

DATABASE SYSTEM IMPLEMENTATION

GT 4420/6422 // SPRING 2019 // @JOY_ARULRAJ

LECTURE #19: MULTI-VERSION CONCURRENCY CONTROL (PART 1)

TODAY'S AGENDA

Compare-and-Swap (CAS)

Isolation Levels

MVCC Design Decisions

COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

- If values are equal, installs new given value **V'** in **M**
- Otherwise operation fails

COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails

```
__sync_bool_compare_and_swap(&M, 20, 30)
```


COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails

Address



```
__sync_bool_compare_and_swap(&M, 20, 30)
```

COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails

M
20

Address

`__sync_bool_compare_and_swap(&M, 20, 30)`

COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails

M
20

`__sync_bool_compare_and_swap(&M, 20, 30)`

Address

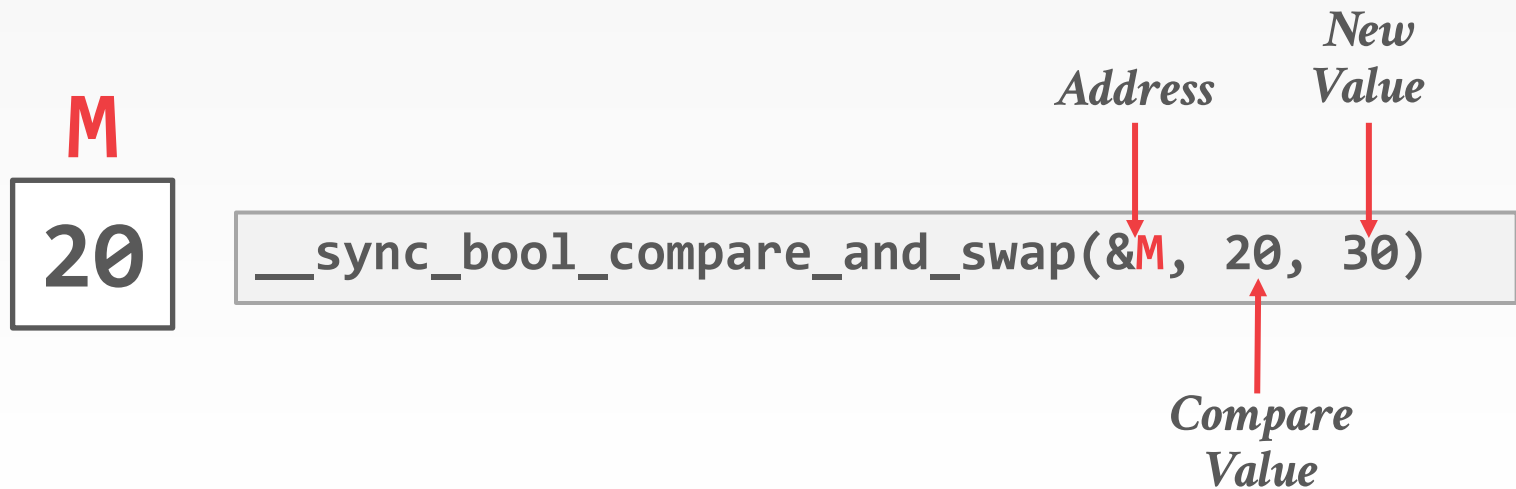
*Compare
Value*

COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails

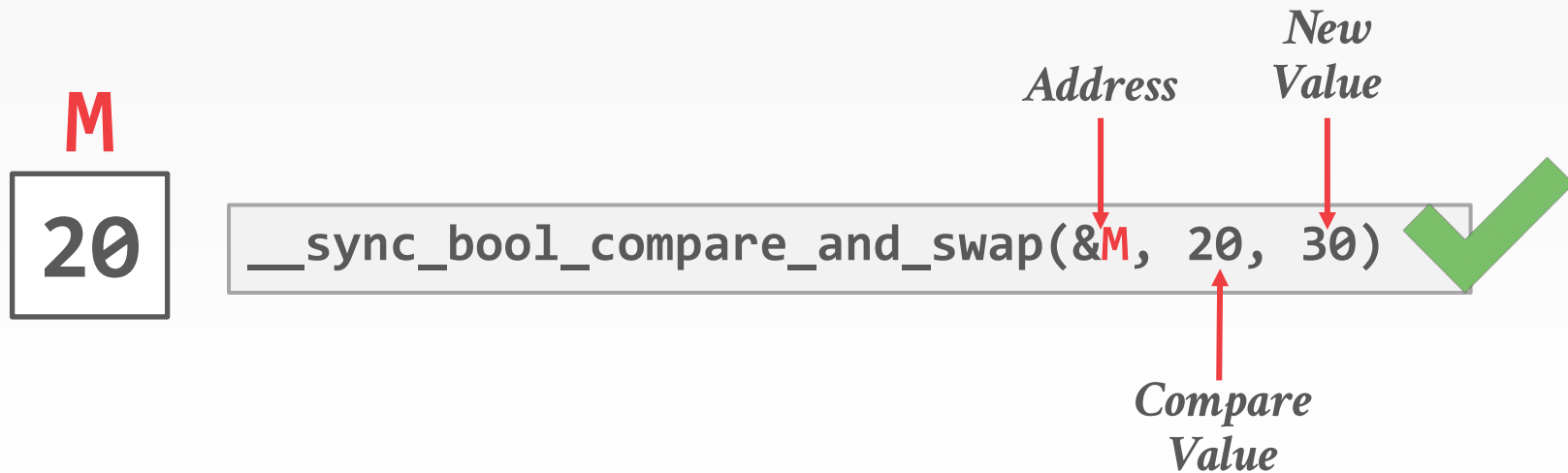


COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails

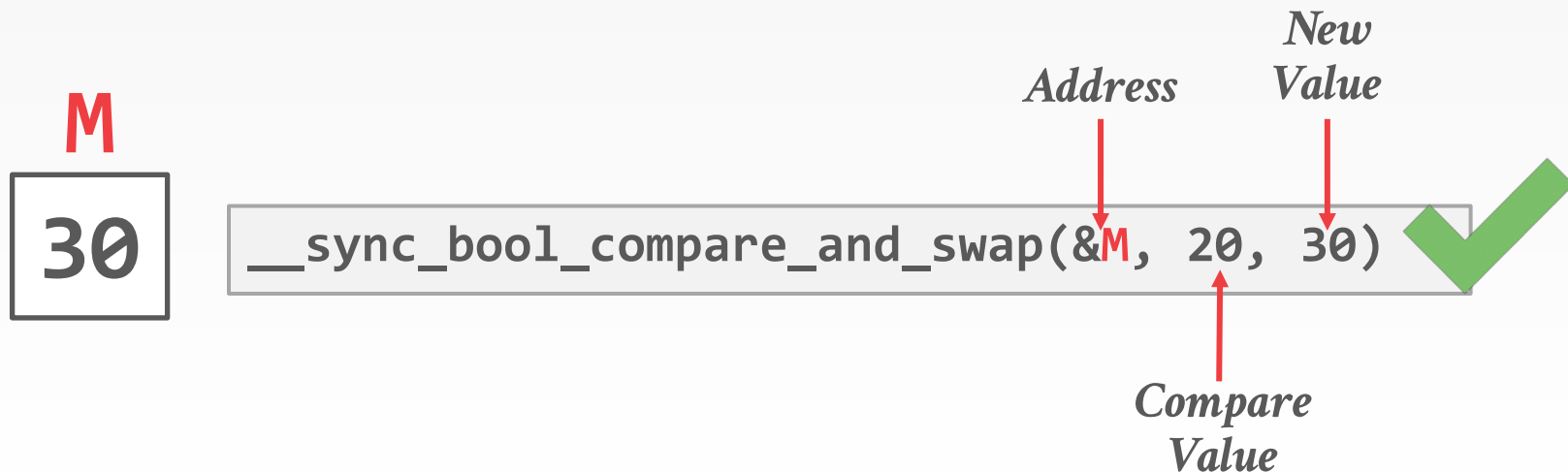


COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails

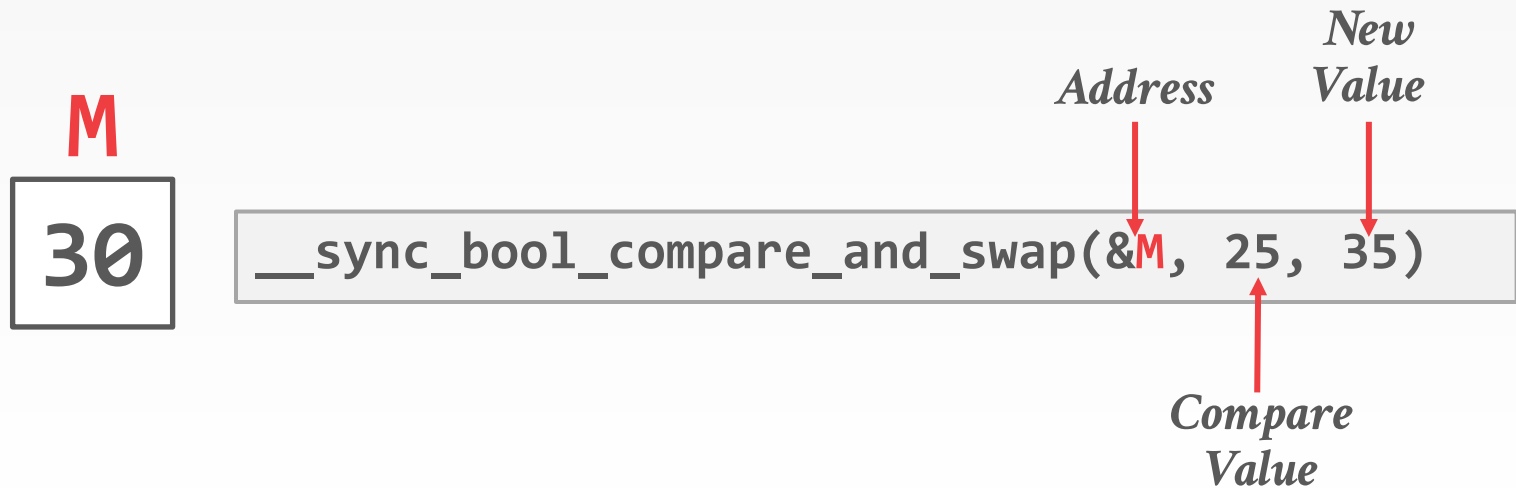


COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails

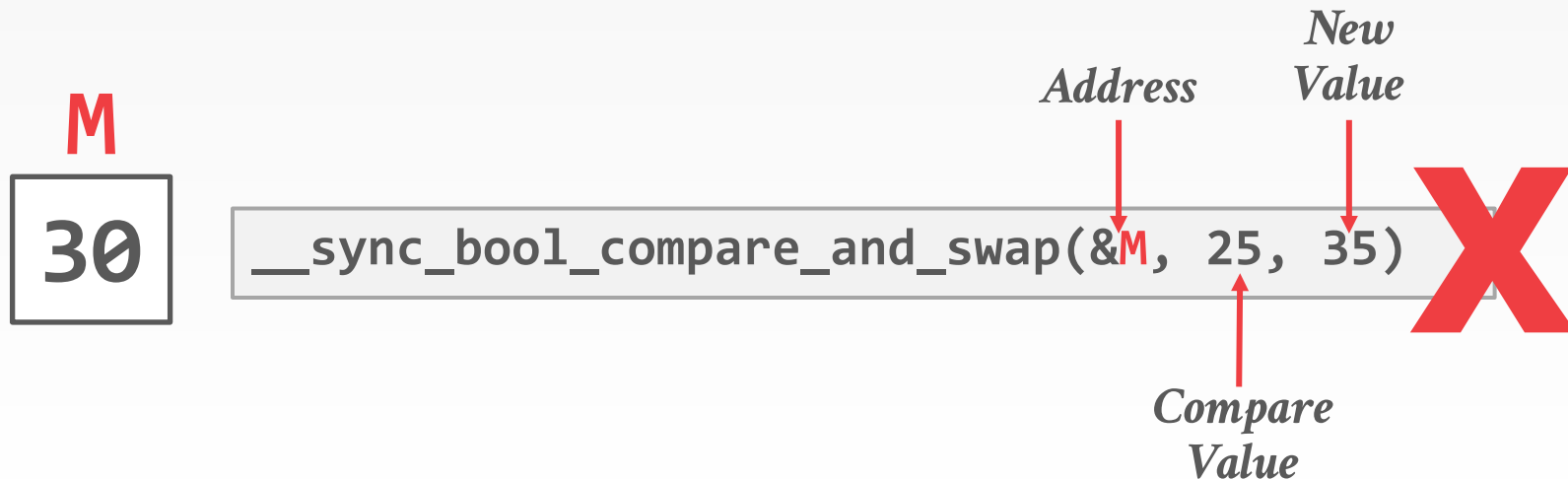


COMPARE-AND-SWAP

Atomic instruction that compares contents of a memory location **M** to a given value **V**

→ If values are equal, installs new given value **V'** in **M**

→ Otherwise operation fails



OBSERVATION

Serializability is useful because it allows programmers to ignore concurrency issues but enforcing it may allow too little parallelism and limit performance.

We may want to use a weaker level of consistency to improve scalability.

ISOLATION LEVELS

Controls the extent that a txn is exposed to the actions of other concurrent txns.

Provides for greater concurrency at the cost of exposing txns to uncommitted changes:

- Dirty Read Anomaly
- Unrepeatable Reads Anomaly
- Phantom Reads Anomaly

ANSI ISOLATION LEVELS

SERIALIZABLE

→ No phantoms, all reads repeatable, no dirty reads.

REPEATABLE READS

→ Phantoms may happen.

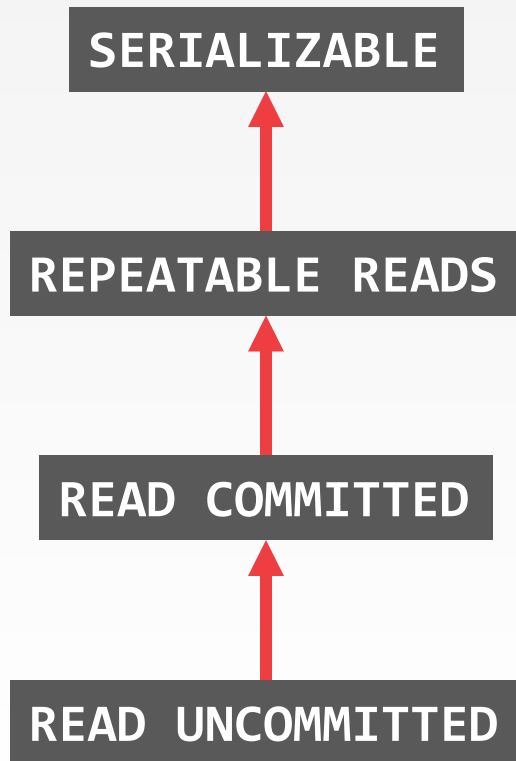
READ COMMITTED

→ Phantoms and unrepeatable reads may happen.

READ UNCOMMITTED

→ All of them may happen.

ISOLATION LEVEL HIERARCHY



REAL-WORLD ISOLATION LEVELS

	<i>Default</i>	<i>Maximum</i>
Action Ingres	SERIALIZABLE	SERIALIZABLE
Greenplum	READ COMMITTED	SERIALIZABLE
IBM DB2	CURSOR STABILITY	SERIALIZABLE
MySQL	REPEATABLE READS	SERIALIZABLE
MemSQL	READ COMMITTED	READ COMMITTED
MS SQL Server	READ COMMITTED	SERIALIZABLE
Oracle	READ COMMITTED	SNAPSHOT ISOLATION
Postgres	READ COMMITTED	SERIALIZABLE
SAP HANA	READ COMMITTED	SERIALIZABLE
VoltDB	SERIALIZABLE	SERIALIZABLE

REAL-WORLD ISOLATION LEVELS

	<i>Default</i>	<i>Maximum</i>
Action Ingres	SERIALIZABLE	SERIALIZABLE
Greenplum	READ COMMITTED	SERIALIZABLE
IBM DB2	CURSOR STABILITY	SERIALIZABLE
MySQL	REPEATABLE READS	SERIALIZABLE
MemSQL	READ COMMITTED	READ COMMITTED
MS SQL Server	READ COMMITTED	SERIALIZABLE
Oracle	READ COMMITTED	SNAPSHOT ISOLATION
Postgres	READ COMMITTED	SERIALIZABLE
SAP HANA	READ COMMITTED	SERIALIZABLE
VoltDB	SERIALIZABLE	SERIALIZABLE

REAL-WORLD ISOLATION LEVELS

	<i>Default</i>	<i>Maximum</i>
Action Ingres	SERIALIZABLE	SERIALIZABLE
Greenplum	READ COMMITTED	SERIALIZABLE
IBM DB2	CURSOR STABILITY	SERIALIZABLE
MySQL	REPEATABLE READS	SERIALIZABLE
MemSQL	READ COMMITTED	READ COMMITTED
MS SQL Server	READ COMMITTED	SERIALIZABLE
Oracle	READ COMMITTED	SNAPSHOT ISOLATION
Postgres	READ COMMITTED	SERIALIZABLE
SAP HANA	READ COMMITTED	SERIALIZABLE
VoltDB	SERIALIZABLE	SERIALIZABLE

CRITICISM OF ISOLATION LEVELS

The isolation levels defined as part of SQL-92 standard only focused on anomalies that can occur in a 2PL-based DBMS.

