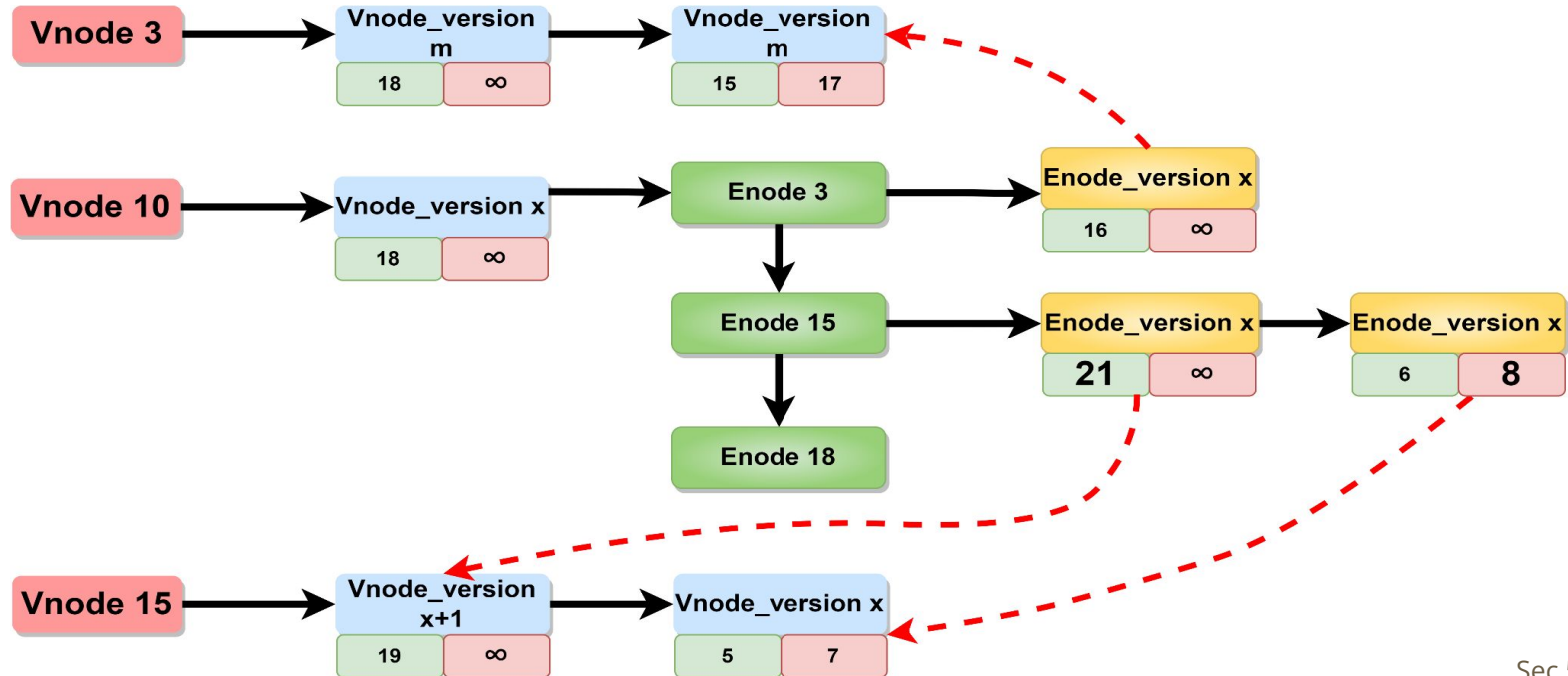
Add Edge(10,15) : Case-3

Case3: Adding a new Edge Version.



