## Advanced Database Systems, CSCI-GA.2434-001 New York University, Fall 2022

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Office Hours: On Thursdays at 2 pm by zoom https://nyu.zoom.us/j/93449260732

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## 1 Goals

To study the internals of database systems as an introduction to research and as a basis for rational performance tuning.

The study of internals will concern topics at the intersection of database system, operating system, and distributed computing research and development. Specific to databases is the support of the notion of transaction: a multi-step atomic unit of work that must appear to execute in isolation and in an all-or-nothing manner. The theory and practice of transaction processing is the problem of making this happen efficiently and reliably.

Tuning is the activity of making your database system run faster. The capable tuner must understand the internals and externals of a database system well enough to understand what could be affecting the performance of a database application. We will see that interactions between different levels of the system, e.g., index design and concurrency control, are extremely important, so will require a new optic on database management design as well as introduce new research issues. Our discussion of tuning will range from the hardware to conceptual design, touching on operating systems, transactional subcomponents, index selection, query reformulation, normalization decisions, and the comparative advantage of redundant data. This portion of the course will be heavily sprinkled with case studies from database tuning in biotech, telecommunications, and finance.

Because of my recent research interests, this year will include frequent discussions of "array databases," the extension of relational systems to support ordered data such as time series in finance, network management etc. You will even get to program in our system aquery: https://github.com/josepablocam/aquery2q

## 2 Mechanics

YOU MUST BE ENROLLED IN THIS CLASS TO SIT IN ON THE LEC-TURES.

## 2.1 Texts and Notes

The first text will be used for the first half of the course and the second text in the second half. The notes will be used throughout the course.

• Concurrency Control and Recovery in Database Systems by Bernstein, Hadzilacos, and Goodman, Addison-Wesley, 1987. ISBN 0-201-10715-5 Available for free from Phil Bernstein's website at Microsoft. You can find a copy in this current directory at ccontrol.zip

There are also optional books which are very nicely written:

- Database Tuning : Principles Experiments and Troubleshooting Techniques Dennis Shasha and Philippe Bonnet, Morgan Kaufmann Publishers, June 2002, ISBN 1-55860-753-6, Paper, 464 Pages.
- Transaction Processing: Concepts and Techniques by Jim Gray, Andreas Reuter 1002 pages ; Publisher: Morgan Kaufmann; 1st edition (1993) ISBN: 1558601902
- Transactional Information Systems: Theory, Algorithms, and the Practice of Concurrency Control and Recovery Gerhard Weikum, Gottfried

Vossen The Morgan Kaufmann Series in Data Management Systems, Jim Gray, Series Editor May 2001, 944 pages \$79.95, ISBN 1-55860-508-8 If you want to be a world authority on these topics.

## 2.2 Prerequisites

Fundamental Algorithms I plus Data Base Systems I or equivalent (first 6 chapters of Ullman). If you don't have the database prerequisites, then you may take the course, but you must be responsible for understanding material covered in Database I: a reading knowledge of SQL and basic familiarity with indexes and third normal form.

#### 2.3 Course Requirements

problem sets (35%), project (65%).

LATE HOMEWORKS OR PROJECTS WILL NOT BE ACCEPTED without a note from your physician or from your employer. (We may discuss the solutions on the day you hand in the assignment. That's why I don't want any late homeworks. As for projects, this is a question of fairness.)

On the other hand, collaboration on the problem sets IS allowed. You may work together with one other student and sign both of your names to a single submitted homework. Both of you will receive the grade that the homework merits. So, you may work alone or in a team of two, but no team larger than two. Please choose your partner carefully.

## 3 Syllabus — times are estimated

- 1. Overview of transaction processing, distributed systems, and tuning (1 week)
- 2. Principles of concurrency control for centralized, distributed, and replicated databases. (3 weeks)
- 3. Principles of logging, recovery, and commit protocols. (3 weeks)
- 4. Database Tuning (7 weeks)

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Tuning principles.
Hardware, operating system, and transaction subsystem
Transaction Chopping
Index tuning
Tuning relational systems
Tuning data warehouses
Troubleshooting
Case Studies from Wall Street and Elsewhere
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5. Special topics: array databases, special indexes, time series.

## 4 Project

Your project is due on December 2, 2022. It will be graded by the last class at which point you will have nothing more to do. You have three possible projects:

- 1. Distributed replicated concurrency control and recovery. You may do this in a team of two.
- 2. An experimental study of tuning issues on a real system.
- 3. A paper on the topics I invite.

## 4.1 Possibility 1 — Replicated Concurrency Control and Recovery (RepCRec for short)

In groups of 1 or 2, you will implement a distributed database, complete with multiversion concurrency control, deadlock detection, replication, and failure recovery. If you do this project, you will have a deep insight into the design of a distributed system. Normally, this is a multi-year, multi-person effort, but it's doable because the database is tiny.

