ABSTRACT
We implemented a distributed transaction processing system where data is partitioned and mapped to different shards. All shards are replicated to enhance the availability and durability of the system. The database model is simple key-value store inherited from Lab 4. The objectives of the project are 1) to process transaction using two phase commit and guarantee atomic execution, 2) to persistently store data and server status on disk to tolerate server failures. The requests of a transaction consist of GET, PUT, and ADD. To simplify implementation, the only scenario of aborting a transaction is that it has an add request that results a negative value. Firstly, we implemented a coarse-grained locking scheme where a transaction locks the groups it touches. In order to achieve better performance gains, we later refined our system with a fine-grained locking scheme where a transaction locks the keys it touches. Secondly, we implemented test cases to verify the correctness of the system under different failure scenarios including unreliable networks and server failures. Lastly we benchmark our system with synthetic workloads that varies with parameters like distribution of number of groups a transaction accesses, read/write ratios of a transaction, number of clients and so on.

1. IMPLEMENTATION DETAILS
Our persistent key value store is constructed such that each key of type string is mapped to a value of type integer. We confined the type of values to integer to allow arithmetic operations on the key-value pairs. The data of our systems are partitioned into different shards. A group of servers are responsible for a distinct subset of shards, and all the data within a group are replicated. Our system supports atomic transactions, where a transaction is an ordered group of requests such as puts, gets and etc. We also support persistency, where all committed transactions are recorded to disk. Our persistent key-value store can model applications like an inventory management system or a bank account system.

1.1 Transaction Support
Our system supports transaction consisting of requests of PUTs, GETs, and ADDs.

- a PUT updates the value associated with the key
- a GET returns the value associated with the key
- an ADD adds a value (could be negative) to the previous value associated with the key

In particularly, the transaction support of our system ensures the following properties.
Consistency Our system allows multiple clients to send transactions concurrently. Specifically, our database enforce sequential consistency such that the effects of concurrent transactions appears as some sequential order. To enable sequential consistency, the client should lock the groups that a transaction touches before execution. And since we will have multiple servers within each group, we will ensure consistency inside the group with Paxos, to guarantee a global ordering of the operations within a group.

Atomicity The transactions need also be atomic, i.e. either all of the requests of the transaction are executed or none are executed. We ensure atomicity of the transaction with two phase commit protocol.

Persistency All the effects of a committed transaction on key value store are written on disk.

Fault-tolerant Our system ensures the transaction processing is fault-tolerant. On the server sides, the Paxos implementation in Lab 3 has already ensured tolerance under network failures. In our project, we will modified Lab 3 such that Paxos can also handle server crashes. On client side, we will also record its transaction processing status on disk, so that after crash, the client will know at which point it was processing the transaction.

1.1.1 Persistent Paxos
We made the Paxos persistent so that it can tolerate server crash.
Whenever any of the propose number(n_p), accepted number(n_a) and accepted value(v_a) is modified, all of them are written to the file system with the file name in the following format: SERVERNAME_INS#_txt.

When the Paxos log is truncated, the corresponding files are also deleted. When a server reboots after failure, it will reconstruct the Paxos instances by reading from the file system. We use a lazy reconstruction approach where an instance is read and reconstructed only when it is touched.

Moreover, we added a new function call, Poll(seq int), to the Paxos, to peek the status of a Paxo instance at some
1.1.2 Locking Scheme

We use locking to ensure sequential consistency of concurrent transactions. Transactions are initiated at the client side. A client breaks down a transaction, and sends the requests to a server in the corresponding group. Upon receiving the requests, the server will start a Paxos instance to agree on the transaction. This Paxos instance also does the proper locking for the transaction to guarantee mutual exclusive.

To avoid deadlocks, the clients should send requests to the groups sequentially following a fixed order, such as the order of increasing group IDs. Groups with larger gids are locked only after groups with smaller gids are locked. This prevents the scenario where two transactions each locks a group and requests to lock the other's group.

In our implementation, locking can happen in two different granularity, per-group locking and per-row locking.

In per-group locking, a transaction locks a whole group if any data in that group is touched (read or write). Another transaction can only access the same group until the first has released the lock. The advantage of this implementation is its simplicity. But the performance is sacrificed since only one transaction can access a group at any time.

In per-row locking, a transaction only locks the rows it needs to access. Two types of locking are supported: shared lock for GET requests and exclusive lock for PUT or ADD requests. Multiple GET requests from different transactions can share lock the same record at the same time. When a transaction reaches a group, it will first try to lock the records it will access within the group. If any lock fails, no lock should happen and a lock failure message is replied to the client. Compared to per-group locking, this approach exploits much more concurrency and should provide higher performance (section 2).

To tolerate failures, we have Paxos handle failures on server side. On client side, when a transaction starts, the client will record its status as started on disk. When all groups are properly locked, the on-disk status of the client changes to locked.

The servers will periodically use Poll() to catch up in the Paxos log with other replicas. Otherwise, there is possibility that some of the servers will be left far behind in the Paxos log and take a long time to catch up. For example, after a client locks a server for a transaction, it seeks other servers to execute two phase commit in Section 1.1.3. After the client send request to this server to lock for a new transaction, that server still grabs lock from previous transaction, rejects the new transaction request and waits for the prepare message of previous transaction, which will never come. In this case, the server stalls, and the new transaction can not proceed.

This is the first step of transaction processing from client’s perspective, we call it insert transaction.