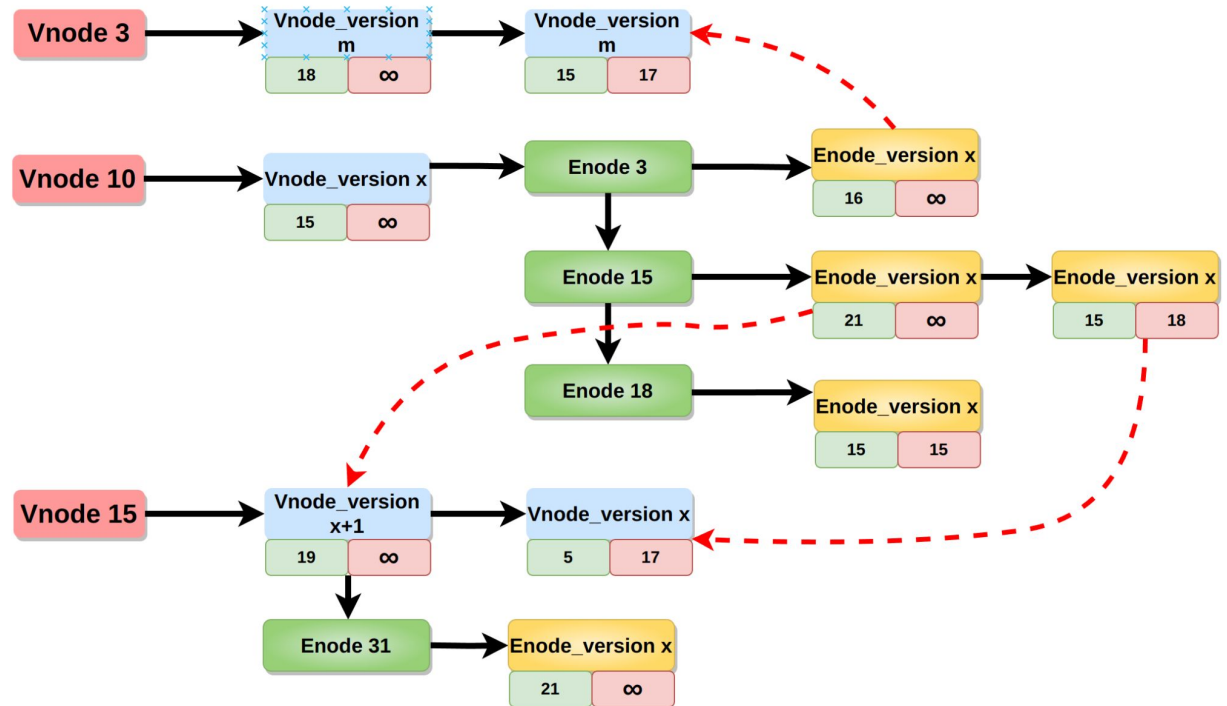
Add Edge(10,15) : Case-3

Case3: Adding a new Edge Version.



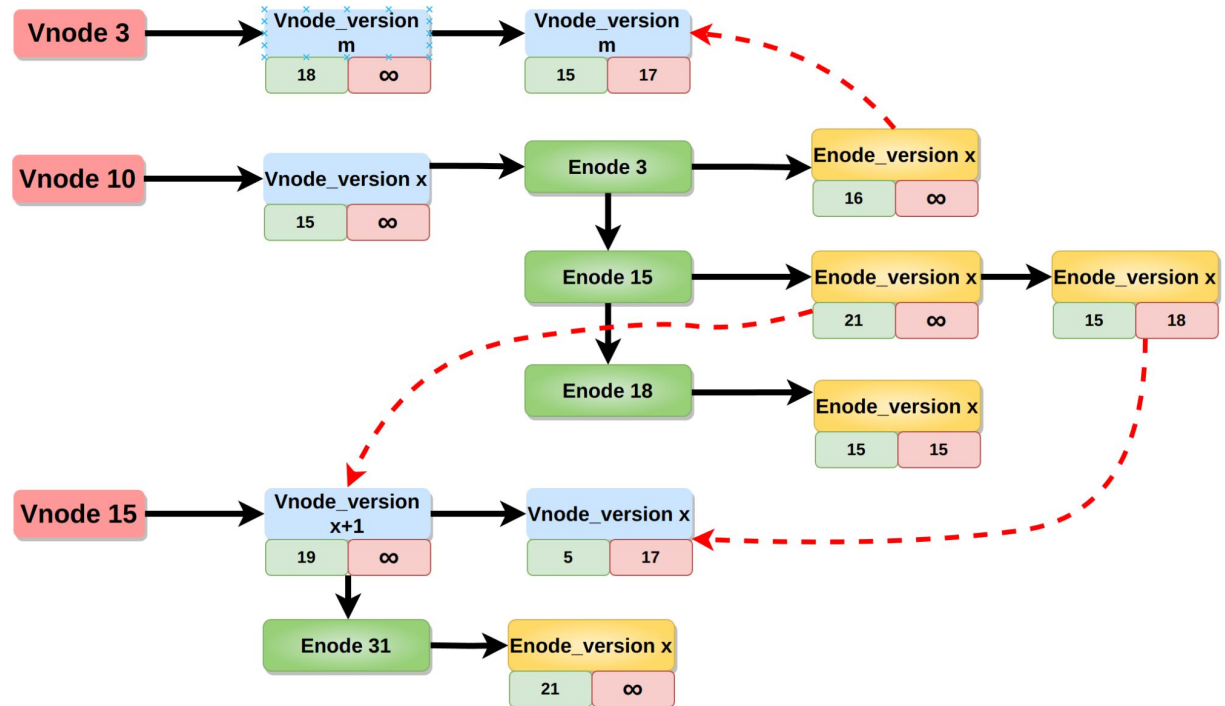
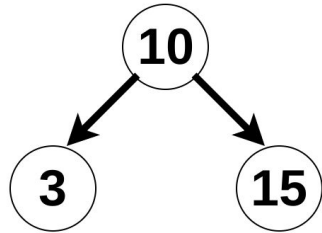
BFS(vertex 10) with TS 16

