CaseStudy-WaterQuality

May 9, 2023

The case study deals with Water quality data, there are actually six water samples involved. And in all the six samples the test to evaluate the parameters pH,EC,TDS,BOD and COD are repeated for three times and the readings are saved. Mean value and standard deviation value of the three test repetition has been calculated and recorded.

- 1. pH Potential of Hydrogen. This is a measure of how acidic/basic the water is. The range goes from 0 to 14, with 7 being neutral. pH < 7 is acidic and pH > 7 is base.
- 2. EC Electrical Conductivity. This is a measure of Water's ability to conduct electricity. The normal range for purified drinking water ranges from 0.5 to 3 μS/cm(millimhos/cm).
- 3. TDS Total Dissolved Solids. This refers to the total concentration of dissolved substances in drinking water. Normal TDS value for purified drinking water is under 25 ppm (parts per milligram).
- 4. BOD Biological Oxygen Demand. This is a measure of the amount of oxygen required to remove waste organic matter from water in the process of decomposition by aerobic bacteria. Aerobic bacteria lives only in an environment containing oxygen. Normal drinking water has a BOD level of 1 2 ppm (parts per milligram)
- 5. COD Chemical Oxygen Demand. This is a water quality measure used not only to determine the amount of biologicaly active substances such as bacteria but also biologically inactive organic matter in water. It is an important amd rapidly measured variable for characterising water bodies, sewage, industrial wastes and treatment plant effluents.

Our main aim is to find out the correlation between pH values and other the numerical columns.

Import the Excel sheet containing the required data for water quality analysis and display the data present in the sheet.

	Parameter	Unit	S-1	S-2	S-3	S-4	S-5	S-6
0	pH-1	none	8.70	8.60	8.70	8.36	8.80	9.16
1	pH-2	none	8.92	8.61	8.48	8.42	8.41	8.52
2	рН-3	none	7.80	7.43	7.75	8.62	9.37	9.38
3	Mean	NaN	8.50	8.20	8.20	8.40	8.80	9.00
4	SD	NaN	0.48	0.56	0.17	0.12	0.36	0.38
5	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
6	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
7	EC-1	μS/cm	3130.00	12440.00	2340.00	14690.00	9130.00	7790.00
8	EC-2	μS/cm	3310.00	10340.00	4470.00	15210.00	4580.00	4760.00
9	EC-3	μS/cm	4580.00	13750.00	1880.00	18570.00	4480.00	4160.00

10	Mean	NaN	3673.30	12176.60	2896.70	16156.70	6063.30	5570.00
11	SD	NaN	645.30	1404.50	1128.30	1719.60	2168.80	1588.80
12	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
13	TDS-1	mg/L	2000.00	8512.00	1490.00	9956.00	5850.00	5380.00
14	TDS-2	mg/L	2280.00	6750.00	2930.00	2750.00	3001.00	3110.00
15	TDS-3	mg/L	1230.00	8900.00	2270.00	2930.00	9960.00	4460.00
16	Mean	NaN	1836.70	8054.00	6690.00	5212.00	6270.30	4316.70
17	SD	NaN	443.90	935.60	588.60	3355.30	2856.50	932.20
18	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
19	BOD-1	mg/L	16.00	15.00	31.00	12.00	24.00	38.00
20	B0D-2	mg/L	18.00	20.00	22.00	18.00	32.00	22.00
21	B0D-3	mg/L	80.00	80.00	72.00	58.00	60.00	48.00
22	Mean	NaN	38.00	38.30	41.70	29.30	38.70	36.00
23	SD	NaN	29.70	29.50	21.80	20.40	15.40	10.70
24	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
25	COD-1	mg/L	323.00	282.00	229.00	217.00	175.00	161.00
26	COD-2	mg/L	312.00	201.00	105.00	97.00	63.20	46.40
27	COD-3	mg/L	548.00	391.00	229.00	201.00	180.00	135.00
28	Mean	NaN	394.30	291.30	187.70	171.70	139.40	342.40
29	SD	NaN	108.80	77.80	58.50	53.20	53.90	49.10

Below given is the number null values in the imported dataset.

