

Connecting to MySQL database

```
In [1]: # Load and activate the SQL extension
%load_ext sql
```

```
In [2]: # Establish a connection to the local database using the '%sql' magic command.
# Replace 'password' with our connection password and `db_name` with our database name
# If you get an error here, please make sure the database name or password is correct

%sql mysql+pymysql://username:password@localhost:3306/md_water_services
```

Connecting to 'mysql+pymysql://root:***@localhost:3306/md_water_services'

Cleaning our data

```
In [4]: %%sql
SELECT *
FROM employee
LIMIT 10;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

10 rows affected.

Out[4]:

| assigned_employee_id | employee_name | phone_number | email | address | province_name | town_name |
|----------------------|---------------|--------------|-------|---------|---------------|-----------|
|----------------------|---------------|--------------|-------|---------|---------------|-----------|

| | | | | | | |
|----|----------------|--------------|------|------------------------------------|----------|----------|
| 0 | Amara Jengo | +99637993287 | None | 36 Pwani Mchangani Road | Sokoto | Ilorin |
| 1 | Bello Azibo | +99643864786 | None | 129 Ziwa La Kioo Road | Kilimani | Fajana |
| 2 | Bakari Iniko | +99222599041 | None | 18 Mlima Tazama Avenue | Hawassa | Fajana |
| 3 | Malachi Mavuso | +99945849900 | None | 100 Mogadishu Road | Akatsi | Lugbe |
| 4 | Cheche Buhle | +99381679640 | None | 1 Savanna Street | Akatsi | Fajana |
| 5 | Zuriel Matembo | +99034075111 | None | 26 Bahari Ya Faraja Road | Kilimani | Fajana |
| 6 | Deka Osumare | +99379364631 | None | 104 Kenyatta Street | Akatsi | Fajana |
| 7 | Lalitha Kaburi | +99681623240 | None | 145 Sungura Amanpour Road | Kilimani | Fajana |
| 8 | Enitan Zuri | +99248509202 | None | 117 Kampala Road | Hawassa | Zanzibar |
| 10 | Farai Nia | +99570082739 | None | 33 Angélique Kidjo Avenue | Amanzi | Dakota |

In [10]:

```
%%sql
/* putting email addresses for all workers.
Here, I assume that the email format is "firstname.lastname@ndogowater.gov"
*/
SELECT assigned_employee_id, employee_name, CONCAT(LOWER(REPLACE(employee_name, ' ', '_')), '@ndogowater.gov')
FROM employee
LIMIT 10;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

10 rows affected.

Out[10]: **assigned_employee_id** **employee_name** **new_email**

| | | |
|----|----------------|-------------------------------|
| 0 | Amara Jengo | amara.jengo@ndogowater.gov |
| 1 | Bello Azibo | belo.azibo@ndogowater.gov |
| 2 | Bakari Iniko | bakari.iniko@ndogowater.gov |
| 3 | Malachi Mavuso | malachi.mavuso@ndogowater.gov |
| 4 | Cheche Buhle | cheche.buhle@ndogowater.gov |
| 5 | Zuriel Matembo | zuriel.matembo@ndogowater.gov |
| 6 | Deka Osumare | deka.osumare@ndogowater.gov |
| 7 | Lalitha Kaburi | lalitha.kaburi@ndogowater.gov |
| 8 | Enitan Zuri | enitan.zuri@ndogowater.gov |
| 10 | Farai Nia | farai.nia@ndogowater.gov |

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In [16]:

```
%%sql
-- update the database with these email addresses
UPDATE employee
SET email=CONCAT(LOWER(REPLACE(employee_name, ' ', '.')), '@ndogowater.gov');
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
56 rows affected.

Out[16]:

In [111...

```
%%sql
SELECT *
FROM employee
WHERE assigned_employee_id = 20 OR assigned_employee_id = 22
LIMIT 10;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
2 rows affected.

