



Data Management 09 Transaction Processing

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Announcements/Org

#1 Video Recording

- Link in TUbe & TeachCenter (lectures will be public)
- Optional attendance (independent of COVID)
- Virtual lectures (recorded) until end of the year https://tugraz.webex.com/meet/m.boehm





#2 Exercise Submissions

- Grading Exercise 1: uploaded, Exercise 2: end of May
- Exercise 3 (already published, discussed today) due May 31 + 7 late days

#3 CS Talks

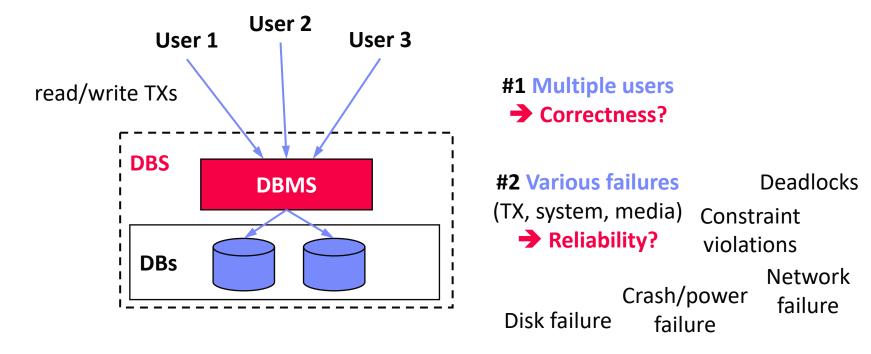
- Eva Galperin (Director of Cybersecurity at EFF):
 Who Deserves Cybersecurity
- Aula Alte Technik; Jun 07, 5.30pm







Transaction (TX) Processing



- Goal: Basic Understanding of Transaction Processing
 - Transaction processing from user perspective
 - Locking and concurrency control to ensure #1 correctness
 - Logging and recovery to ensure #2 reliability







Agenda

- Overview Transaction Processing
- Locking and Concurrency Control
- Logging and Recovery
- Exercise 3: Tuning and Transactions

Additional Literature:

[Jim Gray, Andreas Reuter: Transaction Processing: Concepts and Techniques. Morgan Kaufmann 1993]

[Gerhard Weikum, Gottfried Vossen: Transactional Information Systems: Theory, Algorithms, and the Practice of Concurrency Control and Recovery. **Morgan Kaufmann 2002**]





Overview Transaction Processing





Terminology of Transactions

- Database Transaction
 - A transaction (TX) is a series of steps that brings a database from
 a consistent state into another (not necessarily different) consistent state
 - ACID properties (atomicity, consistency, isolation, durability)

```
#1 Isolation level (defined
 Terminology
                     #2 Start/begin of TX (BOT/BT)
                                                        by addressed anomalies)
   by Example
                          START TRANSACTION ISOLATION LEVEL SERIALIZABLE;
                              UPDATE Account SET Balance=Balance-100
#3 Reads and writes of
                                 WHERE AID = 107;
                              UPDATE Account SET Balance=Balance+100
    data objects
                                 WHERE AID = 999;
                                                                    #6 Savepoints
                              SELECT Balance INTO lbalance
                                                                    (checkpoint for
                                 FROM Account WHERE AID=107;
                                                                    partial rollback)
#4 Abort/rollback TX
                              IF lbalance < 0 THEN</pre>
(unsuccessful end of
                                 ROLLBACK TRANSACTION;
                                                           #5 Commit TX
transaction, EOT/ET)
                              END IF
                                                          (successful end of
                          COMMIT TRANSACTION;
                                                         transaction, EOT/ET)
```





Example OLTP Benchmarks

Online Transaction Processing (OLTP)

- Write-heavy database workloads, primarily with point lookups/accesses
- Applications: financial, commercial, travel, medical, and governmental ops
- Benchmarks: e.g., TPC-C, TPC-E, AuctionMark, SEATS (Airline), Voter

Example TPC-C

- 45% New-Order
- 43% Payment
- 4% Order Status
- 4% Delivery
- 4% Stock Level



[http://www.tpc.org/tpc_do cuments_current_versions/ pdf/tpc-c_v5.11.0.pdf]

New Order Transaction:

- Get records describing a warehouse (tax), customer, district
- 2) Update the district to increment next available order number
- 3) Insert record into Order and NewOrder
- 4) For All Items
 - a) Get item record (and price)
 - b) Get/update stock record
 - c) Insert OrderLine record
- 5) Update total amount of order





ACID Properties

[Theo Härder, Andreas Reuter: Principles of Transaction-Oriented Database Recovery.