Two additional isolation levels:

- **CURSOR STABILITY**
- **SNAPSHOT ISOLATION**



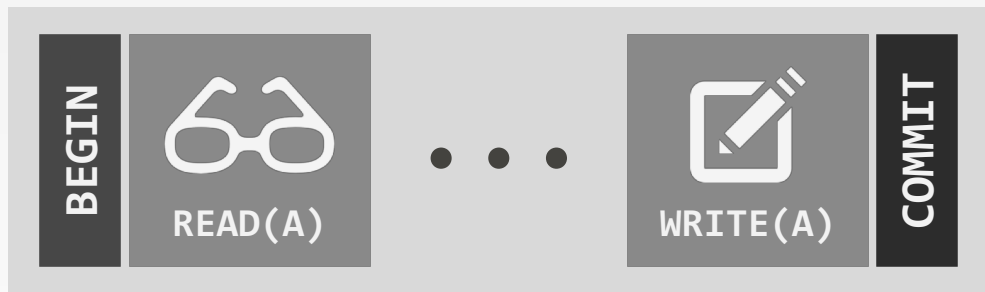
CURSOR STABILITY (CS)

The DBMS's internal cursor maintains a lock on a item in the database until it moves on to the next item.

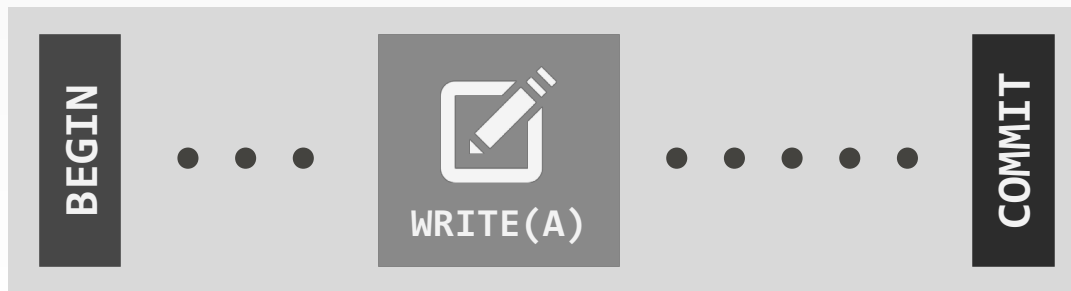
CS is a stronger isolation level in between **REPEATABLE READS** and **READ COMMITTED** that can (sometimes) prevent the Lost Update Anomaly.

LOST UPDATE ANOMALY

Txn #1

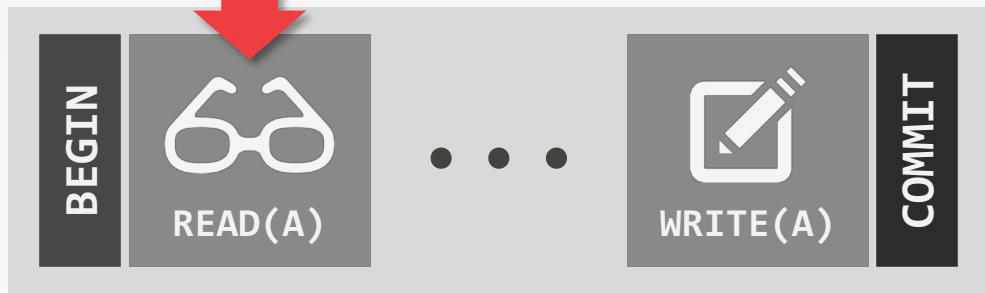


Txn #2

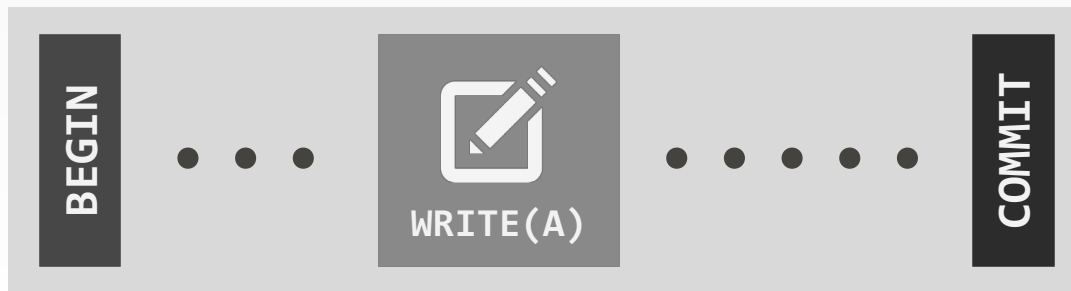


LOST UPDATE ANOMALY

Txn #1

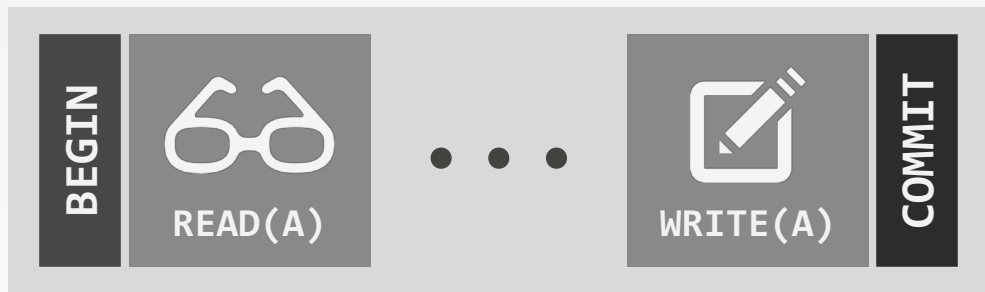


Txn #2

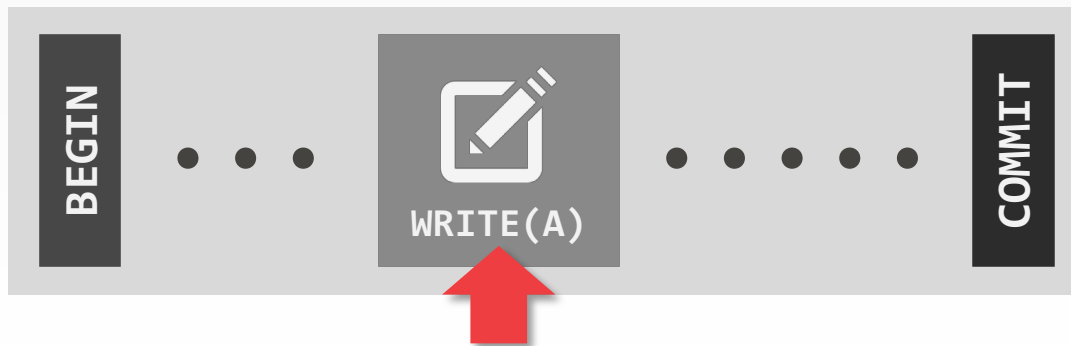


LOST UPDATE ANOMALY

Txn #1

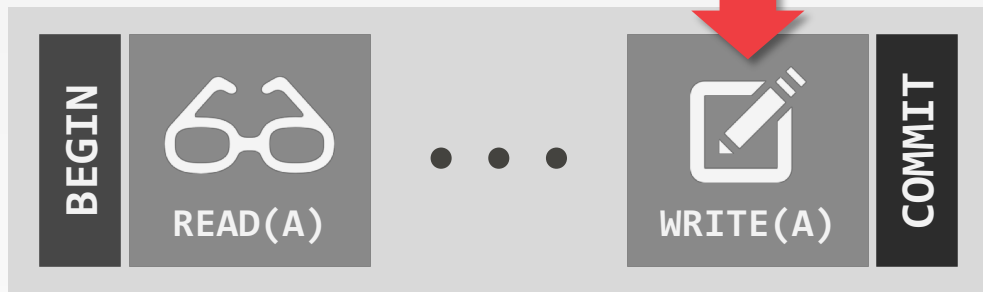


Txn #2

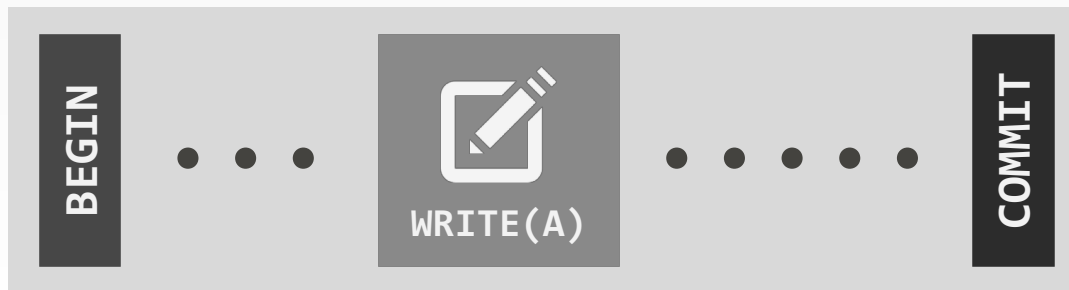


LOST UPDATE ANOMALY

Txn #1

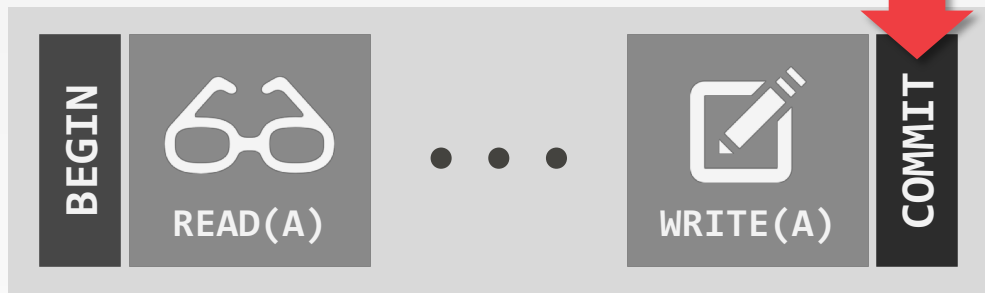


Txn #2

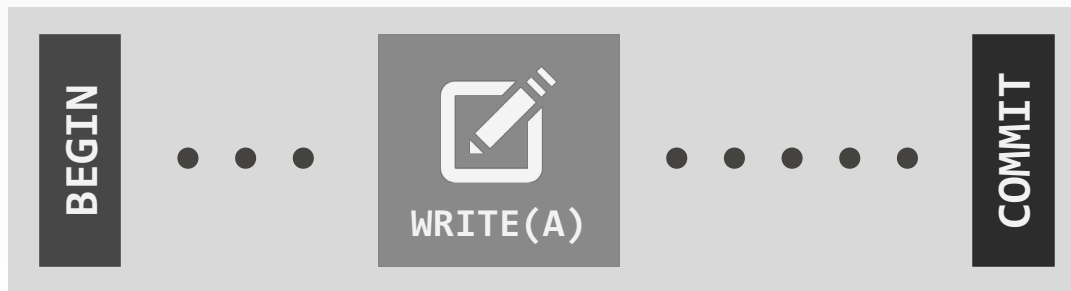


LOST UPDATE ANOMALY

Txn #1

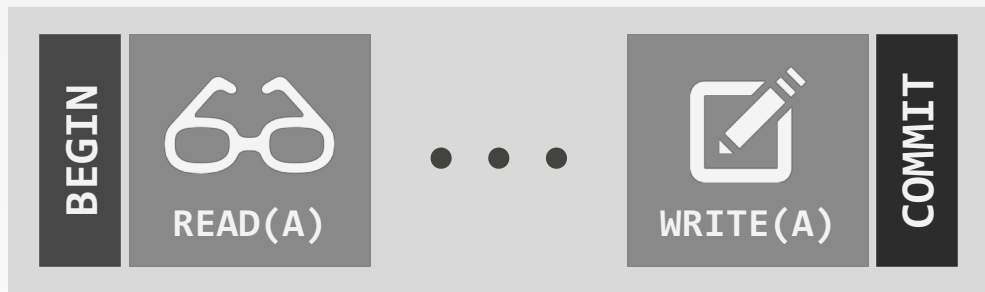


Txn #2



LOST UPDATE ANOMALY

Txn #1

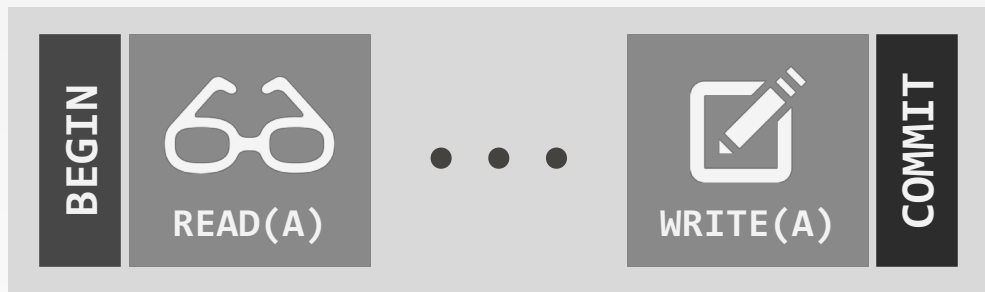


Txn #2



LOST UPDATE ANOMALY

Txn #1



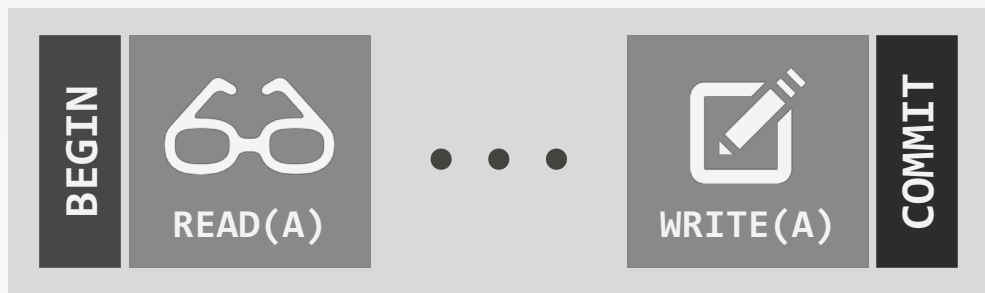
Txn #2's write to **A** will be lost even though it commits after Txn #1.

Txn #2



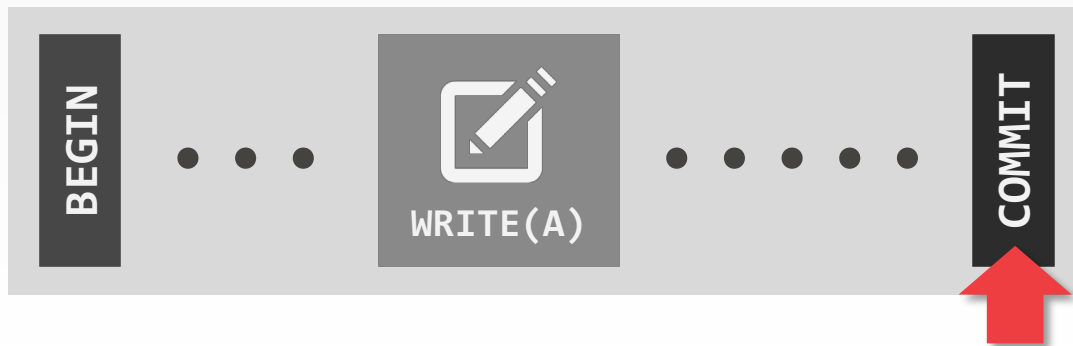
LOST UPDATE ANOMALY

Txn #1



Txn #2's write to **A** will be lost even though it commits after Txn #1.

Txn #2



A cursor lock on **A** would prevent this problem (but not always).

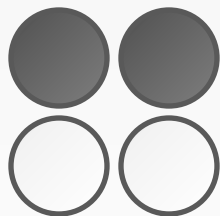
SNAPSHOT ISOLATION (SI)

Guarantees that all reads made in a txn see a consistent snapshot of the database that existed at the time the txn started.

→ A txn will commit under SI only if its writes do not conflict with any concurrent updates made since that snapshot.