#### Data

The data consists of 20 distinct variables x1, ..., x20 (the numbers between 1 and 20 will be referred to as indexes below). There are 10 sites numbered 1 to 10. A copy is indicated by a dot. Thus, x6.2 is the copy of variable x6 at site 2. The odd indexed variables are at one site each (i.e. 1 + (index number mod 10) ). For example, x3 and x13 are both at site 4. Even indexed variables are at all sites. Each variable xi is initialized to the value 10i (10 times i). Each site has an independent lock table. If that site fails, the lock table is erased.

#### Algorithms to use

Please implement the available copies approach to replication using strict two phase locking (using read and write locks) at each site and validation at commit time. A transaction may read a variable and later write that same variable (though then its lock will have to be promoted) as well as others. Please use the version of the algorithm specified in my notes rather than in the textbook, just for consistency. Note that available copies allows writes and commits to go to just the available sites, so if site A is down, its last committed value of x may be different from site B which is up.

At each variable locks are acquired in a first-come first-serve fashion, e.g. if requests arrive in the order R(T1,x), R(T2,x), W(T3,x,73), R(T4,x) then, assuming no transaction aborts, first T1 and T2 will share read locks on x, then T3 will obtain a write lock on x and then T4 a read lock on x. Note that T4 doesn't skip in front of T3, as that might result in starvation for writes. Note also that the blocking (waits-for) graph will have edges from T3 to T2 from T3 to T1 and from T4 to T3.

In the case of requests arriving in the order R(T1,x), R(T2,x), W(T1,x,73), there will be a waits-for edge from T1 to T2 because T1 is attempting to promote its lock from read to write, but cannot do so until T2 releases its lock.

By contrast, in the case W(T1,x,15), R(T2,x), R(T1,x), there will be a waits-for edge from T2 to T1 but the R(T1,x) will not need to wait for a lock because T1 already has a write-lock which is sufficient for the read. The same would hold in this case: W(T1,x,15), R(T2,x), R(T1,x), W(T1,x,41).

To prevent needless deadlocks, a write of a replicated variable should not acquire a lock on any site s unless it can acquire a lock on all the sites containing that variable.

Detect deadlocks using cycle detection and abort the youngest transaction in the cycle. This implies that your system must keep track of the transaction time of any transaction holding a lock. (We will ensure that no two transactions will have the same age.) There is never a need to restart an aborted transaction. That is the job of the application (and is often done incorrectly). Deadlock detection need not happen at every tick. When it does, it should happen at the beginning of the tick. When deadlock detection happens, it should be complete (i.e. find all the deadlocks).

Read-only transactions should use multiversion read consistency. Here are some implementation notes that may be helpful. In which situations can a read-only transaction read RO an item xi?

- 1. If xi is not replicated and the site holding xi is up, then the read-only transaction RO can read the value of xi as of the time that RO begins. Because that is the only site that knows about xi.
- 2. If xi is replicated then RO can read xi from site s if xi was committed at s by some transaction T' before RO began and s was up all the time between the time when xi was commited and RO began. In that case RO can read the version that T' wrote. If every site containing xi failed between the last commit recorded on that site and the time RO began, then RO can abort. (Here is an example showing why: Suppose x has copies on sites A and B. T1 commits x on site A, then site A fails, then site A recovers, then RO begins. In the replicated case, site B might have received a write on x, but at the time of the read site B might be down, so RO cannot be sure of the value of x before RO begins.)

Implementation: for every version of xi, on each site s, record when that version was committed. Also, the TM will record the failure history of every site.

#### Examples:

- Sites 2-10 are down at 12 noon Site 1 commits a transaction T that writes x2 at 1 PM At 1:30 pm a read-only transaction begins. Site 1 has been up since transaction T commits its update to x2 and the beginning of the read-only transaction. No other transaction wrote x2 in the meantime. Site 1 fails here at 2 PM. The read-only transaction can still use the values it had from site 1.
- Sites 2-10 are down at 12 noon Site 1 commits a transaction that writes x2 at 1 PM Site 1 fails here At 2 pm a read-only transaction begins. It can abort because no site has been up since a transaction commits its update to x2 and the beginning of the read-only transaction.

#### Test Specification

When we test your software, input instructions come from a file or the standard input, output goes to standard out. (That means your algorithms may not look ahead in the input.) Each line will have at most a single instruction from one transaction or a fail, recover, dump, end, etc. Some of these operations may be blocked due to conflicting locks. We will ensure that when a transaction is waiting, it will not receive another operation.