ACM Comput. Surv. 15(4) 1983]



Atomicity

- A transaction is executed atomically (completely or not at all)
- If the transaction fails/aborts no changes are made to the database (UNDO)

Consistency

 A successful transaction ensures that all consistency constraints are met (referential integrity, semantic/domain constraints)

Isolation

- Concurrent transactions are executed in isolation of each other
- Appearance of serial transaction execution

Durability

- Guaranteed persistence of all changes made by a successful transaction
- In case of system failures, the database is recoverable (REDO)





Anomalies – Lost Update

TA1 updates points for Exercise 1

```
SELECT Pts INTO :points
FROM Students WHERE Sid=789;
```

```
points += 23.5;
```

UPDATE Students SET Pts=:points
 WHERE Sid=789;
COMMIT TRANSACTION;

TA2 updates points for Exercise 2

SELECT Pts INTO :points
FROM Students WHERE Sid=789;

```
points += 24.0;
```

UPDATE Students SET Pts=:points
 WHERE Sid=789;
COMMIT TRANSACTION;

Time

- Problem: Write-write dependency
- Solution: Exclusive lock on write



Student received 24 instead of 47.5 points

(lost update 23.5)





Anomalies – Dirty Read

TA1 updates points for Exercise 1

UPDATE Students SET Pts=100
WHERE Sid=789;

ROLLBACK TRANSACTION;

TA2 updates points for Exercise 2

SELECT Pts INTO :points
FROM Students WHERE Sid=789;

points += 24.0;

UPDATE Students SET Pts=:points
 WHERE Sid=789;
COMMIT TRANSACTION;

Time



Student received 124 instead of 24 points

- Problem: Write-read dependency
- Solution: Read only committed changes; otherwise, cascading abort





Anomalies – Unrepeatable Read

TA1 updates points for Exercise 1	TA2 runs statistics for Exercise 1		
	<pre>SELECT Pts INTO :p1 FROM Students WHERE Sid=789;</pre>		
START TRANSACTION; UPDATE Students SET Pts=Pts+23.5 WHERE Sid=789; COMMIT TRANSACTION;	•••		
modified value	SELECT Pts INTO :p2 FROM Students WHERE Sid=789; COMMIT TRANSACTION;		
Tir Problem: Read-write dependence	TA2 sees only committed data but analysis corrupted as p1!=p2		

Problem: Read-write dependency

Solution: TA works on consistent snapshot of touched records





Anomalies – Phantom

TA1 inserts missing student	TA2 runs statistics for Exercise 1		
	<pre>SELECT Avg(Pts) INTO :p1 FROM Students WHERE Sid<1000;</pre>		
START TRANSACTION; INSERT INTO Students VALUES (999,, 0); COMMIT TRANSACTION;	•••		
added row (harder to track because new database object)	SELECT Avg(Pts) INTO :p2 FROM Students WHERE Sid<1000; COMMIT TRANSACTION;		
Tiı	TA2 sees only committed data but analysis corrupted as p1!=p2		

 Similar to non-repeatable read but at set level (snapshot of accessed data objects not sufficient)





Isolation Levels

Different Isolation Levels

SET TRANSACTION TSOLATION LEVEL

Tradeoff Isolation vs performance per session/TX

READ COMMITTED

SQL standard requires guarantee against lost updates for all

SQL Standard Isolation Levels

Isolation Level	Lost Update	Dirty Read (P1)	Unrepeatable Read (P2)	Phantom Read (P3)
READ UNCOMMITTED	No*	Yes	Yes	Yes
READ COMMITTED	No*	No	Yes	Yes
REPEATABLE READ	No*	No	No	Yes
[SERIALIZABLE]	No*	No	No	No

Serializable w/ highest guarantees (pseudo-serial execution)

* Lost update potentially w/ different semantics in standard

How can we enforce these isolation levels?