SI is susceptible to the Write Skew Anomaly

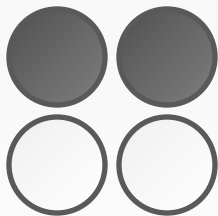
WRITE SKEW ANOMALY



WRITE SKEW ANOMALY

Txn #1

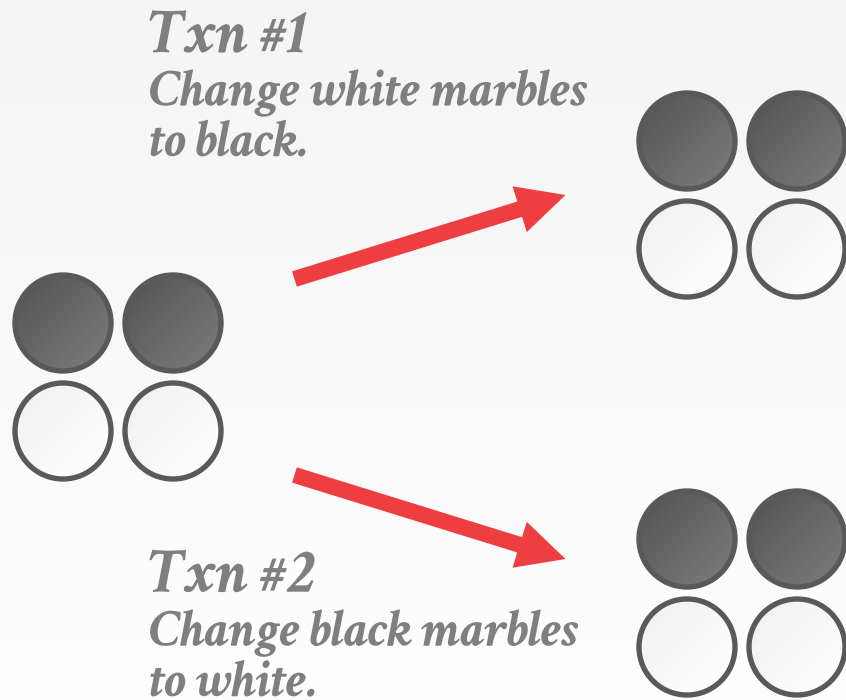
*Change white marbles
to black.*



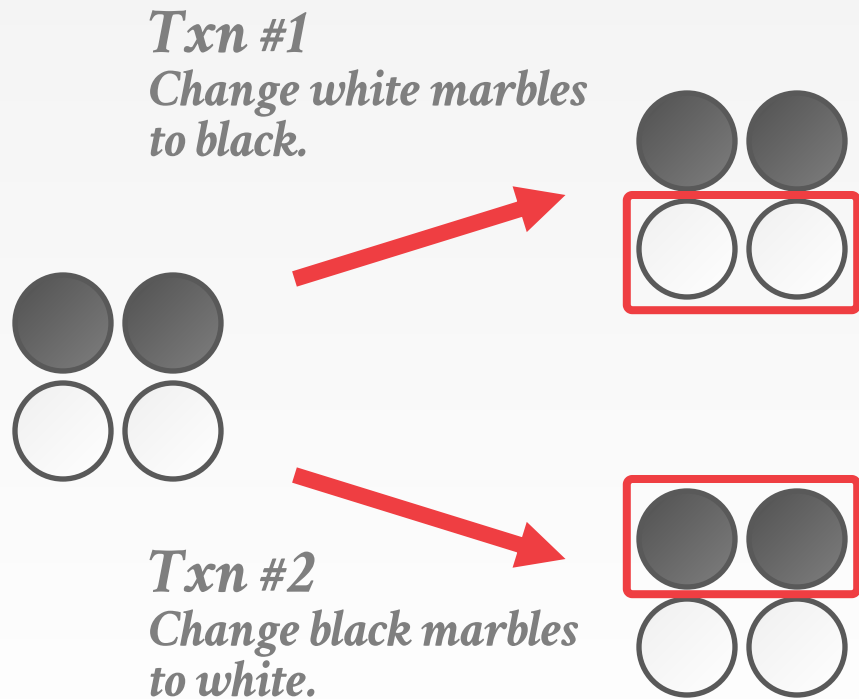
Txn #2

*Change black marbles
to white.*

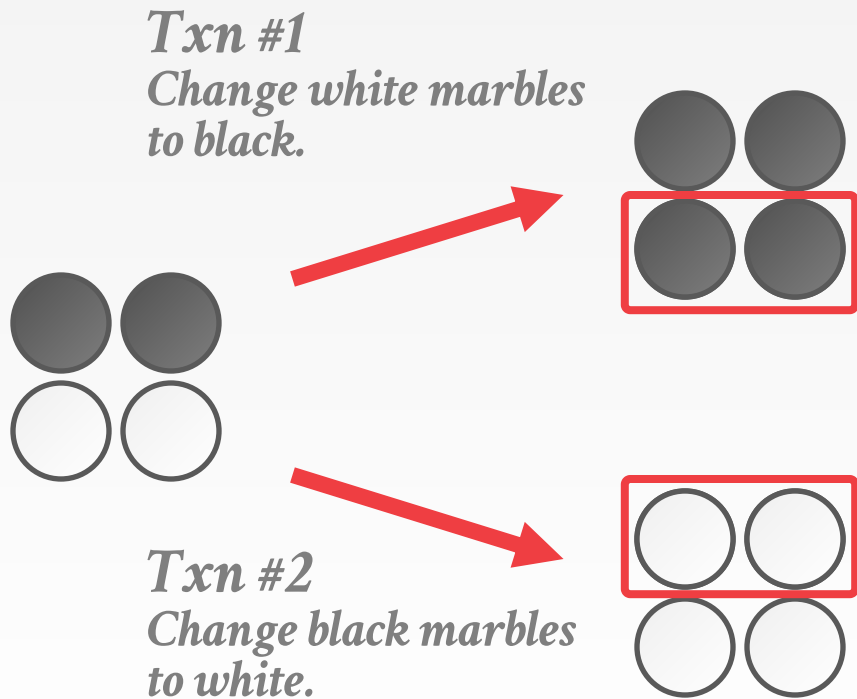
WRITE SKEW ANOMALY



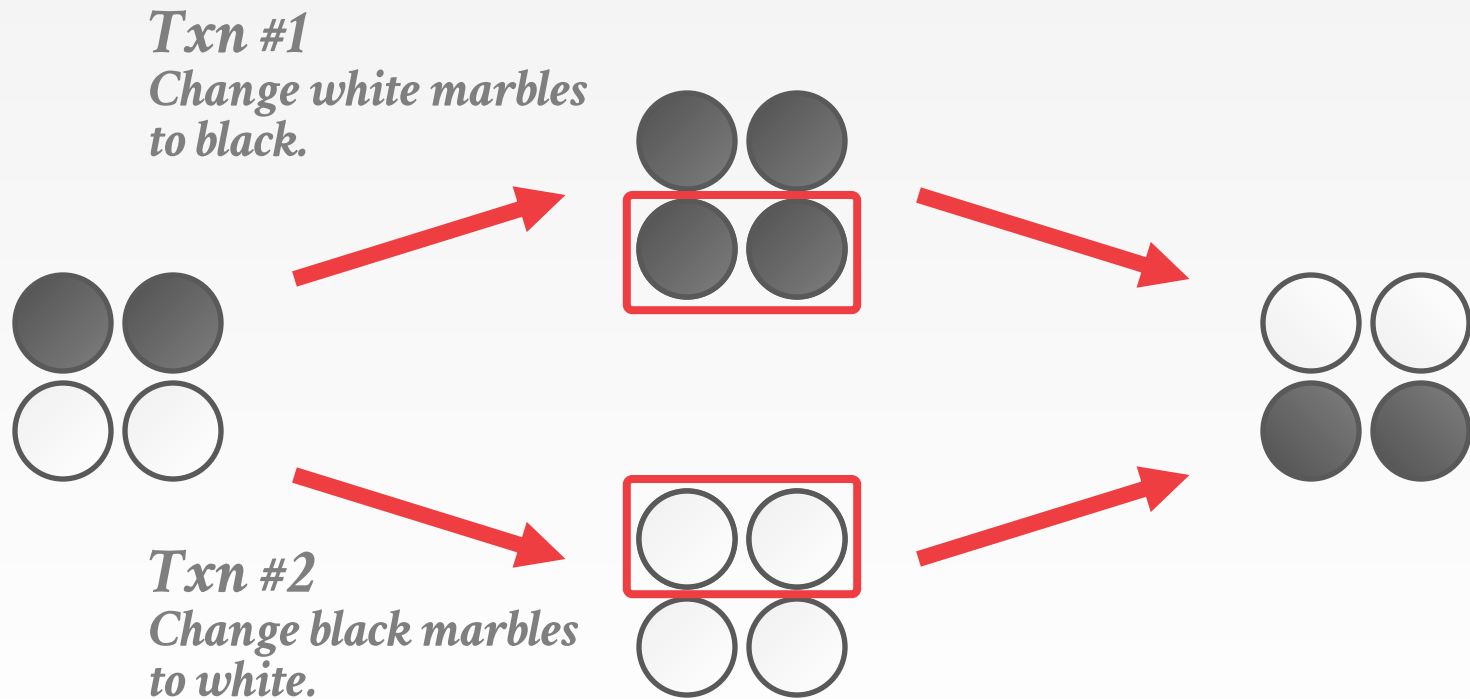
WRITE SKEW ANOMALY



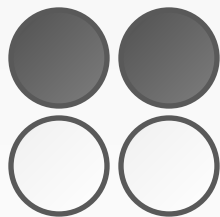
WRITE SKEW ANOMALY



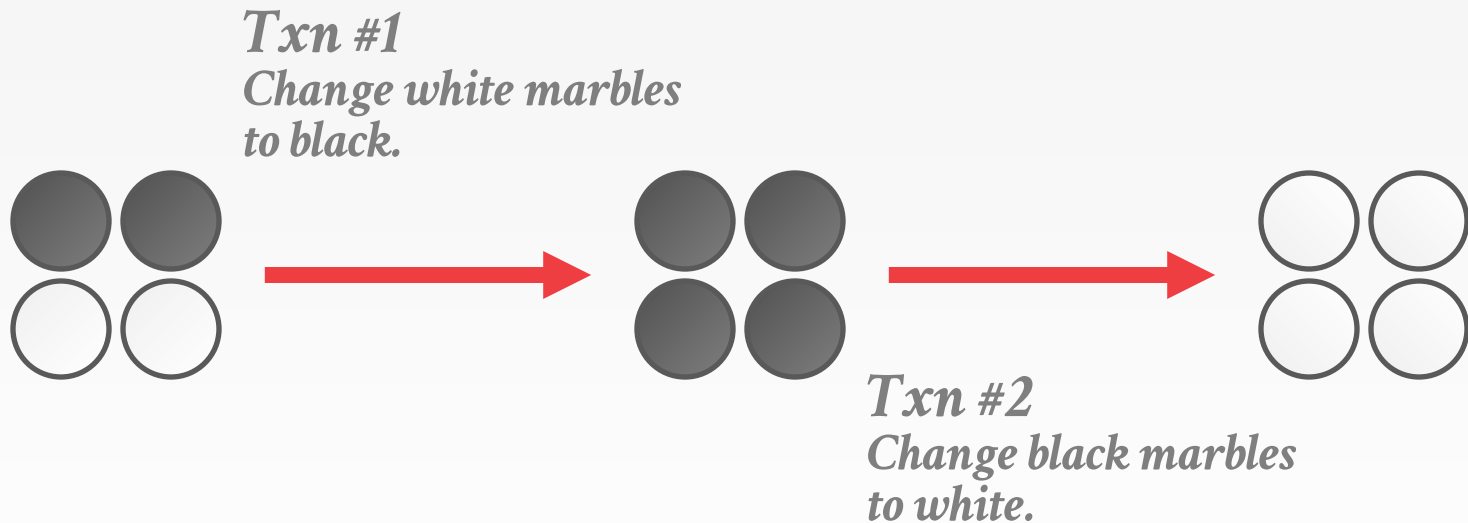
WRITE SKEW ANOMALY



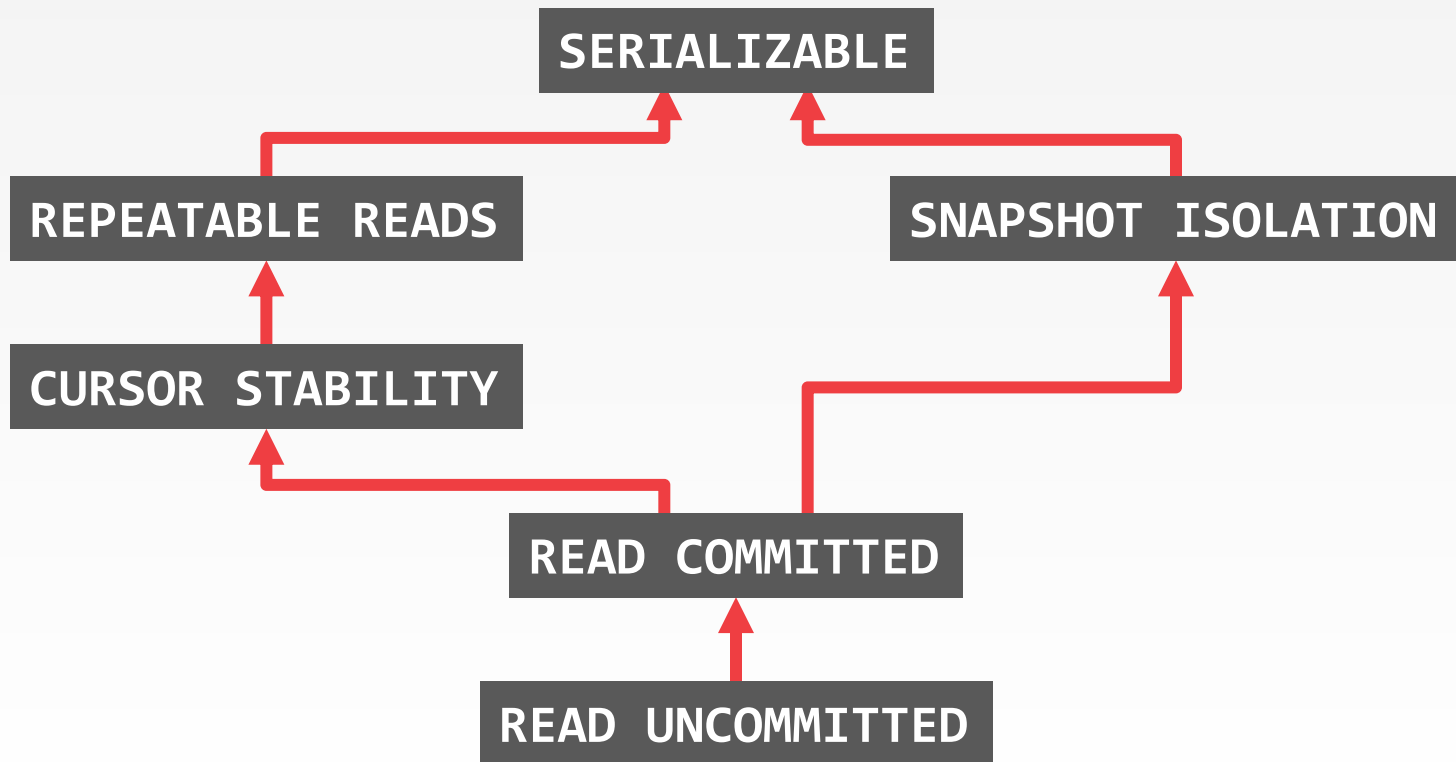
WRITE SKEW ANOMALY



WRITE SKEW ANOMALY



ISOLATION LEVEL HIERARCHY



REPEATABLE

CURSOR S

HY

SOLUTION

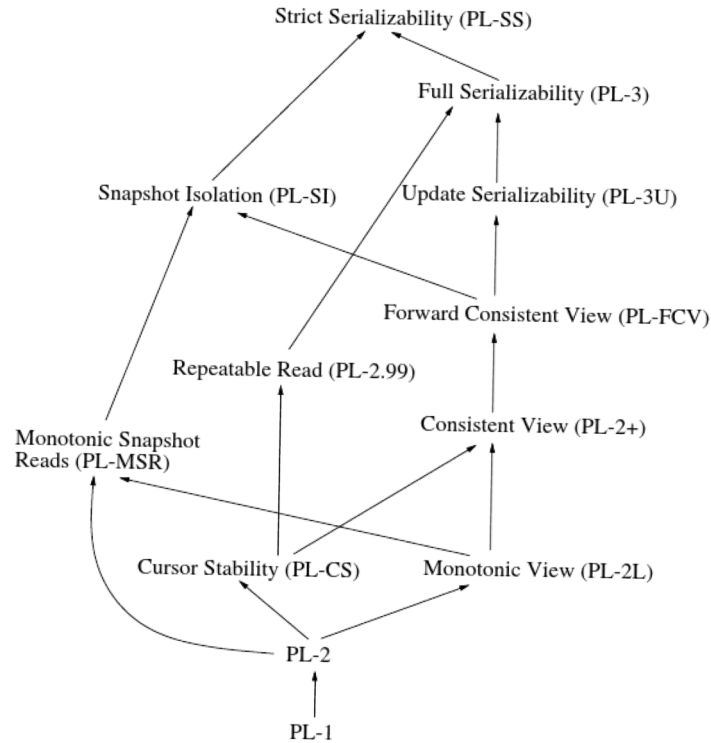


Figure 4-1: A partial order to relate various isolation levels.

