Data Sharding Using MongoDB

Introduction

Sharding is a database partitioning technique to be able to store large data collections across multiple database servers (Espinosa, 2017/2021).

MongoDB is a document oriented database management system, it uses JSON to represent its documents and they are organized in collections, collections are organized in databases.

Sharded clusters are the way that MongoDB supports sharding, it is composed by the following components:

- Shards: They store data.
- Query Routers: Is in charge of redirecting queries to the appropriate shard.
- Config Servers: Stores metadata of clusters that allows query routers to select the appropriate shard.

In MongoDB sharding is enabled per collection, and it uses the attribute called shard key to partition and distribute the collection documents across the cluster (Espinosa, 2017/2021). Furthermore, it uses two kinds of partitioning:

- Ranged Based: data is partitioned using intervals called chunks.
- Hash Based: a hash function is used to partition data.

When a shard server has too many chunks, MongoDB automatically redistributes the chunks across shards, which is known as cluster balancing (Espinosa, 2017/2021).

We can also tag a range of shard key values to guide partitioning, which provides us with isolation of data and the ability to place shards in related geographical regions.

Methodology and Results

To do this practice we used a project called "play with docker" available on web as well as a github repository containing instructions developed by Javier Espinoza, the links are the following:

- https://labs.play-with-docker.com/
- https://github.com/javieraespinosa/dxlab-sharding#inserting-and-querying-data

To install and configure the environment we created an instance in play with docker and enter the following commands.

```
(local) root@192.168.0.28
  git clone https://github.com/javieraespinosa/dxlab-sharding.git
$ git clone https://github.com/javieraespinosa/dxlab-sharding.gi
Cloning into 'dxlab-sharding'...
remote: Enumerating objects: 77, done.
remote: Counting objects: 100% (22/22), done.
remote: Compressing objects: 100% (21/21), done.
remote: Total 77 (delta 10), reused 3 (delta 0), pack-reused 55
Receiving objects: 100% (77/77), 747.58 KiB | 17.38 MiB/s, done.
Resolving deltas: 100% (41/41), done.
[nodel] (local) root@192.168.0.28 ~
  od dxlab-sharding
nodel] (local) root@192.168.0.28 ~/dxlab-sharding
docker-compose pull
 Pulling cli
 Pulling configserver
Pulling queryrouter.docker ... done
Pulling shardl.docker ... done
Pulling shard2.docker ... done
 Pulling shard3.docker
          [1] (local) root@192.168.0.28 ~/dxlab-sharding
   docker-compose pull
 Pulling cli
 Pulling configserver
                                                   ... done
  Pulling queryrouter.docker ... done
Pulling shard1.docker
Pulling shard2.docker
Pulling shard3.docker
              (local) root@192.168.0.28 ~/dxlab-sharding
$ docker images
  REPOSITORY TAG
                                            IMAGE ID
                        3.0
                                           fdab8031e252 3 years ago
                                                                                                  232MB
```

Figure 1: Cloning the github repository, downloading images specified in docker-compose.yml and verifying the existence of docker images.

