

About the Data

This data set shows the different drinking water sources across the country on the year 2020.

- Philippines - Households by Main Source of Drinking Water Census 2020
- Source: <https://data.humdata.org/dataset/hh-by-main-source-of-drinking-water-census-2020> (<https://data.humdata.org/dataset/hh-by-main-source-of-drinking-water-census-2020>)

Load Data

```
In [60]: import pandas as pd

# Loading the data
df = pd.read_excel('data/hh-drinking-water-source-admin3-census2020.xlsx')
df.head()
```

Out[60]:

	Region	Province	Mun	concat	MunCode_New	MunCode_Old	Total Number \nof Households*	Own Use Faucet, Community Water System	Shared Faucet, Community Water System	Own Use Tubed/Pipe Deep Wel
0	NATIONAL CAPITAL REGION (NCR)	NCR, City of Manila, First District (Not a Pro...	CITY OF MANILA	NATIONAL CAPITAL REGION (NCR)NCR, City of Mani...	PH1380600000	PH133900000	483261	118315	27775	2805
1	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MANDALUYONG	NATIONAL CAPITAL REGION (NCR)NCR, Second Distr...	PH1380500000	PH137401000	116505	32880	4687	426
2	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MARIKINA	NATIONAL CAPITAL REGION (NCR)NCR, Second Distr...	PH1380700000	PH137402000	104404	47226	4447	762
3	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF PASIG	NATIONAL CAPITAL REGION (NCR)NCR, Second Distr...	PH1381200000	PH137403000	212864	89493	6025	1428
4	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	QUEZON CITY	NATIONAL CAPITAL REGION (NCR)NCR, Second Distr...	PH1381300000	PH137404000	738330	309249	36489	4594

5 rows × 22 columns



Initial Exploration

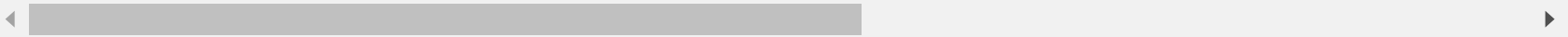
- I started by looking at the first and last few values (`head()` and `tail()`) of the dataset as well as the summary and a descriptive statistic of the available numerical columns using the `info()` and `describe()` functions.

```
In [61]: df.head()
```

Out[61]:

	Region	Province	Mun	concat	MunCode_New	MunCode_Old	Total Number \nof Households*	Own Use Faucet, Community Water System	Shared Faucet, Community Water System	Own Use Tubed/Pipe Deep Wel
0	NATIONAL CAPITAL REGION (NCR)	NCR, City of Manila, First District (Not a Province)	CITY OF MANILA	NATIONAL CAPITAL REGION (NCR)NCR, City of Mani...	PH1380600000	PH133900000	483261	118315	27775	2805
1	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MANDALUYONG	NATIONAL CAPITAL REGION (NCR)NCR, Second Distr...	PH1380500000	PH137401000	116505	32880	4687	426
2	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MARIKINA	NATIONAL CAPITAL REGION (NCR)NCR, Second Distr...	PH1380700000	PH137402000	104404	47226	4447	762
3	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF PASIG	NATIONAL CAPITAL REGION (NCR)NCR, Second Distr...	PH1381200000	PH137403000	212864	89493	6025	1428
4	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	QUEZON CITY	NATIONAL CAPITAL REGION (NCR)NCR, Second Distr...	PH1381300000	PH137404000	738330	309249	36489	4594

5 rows × 22 columns

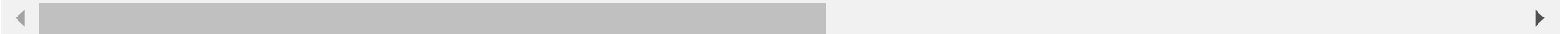


```
In [62]: df.tail()
```

```
Out[62]:
```

