Lecture 33 — Parallel Databases

Jeff Zarnett jzarnett@uwaterloo.ca

Department of Electrical and Computer Engineering University of Waterloo

September 12, 2023

ECE 356 Fall 2025 1/29

Concurrency and Parallelism

The first way that we could achieve parallelism or concurrency is based on how we decide to implement the server.

If each incoming transaction to be processes is assigned a thread, then we could have *n* worker threads and a transaction gets picked up by a worker.

Keeping in mind that locking and coordination are needed, but the maximum theoretical speedup is limited by the number of processors.

Or a pipeline architecture?

ECE 356 Fall 2025 2/29

I/O Parallelism

If the database is aware of the various disks available in the system, we can speed up performance via I/O parallelism.

If we need to read some blocks from disk, we could let multiple requests run in parallel.

If there are three blocks we need, and three disks, we could get all three results at (roughly) the same time.

ECE 356 Fall 2025 3/29

I/O Parallelism: Disk Partitioning

We'll consider three basic partitioning strategies assuming we have *n* disks:

- Round-Robin
- Hash Partitioning
- Range Partitioning

ECE 356 Fall 2025 4/29

I/O Parallelism

There are three operations we consider likely to happen:

(1) Scanning the entire relation;

(2) Locating a tuple with some specific attribute equal to a certain value, and

(3) Range queries (where we have a range of acceptable values of the attribute).

ECE 356 Fall 2025 5/29

ound Robin

Round Robin is good for when we have to read the whole relation.

But no advantage is gained when a specific query or range query is done as we have to search over everything anyway.

ECE 356 Fall 2025 6/29

Hash Partitioning

Hash partitioning is advantageous when we do specific queries.

This is only beneficial, of course, if the items are partitioned based on that particular attribute.

In theory it search time could be reduced to 1/n of the original time.

Otherwise no advantage is gained over round robin.

This is also not especially suitable for range queries.

ECE 356 Fall 2025 7/29

Range Partitioning

Range partitioning is good for specific as well as range queries on a particular attribute.

A nice advantage of this is if we know that a query will be only on one disk, it's possible to send the query to just one disk.

The other disks are available to perform other operations.

ECE 356 Fall 2025 8/29

When the relation is spread over several disks, if things are not spread out evenly, then there is skew in the distribution of tuples.

This can be because of either attribute-value skew: city = "Toronto" being much more common than "Yellowknife", for example.

Or it can be because of the way the partitioning function works even if values are evenly distributed.

ECE 356 Fall 2025 9/29

Balancing Skew

To balance this out, one suggested strategy is the histogram approach.

Suppose there are, for example, 5 disks and 100 possible values.

The simple range approach is 20 values in each partition.

If the data has a normal distribution however... Rather than 20 values per disk we would try to cut it so there are about 20% of tuples in each partition.

ECE 356 Fall 2025 10/29

Slice and Dice!

An alternative approach is to cut it all up more. More? Suppose there are *n* processors and the work is divided up into 5*n* ranges.

If the data is evenly distributed, each CPU will do 5 chunks.

If the work is unevenly divided, however, some CPUs will do a smaller number of large chunks.

Others will do a large number of smaller chunks and some will be in between.

The uneven distribution of values is then spread out over several processors.

ECE 356 Fall 2025 11/29

Realistic? Maybe...

Admittedly, in a single server database this is not likely to happen even when there are multiple disks.

Usually the disks are arranged in a RAID array and that is done outside the purview of the database server...

So why did we learn about this? Because it will be useful in a distributed database.

ECE 356 Fall 2025 12/29

Intraquery Parallelism

The subject of inter-query parallelism is actually somewhat boring and redundant as it is just the same as previous discussions of parallelism and concurrency.

Lock shared data, you know the drill.

But there are numerous opportunities to get parallelism inside a single query, and it is a much more interesting subject.

We'll consider two things: intraoperation parallelism and interoperation parallelism.

ECE 356 Fall 2025 13/29

Intraoperation Parallelism

When we have a single operation that can be, in some way, divided up (partitioned) it is a good candidate for intraoperation parallelism.

- Searching
- Sorting
- Calculation

ECE 356 Fall 2025 14/29

Partitioned Join

To give a specific example, we will look at parallel join, in particular a partitioned join.