If an operation for T1 is waiting for a lock held by T2, then when T2 commits, the operation for T1 proceeds if there is no other lock request ahead of it. Lock acquisition is first come first served but several transactions may hold read locks on the same item. As illustrated above, if x is currently read-locked by T1 and there is no waiting list and T2 requests a read lock on x, then T2 can get it. However, if x is currently read-locked by T1 and T3 is waiting for a write lock on x and T2 subsequently requests a read lock on x, then T2 must wait for T3 either to be aborted or to complete its possesion of x; that is, T2 cannot skip T3.

The execution file has the following format:

begin(T1) says that T1 begins

beginRO(T3) says that T3 begins and is read-only

R(T1, x4) says transaction 1 wishes to read x4 (provided it can get the locks or provided it doesn't need the locks (if T1 is a read-only transaction)). It should read any up (i.e. alive) copy and return the current value (or the value when T1 started for read-only transaction). It should print that value in the format

x4: 5

on one line by itself.

W(T1, x6, v) says transaction 1 wishes to write all available copies of x6 (provided it can get the locks on available copies) with the value v. So, T1 can write to x6 only when T1 has locks on all sites that are up and that contain x6. If a write from T1 can get some locks but not all, then it is an implementation option whether T1 should release the locks it has or not. However, for purposes of clarity we will say that T1 should release those locks.

dump() prints out the committed values of all copies of all variables at all sites, sorted per site with all values per site in ascending order by variable name, e.g.

site  $1 - x^2$ : 6, x3: 2, ... x20: 3 ... site  $10 - x^2$ : 14, .... x8: 12, x9: 7, ... x20: 3 This includes sites that are down (which of course should not reflect writes when they are down).

in one line.

one line per site.

end(T1) causes your system to report whether T1 can commit in the format

T1 commits

or

T1 aborts

fail(6) says site 6 fails. (This is not issued by a transaction, but is just an event that the tester will execute.)

recover(7) says site 7 recovers. (Again, a tester-caused event) We discuss this further below.

A newline in the input means time advances by one. There will be one instruction per line.

Other events to be printed out:

(i) when a transaction commits, the name of the transaction;

(ii) when a transaction aborts, the name of the transaction;

(iii) which sites are affected by a write (based on which sites are up);

(iv) every time a transaction waits because of a lock conflict

(v) every time a transaction waits because a site is down (e.g., waiting for an unreplicated item on a failed site).

Example (partial script with six steps in which transactions T1 commits, and one of T3 and T4 may commit)

begin(T1) begin(T2) begin(T3) W(T1, x1,5) W(T3, x2,32) W(T2, x1,17) // will cause T2 to wait, but the write will go ahead after T1 commits end(T1) begin(T4) W(T4, x4,35) W(T3, x5,21) W(T4,x2,21) W(T3,x4,23) // T4 will abort because it's younger

#### Design

Your program should consist of two parts: a single transaction manager that translates read and write requests on variables to read and write requests on copies using the available copy algorithm described in the notes. The transaction manager never fails. (Having a single global transaction manager that never fails is a simplification of reality, but it is not too hard to get rid of that assumption by using a shared disk configuration. For this project, the transaction manager is also fulfilling the role of a broker which routes requests and knows the up/down status of each site.)

If the TM requests a read on a replicated data item x for read-write transaction T and cannot get it due to failure, the TM should try another site (all in the same step). If no relevant site is available, then T must wait. This applies to read-only transactions as well which, for each replicated data item x, must have access to the version of x that was the last to commit before T began. (As mentioned above, if every site failed after a commit to x but before T began, then the read-only transaction should abort.) T may also have to wait for conflicting locks. Thus the TM may accumulate an input command for T and will try it on the next tick (time moment). As mentioned above, while T is blocked (whether waiting for a lock to be released or a failure to be cleared), our test files will emit no new operations for T.

If a site (also known as a data manager or DM) fails and recovers, the DM would normally decide which in-flight transactions to commit (perhaps by asking the TM about transactions that the DM holds pre-committed but not yet committed), but this is unnecessary in this project, since, in the simulation model, commits are atomic with respect to failures (i.e., all writes of a committing transaction apply or none do). Upon recovery of a site s, all non-replicated variables are available for reads and writes. Regarding replicated variables, the site makes them available for writing, but not reading. In fact, a read for a replicated variable x will not be allowed at a recovered site until a committed write to x takes place on that site (see lecture notes on recovery when using the available copies algorithm).

During execution, your program should say which transactions commit and which abort and why. For debugging purposes you should implement (for your own sake) a command like querystate() which will give the state of each DM and the TM as well as the data distribution and data values. Finally, each read that occurs should show the value read.

