# Space and Time Bounded Multiversion Garbage Collection

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#### Introduction







- Multiversioning widely used:
  - Database systems ోం Peloton
  - Software Transactional Memory [FC'11] [LS'13]
  - Concurrent data structures [WBBFRS'21] [NHP'20]



- Multiversion garbage collection problem (MVGC)
- Observed to be a bottleneck in modern database systems [LSPKNCSH'16] [BLNK'19]





## Research Question

How do you garbage collect efficiently for multiversioning?

#### Main results

#### A general MVGC scheme with:

- Time: O(1) per reclaimed version, on average
- Space: roughly constant factor more versions than needed
- Progress: wait-free

#### Previous solutions either use:

- unbounded space [WBBFRS'21] [FC'11], or
- O(P) time per reclaimed version [BLNK'19] [LSPKNCSH'16] [LS'13]
  - **P**: number of processes

#### Main results

#### A general MVGC scheme with:

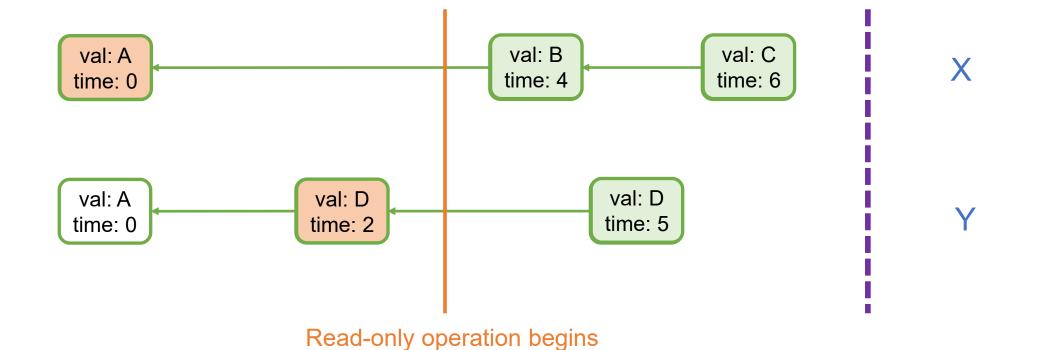
- Time: O(1) per reclaimed version, on average
- Space: roughly constant factor more versions than needed
- Progress: wait-free

- Components of independent interest:
  - Range tracking data structure
  - Concurrent doubly-linked-list with amortized O(1) time remove()