To prepare the sharded clusters we enter the following commands.

```
[node1] (local) root@192.168.0.28 ~/dxlab-sharding
$ docker-compose up -d
Creating network "dxlab-sharding_default" with the default driver
Creating shard3.docker ... done
 Creating configserver
Creating shard1.docker
Creating shard2.docker
Creating dxlab-sharding_cli_1 ... done
Creating queryrouter.docker ... done
  nodel] (local) root@192.168.0.28 ~/dxlab-sharding docker ps
CONTAINER ID
41d701e3a2e2
                               IMAGE
                                                           COMMAND
                                                                                                                                                       STATUS
                                                                                                                                                     Up Less than a second
Up 2 seconds
Up 1 second
Up 1 second
Up 2 second
CONTAINER 1D IMAGE COMMAND
414701e3a2e2 mongo:3.0 "docker-entrypoint.s..."
edf21b009ab2 mongo:3.0 "docker-entrypoint.s..."
c1019f68ab4a mongo:3.0 "docker-entrypoint.s..."
ff68eade7176 mongo:3.0 "docker-entrypoint.s..."
[node1] (local) root@192.168.0.28 -/dxlab-sharding
                                                                                                                  2 seconds ago
5 seconds ago
5 seconds ago
5 seconds ago
                                                                                                                                                                                                           0.0.0.0:27017->27017/tcp
                                                                                                                                                                                                                                                                        queryrouter.docker
                                                                                                                                                                                                            0.0.0.0:27118->27017/tcp
0.0.0.0:27117->27017/tcp
                                                                                                                                                                                                                                                                        shard1.docker
                                                                                                                                                                                                            27017/tcp
0.0.0.0:27119->27017/tcp
                                                                                                                   5 seconds ago
                                                                                                                                                                                                                                                                        shard3.docker
    docker network inspect dxlab-sharding_default
                 "Name": "dxlab-sharding_default",
"Id": "97b33de8a99f76405da67e3997cf4f50bbbc7d0c47d447c174401849fd515526",
"Created": "2022-02-21T02:12:38.889313546Z",
"Scope": "local",
"Driver": "bridge",
"EnableIPv6": false,
                           "Driver": "default",
"Options": null,
"Config": [
                                            "Subnet": "172.19.0.0/16",
"Gateway": "172.19.0.1"
```

Figure 2: Starting the cluster, listing containers, and showing IP's (part 1).

```
"Attachable": true,
"Ingress": false,
"Ingress": {
"ConfigFrom": {
      "Network":
},
"ConfigOnly": false,
". /
"Containers": {
      "3b27d0a6dc7214121fb8db9e8c47b13528737ca8b7ef57c1b4d09620daf3970e": {
           "Name": "configserver",
"EndpointID": "34c87d58500f574ad9e0c8325defd5b83e80fa7e1cd48ef046e003f6c33dc1ef",
"MacAddress": "02:42:ac:13:00:03",
"IPv4Address": "172.19.0.3/16",
           "IPv6Address": ""
     },
"41d701e3a2e25058f04872e1dcaa9819ba767ec1c674f24d613b8bb5c81e9ca6": {
           "Name": "queryrouter.docker",
"EndpointID": "989f7b154fe2091eaa870d75dbae406f99754c56508f78cf23222485af2f1d96",
"MacAddress": "02:42:ac:13:00:05",
           "IPv6Address": "172.19.0.5/16",
"IPv6Address": ""
     },
"c1019f68ab4a20cff61d43480446317cb69190f62d9fb5a6a71817f23c8448cf": {
            "Name": "shard1.docker",
           "EndpointID": "20c75fe5caeaac06bb32326fdbd9fd0a707e9d1cd8310e6ad9c37ca5b9ebab9c",
"MacAddress": "02:42:ac:13:00:06",
"IPv4Address": "172.19.0.6/16",
"IPv6Address": ""
       edf21b009ab2c2676972f94117c41749a465eec9be69fee201b6127edacf0f00": {
           "Name": "shard2.docker",
           "EndpointID": "17fbf63d90659ce82ac6b015843676061d14926168fc6d4d562d465c17cc7574",
"MacAddress": "02:42:ac:13:00:04",
"IPv4Address": "172.19.0.4/16",
           "IPv6Address": ""
```

Figure 3: Listing containers IP's (part 2).

```
},
    "ff68eade71763b58d4d7e21ee4c42698e781fb95a558e1cd53b8e3afdde487d0": {
        "Name": "shard3.docker",
        "EndpointID": "51ec3ad82123a25e58dbf784136848861dc45c0867d93a1034a7f23dcb8ead77",
        "MacAddress": "02:42:ac:13:00:02",
        "IPv4Address": "172.19.0.2/16",
        "IPv6Address": ""
        }
},
        "Options": {},
        "Com.docker.compose.network": "default",
        "com.docker.compose.project": "dxlab-sharding",
        "com.docker.compose.version": "1.26.0"
}
```

Figure 4: Listing containers IP's (part 3).