Let's assume we want to join relations *r* and *s*.

If the join is an equality condition such as one attribute in *r* equalling another in *s* then we can divide this up to multiple processors.

ECE 356 Fall 2025 15/29

Partitioned Join

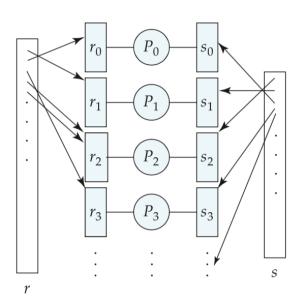
If there are n processors we could divide each relation into n pieces and send each processor P_i its piece of r and s.

That processor then compute its part.

These parts are then combined at the end to produce the correct data.

ECE 356 Fall 2025 16/29

Partitioned Parallel Join



ECE 356 Fall 2025 17/29

Fragment and Replicate

Partitioning is not suitable for all types of joins, however; because we put in the restriction that there is a join on an equality condition.

A more general approach is the asymmetric fragment-and-replicate join.

ECE 356 Fall 2025 18/29

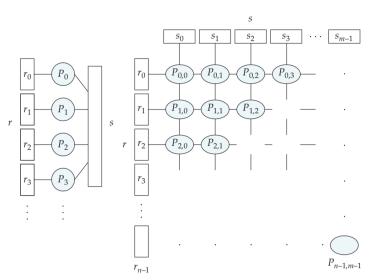
Fragment and Replicate

- Partition one of the relations (*r*) and hand out the partitions to the processors.
- 2 Send copies of the whole other relation (s) to every processor.
- **3** Each processor computers its join (through whatever method) and the data is recombined.

It would be preferable to choose the smaller relation to be the one that is copied.

ECE 356 Fall 2025 19 / 29

Fragment and Replicate



(a) Asymmetric fragment and replicate

(b) Fragment and replicate

ECE 356 Fall 2025 20 / 29

Parallelism Roundup

A quick rundown on how parallelism affects operations other than selection and join:

- Duplicate Elimination
- Projection
- Aggregation

ECE 356 Fall 2025 21/29

Interoperation Parallelism

We already discussed the idea of pipelining.

This, unfortunately, does not scale well: a pipeline with 4 stages cannot really take advantage of 16 processors.

The next way that we can use parallelism between various operations.

If we are to join four tables, we could compute two pairs of joins in parallel and then combine them in a third operation for the last step.

ECE 356 Fall 2025 22 / 29

Change is Hard

We would normally expect that when changes are made to the database schema such as data migration, the database is taken temporarily off the line.

Sometimes we don't have the option to take things offline for an extended period.

ECE 356 Fall 2025 23/29

Change is Hard

If a new index is to be constructed, for example, we can't just lock the relation in shared mode.

We have to allow insertion, deletion, and update while the index is being added.

This is usually done by just keeping track of all the changes as they come in.

Then, adjust the index when generated to account for all the changes that happened while it was being built.

ECE 356 Fall 2025 24/29

Parallel Database Architecture

Now if we have a parallel database, we should consider the architecture. how it is set up.

We will consider three possible options: shared memory, shared disk, and shared nothing.

ECE 356 Fall 2025 25/29

Shared Memory

This is our typical multicore or multi-CPU architecture we have likely already become familiar with when discussing concurrency.

Memory is shared between the various processors and they have a common set of disks.

There is no redundancy, however, as it is all wrapped up into one machine.

This means that communication can take place between the threads using shared memory.

ECE 356 Fall 2025 26 / 29

Shared Disk

In this architecture all processors can access disks directly, but every processor has its own memory.

This has some degree of redundancy as we might be able to keep working if something goes wrong at one of the systems.

If one of the systems crashes, every system can continue executing without any problem, at some reduced performance level.

The tradeoff is that communication has to take place using the disk.

ECE 356 Fall 2025 27/29

Shared Nothing

In a shared nothing system, well, it's exactly what it sounds like: nothing is shared between the systems.

If they wish to communicate, then communication takes place over the network.

This means the systems are as redundant as possible: if any one system goes down we might be able to carry on.

ECE 356 Fall 2025 28 / 29

Shared Nothing

This sort of architecture isn't so much parallel as it actually is distributed...

ECE 356 Fall 2025 29 / 29