

# Analyzing the Impact of System Architecture on the Scalability of OLTP Engines for High-Contention Workloads

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# Section 1

## Introduction

# Requirements for a DBMS

- ▶ Reliability
  - ▶ ACID Transactions
  - ▶ high availability
  - ▶ etc.
- ▶ Functionality
  - ▶ simple to use programming model
  - ▶ simple to use API
  - ▶ etc.

*Performance isn't everything, but without it, everything else is nothing.*

- ▶ Performance
  - ▶ high transaction throughput
  - ▶ low latency
  - ▶ etc.

## Some Implications of those Requirements

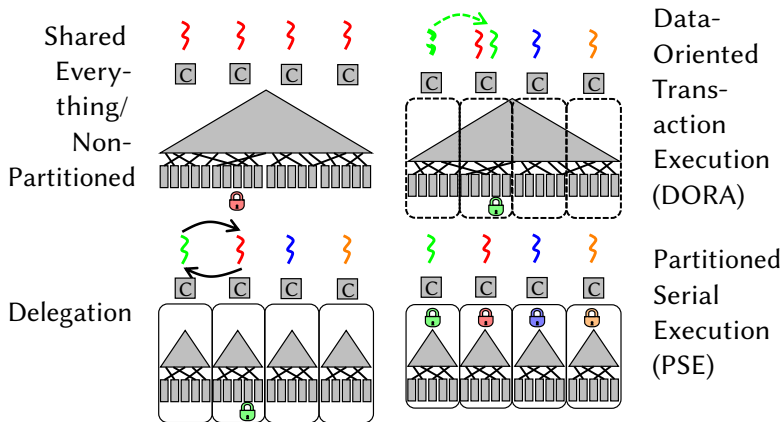
- ▶ work purely in-memory when the working set completely fits in main memory
- ▶ proper utilization of the computational resources is required
  - ▶ available CPU time (usually not the bottleneck)
  - ▶ available hardware contexts (simultaneous threads)
  - ▶ Cache Oblivious Algorithms (e.g. partitioning Hash-JOINs)
  - Interleaved transaction execution to exploit abundant thread-level parallelism without violating the ACID properties!
  - Interleaved operation execution to exploit intra-transaction parallelism!
- physical & logical Synchronization

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  - Interleaved transaction execution to exploit abundant thread-level parallelism without violating the ACID properties!
  - Interleaved operation execution to exploit intra-transaction parallelism!
- physical & logical Synchronization
- **Limits concurrency for high-contention workloads!**

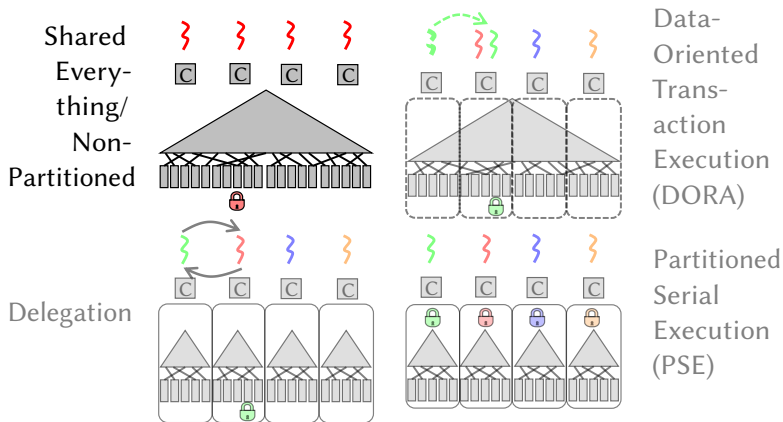
## Section 2

### Database Architectures



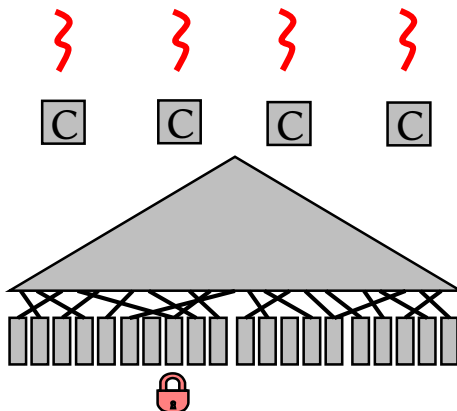
## Subsection 1

### Shared Everything/Non-Partitioned (SE/NP)



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# Properties of SE/NP

- ▶ metadata (incl. locks) are not partitioned
- physical synchronization (latches, atomics) required
- ▶ data and indices are not partitioned
- logical synchronization using a concurrency control protocol also required
- ▶ transactions completely executed by one thread
- ▶ thread-assignment depends only on load

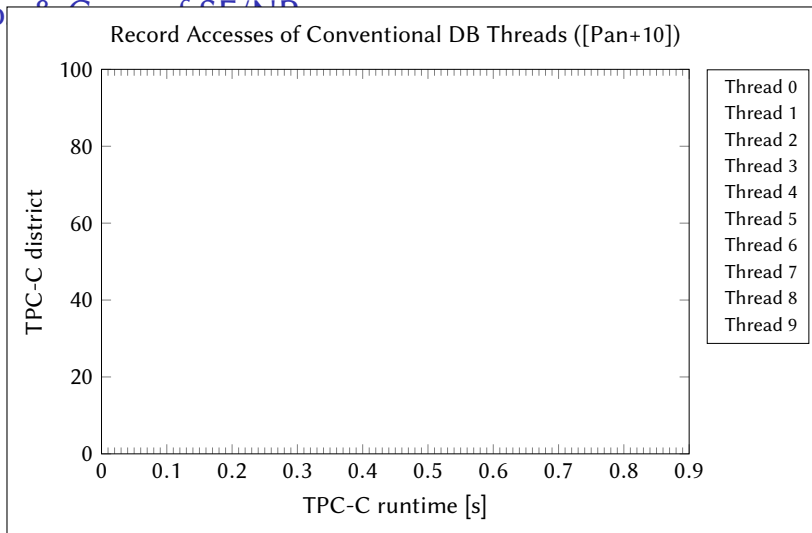
## Pros & Cons of SE/NP

- + no partitioning required (e.g. manual selection of a strategy)
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- + changed workloads would require repartitioning to benefit from partitioning

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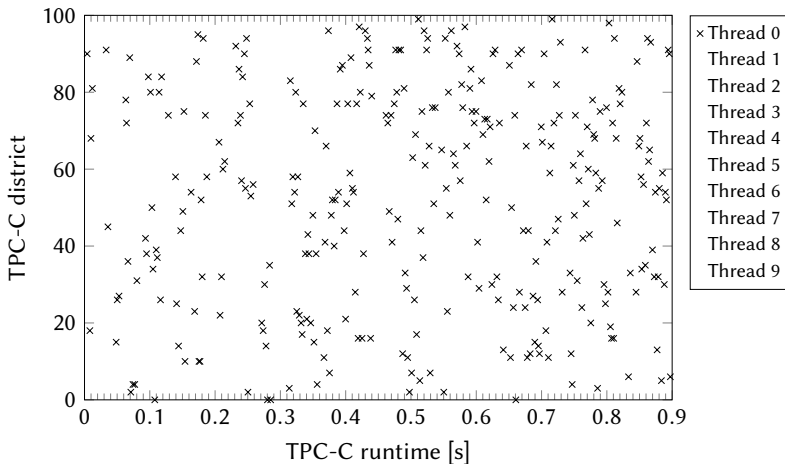
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- each thread might access every record at arbitrary times
  - each CPU cache may contain any part of the data
    - cache pollution
  - each CPU may access any part of the data
    - data movement between NUMA regions
  - each CPU may acquire any latch
    - data movement between NUMA regions
  - each CPU may atomically write to any semaphore
    - hardware cache coherence overhead

## Project CSE/NE



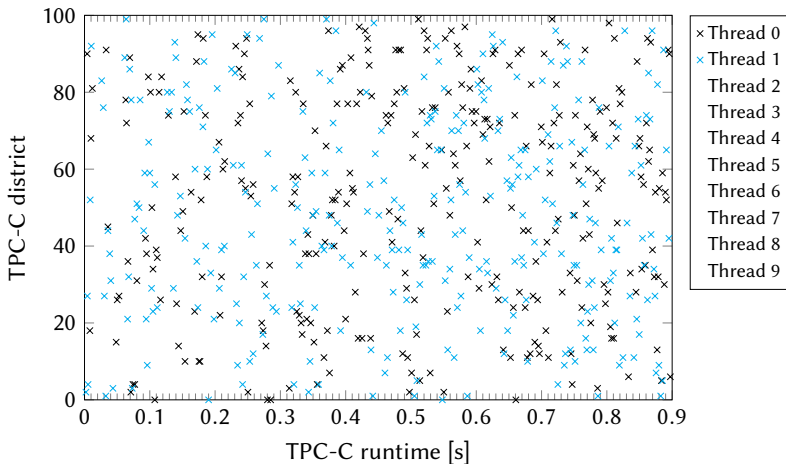
## Project C: CSE/NB

Record Accesses of Conventional DB Threads ([Pan+10])



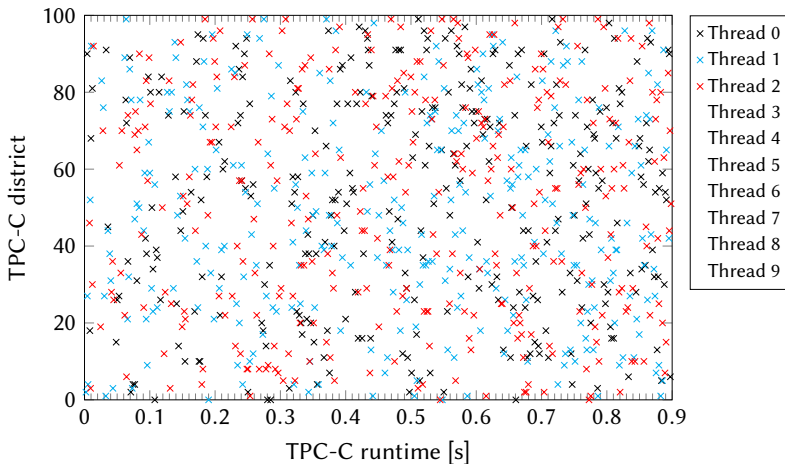
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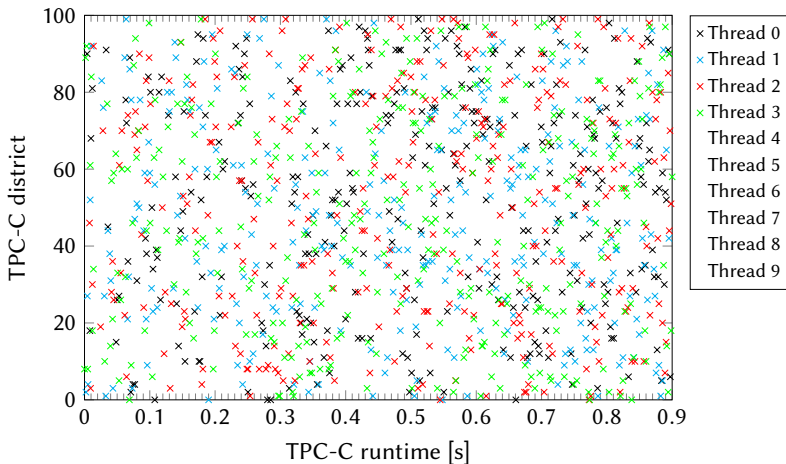
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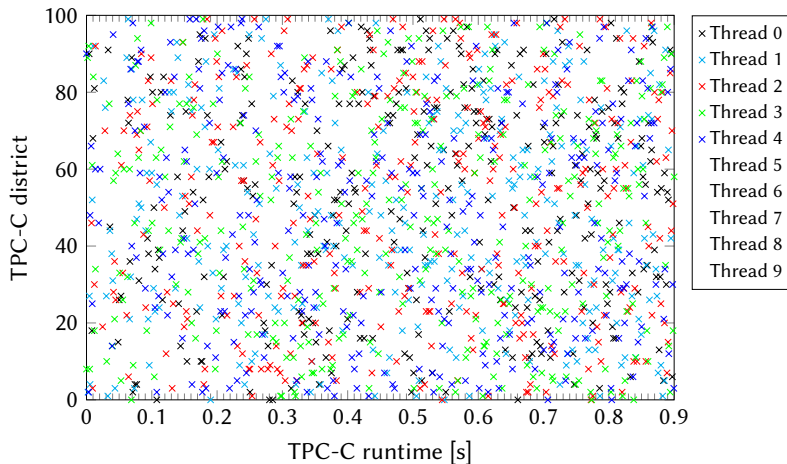
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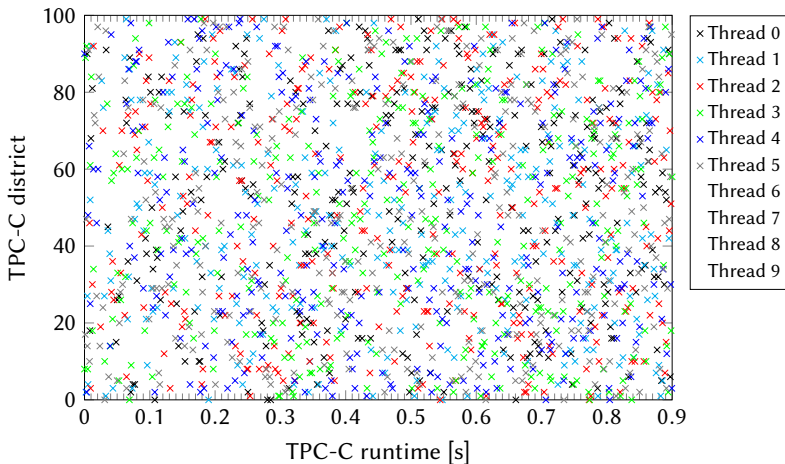
## Pro 8 C 6 SE/NB

Record Accesses of Conventional DB Threads ([Pan+10])



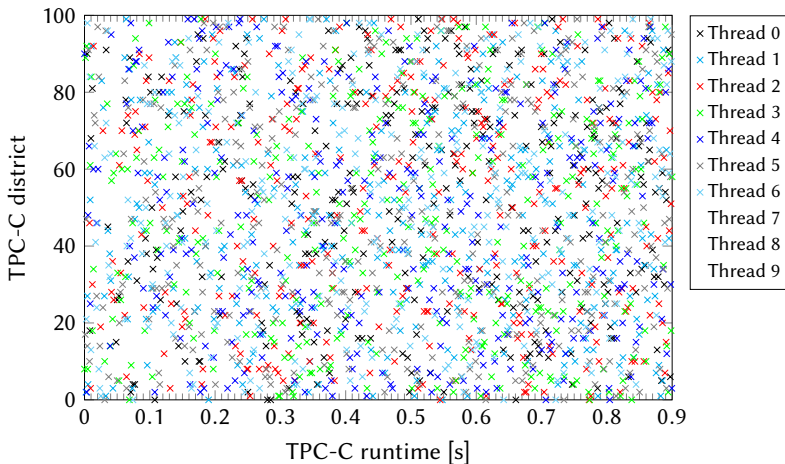
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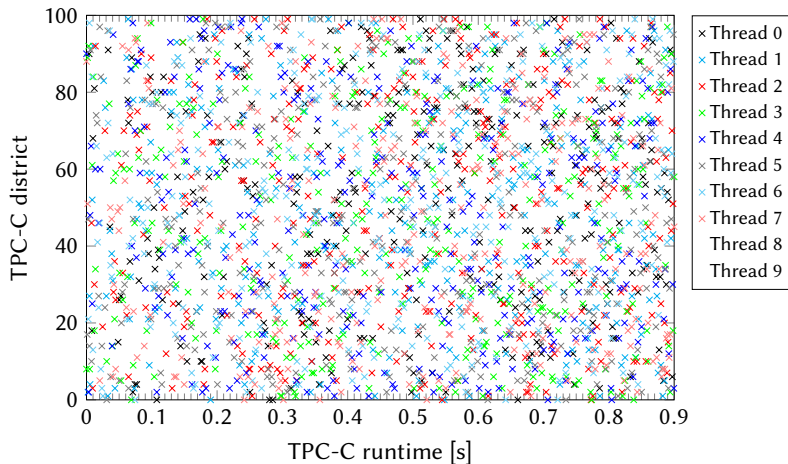
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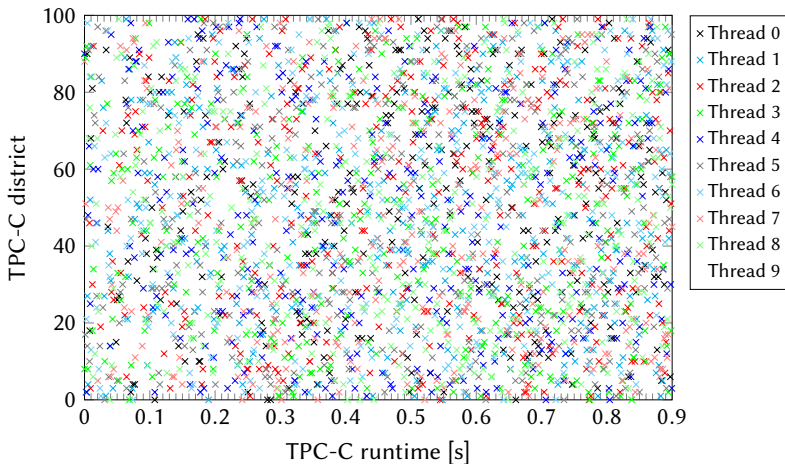
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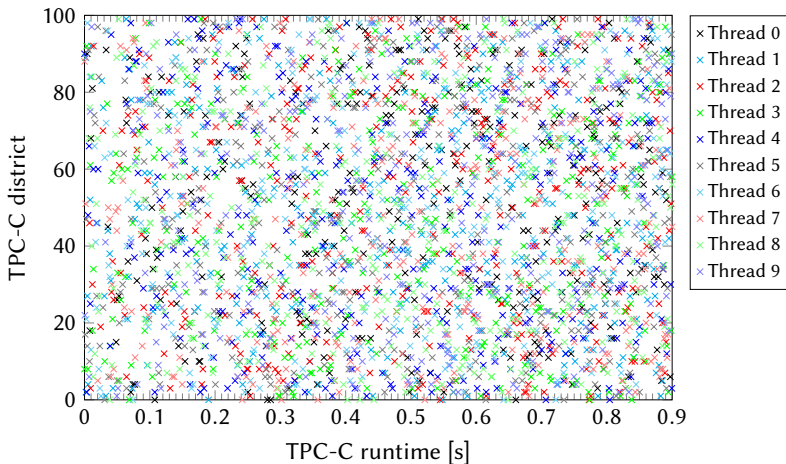
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## Pro 8 C 6 SE/NB

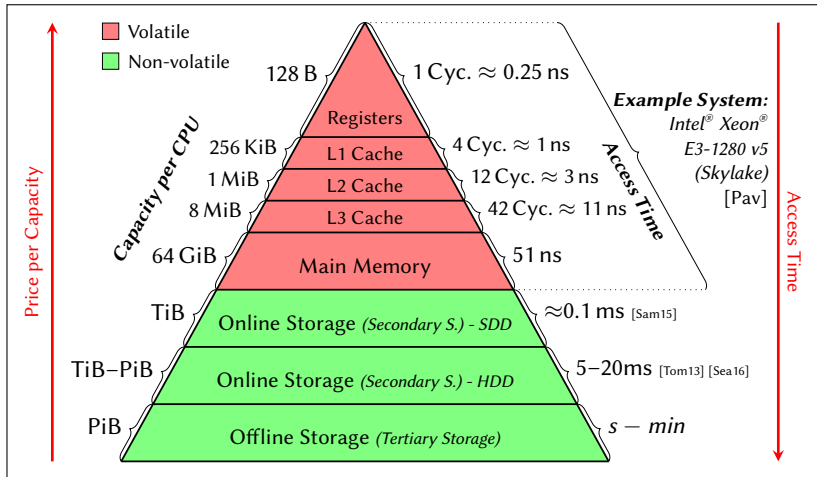
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## Pros & Cons of SE/NP

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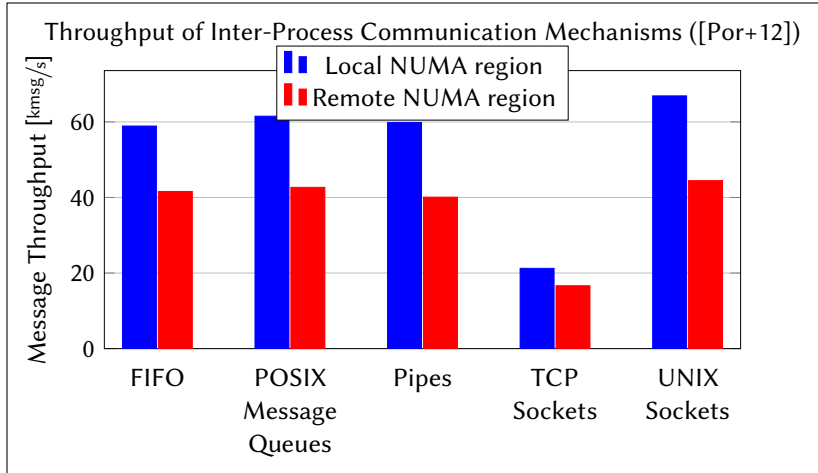




## Pros & Cons of SE/NP

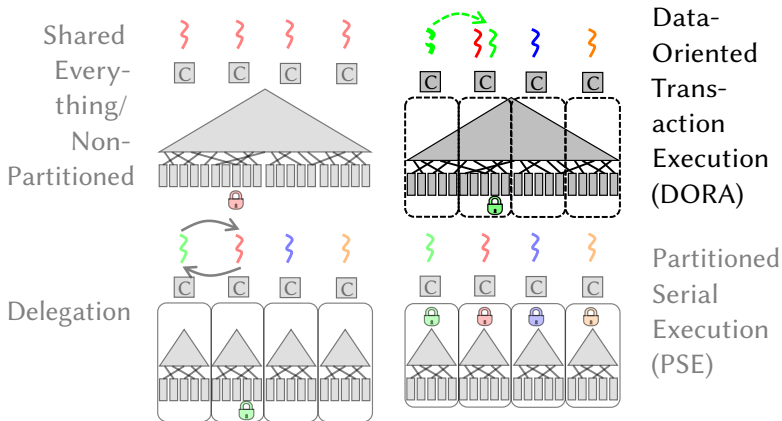
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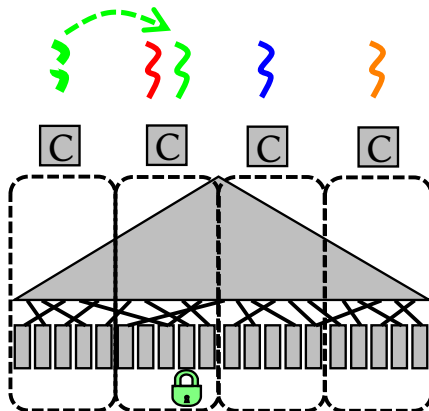
## Subsection 2

### Data-Oriented Transaction Execution (DORA)



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# Properties of DORA

- ▶ metadata (incl. locks) are physically partitioned
- no physical synchronization (latches, atomics) required
- ▶ data and indices are logically partitioned
- logical synchronization using a concurrency control protocol only locally required
- ▶ threads are assigned to data
- ▶ transactions migrate to threads owning the accessed data

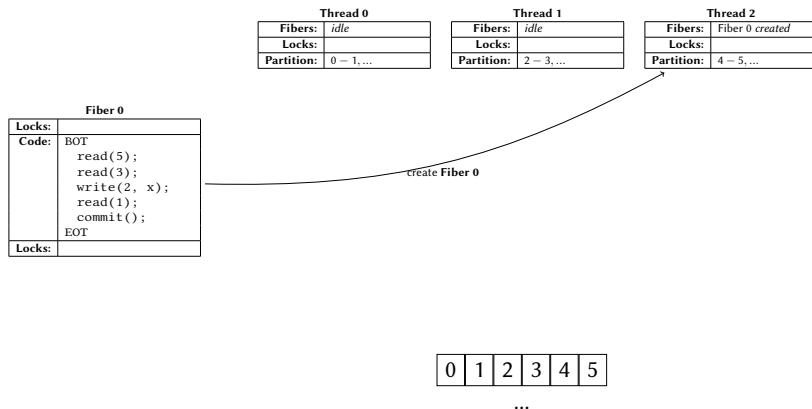
# Interactive Example

Thread 0		Thread 1		Thread 2	
Fibers:	<i>idle</i>	Fibers:	<i>idle</i>	Fibers:	<i>idle</i>
Locks:		Locks:		Locks:	
Partition:	0 – 1, ...	Partition:	2 – 3, ...	Partition:	4 – 5, ...