- **User:** set default/transaction isolation level (mixed TX workloads possible)
- **System:** dedicated concurrency control strategies + scheduler



Excursus: A Critique of SQL Isolation Levels

Summary

Criticism: SQL standard isolation levels are ambiguous (strict/broad interpretations)

[Hal Berenson, Philip A. Bernstein, Jim Gray, Jim Melton, Elizabeth J. O'Neil, Patrick E. O'Neil: A Critique of ANSI SQL Isolation Levels. **SIGMOD 1995**]



- Additional anomalies: dirty write, cursor lost update, fuzzy read, read skew, write skew
- Additional isolation levels: cursor stability and snapshot isolation
- Snapshot Isolation (< Serializable)</p>
 - Type of optimistic concurrency control via multi-version concurrency control
 - TXs reads data from a snapshot of committed data when TX started
 - TXs never blocked on reads, other TXs data invisible
 - TX T1 only commits if no other TX wrote the same data items in the time interval of T1

Current Status?

[http://dbmsmusings.blogspot.com/2019/05/ introduction-to-transaction-isolation.html]

 "SQL standard that fails to accurately define database isolation levels and database vendors that attach liberal and non-standard semantics"





Excursus: Isolation Levels in Practice

 Default and Maximum Isolation Levels for "ACID" and "NewSQL" DBs

as of 2013

- 3/18 SERIALIZABLE by default
- 8/18 did not provide
 SFRTAL TZABLE at all



[Peter Bailis, Alan Fekete, Ali Ghodsi, Joseph M. Hellerstein, Ion Stoica: HAT, Not CAP: Towards Highly Available Transactions. HotOS 2013]

Beware of defaults, even though the SQL standard says SERIALIZABLE is the default

Database	Default	Maximum
Actian Ingres 10.0/10S [1]	S	S
Aerospike [2]	RC	RC
Akiban Persistit [3]	SI	SI
Clustrix CLX 4100 [4]	RR	RR
Greenplum 4.1 [8]	RC	S
IBM DB2 10 for z/OS [5]	CS	S
IBM Informix 11.50 [9]	Depends	S
MySQL 5.6 [12]	RR	S
MemSQL 1b [10]	RC	RC
MS SQL Server 2012 [11]	RC	S
NuoDB [13]	CR	CR
Oracle 11g [14]	RC	SI
Oracle Berkeley DB [7]	S	S
Oracle Berkeley DB JE [6]	RR	S
Postgres 9.2.2 [15]	RC	S
SAP HANA [16]	RC	SI
ScaleDB 1.02 [17]	RC	RC
VoltDB [18]	S	S

RC: read committed, RR: repeatable read, SI: snapshot isolation, S: serializability, CS: cursor stability, CR: consistent read





Locking and Concurrency Control

(Consistency and Isolation)





Overview Concurrency Control

Terminology

- Lock: logical synchronization of TXs access to database objects (row, table, etc)
- Latch: physical synchronization of access to shared data structures

#1 Pessimistic Concurrency Control

- Locking schemes (lock-based database scheduler)
- Full serialization of transactions

#2 Optimistic Concurrency Control (OCC)

- Optimistic execution of operations, check of conflicts (validation)
- Optimistic and timestamp-based database schedulers

#3 Mixed Concurrency Control (e.g., PostgreSQL)

due to concurrent update

Might return synchronization errors

ERROR: deadlock detected





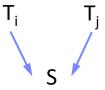
Serializability Theory

Operations of Transaction T_i

- Read and write operations of A by T_i: r_i(A) w_i(A)
- Abort of transaction T_i: a_i (unsuccessful termination of T_i)
- Commit of transaction T_i: c_i (successful termination of T_i)

Schedule S

- Operations of a transaction T_i are executed in order
- Multiple transactions may be executed concurrently
- → Schedule describes the total ordering of operations



Equivalence of Schedules S1 and S2

Read-write, write-read, and write-write dependencies on data object A executed in same order:
(4)

$$r_i(A) <_{S1} w_j(A) \Leftrightarrow r_i(A) <_{S2} w_j(A)$$

$$\mathbf{w_i}(A) <_{S1} r_i(A) \Leftrightarrow \mathbf{w_i}(A) <_{S2} r_i(A)$$

$$w_i(A) <_{S1} w_j(A) \Leftrightarrow w_i(A) <_{S2} w_j(A)$$





Serializability Theory, cont.