Current Partial
Snapshot



BFS(vertex 10) with TS 16

Current Partial
Snapshot



Memory Reclamation

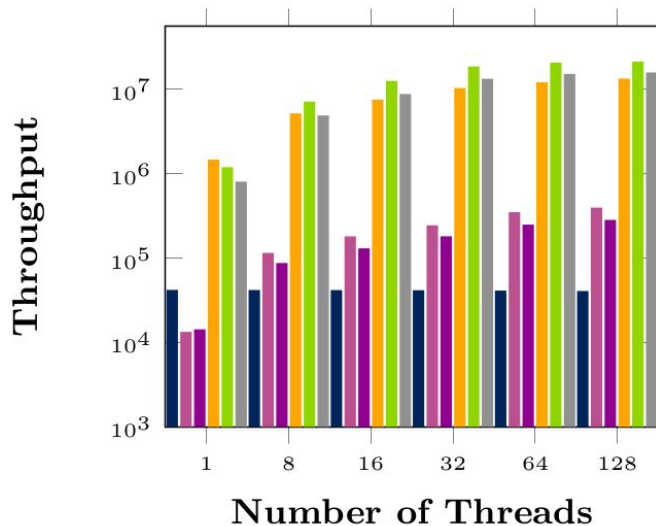
- **Step-1:** Capture the smallest active snapshot timestamp among all the threads, say T .
- **Step-2:** Iterate the complete data structure and pass all the edge nodes having timestamp smaller than or equal to $T-1$ to DEBRA.
- **Step-3:** After removing all the reference to vertex nodes from edge nodes in step-2, re-iterate the complete data structure and remove all the vertex nodes having timestamp smaller than or equal to $T-1$ to DEBRA.

Results and Analysis :

- **Workload Distribution** : The distribution is over the following ordered set of Operations (AddVertex, RemoveVertex, ContainsVertex, AddEdge, RemoveEdge, ContainsEdge, and Critical Operation(Snapshot/BFS/Betweenness Centrality)).
 - Read Heavy Workload : 3%, 2%, 44%, 3%, 2%, 44% , 2%
 - Update Heavy Workload: 13%, 12%, 24%, 13%, 12%, 24% , 2%
- **Algorithms** : We compare our implementation to Obstruction-free and wait-free implementations of same operations namely
 - **Obst-Free**: “A Simple and Practical Concurrent Non-blocking Unbounded Graph with Reachability Queries”, Bapi Chatterjee, Sathya Peri, Muktikanta Sa, Nandini Singhal in the 20th International Conference on Distributed Computing and Networking (ICDCN), Bangalore, India, January 2019.
 - **PANIGRAHAM**: “Non-blocking dynamic unbounded graphs with worst-case amortized bounds”, Bapi Chatterjee, Sathya Peri, Muktikanta Sa, Manogana In: International Conference on Principles of Distributed Systems (2021)
 - **Graph_Iterator**: “Non-blocking Dynamic Unbounded Graphs with Wait-Free Snapshot”, Gaurav Bhardwaj, Sathya Peri, and Pratik Shetty: 25th International Symposium on Stabilization, Safety, and Security (2023)
 - **LIGRA**