0	1	2	3	4	5
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...

# Interactive Example



# Interactive Example

Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	Fiber 0 <i>waiting</i>
<b>Locks:</b>		<b>Locks:</b>		<b>Locks:</b>	
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

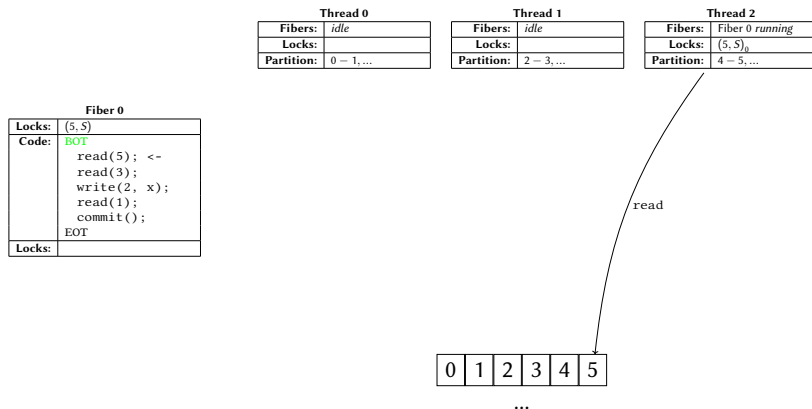
Fiber 0	
<b>Locks:</b>	
<b>Code:</b>	BOT read(5); read(3); write(2, x); read(1); commit(); EOT
<b>Locks:</b>	

0	1	2	3	4	5
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...



# Interactive Example



# Interactive Example

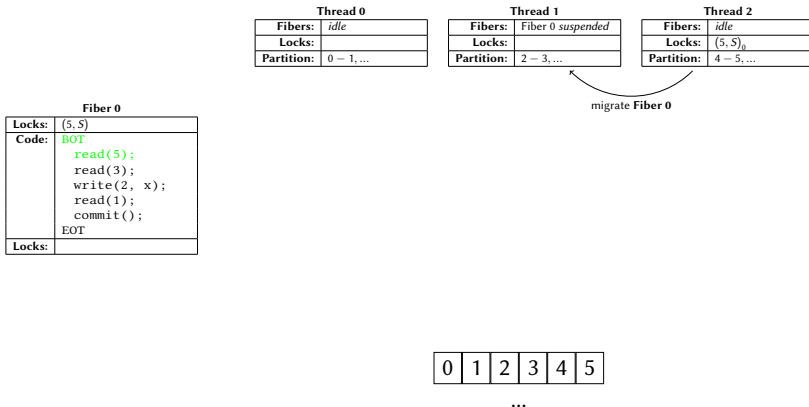
Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	Fiber 0 <i>suspended</i>
<b>Locks:</b>		<b>Locks:</b>		<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

Fiber 0	
<b>Locks:</b>	(5, S)
<b>Code:</b>	BOT read(5); read(3); write(2, x); read(1); commit(); EOT
<b>Locks:</b>	

0	1	2	3	4	5
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# Interactive Example



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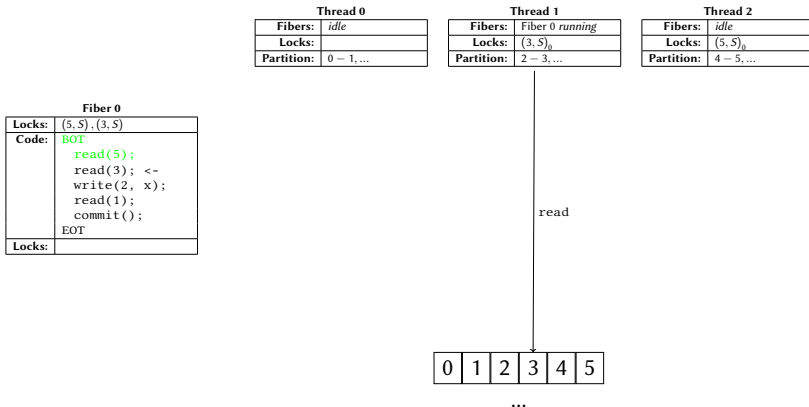
Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>Fiber 0 waiting</i>	<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>		<b>Locks:</b>		<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

Fiber 0	
<b>Locks:</b>	(5, S)
<b>Code:</b>	BOT read(5); read(3); write(2, x); read(1); commit(); EOT
<b>Locks:</b>	

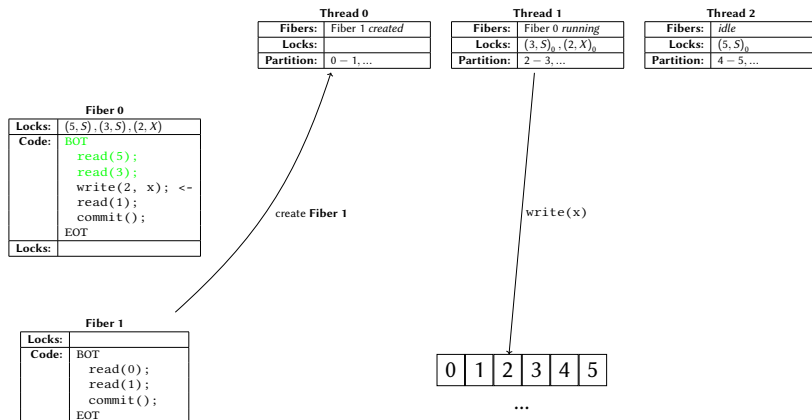
0	1	2	3	4	5
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...

# Interactive Example



# Interactive Example



# Interactive Example

Thread 0

<b>Fibers:</b>	Fiber 1 <i>waiting</i>
<b>Locks:</b>	
<b>Partition:</b>	0 – 1, ...

Thread 1

<b>Fibers:</b>	Fiber 0 <i>suspended</i>
<b>Locks:</b>	$(3, S)_0, (2, X)_0$
<b>Partition:</b>	2 – 3, ...

Thread 2

<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	4 – 5, ...

Fiber 0

<b>Locks:</b>	$(5, S), (3, S), (2, X)$
<b>Code:</b>	BOT read(5); read(3); write(2, x); read(1); commit(); EOT
<b>Locks:</b>	

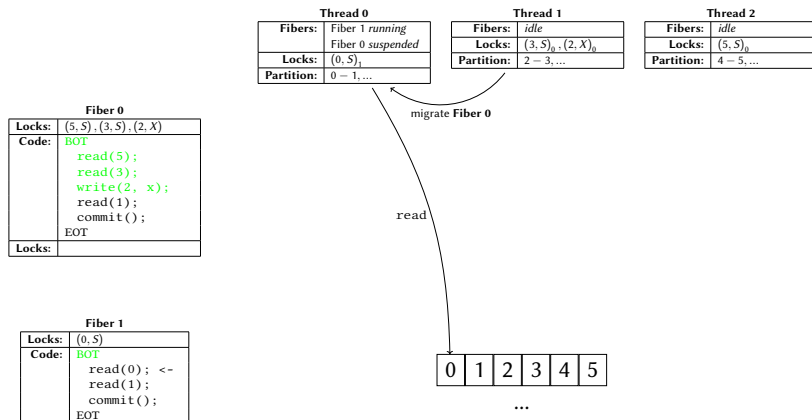
Fiber 1

<b>Locks:</b>	
<b>Code:</b>	BOT read(0); read(1); commit(); EOT

0	1	2	3	4	5
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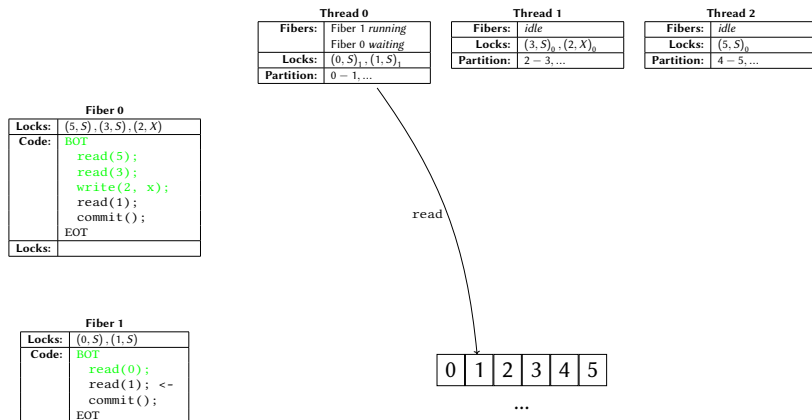
...

# Interactive Example





# Interactive Example



# Interactive Example

Thread 0	
<b>Fibers:</b>	Fiber 1 <i>committing</i> Fiber 0 <i>waiting</i>
<b>Locks:</b>	
<b>Partition:</b>	0 – 1, ...

Thread 1	
<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>	$(3, S)_0, (2, X)_0$
<b>Partition:</b>	2 – 3, ...

Thread 2	
<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	4 – 5, ...

Fiber 0	
<b>Locks:</b>	$(5, S), (3, S), (2, X)$
<b>Code:</b>	<i>BOT</i> read(5); read(3); write(2, x); read(1); commit(); <i>EOT</i>
<b>Locks:</b>	

Fiber 1	
<b>Locks:</b>	
<b>Code:</b>	<i>BOT</i> read(0); read(1); commit(); <- <i>EOT</i>

0	1	2	3	4	5
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...

# Interactive Example

Thread 0	
<b>Fibers:</b>	Fiber 1 <i>terminated</i> Fiber 0 <i>waiting</i>
<b>Locks:</b>	
<b>Partition:</b>	0 – 1, ...

Thread 1	
<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>	$(3, S)_0, (2, X)_0$
<b>Partition:</b>	2 – 3, ...

Thread 2	
<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	4 – 5, ...

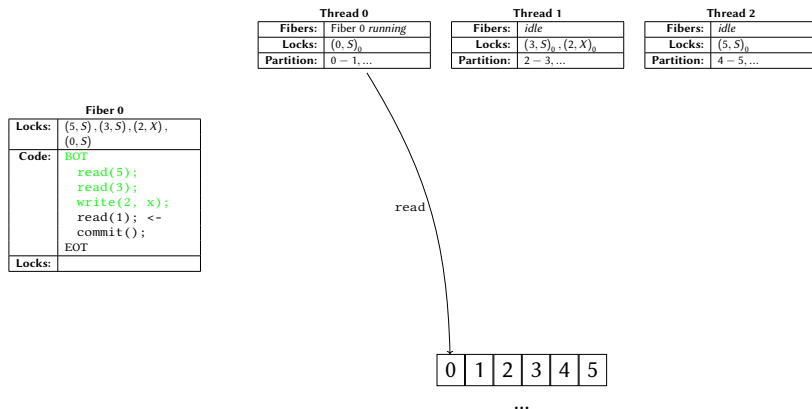
Fiber 0	
<b>Locks:</b>	$(5, S), (3, S), (2, X)$
<b>Code:</b>	<i>BOT</i> read(5); read(3); write(2, x); read(1); commit(); <i>EOT</i>
<b>Locks:</b>	

Fiber 1	
<b>Locks:</b>	
<b>Code:</b>	<i>BOT</i> read(0); read(1); commit(); <i>EOT</i>

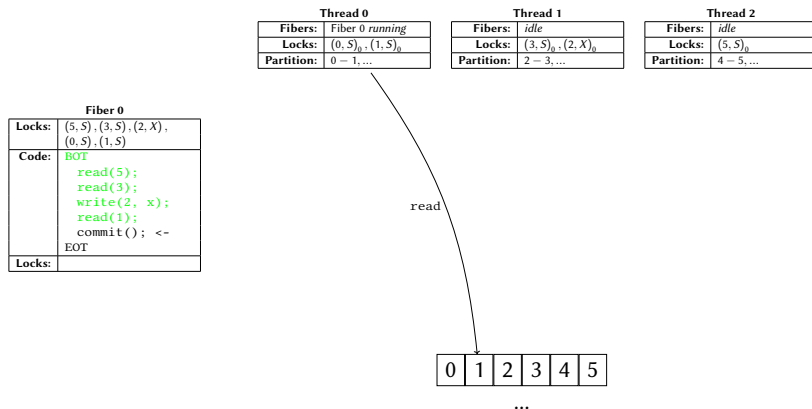
0	1	2	3	4	5
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...

# Interactive Example



# Interactive Example



# Interactive Example

Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	Fiber 0 committing	<b>Fibers:</b>	idle	<b>Fibers:</b>	idle
<b>Locks:</b>		<b>Locks:</b>	$(3, S)_0, (2, X)_0$	<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

Fiber 0	
<b>Locks:</b>	$(5, S), (3, S), (2, X)$
<b>Code:</b>	BOT read(5); read(3); write(2, x); read(1); commit(); <- EOT
<b>Locks:</b>	

0	1	2	3	4	5
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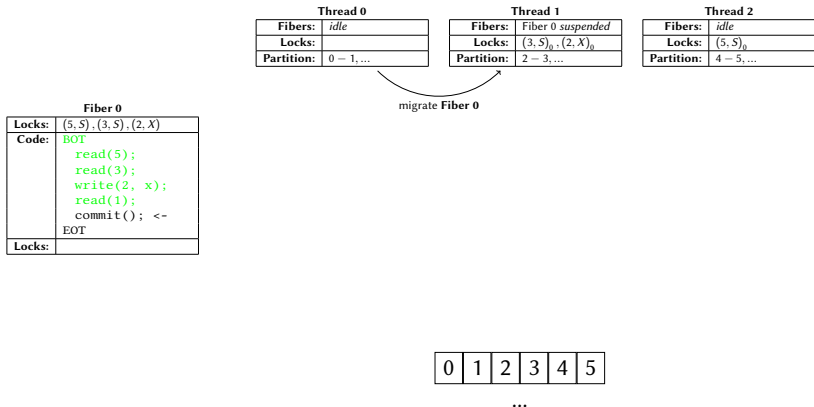
Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	Fiber 0 <i>suspended</i>	<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>		<b>Locks:</b>	$(3, S)_0, (2, X)_0$	<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

Fiber 0	
<b>Locks:</b>	$(5, S), (3, S), (2, X)$
<b>Code:</b>	BOT read(5); read(3); write(2, x); read(1); commit(); <- EOT
<b>Locks:</b>	

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# Interactive Example





# Interactive Example

Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>Fiber 0 waiting</i>	<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>		<b>Locks:</b>	$(3, S)_0, (2, X)_0$	<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	$0 - 1, \dots$	<b>Partition:</b>	$2 - 3, \dots$	<b>Partition:</b>	$4 - 5, \dots$

Fiber 0	
<b>Locks:</b>	$(5, S), (3, S), (2, X)$
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# Interactive Example

Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>Fiber 0 committing</i>	<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>		<b>Locks:</b>		<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

Fiber 0	
<b>Locks:</b>	(5, S)
<b>Code:</b>	<pre> BOT read(5); read(3); write(2, x); read(1); commit(); &lt;- EOT </pre>
<b>Locks:</b>	

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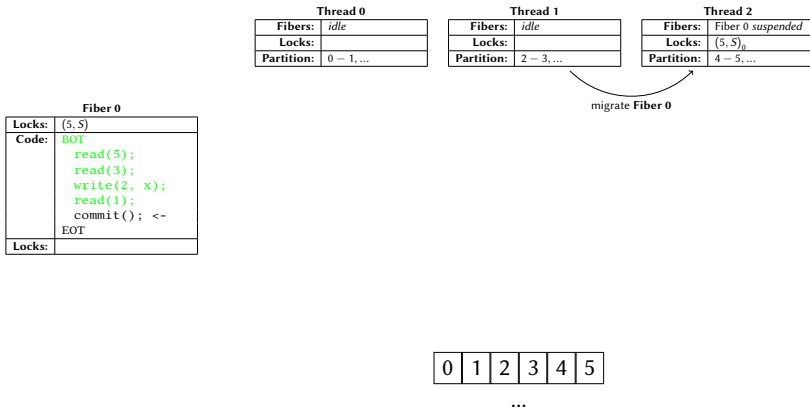
Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>Fiber 0 suspended</i>	<b>Fibers:</b>	<i>idle</i>
<b>Locks:</b>		<b>Locks:</b>		<b>Locks:</b>	$(5, S)_0$
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

Fiber 0	
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<b>Code:</b>	<pre> BOT read(5); read(3); write(2, x); read(1); commit(); &lt;- EOT </pre>
<b>Locks:</b>	

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# Interactive Example



# Interactive Example

Thread 0			Thread 1			Thread 2		
<b>Fibers:</b>	<i>idle</i>		<b>Fibers:</b>	<i>idle</i>		<b>Fibers:</b>	Fiber 0 <i>waiting</i>	
<b>Locks:</b>			<b>Locks:</b>			<b>Locks:</b>	$(5, S)_0$	
<b>Partition:</b>	0 – 1, ...		<b>Partition:</b>	2 – 3, ...		<b>Partition:</b>	4 – 5, ...	

Fiber 0	
<b>Locks:</b>	(5, S)
<b>Code:</b>	BOT read(5); read(3); write(2, x); read(1); commit(); <- EOT
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# Interactive Example

Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	Fiber 0 <i>committing</i>
<b>Locks:</b>		<b>Locks:</b>		<b>Locks:</b>	
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

Fiber 0	
<b>Locks:</b>	
<b>Code:</b>	<pre> BOT read(5); read(3); write(2, x); read(1); commit(); &lt;- EOT </pre>
<b>Locks:</b>	

0	1	2	3	4	5
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...

# Interactive Example

Thread 0		Thread 1		Thread 2	
<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	<i>idle</i>	<b>Fibers:</b>	Fiber 0 <i>terminated</i>
<b>Locks:</b>		<b>Locks:</b>		<b>Locks:</b>	
<b>Partition:</b>	0 – 1, ...	<b>Partition:</b>	2 – 3, ...	<b>Partition:</b>	4 – 5, ...

Fiber 0	
<b>Locks:</b>	
<b>Code:</b>	<pre> BOT read(5); read(3); write(2, x); read(1); commit(); EOT </pre>
<b>Locks:</b>	

0	1	2	3	4	5
---	---	---	---	---	---

...

# Interactive Example

Thread 0		Thread 1		Thread 2	
Fibers:	<i>idle</i>	Fibers:	<i>idle</i>	Fibers:	<i>idle</i>
Locks:		Locks:		Locks:	
Partition:	0 – 1, ...	Partition:	2 – 3, ...	Partition:	4 – 5, ...

0	1	2	3	4	5
---	---	---	---	---	---

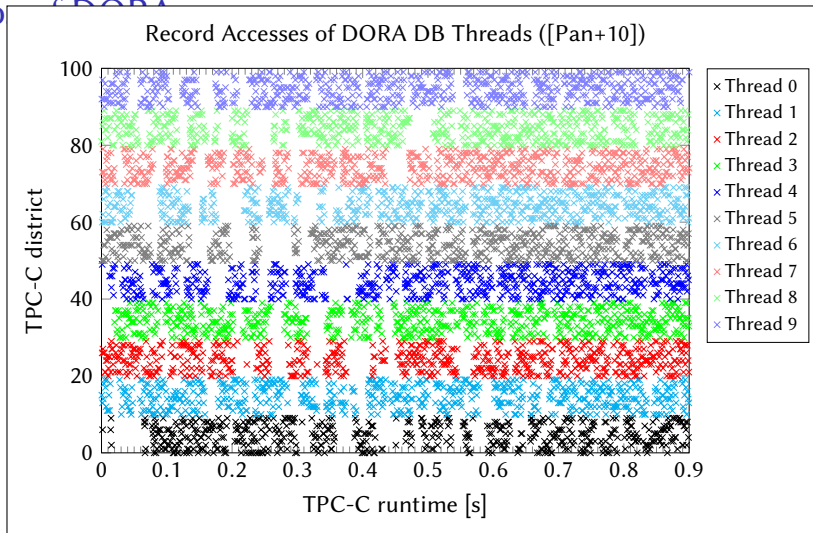
...



# Pros of DORA

- + each thread accesses only the records of its partition
  - + each CPU cache may contain only data of its partition
    - lower cache pollution
  - + each CPU may access only data of its partitions
    - no data movement between NUMA regions (for single-CPU transactions)
  - No physical synchronization required!
- + logical partitioning allows fast repartitioning when the workload changes
- + intra-transaction parallelism could be exploited for multi-site transactions

## Pro DORA

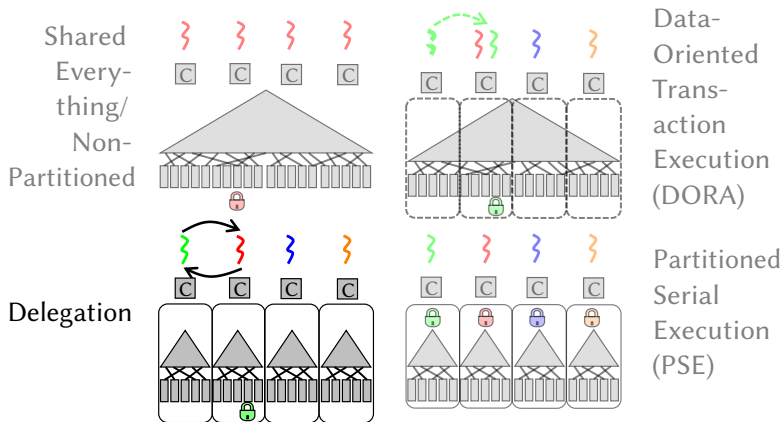


## Cons of DORA

- partitioning required (e.g. manual selection of a partitioning strategy—*called routing rule*)
- partitioning is sensitive to the workload
- multi-site transactions require expensive fiber-migration (probably between NUMA regions)
- accessed partitions need to be calculated during query analysis for optimal performance
  - slower accesses with secondary index
- primary index is shared
  - centralized latching for inserts/deletes still required
  - some contention on the shared latch
- centralized deadlock detection still required (for DL\_DETECT)

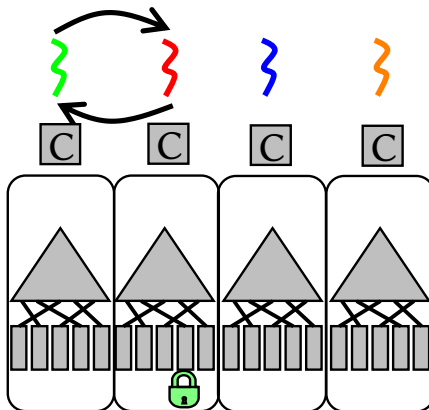
## Subsection 3

### Delegation



## Subsection 3

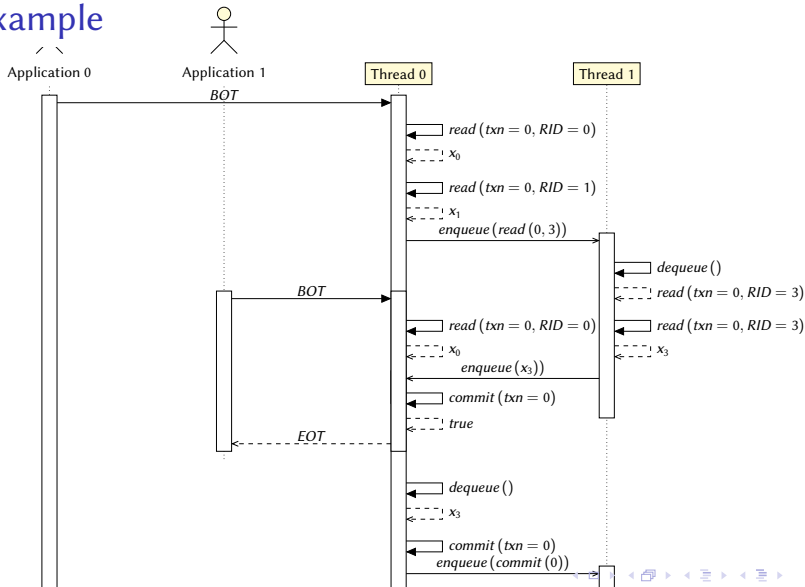
### Delegation



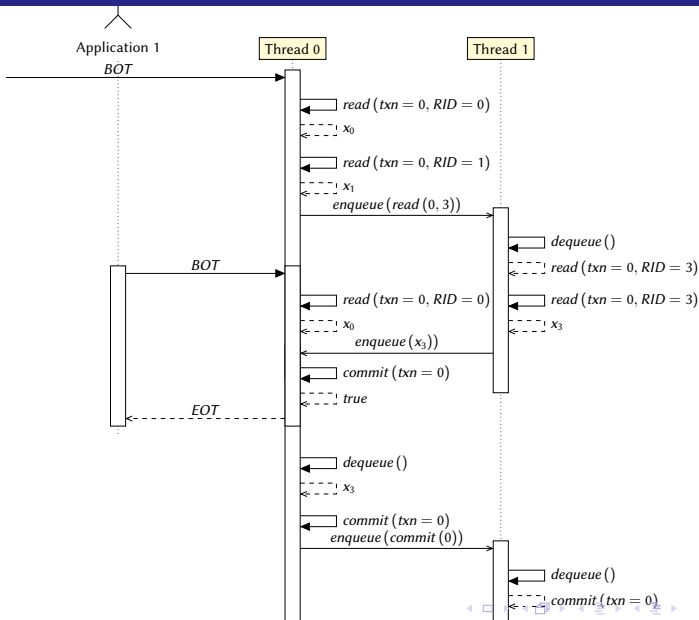
# Properties of Delegation

- ▶ metadata (incl. locks) are physically partitioned
- no physical synchronization (latches, atomics) required
- ▶ data and indices are physically partitioned
- logical synchronization using a concurrency control protocol only locally required
- ▶ transactions completely executed by one thread (ideally the one owning the majority of the records)
- ▶ thread accesses remote records by passing messages to the threads owning them
  - ▶ message passing implemented using shared variables
  - ▶ remote records are passed as pointers