Example Serializable Schedules

Serializability Graph (conflict graph)

- Operation dependencies (read-write, write-read, write-write) aggregated
- Nodes: transactions; edges: transaction dependencies
- Transactions are serializable (via topological sort) if the graph is acyclic
- Beware: Serializability Theory considers only successful transactions,
 which disregards anomalies like dirty read that might happen in practice



BREAK (and Test Yourself)

- Given two transactions T₁ and T₂, which pairs of the following three schedules are equivalent? Explain for each pair (S₁-S₂, S₁-S₃, S₂-S₃) why they are equivalent or non-equivalent. [5 points]
 - $T_1 = \{r_1(a), r_1(c), w_1(a), w_1(c)\}$
 - $T_2 = \{r_2(b), w_2(b), r_2(c), w_2(c)\}$

Schedules

- $S_1 = \{r_1(a), r_1(c), w_1(a), w_1(c), r_2(b), w_2(b), r_2(c), w_2(c)\} = \{T_1, T_2\}$
 - \rightarrow S₁ = S₂ (equivalent, because $r_2(b)$, $w_2(b)$ independent of T_1)
- $S_2 = \{r_1(a), r_2(b), r_1(c), w_1(a), w_2(b), w_1(c), r_2(c), w_2(c)\}$

$$\rightarrow$$
 S₁ $\not\equiv$ S₃ (transitive)

- \rightarrow S₂ $\not\equiv$ S₃ (non-equivalent, because $w_1(c)$, $r_2(c)$ of c in different order)
- $S_3 = \{r_1(a), r_2(b), r_1(c), w_1(a), w_2(b), r_2(c), w_1(c), w_2(c)\}$





Locking Schemes

Compatibility of Locks

- X-Lock (exclusive/write lock)
- S-Lock (shared/read lock)

Requested Lock

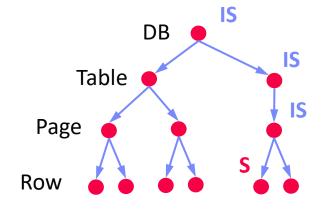
Existing Lock

	None	S	X
S	Yes	Yes	No
X	Yes	No	No

Multi-Granularity Locking

- Hierarchy of DB objects
- Additional intentional IX and IS locks

	None	S	Х	IS	IX
S	Yes	Yes	No	Yes	No
X	Yes	No	No	No	No
IS	Yes	Yes	No	Yes	Yes
IX	Yes	No	No	Yes	Yes



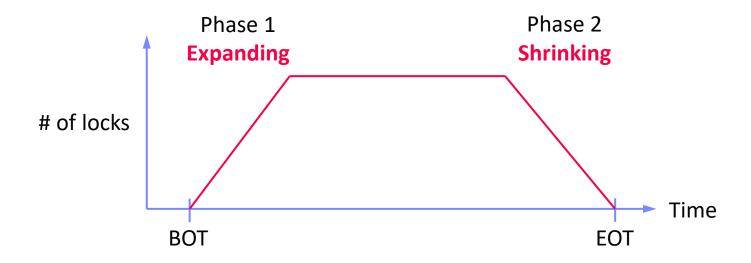




Two-Phase Locking (2PL)

Overview

- 2PL is a concurrency protocol that guarantees SERIALIZABLE
- Expanding phase: acquire locks needed by the TX
- Shrinking phase: release locks acquired by the TX (can only start if all needed locks acquired)





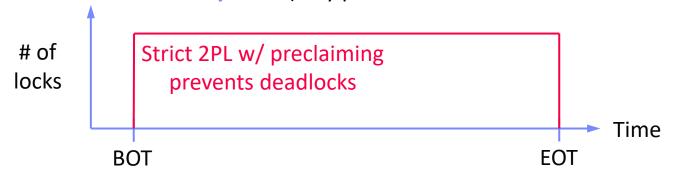


Two-Phase Locking, cont.