	Region	Province	Mun	concat	MunCode_New	MunCode_Old	Total Number \nof Households*	Own Use Faucet, Community Water System	Shared Faucet, Community Water System
1637	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	INTERIM PROVINCE	MIDSAYAP CLUSTER II	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	PH1999904000	NaN	4274	212	286
1638	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	INTERIM PROVINCE	PIGcAWAYAN CLUSTER	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	PH1999905000	NaN	4356	192	560
1639	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	INTERIM PROVINCE	PIKIT CLUSTER I	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	PH1999906000	NaN	8935	176	143
1640	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	INTERIM PROVINCE	PIKIT CLUSTER II	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	PH1999907000	NaN	7978	34	39
1641	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	INTERIM PROVINCE	PIKIT CLUSTER III	BANGSAMORO AUTONOMOUS REGION IN MUSLIM MINDANA...	PH1999908000	NaN	6566	16	494

5 rows × 22 columns




```
In [63]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1642 entries, 0 to 1641
Data columns (total 22 columns):
#   Column                                                                 Non-Null Count  Dtype
---  -
0   Region                                                                1642 non-null  object
1   Province                                                             1642 non-null  object
2   Mun                                                                  1642 non-null  object
3   concat                                                                1642 non-null  object
4   MunCode_New                                                           1642 non-null  object
5   MunCode_Old                                                           1634 non-null  object
6   Total Number of Households*                                         1642 non-null  int64
7   Own Use Faucet, Community Water System                             1642 non-null  int64
8   Shared Faucet, Community Water System                             1642 non-null  int64
9   Own Use Tubed/Piped Deep Well                                       1642 non-null  int64
10  Shared Tubed/Piped Deep Well                                         1642 non-null  int64
11  Tubed/Piped Shallow Well                                             1642 non-null  int64
12  Protected Well                                                       1642 non-null  int64
13  Unprotected Well                                                     1642 non-null  int64
14  Protected Spring                                                     1642 non-null  int64
15  Unprotected Spring                                                   1642 non-null  int64
16  Rainwater                                                            1642 non-null  int64
17  Surface Watera                                                       1642 non-null  int64
18  Peddler Includes tanker-truck and cart with small tank             1642 non-null  int64
19  Water Refilling Station                                              1642 non-null  int64
20  Bottled Water                                                         1642 non-null  int64
21  Others                                                                1642 non-null  int64
dtypes: int64(16), object(6)
memory usage: 282.3+ KB
```

```
In [64]: df.describe()
```

Out[64]:

	Total Number Households*	Own Use Faucet, Community Water System	Shared Faucet, Community Water System	Own Use Tubed/Piped Deep Well	Shared Tubed/Piped Deep Well	Tubed/Piped Shallow Well	Protected Well	Unprotected Well	Protected Spring
count	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000
mean	16062.517052	3541.592570	1537.856273	644.468940	869.188794	222.572473	491.906821	166.775274	539.623021
std	35028.096284	12959.399786	2682.901522	965.179271	1104.238682	339.419088	780.860390	357.021281	826.273025
min	35.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000
25%	4968.500000	452.500000	351.250000	71.000000	127.000000	25.000000	56.250000	8.000000	40.000000
50%	8582.000000	1230.500000	910.000000	272.000000	484.000000	102.000000	212.500000	42.000000	232.500000
75%	15390.000000	2986.250000	1882.750000	807.750000	1184.750000	285.000000	602.000000	164.000000	706.500000
max	738330.000000	309249.000000	57556.000000	8529.000000	10834.000000	4530.000000	8471.000000	5962.000000	12553.000000



Handling Missing Values

- Checking if there are null values within the dataset and handling them accordingly such as replacing their values with 0 or removing them completely.


```
In [65]: df.isnull().sum()
```

```
Out[65]: Region                                0
Province                                      0
Mun                                           0
concat                                       0
MunCode_New                                0
MunCode_Old                                8
Total Number \nof Households*              0
Own Use Faucet, Community Water System      0
Shared Faucet, Community Water System       0
Own Use Tubed/Piped Deep Well               0
Shared Tubed/Piped Deep Well                0
Tubed/Piped Shallow Well                    0
Protected Well                              0
Unprotected Well                            0
Protected Spring                            0
Unprotected Spring                          0
Rainwater                                   0
Surface Watera                              0
Peddler Includes tanker-truck and cart with small tank 0
Water Refilling Station                     0
Bottled Water                               0
Others                                       0
dtype: int64
```