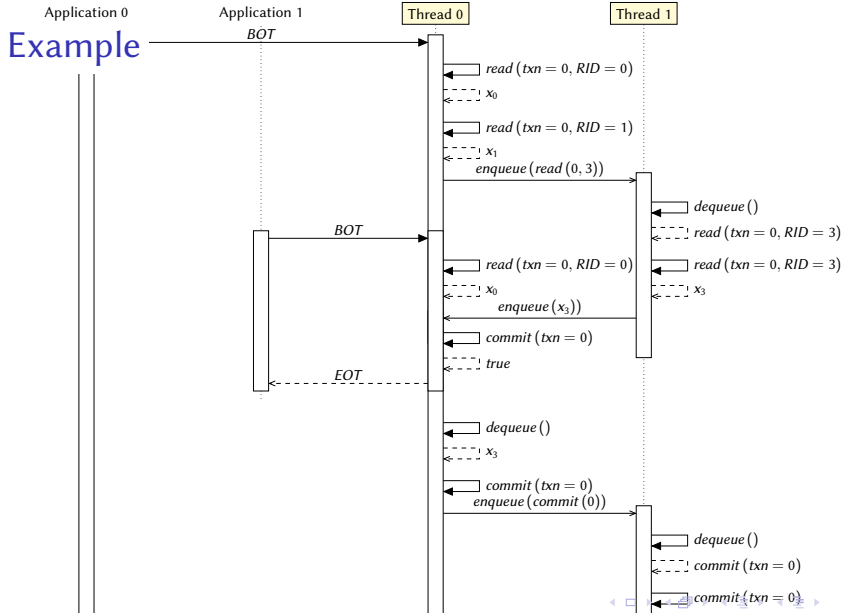
# Example



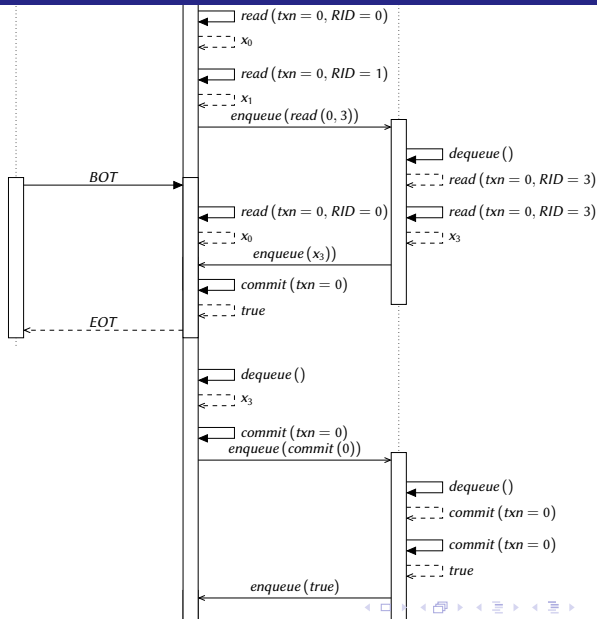
# Example



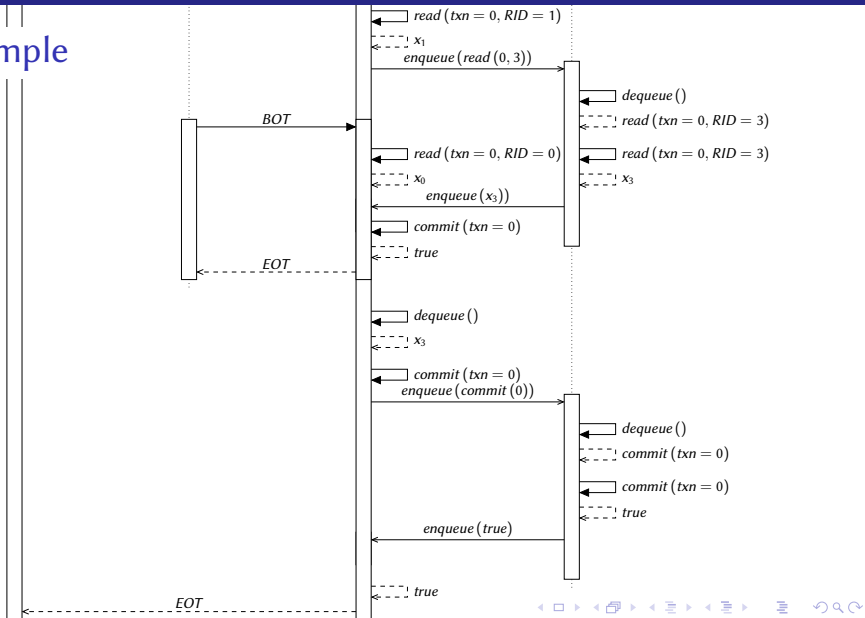




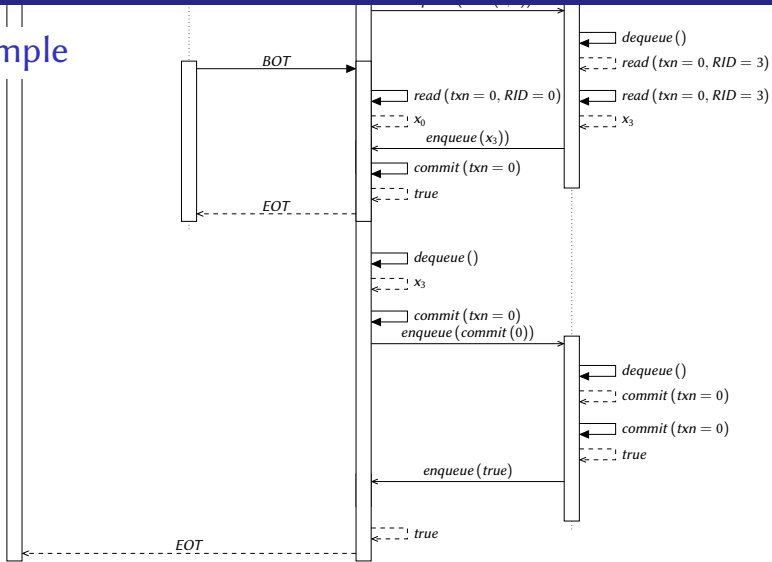
# Example



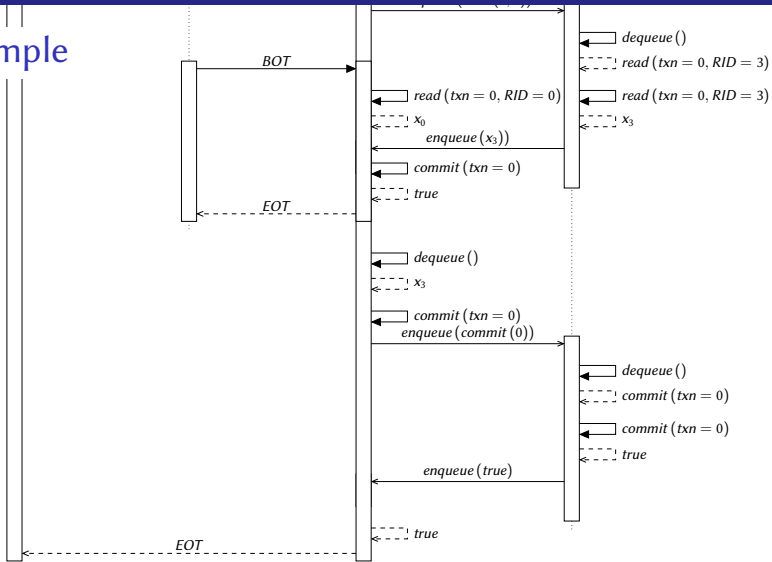
# Example



# Example



# Example



# Pros & Cons of Delegation

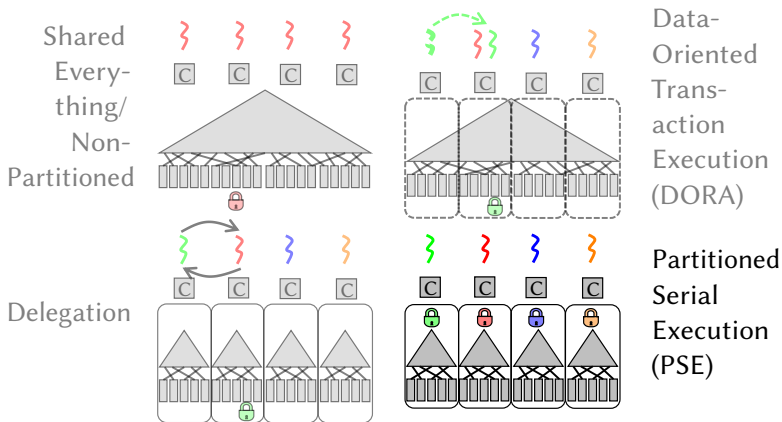
- + only multi-site transactions cause a thread to access unowned records
  - + each CPU cache usually only contains data of its partition
    - lower cache pollution
  - + each CPU usually only accesses data of its partitions
    - fewer data movement between NUMA regions
  - No physical synchronization required!
- + message-passing required for multi-site transactions imposes only a low overhead

# Pros & Cons of Delegation

- + only multi-site transactions cause a thread to access unowned records
  - + each CPU cache usually only contains data of its partition
    - lower cache pollution
  - + each CPU usually only accesses data of its partitions
    - fewer data movement between NUMA regions
  - No physical synchronization required!
- + message-passing required for multi-site transactions imposes only a low overhead
- partitioning required (e.g. manual selection of a partitioning strategy—*called routing rule*)
- partitioning is sensitive to the workload
- physical partitioning requires expensive repartitioning when the workload changes

## Subsection 4

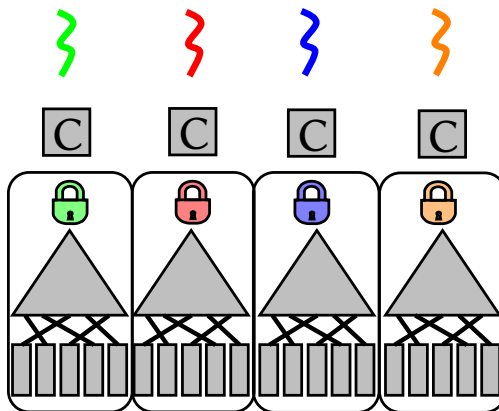
### Partitioned Serial Execution (PSE)





## Subsection 4

### Partitioned Serial Execution (PSE)



# Properties of PSE

- ▶ data and associated metadata are physically partitioned  
→ Shared-Nothing
- ▶ partition-level locking using latches (only exclusive mode)
- No concurrency control algorithm required!
- ▶ single-site transactions run serially on the partition's thread  
(partition needs to be locked)
- ▶ multi-site transactions require upfront to lock of all relevant  
partitions/coordination between threads

# Pros of PSE

- + only multi-site transactions cause a thread to access unowned records
  - + each CPU cache usually only contains data of its partition
    - lower cache pollution
  - + partition-lock is usually in the CPU cache
    - synchronization imposes minor overhead
  - + each CPU usually only accesses data of its partitions
    - fewer data movement between NUMA regions
  - no physical synchronization beyond the partition-lock required
- scales linearly for single-site transactions

# Cons of PSE

- multi-site transactions require locking of all relevant partitions  
→ decreases concurrency drastically
- partitioning required (e.g. manual selection of a partitioning strategy—*called routing rule*)
- partitioning is sensitive to the workload
- physical partitioning requires expensive repartitioning when the workload changes
- coordination of multi-site transactions required

# Summary

Architecture				
SE/NP				
PSE				
Delegation				
DORA				

# Summary

Archi- tec- ture	Process Management			
	Paral- lelism			
SE/NP	Shared Memory			
PSE	Shared Nothing			
Dele- gation	Message Passing			
DORA	Shared Memory			

# Summary

Archi- tec- ture	Process Management			
	Paral- lelism	Thread Assignment		
SE/NP	Shared Memory	thread-to-txn		
PSE	Shared Nothing	thread-to-txn		
Dele- gation	Message Passing	thread-to-txn		
DORA	Shared Memory	thread-to-data		

# Summary

Architecture	Process Management		Transactional Storage Management	
	Parallelism	Thread Assignment	Logical Synchronization	
SE/NP	Shared Memory	thread-to-txn	CC Protocols	
PSE	Shared Nothing	thread-to-txn	Partition Lock	
Delegation	Message Passing	thread-to-txn	CC Protocols	
DORA	Shared Memory	thread-to-data	CC Protocols	

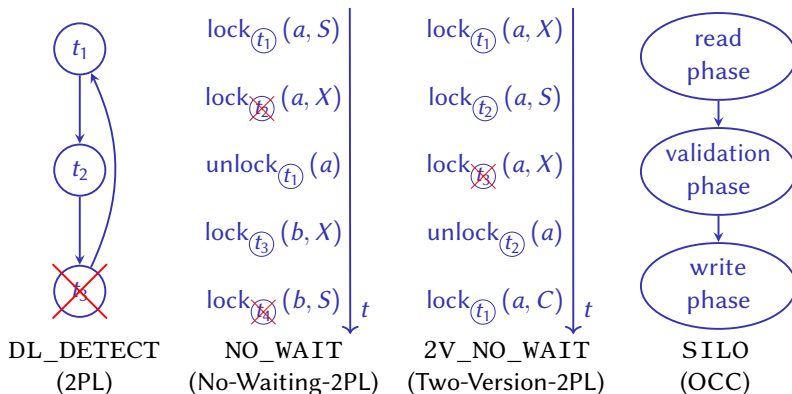


# Summary

Architecture	Process Management		Transactional Storage Management	
	Parallelism	Thread Assignment	Logical Synchronization	Physical Synchronization
SE/NP	Shared Memory	thread-to-txn	CC Protocols	latch/-atomics
PSE	Shared Nothing	thread-to-txn	Partition Lock	partition lock
Delegation	Message Passing	thread-to-txn	CC Protocols	Message Passing
DORA	Shared Memory	thread-to-data	CC Protocols	Transaction Migration

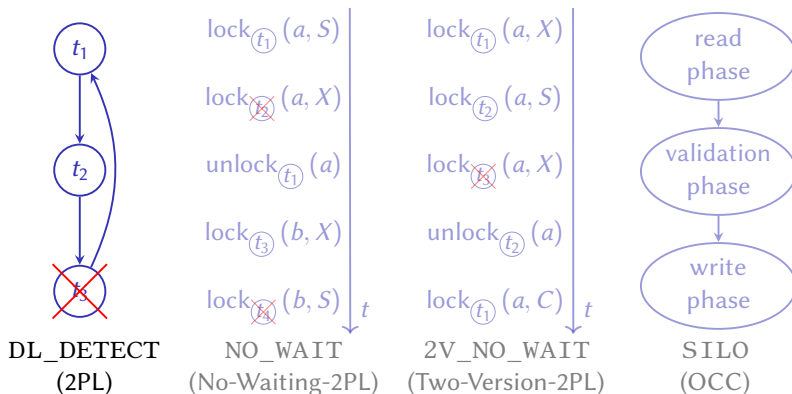
## Section 3

### Concurrency Control Algorithms







## Subsection 1

### DL\_DETECT (2PL)



## Properties of DL\_DETECT (2PL)

- ▶ pessimistic concurrency control protocol
- ▶ transactions lock database objects (databases, tables, records, key ranges, etc.) before reading (shared mode  $S$ ) or updating (exclusive mode  $X$ ) them [Moh90]
- ▶  $t_0$  tries to acquire lock held by  $t_1$  in compatible mode  
→  $t_0$  can immediately acquire lock as well (starvation needs to be prevented)
- ▶  $t_0$  tries to acquire lock held by  $t_1$  in incompatible mode  
→  $t_0$  waits until  $t_1$  releases lock
- ▶ deadlock detection using a repeatedly generated and analyzed wait-for graph

compatibility	shared mode	exclusive mode
shared mode		
exclusive mode		

# Interactive Example

## Transactions:

$t_0$        $t_1$        $t_2$

## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	NL	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

## Wait-for Graph:

# Interactive Example

## Transactions:

$t_0$        $t_1$        $t_2$   
 — BOT

## Locks:

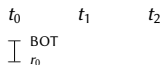
Record 0		Record 1		Record 2		...
Current Mode:	NL	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

## Wait-for Graph:



# Interactive Example

## Transactions:



## Locks:

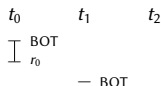
Record 0		Record 1		Record 2		...
Current Mode:	S (1)	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

## Wait-for Graph:



# Interactive Example

## Transactions:



## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	S (1)	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

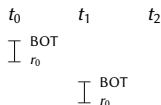
## Wait-for Graph:





# Interactive Example

## Transactions:



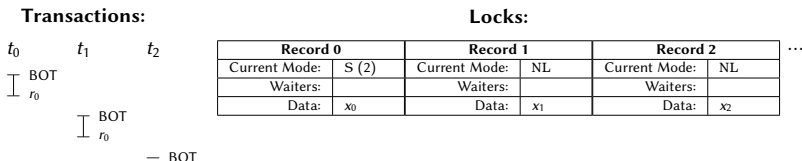
## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	S (2)	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

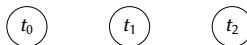
## Wait-for Graph:



# Interactive Example

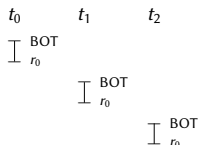


## Wait-for Graph:



# Interactive Example

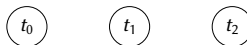
## Transactions:



## Locks:

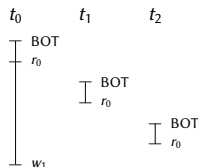
Record 0		Record 1		Record 2		...
Current Mode:	S (3)	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

## Wait-for Graph:



# Interactive Example

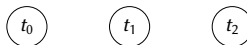
## Transactions:



## Locks:

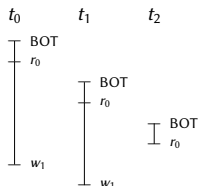
Record 0		Record 1		Record 2		...
Current Mode:	S (3)	Current Mode:	X ( $t_0$ )	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

## Wait-for Graph:



# Interactive Example

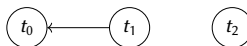
## Transactions:



## Locks:

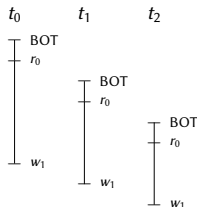
Record 0		Record 1		Record 2		...
Current Mode:	S (3)	Current Mode:	X ( $t_0$ )	Current Mode:	NL	
Waiters:		Waiters:	(X, $t_1$ )	Waiters:		
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	

## Wait-for Graph:



# Interactive Example

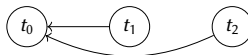
## Transactions:



## Locks:

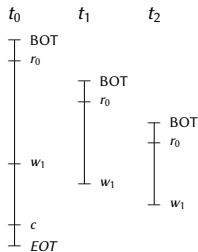
Record 0		Record 1		Record 2		...
Current Mode:	S (3)	Current Mode:	X ( $t_0$ )	Current Mode:	NL	
Waiters:		Waiters:	(X, $t_1$ ) (X, $t_2$ )	Waiters:		
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	

## Wait-for Graph:



# Interactive Example

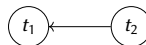
## Transactions:



## Locks:

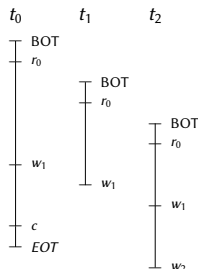
Record 0		Record 1		Record 2		...
Current Mode:	S (2)	Current Mode:	X ( $t_1$ )	Current Mode:	NL	
Waiters:		Waiters:	(X, $t_2$ )	Waiters:		
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	

## Wait-for Graph:



# Interactive Example

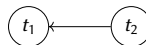
## Transactions:



## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	S (2)	Current Mode:	X ( $t_1$ )	Current Mode:	X ( $t_2$ )	
Waiters:		Waiters:	(X, $t_2$ )	Waiters:		
Data:	$x_0$	Data:	$x_1'$	Data:	$x_2$	

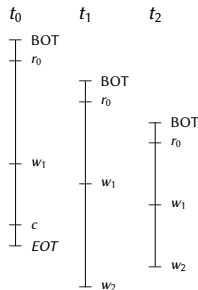
## Wait-for Graph:





# Interactive Example

## Transactions:



## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	S (2)	Current Mode:	X ( $t_1$ )	Current Mode:	X ( $t_2$ )	
Waiters:		Waiters:	(X, $t_2$ )	Waiters:	(X, $t_1$ )	
Data:	$x_0$	Data:	$x_1'$	Data:	$x_2'$	

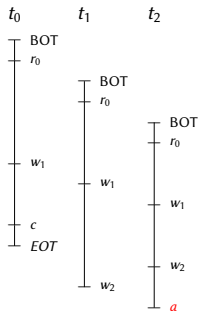
## Wait-for Graph:



Cycle → Deadlock → Rollback a blocked Transaction

# Interactive Example

## Transactions:



## Locks:

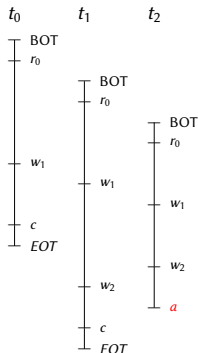
Record 0		Record 1		Record 2		...
Current Mode:	S (1)	Current Mode:	X ( $t_1$ )	Current Mode:	X ( $t_1$ )	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1''$	Data:	$x_2$	

## Wait-for Graph:



# Interactive Example

## Transactions:



## Locks:

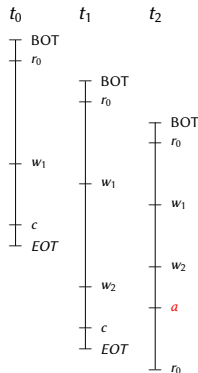
Record 0		Record 1		Record 2		...
Current Mode:	NL	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1''$	Data:	$x_2''$	

## Wait-for Graph:



# Interactive Example

## Transactions:



## Locks:

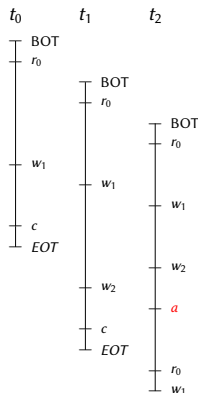
Record 0		Record 1		Record 2		...
Current Mode:	S (1)	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1''$	Data:	$x_2''$	

## Wait-for Graph:



# Interactive Example

## Transactions:



## Locks:

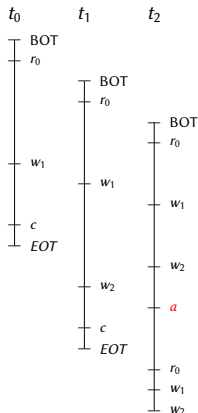
Record 0		Record 1		Record 2		...
Current Mode:	S (1)	Current Mode:	X ( $t_2$ )	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1''$	Data:	$x_2''$	