- Strict 2PL (S2PL) and Strong Strict 2PL (SS2PL)
 - Problem: Transaction rollback can cause (Dirty Read)
 - Release all X-locks (S2PL) or X/S-locks (SSPL) at end of transaction (EOT)



- Strict 2PL w/ pre-claiming (aka conservative 2PL)
 - Problem: incremental expanding can cause deadlocks for interleaved TXs
 - Pre-claim all necessary locks (only possible if entire TX known + latches)





Deadlocks

Deadlock Scenario

- Deadlocks of concurrent transactions
- Deadlocks happen due to cyclic dependencies without pre-claiming (wait for exclusive locks)

#1 Deadlock Prevention

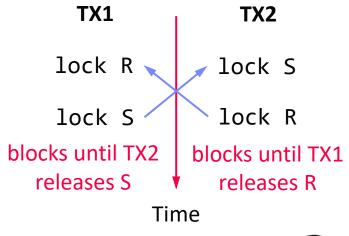
- Guarantee that deadlocks can't happen
- E.g., via pre-claiming (but overhead and not always possible)

#2 Deadlock Avoidance

- Attempts to avoid deadlocks before acquiring locks via timestamps per TX
- Wound-wait (T1 locks something held by T2 → if T1<T2, restart T2)</p>
- Wait-die (T1 locks something held by T2 \rightarrow if T1>T2, abort T1 but keep TS)

#3 Deadlock Detection

- Maintain a wait-for graph of blocked TX (similar to serializability graph)
- Detection of cycles in graph (on timeout) \rightarrow abort one or many TXs









Timestamp Ordering

Great, low overhead scheme if conflicts are rare (no hot spots)

Synchronization Scheme

- Transactions get timestamp (or version number) TS(T_i) at BOT
- Each data object A has readTS(A) and writeTS(A)
- Use timestamp comparison to validate access, otherwise abort
- No locks but latches (physical synchronization)

Read Protocol T_i(A)

- If TS(T_i) >= writeTS(A): allow read, set readTS(A) = max(TS(T_i), readTS(A))
- If TS(T_i) < writeTS(A): abort T_i (older than last modifying TX)

Write Protocol T_i(A)

- If TS(T_j) >= readTS(A) AND TS(T_j) >= writeTS(A): allow write, set writeTS(A)=TS(T_i)
- If TS(T_i) < readTS(A): abort T_i (older than last reading TX)
- If TS(T_i) < writeTS(A): abort T_i (older than last modifying TX)
- BEWARE: Timestamp Ordering requires additional handling of dirty reads, and concurrent transactions in general (e.g., via abort or versions)



Optimistic Concurrency Control (OCC)

Read Phase

- Initial reads from DB, repeated reads and writes into TX-local buffer
- Maintain ReadSet(T_j) and WriteSet(T_j) per transaction T_j
- TX seen as read-only transaction on database

Validation Phase

- Check read/write and write/write conflicts, abort on conflicts
- BOCC (Backward-oriented concurrency control) check all older TXs T_i that finished (EOT) while T_i was running ($EOT(T_i) \ge BOT(T_i)$)
 - Serializable: if $EOT(T_i) < BOT(T_i)$ or $WSet(T_i) \cap RSet(T_i) = \emptyset$
 - Snapshot isolation: $EOT(T_i) < BOT(T_i)$ or $WSet(T_i) \cap WSet(T_i) = \emptyset$
- FOCC (Forward-oriented concurrency control) check running TXs

Write Phase

- Successful TXs: propagate TX-local buffer into the database and log
- Unsuccessful TXs: discard the TX-local buffer





Logging and Recovery

(Atomicity and Durability)





Failure Types and Recovery

- Transaction Failures
 - E.g., Violated integrity constraints, abort
 - → R1-Recovery: partial UNDO of this uncommitted TX
- System Failures (soft crash)
 - E.g., HW or operating system crash, power outage
 - Kills all in-flight transactions, but does not lose persistent data
 - → R2-Reovery: partial REDO of all committed TXs
 - → R3-Recovery: global UNDO of all uncommitted TXs
- Media Failures (hard crash)
 - E.g., disk hard errors (non-restorable)
 - Loses persistent data → need backup data (checkpoint)
 - → R4-Recovery: global REDO of all committed TXs