- There are null values in the MunCode_Old column which I think should be removed for it is no longer relevant in the code anymore leaving us with a dataset that has no null values. I also dropped the concat column for it's only the region and municipality joined together.

```
In [66]: # no. of null values in the MunCode_Old column
df['MunCode_Old'].isnull().sum()
```

```
Out[66]: 8
```

```
In [67]: # dropping both concat and MunCode_Old column
df.drop(['concat', 'MunCode_Old'], axis=1, inplace=True)
df.head()
```

Out[67]:

	Region	Province	Mun	MunCode_New	Total Number \nof Households*	Own Use Faucet, Community Water System	Shared Faucet, Community Water System	Own Use Tubed/Piped Deep Well	Shared Tubed/Piped Deep Well	Tubed/Piped Shallow Well
0	NATIONAL CAPITAL REGION (NCR)	NCR, City of Manila, First District (Not a Pro...	CITY OF MANILA	PH1380600000	483261	118315	27775	2809	1304	310
1	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MANDALUYONG	PH1380500000	116505	32880	4687	426	63	150
2	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MARIKINA	PH1380700000	104404	47226	4447	762	70	64
3	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF PASIG	PH1381200000	212864	89493	6025	1428	240	139
4	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	QUEZON CITY	PH1381300000	738330	309249	36489	4594	2719	633

```
In [68]: # there are no more null values left
df.isnull().sum().sum()
```

Out[68]: 0

```
In [69]: df.columns
```

```
Out[69]: Index(['Region', 'Province', 'Mun', 'MunCode_New',
               'Total Number \nof Households*',
               'Own Use Faucet, Community Water System',
               'Shared Faucet, Community Water System',
               'Own Use Tubed/Piped Deep Well', 'Shared Tubed/Piped Deep Well',
               'Tubed/Piped Shallow Well', 'Protected Well', 'Unprotected Well',
               'Protected Spring', 'Unprotected Spring', 'Rainwater', 'Surface Watera',
               'Peddler Includes tanker-truck and cart with small tank ',
               'Water Refilling Station', 'Bottled Water', 'Others'],
              dtype='object')
```

- Setting the MunCode_New column the index for each element has it's unique Municipality Code.

```
In [70]: # setting the MunCode_New column as the new index
df.set_index('MunCode_New', inplace=True)
df.head()
```

Out[70]:

	Region	Province	Mun	Total Number \nof Households*	Own Use Faucet, Community Water System	Shared Faucet, Community Water System	Own Use Tubed/Piped Deep Well	Shared Tubed/Piped Deep Well	Tubed/Piped Shallow Well	F
MunCode_New										
PH1380600000	NATIONAL CAPITAL REGION (NCR)	NCR, City of Manila, First District (Not a Pro...	CITY OF MANILA	483261	118315	27775	2809	1304	310	
PH1380500000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MANDALUYONG	116505	32880	4687	426	63	150	
PH1380700000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MARIKINA	104404	47226	4447	762	70	64	
PH1381200000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF PASIG	212864	89493	6025	1428	240	139	
PH1381300000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	QUEZON CITY	738330	309249	36489	4594	2719	633	

```
In [84]: # renaming one of the columns
df.rename(
    columns={
        'Total Number \nof Households*': 'Total Number of Households'
    },
    inplace=True
)
df.head()
```

Out[84]:

	Region	Province	Mun	Total Number of Households	Own Use Faucet, Community Water System	Shared Faucet, Community Water System	Own Use Tubed/Piped Deep Well	Shared Tubed/Piped Deep Well	Tubed/Piped Shallow Well	Pi
MunCode_New										
PH1380600000	NATIONAL CAPITAL REGION (NCR)	NCR, City of Manila, First District (Not a Pro...	CITY OF MANILA	483261	118315	27775	2809	1304	310	
PH1380500000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MANDALUYONG	116505	32880	4687	426	63	150	
PH1380700000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MARIKINA	104404	47226	4447	762	70	64	
PH1381200000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF PASIG	212864	89493	6025	1428	240	139	
PH1381300000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	QUEZON CITY	738330	309249	36489	4594	2719	633	