## Wait-for Graph:



# Interactive Example

## Transactions:



## Locks:

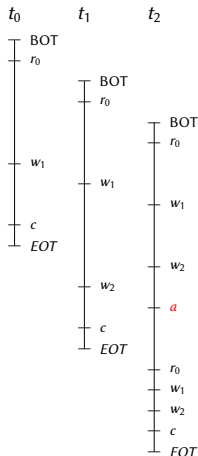
Record 0		Record 1		Record 2		...
Current Mode:	S (1)	Current Mode:	X ( $t_2$ )	Current Mode:	X ( $t_2$ )	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1'''$	Data:	$x_2''$	

## Wait-for Graph:



# Interactive Example

## Transactions:



## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	NL	Current Mode:	NL	Current Mode:	NL	
Waiters:		Waiters:		Waiters:		
Data:	$x_0$	Data:	$x_1'''$	Data:	$x_2'$	

## Wait-for Graph:

## Pros & Cons of DL\_DETECT (2PL)

+ aborts only after deadlocks

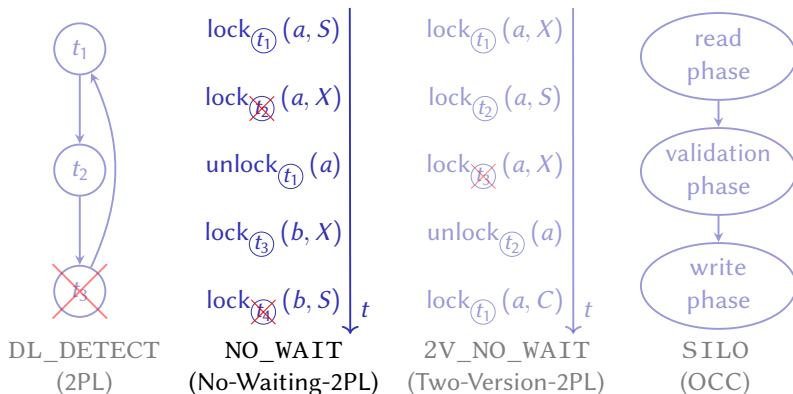


## Pros & Cons of DL\_DETECT (2PL)

- + aborts only after deadlocks
- deadlocks are possible
- locks prevent concurrency too often (e.g. blind writes)
- calculation and analysis of wait-for graph expensive
  - done offline → transactions deadlocked for a while
- aborts happen
  - work done before needs to be repeated
- queue of waiters requires latching
  - limits scalability
- even writes need to acquire latches and wait





## Subsection 2

### NO\_WAIT (No-Waiting-2PL)



## Properties of NO\_WAIT (No-Waiting-2PL)

- ▶ pessimistic concurrency control protocol
- ▶ transactions lock database objects (databases, tables, records, key ranges, etc.) before reading (shared mode  $S$ ) or updating (exclusive mode  $X$ ) them [Moh90]
- ▶  $t_0$  tries to acquire lock held by  $t_1$  in compatible mode  
→  $t_0$  can immediately acquire lock as well (starvation needs to be prevented)
- ▶  $t_0$  tries to acquire lock held by  $t_1$  in incompatible mode  
→  $t_0$  aborts

compatibility	shared mode	exclusive mode
shared mode		
exclusive mode		

# Interactive Example

## Transactions:

$t_0$        $t_1$        $t_2$

## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	0	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

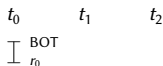
$t_0$              $t_1$              $t_2$   
 — BOT

## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	0	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

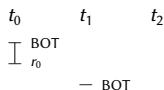


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	2	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

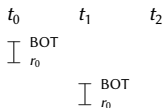


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	2	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

# Interactive Example

## Transactions:



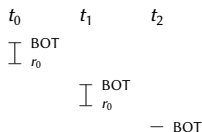
## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	4	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	



# Interactive Example

## Transactions:

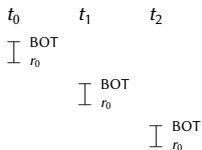


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	4	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

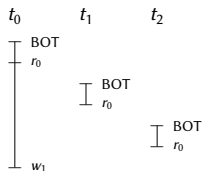


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	6	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

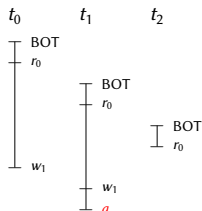


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	6	Current Mode:	1	Current Mode:	0	
Data:	$x_0$	Data:	$x_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

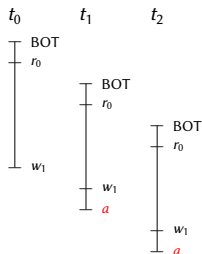


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	4	Current Mode:	1	Current Mode:	0	
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

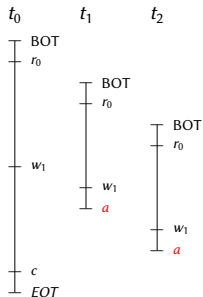


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	2	Current Mode:	1	Current Mode:	0	
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

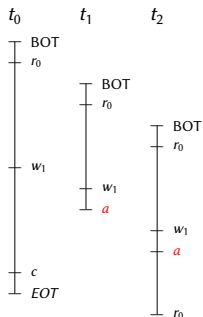


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	0	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

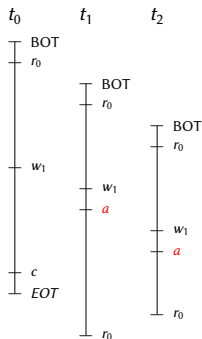


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	2	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	

# Interactive Example

## Transactions:



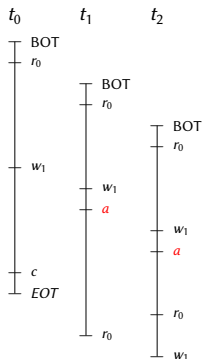
## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	4	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	



# Interactive Example

## Transactions:

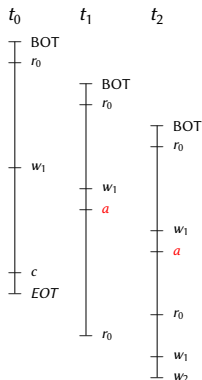


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	4	Current Mode:	1	Current Mode:	0	
Data:	$x_0$	Data:	$x'_1$	Data:	$x_2$	

# Interactive Example

## Transactions:

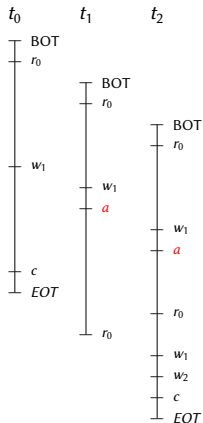


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	4	Current Mode:	1	Current Mode:	1	
Data:	$x_0$	Data:	$x_1'$	Data:	$x_2$	

# Interactive Example

## Transactions:

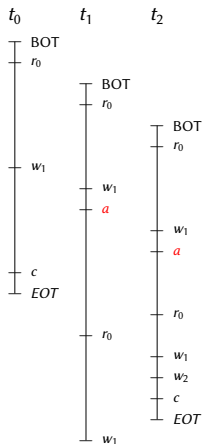


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	2	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1'$	Data:	$x_2'$	

# Interactive Example

## Transactions:

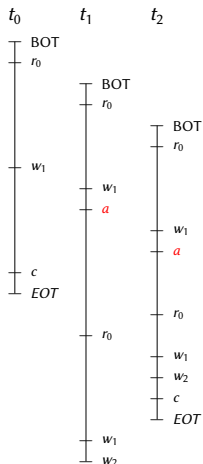


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	2	Current Mode:	1	Current Mode:	0	
Data:	$x_0$	Data:	$x_1'$	Data:	$x_2'$	

# Interactive Example

## Transactions:

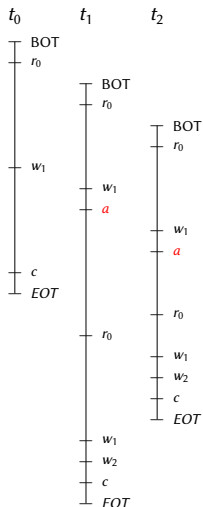


## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	2	Current Mode:	1	Current Mode:	1	
Data:	$x_0$	Data:	$x_1'''$	Data:	$x_2'$	

# Interactive Example

## Transactions:



## Locks:

Record 0		Record 1		Record 2		...
Current Mode:	0	Current Mode:	0	Current Mode:	0	
Data:	$x_0$	Data:	$x_1'''$	Data:	$x_2''$	

## Pros & Cons of NO\_WAIT (No-Waiting-2PL)

- + deadlocks are impossible
- + locks can be implemented using a semaphore and atomics  
→ scales better than latches
- + no need to expensively calculate and analysis a wait-for graph

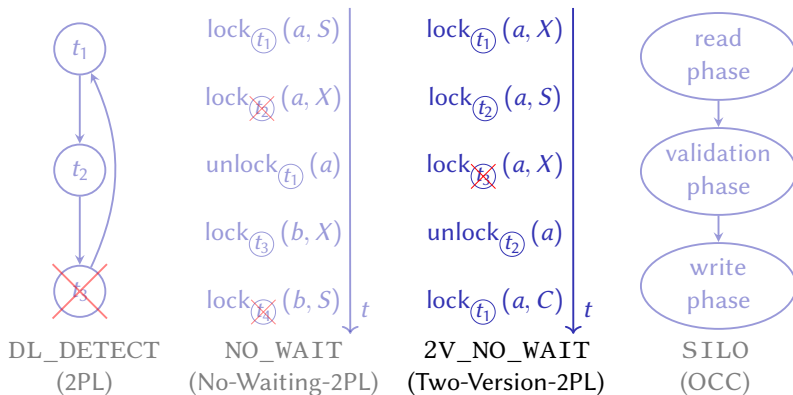
## Pros & Cons of NO\_WAIT (No-Waiting-2PL)

- + deadlocks are impossible
- + locks can be implemented using a semaphore and atomics  
→ scales better than latches
- + no need to expensively calculate and analysis a wait-for graph
- many lock conflicts for update-intensive high-contention workloads  
→ many aborts → work done before needs to be repeated
- locks prevent concurrency too often (e.g. blind writes)



## Subsection 3

### 2V\_NO\_WAIT (Two-Version-2PL)



# Properties of 2V\_NO\_WAIT (Two-Version-2PL) I

- ▶ multiversion pessimistic concurrency control protocol
- ▶ 3 phases: read, certify, write/commit
- ▶ transactions lock records before reading (shared mode  $S$ ), privately updating (exclusive mode  $X$ ) or certifying/globally updating (certify mode  $C$ ) them
- ▶ updates happen first on a private copy  
→ committed copy can still be read by other transactions
- ▶ before committing writes (replace original record with private copy) the absence of relevant conflicts needs to be certified (certification step)

## Properties of 2V\_NO\_WAIT (Two-Version-2PL) II

- ▶  $t_0$  tries to acquire lock held by  $t_1$  in compatible mode  
→  $t_0$  can immediately acquire lock as well (starvation needs to be prevented)
- ▶  $t_0$  tries to acquire lock held by  $t_1$  in incompatible mode  
→  $t_0$  aborts

compatibility	shared mode	exclusive mode	certify mode
shared mode	⊕	⊕	⊖
exclusive mode	⊕	⊖	⊖
certify mode	⊖	⊖	⊖

# Protocol I

## read $r_i$

$C$  acquired  $r_i$  gets certified or committed by another transaction

- ▶ **abort** this transaction

$C$  not acquired other threads might read  $r_i$  or privately update  $r_i$

- ▶ acquire  $r_i$ 's lock in  $S$  mode
- ▶ read global (committed) value of  $r_i$

## update $r_i$

$W$  acquired  $r_i$  gets (privately or globally) updated by another transaction  
→ there are already two versions

- ▶ **abort** this transaction

$W$  not acquired other threads at most read  $r_i$

- ▶ acquire  $r_i$ 's lock in  $X$  mode
- ▶ create local copy of global (committed) value of  $r_i$
- ▶ update local copy of  $r_i$

# Protocol II

**certify  $r_i$**  (*only if  $r_i$  was updated*)

**$S$  acquired**  $r_i$ 's global (committed) value gets read by other transaction  
→ globally updating  $r_i$  would cause non-repeatable reads

- ▶ **abort** this transaction

**$S$  not acquired** other threads at most read  $r_i$

- ▶ acquire  $r_i$ 's lock in  $C$  mode

**commit**

- ▶ (*only if  $r_i$  was updated*) replace global  $r_i$  with updated local version
- ▶ release the locks held on  $r_i$

## Pros & Cons 2V\_NO\_WAIT (Two-Version-2PL)

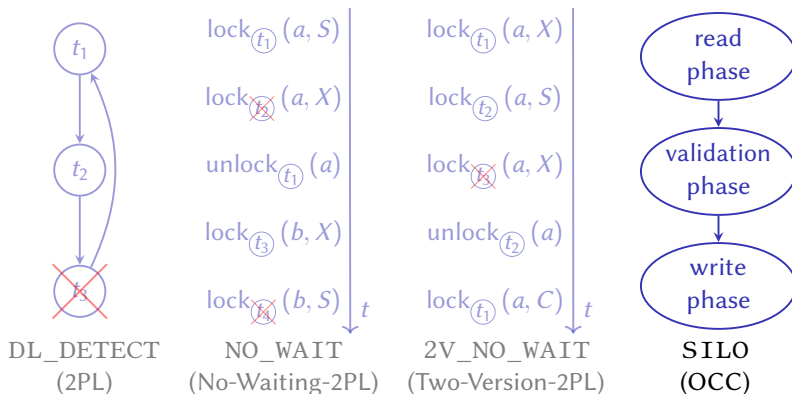
- + deadlocks are impossible
- + transactions can read while a transaction updates a record
- + locks can be implemented using a semaphore and a flag updated with atomic instructions
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- + locks can be implemented using a semaphore and a flag updated with atomic instructions
  - scales better than latches
- + no need to expensively calculate and analysis a wait-for graph
- update-intensive high-contention workloads result in many lock conflicts
  - many aborts → work done before needs to be repeated
- locks still prevent concurrency too often (e.g. blind writes)
- additional steps for updates required:
  - ▶ create private copy of updated record (expensive but scalable)
  - ▶ certify update (cheap)

## Subsection 4

### SILO (OCC)





# Properties of SILO (OCC) I

- ▶ optimistic concurrency control protocol
- ▶ 3 phases: read, validate, write/commit
- ▶ each record contains the transaction ID (global ordered number based on epochs) from the last update
- ▶ transactions perform reads and local writes during the read phase without acquiring locks

## Properties of SILO (OCC) II

- ▶ read and write sets (records read and written by the transaction) are recorded locally
- ▶ read and write sets used to validate absence of relevant conflicts
- ▶ commit requires three phases: locking of updated records, verification of read set (based on TIDs), execute global writes
- ▶ deletes invalidate records using updates  
→ garbage collection required
- ▶ records for inserts created before validation to provide locks

## Pros & Cons SILO (OCC)

- + deadlocks are impossible (locks acquired only in last phase → global order can be used)
- + transactions can concurrently read and write
- + only actual conflicts cause aborts (optimism)

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- + deadlocks are impossible (locks acquired only in last phase → global order can be used)
- + transactions can concurrently read and write
- + only actual conflicts cause aborts (optimism)
- update-intensive high-contention workloads result in many invalid reads
  - many aborts → work done before needs to be repeated
- globally sorted transaction IDs need to be generated (epochs make that cheap)
- additional steps for updating transactions required:
  - ▶ write and read sets locally (expensive but scalable)
  - ▶ validate reads

## Section 4

### Performance Evaluation

	SE/NP	DORA	Delegation	PSE
DL_DETECT	⊕	⊕	⊕	⊙
NO_WAIT	⊕	⊕	⊕	
2V_NO_WAIT	⊕	⊕	⊕	
SILO	⊕	⊖	⊕	



# Evaluation Set-Up

- ▶ 4x Intel Xeon E7-8890 v3 NUMA machine (72 cores @ 2.5 GHz)
- ▶ 32 kB L1I cache and 32 kB L1D cache per core
- ▶ 256 kB L2 cache per core
- ▶ 45 MB L3 cache per CPU
- ▶ 512 GB DDR4 RAM
- ▶ hyperThreading not used
- ▶ threads pinned to physical cores
- ▶ sockets filled sequentially with threads

# Benchmarks

## Microbenchmark

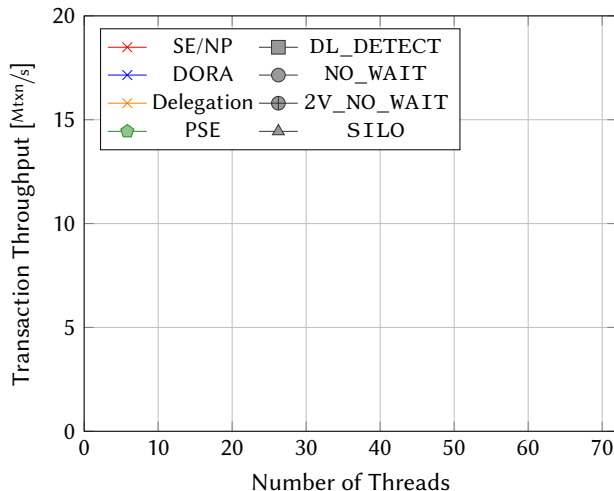
- ▶ 13 GB database
- ▶ Hot Set: 16 records *distributed to 16 partitions*
- ▶ Cold Set: 100 000 000 – 16 records
- ▶ Txn: 2 accesses to Hot Set & 8 accesses to (*thread-local*) Cold Set

## Yahoo! Cloud Serving Benchmark (YCSB)

- ▶ 20 GB database
- ▶ 20 000 000 records
- ▶ Txn: reads/updates 16 records following Zipfian distribution according to parameter  $\Theta$

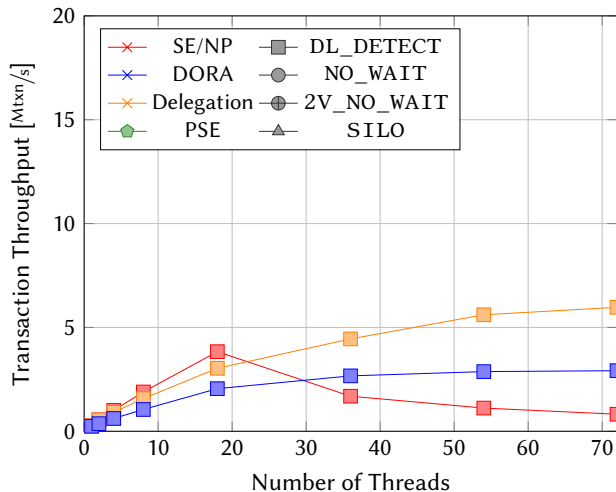


# Read-Only Microbenchmark



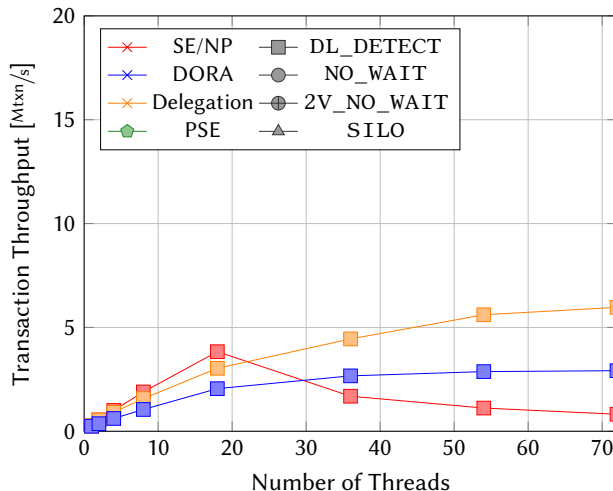
## Observations

# Read-Only Microbenchmark



Observations

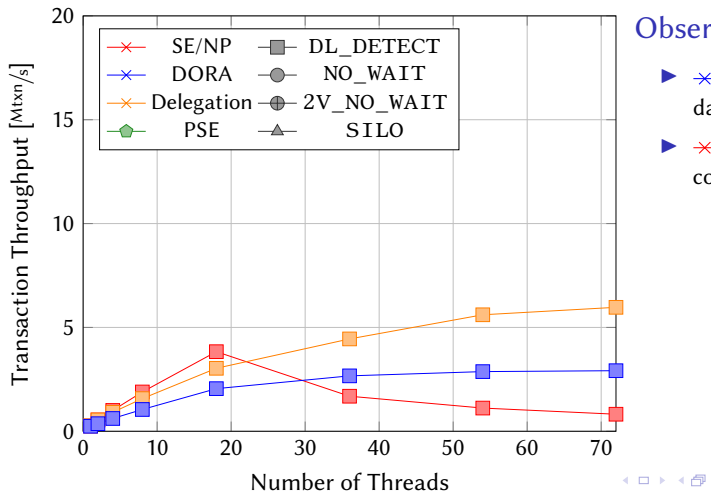
# Read-Only Microbenchmark



## Observations

- $\times/\times$  suffer from remote data access overhead

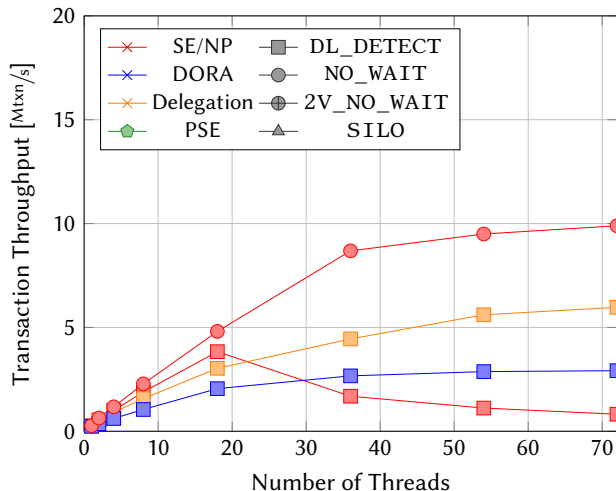
# Read-Only Microbenchmark



## Observations

- ▶  $\times/\times$  suffer from remote data access overhead
- ▶  $\times$  suffers from latch contention on locks

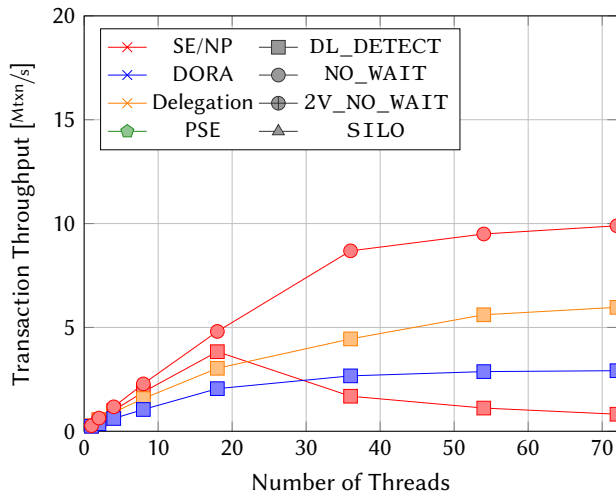
# Read-Only Microbenchmark



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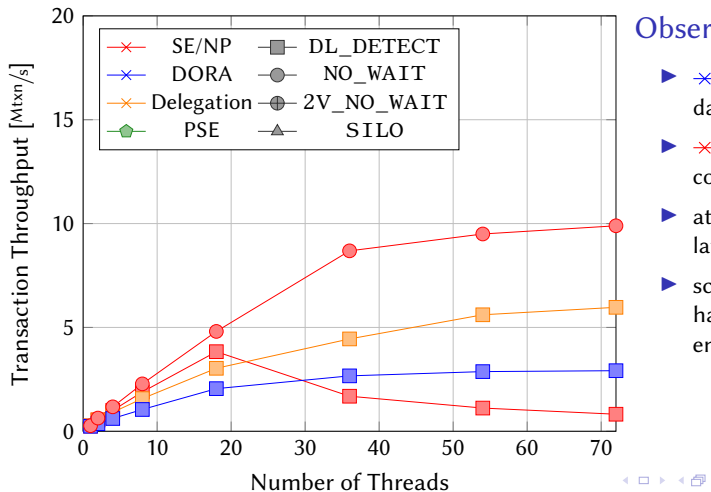
# Read-Only Microbenchmark



## Observations

- ▶  $\times/\times$  suffer from remote data access overhead
- ▶  $\times$  suffers from latch contention on locks
- ▶ atomics of  $\bullet$  outperform latches of  $\blacksquare$