Out[111]: **assigned_employee_id** **employee_name** **phone_number** **email** **address** **provi**

| | | | | | |
|----|-------------|--------------|----------------------------|---------------------------------|--|
| 20 | Kunto Asha | +99176320477 | kunto.asha@ndogowater.gov | 30 Nyoka Achebe Street | |
| 22 | Lesedi Kofi | +99611183730 | lesedi.kofi@ndogowater.gov | 52 Moroni Avenue | |

I picked up another bit we have to clean up. Often when databases are created and updated, or information is collected from different sources, errors creep in. For example, if you look at the phone numbers in the phone_number column, the values are stored as strings.

The phone numbers should be 12 characters long, consisting of the plus sign, area code (99), and the phone number digits. However, when we use the LENGTH(column) function, it returns 13 characters, indicating there's an extra character.

```
In [18]: %%sql
SELECT
LENGTH(phone_number)
FROM
employee;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

56 rows affected.

```
Out[18]: LENGTH(phone_number)
```

| |
|----|
| 13 |
| 13 |
| 13 |
| 13 |
| 13 |
| 13 |
| 13 |
| 13 |
| 13 |
| 13 |

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So, I trim the column

```
In [20]: %%sql
SELECT
LENGTH(TRIM(phone_number)) AS LENGTH
FROM
employee;

UPDATE employee
SET phone_number = TRIM(phone_number);

SELECT
LENGTH(TRIM(phone_number)) AS LENGTH
FROM
employee;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

56 rows affected.

56 rows affected.

56 rows affected.

Out[20]: **LENGTH**

| |
|----|
| 12 |
| 12 |
| 12 |
| 12 |
| 12 |
| 12 |
| 12 |
| 12 |
| 12 |
| 12 |

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In [3]: **%%sql****SHOW TABLES;**

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

8 rows affected.

Out[3]: **Tables in md_water_services**

| |
|---------------------|
| data_dictionary |
| employee |
| global_water_access |
| location |
| visits |
| water_quality |
| water_source |
| well_pollution |

NOTES: This query will show all of the tables in a database. When you start a data project, this is a good first command to use to get to know the database.

Now, using the employees table to count how many employees live in each town.

In [112...]

```
%%sql
SELECT town_name, COUNT(assigned_employee_id) AS number_of_employees
FROM employee
WHERE province_name = 'Kilimani'
GROUP BY town_name;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

3 rows affected.

Out[112]: **town_name** **number_of_employees**

| | |
|--------|---|
| Rural | 9 |
| Ilanga | 1 |
| Harare | 2 |

Honouring the workers

Say the president of this hometown asks to send out an email or message congratulating the top 3 field surveyors. Get the employee_ids and use that to get the contact details of field surveyors with the most locations visited.

In [30]: **%%sql**
SELECT assigned_employee_id, **count**(location_id) **AS** number_of_visits
FROM visits
GROUP BY assigned_employee_id
ORDER BY number_of_visits **DESC**
LIMIT 3;

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
 3 rows affected.

Out[30]: **assigned_employee_id** **number_of_visits**

| | |
|----|------|
| 1 | 3708 |
| 30 | 3676 |
| 34 | 3539 |

In [109... **%%sql**
SELECT assigned_employee_id, **count**(location_id) **AS** number_of_visits
FROM visits
GROUP BY assigned_employee_id
ORDER BY number_of_visits
LIMIT 2;

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
 2 rows affected.

Out[109]: **assigned_employee_id** **number_of_visits**

| | |
|----|-----|
| 20 | 15 |
| 22 | 143 |

Analysing locations

Looking at the location table, let's focus on the province_name, town_name and location_type to understand where the water sources are

In [34]: **%%sql**
-- counting the number of records per town
SELECT COUNT(*) AS records_per_town, town_name
FROM location

```
GROUP BY town_name
ORDER BY records_per_town DESC
LIMIT 6;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
6 rows affected.

Out[34]: **records_per_town town_name**

| | |
|-------|--------|
| 23740 | Rural |
| 1650 | Harare |
| 1090 | Amina |
| 1070 | Lusaka |
| 990 | Mrembo |
| 930 | Asmara |

In [35]: **%%sql**
-- counting the number of records per province
SELECT COUNT(*) AS records_per_province, province_name
FROM location
GROUP BY province_name
ORDER BY records_per_province **DESC**
LIMIT 6;

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
5 rows affected.