- Deciding whether or not I should replace the columns whose datatypes are objects to be represented as integers.
- There are 3 columns whose datatype is object (Region, Provincem and Mun/Municipality). Since these columns represent no inherent ordering, I decided to leave them as is.

```
In [85]: df.dtypes
```

```
Out[85]: Region                object
Province                object
Mun                    object
Total Number of Households    int64
Own Use Faucet, Community Water System    int64
Shared Faucet, Community Water System    int64
Own Use Tubed/Piped Deep Well    int64
Shared Tubed/Piped Deep Well    int64
Tubed/Piped Shallow Well    int64
Protected Well    int64
Unprotected Well    int64
Protected Spring    int64
Unprotected Spring    int64
Rainwater    int64
Surface Watera    int64
Peddler Includes tanker-truck and cart with small tank    int64
Water Refilling Station    int64
Bottled Water    int64
Others    int64
dtype: object
```

```
In [86]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Index: 1642 entries, PH1380600000 to PH1999908000
Data columns (total 19 columns):
#   Column                                                                 Non-Null Count  Dtype
---  -
0   Region                                                                1642 non-null   object
1   Province                                                             1642 non-null   object
2   Mun                                                                  1642 non-null   object
3   Total Number of Households                                           1642 non-null   int64
4   Own Use Faucet, Community Water System                             1642 non-null   int64
5   Shared Faucet, Community Water System                               1642 non-null   int64
6   Own Use Tubed/Piped Deep Well                                         1642 non-null   int64
7   Shared Tubed/Piped Deep Well                                         1642 non-null   int64
8   Tubed/Piped Shallow Well                                              1642 non-null   int64
9   Protected Well                                                        1642 non-null   int64
10  Unprotected Well                                                      1642 non-null   int64
11  Protected Spring                                                       1642 non-null   int64
12  Unprotected Spring                                                     1642 non-null   int64
13  Rainwater                                                              1642 non-null   int64
14  Surface Watera                                                         1642 non-null   int64
15  Peddler Includes tanker-truck and cart with small tank              1642 non-null   int64
16  Water Refilling Station                                                1642 non-null   int64
17  Bottled Water                                                         1642 non-null   int64
18  Others                                                                1642 non-null   int64
dtypes: int64(16), object(3)
memory usage: 321.1+ KB
```



```
In [87]: df.isnull().sum()
```

```
Out[87]: Region                                0
Province                                       0
Mun                                            0
Total Number of Households                   0
Own Use Faucet, Community Water System       0
Shared Faucet, Community Water System        0
Own Use Tubed/Piped Deep Well                0
Shared Tubed/Piped Deep Well                 0
Tubed/Piped Shallow Well                     0
Protected Well                               0
Unprotected Well                             0
Protected Spring                             0
Unprotected Spring                           0
Rainwater                                    0
Surface Watera                               0
Peddler Includes tanker-truck and cart with small tank 0
Water Refilling Station                      0
Bottled Water                                0
Others                                        0
dtype: int64
```

```
In [88]: df.dtypes
```

```
Out[88]: Region                object  
Province                object  
Mun                    object  
Total Number of Households    int64  
Own Use Faucet, Community Water System    int64  
Shared Faucet, Community Water System    int64  
Own Use Tubed/Piped Deep Well    int64  
Shared Tubed/Piped Deep Well    int64  
Tubed/Piped Shallow Well    int64  
Protected Well    int64  
Unprotected Well    int64  
Protected Spring    int64  
Unprotected Spring    int64  
Rainwater    int64  
Surface Watera    int64  
Peddler Includes tanker-truck and cart with small tank    int64  
Water Refilling Station    int64  
Bottled Water    int64  
Others    int64  
dtype: object
```

- Having a cleaned dataset.

```
In [89]: cleaned_df = df
cleaned_df.head()
```

Out[89]:

