# Understanding Transaction Isolation and Serializability 

PostgresConf Silicon Valley
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## About me

- Worked with data storage, processing,
retrieval technologies for 7 years.
- Distributed data pipelines (Spark, Flink)
- Relational databases (mostly PostgreSQL)
- MPP data warehouses (Redshift)
- Data Engineer at Movable Ink.


## MOVABLETNK

- Focus on data platform and infrastructure.
- Second time speaking at a PostgreSQL conference.


## Overview

- Agenda
- Primer on transactions
- Motivating the problem of isolation
- Serializability
- Isolation level: Serializable
- Disclaimers
- I mostly work with databases, not on databases.
- Not focusing on implementation.
- Goal: Build intuition for the foundational concept of serializability.


## Primer on transactions

- A transaction is a unit of work that bundles multiple steps into a single, all-or-nothing operation.
- Transactions have properties that are guaranteed by the database:
- Atomicity: All-or-nothing.
- Consistency: Invariants hold.
- Isolation: Not affected by concurrency.
- Durability: Committed work persists.
- Allow programmers to make simplifying assumptions by adopting transactional model.

The simplifying assumption of Isolation:
Each concurrent transaction has the database all to itself.

## Isolation is easy!

- Suppose Isolation wasn't guaranteed: who cares?
- Concurrent transactions have start and end times that overlap.
- Lots of concurrent transactions don't require isolation:
- Read-only transactions.
- Disjoint read/write sets.
- Single-statement transactions.


## Single-statement transactions

- Simple banking application.
- Alice and Bob share an account with $\$ 1,000$.
- Two concurrent transactions:
- T1: Alice makes a deposit of \$500 into account A.
- T2: Bob checks the balance of account A.
- These are concurrent, but don't need to be isolated.


## Multi-statement transactions

- Two concurrent transactions:
- T1: Alice reads balance $B=\$ 1,000$.
- T2: Bob reads balance $B=\$ 1,000$.
- T2: Bob withdraws $\$ 300$, writes new balance of $(B-\$ 300)=\$ 700$.
- T1: Alice deposits $\$ 500$, writes new balance of $(B+\$ 500)=\$ 1,500$.
- This ordering of T1 and T2 is a schedule.
- Free \$300, way to go Bob!
- This is the "lost update" problem.
- Occurs when two or more transactions attempt to write to the same location.


## Isolation is hard!

- Forget "concurrent", we care if transactions are interleaved.
- Interleaved transactions have statements with alternating orders.
- Lots of "textbook" examples of how things can go wrong.
- Isolation of interleaved transactions is a simplifying assumption!


## Why does this matter?

- Let the database worry about it!
- Two responsibilities of applications:
- Pick an "isolation level".
- Deal with the consequences.
- Basics of isolation theory are important.


## Handling interleaved transactions

- Goal: Run interleaved transactions without associated problems.
- Naive solution: Don't interleave them, run them "in serial".
- T1: Alice reads balance $B=\$ 1,000$.
- T1: Alice deposits $\$ 500$, writes new balance of $(B+\$ 500)=\$ 1,500$.
- T2: Bob reads balance $B=\$ 1,500$.
- T2: Bob withdraws $\$ 300$, writes new balance of $(B-\$ 300)=\$ 1,200$.
- This is another schedule for the same transactions.
- Hopefully we can do better!


## Handling interleaved transactions...better

- Why does executing "in serial" work?
- What if we can replicate the important parts, but still interleave transactions? That's what serializability is for!
- A group of transactions is serializable if it "appears" that the transactions ran sequentially.
- We test for serializability by comparing the interleaved schedule to sequential schedules.
- Let's examine some schedules to see how this works in practice.