## Multiversioning

**Versions** 

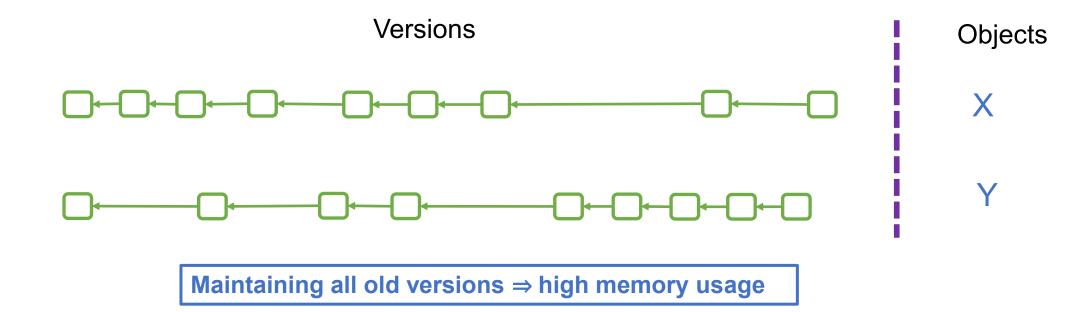
**Objects** 



Time

with timestamp 3

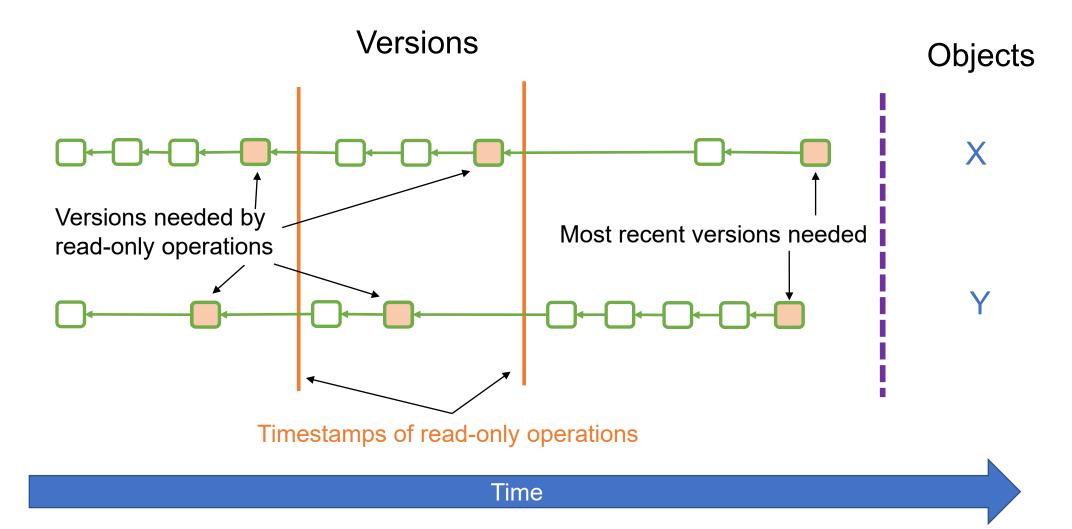
# Multiversion Garbage Collection (MVGC)



- How do we know which versions obsolete?
- How do we safely reclaim them?

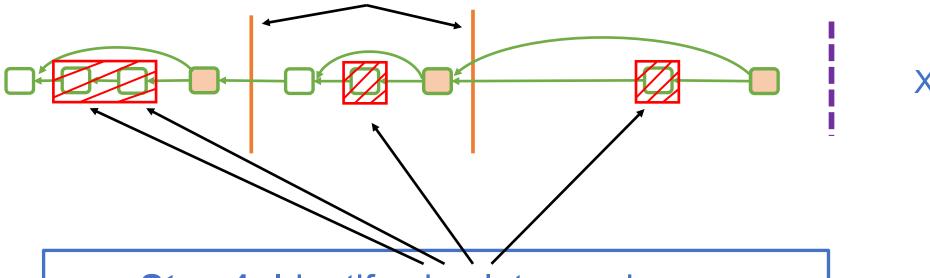


#### Which Versions are Needed?



# Multiversion Garbage Collection (MVGC)

Begin timestamp of read-only operations



Step 1: Identify obsolete versions

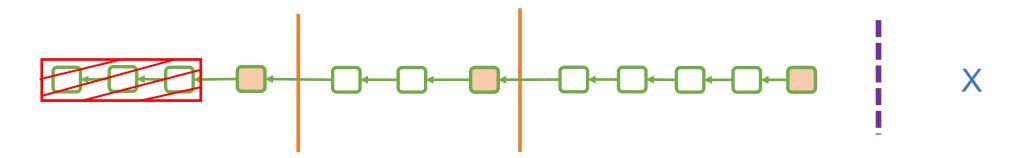
Step 2: Unlink from version list

Step 3: Reclaim memory of unlinked

versions

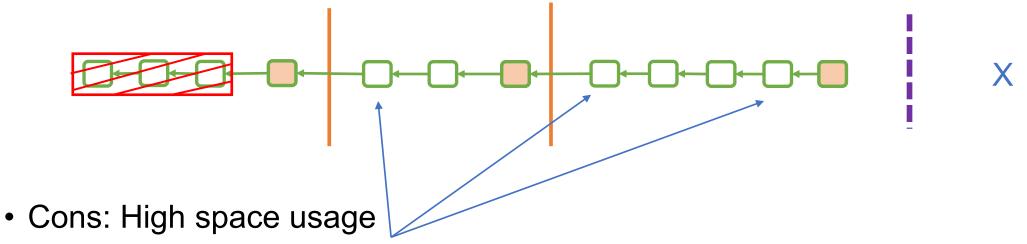
## Related Work – Epoch-Based Solutions

- Track the oldest active read-only operation and reclaim any version overwritten before the start of this operation
- Most commonly used



Pros: Fast, easy to implement

## Related Work – Epoch-Based Solutions



- Unable to collect newer obsolete versions
- Particularly bad with long read-only operations, which is one of the main motivations for multiversioning
  - E.g. database scans, range queries, etc
- Paused process can lead to unbounded space usage

## Related Work – Other Solutions

- Techniques have been developed to address shortcomings of epoch-based solutions
  - GMV [LS'13], Hana [LSPKNCSH'16], Steam [BLNK'19]
  - Requires Ω(P) time, on average, to collect each version in worst case executions,
  - Keeps up to P times more versions than necessary