MULTI-VERSION CONCURRENCY CONTROL

The DBMS maintains multiple **physical** versions of a single **logical** object in the database:

- When a txn writes to an object, the DBMS creates a new version of that object.
- When a txn reads an object, it reads the newest version that existed when the txn started.

First proposed in 1978 MIT PhD dissertation.

First implementation was InterBase (Firebird).

Used in almost every new DBMS in last 10 years.

MULTI-VERSION CONCURRENCY CONTROL

Main benefits:

- Writers don't block readers.
- Read-only txns can read a consistent snapshot without acquiring locks.
- Easily support time-travel queries.

MVCC is more than just a “concurrency control protocol”. It completely affects how the DBMS manages transactions and the database.

MVCC DESIGN DECISIONS

Concurrency Control Protocol

Version Storage

Garbage Collection

Index Management

Txn Id Wraparound (New)



This is the Best Paper Ever on In-Memory Multi-Version Concurrency Control

Yingjun Wu

Joy Arulraj

DECISIONS

Jie
Carnegie M
jiejil@cs.cmu.edu

ABSTRACT

Multi-version concurrency control (MVCC) is a popular scheme used in database management systems (DBMSs). Although it is used in almost every modern DBMS, it is not perfect. Maintaining multiple versions of data in parallelism without sacrificing performance is a large number of decisions. To understand how MVCC we conduct an extensive study of all of these in an in-memory transactional and hybrid database environment.

1. INTRODUCTION

The evolution of computer architecture, core, in-memory DBMSs, and workloads, these systems need to maximize parallelism. The most popular protocol in the last decade is multi-version concurrency control (MVCC). The idea of MVCC is that each logical version of a tuple is stored in the same tuple to proceed with access older versions. This is appealing for hybrid transactional and analytical workloads that execute read-only transactions immediately after transaction.

What is interesting about MVCC is that the algorithm appeared in a 1979 dissertation started in 1981 [21] for the

If You Only Read One Empirical Evaluation Paper on In-Memory Multi-Version Concurrency Control, Make It This One!

Jie
Carnegie M
jiejil@cs.cmu.edu

ABSTRACT

Multi-version concurrency control (MVCC) is a popular transaction management system (DBMS) since the late 1970s. It is used in almost every modern database management system. To understand how MVCC we conduct an extensive study of all of these in an in-memory transactional and hybrid database environment.

1. INTRODUCTION

Computer architecture, core, in-memory DBMSs, and workloads, these systems need to maximize parallelism. The most popular protocol in the last decade is multi-version concurrency control (MVCC). The idea of MVCC is that each logical version of a tuple is stored in the same tuple to proceed with access older versions. This is appealing for hybrid transactional and analytical workloads that execute read-only transactions immediately after transaction.

We Think That You Will Really Enjoy This Empirical Evaluation Paper on In-Memory Multi-Version Concurrency Control

Jie
Carnegie M
jiejil@cs.cmu.edu

ABSTRACT

Multi-version concurrency control (MVCC) is a popular transaction management system (DBMS) since the late 1970s. It is used in almost every modern database management system. To understand how MVCC we conduct an extensive study of all of these in an in-memory transactional and hybrid database environment.

1. INTRODUCTION

Computer architecture, core, in-memory DBMSs, and workloads, these systems need to maximize parallelism. The most popular protocol in the last decade is multi-version concurrency control (MVCC). The idea of MVCC is that each logical version of a tuple is stored in the same tuple to proceed with access older versions. This is appealing for hybrid transactional and analytical workloads that execute read-only transactions immediately after transaction.

An Empirical Evaluation of In-Memory Multi-Version Concurrency Control

Yingjun Wu
National University of Singapore
yingjun@comp.nus.edu.sgJoy Arulraj
Carnegie Mellon University
jarulraj@cs.cmu.eduJie Lin
Carnegie Mellon University
jiejil@cs.cmu.eduRan Xian
Carnegie Mellon University
rxian@cs.cmu.eduAndrew Pavlo
Carnegie Mellon University
pavlo@cs.cmu.edu

ABSTRACT

Multi-version concurrency control (MVCC) is currently the most popular transaction management scheme in modern database management systems (DBMSs). Although MVCC was discovered in the late 1970s, it is used in almost every major relational DBMS released in the last decade. Maintaining multiple versions of data potentially increases parallelism without sacrificing serializability when processing transactions. But scaling MVCC in a multi-core and in-memory setting is non-trivial: when there are a large number of threads running in parallel, the synchronization overhead can outweigh the benefits of multi-versioning.

To understand how MVCC perform when processing transactions in modern hardware settings, we conduct an extensive study of the scheme's four key design decisions: concurrency control protocol, version storage, garbage collection, and index management. We implemented state-of-the-art variants of all of these in an in-memory transactional and analytical database environment.

in a 1979 dissertation [38] and the first implementation started in 1981 [22] for the InterBase DBMS (now open-sourced as Firebird). MVCC is also used in some of the most widely deployed disk-oriented DBMSs today, including Oracle (since 1984 [4]), PostgreSQL (since 1985 [41]), and MySQL's InnoDB engine (since 2001). But while there are plenty of contemporaries to these older systems that use a single-version scheme (e.g., IBM DB2, Sybase), almost every new transactional DBMS eschews this approach in favor of MVCC [37]. This includes both commercial (e.g., Microsoft Hekaton [16], SAP HANA [40], MemSQL [11], NuoDB [13]) and academic (e.g., HYRISE [21], HyPer [36]) systems.

Despite all these newer systems using MVCC, there is no one "standard" implementation. There are several design choices that have different trade-offs and performance behaviors. Until now, there has not been a comprehensive evaluation of MVCC in a modern DBMS operating environment. The last extensive study was in the 1980s [13], but it used simulated workloads running in a

AN EMPIRICAL
EVALUATION OF
VERSION CONTROL
VLDB 2017

MVCC IMPLEMENTATIONS

	<i>Protocol</i>	<i>Version Storage</i>	<i>Garbage Collection</i>	<i>Indexes</i>
Oracle	MV2PL	Delta	Vacuum	Logical
Postgres	MV-2PL/MV-TO	Append-Only	Vacuum	Physical
MySQL-InnoDB	MV-2PL	Delta	Vacuum	Logical
HYRISE	MV-OCC	Append-Only	-	Physical
Hekaton	MV-OCC	Append-Only	Cooperative	Physical
MemSQL	MV-OCC	Append-Only	Vacuum	Physical
SAP HANA	MV-2PL	Time-travel	Hybrid	Logical
NuoDB	MV-2PL	Append-Only	Vacuum	Logical
HyPer	MV-OCC	Delta	Txn-level	Logical

TUPLE FORMAT

TXN-ID	BEGIN-TS	END-TS	POINTER	...	<i>DATA</i>
--------	----------	--------	---------	-----	-------------

TUPLE FORMAT

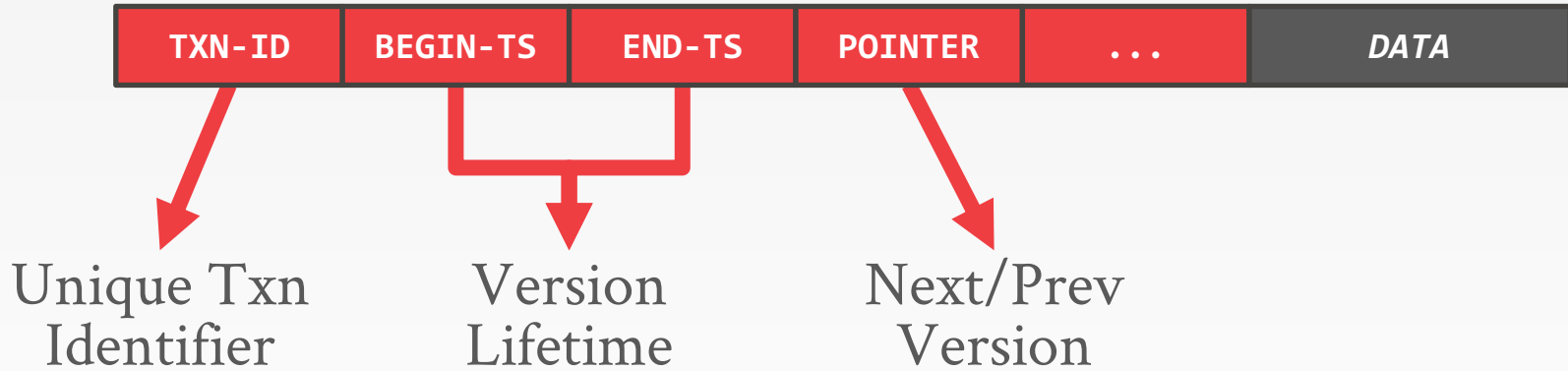


Unique Txn
Identifier

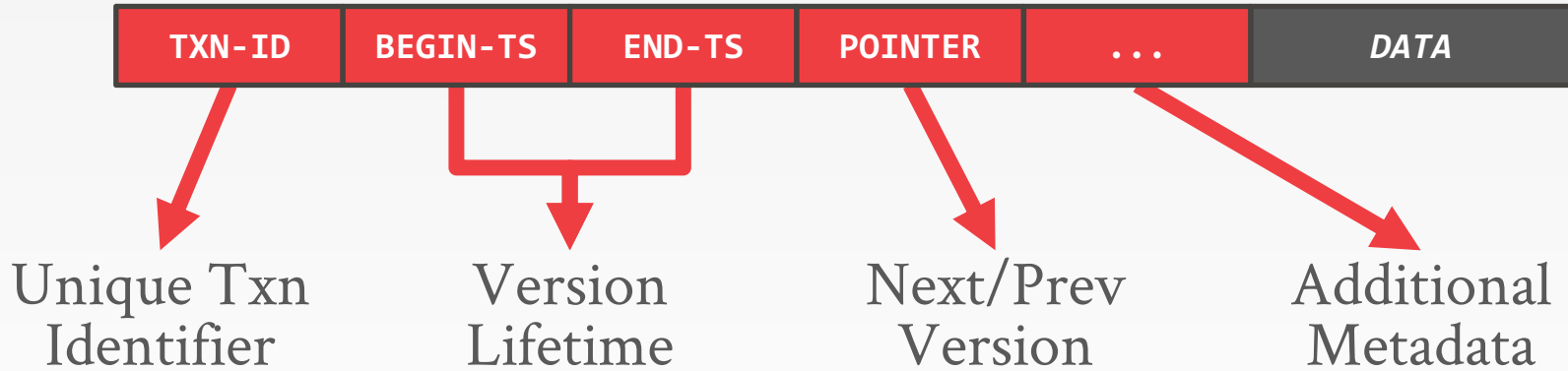
TUPLE FORMAT



TUPLE FORMAT



TUPLE FORMAT



CONCURRENCY CONTROL PROTOCOL

Approach #1: Timestamp Ordering

- Assign txns timestamps that determine serial order.
- Considered to be original MVCC protocol.

Approach #2: Optimistic Concurrency Control

- Three-phase protocol from last class.
- Use private workspace for new versions.

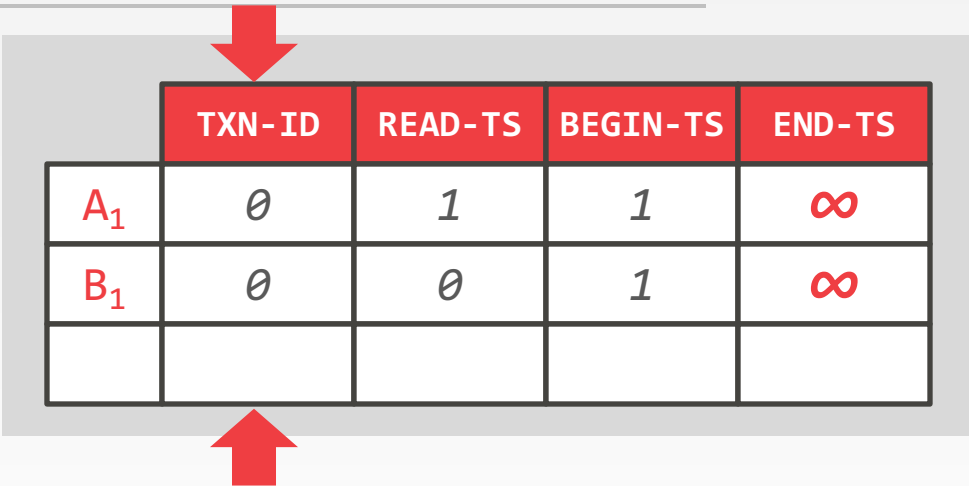
Approach #3: Two-Phase Locking

- Txns acquire appropriate lock on physical version before they can read/write a logical tuple.

TIMESTAMP ORDERING (MVTO)

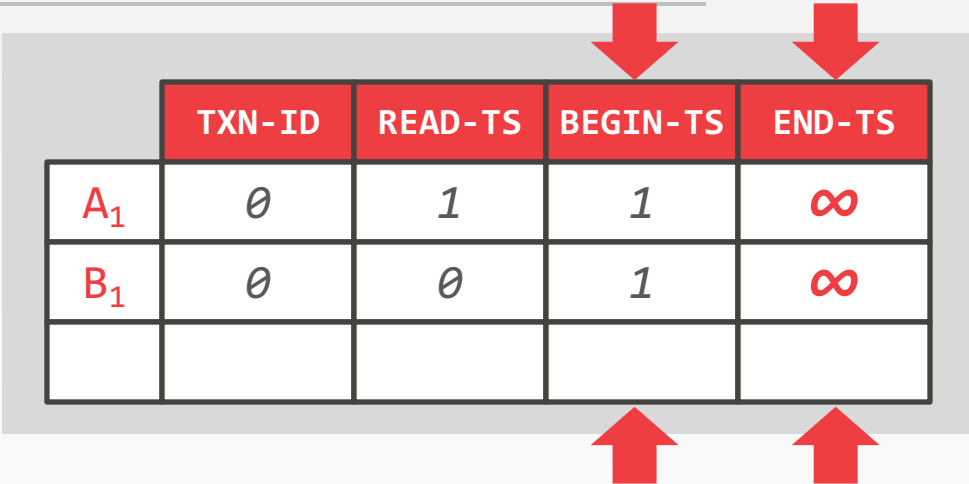
	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	1	1	∞
B_1	\emptyset	\emptyset	1	∞

TIMESTAMP ORDERING (MVTO)



	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	1	1	∞
B_1	\emptyset	\emptyset	1	∞

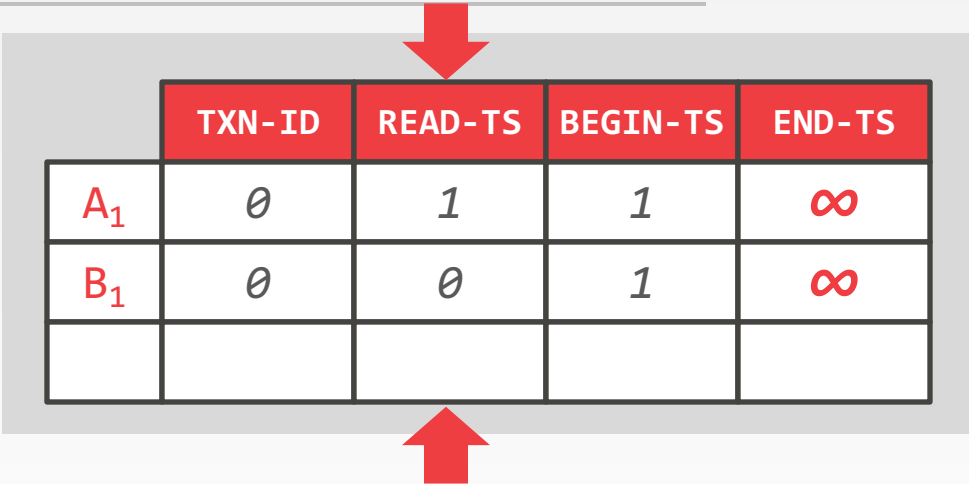
TIMESTAMP ORDERING (MVTO)



The diagram illustrates the Timestamp Ordering (MVTO) protocol. It features a table with five columns: TXN-ID, READ-TS, BEGIN-TS, and END-TS. The first two rows represent transactions A₁ and B₁. Transaction A₁ has a TXN-ID of 0, a READ-TS of 1, a BEGIN-TS of 1, and an END-TS of ∞. Transaction B₁ has a TXN-ID of 0, a READ-TS of 0, a BEGIN-TS of 1, and an END-TS of ∞. The third row is empty. Four red arrows point to the BEGIN-TS and END-TS columns: two arrows point down to the BEGIN-TS column and two arrows point up to the END-TS column.