Out[35]: **records_per_province province_name**

| | |
|------|----------|
| 9510 | Kilimani |
| 8940 | Akatsi |
| 8220 | Sokoto |
| 6950 | Amanzi |
| 6030 | Hawassa |

1. Create a result set showing: • province_name • town_name • An aggregated count of records for each town (consider naming this records_per_town). • Ensure data is grouped by both province_name and town_name.
2. Order results primarily by province_name. Within each province, further sort the towns by their record counts in descending order.

In [45]: **%%sql**
SELECT province_name, town_name, **COUNT(*) AS** records_per_town
FROM location
GROUP BY province_name, town_name
ORDER BY province_name, records_per_town **desc**

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
31 rows affected.

Out[45]: **province_name** **town_name** **records_per_town**

| | | |
|--------|----------|------|
| Akatsi | Rural | 6290 |
| Akatsi | Lusaka | 1070 |
| Akatsi | Harare | 800 |
| Akatsi | Kintampo | 780 |
| Amanzi | Rural | 3100 |
| Amanzi | Asmara | 930 |
| Amanzi | Dahabu | 930 |
| Amanzi | Amina | 670 |
| Amanzi | Pwani | 520 |
| Amanzi | Abidjan | 400 |

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Look at number of records for each location type.

In [47]:

```
%%sql
SELECT COUNT(*) AS num_sources, location_type
FROM location
GROUP BY location_type
;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
2 rows affected.

Out[47]: **num_sources** **location_type**

| | |
|-------|-------|
| 15910 | Urban |
| 23740 | Rural |

In [48]:

```
%%sql
-- checking what percentage of water sources are in rural communities
SELECT 23740/(15910+23740)*100
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
1 rows affected.

Out[48]: **23740/(15910+23740)*100**
59.8739

Diving into the sources

Ok, water_source is a big table, with lots of stories to tell

Before I go and spoil it all, I open up the table, look at the various columns, make some notes on what we can do with them, and go ahead and make some queries and explore the dataset. Perhaps there's more to tell. 11:04 The way I look at this table; we have access to different water source types and the number of people using each source. These are the questions that I am curious about.

1. How many people did we survey in total?
2. How many wells, taps and rivers are there?
3. How many people share particular types of water sources on average?
4. How many people are getting water from each type of source?

In [49]:

```
%%sql
-- exploring the table
SELECT *
FROM water_source
LIMIT 1;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
1 rows affected.

Out[49]:

| source_id | type_of_water_source | number_of_people_served |
|--------------|----------------------|-------------------------|
| AkHa00000224 | tap_in_home | 956 |

In [56]:

```
%%sql
-- How many people did we survey in total?
SELECT SUM(number_of_people_served) AS number_of_people_surveyed
FROM water_source
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
1 rows affected.

Out[56]:

| number_of_people_surveyed |
|---------------------------|
| 27628140 |

In [52]:

```
%%sql
-- How many wells, taps and rivers are there?
SELECT type_of_water_source, COUNT(*) AS count
FROM water_source
GROUP BY type_of_water_source
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
5 rows affected.

Out[52]:

| type_of_water_source | count |
|----------------------|-------|
| tap_in_home | 7265 |
| tap_in_home_broken | 5856 |
| well | 17383 |
| shared_tap | 5767 |
| river | 3379 |

In [55]:

```
%%sql
-- How many people share particular types of water sources on average?
SELECT type_of_water_source, ROUND(AVG(number_of_people_served)) AS avg_people_shar
FROM water_source
GROUP BY type_of_water_source
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
5 rows affected.