Database (Transaction) Log

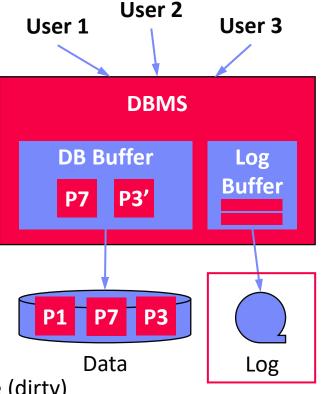
Database Architecture

- Page-oriented storage on disk and in memory (DB buffer)
- Dedicated eviction algorithms
- Modified in-memory pages marked as dirty, flushed by cleaner thread
- Log: append-only TX changes
- Data/log often placed on different devices and periodically archived (backup + truncate)

Write-Ahead Logging (WAL)

- The log records representing changes to some (dirty)
 data page must be on stable storage before the data page (UNDO atomicity)
- Force-log on commit or full buffer (REDO durability)
- Recovery: forward (REDO) and backward (UNDO) processing
- Log sequence number (LSN)

[C. Mohan, Donald J. Haderle, Bruce G. Lindsay, Hamid Pirahesh, Peter M. Schwarz: ARIES: A Transaction Recovery Method Supporting Fine-Granularity Locking and Partial Rollbacks Using Write-Ahead Logging. **TODS 1992**]







Logging Types and Recovery

- #1 Logical (Operation) Logging
 - REDO: log operation (not data) to construct after state
 - UNDO: inverse operations (e.g., increment/decrement), not stored
 - Non-determinism cannot be handled, more flexibility on locking

#2 Physical (Value) Logging

- REDO: log REDO (after) image of record or page
- UNDO: log UNDO (before) image of record or page
- **UPDATE** Emp **SET** Salary=Salary+100 WHERE Dep='R&D';
- Larger space overhead (despite page diff) for set-oriented updates

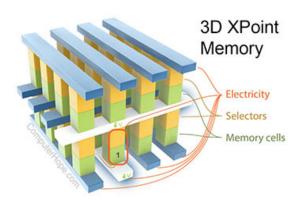
Restart Recovery (ARIES)

- Conceptually: take database checkpoint and replay log since checkpoint
- Operation and value locking; stores log seq. number (LSN, PageID, PrevLSN)
- Phase 1 Analysis: determine winner and loser transactions
- Phase 2 Redo: replay all TXs in order [repeating history] → state at crash
- Phase 3 Undo: replay uncommitted TXs (losers) in reverse order



Excursus: Recovery on Storage Class Memory

- **Background: Storage Class Memory (SCM)**
 - Byte-addressable, persistent memory with higher capacity, but latency close to DRAM
 - **Examples:** Resistive RAM, Magnetic RAM, Phase-Change Memory (e.g., Intel 3D XPoint)



[Credit: https://computerhope.com]

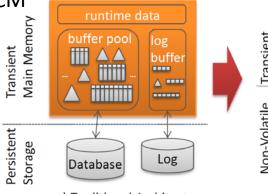
SOFORT: DB Recovery on SCM

Simulated DBMS prototype on SCM

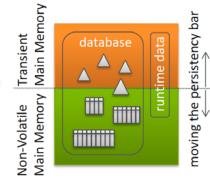
Instant recovery by trading TX throughput vs recovery time (% of data structures on SCM)



[Ismail Oukid, Wolfgang Lehner, Thomas Kissinger, Thomas Willhalm, Peter Bumbulis: Instant Recovery for Main Memory Databases. CIDR 2015







b) SCM-enabled Architecture

- Write-Behind Logging (for hybrid SCM)
 - Update persistent data (SCM) on commit, log change metadata + timestamps → 1.3x

[Joy Arulraj, Matthew Perron, Andrew Pavlo: Write-Behind Logging. PVLDB 2016





Exercise 3: Tuning and Transactions

Published: May 09, 2022

Deadline: May 31, 2022







Task 3.1 Query Rewriting and Tuning

5/25 points

- a) Query Processing (3 points)
 - Q09: Find districts with >1500 inhabitants holding citizenships != 'Austria' as of '2022-01-01'. (return district name, country name, population count).
 - T1/Q09.sql and EXPLAIN plan output T1/Q09.json

b) Indexing (3 points)