If a transaction T accesses an item (really accesses it, not just request a lock) at a site and the site then fails, then T should continue to execute and then abort only at its commit time (unless T is aborted earlier due to deadlock).

#### Output of your program:

Your program output will execute each test case starting with the initial state of the database. Your output should contain: (i) the committed state of the data items at each dump.

(ii) which value each read returns. (iii) which transactions commit and which abort.

#### 4.1.1 Running the programming project

If our very able graders have system style problems with your project, they may contact you to work with them to resolve them. You will not be permitted to hand in a new version of the project, but you can ask the graders to change a few things to get the project to run. If you do have such a meeting, you will have 15-30 minutes to present. The test should take a few minutes. The only times tests take longer are when the software is insufficiently portable. The version you send in should run on departmental servers or on your laptop. Reprozip will help.

The grader will ask you for a design document that explains the structure of the code (see more below). The grader will also take a copy of your source code for evaluation of its structure (and, alas, to check for plagiarism).

#### 4.1.2 Some Questions and Answers

1. When does the transaction manager learn about failed sites?

Answer: immediately upon the tick which has say fail(3)

2. When a transaction Tj that has written v into xi aborts, what should the value of xi be?

Answer: The value before Tj started. Before-image of xi.

- 3. If a transaction is waiting, then we will not send new operations or an end for that transaction.
- 4. The reason a transaction Ti must abort when it accessed a site s that failed between that access and the end time of Ti is that the site s would have lost the lock information that says that Ti held a lock on s.
- 5. When a transaction aborts due to deadlock or failure, there will be no end statement from that statement and no other operation from that transaction.
- 6. If a read-only transaction (using multiversion read consistency) must read from a site and that site is down, the read-only transaction will wait.
- 7. We will never cause all sites to fail.

#### 4.1.3 Documentation and Code Structure

Because this class is meant to fulfill the large-scale programming project course requirement, please give some thought to design and structure. The design document submitted in late October should include all the major functions, their inputs, outputs and side effects. If you are working in a team, the author of the function should also be listed. That is, we should see the major components, relationships between the components, and communication between components. This should work recursively within components. A figure showing interconnections and no more than three pages of text would be helpful.

The submitted code similarly should include as a header: the author (if you are working in a team of two), the date, the general description of the function, the inputs, the outputs, and the side effects.

In addition, you should provide a few testing scripts in plain text to the grader in the format above and say what you believe will happen in each test.

Finally, you will use reprozip and virtual machines to make your project reproducible even across different architectures for all time. Simply using portable Java or python or whatever is not the same. Documentation and packaging using reprozip and doing so correctly constitutes roughly 20% of the project grade.

## 4.2 Submission Instructions

- Sign in to https://brightspace.nyu.edu with your NYU NetID and password.

- Under the 'My Courses' section, select the course 'Advanced Database Systems CSCI-G  $\ensuremath{\mathsf{CSCI-G}}$ 

- Navigate to the 'Assignment' tab.

- Please submit your source code as text and your executable using reprozip/docker.

#### 4.3 Possibility 2 — Benchmarking/Tuning Project

Use everything you learn in class or from the tuning book and try to improve a real system that is available to you. Use substantial relations, e.g. 100 million rows and up. Specify the database management system, operating system, hardware platform including disks, memory size, and processor. For each attempted improvement, specify what happened to the system (whether it became faster or slower) and try to form a hypothesis as to why that occurred.

You should be prepared to discuss your project with me or potentially in front of the class.

## 4.4 Possibility 3 — Paper

This year, I invite papers on two topics:

- 1. A survey of the novel uses and challenges of transactional memory.
- 2. A survey of languages for time series databases.

If you want to write a paper though, it's a one person job and we need to discuss beforehand. Your model for a survey paper should be ACM Computing Surveys. Also, you should create four non-trivial problems based on the material you read and give the solutions.

## 5 Project Schedule — depends on project you choose

## 5.1 Schedule for Programming Project

Last class in September: Letter of intent that you are going to do programming project. Partner chosen if any. Please send this to me only if you want to do something other than the replicated concurrency control project. Otherwise, please send to ms12418@nyu.edu

Last class in October: design document. Please submit this document through brightspace as for the final submission.

Project is due on December 2, 2022 at 4:30 pm. Please submit your project to NYU Classes. Between December 2 and December 8, your project will be graded. You will make an appointment that week with the graders. We will figure out a randomized way to do this.

# 5.2 Schedule for Benchmarking/Tuning Project and for Scalaris/SQLite project

Last class in September: project outline (should fit on one page). Tuning problem you intend to address. System you plan to use and experimental question you plan to ask. This must be approved by me (Shasha) before you go on.

Last Class in October: status report. How are you doing? Any show-stoppers.

December 2, 2022: final report/demo to me.