Out[55]: **type_of_water_source** **avg_people_sharing**

| | |
|--------------------|------|
| tap_in_home | 644 |
| tap_in_home_broken | 649 |
| well | 279 |
| shared_tap | 2071 |
| river | 699 |

In [54]: **%%sql**

```
-- How many people are getting water from each type of source?
SELECT type_of_water_source, SUM(number_of_people_served) AS num_people_getting
FROM water_source
GROUP BY type_of_water_source
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

5 rows affected.

Out[54]: **type_of_water_source** **num_people_getting**

| | |
|--------------------|----------|
| tap_in_home | 4678880 |
| tap_in_home_broken | 3799720 |
| well | 4841724 |
| shared_tap | 11945272 |
| river | 2362544 |

In [59]: **%%sql**

```
-- How many people are getting water from each type of source?
SELECT type_of_water_source, ROUND((SUM(number_of_people_served)/27628140)*100) AS
FROM water_source
GROUP BY type_of_water_source
ORDER BY pcnt_people_getting DESC
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

5 rows affected.

Out[59]: **type_of_water_source** **pcnt_people_getting**

| | |
|--------------------|----|
| shared_tap | 43 |
| well | 18 |
| tap_in_home | 17 |
| tap_in_home_broken | 14 |
| river | 9 |

NOTES: This query fetches 10 records from the `location` table. This is the results set I got, with only 10 rows.

Start of a solution

At some point, we will have to fix or improve all of the infrastructure, so we should start thinking about how we can make a data-driven decision how to do it. I think a simple

approach is to fix the things that affect most people first. So let's write a query that ranks each type of source based on how many people in total use it. 'rank' should tell you we are going to need a window function to do this, so let's think through the problem.

We will need the following columns:

- Type of sources -- Easy
- Total people served grouped by the types -- We did that earlier, so that's easy too.
- A rank based on the total people served, grouped by the types -- A little harder.

```
In [75]: %%sql
-- How many people are getting water from each type of source?
SELECT type_of_water_source, SUM(number_of_people_served) AS population_served, RANK() OVER (PARTITION BY type_of_water_source ORDER BY population_served DESC) AS rank_of_water_source
FROM water_source
GROUP BY type_of_water_source
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

5 rows affected.

```
Out[75]: type_of_water_source  population_served  rank_of_water_source
```

| | | |
|--------------------|----------|---|
| shared_tap | 11945272 | 1 |
| well | 4841724 | 2 |
| tap_in_home | 4678880 | 3 |
| tap_in_home_broken | 3799720 | 4 |
| river | 2362544 | 5 |

Ok, so I should fix shared taps first, then wells, and so on. But the next question is, which shared taps or wells should be fixed first? I can use the same logic; the most used sources should really be fixed first.

I definitely should keep these requirements in mind:

1. The sources within each type should be assigned a rank.
2. Limit the results to only improvable sources.
3. Think about how to partition, filter and order the results set.
4. Order the results to see the top of the list.

```
In [92]: %%sql
SELECT
    source_id,
    type_of_water_source,
    Number_of_people_served,
    RANK() OVER (PARTITION BY type_of_water_source ORDER BY Number_of_people_served DESC) AS rank_of_water_source
FROM
    water_source
WHERE
    type_of_water_source IN ('river', 'tap_in_home_broken', 'well', 'shared_tap')
ORDER BY
    source_rank ASC;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

32385 rows affected.

Out[92]:

| source_id | type_of_water_source | Number_of_people_served | source_rank |
|--------------|----------------------|-------------------------|-------------|
| SoRu36122224 | well | 398 | 1 |
| SoRu36201224 | well | 398 | 1 |
| SoRu35723224 | well | 398 | 1 |
| SoRu36436224 | well | 398 | 1 |
| SoRu36899224 | well | 398 | 1 |
| SoRu36142224 | well | 398 | 1 |
| SoRu36355224 | well | 398 | 1 |
| SoRu34665224 | well | 398 | 1 |
| SoRu35277224 | well | 398 | 1 |
| SoRu36774224 | well | 398 | 1 |

Truncated to [displaylimit](#) of 10.

Analysing Queues

Ok, this is the really big, and last table we'll look at this time. The analysis is going to be a bit tough, but the results will be worth it, so stretch out, grab a drink, and let's go!