#### Overview

**Step 1**: Identify obsolete versions

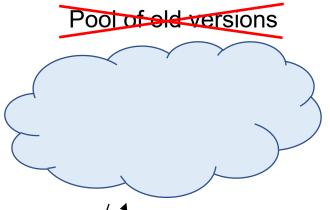
Step 2: Unlink from version list

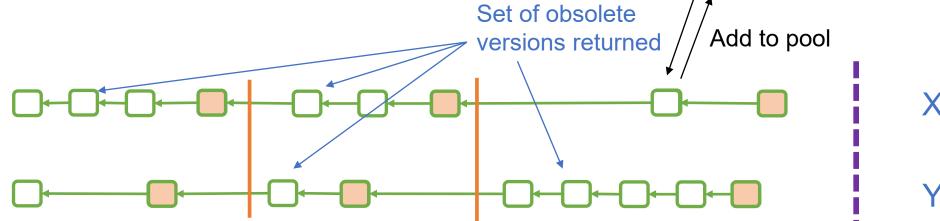
Step 3: Reclaim memory of unlinked versions

#### Range tracking data structure

## Overview

Step 1: Identify obsolete versions





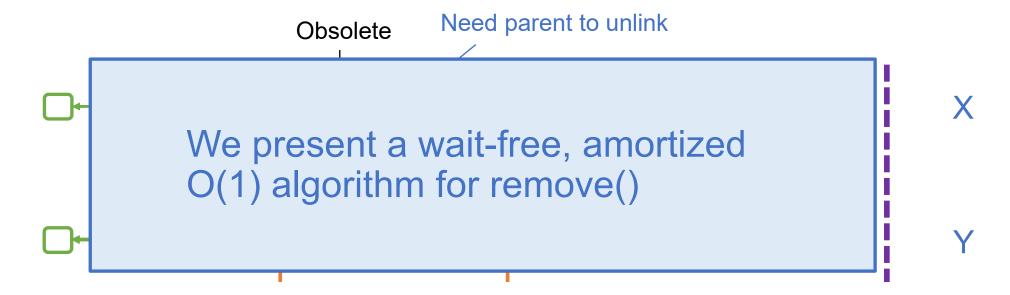
Step 2: Unlink from version list

Step 3: Reclaim memory of unlinked versions

#### Overview

**Step 1**: Identify obsolete versions

Step 2: Unlink from version list



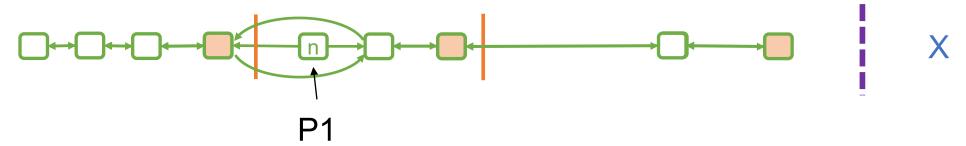
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#### Overview

Step 1: Identify obsolete versions

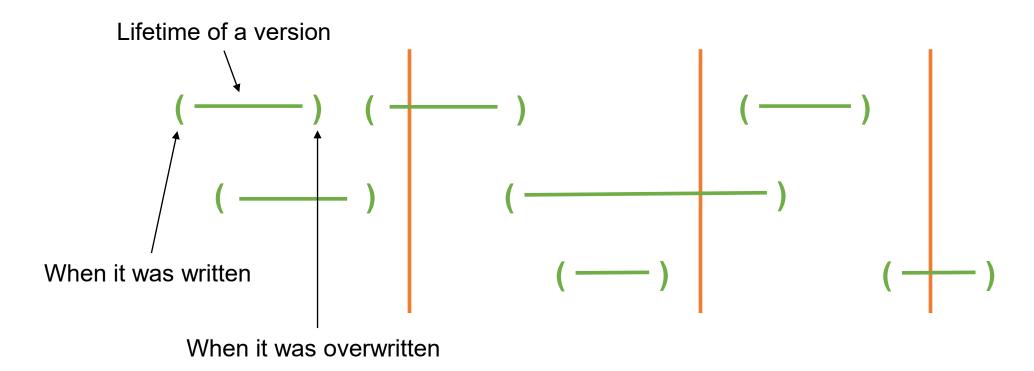
Step 2: Unlink from version list

Step 3: Reclaim memory of unlinked versions



- n is not safe to reclaim right away because a process (P1) could be paused on it
- Using Hazard Pointers (HP) or Concurrent Reference Counting (CRC) would solve this problem, but
  - HP sacrifices wait-freedom
  - CRC has bad worst case space bounds
- We design a new safe reclamation scheme specifically for our doubly linked version list