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	Parameter	Unit	S-1	S-2	S-3	S-4	S-5	S-6
0	pH-1	none	8.70	8.60	8.70	8.36	8.80	9.16
1	pH-2	none	8.92	8.61	8.48	8.42	8.41	8.52
2	рН-3	none	7.80	7.43	7.75	8.62	9.37	9.38
3	Mean	NaN	8.50	8.20	8.20	8.40	8.80	9.00
4	SD	NaN	0.48	0.56	0.17	0.12	0.36	0.38
5	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
6	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
7	EC-1	μS/cm	3130.00	12440.00	2340.00	14690.00	9130.00	7790.00
8	EC-2	μS/cm	3310.00	10340.00	4470.00	15210.00	4580.00	4760.00
9	EC-3	$\mu \text{S/cm}$	4580.00	13750.00	1880.00	18570.00	4480.00	4160.00
10	Mean	NaN	3673.30	12176.60	2896.70	16156.70	6063.30	5570.00
11	SD	NaN	645.30	1404.50	1128.30	1719.60	2168.80	1588.80
12	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN

13	TDS-1	mg/L	2000.00	8512.00	1490.00	9956.00	5850.00	5380.00
14	TDS-2	mg/L	2280.00	6750.00	2930.00	2750.00	3001.00	3110.00
15	TDS-3	mg/L	1230.00	8900.00	2270.00	2930.00	9960.00	4460.00
16	Mean	${\tt NaN}$	1836.70	8054.00	6690.00	5212.00	6270.30	4316.70
17	SD	NaN	443.90	935.60	588.60	3355.30	2856.50	932.20
18	NaN	${\tt NaN}$	NaN	NaN	NaN	NaN	NaN	NaN
19	BOD-1	mg/L	16.00	15.00	31.00	12.00	24.00	38.00
20	B0D-2	mg/L	18.00	20.00	22.00	18.00	32.00	22.00
21	B0D-3	mg/L	80.00	80.00	72.00	58.00	60.00	48.00
22	Mean	${\tt NaN}$	38.00	38.30	41.70	29.30	38.70	36.00
23	SD	${\tt NaN}$	29.70	29.50	21.80	20.40	15.40	10.70
24	NaN	${\tt NaN}$	NaN	NaN	NaN	NaN	NaN	NaN
25	COD-1	mg/L	323.00	282.00	229.00	217.00	175.00	161.00
26	COD-2	mg/L	312.00	201.00	105.00	97.00	63.20	46.40
27	COD-3	mg/L	548.00	391.00	229.00	201.00	180.00	135.00
28	Mean	${\tt NaN}$	394.30	291.30	187.70	171.70	139.40	342.40
29	SD	NaN	108.80	77.80	58.50	53.20	53.90	49.10

Unit column needs to be removed, since it is no longer required for our analysis.

The dataset looks like below mentioned one after removing unit column

	Parameter	S-1	S-2	S-3	S-4	S-5	S-6
0	pH-1	8.70	8.60	8.70	8.36	8.80	9.16
1	pH-2	8.92	8.61	8.48	8.42	8.41	8.52
2	рН-3	7.80	7.43	7.75	8.62	9.37	9.38
3	Mean	8.50	8.20	8.20	8.40	8.80	9.00
4	SD	0.48	0.56	0.17	0.12	0.36	0.38

For the benefit of our analysis, the dataset WaterQuality is being transposed. And the data is displayed below for better understanding.