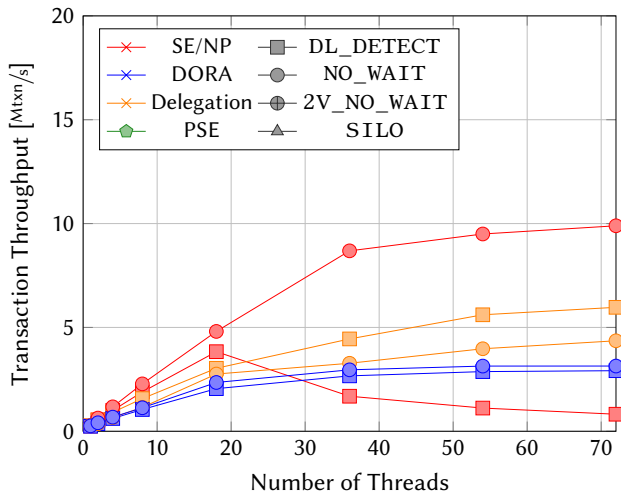
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- ▶ scaling of  $\bullet$  limited by hardware cache coherence mechanism

# Read-Only Microbenchmark

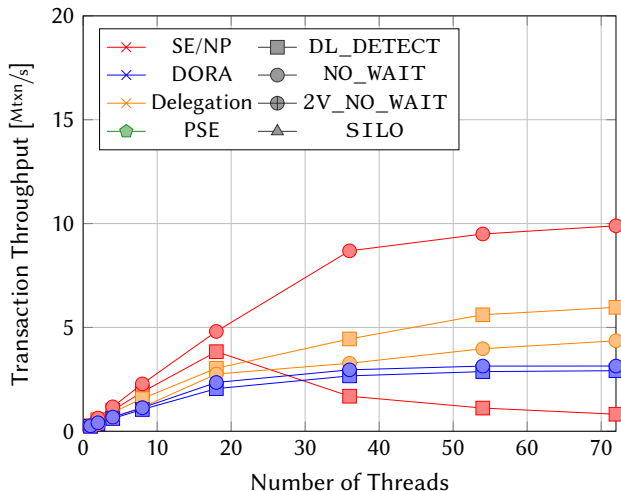


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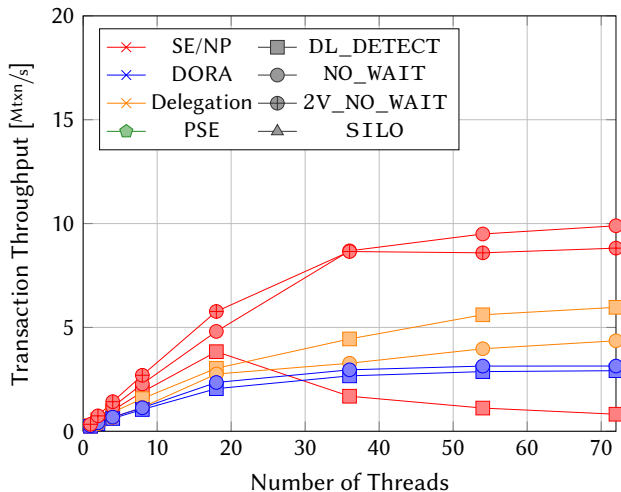
# Read-Only Microbenchmark



## Observations

- ▶ x suffers from latch contention on locks
- ▶ atomics of ● outperform latches of ■
- ▶ scaling of ● limited by hardware cache coherence mechanism
- ▶ x/x suffer more from remote data accesses than x suffers from cache coherence

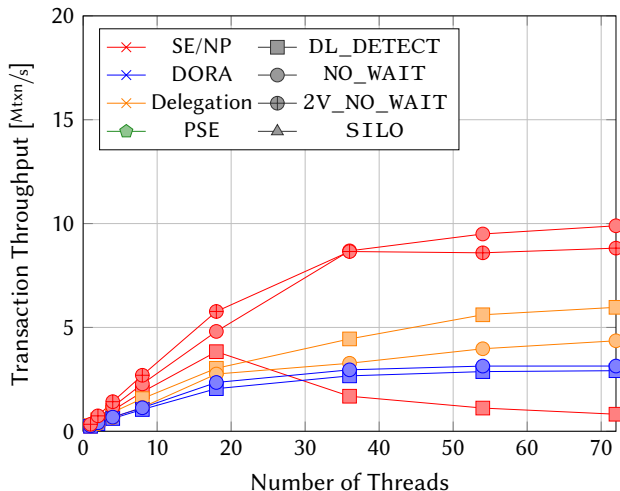
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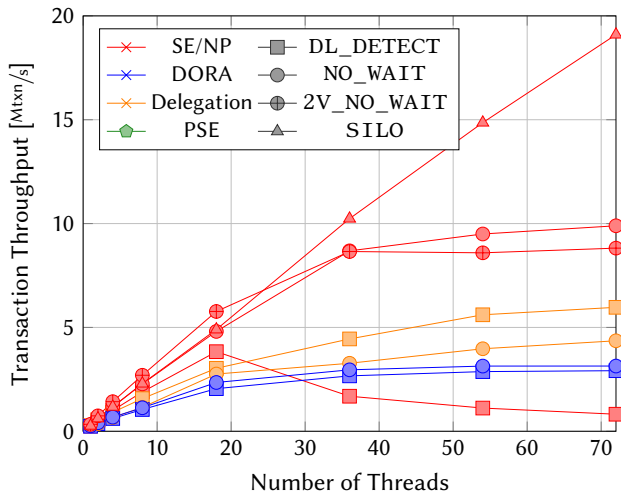
# Read-Only Microbenchmark



## Observations

- ▶ atomics of outperform latches of
- ▶ scaling of limited by hardware cache coherence mechanism
- ▶ / suffer more from remote data accesses than suffers from cache coherence
- ▶ and perform identical for read-only

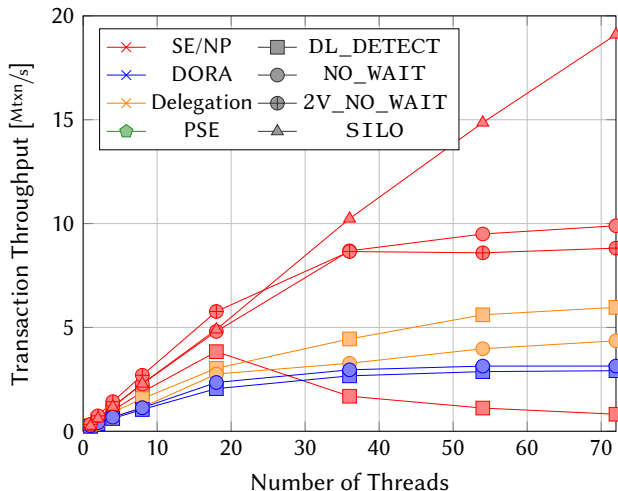
# Read-Only Microbenchmark



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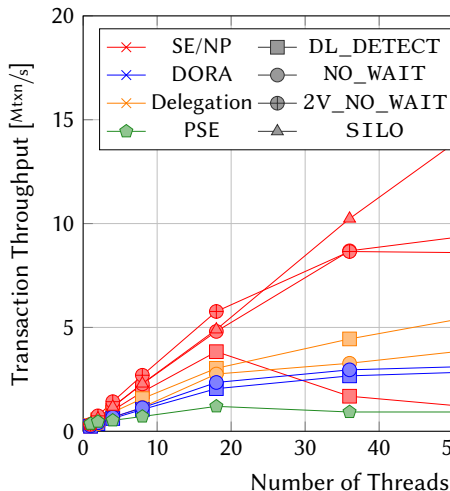
# Read-Only Microbenchmark



## Observations

- ▶ scaling of  $\bullet$  limited by hardware cache coherence mechanism
- ▶  $\times$ / $\times$  suffer more from remote data accesses than  $\times$  suffers from cache coherence
- ▶  $\oplus$  and  $\bullet$  perform identical for read-only
- ▶  $\triangle$  behaves identical for  $\times$  and  $\times$  for read-only

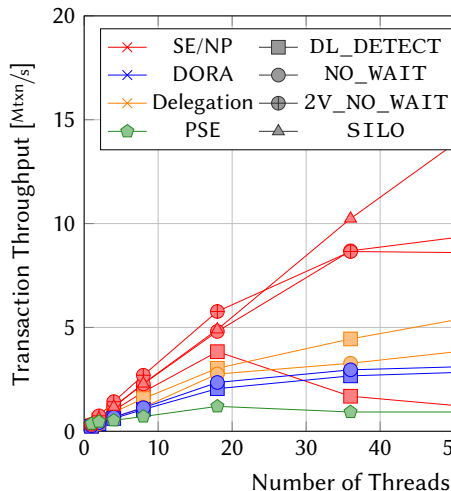
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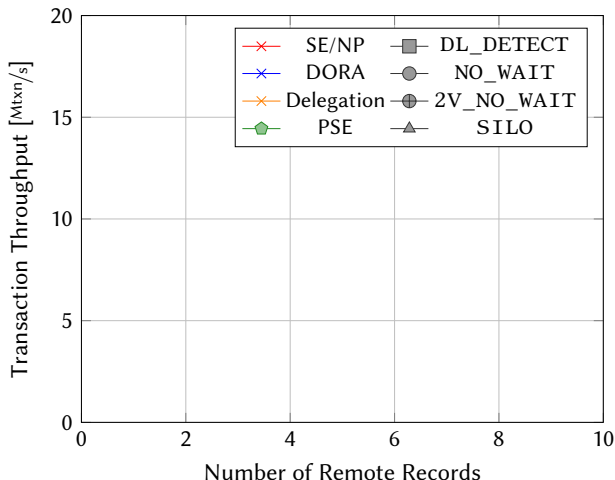
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- ▶ coarse-grained partition locking of  $\diamond$  does not scale due to multi-site workload

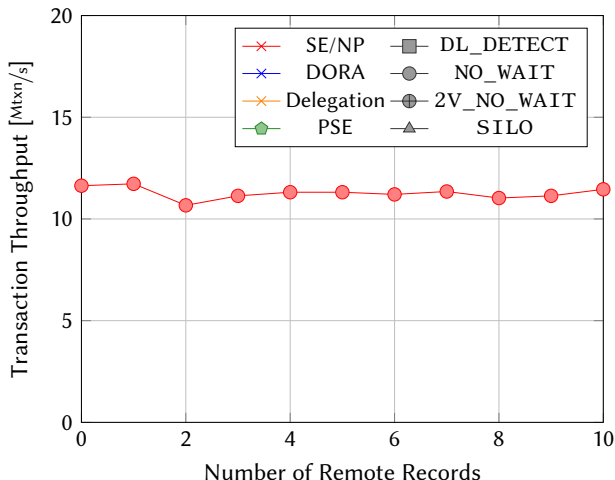
# Multi-Site Read-Only Microbenchmark



## Observations

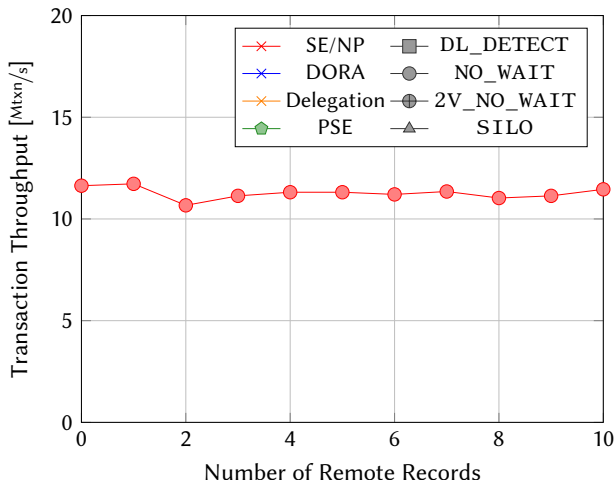


# Multi-Site Read-Only Microbenchmark



Observations

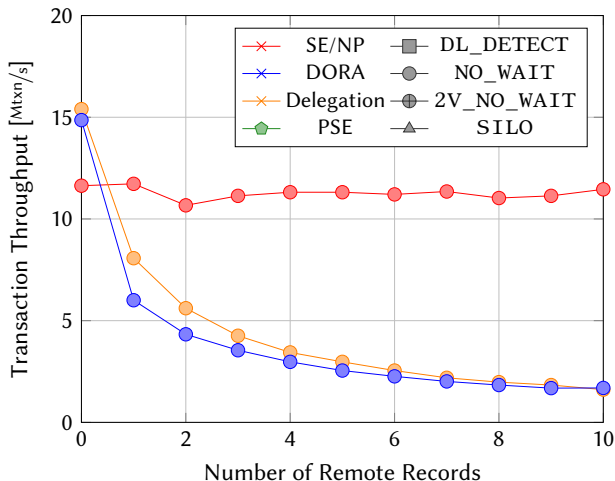
# Multi-Site Read-Only Microbenchmark



## Observations

- SE/NP does not know remote records

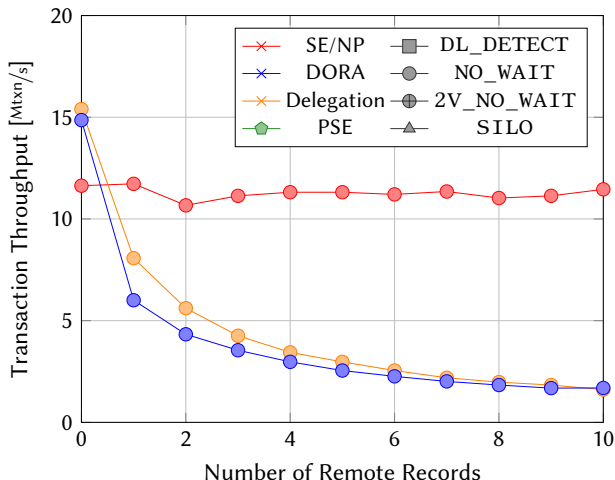
# Multi-Site Read-Only Microbenchmark



## Observations

- x does not know remote records

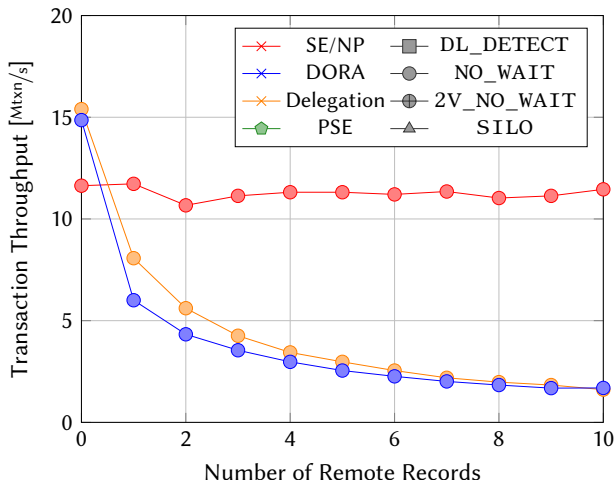
# Multi-Site Read-Only Microbenchmark



## Observations

- ▶ x does not know remote records
- ▶ x/x outperform x for 0 remote records due to lower cache coherence activity

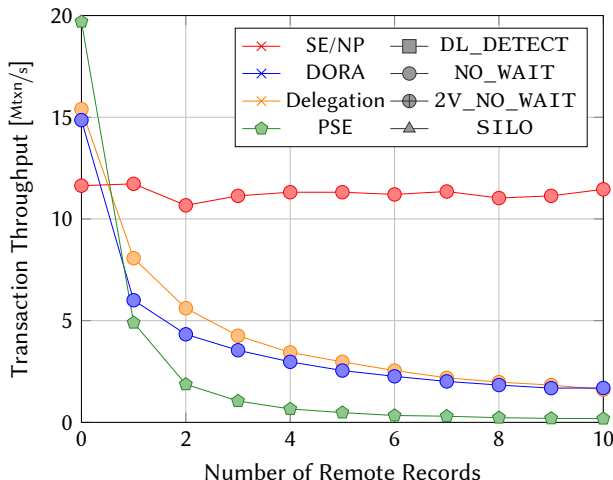
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- ▶  $\times$  does not know remote records
- ▶  $\times$ / $\times$  outperform  $\times$  for 0 remote records due to lower cache coherence activity
- ▶  $\times$ / $\times$  suffer from remote data access overhead for  $> 0$  remote records

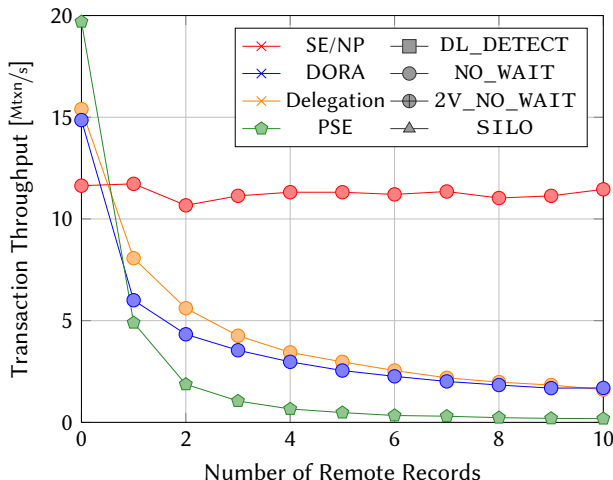
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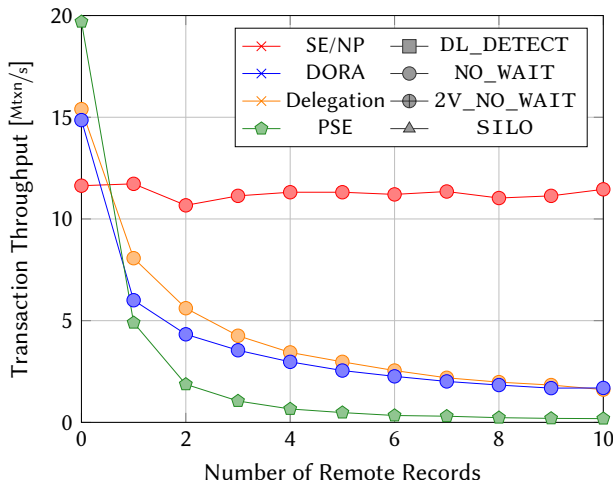
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## Observations

- ▶  $\times/\times$  outperform  $\times$  for 0 remote records due to lower cache coherence activity
- ▶  $\times/\times$  suffer from remote data access overhead for  $> 0$  remote records
- ▶ coarse-grained partition locking of  $\blacklozenge$  imposes nearly no overhead for suitable partitioning

# Multi-Site Read-Only Microbenchmark

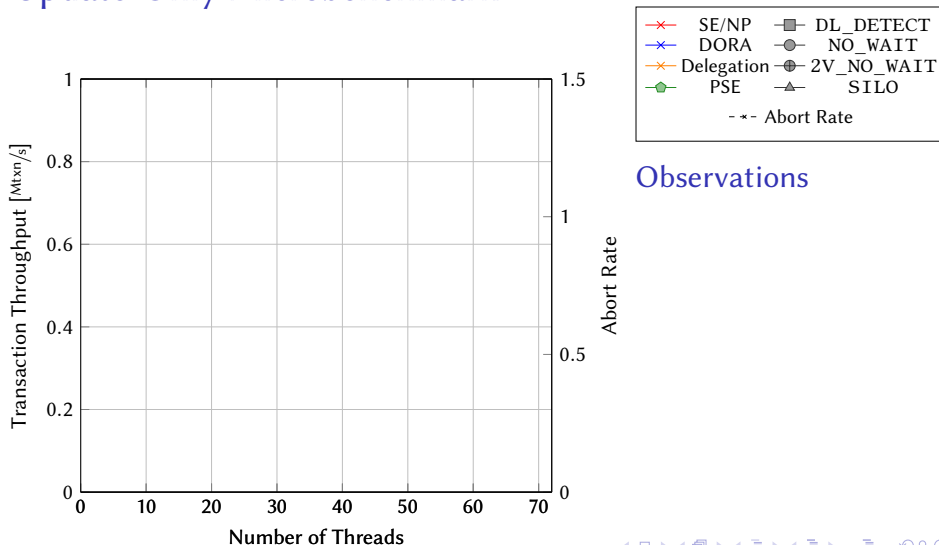


## Observations

- ▶  $\times/\times$  suffer from remote data access overhead for  $> 0$  remote records
- ▶ coarse-grained partition locking of  $\blacktriangle$  imposes nearly no overhead for suitable partitioning
- ▶ coarse-grained partition locking of  $\blacktriangle$  limits the concurrency drastically for  $> 0$  remote records

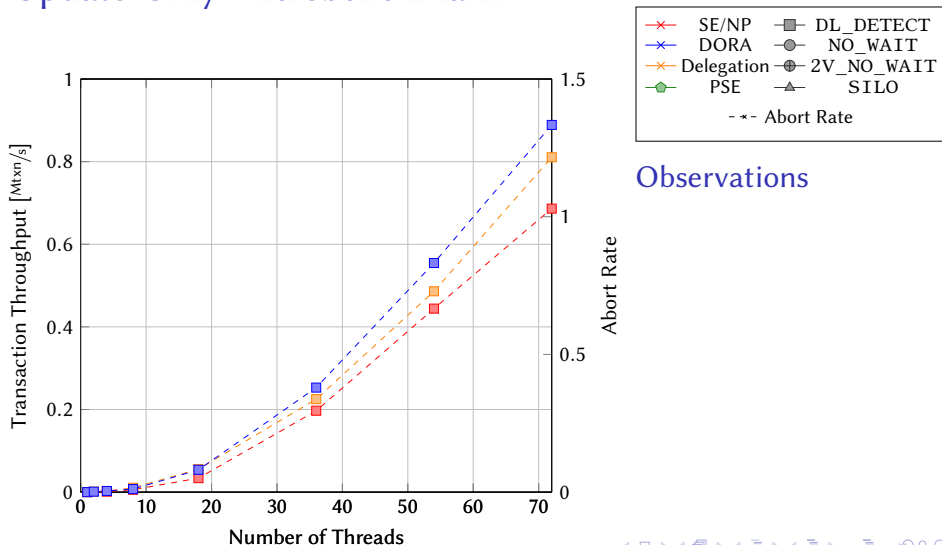


# Update-Only Microbenchmark



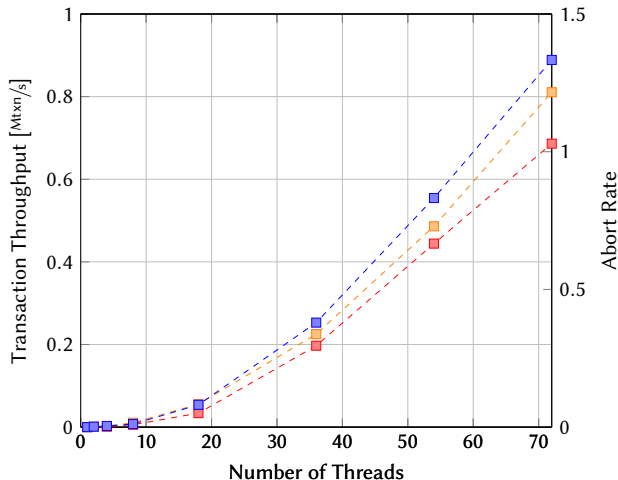
## Observations

# Update-Only Microbenchmark



## Observations

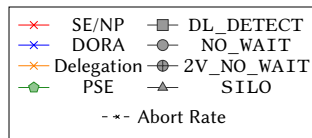
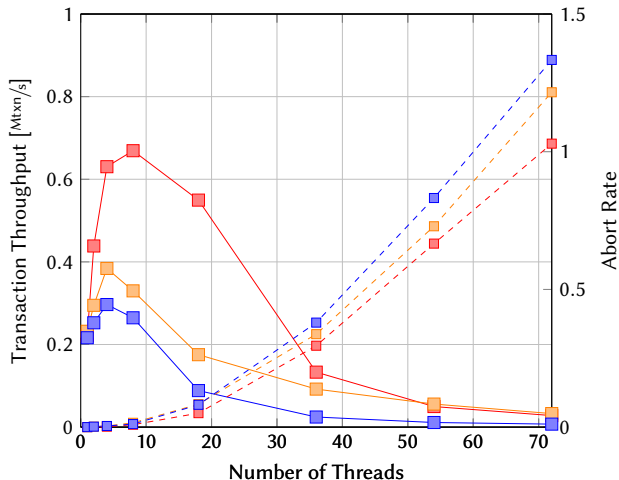
# Update-Only Microbenchmark



## Observations

- ▶ abort rate scales for  $\blacksquare$  due to higher contention  $\rightarrow$  deadlocks