	Region	Province	Mun	Total Number of Households	Own Use Faucet, Community Water System	Shared Faucet, Community Water System	Own Use Tubed/Piped Deep Well	Shared Tubed/Piped Deep Well	Tubed/Piped Shallow Well	Pi
MunCode_New										
PH1380600000	NATIONAL CAPITAL REGION (NCR)	NCR, City of Manila, First District (Not a Pro...	CITY OF MANILA	483261	118315	27775	2809	1304	310	
PH1380500000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MANDALUYONG	116505	32880	4687	426	63	150	
PH1380700000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF MARIKINA	104404	47226	4447	762	70	64	
PH1381200000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	CITY OF PASIG	212864	89493	6025	1428	240	139	
PH1381300000	NATIONAL CAPITAL REGION (NCR)	NCR, Second District (Not a Province)	QUEZON CITY	738330	309249	36489	4594	2719	633	

```
In [90]: # descriptive statistics of the cleaned data (numerical columns only)
cleaned_df.describe()
```

Out[90]:

	Total Number of Households	Own Use Faucet, Community Water System	Shared Faucet, Community Water System	Own Use Tubed/Piped Deep Well	Shared Tubed/Piped Deep Well	Tubed/Piped Shallow Well	Protected Well	Unprotected Well	Protected Spring
count	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000	1642.000000
mean	16062.517052	3541.592570	1537.856273	644.468940	869.188794	222.572473	491.906821	166.775274	539.623021
std	35028.096284	12959.399786	2682.901522	965.179271	1104.238682	339.419088	780.860390	357.021281	826.273025
min	35.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000
25%	4968.500000	452.500000	351.250000	71.000000	127.000000	25.000000	56.250000	8.000000	40.000000
50%	8582.000000	1230.500000	910.000000	272.000000	484.000000	102.000000	212.500000	42.000000	232.500000
75%	15390.000000	2986.250000	1882.750000	807.750000	1184.750000	285.000000	602.000000	164.000000	706.500000
max	738330.000000	309249.000000	57556.000000	8529.000000	10834.000000	4530.000000	8471.000000	5962.000000	12553.000000

Analysis

- Understanding the distribution and characteristics of each feature as well as analyzing the relationship between multiple variables and plotting them to further visualize their relationship.

```
In [91]: cleaned_df.columns
```

Out[91]: Index(['Region', 'Province', 'Mun', 'Total Number of Households',
'Own Use Faucet, Community Water System',
'Shared Faucet, Community Water System',
'Own Use Tubed/Piped Deep Well', 'Shared Tubed/Piped Deep Well',
'Tubed/Piped Shallow Well', 'Protected Well', 'Unprotected Well',
'Protected Spring', 'Unprotected Spring', 'Rainwater', 'Surface Watera',
'Peddler Includes tanker-truck and cart with small tank ',
'Water Refilling Station', 'Bottled Water', 'Others'],
dtype='object')

- This heatmap tells us the activity of the data. The highest values is 1 and the rest are below it but not less than 0.