## Example: read-only transactions

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## Schedule A (interleaved):

- $\quad(x, y)=(0,1)$


## Example: read-only transactions

## Schedule A (interleaved):

- $(x, y)=(0,1)$
- $r(x=0)$ by T1


## Example: read-only transactions

## Schedule A (interleaved):

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- $r(y=1)$ by T2


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## Example: read-only transactions

Schedule A (interleaved):

- $\quad(x, y)=(0,1)$
- $r(x=0)$ by T1
- $r(y=1)$ by T2
- $r(y=1)$ by T1
- $r(x=0)$ by T2

Schedule B(T1 $\rightarrow$ T2):

- $(x, y)=(0,1)$


## Example: read-only transactions

Schedule A (interleaved):

- $\quad(x, y)=(0,1)$
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Schedule B (T1 $\rightarrow$ T2):

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- $(x, y)=(0,1)$
- $r(x=0)$ by T1
- $r(y=1)$ by T1
- $r(y=1)$ by T2
- $r(x=0)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$


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Schedule B (T1 $\rightarrow$ T2):

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- $r(x=0)$ by T1
- $r(y=1)$ by $T 1$
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- $r(x=0)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$
- $r(y=1)$ by T2


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- $r(x=0)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$
- $r(y=1)$ by $T 2$
- $r(x=0)$ by T2
- $r(x=0)$ by T1
- $r(y=1)$ by $T 1$


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Schedule B (T1 $\rightarrow$ T2):

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- $r(x=0)$ by T1
- $r(y=1)$ by $T 1$
- $r(y=1)$ by T2
- $r(x=0)$ by T2

Schedule C (T2 $\rightarrow \mathrm{T} 1$ ):

- $(x, y)=(0,1)$
- $r(y=1)$ by T2
- $r(x=0)$ by T2
- $r(x=0)$ by T1
- $r(y=1)$ by $T 1$


## Example: disjoint transactions

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## Example: disjoint transactions

## Schedule A (interleaved):

- $(x, y)=(1,1)$
- $r(x=0)$ by T1
- $r(y=1)$ by T2
- $w(x=x+1)$ by $T 1$


## Example: disjoint transactions

## Schedule A (interleaved):

- $(x, y)=(1,2)$
- $r(x=0)$ by T1
- $r(y=1)$ by T2
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## Example: disjoint transactions

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Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$


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Schedule B (T1 $\rightarrow$ T2):

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- $r(y=1)$ by T2
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Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(1,2)$
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2
- $r(x=0)$ by T1
- $w(x=x+1)$ by T1


## Example: dependent transactions

## Example: dependent transactions

## Schedule A (interleaved):

- $(x, y)=(0,1)$


## Example: dependent transactions

## Schedule A (interleaved):

- $(x, y)=(2,1)$
$w(x=2)$ by T1


## Example: dependent transactions

## Schedule A (interleaved):

- $(x, y)=(2,1)$
$w(x=2)$ by $T 1$
- $r(x=2)$ by T2


## Example: dependent transactions

## Schedule A (interleaved):

- $(x, y)=(2,3)$
- $w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1


## Example: dependent transactions

## Schedule A (interleaved):

- $(x, y)=(2,3)$
- $w(x=2)$ by $T 1$
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2


## Example: dependent transactions

## Schedule A (interleaved):

- $(x, y)=(2,4)$
- $w(x=2)$ by T 1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2


## Example: dependent transactions

## Schedule A (interleaved):

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## Example: dependent transactions

## Schedule A (interleaved):

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- $w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule B (T1 $\rightarrow$ T2):

- $(x, y)=(0,1)$


## Example: dependent transactions

Schedule A (interleaved):

- $(x, y)=(2,4)$
$w(x=2)$ by T 1

Schedule B (T1 $\rightarrow$ T2):

- $(x, y)=(2,1)$
- $w(x=2)$ by T1
- $r(x=2)$ by T2
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Schedule A (interleaved):

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Schedule B (T1 $\boldsymbol{\rightarrow T}$ ) :

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Schedule B (T1 $\rightarrow$ T2):

- $(x, y)=(2,3)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2


## Example: dependent transactions

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## Example: dependent transactions

Schedule A (interleaved):

- $(x, y)=(2,4)$
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- $w(y=3)$ by T1
- $r(y=3)$ by $T 2$
- $w(y=y+1)$ by T2

Schedule B(T1 $\boldsymbol{\rightarrow T}$ 2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by $T 2$
- $w(y=y+1)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$


## Example: dependent transactions

Schedule A (interleaved):