Ok, these are some of the things I think are worth looking at:

1. How long did the survey take?
2. What is the average total queue time for water?
3. What is the average queue time on different days?
4. How can we communicate this information efficiently?

Question 1: To calculate how long the survey took, I'll get the first and last dates (which functions can find the largest/smallest value), and subtract them. Remember with DateTime data, we can't just subtract the values. So I'll use a function to get the difference in days.

In [95]:

```
%%sql
SELECT *
FROM visits
LIMIT 1;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

1 rows affected.

Out[95]:

| record_id | location_id | source_id | time_of_record | visit_count | time_in_queue | assigned_employee |
|-----------|-------------|--------------|------------------------|-------------|---------------|-------------------|
| 0 | Soll32582 | Soll32582224 | 2021-01-01 09:10:00 | 1 | 15 | |

In [100...]

```
%%sql
SELECT
    MIN(time_of_record) AS start_date,
    MAX(time_of_record) AS end_date,
    DATEDIFF(MAX(time_of_record), MIN(time_of_record)) AS survey_duration_in_days
```

```
FROM
visits;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
1 rows affected.

```
Out[100]:
```

| start_date | end_date | survey_duration_in_days |
|---------------------|---------------------|-------------------------|
| 2021-01-01 09:10:00 | 2023-07-14 13:53:00 | 924 |

Question 2: Let's see how long people have to queue on average in Maji Ndogo.

```
In [101... %%sql
SELECT AVG(NULLIF(time_in_queue,0)) AS avg_queue_time
FROM visits;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
1 rows affected.

```
Out[101]:
```

| avg_queue_time |
|----------------|
| 123.2574 |

Question 3: Time to look at the queue times aggregated across the different days of the week.

```
In [104... %%sql
SELECT DAYNAME(time_of_record) AS day_of_week, ROUND(AVG(NULLIF(time_in_queue,0)))
FROM visits
GROUP BY day_of_week
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
7 rows affected.

```
Out[104]:
```

| day_of_week | avg_queue_time |
|-------------|----------------|
| Friday | 120 |
| Saturday | 246 |
| Sunday | 82 |
| Monday | 137 |
| Tuesday | 108 |
| Wednesday | 97 |
| Thursday | 105 |

```
In [107... %%sql
SELECT
    HOUR(time_of_record) AS hour_of_day,
    ROUND(AVG(NULLIF(time_in_queue, 0))) AS avg_queue_time
FROM
    visits
GROUP BY
    hour_of_day
ORDER BY avg_queue_time DESC;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'
14 rows affected.

Out[107]: **hour_of_day** **avg_queue_time**

| | |
|----|-----|
| 19 | 168 |
| 7 | 149 |
| 8 | 149 |
| 17 | 149 |
| 6 | 149 |
| 18 | 147 |
| 9 | 118 |
| 13 | 115 |
| 10 | 114 |
| 14 | 114 |

Truncated to [displaylimit](#) of 10.

The hour number is difficult to interpret. A format like 06:00 will be easier to read, so let's use that

Question 4: We can also look at what time during the day people collect water. Try to order the results in a meaningful way.

In [108...

```
%%sql
SELECT
    TIME_FORMAT(TIME(time_of_record), '%H:00') AS hour_of_day,
    ROUND(AVG(NULLIF(time_in_queue, 0))) AS avg_queue_time
FROM
    visits
GROUP BY
    hour_of_day
ORDER BY avg_queue_time DESC;
```

Running query in 'mysql+pymysql://root:***@localhost:3306/md_water_services'

14 rows affected.

Out[108]: **hour_of_day** **avg_queue_time**

| | |
|-------|-----|
| 19:00 | 168 |
| 07:00 | 149 |
| 08:00 | 149 |
| 17:00 | 149 |
| 06:00 | 149 |
| 18:00 | 147 |
| 09:00 | 118 |
| 13:00 | 115 |
| 10:00 | 114 |
| 14:00 | 114 |

Truncated to [displaylimit](#) of 10.