To add a shard server we need to perform the following commands.

```
docker-compose run --rm cli
root@d2734f7317fa:~# mongo --host queryrouter.docker
MongoDB shell version: 3.0.15
connecting to: queryrouter.docker:27017/test Welcome to the MongoDB shell.
For interactive help, type "help".
For more comprehensive documentation, see
        http://docs.mongodb.org/
Questions? Try the support group
http://groups.google.com/group/mongodb-user
mongos> use admin switched to db admin
mongos> db.runCommand({
... addShard: "shard1.docker",
      name: "shard1"
    })
  "shardAdded" : "shard1", "ok" : 1 }
 ongos> sh.status()
 -- Sharding Status
 sharding version: {
    "_id" : 1,
    "minCompatibleVersion" : 5,
         "currentVersion" : 6,
         "clusterId" : ObjectId("6212f51bfb8033f2a46712a5")
  shards:
         { "_id" : "shard1", "host" : "shard1.docker:27017" }
 balancer:
         Currently enabled: yes
         Currently running: no Failed balancer rounds in last 5 attempts: 0
         Migration Results for the last 24 hours:
                  No recent migrations
 databases:
     { "_id" : "admin", "partitioned" : false, "primary" : "config" }
```

Figure 5: Entering the cluster environment, connecting to the query router and adding a shard to the cluster.

```
mongos> sh.status()
  - Sharding Status --
  sharding version: {
        "_id" : 1,
        "minCompatibleVersion": 5,
        "currentVersion" : 6,
        "clusterId" : ObjectId("6212f6a722b8cafd8f9988ce")
  shards:
           " id" : "shard1",
                              "host" : "shard1.docker:27017" }
  balancer:
        Currently enabled:
                            yes
        Currently running:
                            no
        Failed balancer rounds in last 5 attempts:
        Migration Results for the last 24 hours:
                No recent migrations
  databases:
                             "partitioned" : false, "primary" : "config" }
          "_id" : "admin",
```

Figure 6: Verifying the status of the cluster.

Now we need to populate the database.

```
root@bd9cb128a63a:~# mongoimport \
    --host queryrouter.docker \
    --db mydb \
    --collection cities \
    --file ./cities.txt
2022-02-21T02:20:59.323+0000
                                connected to: queryrouter.docker
2022-02-21T02:20:59.933+0000
                                imported 29353 documents
root@bd9cb128a63a:~# mongo --host queryrouter.docker
MongoDB shell version: 3.0.15
connecting to: queryrouter.docker:27017/test
mongos> show dbs
admin
        (empty)
config
        0.016GB
mydb
        0.078GB
mongos> use mydb
switched to db mydb
mongos> show collections
cities
system.indexes
mongos>
```

Figure 7: Importing the contents of cities.txt into the database.

Figure 8: Running a query on the new imported data.

mongos> db.cities.count() 29353

Figure 9: Counting the documents of the collection cities.

To create a ranged based partitioning the following commands need to be executed. We can see in the sharding status (in Fig. 10) that it displays the sharding version, the shards, the balancer, and the databases, and as expected, we get the shard key (state) with a minKey and a maxKey as well as the chunks. In Fig. 11 we can see that we get three chunks that depend on the shard key.

```
db.createCollection("cities1")
mongos> show collections cities
cities1
system.indexes
 ongos> sh.enableSharding("mydb")
 "ok": 1 }
ongos> sh.shardCollection("mydb.cities1", { "state": 1} )
"collectionsharded": "mydb.cities1", "ok": 1 }
 ongos> sh.status()
  - Sharding Status
 sharding version: {
    "_id" : 1,
    "minCompatibleVersion" : 5,
    "currentVersion" : 6,
    "clusterId" : ObjectId("6212f6a722b8cafd8f9988ce")
  shards:
           "_id" : "shard1", "host" : "shard1.docker:27017" }
  balancer:
         Currently enabled: yes
         Currently running: no Failed balancer rounds in last 5 attempts: 0
         Migration Results for the last 24 hours:
                  No recent migrations
  databases:
         shard key: { "state" : 1 }
                           chunks:
                                    shard1 1
                            { "state" : { "$minKey" : 1 } } -->> { "state" : { "$maxKey" : 1 } } on : shardl Timestamp(1, 0)
```