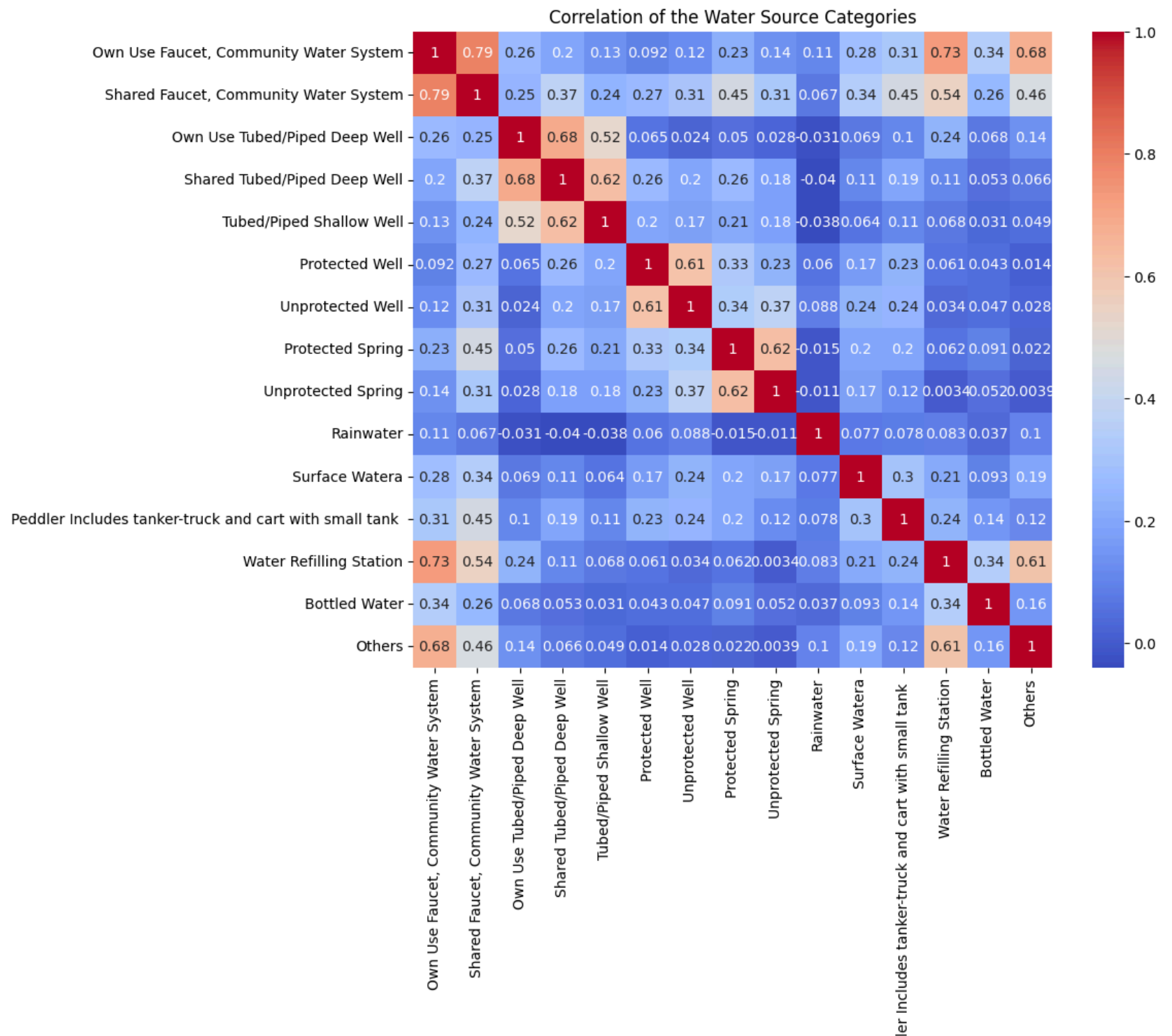
```
In [105]: import seaborn as sns
import matplotlib.pyplot as plt

# columns I want to use correlation analysis with (water sources)
sources_columns = ['Own Use Faucet, Community Water System', 'Shared Faucet, Community Water System',
                  'Own Use Tubed/Piped Deep Well', 'Shared Tubed/Piped Deep Well',
                  'Tubed/Piped Shallow Well', 'Protected Well', 'Unprotected Well',
                  'Protected Spring', 'Unprotected Spring', 'Rainwater', 'Surface Watera',
                  'Peddler Includes tanker-truck and cart with small tank ',
                  'Water Refilling Station', 'Bottled Water', 'Others']

# correlation matrix
corr_matrix = cleaned_df[sources_columns].corr()

# using heatmap to visualize it
plt.figure(figsize=(10, 8))
sns.heatmap(corr_matrix, annot=True, cmap='coolwarm')
plt.title('Correlation of the Water Source Categories')
```

```
Out[105]: Text(0.5, 1.0, 'Correlation of the Water Source Categories')
```



```
In [100]: # using bar plot to visualize the water source across the regions
plt.figure(figsize=(8, 6))
sns.lineplot(x='Region', y='Own Use Faucet, Community Water System', data=df, estimator='count', ci=None)
plt.title('Distribution of Own Use Faucet, Community Water System across Regions')
plt.xlabel('Region')
plt.ylabel('Count')
plt.xticks(rotation=45)
plt.legend(title='Water Source')
```