Results: Point Operation

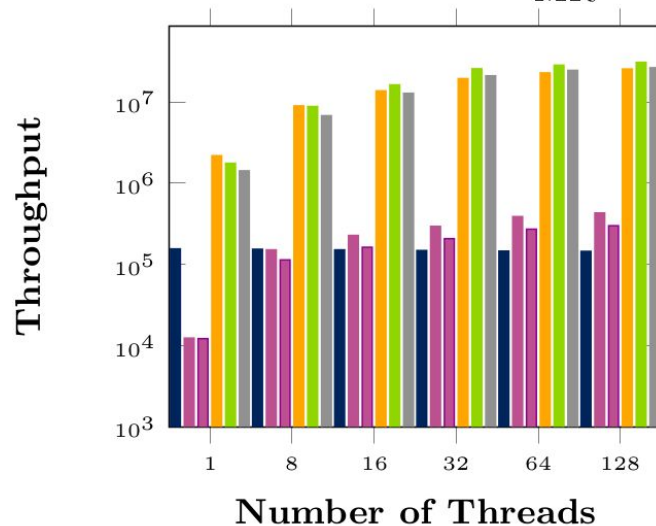
■ LIGRA ■ OBST-FREE ■ WF



(a)

Update Heavy Workload

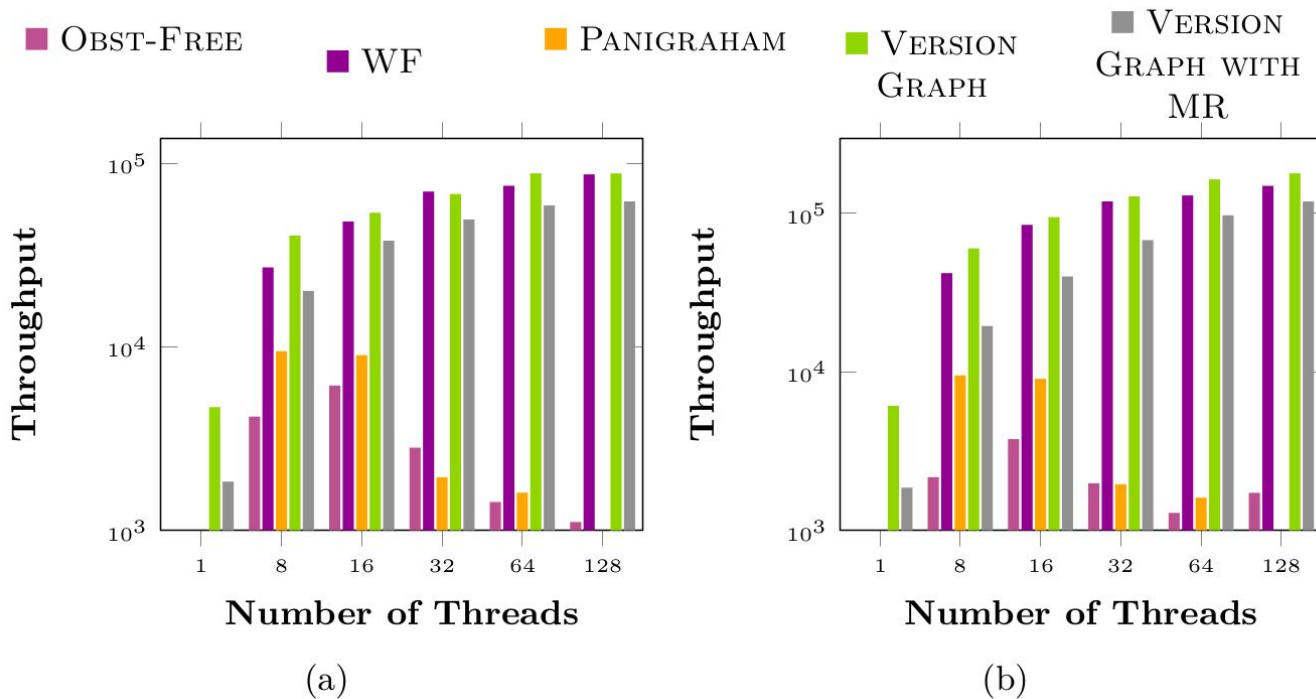
■ PANIGRAHAM ■ VERSION GRAPH ■ VERSION GRAPH WITH MR