Figure 10: Creating a new collection and enabling sharding using the attribute called state as shard key.

```
mongos> db.cities.find().forEach(
        function(doc) {
            db.cities1.insert(doc);
...)
nongos> sh.status()
 -- Sharding Status ---
 sharding version: {
          " id" : 1,
         "minCompatibleVersion" : 5,
          "currentVersion" : 6,
         "clusterId" : ObjectId("6212f6a722b8cafd8f9988ce")
 shards:
            "_id" : "shard1", "host" : "shard1.docker:27017" }
 balancer:
         Currently enabled: yes
         Currently running: no
         Failed balancer rounds in last 5 attempts:
         Migration Results for the last 24 hours:
                    No recent migrations
 databases:
            "_id" : "admin", "partitioned" : false, "primary" : "config" }
"_id" : "mydb", "partitioned" : true, "primary" : "shardl" }
                   mydb.cities1
                              shard key: { "state" : 1 }
                               chunks:
                                        shard1 3
                              { "state" : { "$minKey" : 1 } } -->> { "state" : "MA" } on : shard1 Timestamp(1, 1) { "state" : "MA" } -->> { "state" : "RI" } on : shard1 Timestamp(1, 2) { "state" : "RI" } -->> { "state" : { "$maxKey" : 1 } } on : shard1 Timestamp(1, 3)
```

Figure 11: Populating the new collection and verifying the state.

To define a hash-based partitioning we follow a similar approach. We create a new collection and enable sharding with the same attribute called state, however the difference is that now it has a value of "hashed", we get two shards (Fig. 12). After populating the collection, we can see in Fig. 13 that now we have 4 chunks that depend on the shard key.

Figure 12: Enabling sharding and verifying status.

Figure 13: Populating collection and verifying status.

To activate the cluster balancing first we add more shards in Fig. 14, then in Fig. 15 we can see that shard1 gets two chunks, shard2 gets 1, and shard3 also gets 1.

```
mongos> use admin
switched to db admin
mongos> db.runCommand( { addShard: "shard2.docker", name: "shard2" } )
{ "shardAdded" : "shard2", "ok" : 1 }
mongos> db.runCommand( { addShard: "shard3.docker", name: "shard3" } )
{ "shardAdded" : "shard3", "ok" : 1 }
```

Figure 14: Adding more shards to the cluster.

Figure 15: Verifying status.

In order to use tags as a guide to partitioning, first we need to associate tags to shards in Fig. 16. Then we create, populate and enable sharding in Fig. 17. In Fig. 18 we define and associate key ranges to shards. Finally we check the status in Fig. 19, we can see that the tagging was successful because shard3 gets 5 chunks while shard1 and shard2 only get 1.

```
mongos> sh.addShardTag("shard1", "CA")
mongos> sh.addShardTag("shard2", "NY")
mongos> sh.addShardTag("shard3", "Others")
```

Figure 16: Associating tags to shards.

```
mongos> use mydb
switched to db mydb
mongos> db.createCollection("cities3")
{ "ok" : 1 }
mongos> sh.shardCollection("mydb.cities3", { "state": 1} )
{ "collectionsharded" : "mydb.cities3", "ok" : 1 }
mongos> db.cities.find().forEach(
... function(doc) {
... db.cities3.insert(doc);
... }
... )
```

Figure 17: Create, populate and enable sharding.

```
mongos> sh.addTagRange("mydb.cities3", { state: MinKey }, { state: "CA" }, "Others")
mongos> sh.addTagRange("mydb.cities3", { state: "CA" }, { state: "CA_" }, "CA")
mongos> sh.addTagRange("mydb.cities3", { state: "CA_" }, { state: "NY" }, "Others")
mongos> sh.addTagRange("mydb.cities3", { state: "NY" }, { state: "NY_" }, "NY")
mongos> sh.addTagRange("mydb.cities3", { state: "NY_" }, { state: MaxKey }, "Others")
```