		0 :	1 2	3	4	5	6	7		8		9	\
Parameter	рΗ	-1 pH	-2 pH-3	Mean	SD	NaN	NaN	EC-1	EC	-2	E	C-3	
S-1	8	.7 8.9	7.8	8.5	0.48	NaN	NaN	3130.0	3310	.0	4580	0.0	
S-2	8	.6 8.6	31 7.43	8.2	0.56	NaN	NaN	12440.0	10340	.0	13750	0.0	
S-3	8	.7 8.4	18 7.75	8.2	0.17	NaN	NaN	2340.0	4470	.0	1880	0.0	
S-4	8.	36 8.4	12 8.62	8.4	0.12	NaN	NaN	14690.0	15210	.0	18570	0.0	
S-5	8	.8 8.4	11 9.37	8.8	0.36	NaN	NaN	9130.0	4580	.0	4480	0.0	
S-6	9.	16 8.	52 9.38	9.0	0.38	NaN	NaN	7790.0	4760	.0	4160	0.0	
		20	21	22	23	24	25	26	27		28 `	\	
Parameter		BOD-2	BOD-3	Mean	SD	NaN	COD-1	COD-2	COD-3	Me	an		
S-1		18.0	80.0	38.0	29.7	NaN	323.0	312.0	548.0	394	.3		
S-2		20.0	80.0	38.3	29.5	NaN	282.0	201.0	391.0	291	.3		
S-3		22.0	72.0	41.7	21.8	NaN	229.0	105.0	229.0	187	.7		
S-4		18.0	58.0	29.3	20.4	NaN	217.0	97.0	201.0	171	.7		
S-5	•••	32.0	60.0	38.7	15.4	NaN	175.0	63.2	180.0	139	.4		

```
S-6 ... 22.0 48.0 36.0 10.7 NaN 161.0 46.4 135.0 342.4
```

	29
Parameter	SD
S-1	108.8
S-2	77.8
S-3	58.5
S-4	53.2
S-5	53.9
S-6	49.1

[7 rows x 30 columns]

Since we have transposed the dataset, Now we have need to convert the First row as column header and delete the first row.

Parameter	pH-1	pH-2	рН-3	Mean	SD	NaN	NaN	EC-	1 E	C-2	EC-3	\
S-1	8.7	8.92	7.8	8.5	0.48	NaN	${\tt NaN}$	3130.	0 331	0.0	4580.0	
S-2	8.6	8.61	7.43	8.2	0.56	NaN	${\tt NaN}$	12440.	0 1034	0.0	13750.0	
S-3	8.7	8.48	7.75	8.2	0.17	NaN	NaN	2340.	0 447	0.0	1880.0	
S-4	8.36	8.42	8.62	8.4	0.12	NaN	${\tt NaN}$	14690.	0 1521	0.0	18570.0	
S-5	8.8	8.41	9.37	8.8	0.36	NaN	${\tt NaN}$	9130.	0 458	0.0	4480.0	
S-6	9.16	8.52	9.38	9.0	0.38	NaN	${\tt NaN}$	7790.	0 476	0.0	4160.0	
Parameter	BOI)-2 BOD	-3 Me	ean	SD 1	NaN	COD-1	COD-2	COD-3	Mean	n SD	
S-1	18	3.0 80	.0 38	3.0 2	9.7	NaN	323.0	312.0	548.0	394.	3 108.8	
S-2	20	0.0 80	.0 38	3.3 2	9.5	NaN	282.0	201.0	391.0	291.	3 77.8	
S-3	22	2.0 72	.0 4	1.7 2	1.8	NaN	229.0	105.0	229.0	187.	7 58.5	
S-4	18	3.0 58	.0 29	9.3 2	0.4	NaN	217.0	97.0	201.0	171.	7 53.2	
S-5	32	2.0 60	.0 38	3.7 1	5.4	NaN	175.0	63.2	180.0	139.	4 53.9	
S-6	22	2.0 48	3.0 36	3.0 1	0.7	NaN	161.0	46.4	135.0	342.	4 49.1	

[6 rows x 30 columns]

The dataset after deleting the NULL values across rows and columns.