1.1.3 Two Phase Commit

After client hears from all groups that the servers have been properly locked for the transaction, it initializes two-phase commit (2pc) protocol[1] as described in fig. 1, where the records with * are written into non-volatile storage.

![Figure 1: Two Phase Commit Protocol](image)

The client will first send prepare messages to all the groups that a transaction involves in parallel to make sure the transaction can be executed. The servers pre-run the transaction. And if there is an ADD request that results negative integer, it responses abort. Otherwise, the server responses prepare ok. The client waits for all prepare responses from different groups. And depends on the prepare messages, client 1) sends out reply to application and 2) either sends out commit or abort message to servers. After servers sees commit, it will write the result of the transaction into persistent storage.

As shown in Figure fig. 1, two-phase commit requires the coordinator(client) to write once to the persistent storage (commit/abort) and subordinate(servers) to write twice to the persistent storage (prepare_ok/abort and commit/abort). In our implementation, the server always need to make consensus on those two messages through Paxos. Since our Paxos is already persistent, two phase commit is automatically achieved at the server side.

At the client side, we added an extra disk operation to make the state of the current transaction persistent. When a client reboots, it will first read the disk for the latest state before it crashed and repeat the last operation if necessary.

The servers, on the other hand, should passively wait for the clients requests to insert Paxos instance. So it does not have to recover the states up to date immediately. We take a lazy approach to recover the servers: only replay Paxos log and recover the states when the incoming request depends on it. For example, a server after reboot may receive a commit request without knowing the result of the transaction. It will replay the Paxos log at this point and read the transaction results from the log and serve the commit request.

The prepare and commit phases in 2pc are the second and third steps of transaction processing from client’s perspective.

1.2 Testing

We implemented various test cases to make sure our implementation works correctly. In general, our tests fall into two categories: transaction testing and 2pc testing.

1.2.1 Transaction Support

This test is to make sure that our database satisfies atomicity and consistency, i.e., the requirement of the notion of
transaction. For atomicity, we need to make sure that a transaction either completely commits or completely aborts. Partial transactions are not allowed. For consistency, the database should support multiple clients sending requests concurrently and the results are equivalent to some order of sequential execution. We designed the following test cases accordingly.

Test 1 A single client sends requests to three groups of servers where each group contains 3 servers. One of the requests will add a negative value to the database to make record less than 0 and thus should abort. The test verifies that all the changes of the aborted transaction are rolled back. Both reliable and unreliable networks are tested.

Test 2 Initially, each group has a record with value 10. Three clients send requests to all the 3 groups to add -1 to the corresponding record. Within a certain transaction, the values returned from all the groups should be the same. And values returned by different transactions should be different. Both reliable and unreliable networks are tested.

1.2.2 Two Phase Commit
To test that our two-phase commit protocol is correct we need to manually crash the system at different point and reboot the system to see if it can still run properly. A failpoint parameter is passed into both the client and the server when the transactions run. When the machine(client/server) runs into the position indicated by the failpoint, the machine should delete all the information stored in the main memory. The data stored on the disk, however, is preserved.

After failure, the Reboot() function in either the client or the server is called to recover the process. And if the system is correctly implemented, all the transactions should behave properly.

The following failure points are considered in the test and they are tested individually.

Client Side
Case 1: Client fails after locking all the groups but before sending out prepare requests.

Server Side
Case 1: Server fails before writing the prepare record to disk.
Case 2: Server fails after writing the prepare record to disk but before replying the to the client.
Case 3: Server fails after replying the prepare state to the client.
Case 4: Server fails after writing the commit record to disk but before replying to the client.

Finally, we also tested the persistent database storage. In this test, the system is first loaded with data and then the whole system crashes. After reboot, the system should recover all the missing data by reading from the disks.

2. PERFORMANCE RESULTS
In this section, our system is evaluated in several different aspects. In particular, we will first evaluate the overhead of using paxos to reach consensus within a group. Then we evaluate the overhead of disk operations in our 2PC. Finally, we compare the two concurrency control schemes introduced in section 1.1. All the experiments are carried

2.1 Overhead of Paxos
To evaluate the overhead of paxos protocol between replicas, we assume a single client and a single group. In the first case, the group contains only a single server which processes the request alone. In the second case, the group contains three servers and each request should go through the paxos protocol. The difference between the performance (fig. 2) shows the overhead of paxos protocol.

fig. 2 also shows the overhead of writing the records to persistent storage in order to tolerate system crashes. It turns out that the disk writing overhead is smaller than the overhead of paxos protocol.

2.2 Locking Granularity

dlg. 3 shows the performance comparison between per-group locking vs. per-row locking. The experiment involves three clients and three groups with three servers in each group. The database contains 1000 records. Each transaction uniform randomly touches six records, two in each group.

Clearly, per-row locking significantly outperforms per-group locking. Per-row locking allows two transactions to run concurrently as long as their data sets do not overlap. In our setting, most transactions access disjoint sets of data which is the best scenario for per-row locking.

3. DISCUSSION
To summarize, our project is built on top of Lab4. We enhanced the pure key-value storage engine to a transactional processing engine. Then, persistent paxos and persistent data storage are added. And two-phase commit is supported on top of these.

We also implemented various test cases to verify the correctness of our implementation. Finally, we evaluated the performance of our system and studied tradeoffs in different design decisions.

From the project, we learned that Paxos is a very expensive protocol that it supersedes all overheads of 2pc and disk operations. In the future, optimization could be done on Paxos, to further increase our system’s performance.

4. REFERENCES