	TXN-ID	READ-TS	BEGIN-TS	END-TS
A ₁	0	1	1	∞
B ₁	0	0	1	∞

TIMESTAMP ORDERING (MVTO)



	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	1	1	∞
B_1	\emptyset	\emptyset	1	∞

Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

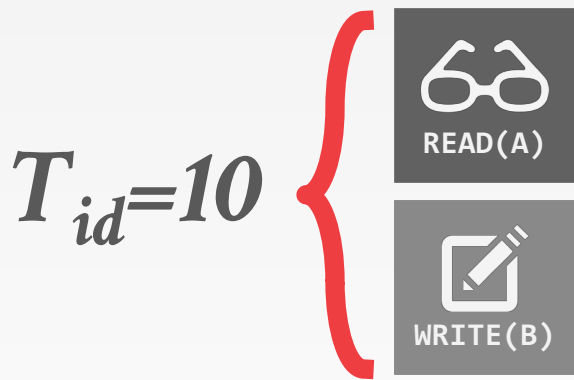
TIMESTAMP ORDERING (MVTO)



Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	1	1	∞
B_1	\emptyset	\emptyset	1	∞

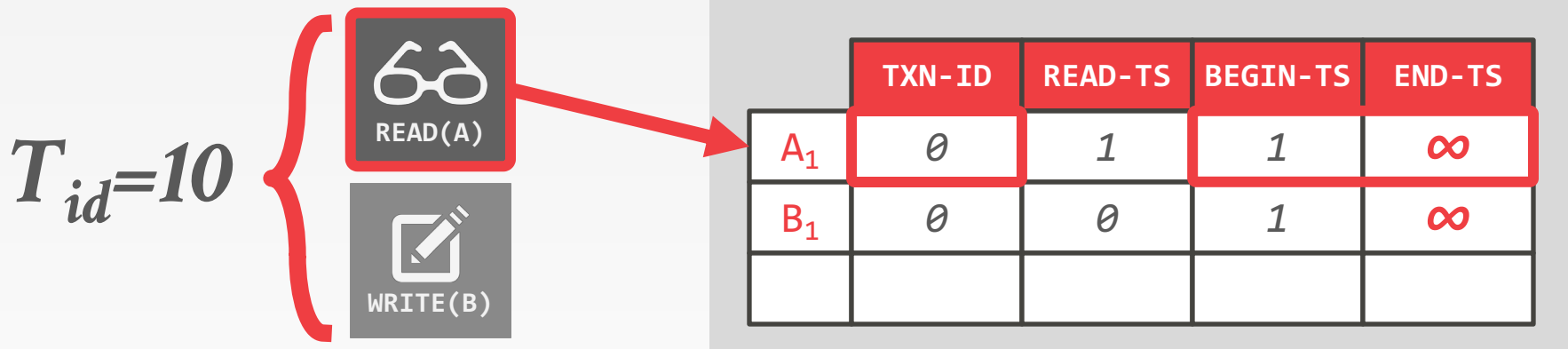
TIMESTAMP ORDERING (MVTO)



	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	1	1	∞
B_1	\emptyset	\emptyset	1	∞

Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

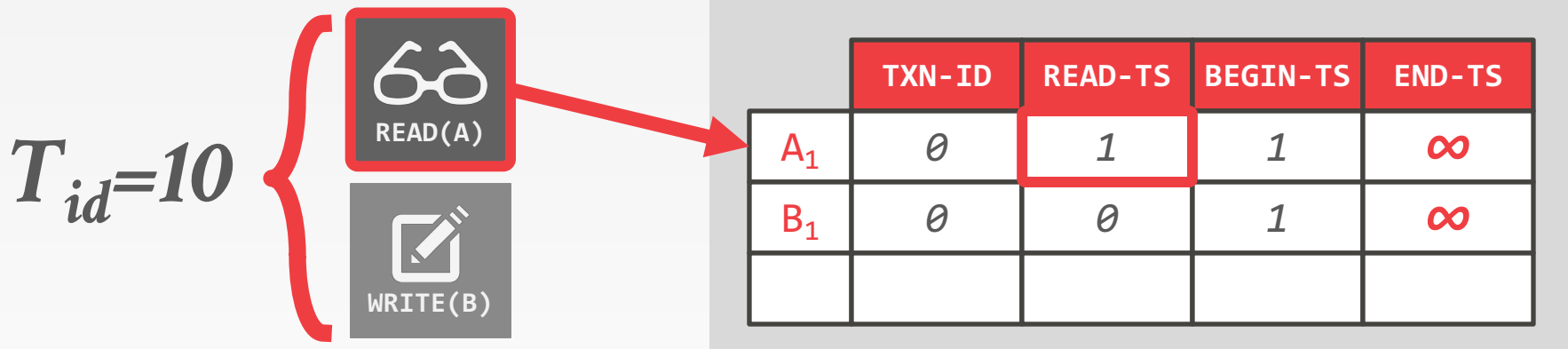
TIMESTAMP ORDERING (MVTO)



Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

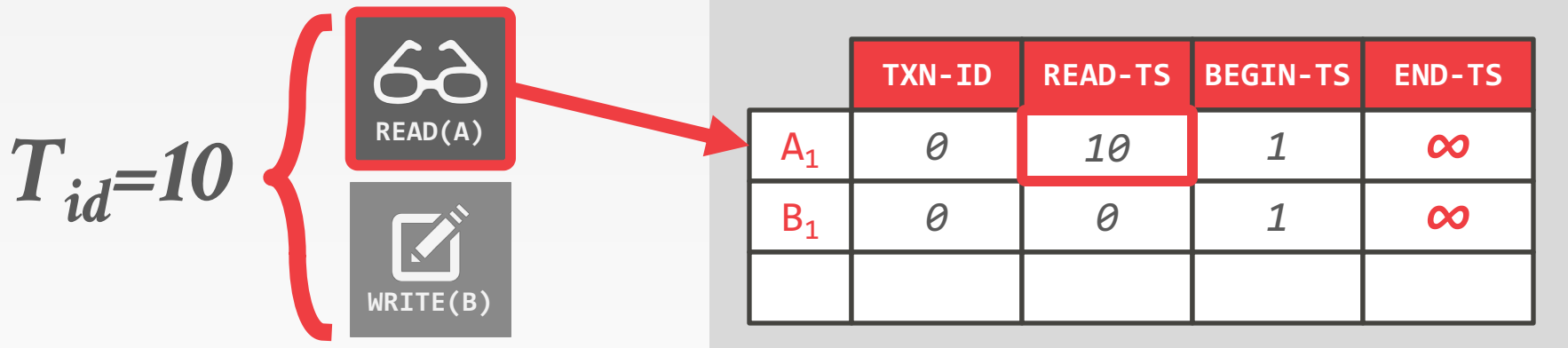
TIMESTAMP ORDERING (MVTO)



Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

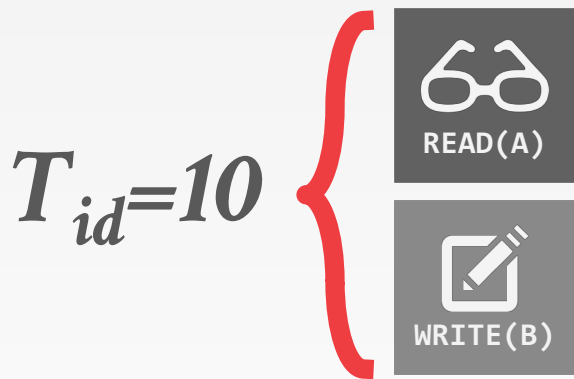
TIMESTAMP ORDERING (MVTO)



Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

TIMESTAMP ORDERING (MVTO)

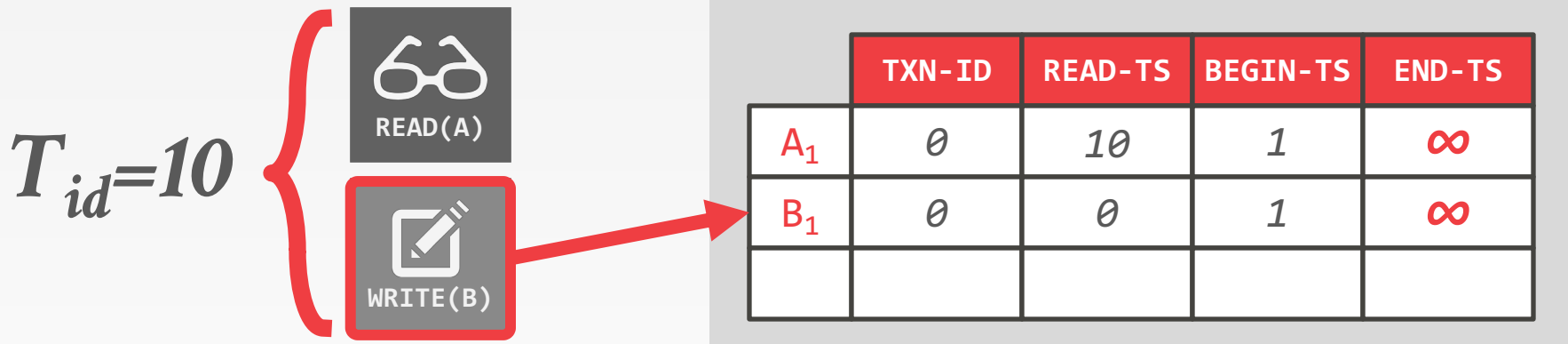


	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	10	1	∞
B_1	\emptyset	\emptyset	1	∞

Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

TIMESTAMP ORDERING (MVTO)

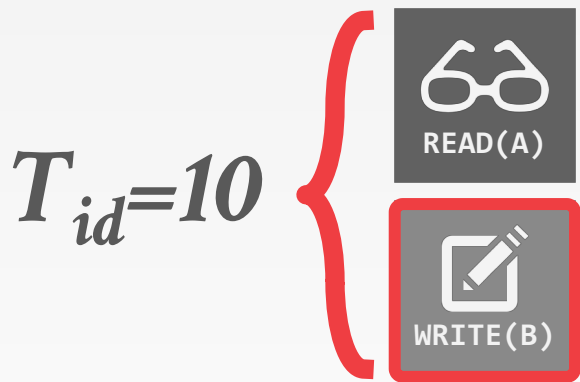


Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

Txn creates a new version if no other txn holds lock and T_{id} is greater than “read-ts”.

TIMESTAMP ORDERING (MVTO)



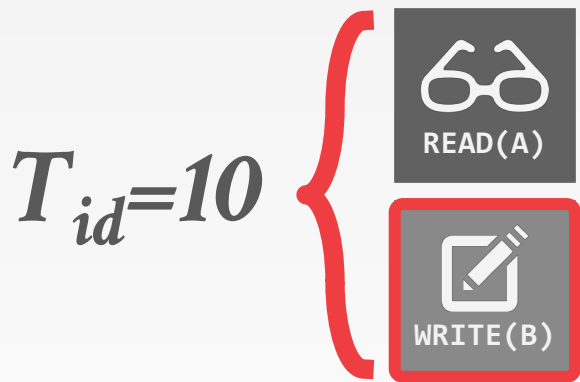
	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	10	1	∞
B_1	\emptyset	\emptyset	1	∞


Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

Txn creates a new version if no other txn holds lock and T_{id} is greater than “read-ts”.

TIMESTAMP ORDERING (MVTO)



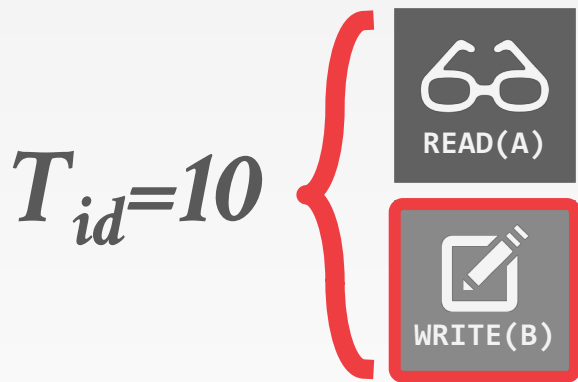
	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	10	1	∞
 B_1	10	\emptyset	1	∞


Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

Txn creates a new version if no other txn holds lock and T_{id} is greater than “read-ts”.

TIMESTAMP ORDERING (MVTO)



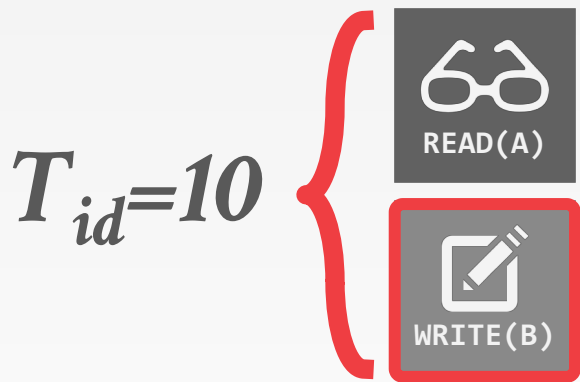
	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	10	1	∞
 B_1	10	\emptyset	1	∞



Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

Txn creates a new version if no other txn holds lock and T_{id} is greater than “read-ts”.

TIMESTAMP ORDERING (MVTO)



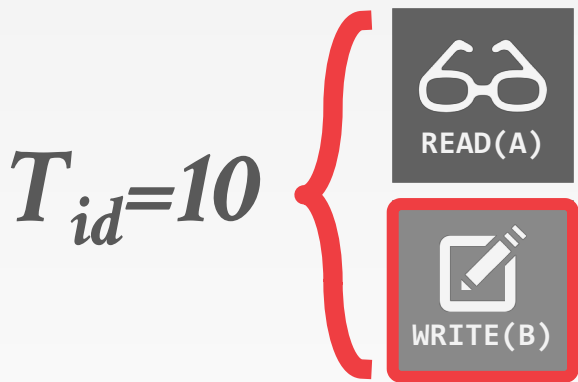
	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	10	1	∞
 B_1	10	\emptyset	1	∞
 B_2	10	\emptyset	10	∞

Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

Txn creates a new version if no other txn holds lock and T_{id} is greater than “read-ts”.

TIMESTAMP ORDERING (MVTO)



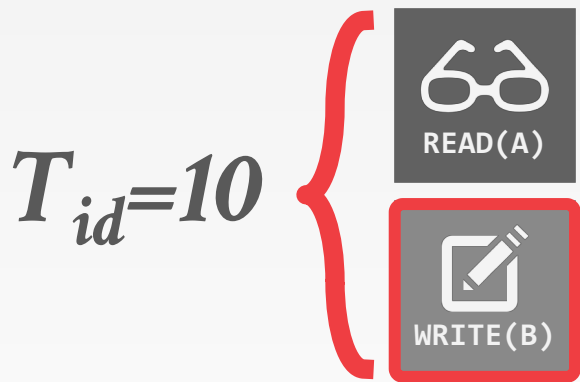
	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	$1\emptyset$	1	∞
B_1	$1\emptyset$	\emptyset	1	$1\emptyset$
B_2	$1\emptyset$	\emptyset	$1\emptyset$	∞

Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

Txn creates a new version if no other txn holds lock and T_{id} is greater than “read-ts”.

TIMESTAMP ORDERING (MVTO)



	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	10	1	∞
B_1	\emptyset	\emptyset	1	10
B_2	\emptyset	\emptyset	10	∞

Use “read-ts” field in the header to keep track of the timestamp of the last txn that read it.

Txn is allowed to read version if the lock is unset and its T_{id} is between “begin-ts” and “end-ts”.

Txn creates a new version if no other txn holds lock and T_{id} is greater than “read-ts”.

VERSION STORAGE

The DBMS uses the tuples' pointer field to create a latch-free **version chain** per logical tuple.

- This allows the DBMS to find the version that is visible to a particular txn at runtime.
- Indexes always point to the “head” of the chain.

Threads store versions in “local” memory regions to avoid contention on centralized data structures.

Different storage schemes determine where/what to store for each version.

VERSION STORAGE

Approach #1: Append-Only Storage

→ New versions are appended to the same table space.

Approach #2: Time-Travel Storage

→ Old versions are copied to separate table space.


Approach #3: Delta Storage

→ The original values of the modified attributes are copied into a separate delta record space.

APPEND-ONLY STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	●
A_2	XXX	\$222	∅
B_1	YYY	\$10	∅



APPEND-ONLY STORAGE

Main Table


	KEY	VALUE	POINTER
A_1	XXX	\$111	●
A_2	XXX	\$222	∅
B_1	YYY	\$10	∅

All of the physical versions of a logical tuple are stored in the same table space

APPEND-ONLY STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	●
A_2	XXX	\$222	∅
B_1	YYY	\$10	∅



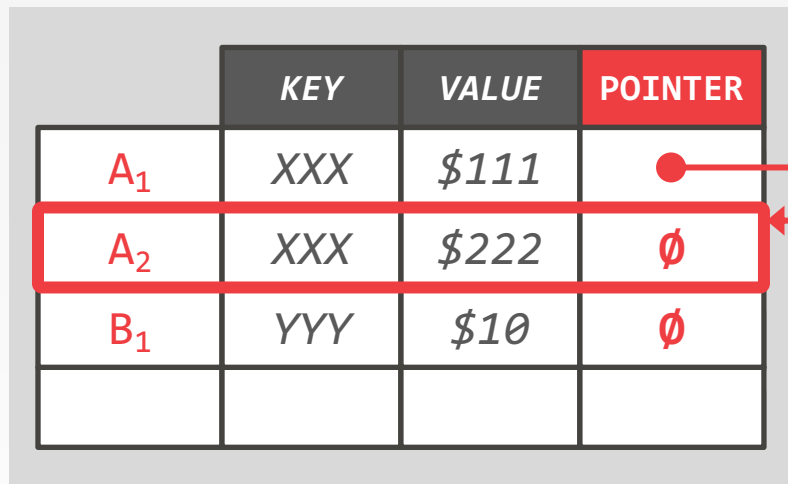
All of the physical versions of a logical tuple are stored in the same table space

On every update, append a new version of the tuple into an empty space in the table.