Parameter	pH-1	pH-2	рН-3	Mean	SD	EC-	-1	EC-2	EC-3	Mean	\
S-1	8.7	8.92	7.8	8.5	0.48	3130	.0 3	3310.0	4580.0	3673.3	
S-2	8.6	8.61	7.43	8.2	0.56	12440	.0 10	340.0	13750.0	12176.6	
S-3	8.7	8.48	7.75	8.2	0.17	2340	.0 4	1470.0	1880.0	2896.7	
S-4	8.36	8.42	8.62	8.4	0.12	14690	.0 15	210.0	18570.0	16156.7	
S-5	8.8	8.41	9.37	8.8	0.36	9130	.0 4	1580.0	4480.0	6063.3	
S-6	9.16	8.52	9.38	9.0	0.38	7790	.0 4	1760.0	4160.0	5570.0	
Parameter	S	D E	30D-1	B0D-2	BOD-3	Mean	SD	COD-1	COD-2	COD-3 \	
S-1	645.	3	16.0	18.0	80.0	38.0	29.7	323.0	312.0	548.0	
S-2	1404.	5	15.0	20.0	80.0	38.3	29.5	282.0	201.0	391.0	
S-3	1128.	3	31.0	22.0	72.0	41.7	21.8	229.0	105.0	229.0	

```
S-4
          1719.6 ... 12.0 18.0 58.0
                                       29.3 20.4 217.0
                                                          97.0 201.0
S-5
          2168.8
                     24.0
                           32.0 60.0
                                       38.7
                                             15.4
                                                  175.0
                                                          63.2 180.0
S-6
          1588.8 ...
                     38.0
                           22.0 48.0
                                       36.0 10.7
                                                  161.0
                                                          46.4 135.0
Parameter
           Mean
                    SD
S-1
          394.3
                 108.8
S-2
          291.3
                  77.8
S-3
          187.7
                  58.5
S-4
          171.7
                  53.2
S-5
          139.4
                  53.9
S-6
          342.4
                  49.1
```

[6 rows x 25 columns]

<class 'pandas.core.frame.DataFrame'>

Index: 6 entries, S-1 to S-6
Data columns (total 25 columns):

#	Column	Non-Null Count	Dtype
0	pH-1	6 non-null	object
1	pH-2	6 non-null	object
2	рН-З	6 non-null	object
3	Mean	6 non-null	object
4	SD	6 non-null	object
5	EC-1	6 non-null	object
6	EC-2	6 non-null	object
7	EC-3	6 non-null	object
8	Mean	6 non-null	object
9	SD	6 non-null	object
10	TDS-1	6 non-null	object
11	TDS-2	6 non-null	object
12	TDS-3	6 non-null	object
13	Mean	6 non-null	object
14	SD	6 non-null	object
15	BOD-1	6 non-null	object
16	BOD-2	6 non-null	object
17	BOD-3	6 non-null	object
18	Mean	6 non-null	object
19	SD	6 non-null	object
20	COD-1	6 non-null	object
21	COD-2	6 non-null	object
22	COD-3	6 non-null	object
23	Mean	6 non-null	object
24	SD	6 non-null	object
_		>	-

dtypes: object(25)
memory usage: 1.2+ KB

Since all the columns are converted as object columns, we need to convert it to float columns to

perform required actions on the numerical columns.

<class 'pandas.core.frame.DataFrame'>

Index: 6 entries, S-1 to S-6
Data columns (total 25 columns):

Data	COLUMNIS	(cotar 25 corum	115).
#	Column	No	on-Null Count	Dtype
0	pH-1	6	non-null	float64
1	pH-2	6	non-null	float64
2	pH-3	6	non-null	float64
3	Mean	6	non-null	float64
4	SD	6	non-null	float64
5	EC-1	6	non-null	float64
6	EC-2	6	non-null	float64
7	EC-3	6	non-null	float64
8	Mean	6	non-null	float64
9	SD	6	non-null	float64
10	TDS-1	6	non-null	float64
11	TDS-2	6	non-null	float64
12	TDS-3	6	non-null	float64
13	Mean	6	non-null	float64
14	SD	6	non-null	float64
15	BOD-1	6	non-null	float64
16	BOD-2	6	non-null	float64
17	BOD-3	6	non-null	float64
18	Mean	6	non-null	float64
19	SD	6	non-null	float64
20	COD-1	6	non-null	float64
21	COD-2	6	non-null	float64
22	COD-3	6	non-null	float64
23	Mean	6	non-null	float64
24	SD	6	non-null	float64
dtvne	es: float	t64	4(25)	

dtypes: float64(25) memory usage: 1.2+ KB

For better readability, the mean and Sd columns are renamed with relevant names. 'pH-Mean', 'pH-SD', 'EC-Mean', 'EC-SD', 'TDS-Mean', 'TDS-SD', 'BOD-Mean', 'BOD-SD', 'COD-Mean', COD-SD'