Figure 18: Defining and associating key ranges to shards.

```
mydb.cities3
         shard key: { "state" : 1 }
         chunks:
                   shard1
                  shard2
                   shard3 5
                    : { "$minKey" : 1 } } --> { "state" : "CA" } on : shard3 Timestamp(7, 1)
                                         "state"
                                                 : "CA "
                                                           } on : shard1 Timestamp(6, 0)
                                      { "state" : "MA" } on : shard3 Timestamp(4, 4)
                                                 : "NY" } on : shard3 Timestamp(4, 4)
: "NY" } on : shard3 Timestamp(4, 5)
: "NY_" } on : shard2 Timestamp(4, 5)
                               -->> { "state" 
-->> { "state"
                                         "state"
                                                           } on : shard2 Timestamp(7, 0)
                                          "state": "RI" } on: shard3 Timestamp(4, 8)
                                                      "$maxKey" : 1 } } on : shard3 Timestamp(5, 0) : 1 } } -->> { "state" : "CA" }
                                        "state" : {
                                          "$minKey
                                           -->> { "state"
                                                              : "CA "
          tag: CA { "state"
                                : "CA"
          tag: Others { "state" : "CA_" } -
                                                       { "state" : "NY"
                                                 { "state" : "NY_"
          tag: NY { "state" : "NY" } -->>
                                                                      { "$maxKey" : 1 } }
          tag: Others
                            "state" :
                                                 -->> { "state" :
```

Figure 19: Verifying the status.

Discussion

A shard key is an attribute that is used to partition and distribute the collection documents across the cluster, the sharding key may impact the sharding strategy but it is not directly dependent of it, we can have either strategy, and examples are shown in our results. In the case of the interval-oriented strategy MongoDB limit chunks depending on the domain of the sharding key, this is well suited when the collection has documents in which the values of the shard key are well distributed among them. The hash-based strategy on the other hand, is well suited when the values of the sharding key is not well distributed among the collection. To have a more balanced distribution of data across shards, the strategy to be used depends on the data of the collection, however, a hash-based approach should be more balanced in general.

Tag based sharding is an interesting option when we need more control of where our shardings are going, one example would be when we need to divide our customers depending on their location, if we use tags, then we can make sure that the shards are positioned in geographical related regions. When a new shard is added to a cluster containing already other shards with data, cluster balancing takes place, the chunks are automatically distributed between the old and the new shards.

Finally, to test if a sharded collection was an interesting solution in comparison to a centralized one, I would measure the time that it takes to run queries on both cases while using a large enough database so that the return time of queries can be appreciated.

Vade Mecum

The aspects that should be considered when developing a sharding solution in MongoDB are the following:

- Sharding is enabled on a per-collection basis, which means that documents of the collection
 are distributed across the shards (which can be seen as servers) of a cluster using the shard
 key.
- MongoDB supports sharding using a sharded cluster, which is composed of shards (that store data), query routers (which redirect queries to the appropriate shards) and config servers (which stores cluster's metadata that is used to select appropriate shards).
- It is important to decide how many query routers, config servers and shards the solution will have, depending on the size of our database we may want more or less servers.
- Deciding on a sharding key, to decide which attribute should be considered as a sharding key you should consider an attribute that groups related documents in a distributed manner,

if you can't find it, a good solution can be to hash the _id given that reads and writes will be distributed evenly, but queries for multiple documents will have to reach all shards.

- Deciding on a strategy: range based partitioning or hashing. Range based partitioning separates data into intervals [min, max] which are called chunks, while hash based partitioning uses a hash function.
- Cluster balancing is a feature that is automatically provided by MongoDB to redistribute chunks across shards when a shard server has too many.
- Partitioning can be guided by using tags, which are used to isolate date or place shards in related geographical regions.

Conclusions

Sharding a database is necessary when data grows too large and the response time is not the same as it once was, it allows us to scale depending on our needs. To do this, MongoDB uses sharded clusters with different strategies that can be applied depending on the dataset itself and on what we believe that would be better. Sharding can be really advantageous when having a really big database, because it can greatly impact the efficiency of our system, however, when not having a large enough database we can say that the advantages are almost insignificant and that time should not be invested in developing this solution.

References

Espinosa, J. (2021). Sharding Data Collections with MongoDB [Jupyter Notebook].

https://github.com/javieraespinosa/dxlab-sharding (Original work published 2017)