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- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by $T 2$
- $w(y=y+1)$ by T2

Schedule B (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$
- $r(x=0)$ by T2


## Example: dependent transactions

Schedule A (interleaved):

- $(x, y)=(2,4)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule B (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2


## Example: dependent transactions

Schedule A (interleaved):

- $(x, y)=(2,4)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by $T 2$
- $w(y=y+1)$ by T2

Schedule B (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(0,2)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2


## Example: dependent transactions

Schedule A (interleaved):

- $(x, y)=(2,4)$
- $w(x=2)$ by T 1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule B(T1 $\boldsymbol{\rightarrow T}$ 2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(2,2)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2
- $w(x=2)$ by T1


## Example: dependent transactions

Schedule A (interleaved):

- $(x, y)=(2,4)$
- $w(x=2)$ by T 1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
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Schedule B (T1 $\rightarrow$ T2):

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- $w(y=y+1)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(2,3)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2
- $w(x=2)$ by T1
- $w(y=3)$ by T1


## Example: dependent transactions

Schedule A (interleaved):

- $(x, y)=(2,4)$
- $w(x=2)$ by T 1
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Schedule B(T1 $\boldsymbol{\rightarrow T}$ 2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(2,3)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2
- $w(x=2)$ by T1
- $w(y=3)$ by T1


## Serializability

- A concurrent schedule is serializable if its effects are equivalent to at least one serial schedule of the the same transactions.
- If a schedule is serializable, then it preserves the correctness of serial execution, while still allowing the efficiency of interleaved execution.
- Serializability is the "gold standard" of transaction isolation.


## Isolation level: Serializable

- Isolation levels are configurable, and determine how the database handles concurrent transactions
- Under the Serializable isolation level, the database guarantees that only serializable schedules of concurrent transactions are allowed to commit.
- Different enforcement mechanisms:
- Two-phase locking (2PL)
- Multi-version concurrency control (MVCC) $\leftarrow$ (what PostgreSQL uses)
- Not implemented by all databases, and rarely the default isolation level.


## Serializable isolation is hard!

- Database will monitor for non-serializable schedules, and abort transactions.
- For long-running transactions, this can be really expensive.
- Requires retry logic in application.
- It's easy to construct non-serializable schedules!


## Example: dependent transactions

Schedule A (interleaved):

- $(x, y)=(2,4)$
- $w(x=2)$ by T 1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule B(T1 $\boldsymbol{\rightarrow T}$ 2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Schedule C (T2 $\rightarrow$ T1):

- $(x, y)=(2,3)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2
- $w(x=2)$ by T1
- $\quad w(y=3)$ by T1


## Example: dependent transactions

## Schedule A (interleaved):

- $(x, y)=(2,4)$
- $w(x=2)$ by T 1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2


## Example: non-serializable schedule

Serializable schedule:

- $(x, y)=(2,4)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Non-serializable schedule:

- $(x, y)=(0,1)$


## Example: non-serializable schedule

Serializable schedule:

- $(x, y)=(2,4)$
$w(x=2)$ by T1

Non-serializable schedule:

- $(x, y)=(2,1)$
- $w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2


## Example: non-serializable schedule

Serializable schedule:

- $(x, y)=(2,4)$
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- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Non-serializable schedule:

- $(x, y)=(2,1)$
- $w(x=2)$ by $T 1$
- $r(x=2)$ by T2


## Example: non-serializable schedule

Serializable schedule:

- $(x, y)=(2,4)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Non-serializable schedule:

- $(x, y)=(2,1)$
- $w(x=2)$ by $T 1$
- $r(x=2)$ by T2
- $r(y=1)$ by T2


## Example: non-serializable schedule

Serializable schedule:

- $(x, y)=(2,4)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $\quad r(y=3)$ by T2
- $w(y=y+1)$ by T2

Non-serializable schedule:

- $(x, y)=(2,3)$
- $w(x=2)$ by $T 1$
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1


## Example: non-serializable schedule

Serializable schedule:

- $(x, y)=(2,4)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $\quad r(y=3)$ by T2
- $w(y=y+1)$ by T2