<class 'pandas.core.frame.DataFrame'>

Index: 6 entries, S-1 to S-6
Data columns (total 25 columns):

#	Column	Non-Null Count	Dtype
0	pH-1	6 non-null	float64
1	pH-2	6 non-null	float64
2	pH-3	6 non-null	float64
3	pH-Mean	6 non-null	float64
4	pH-SD	6 non-null	float64
5	EC-1	6 non-null	float64

```
6 non-null
6
   EC-2
                              float64
7
   EC-3
              6 non-null
                              float64
   EC-Mean
              6 non-null
8
                              float64
9
   EC-SD
              6 non-null
                              float64
10 TDS-1
              6 non-null
                              float64
11 TDS-2
              6 non-null
                              float64
12
   TDS-3
              6 non-null
                              float64
13 TDS-Mean 6 non-null
                              float64
14 TDS-SD
              6 non-null
                              float64
15 BOD-1
              6 non-null
                              float64
16 BOD-2
              6 non-null
                              float64
17
   BOD-3
              6 non-null
                              float64
   BOD-Mean 6 non-null
                              float64
18
   BOD-SD
              6 non-null
                              float64
19
20 COD-1
              6 non-null
                              float64
21 COD-2
              6 non-null
                              float64
22
   COD-3
              6 non-null
                              float64
23 COD-Mean 6 non-null
                              float64
24 COD-SD
              6 non-null
                              float64
```

dtypes: float64(25) memory usage: 1.2+ KB

Correlation Between Mean columns

Parameter	pH-Mean	EC-Mean	TDS-Mean	BOD-Mean	COD-Mean
Parameter					
pH-Mean	1.000000	-0.270410	-0.411112	-0.149625	0.159292
EC-Mean	-0.270410	1.000000	0.340275	-0.785475	-0.286521
TDS-Mean	-0.411112	0.340275	1.000000	0.219680	-0.597765
BOD-Mean	-0.149625	-0.785475	0.219680	1.000000	0.105256
COD-Mean	0.159292	-0.286521	-0.597765	0.105256	1.000000

Heat Map Generated for Mean Columns.

<Axes: xlabel='Parameter', ylabel='Parameter'>



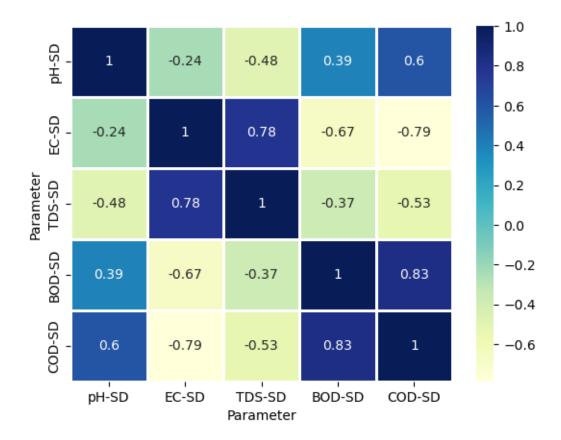
- 1. With respect to pH mean, there is Negative Weak Correlation with EC, BOD & COD. Negative Moderate correlation with TDS.
- 2. With respect to EC mean, there is Negative Weak Correlation with pH & COD. Positive weak correlation with TDS and Negative strong correlation with BOD
- 3. With respect to TDS mean, there is Negative moderate correlation with pH, COD. Positive Moderate correlation with EC and BOD
- 4. With respect to BOD mean, Negative weak correlation with pH, Negative strong correlation with EC, Positive wak correlation with TDS and COD
- 5. With respect to COD mean, there is positive wean correlation with pH & BOD, Negative weak correlation with EC and Negative moderate correlation with TDS.