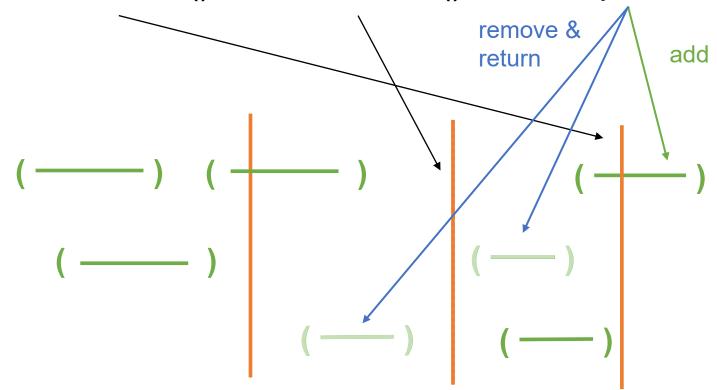
## Step 1: Identifying Obsolete Versions



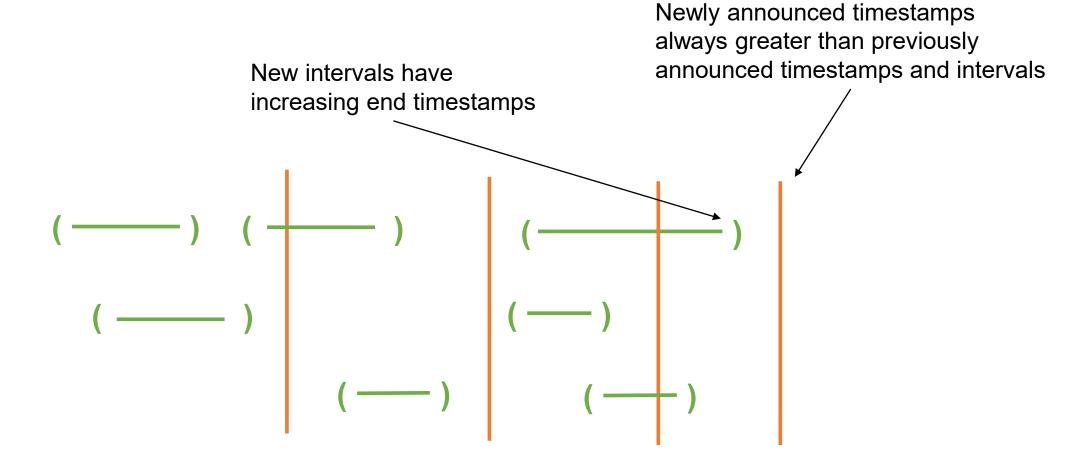
Announced timestamps

## Range Tracker: Definition

Supports announce(), unannounce(), and deprecate()



## Observations



## Range Tracker: Implementation

- Announce() & unannounced() write to an announcement array
- Deprecate(Range r):
  - Append r to process local list (sorted by end timestamp)
  - If local list reaches size O(P log P),
    - Push local list onto a shared queue
    - Pop two lists from the shared queue
    - Scan announcement array
    - Separate the two popped lists into intersected (A) and non-intersected intervals (B)
      - O(P log P) time
    - Push A back to the shared queue and return B

## Range Tracker: Time Bounds

- O(1) time announce() & unannounced()
- O(P) time push/pop from shared queue (P-SIM, wait-free)
- Every O(P log P) calls to deprecate() we perform:
  - 2 pop, 1-3 push to shared queue
  - O(P log P) algorithm for finding intersected intervals
- Deprecate() takes amortized O(1) time

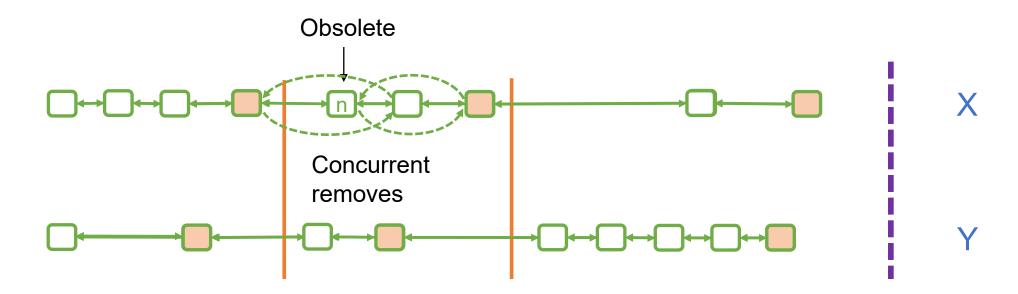
## Range Tracker: Space Bounds

- O(P<sup>2</sup> log P) intervals in local lists, in total
- O(M) intervals in the shared queue
  - M: maximum number of needed intervals at any point in history
- Overall, the range tracker stores a constant factor more intervals than needed plus an additive term