APPEND-ONLY STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	●
A_2	XXX	\$222	∅
B_1	YYY	\$10	∅



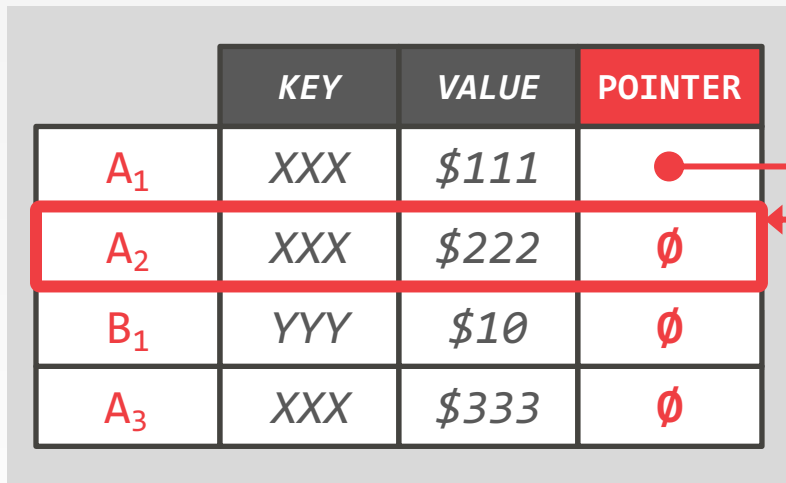
All of the physical versions of a logical tuple are stored in the same table space

On every update, append a new version of the tuple into an empty space in the table.

APPEND-ONLY STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	●
A_2	XXX	\$222	∅
B_1	YYY	\$10	∅
A_3	XXX	\$333	∅

A diagram of a table with four rows. The first row is labeled A1, the second A2, the third B1, and the fourth A3. The columns are KEY, VALUE, and POINTER. The A2 row is highlighted with a red border. A red dot in the A1 row's POINTER column has a red arrow pointing to the A2 row.

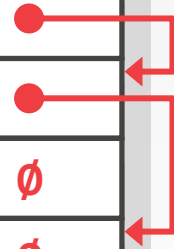
All of the physical versions of a logical tuple are stored in the same table space

On every update, append a new version of the tuple into an empty space in the table.

APPEND-ONLY STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	●
A_2	XXX	\$222	●
B_1	YYY	\$10	∅
A_3	XXX	\$333	∅



All of the physical versions of a logical tuple are stored in the same table space

On every update, append a new version of the tuple into an empty space in the table.

VERSION CHAIN ORDERING

Approach #1: Oldest-to-Newest (O2N)

- Just append new version to end of the chain.
- Have to traverse chain on look-ups.

Approach #2: Newest-to-Oldest (N2O)

- Have to update index pointers for every new version.
- Don't have to traverse chain on look ups.

The ordering of the chain has different performance trade-offs.

TIME-TRAVEL STORAGE

Main Table

	KEY	VALUE	POINTER
A_2	XXX	\$222	●
B_1	YYY	\$10	

Time-Travel Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	∅

TIME-TRAVEL STORAGE

Main Table

	KEY	VALUE	POINTER
A_2	XXX	\$222	●
B_1	YYY	\$10	

Time-Travel Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	∅

On every update, copy the current version to the time-travel table. Update pointers.

TIME-TRAVEL STORAGE

Main Table

	KEY	VALUE	POINTER
A_2	XXX	\$222	● →
B_1	YYY	\$10	

Time-Travel Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	∅ ←
A_2	XXX	\$222	● ←

On every update, copy the current version to the time-travel table. Update pointers.

TIME-TRAVEL STORAGE

Main Table

	KEY	VALUE	POINTER
A_2	XXX	\$222	● →
B_1	YYY	\$10	

Time-Travel Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	∅ ←
A_2	XXX	\$222	● ←

On every update, copy the current version to the time-travel table. Update pointers.

Overwrite master version in the main table. Update pointers.

TIME-TRAVEL STORAGE

Main Table

	KEY	VALUE	POINTER
A_3	XXX	\$333	●
B_1	YYY	\$10	

Time-Travel Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	\emptyset
A_2	XXX	\$222	●

On every update, copy the current version to the time-travel table. Update pointers.

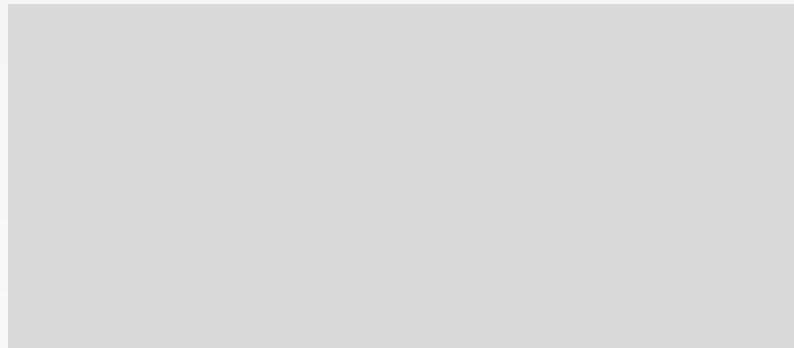
Overwrite master version in the main table. Update pointers.

DELTA STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	
B_1	YYY	\$10	

Delta Storage Segment

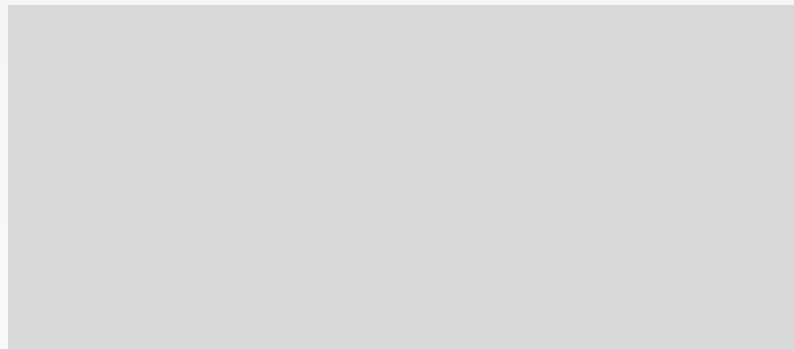


DELTA STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	
B_1	YYY	\$10	

Delta Storage Segment



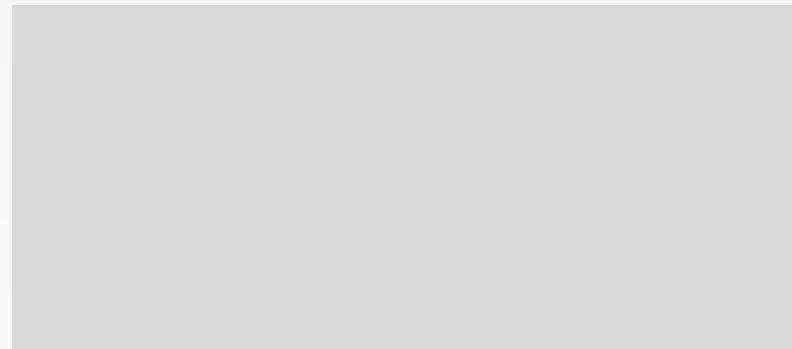
On every update, copy only the values that were modified to the delta storage and overwrite the master version.

DELTA STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	
B_1	YYY	\$10	

Delta Storage Segment



On every update, copy only the values that were modified to the delta storage and overwrite the master version.

DELTA STORAGE

Main Table

	KEY	VALUE	POINTER
A_1	XXX	\$111	
B_1	YYY	\$10	

Delta Storage Segment

	DELTA	POINTER
A_1	(VALUE→\$111)	∅

On every update, copy only the values that were modified to the delta storage and overwrite the master version.

DELTA STORAGE

Main Table

	KEY	VALUE	POINTER
A_2	XXX	\$222	● →
B_1	YYY	\$10	

Delta Storage Segment

	DELTA	POINTER
A_1	(VALUE→\$111)	∅

On every update, copy only the values that were modified to the delta storage and overwrite the master version.

DELTA STORAGE

Main Table

	KEY	VALUE	POINTER
A_2	XXX	\$222	● →
B_1	YYY	\$10	

Delta Storage Segment

	DELTA	POINTER
A_1	(VALUE→\$111)	∅ ←
A_2	(VALUE→\$222)	● ←

On every update, copy only the values that were modified to the delta storage and overwrite the master version.

DELTA STORAGE

Main Table

	KEY	VALUE	POINTER
A_3	XXX	\$333	●
B_1	YYY	\$10	

Delta Storage Segment

	DELTA	POINTER
A_1	(VALUE→\$111)	∅
A_2	(VALUE→\$222)	●

On every update, copy only the values that were modified to the delta storage and overwrite the master version.

DELTA STORAGE

Main Table

	KEY	VALUE	POINTER
A_3	XXX	\$333	●
B_1	YYY	\$10	

Delta Storage Segment

	DELTA	POINTER
A_1	(VALUE→\$111)	∅
A_2	(VALUE→\$222)	●

On every update, copy only the values that were modified to the delta storage and overwrite the master version.

Txns can recreate old versions by applying the delta in reverse order.

NON-INLINE ATTRIBUTES

Main Table

	KEY	INT_VAL	STR_VAL
A_1	XXX	\$100	●

Variable-Length Data

MY_LONG_STRING

NON-INLINE ATTRIBUTES

Main Table

	KEY	INT_VAL	STR_VAL
A_1	XXX	\$100	●

Variable-Length Data

MY_LONG_STRING

NON-INLINE ATTRIBUTES

Main Table

	KEY	INT_VAL	STR_VAL
A_1	XXX	\$100	●
A_2	XXX	\$90	●

Variable-Length Data

MY_LONG_STRING

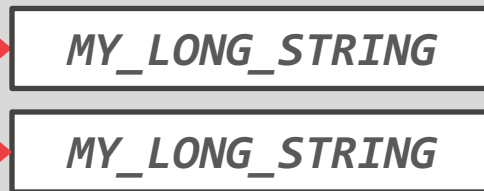
MY_LONG_STRING

NON-INLINE ATTRIBUTES

Main Table

	KEY	INT_VAL	STR_VAL
A_1	XXX	\$100	●
A_2	XXX	\$90	●

Variable-Length Data



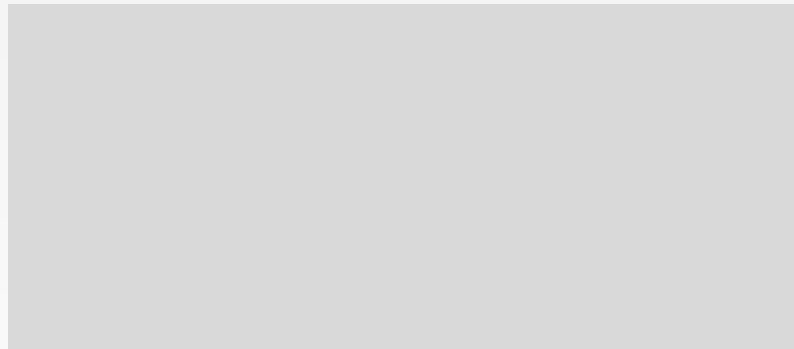
Reuse pointers to variable-length pool for values that do not change between versions.

NON-INLINE ATTRIBUTES

Main Table

	KEY	INT_VAL	STR_VAL
A_1	XXX	\$100	
A_2	XXX	\$90	

Variable-Length Data



Reuse pointers to variable-length pool for values that do not change between versions.

NON-INLINE ATTRIBUTES

Main Table

	KEY	INT_VAL	STR_VAL
A_1	XXX	\$100	●
A_2	XXX	\$90	

Variable-Length Data

Refs=1	MY_LONG_STRING
--------	----------------

Reuse pointers to variable-length pool for values that do not change between versions.

Requires reference counters to know when it safe to free memory. Unable to relocate memory easily.

NON-INLINE ATTRIBUTES

Main Table

	KEY	INT_VAL	STR_VAL
A_1	XXX	\$100	●
A_2	XXX	\$90	●

Variable-Length Data

Refs=2	MY_LONG_STRING
--------	----------------

Reuse pointers to variable-length pool for values that do not change between versions.

Requires reference counters to know when it safe to free memory. Unable to relocate memory easily.

GARBAGE COLLECTION

The DBMS needs to remove reclaimable physical versions from the database over time.

- No active txn in the DBMS can “see” that version (SI).
- The version was created by an aborted txn.

Two additional design decisions:

- How to look for expired versions?
- How to decide when it is safe to reclaim memory?

GARBAGE COLLECTION

The DBMS needs to remove reclaimable physical versions from the database over time.

- No active txn in the DBMS can “see” that version (SI).
- The version was created by an aborted txn.

Two additional design decisions:

- How to look for expired versions?
- How to decide when it is safe to reclaim memory?

GARBAGE COLLECTION

Approach #1: Tuple-level

- Find old versions by examining tuples directly.
- Background Vacuuming vs. Cooperative Cleaning

Approach #2: Transaction-level

- Txns keep track of their old versions so the DBMS does not have to scan tuples to determine visibility.

TUPLE-LEVEL GC

Thread #1

$T_{id=12}$

Thread #2

$T_{id=25}$

	TXN-ID	BEGIN-TS	END-TS
A_1	\emptyset	1	9
B_1	\emptyset	1	9
B_2	\emptyset	10	20

TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Thread #2

$T_{id}=25$

Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

	TXN-ID	BEGIN-TS	END-TS
A_1	\emptyset	1	9
B_1	\emptyset	1	9
B_2	\emptyset	10	20

TUPLE-LEVEL GC

Thread #1

$T_{id=12}$

Thread #2

$T_{id=25}$

Vacuum



	TXN-ID	BEGIN-TS	END-TS
A_1	\emptyset	1	9
B_1	\emptyset	1	9
B_2	\emptyset	10	20

Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Vacuum

Thread #2

$T_{id}=25$



	TXN-ID	BEGIN-TS	END-TS
A_1	\emptyset	1	9
B_1	\emptyset	1	9
B_2	\emptyset	10	20

Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Vacuum



Thread #2

$T_{id}=25$



	TXN-ID	BEGIN-TS	END-TS
A_1	\emptyset	1	9
B_1	\emptyset	1	9
B_2	\emptyset	10	20

Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Thread #2

$T_{id}=25$

Vacuum



	TXN-ID	BEGIN-TS	END-TS
B_2	\emptyset	$1\emptyset$	$2\emptyset$

Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Thread #2

$T_{id}=25$

Vacuum



<i>Dirty?</i>	TXN-ID	BEGIN-TS	END-TS
B_2	\emptyset	$1\emptyset$	$2\emptyset$

Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

TUPLE-LEVEL GC

Thread #1

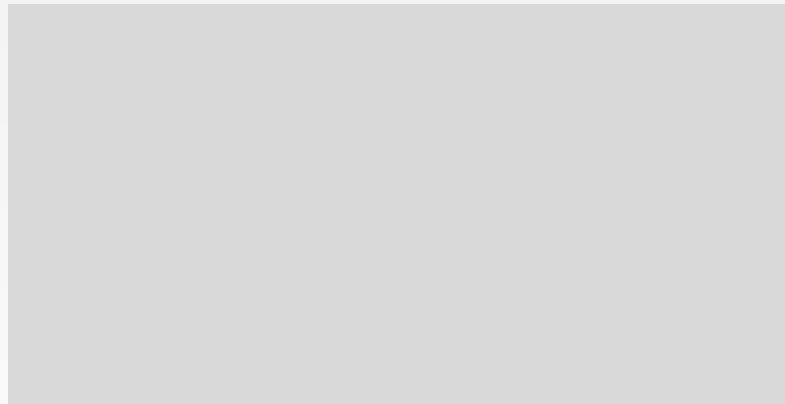
$T_{id}=12$

Thread #2

$T_{id}=25$

Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.



TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Thread #2

$T_{id}=25$

Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

Cooperative Cleaning:

Worker threads identify reclaimable versions as they traverse version chain. Only works with **O2N**.