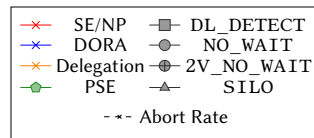
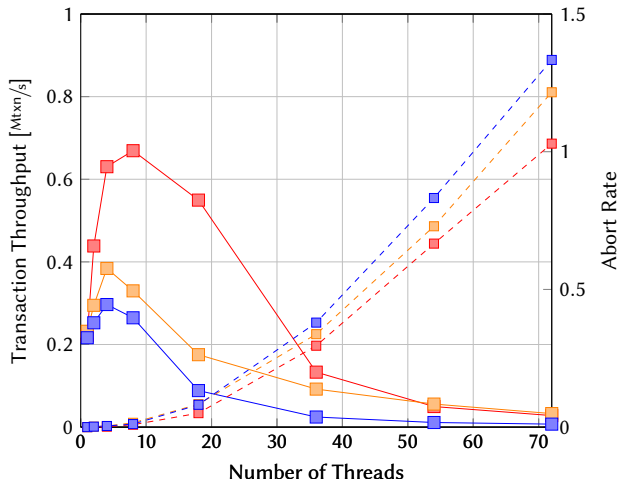
# Update-Only Microbenchmark



## Observations

- ▶ abort rate scales for  $\blacksquare$  due to higher contention  $\rightarrow$  deadlocks

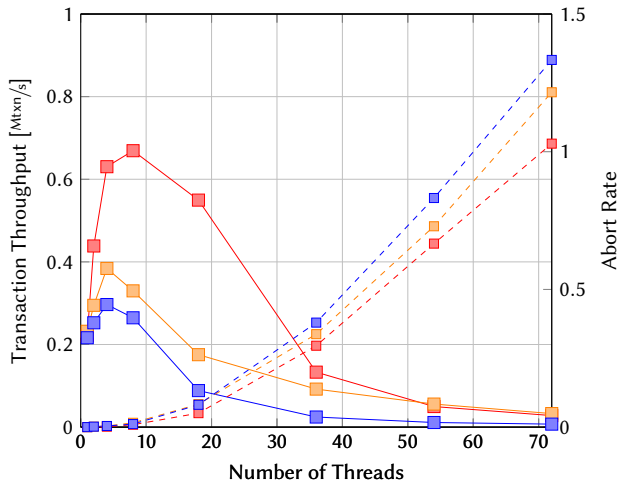
# Update-Only Microbenchmark



## Observations

- ▶ abort rate scales for  $\blacksquare$  due to higher contention  $\rightarrow$  deadlocks
- ▶  $[Mtxn/s]$  suffers from aborts and lock thrashing

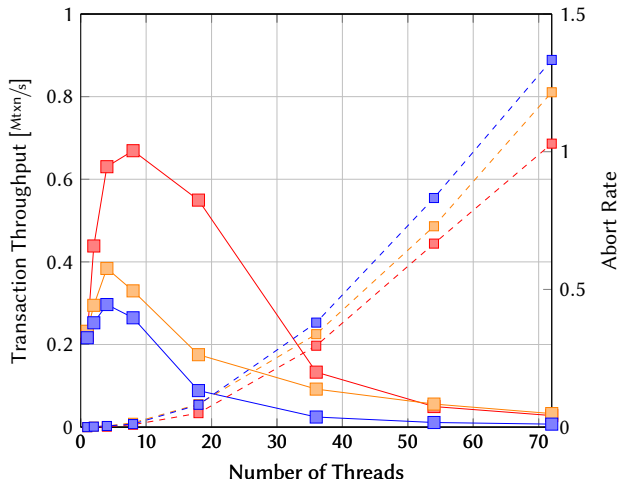
# Update-Only Microbenchmark



## Observations

- ▶ abort rate scales for  $\blacksquare$  due to higher contention  $\rightarrow$  deadlocks
- ▶  $[\text{Mtxn/s}]$  suffers from aborts and lock thrashing
- ▶  $\times/\square$  suffer more from remote data access overhead

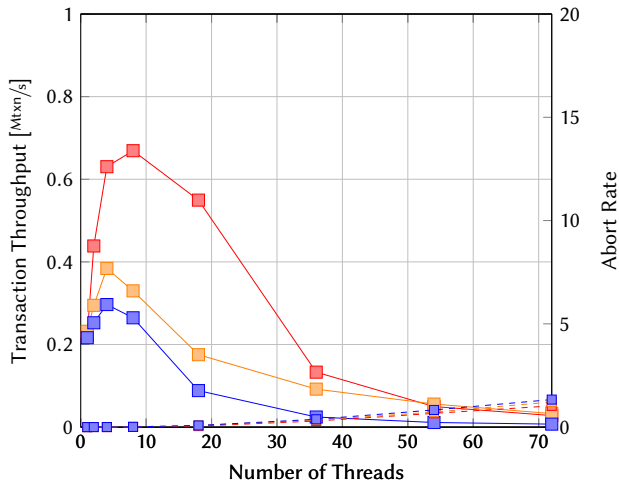
# Update-Only Microbenchmark



## Observations

- ▶  $[Mtxn/s]$  suffers from aborts and lock thrashing
- ▶  $\times/\times$  suffer more from remote data access overhead
- ▶ latch contention is not the bottleneck  $\rightarrow \times$  can outperform  $\times/\times$

# Update-Only Microbenchmark

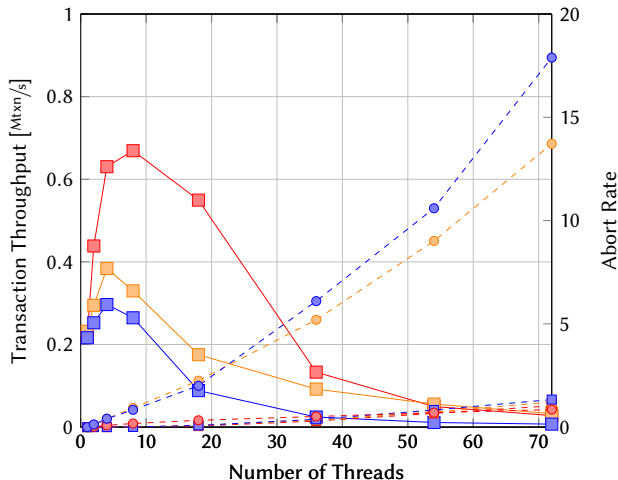


## Observations

- ▶  $[Mtxn/s]$  suffers from aborts and lock thrashing
- ▶  $\times/\times$  suffer more from remote data access overhead
- ▶ latch contention is not the bottleneck  $\rightarrow \times$  can outperform  $\times/\times$



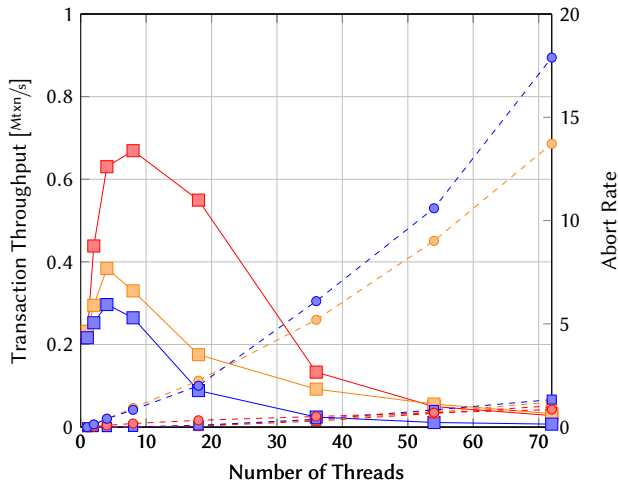
# Update-Only Microbenchmark



## Observations

- ▶  $[Mtxn/s]$  suffers from aborts and lock thrashing
- ▶  $\times/\times$  suffer more from remote data access overhead
- ▶ latch contention is not the bottleneck  $\rightarrow \times$  can outperform  $\times/\times$

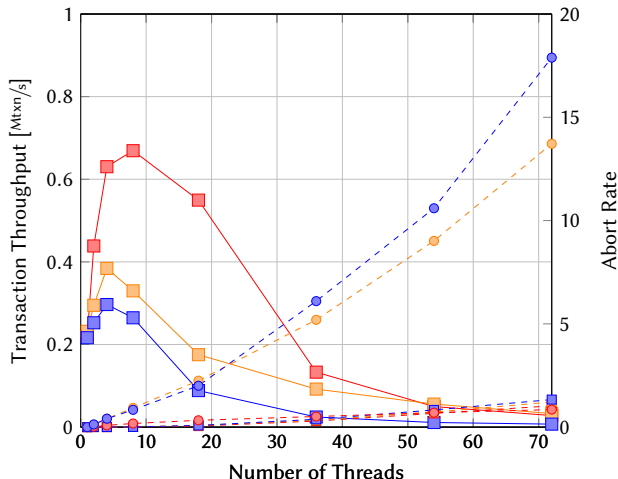
# Update-Only Microbenchmark



## Observations

- ▶  $\times/\times$  suffer more from remote data access overhead
- ▶ latch contention is not the bottleneck  $\rightarrow \times$  can outperform  $\times/\times$
- ▶ lock thrashing does not cause many aborts for  $\bullet$  with  $\times$  for few threads

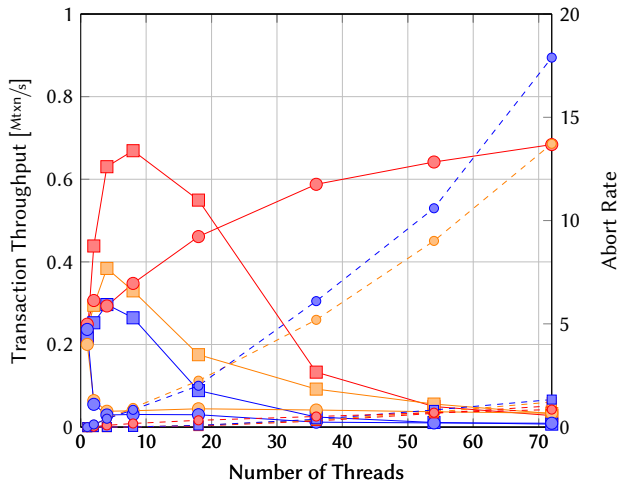
# Update-Only Microbenchmark



## Observations

- lock thrashing does not cause many aborts for  $\bullet$  with  $\times$  for few threads
- lock thrashing caused by long commit latencies caused by overloaded (hot) partitions causes many aborts for  $\times/\times$

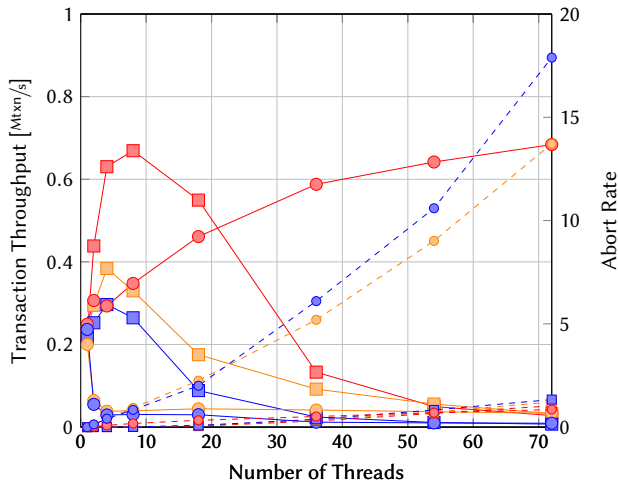
# Update-Only Microbenchmark



## Observations

- lock thrashing does not cause many aborts for  $\bullet$  with  $\times$  for few threads
- lock thrashing caused by long commit latencies caused by overloaded (hot) partitions causes many aborts for  $\times/\times$

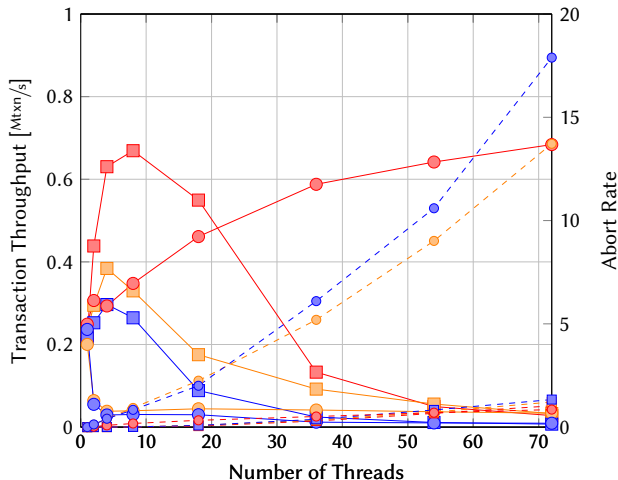
# Update-Only Microbenchmark



## Observations

- lock thrashing does not cause many aborts for  $\bullet$  with  $\times$  for few threads
- lock thrashing caused by long commit latencies caused by overloaded (hot) partitions causes many aborts for  $\times$ / $\times$
- the aborts are the major bottleneck for  $\bullet$

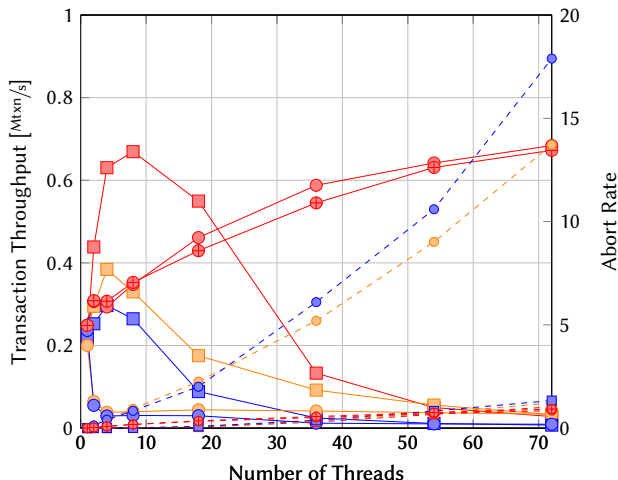
# Update-Only Microbenchmark



## Observations

- lock thrashing caused by long commit latencies caused by overloaded (hot) partitions causes many aborts for  $\times/\times$
- the aborts are the major bottleneck for  $\bullet$
- latching overhead and deadlocks  $\rightarrow$   $\bullet$  outperforms  $\square$  for  $\times$

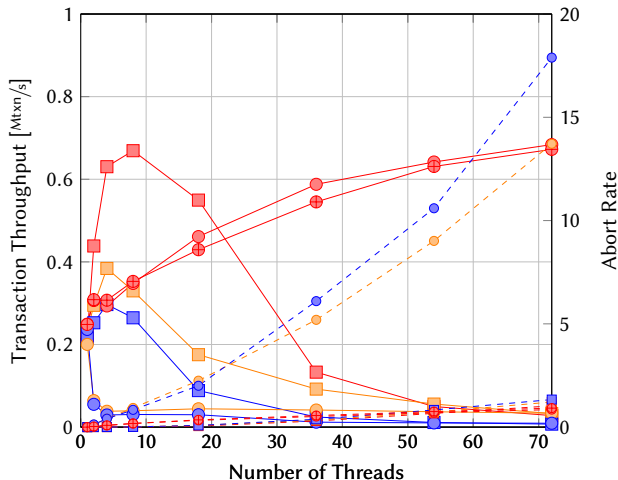
# Update-Only Microbenchmark



## Observations

- lock thrashing caused by long commit latencies caused by overloaded (hot) partitions causes many aborts for  $\times/\times$
- the aborts are the major bottleneck for  $\bullet$
- latching overhead and deadlocks  $\rightarrow$   $\bullet$  outperforms  $\square$  for  $\times$

# Update-Only Microbenchmark

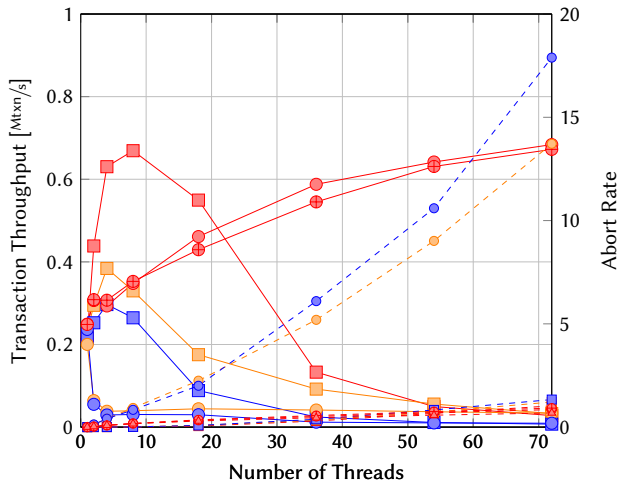


## Observations

- ▶ the aborts are the major bottleneck for  $\bullet$
- ▶ latching overhead and deadlocks  $\rightarrow$   $\bullet$  outperforms  $\square$  for  $\times$
- ▶ for update-only  $\bullet$  and  $\oplus$  behave identical



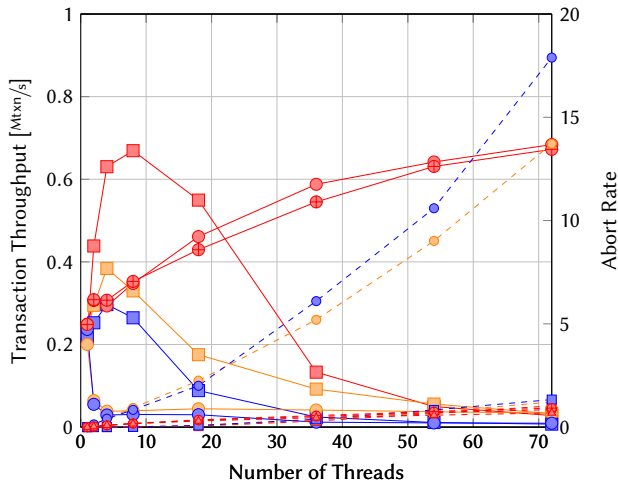
# Update-Only Microbenchmark



## Observations

- ▶ the aborts are the major bottleneck for  $\bullet$
- ▶ latching overhead and deadlocks  $\rightarrow$   $\bullet$  outperforms  $\square$  for  $\times$
- ▶ for update-only  $\bullet$  and  $\bullet$  behave identical

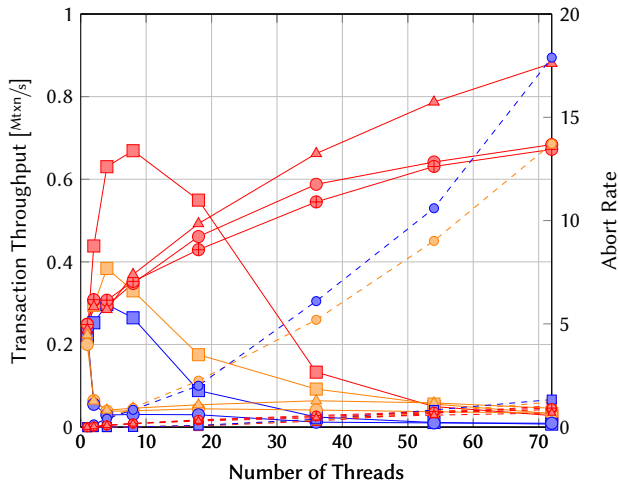
# Update-Only Microbenchmark



## Observations

- ▶ the aborts are the major bottleneck for  $\text{NO\_WAIT}$
- ▶ latching overhead and deadlocks  $\rightarrow$   $\text{NO\_WAIT}$  outperforms  $\text{DL\_DETECT}$  for  $\text{SE/NP}$
- ▶ for update-only  $\text{NO\_WAIT}$  and  $\text{2V\_NO\_WAIT}$  behave identical
- ▶  $\text{SILO}$  causes less aborts than  $\text{DL\_DETECT}$  due its optimism

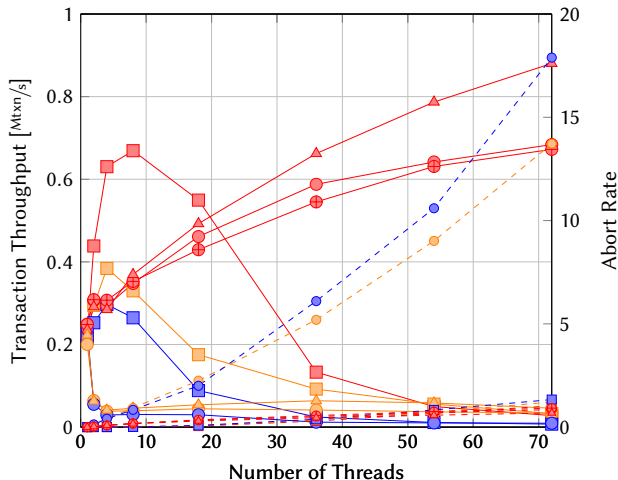
# Update-Only Microbenchmark



## Observations

- ▶ the aborts are the major bottleneck for  $\text{NO\_WAIT}$
- ▶ latching overhead and deadlocks  $\rightarrow$   $\text{NO\_WAIT}$  outperforms  $\text{DL\_DETECT}$  for  $\text{SE/NP}$
- ▶ for update-only  $\text{NO\_WAIT}$  and  $\text{2V\_NO\_WAIT}$  behave identical
- ▶  $\text{SILO}$  causes less aborts than  $\text{DL\_DETECT}$  due its optimism

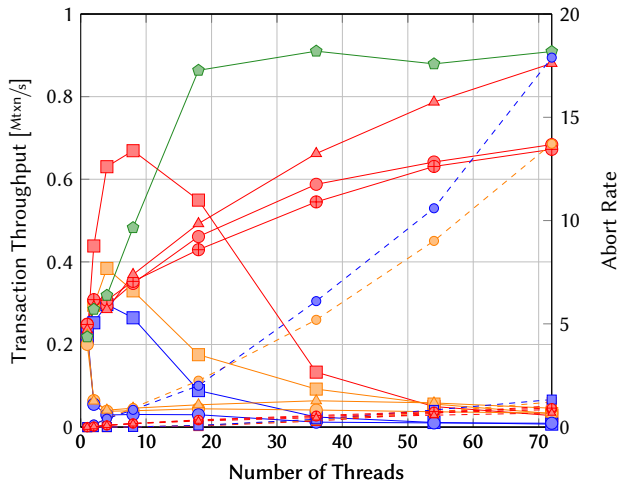
# Update-Only Microbenchmark



## Observations

- for update-only  $\bullet$  and  $\bullet$  behave identical
- $\blacktriangle$  causes less aborts than  $\blacksquare$  due its optimism
- long commit latencies of  $\times$  cause high update contention and therefore many aborts (low [ $\text{Mtxn/s}$ ]) for  $\blacktriangle$

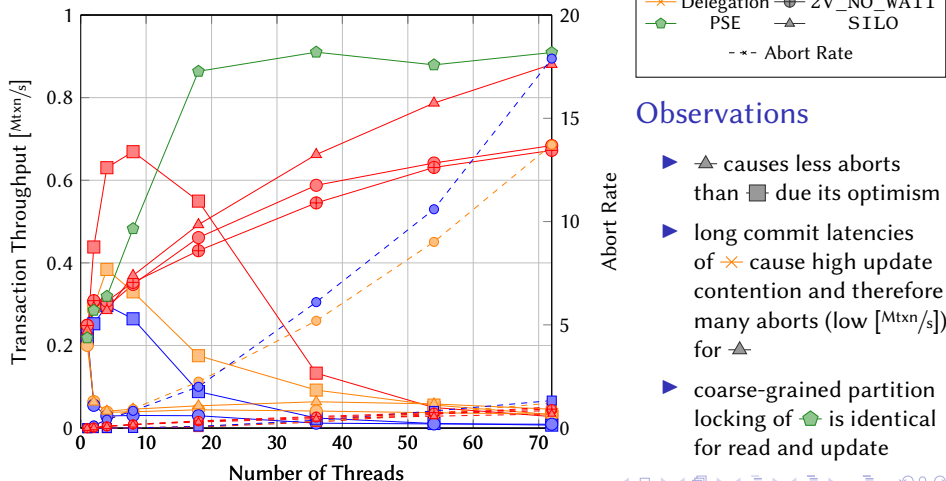
# Update-Only Microbenchmark



## Observations

- for update-only  $\bullet$  and  $\bullet$  behave identical
- $\blacktriangle$  causes less aborts than  $\blacksquare$  due its optimism
- long commit latencies of  $\times$  cause high update contention and therefore many aborts (low [ $\text{Mtxn/s}$ ]) for  $\blacktriangle$