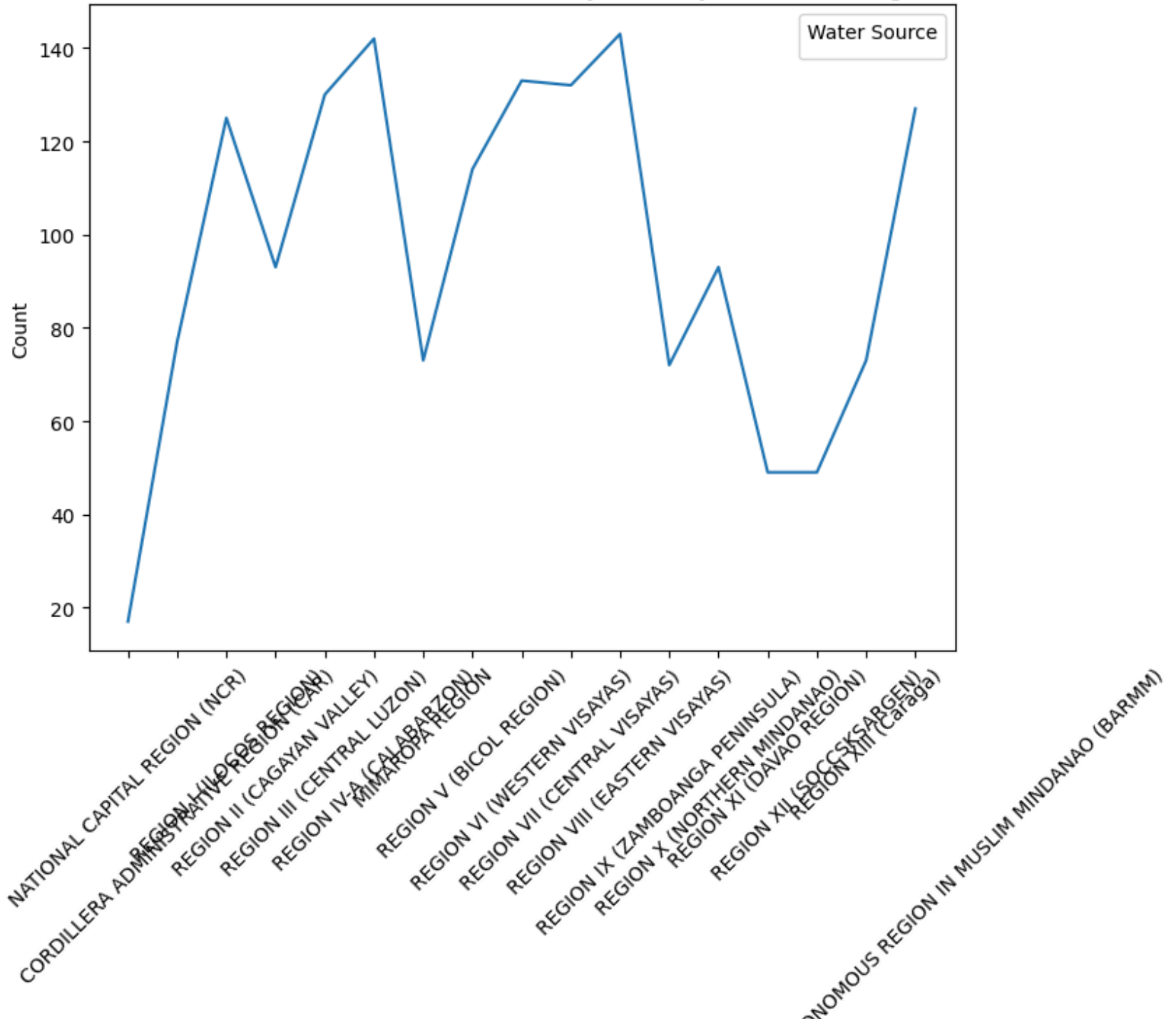
<ipython-input-100-f0069355c1a4>:3: FutureWarning:

The `ci` parameter is deprecated. Use `errorbar=None` for the same effect.

```
sns.lineplot(x='Region', y='Own Use Faucet, Community Water System', data=df, estimator='count', ci=None)
WARNING:matplotlib.legend:No artists with labels found to put in legend. Note that artists whose label start with an underscore are ignored when legend() is called with no argument.
```