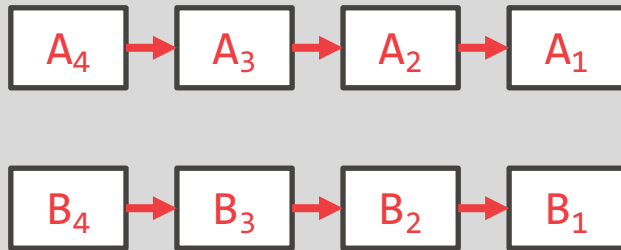
TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Thread #2

$T_{id}=25$



Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

Cooperative Cleaning:

Worker threads identify reclaimable versions as they traverse version chain. Only works with **O2N**.

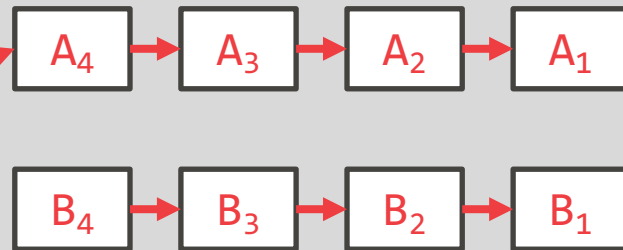
TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Thread #2

$T_{id}=25$



Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

Cooperative Cleaning:

Worker threads identify reclaimable versions as they traverse version chain. Only works with **O2N**.

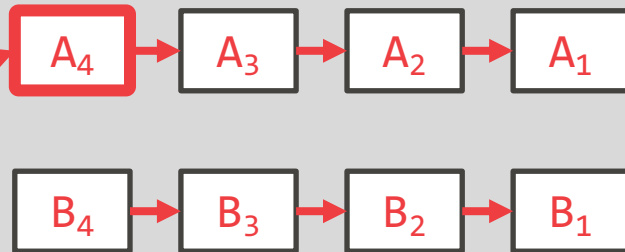
TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Thread #2

$T_{id}=25$



Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

Cooperative Cleaning:

Worker threads identify reclaimable versions as they traverse version chain. Only works with **O2N**.

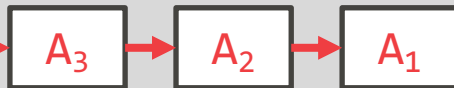
TUPLE-LEVEL GC

Thread #1

$T_{id}=12$

Thread #2

$T_{id}=25$



Background Vacuuming:

Separate thread(s) periodically scan the table and look for reclaimable versions. Works with any storage.

Cooperative Cleaning:

Worker threads identify reclaimable versions as they traverse version chain. Only works with **O2N**.

TRANSACTION-LEVEL GC

Each txn keeps track of its read/write set.

The DBMS determines when all versions created by a finished txn are no longer visible.

May still require multiple threads to reclaim the memory fast enough for the workload.

OBSERVATION

Thread #1

$T_{id=1}$

	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	$2^{31}-1$	$2^{31}-2$	∞
B_1	\emptyset	$2^{31}-1$	$2^{31}-2$	∞

If the DBMS reaches the max value for its timestamps, it will have to wrap around and start at zero. This will make all previous versions be in the "future" from new transactions.

OBSERVATION

Thread #1

$T_{id=1}$

	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	$2^{31}-1$	$2^{31}-2$	∞
B_1	\emptyset	$2^{31}-1$	$2^{31}-2$	∞

If the DBMS reaches the max value for its timestamps, it will have to wrap around and start at zero. This will make all previous versions be in the "future" from new transactions.

OBSERVATION

Thread #1

$T_{id=1}$

	TXN-ID	READ-TS	BEGIN-TS	END-TS
A_1	\emptyset	$2^{31}-1$	$2^{31}-2$	∞
B_1	\emptyset	$2^{31}-1$	$2^{31}-2$	∞
B_2	\emptyset	\emptyset	$1\emptyset$	∞

If the DBMS reaches the max value for its timestamps, it will have to wrap around and start at zero. This will make all previous versions be in the "future" from new transactions.

POSTGRES TXN ID WRAPAROUND

Stop accepting new commands when the system gets close to the max txn id.

Set a flag in each tuple header that says that it is "frozen" in the past. Any new txn id will always be newer than a frozen version.

Runs the vacuum before the system gets close to this upper limit.

INDEX MANAGEMENT

PKey indexes always point to version chain head.

- How often the DBMS has to update the pkey index depends on whether the system creates new versions when a tuple is updated.
- If a txn updates a tuple's pkey attribute(s), then this is treated as an **DELETE** followed by an **INSERT**.

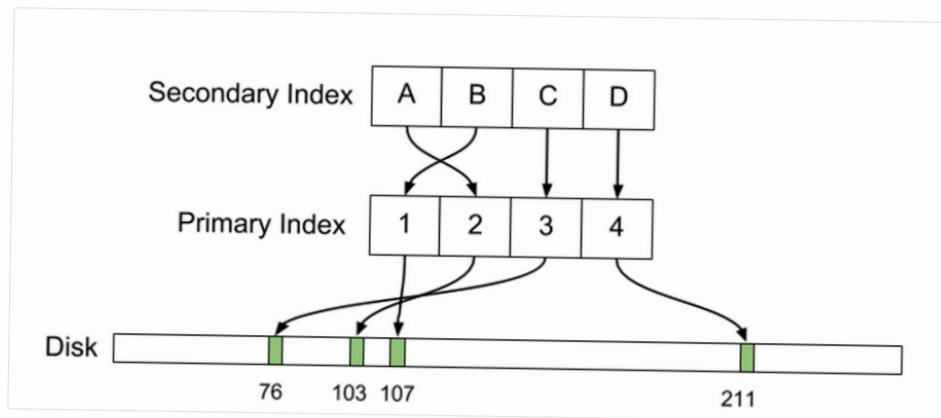
Secondary indexes are more complicated...

ARCHITECTURE

WHY UBER ENGINEERING SWITCHED FROM POSTGRES TO MYSQL

JULY 26, 2016

BY EVAN KLITZKE



SECONDARY INDEXES

Approach #1: Logical Pointers

- Use a fixed identifier per tuple that does not change.
- Requires an extra indirection layer.
- Primary Key vs. Tuple Id

Approach #2: Physical Pointers

- Use the physical address to the version chain head.

INDEX POINTERS



PRIMARY INDEX



SECONDARY INDEX



INDEX POINTERS



PRIMARY INDEX



SECONDARY INDEX



*Append-Only
Newest-to-Oldest*

INDEX POINTERS

GET(A) ↓



PRIMARY INDEX



SECONDARY INDEX



*Append-Only
Newest-to-Oldest*

INDEX POINTERS

GET(A) 



PRIMARY INDEX



SECONDARY INDEX

*Physical
Address*



*Append-Only
Newest-to-Oldest*

INDEX POINTERS



PRIMARY INDEX



SECONDARY INDEX



*Append-Only
Newest-to-Oldest*

INDEX POINTERS

↓ GET(A)



PRIMARY INDEX

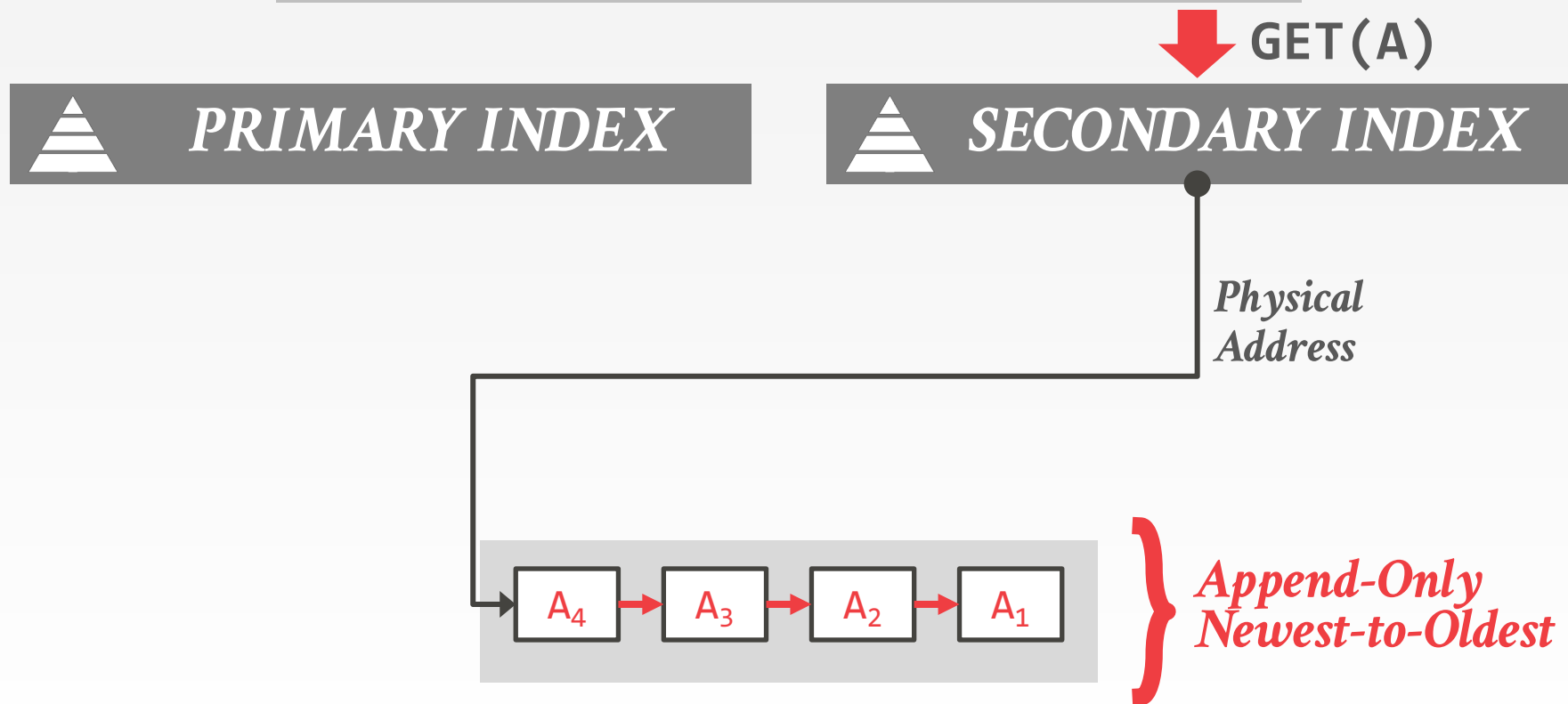


SECONDARY INDEX

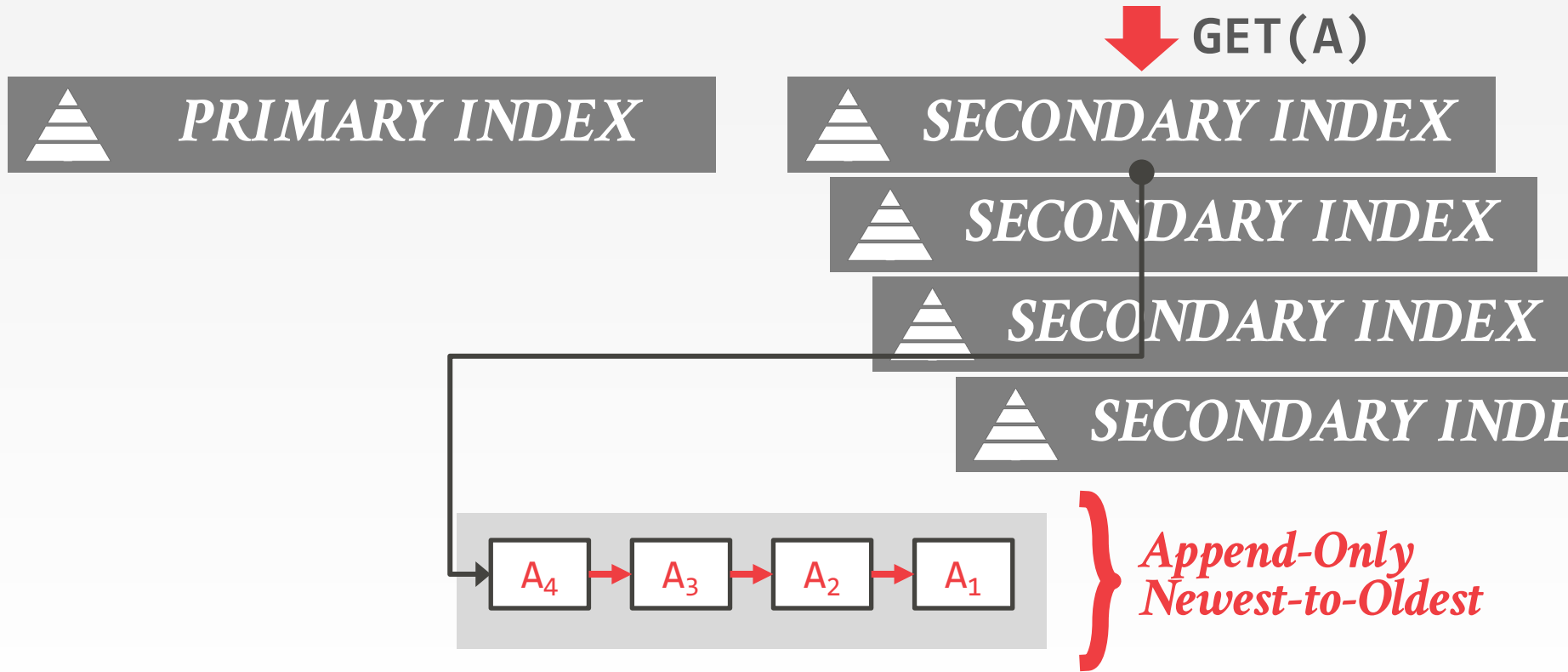


} *Append-Only
Newest-to-Oldest*

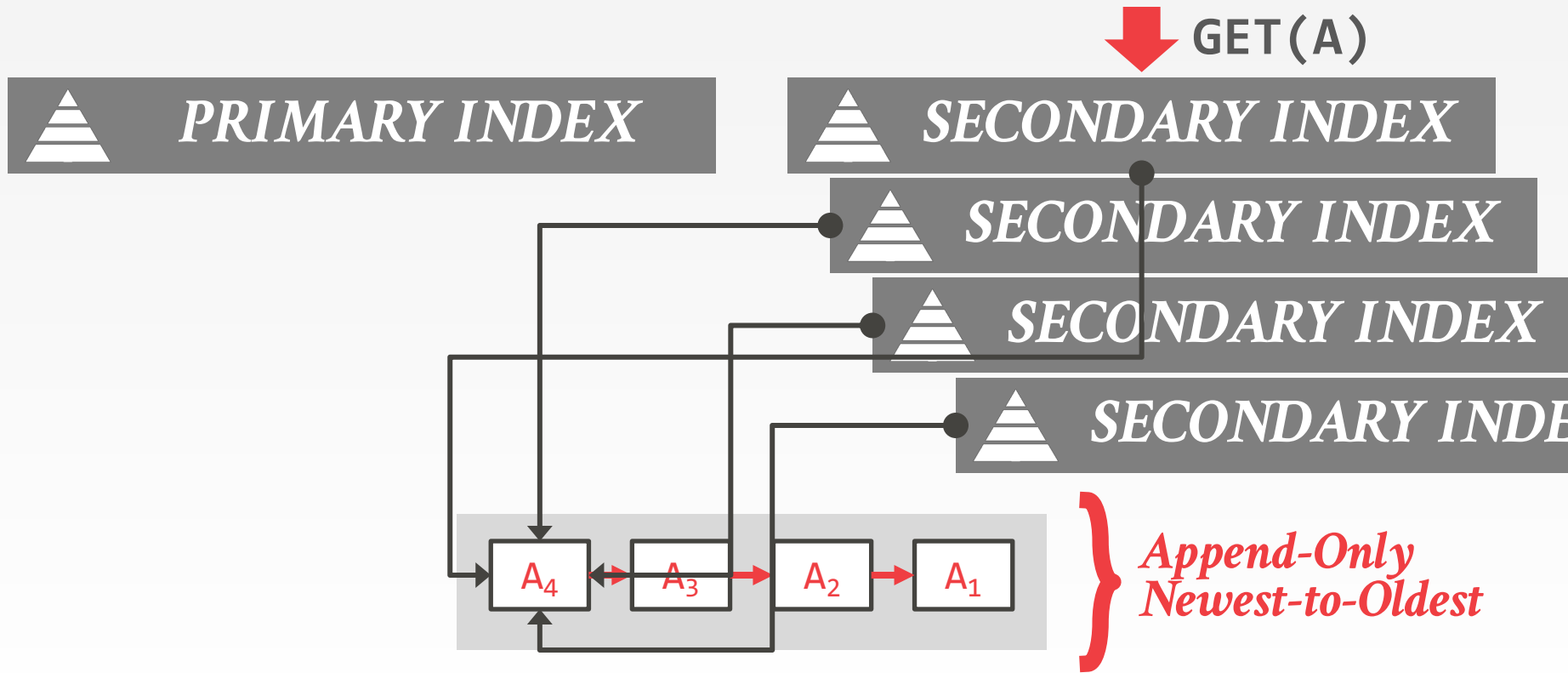
INDEX POINTERS



INDEX POINTERS



INDEX POINTERS



INDEX POINTERS

↓ GET(A)