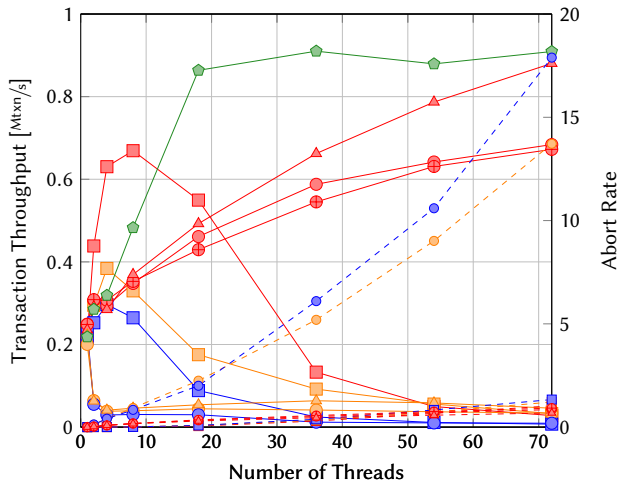
# Update-Only Microbenchmark





## Observations

- ▶  $\triangle$  causes less aborts than  $\square$  due its optimism
- ▶ long commit latencies of  $\times$  cause high update contention and therefore many aborts (low  $[Mtxn/s]$ ) for  $\triangle$
- ▶ coarse-grained partition locking of  $\diamond$  is identical for read and update

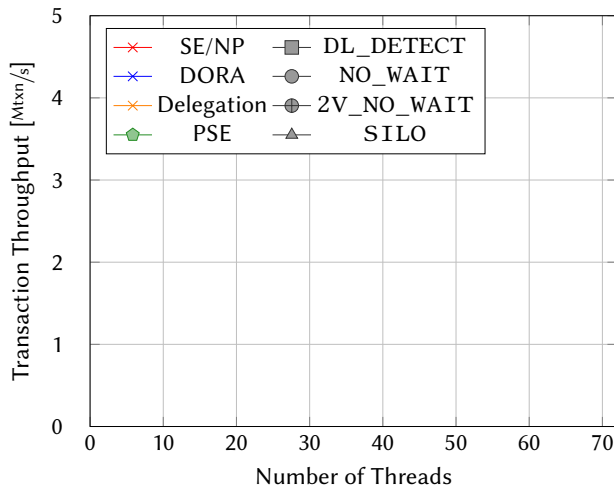
# Update-Only Microbenchmark



## Observations

- coarse-grained partition locking of  is identical for read and update
-  scales according to the number of hot records (each transaction locks 2 of 16 (hot) partitions)

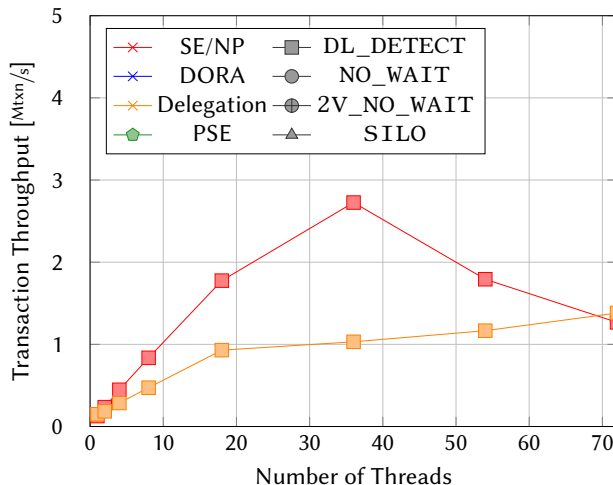
# Read-Only YCSB ( $\Theta = 0.8$ )



Observations

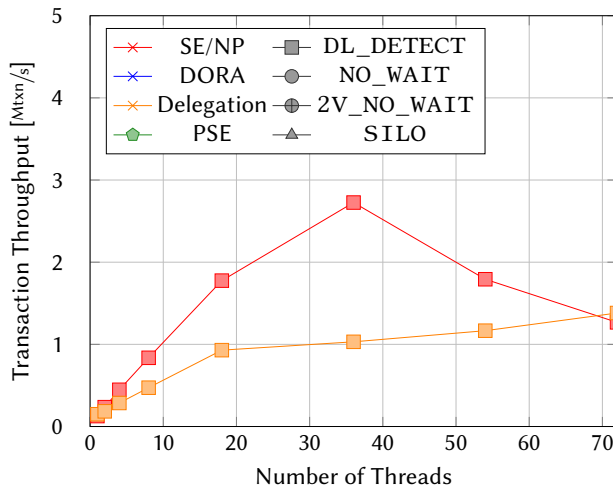


# Read-Only YCSB ( $\Theta = 0.8$ )



Observations

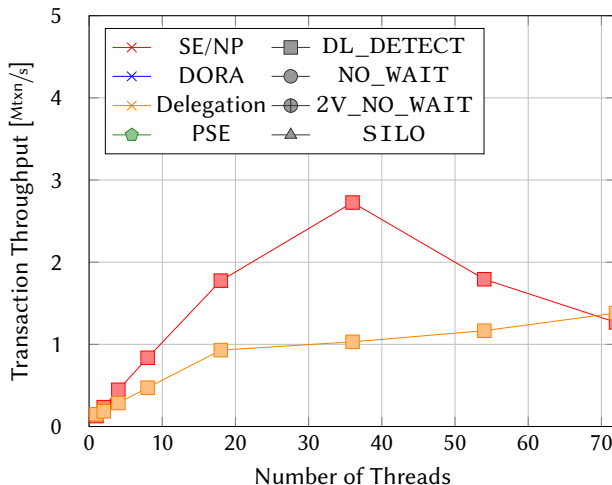
# Read-Only YCSB ( $\Theta = 0.8$ )



## Observations

- SE/NP scales well with DL\_DETECT until the latch contention becomes a bottleneck

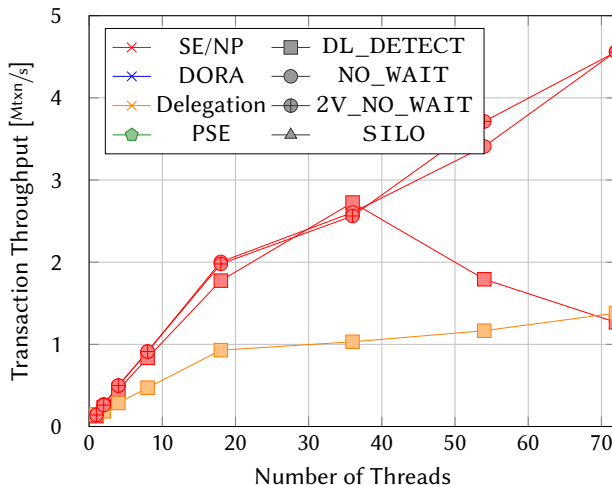
# Read-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶ × scales well with ■ until the latch contention becomes a bottleneck
- ▶ × (and ×) does not scale well due to partition-unfriendly Zipfian access distribution

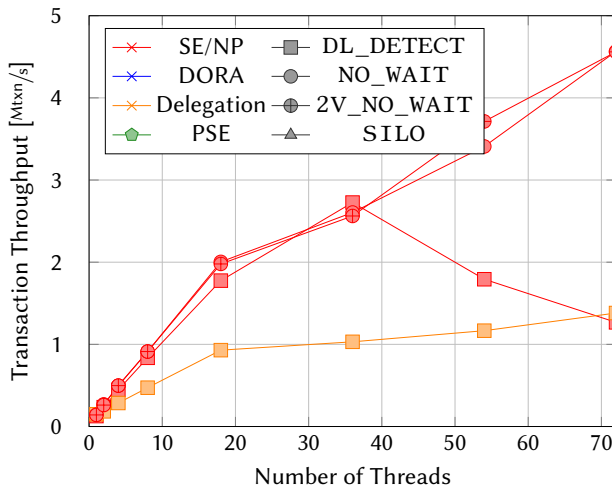
# Read-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶ x scales well with ■ until the latch contention becomes a bottleneck
- ▶ x (and x) does not scale well due to partition-unfriendly Zipfian access distribution

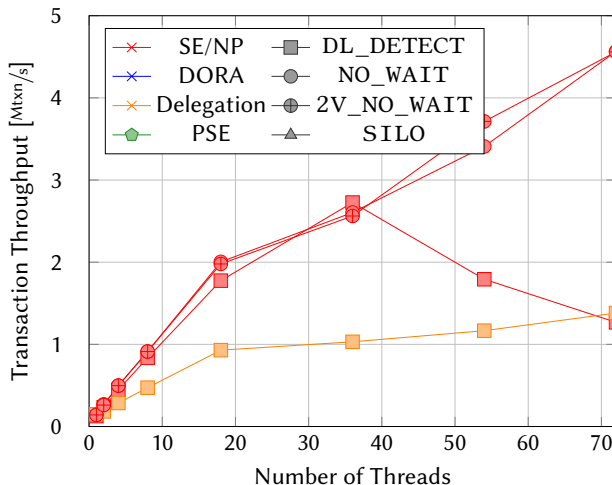
# Read-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶  $\times$  scales well with  $\square$  until the latch contention becomes a bottleneck
- ▶  $\times$  (and  $\times$ ) does not scale well due to partition-unfriendly Zipfian access distribution
- ▶ atomics of  $\circ$  scale better than latches of  $\square$

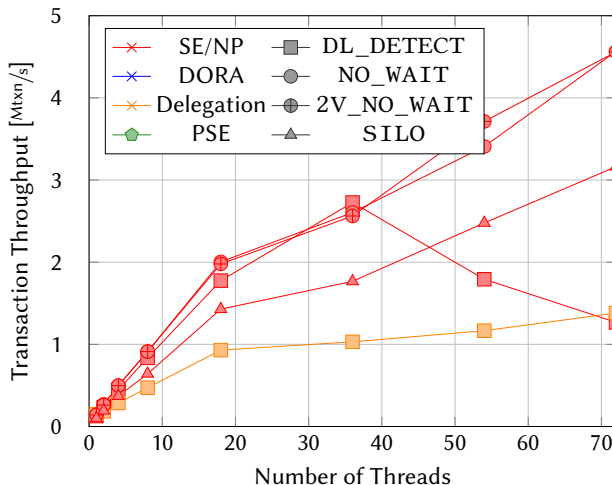
# Read-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶ x scales well with ■ until the latch contention becomes a bottleneck
- ▶ x (and x) does not scale well due to partition-unfriendly Zipfian access distribution
- ▶ atomics of ● scale better than latches of ■
- ▶ ⊕ and ● perform identical for read-only

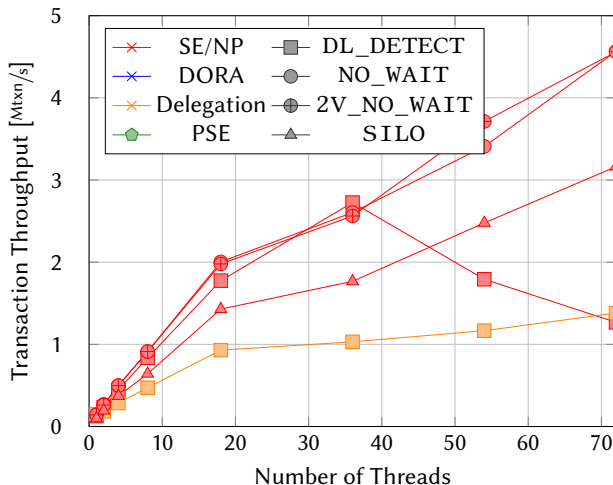
# Read-Only YCSB ( $\Theta = 0.8$ )



## Observations

- SE/NP scales well with DL\_DETECT until the latch contention becomes a bottleneck
- DORA (and Delegation) does not scale well due to partition-unfriendly Zipfian access distribution
- atomics of NO\_WAIT scale better than latches of DL\_DETECT
- SE/NP and NO\_WAIT perform identical for read-only

# Read-Only YCSB ( $\Theta = 0.8$ )

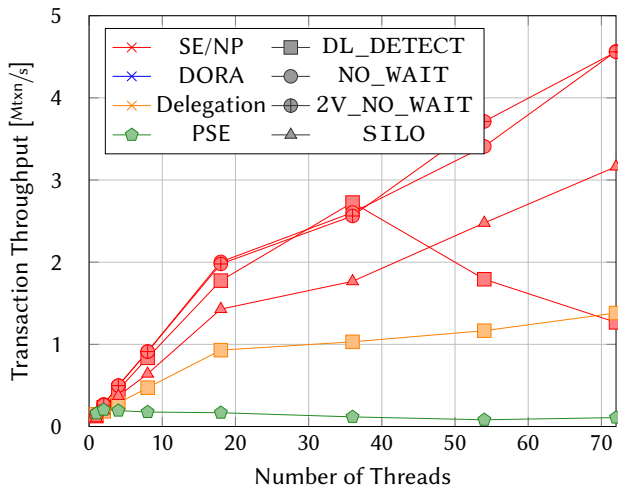


## Observations

- ▶  $\times$  (and  $\times$ ) does not scale well due to partition-unfriendly Zipfian access distribution
- ▶ atomics of  $\bullet$  scale better than latches of  $\blacksquare$
- ▶  $\bullet$  and  $\bullet$  perform identical for read-only
- ▶  $\blacktriangle$  lags behind  $\bullet$  due to the overhead of copying read (large) records for validation



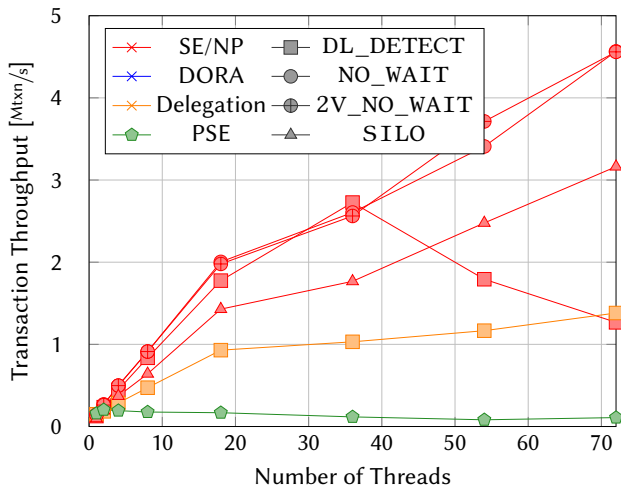
# Read-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶  $\times$  (and  $\times$ ) does not scale well due to partition-unfriendly Zipfian access distribution
- ▶ atomics of  $\bullet$  scale better than latches of  $\blacksquare$
- ▶  $\bullet$  and  $\bullet$  perform identical for read-only
- ▶  $\blacktriangle$  lags behind  $\bullet$  due to the overhead of copying read (large) records for validation

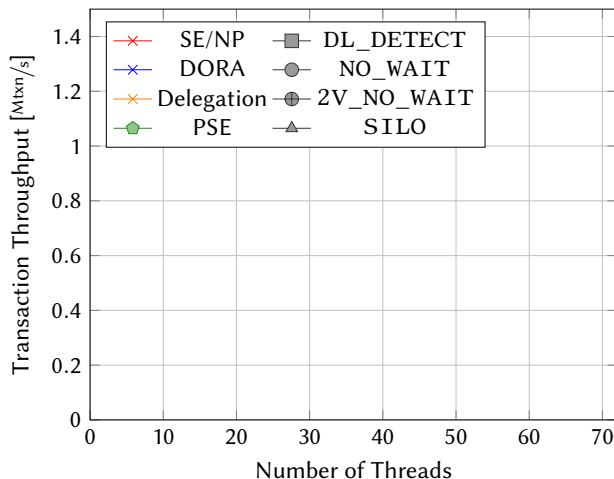
# Read-Only YCSB ( $\Theta = 0.8$ )



## Observations

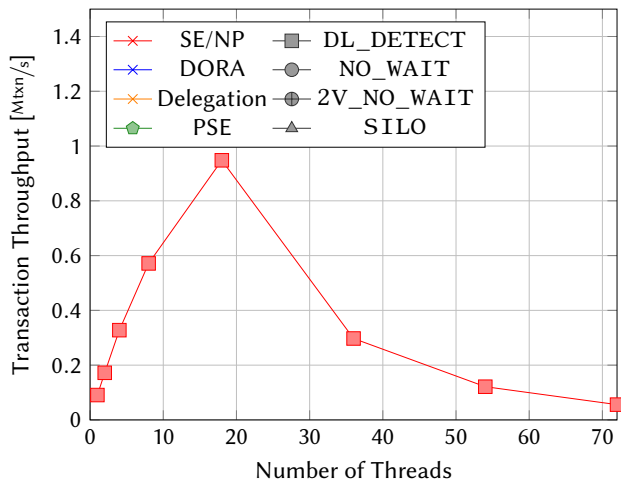
- ▶ atomics of  $\bullet$  scale better than latches of  $\blacksquare$
- ▶  $\oplus$  and  $\bullet$  perform identical for read-only
- ▶  $\blacktriangle$  lags behind  $\oplus$  due to the overhead of copying read (large) records for validation
- ▶ coarse-grained partition locking of  $\blacklozenge$  is identical for read and update

# Update-Only YCSB ( $\Theta = 0.8$ )



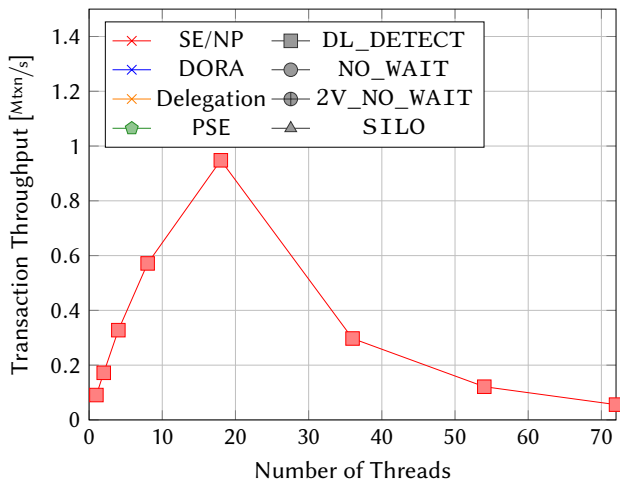
Observations

# Update-Only YCSB ( $\Theta = 0.8$ )



Observations

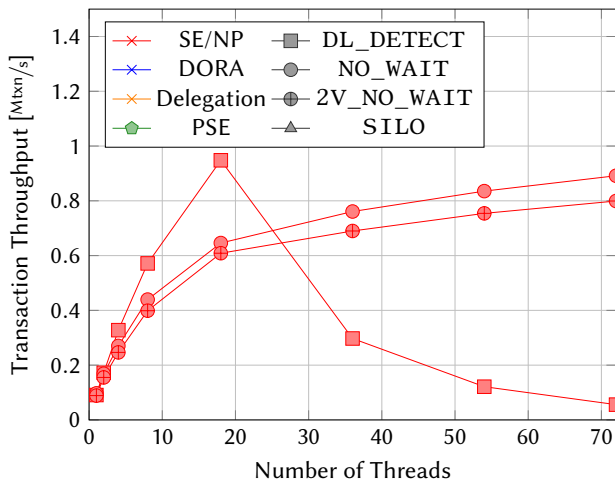
# Update-Only YCSB ( $\Theta = 0.8$ )



## Observations

- **DL\_DETECT** suffers from deadlocks for many threads

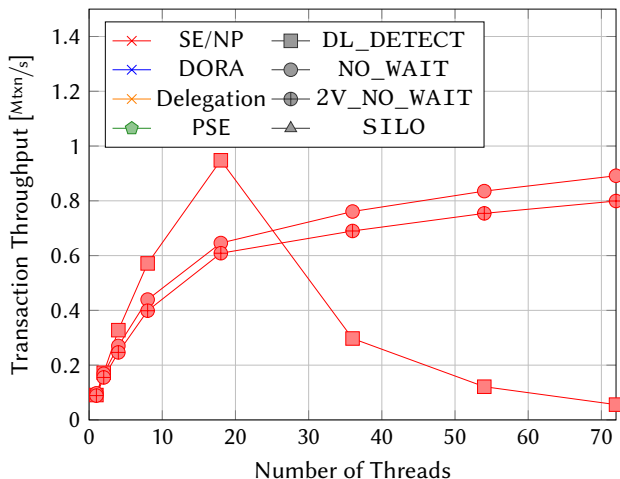
# Update-Only YCSB ( $\Theta = 0.8$ )



## Observations

- DL\_DETECT suffers from deadlocks for many threads

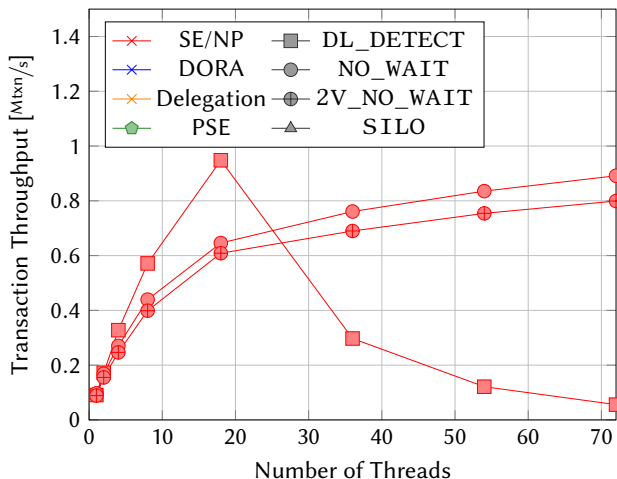
# Update-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶ DL\_DETECT suffers from deadlocks for many threads
- ▶ lock thrashing (aborts for NO\_WAIT) is not a bottleneck due to lower contention

# Update-Only YCSB ( $\Theta = 0.8$ )

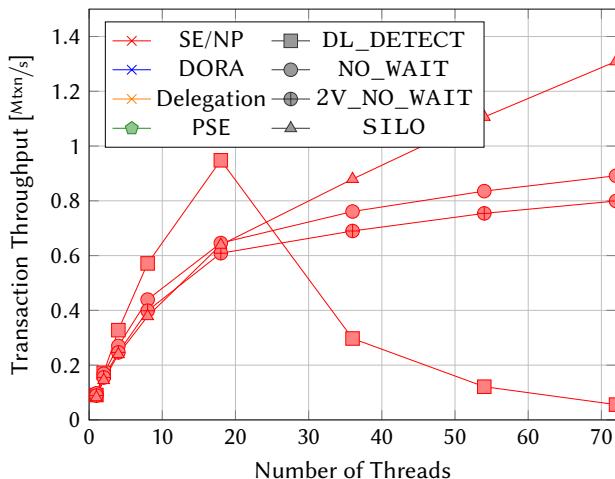


## Observations

- ▶  $\blacksquare$  suffers from deadlocks for many threads
- ▶ lock thrashing (aborts for  $\bullet$ ) is not a bottleneck due to lower contention
- ▶  $\oplus$  and  $\bullet$  perform identical for update-only



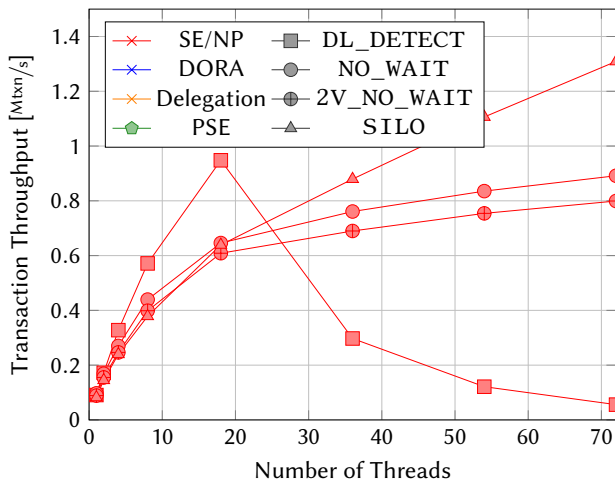
# Update-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶  $\blacksquare$  suffers from deadlocks for many threads
- ▶ lock thrashing (aborts for  $\bullet$ ) is not a bottleneck due to lower contention
- ▶  $\oplus$  and  $\bullet$  perform identical for update-only