Correlation Between Standard Deviation columns

Parameter	pH-SD	EC-SD	TDS-SD	BOD-SD	COD-SD
Parameter					
pH-SD	1.000000	-0.239374	-0.484594	0.393452	0.597802
EC-SD	-0.239374	1.000000	0.784072	-0.671500	-0.787522
TDS-SD	-0.484594	0.784072	1.000000	-0.371113	-0.527358
BOD-SD	0.393452	-0.671500	-0.371113	1.000000	0.826020
COD-SD	0.597802	-0.787522	-0.527358	0.826020	1.000000

Heat Map Generated Standard Deviation Mean Columns.

<Axes: xlabel='Parameter', ylabel='Parameter'>

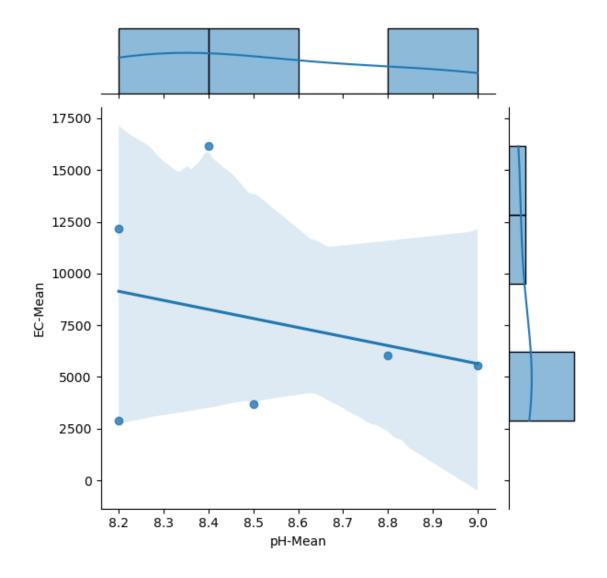


- 1. With respect to pH SD, there is a Negative Weak correlation with EC, Negative Moderate correlation with TDS, Positive Moderate correlation with BOD and Positive Strong correlation with COD.
- 2. With respect to EC SD, there is Negative Weak correlation with pH. Positive Strong correlation with TDS, Negative Strong correlation with BOD and COD
- 3. With respect to TDS SD, there is a Negative moderate correlation with pH & BOD, Positive Strong correlation with EC and Negative strong correlation with COD
- 4. with respect to BOD SD, there is positive Moderate correlation with pH, Negative Strong Correlation with EC, Negative Moderate correlation with TDS and Positive strong correlation with COD.
- 5. With respect to COD SD, there is positive strong correlation with pH & BOD, Negative strong correlation with EC & TDS

Mean values Comparison

Potential of Hydrogen VS Electrical Conductivity

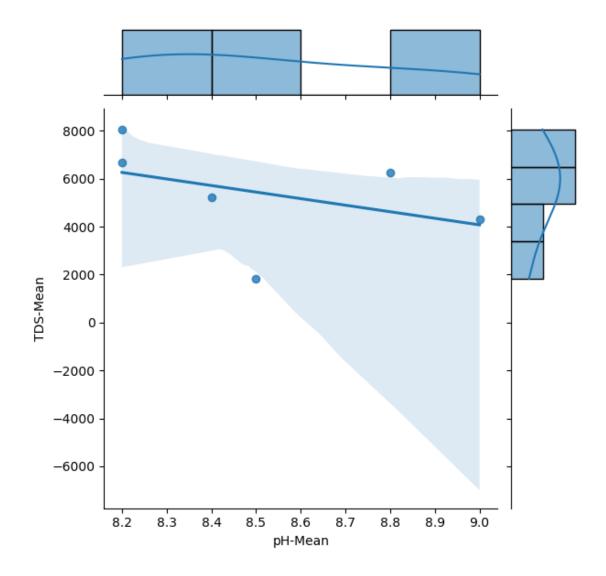
PearsonRResult(statistic=-0.2704097992258808, pvalue=0.604271680754778)