PRIMARY INDEX

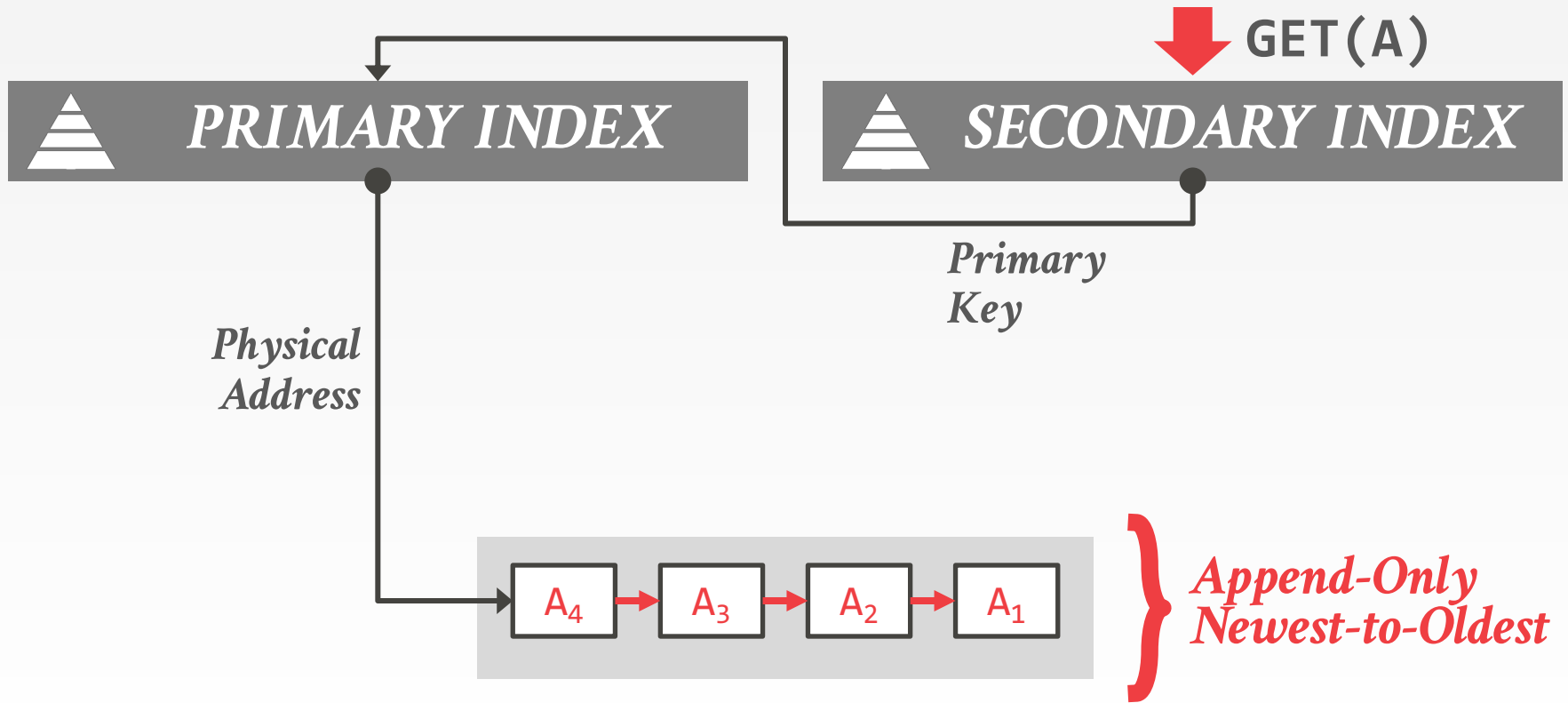


SECONDARY INDEX



} *Append-Only
Newest-to-Oldest*

INDEX POINTERS



INDEX POINTERS

↓ GET(A)



PRIMARY INDEX



SECONDARY INDEX



} *Append-Only
Newest-to-Oldest*

INDEX POINTERS

↓ GET(A)



PRIMARY INDEX



SECONDARY INDEX

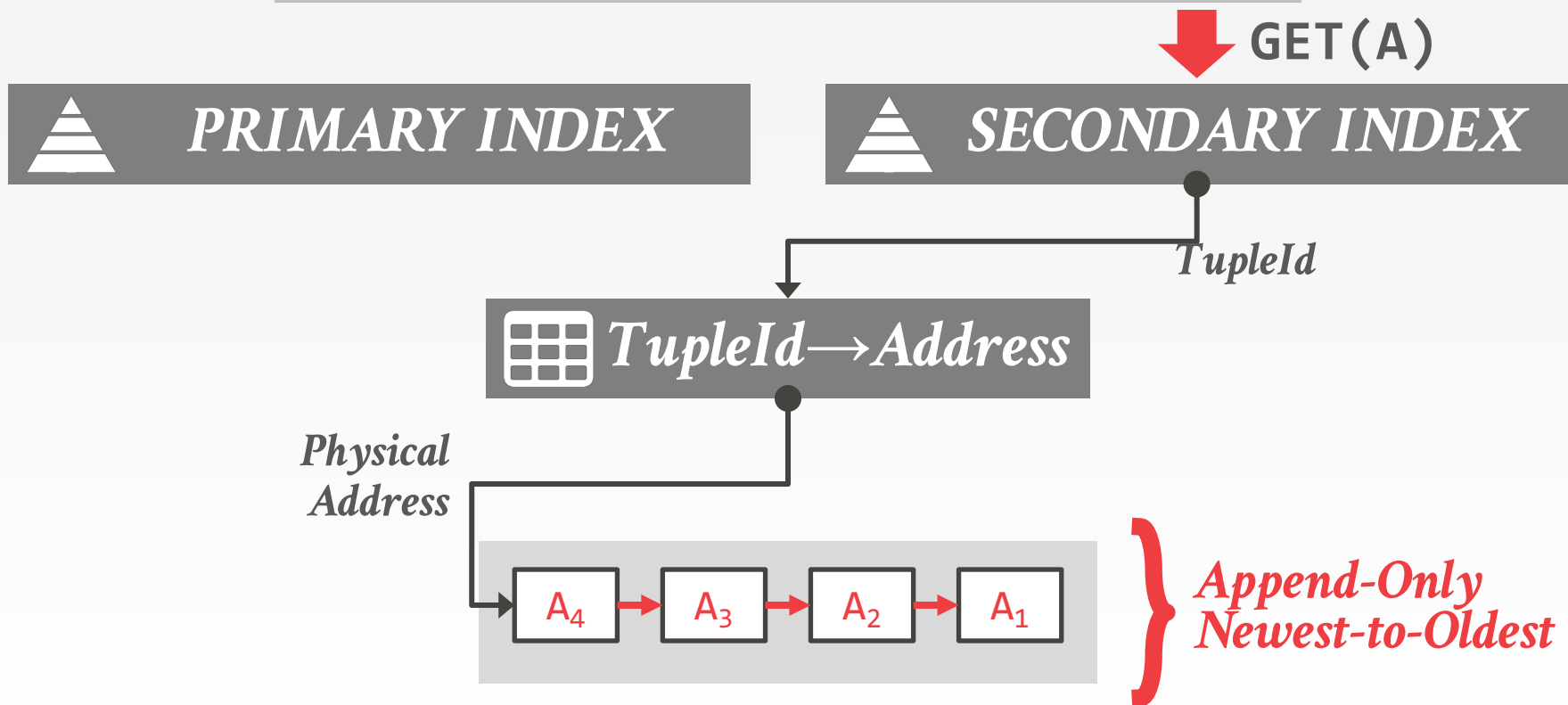


TupleId → *Address*



} *Append-Only
Newest-to-Oldest*

INDEX POINTERS



MVCC CONFIGURATION EVALUATION

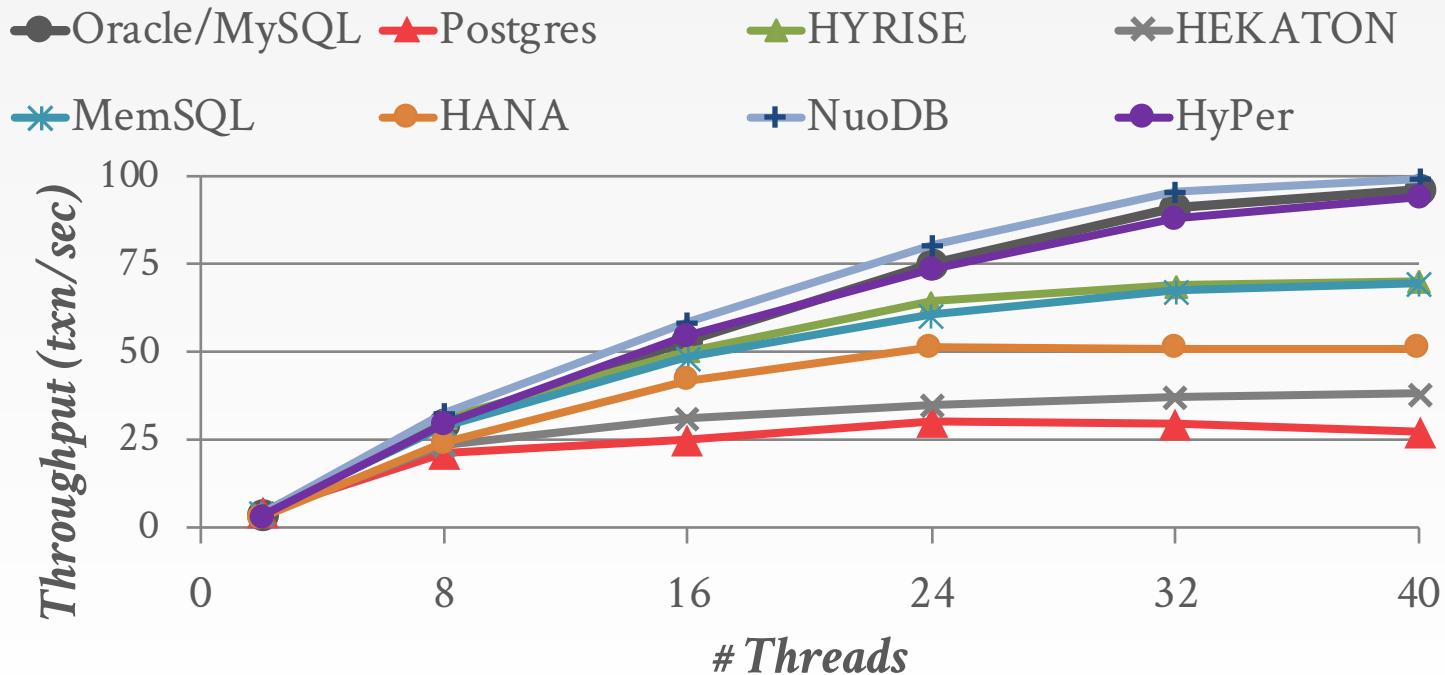
Database: TPC-C Benchmark (40 Warehouses)

Processor: 4 sockets, 10 cores per socket

MVCC CONFIGURATION EVALUATION

Database: TPC-C Benchmark (40 Warehouses)

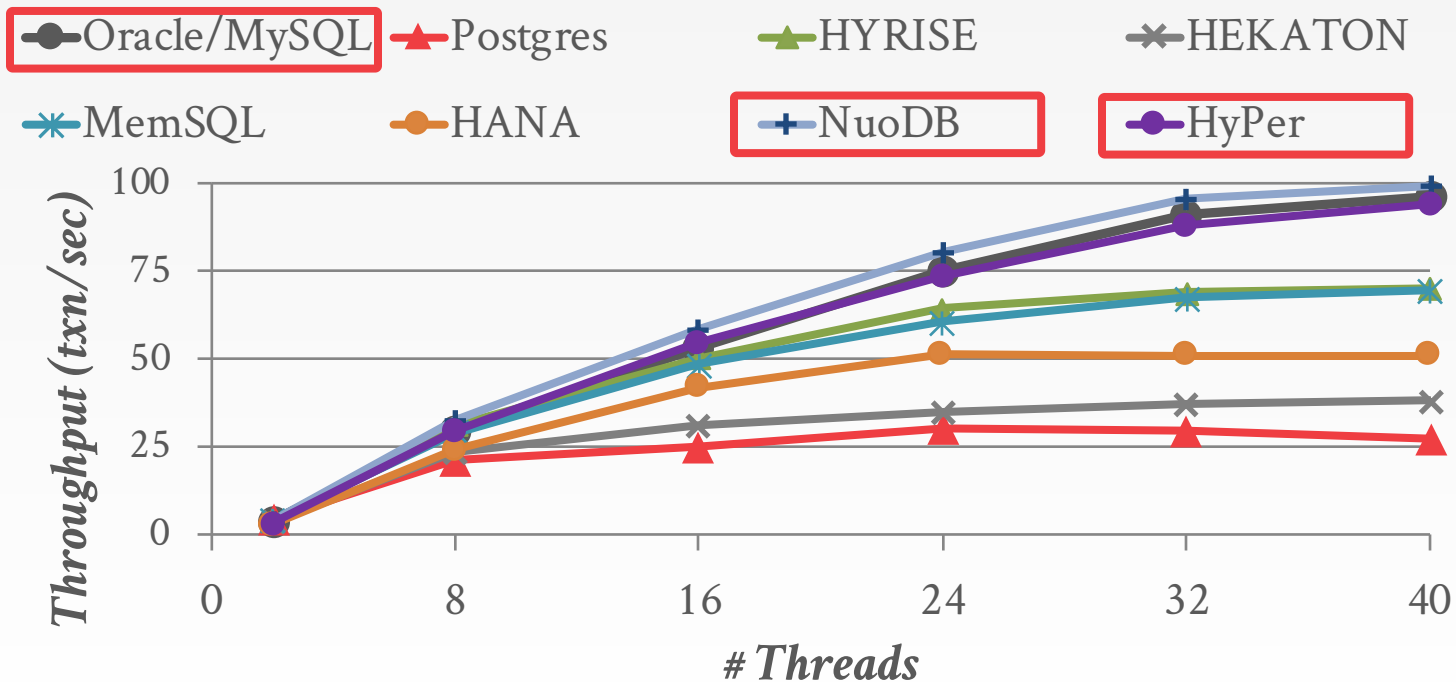
Processor: 4 sockets, 10 cores per socket



MVCC CONFIGURATION EVALUATION

Database: TPC-C Benchmark (40 Warehouses)

Processor: 4 sockets, 10 cores per socket



Robert Haas

VP, Chief Architect, Database Server @ EnterpriseDB, PostgreSQL Major Contributor and Committer

Tuesday, January 30, 2018

DO or UNDO - there is no VACUUM

What if PostgreSQL didn't need VACUUM at all? This seems hard to imagine. After all, PostgreSQL uses multi-version concurrency control (MVCC), and if you create multiple versions of rows, you have to eventually get rid of the row versions somehow. In PostgreSQL, VACUUM is in charge of making sure that happens, and the autovacuum process is in charge of making sure that happens soon enough. Yet, other schemes are possible, as shown by the fact that not all relational databases handle MVCC in the same way, and there are reasons to believe that PostgreSQL could benefit significantly from adopting a new approach. In fact, many of my colleagues at EnterpriseDB are busy implementing a new approach, and today I'd like to tell you a little bit about what we're doing and why we're doing it.

While it's certainly true that VACUUM has significantly improved over the years, there are some problems that are very difficult to solve in the current system structure. Because old row versions and new row versions are stored in the same place - the table, also known as the heap - updating a large number of rows must, at least temporarily, make the heap bigger. Depending on the pattern of updates, it may be impossible to easily shrink the heap again afterwards. For example, imagine loading a large number of rows into a table and then updating half of the rows in each block. The table size must grow by 50% to accommodate the new row versions. When VACUUM removes the old versions of those rows, the original table blocks are now all 50% full. That space is available for new row versions, but there is no easy way to move the rows from the new newly-added blocks back to the old half-full blocks: you can use VACUUM FULL or you can use third-party tools like `pg_repack`, but either way you end up rewriting the whole table. Proposals have been made to try to relocate rows on the fly, but it's hard to do correctly and risks bloating the

About Me



Robert Haas

Follow 0

[View my complete profile](#)

Blog Archive

▼ [2018](#) (2)

▼ [January](#) (2)

[DO or UNDO - there is no VACUUM](#)

[The State of VACUUM](#)

► [2017](#) (6)

► [2016](#) (6)

► [2015](#) (4)

► [2014](#) (11)

► [2013](#) (5)

► [2012](#) (14)

► [2011](#) (41)

► [2010](#) (46)

PARTING THOUGHTS

MVCC is currently the best approach for supporting txns in mixed workloads

We only discussed MVCC for OLTP.

→ Design decisions may be different for HTAP

Interesting MVCC research/project Topics:

→ Block compaction

→ Version compression

→ On-line schema changes

NEXT CLASS

Modern MVCC Implementations

- CMU Cicada
- Microsoft Hekaton
- TUM HyPer
- Serializable Snapshot Isolation