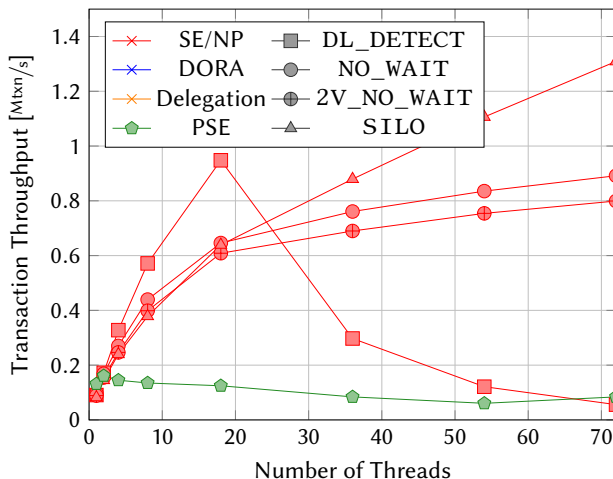
# Update-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶  $\blacksquare$  suffers from deadlocks for many threads
- ▶ lock thrashing (aborts for  $\bullet$ ) is not a bottleneck due to lower contention
- ▶  $\oplus$  and  $\bullet$  perform identical for update-only
- ▶  $\blacktriangle$  causes less aborts than  $\bullet$  due its optimism  $\rightarrow$  higher  $[Mtxn/s]$

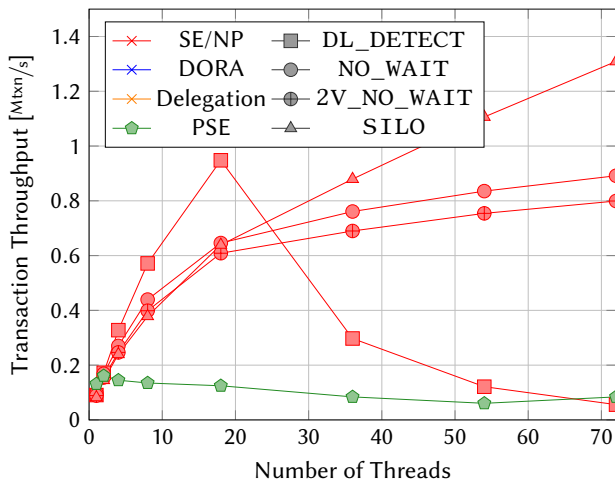
# Update-Only YCSB ( $\Theta = 0.8$ )



## Observations

- ▶  $\square$  suffers from deadlocks for many threads
- ▶ lock thrashing (aborts for  $\bullet$ ) is not a bottleneck due to lower contention
- ▶  $\oplus$  and  $\bullet$  perform identical for update-only
- ▶  $\triangle$  causes less aborts than  $\bullet$  due its optimism  $\rightarrow$  higher  $[Mtxn/s]$

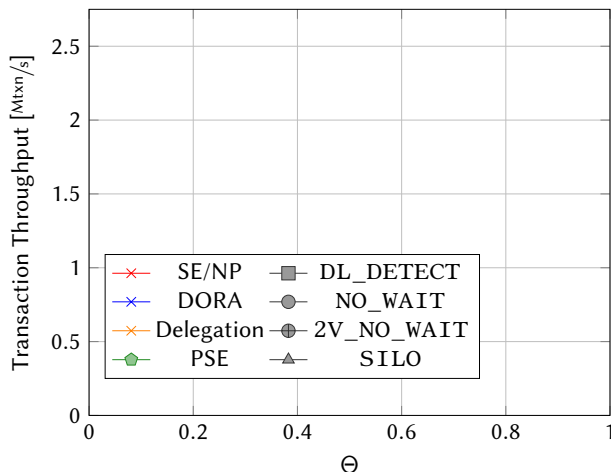
# Update-Only YCSB ( $\Theta = 0.8$ )



## Observations

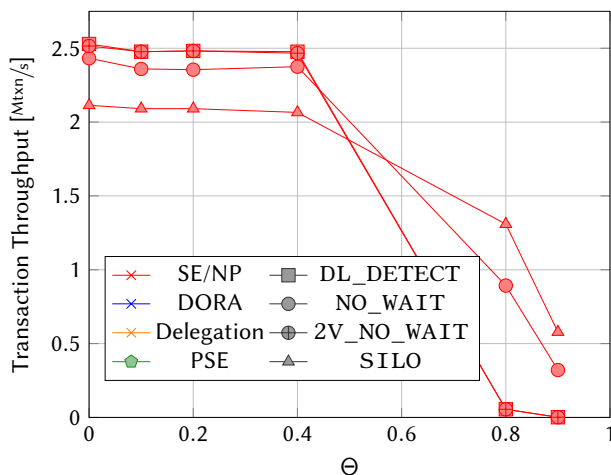
- ▶ lock thrashing (aborts for  $\bullet$ ) is not a bottleneck due to lower contention
- ▶  $\oplus$  and  $\bullet$  perform identical for update-only
- ▶  $\blacktriangle$  causes less aborts than  $\bullet$  due its optimism  $\rightarrow$  higher  $[M_{txn}/s]$
- ▶  $\blacklozenge$  (and  $\blacktimes$ / $\blackstar$ ) does not scale well due to partition-unfriendly Zipfian access distribution

# Update-Only YCSB (72 Threads)



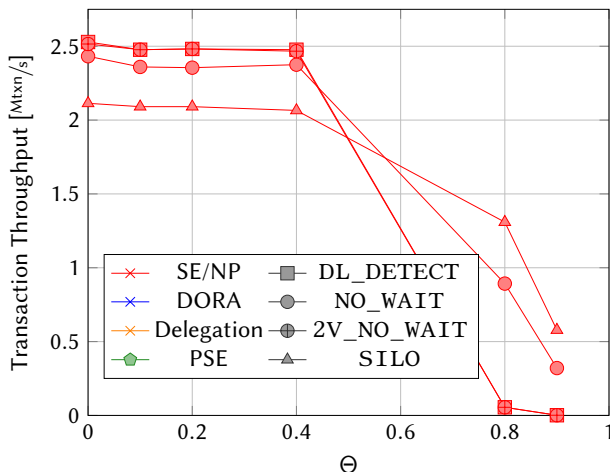
Observations

# Update-Only YCSB (72 Threads)



Observations

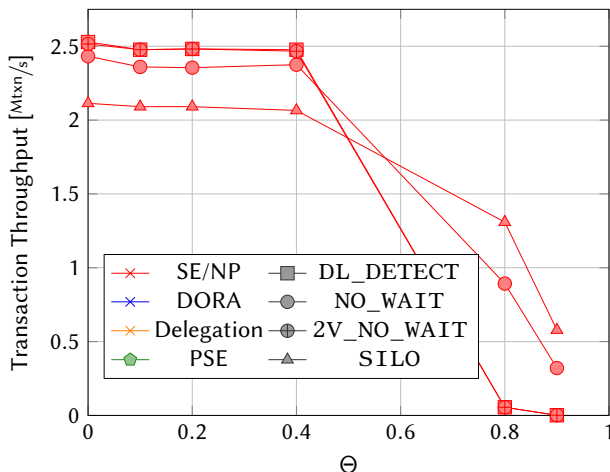
# Update-Only YCSB (72 Threads)



## Observations

- for  $\Theta \leq 0.4$  the contention is very low  $\rightarrow$  high concurrency possible

# Update-Only YCSB (72 Threads)

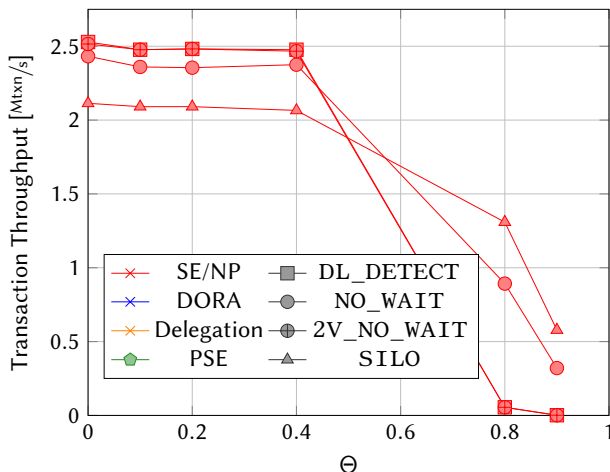


## Observations

- for  $\Theta \leq 0.4$  the contention is very low  $\rightarrow$  high concurrency possible
- copying records imposes an overhead to  $\oplus/\triangle$



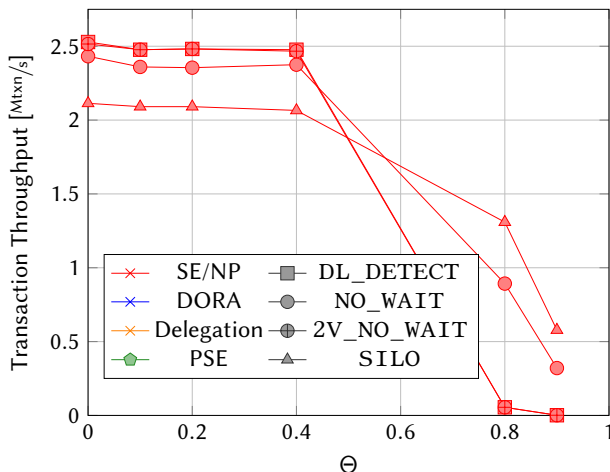
# Update-Only YCSB (72 Threads)



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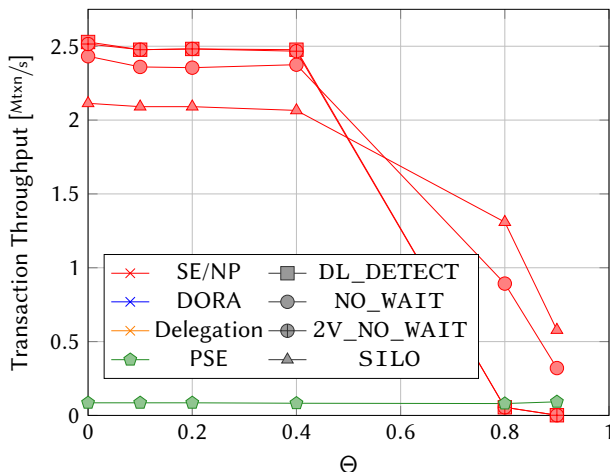
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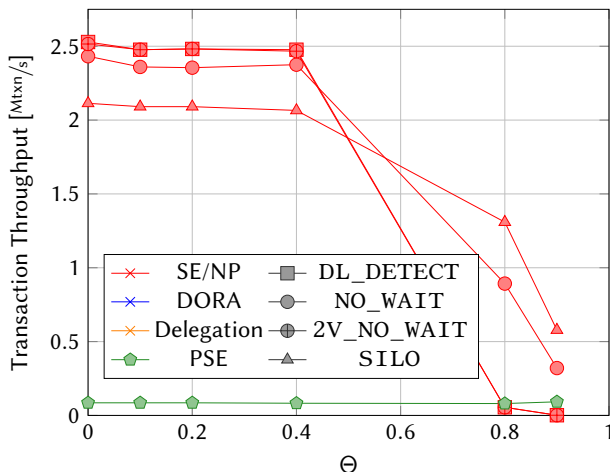
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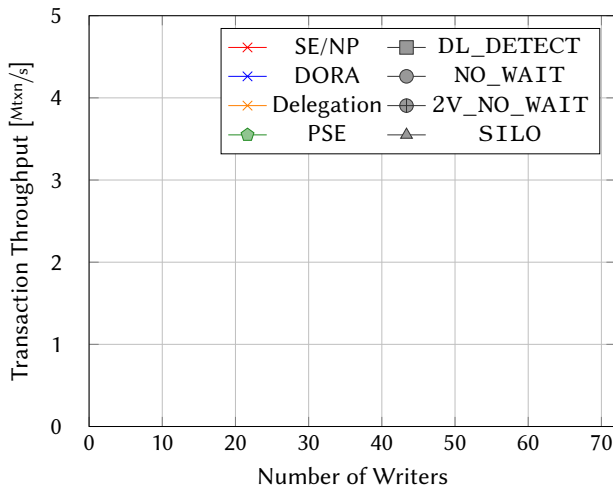
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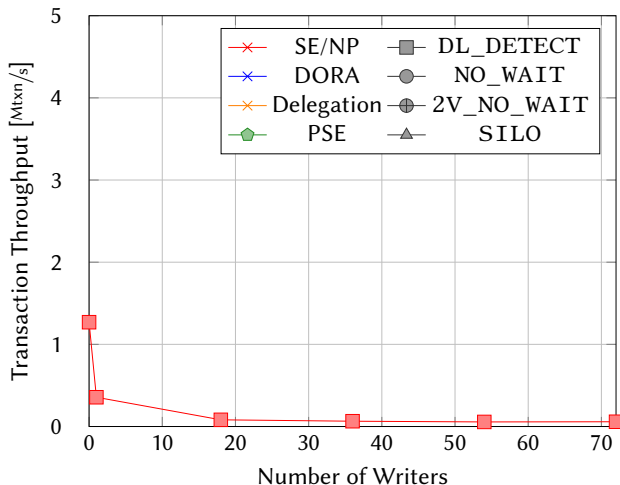
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- ▶  $\diamond$  does not scale well due to partition-unfriendly Zipfian access distribution

## Mixed YCSB ( $\Theta = 0.8$ , 72 Threads)



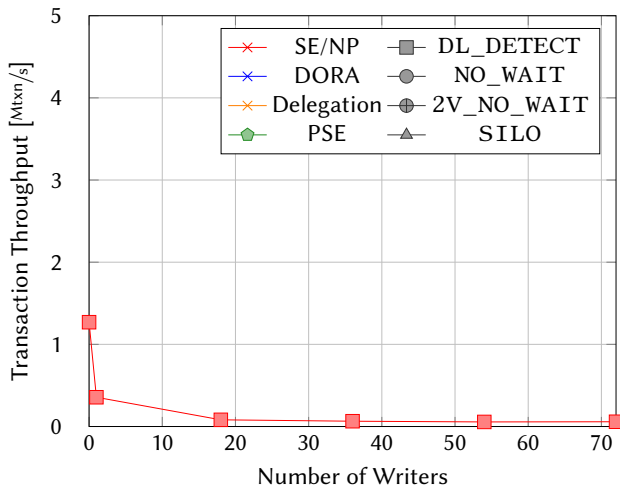
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Observations

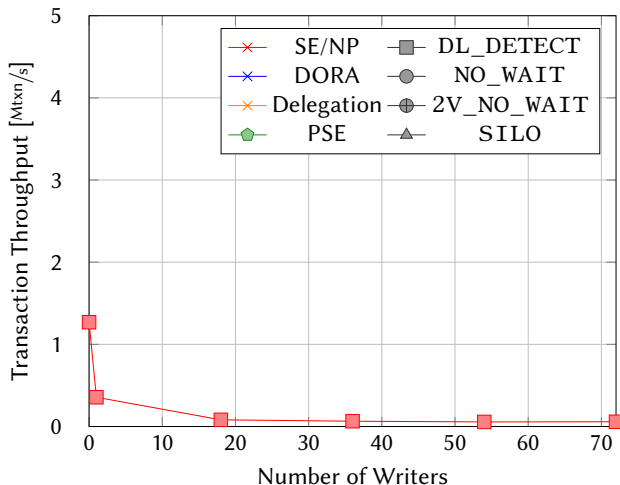
# Mixed YCSB ( $\Theta = 0.8$ , 72 Threads)



## Observations

- DL\_DETECT suffers from latch contention for 72 reading threads

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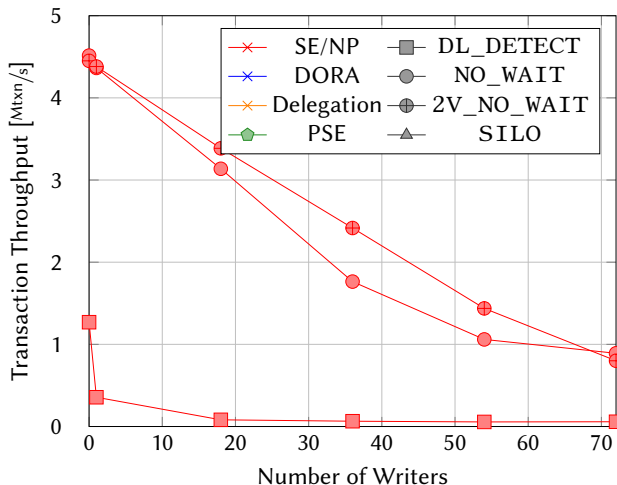


## Observations

- ▶ DL\_DETECT suffers from latch contention for 72 reading threads
- ▶ DL\_DETECT suffers from deadlocks for writing threads



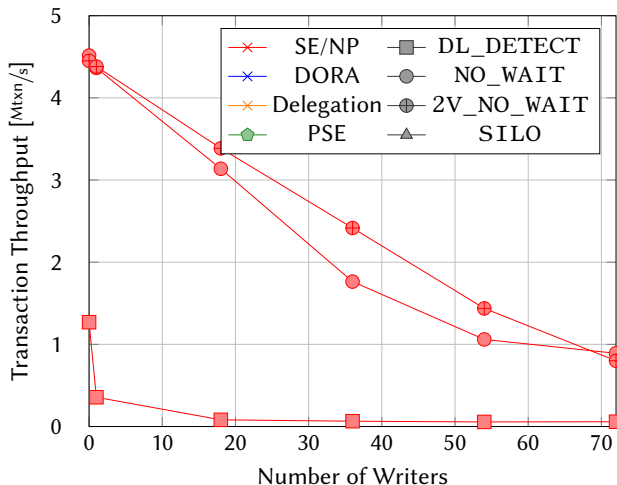
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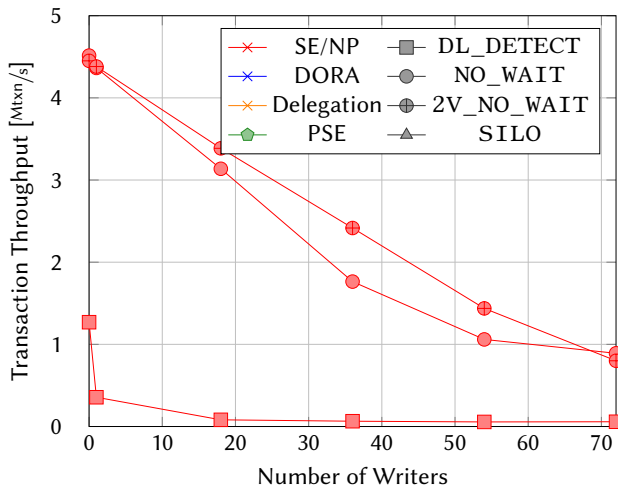
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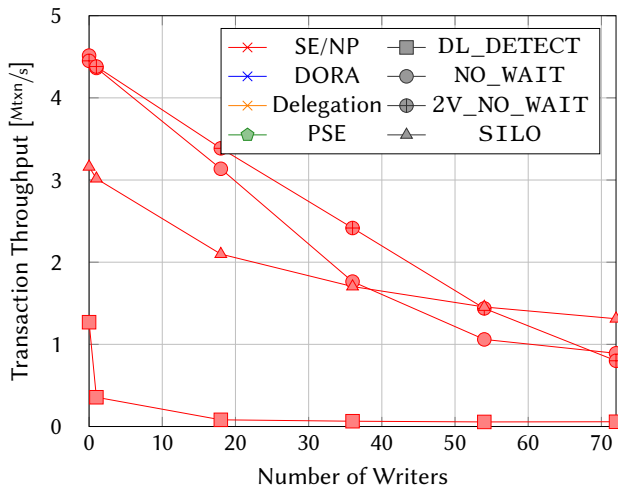
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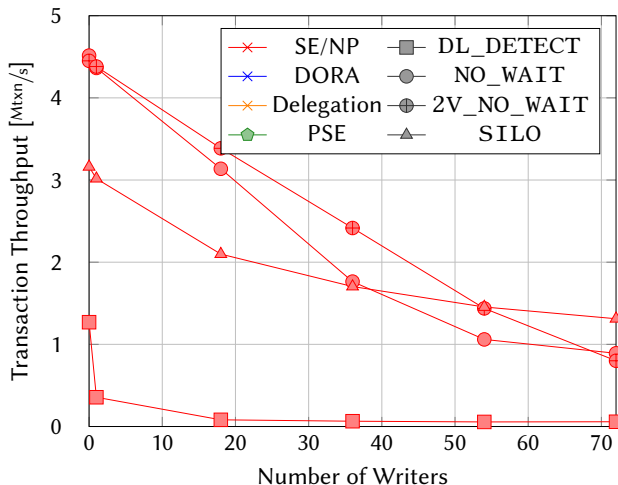
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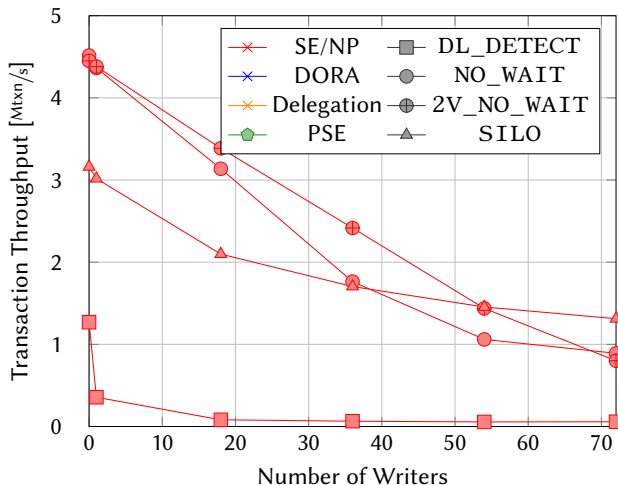
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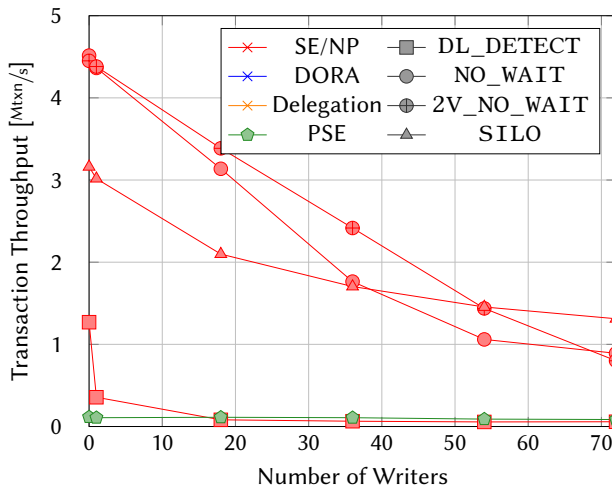
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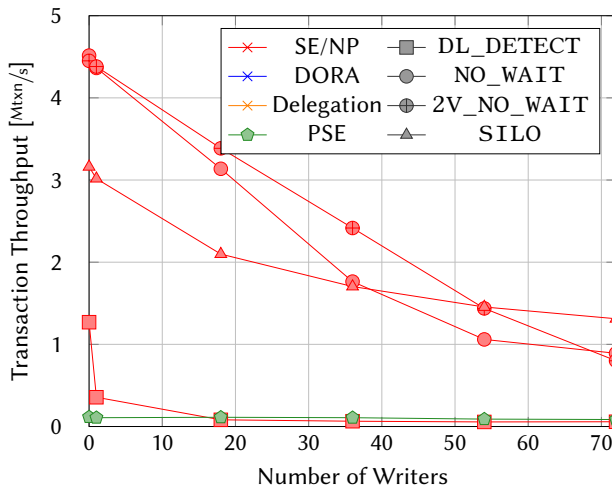
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- ▶  $\blacklozenge$  (and  $\times/\times$ ) does not scale well due to partition-unfriendly Zipfian access distribution



# Conclusion I

- ▶ optimistic concurrency control scales better than pessimistic CC for most workloads
- ▶ optimistic CC suffers from large record sizes
- ▶ atomic operations scale better than latches
- ▶ partitioning makes latches scalable
- ▶ 2PL does not scale for mixed workloads
- ▶ partitioning DB architectures perform bad under partition-unfriendly workloads
- ▶ partitioning DB architectures perform bad under multi-sited transactions

## Conclusion II

- ▶ the transaction throughput decreases by an order of magnitude for update-only instead of read-only workloads (PSE is insensitive to writes)
  - PSE scales best for update-intensive workloads
- ▶ PSE does not scale for read-intensive high-contention workloads with small hot sets
- None of the architectures or CC protocols outperform the others for any workload!
- Every architecture and CC protocol performs very bad for some specific workload!

# Discussion of the Performance Evaluation

- ▶ read-only and update-only workload are not appropriate to evaluate concurrency control algorithms
- ▶ partition-unfriendly workloads are not appropriate to evaluate database architectures that use partitioning
- ▶ neither the microbenchmark nor YCSB are OLTP benchmarks
- The authors did not properly analyze the combination of database architecture and concurrency control algorithm for OLTP workloads!

# References I



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# Any Questions?