Non-serializable schedule:

- $(x, y)=(2,2)$
- $w(x=2)$ by T1
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2


## Example: non-serializable schedule

Serializable schedule:

- $(x, y)=(2,4)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $w(y=3)$ by T1
- $\quad r(y=3)$ by T2
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Non-serializable schedule:

- $(x, y)=(2,2)$
- $w(x=2)$ by T1
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Non-serializable schedule:

- $(x, y)=(2,2)$
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- $(x, y)=(2,2)$
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- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(0,1)$


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
$w(x=2)$ by $T 1$

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,1)$
- $w(x=2)$ by T 1
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
- $w(x=2)$ by T1
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,3)$
- $w(x=2)$ by T 1
- $w(y=3)$ by T1


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
- $w(x=2)$ by T1
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,3)$
- $w(x=2)$ by T 1
- $w(y=3)$ by T1
- $r(x=2)$ by T2


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
$w(x=2)$ by $T 1$
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1

Serial schedule (T1 $\rightarrow$ T2):

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- $w(y=3)$ by T1
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- $(x, y)=(2,2)$
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- $(x, y)=(2,4)$
- $w(x=2)$ by T 1
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- $(x, y)=(2,2)$
$w(x=2)$ by $T 1$
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T 1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Serial schedule (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Serial schedule (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$
- $r(x=0)$ by T2


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
$w(x=2)$ by T1
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by $T 1$
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $\quad w(x=2)$ by T 1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Serial schedule (T2 $\rightarrow$ T1):

- $(x, y)=(0,1)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
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Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
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- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Serial schedule (T2 $\rightarrow$ T1):

- $(x, y)=(0,2)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
$w(x=2)$ by $T 1$
- $r(x=2)$ by T2
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- $w(y=3)$ by T1
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $\quad w(x=2)$ by T 1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Serial schedule (T2 $\rightarrow$ T1):

- $(x, y)=(2,2)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2
- $w(x=2)$ by T1


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
$w(x=2)$ by $T 1$
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Serial schedule (T2 $\rightarrow$ T1):

- $(x, y)=(2,3)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2
- $w(x=2)$ by T1
- $w(y=3)$ by T1


## Example: non-serializable schedule

Non-serializable schedule:

- $(x, y)=(2,2)$
$w(x=2)$ by $T 1$
- $r(x=2)$ by T2
- $r(y=1)$ by T2
- $w(y=3)$ by T1
- $w(y=y+1)$ by T2

Serial schedule (T1 $\rightarrow$ T2):

- $(x, y)=(2,4)$
- $w(x=2)$ by T1
- $w(y=3)$ by T1
- $r(x=2)$ by T2
- $r(y=3)$ by T2
- $w(y=y+1)$ by T2

Serial schedule ( $\mathrm{T} 2 \rightarrow \mathrm{~T} 1$ ):

- $(x, y)=(2,3)$
- $r(x=0)$ by T2
- $r(y=1)$ by T2
- $w(y=y+1)$ by T2
- $w(x=2)$ by T1
- $w(y=3)$ by T1


## If not Serializable isolation, then what?

- ANSI SQL standard defines three other isolation levels:
- Read Uncommitted: "Dirty reads" possible.
- Read Committed: "Non-repeatable reads" possible. $\leftarrow$ (Default in PostgreSQL)
- Repeatable Read: "Phantom reads" and "write skew" possible. (Also called "Snapshot Isolation")
- Each allows some non-serializable schedules to commit.
- Important to understand requirements of your application.
- Serializability is isolation "done right". Everything else is sacrificing correctness.


## Best practices for Serializable isolation

- Limit the "surface area" of transactions.
- Write to database objects in a "canonical order".
- Use fine-grained locking tools like SELECT FOR UPDATE.
- Implement retry logic.


## Key takeaways

1. The goal of serializable isolation is to achieve interleaved execution of transactions without sacrificing correctness.
2. You can check the serializability of a schedule by comparing it to serial schedules of the same transactions.
3. Serializability is fundamental to understanding isolation levels.
4. Other isolation levels deviate from serializability in important ways.

Questions?