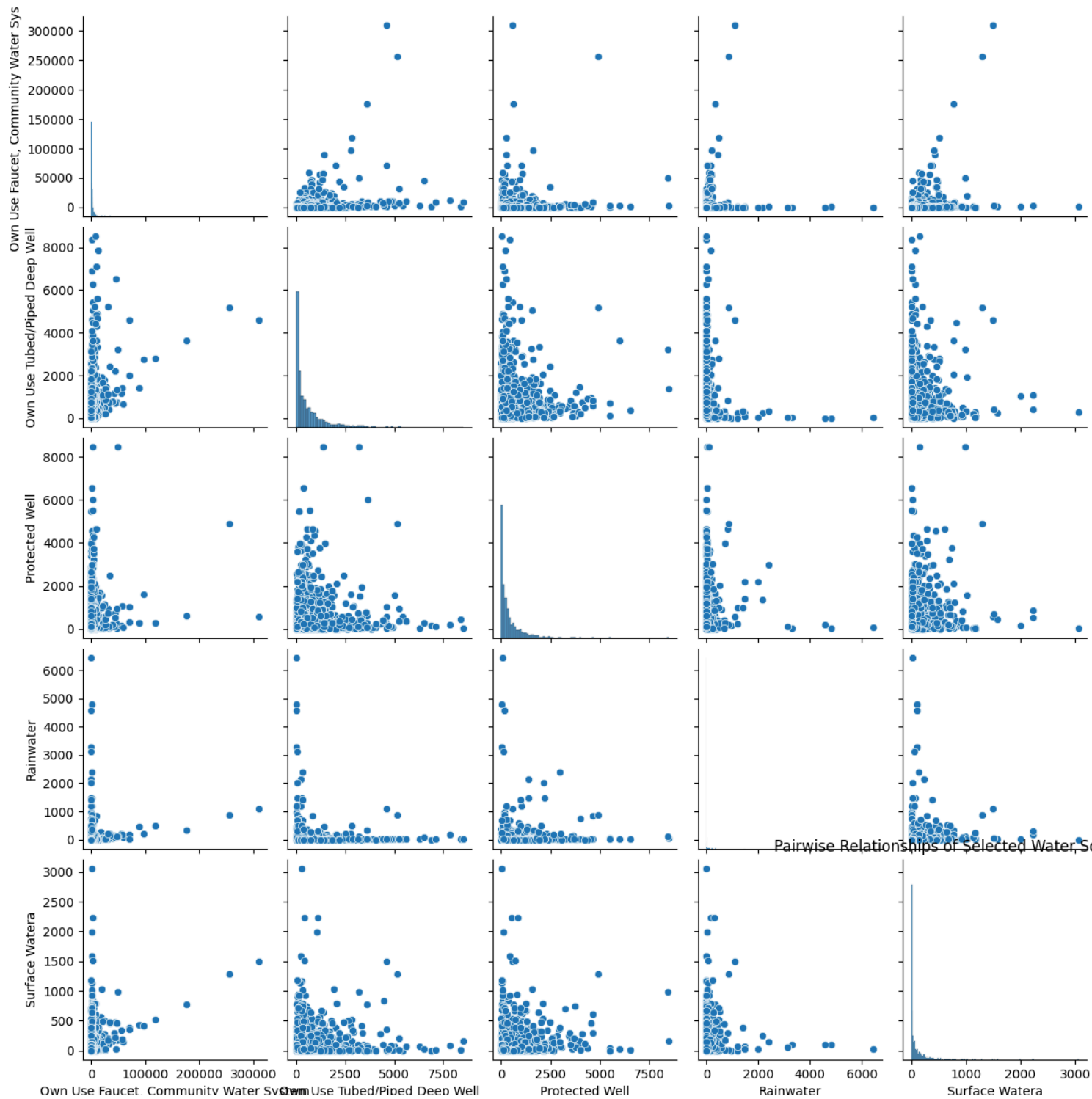
Out[100]: <matplotlib.legend.Legend at 0x780b422703d0>

Distribution of Own Use Faucet, Community Water System across Regions



Region

BANGSAMORO AUTO.



Pairwise Relationships of Selected Water Source Categories

- Visualization of the summary statistics.