Potential of Hydrogen VS Total Dissolved Solids

PearsonRResult(statistic=-0.4111118465174884, pvalue=0.4180738432750332)

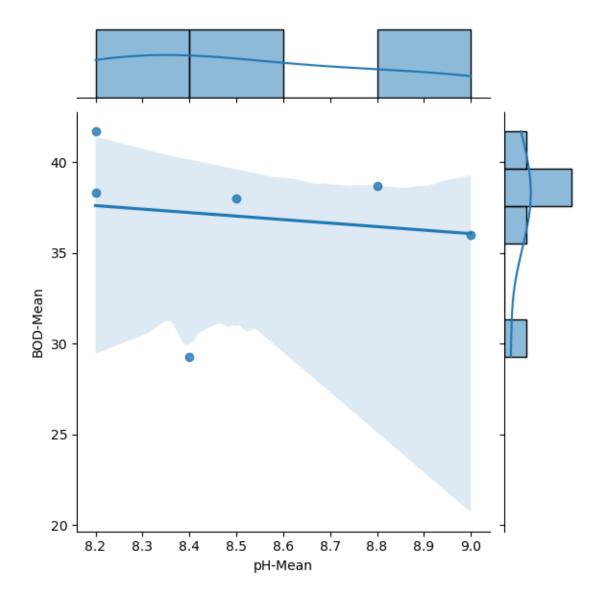
<seaborn.axisgrid.JointGrid at 0x170d94b8c40>



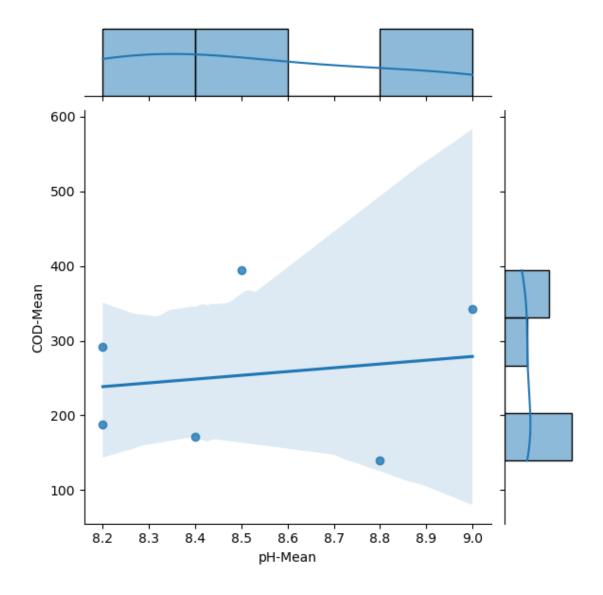
Potential of Hydrogen VS Biological Oxygen Demand

PearsonRResult(statistic=-0.14962479055901207, pvalue=0.7772376824924154)

<seaborn.axisgrid.JointGrid at 0x170d9f1b820>



Potential of Hydrogen VS Chemical Oxygen Demand
PearsonRResult(statistic=0.1592917629600689, pvalue=0.7630832794638668)
<seaborn.axisgrid.JointGrid at 0x170dadd87f0>