(b)

Read Heavy Workload

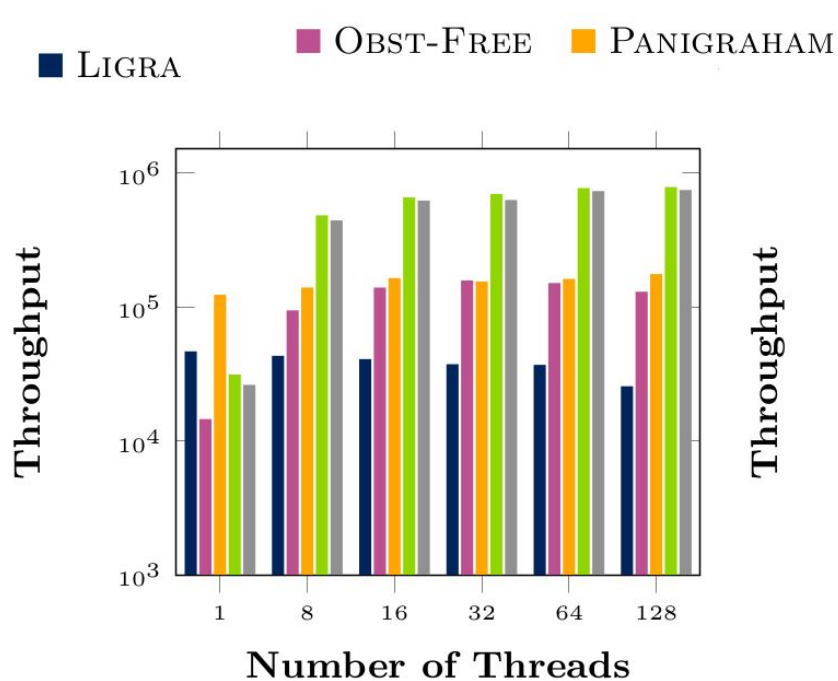
Results: Snapshot



Update Heavy Workload

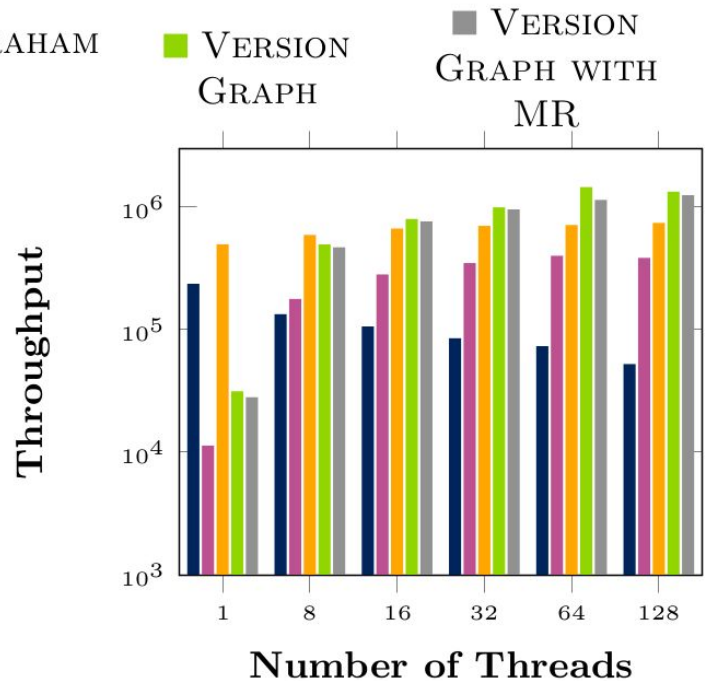
Read Heavy Workload

Results: BFS



(a)