Expected Result in Slide Notes

- Create one or many indexes on attributes of your choosing in order to reduce costs of Q09
- Index.sql and EXPLAIN plan output T1/Q09WithIndex.json

```
ANALYZE Participant, Locale;
EXPLAIN (FORMAT JSON) SELECT *
  FROM Participant AS R, Locale AS S
  WHERE R.LID=S.LID;
```

```
"[{"Plan": {
  "Node Type": "Hash Join", ...
  "Startup Cost": 1.25,
  "Total Cost": 2.47

"Plans": [ {...
  "Node Type": "Seq Scan",
  "Relation Name": "participant",
  },{
  "Node Type": "Hash",
  "Plans": [{...
      "Node Type": "Seq Scan",
      Relation Name": "locale",
  }]}]}]
```





Task 3.2 B-Tree Insertion and Deletion

6/25 points

Setup

Generate a sequence S of numbers as follows and materialize as Input.txt

```
SELECT SETSEED(1.0/(SELECT MOD(X,8)+1));
SELECT * FROM generate_series(1,16) ORDER BY random();
```

- B-Tree Insertion (k=2)
 - Draw a B-tree after sequentially inserting S in the defined order

B-Tree Deletion

Draw the B-tree again after deleting the sequence
 [8,14) in order of keys (del 8, del 9, ..., del 13)

 7

 2
 4

 8
 9

 12
 12

a: (b) 7 (c)

b: 2 () 4

c: 8 () 9 () 12

Note: Text Format

node_id: (child_node_id 1) key (child_node_id 2) ... (child_node_id n)





Task 3.3 Transaction Processing

6/25 points

- **a) Setup** (2 points)
 - Create the following tables w/ meaningful data types → TXSetup.sql Vendors(VID, Name, Profit) Products(PID, Name, Price, Stock) Sales(SDate, VID, PID, Quantity)
 - Insert the following tuples

```
(9,'V1', 0.0) into Customer
(1, 'P1', 25, 100) into Products
```

- b) Atomic Transaction (2 points)
 - Write a SQL transaction a placing a new order → TXNewOrder.sql
 - Add order for 10 x product P1, by vendor V1 as of 2022-04-07
 - Modify product stock / vendor profit accordingly

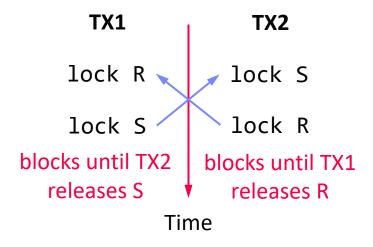




Task 3.3 Transaction Processing, cont.

6/25 points

- c) Deadlock (2 points)
 - Simulate a Deadlock on the populated tables via two TXs and explain how the operations should be interleaved
 - → Deadlock.sql







Task 3.4 Iterator Model and Operators

8/25 points

- a) Operator Implementations (Extra Credit for ICE course 'Databases')
 - Pick your favorite programming language (e.g., Python, Java, C# or C++)
 - open(), next(), close() iterator model (base class)
 - Implement table scan, cmp selection (ge/eq), and hash join
- b) Implement Query Q10 (on new provided data)

```
FROM Districts D,
PopByGender PG
WHERE D.DKey = PG.DKey
AND D.Population >= 30000
AND PG.PopDate = '2022-01-01'

[https://mboehm7.github.io/teaching
/ss22_dbs/DataExport.zip]

./runQuery10.sh ./Districts.csv \
./PopByGender.csv ./out.csv
```



Summary and Q&A

- Summary 09 Transaction Processing
 - Overview transaction processing
 - Locking and concurrency control
 - Logging and recovery
- Summary Part A: Database Systems
 - Databases systems primarily from user perspective
 - End of lectures for Databases (but +1 ECTS if you attend entire course)
- Next Lectures (Part B: Modern Data Management)
 - 10 NoSQL (key-value, document, graph) [May 23]
 - 11 Distributed Storage and Data Analysis [May 30]
 - Jun 06: Whit Monday (Pfingstmontag)
 - 12 Data Stream Processing Systems and Q&A [Jun 13, Patrick]