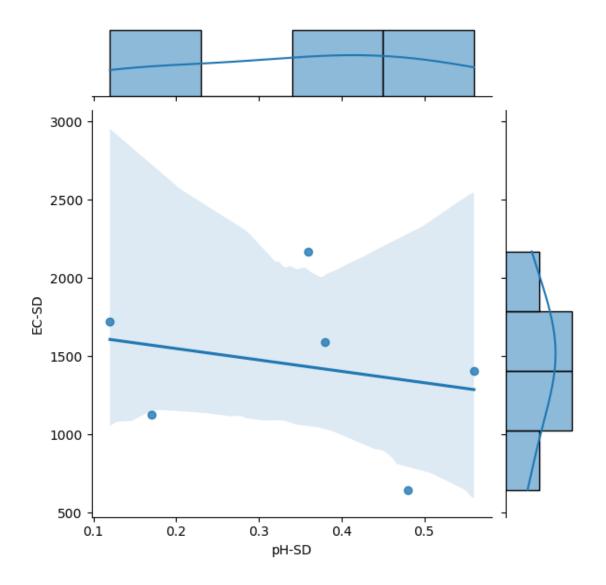


Standard Deviation values Comparison

Potential of Hydrogen VS Electrical Conductivity

PearsonRResult(statistic=-0.23937439009406186, pvalue=0.6477965029401975)

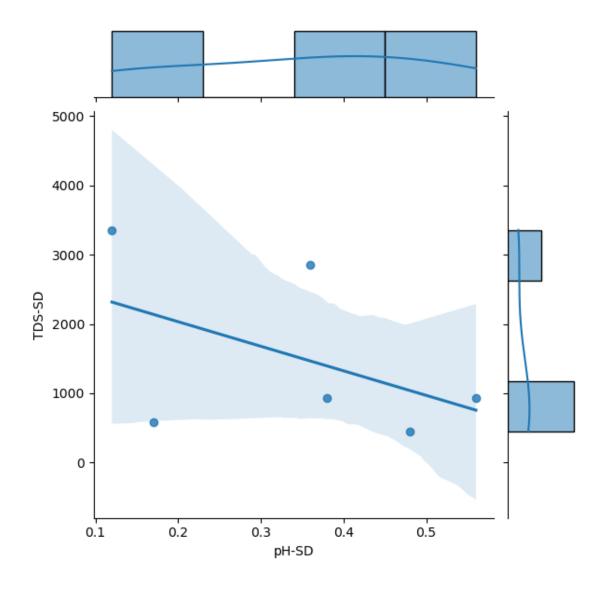
<seaborn.axisgrid.JointGrid at 0x170db8d34c0>



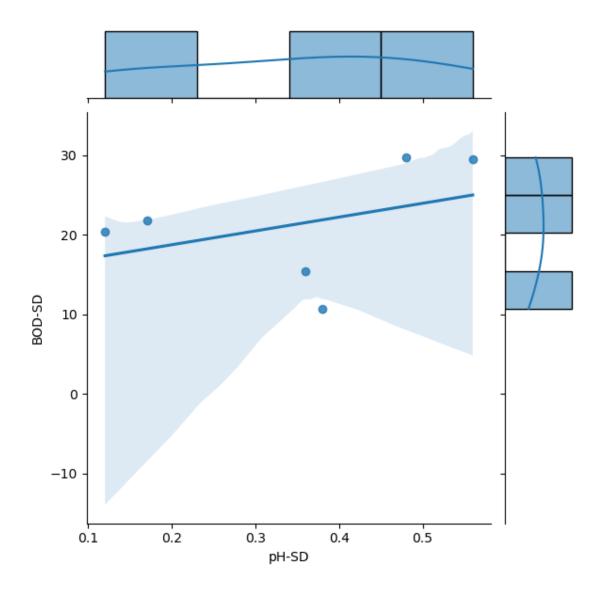
Potential of Hydrogen VS Total Dissolved Solids

PearsonRResult(statistic=-0.48459389393723384, pvalue=0.3300080520935927)

<seaborn.axisgrid.JointGrid at 0x170db93d270>



Potential of Hydrogen VS Biological Oxygen Demand
PearsonRResult(statistic=0.39345150640909626, pvalue=0.44027669117675816)
<seaborn.axisgrid.JointGrid at 0x170dafcb8e0>



Potential of Hydrogen VS Chemical Oxygen Demand

PearsonRResult(statistic=0.5978021544725063, pvalue=0.2101142738704866)

<seaborn.axisgrid.JointGrid at 0x170dc4cc5b0>