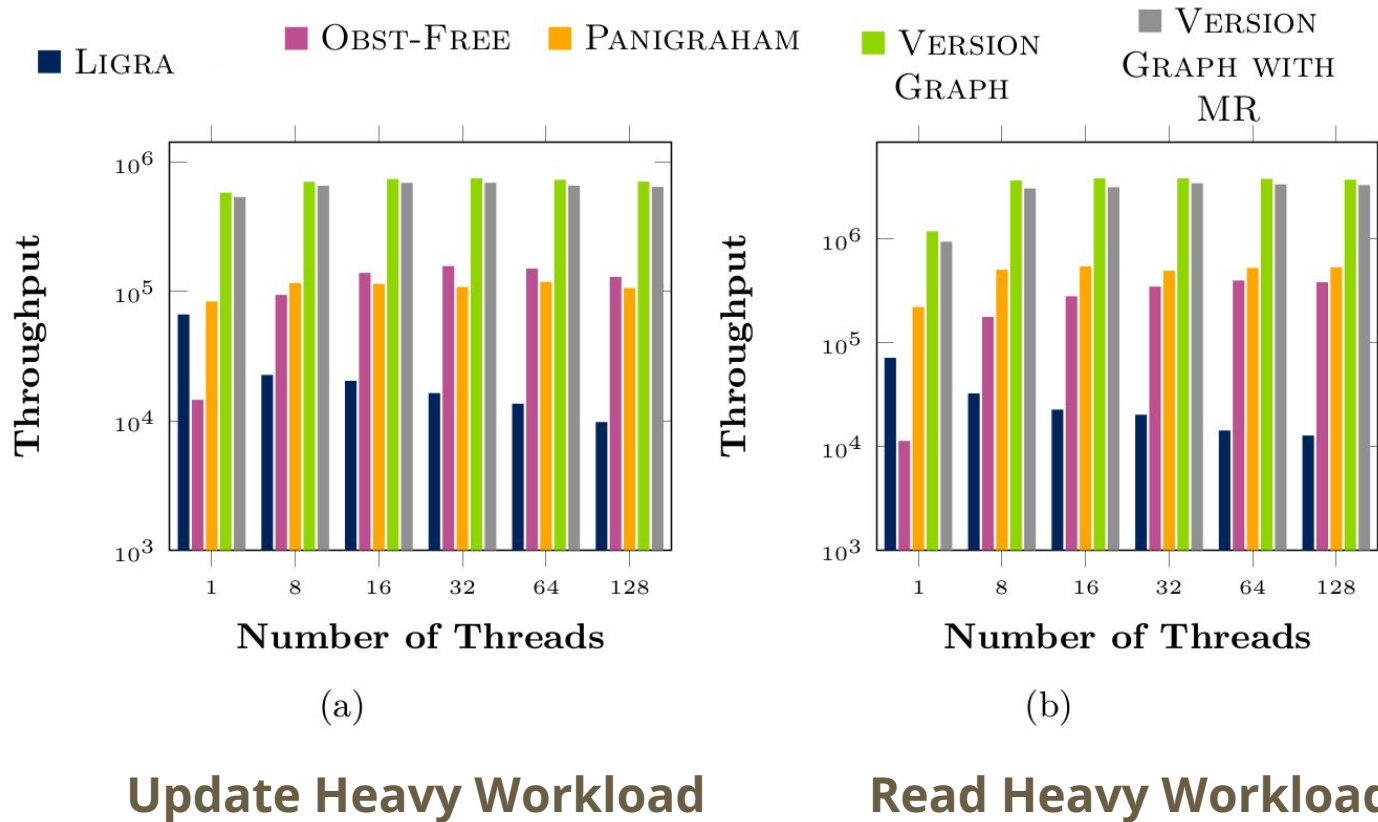
Update Heavy Workload



(b)

Read Heavy Workload

Result: SSSP



Conclusion:

- First algorithm which supports partial wait-free snapshot for the graph.
- Significant improvement in the performance when compared to its counterparts.



**Thank
You**