#### Overview

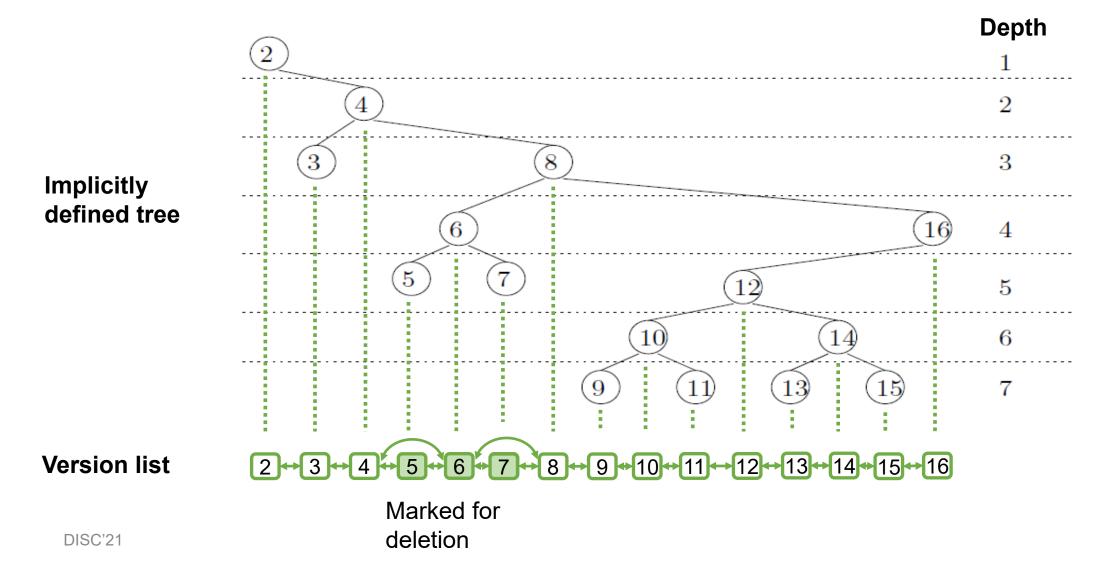
**Step 1**: Identify obsolete versions

Step 2: Unlink from version list



Step 3: Reclaim memory of unlinked versions

## Step 2: Unlinking from version lists

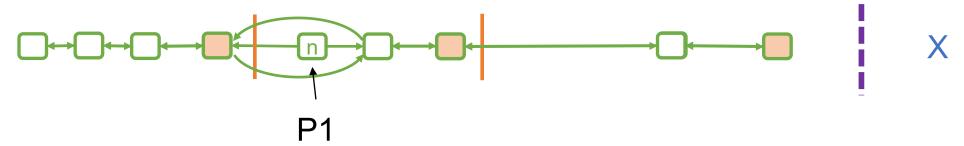


#### Overview

Step 1: Identify obsolete versions

Step 2: Unlink from version list

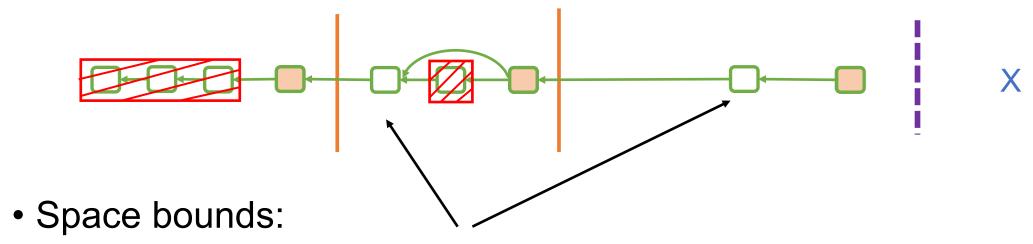
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#### Our results

Diagram might be good for title page



- Number of unreclaimed versions ∈ ~O(# required versions)
- Time bounds:
  - O(1) time, on average, to identify, remove, and reclaim a version
  - Wait-free

## **Space Bounds**

Our MVGC technique (counting all three steps) achieves:

- Amortized O(1) time, in expectation, for each reclaimed version
- A maximum of O(N + P<sup>2</sup> log P + P log L) unreclaimed versions
  - N: high watermark number of needed versions throughout execution
  - P: number of processes
  - L: maximum number of versions added to a single version list
- In large data structures, N >> (P² log P + P log L)
  - Rough notes:
    - Emphasize this somehow, Log L is small, P is small compared to N
    - Size of databases vs how many processes they run with

## Conclusion

- Multiversion Garbage Collection is an important problem
- Our paper presents a theoretically efficient solution
- Currently working on a practical version, preliminary results look promising

# Thank you for listening!

#### References

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