1 C:\Users\DELL\anaconda3\python.exe E:/Golder_Folder/ PycharmProjects2/MichaelProject/main.py 2 Importing Data 3 Data Import Done!! 4Exploring Started 5 Describing Data 6 Describing Done!! 7 Checking Null Values 8 well_code	File - r	nain	
2 Importing Data 3 Data Import Done!! 4Exploring Started	1	C:\Users\DELL\anaco	onda3\python.exe E:/Golder_Folder/
3 Data Import Done!! 4Exploring Started			ichaelProject/main.py
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8 well_code       0         9 date_sampling       0         10 quarter       0         11 type_analyzing       0         12 date_analyzing       0         13 laboratory       5         14 number_analyzing       83         15 na       1         16 k       1         17 ca2       1         18 mg2       1         19 fe3       4         20 fe2       15         21 al3       1         22 nh4       924         23 cl       1         24 so4       1         25 hco3       1         26 co3       1         27 no2       29         28 hardness_general       1         29 no3       9         30 po4       2139         31 hardness_temporal       1	6	Describing Done!!	
9 date_sampling 0 10 quarter 0 11 type_analyzing 0 12 date_analyzing 0 13 laboratory 5 14 number_analyzing 83 15 na 1 16 k 1 17 ca2 1 18 mg2 1 19 fe3 4 20 fe2 15 21 al3 1 22 nh4 924 23 cl 1 24 so4 1 25 hco3 1 26 co3 1 27 no2 29 28 hardness_general 1 29 no3 9 30 po4 2139 31 hardness_temporal 1	7	Checking Null Value	es
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12 date_analyzing 0 13 laboratory 5 14 number_analyzing 83 15 na 1 16 k 1 17 ca2 1 18 mg2 1 19 fe3 4 20 fe2 15 21 al3 1 22 nh4 924 23 cl 1 24 so4 1 25 hco3 1 26 co3 1 27 no2 29 28 hardness_general 1 29 no3 9 30 po4 2139 31 hardness_temporal 1	10	quarter	0
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14 number_analyzing       83         15 na       1         16 k       1         17 ca2       1         18 mg2       1         19 fe3       4         20 fe2       15         21 al3       1         22 nh4       924         23 cl       1         24 so4       1         25 hco3       1         26 co3       1         27 no2       29         28 hardness_general       1         29 no3       9         30 po4       2139         31 hardness_temporal       1	12	date_analyzing	0
15 na	13	laboratory	5
16 k       1         17 ca2       1         18 mg2       1         19 fe3       4         20 fe2       15         21 al3       1         22 nh4       924         23 cl       1         24 so4       1         25 hco3       1         26 co3       1         27 no2       29         28 hardness_general       1         29 no3       9         30 po4       2139         31 hardness_temporal       1	14	number_analyzing	83
17 ca2	15	na	1
18 mg2       1         19 fe3       4         20 fe2       15         21 al3       1         22 nh4       924         23 cl       1         24 so4       1         25 hco3       1         26 co3       1         27 no2       29         28 hardness_general       1         29 no3       9         30 po4       2139         31 hardness_temporal       1	16	k	1
19 fe3	17	ca2	1
20 fe2 15 21 al3 1 22 nh4 924 23 cl 1 24 so4 1 25 hco3 1 26 co3 1 27 no2 29 28 hardness_general 1 29 no3 9 30 po4 2139 31 hardness_temporal 1	18	mg2	1
21 al3       1         22 nh4       924         23 cl       1         24 so4       1         25 hco3       1         26 co3       1         27 no2       29         28 hardness_general       1         29 no3       9         30 po4       2139         31 hardness_temporal       1	19	fe3	4
22 nh4       924         23 cl       1         24 so4       1         25 hco3       1         26 co3       1         27 no2       29         28 hardness_general       1         29 no3       9         30 po4       2139         31 hardness_temporal       1	20	fe2	15
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30 po4 2139 31 hardness_temporal 1	28	hardness_general	
31 hardness_temporal 1			•
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70	31	hardness_temporal	1
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33 ph 1		·-	<del>-</del>
34 eh 2139			2139
35 co2_free			
36 co2_depend 1		•	
37 co2_infiltrate 2			
38 oxygen 2139			
39 lienhe 2139	39	lienhe	2139

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40	cond	Jctivity	2139
41	oxyg	en_dissolve	2139
42	sio2		2
43	colo	<b>^</b>	1
44	smel	l	1
45	tats	e	1
46	tds1	95	1
47	tds1	30	2139
		e: int64	
		king Null Done!!	
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		ss 'pandas.core.fı	rame.DataFrame'>
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55			
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66	10	mg2	2138 non-null float64
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67	11	fe3	2135 non-null float64

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67 68	12	fe2	2124 non-null	float64
69	13	al3	2138 non-null	float64
70	14	nh4	1215 non-null	float64
71	15	cl	2138 non-null	float64
72	16	so4	2138 non-null	float64
73	17	hco3	2138 non-null	float64
74	18	co3	2138 non-null	float64
75	19	no2	2110 non-null	float64
76	20	hardness_general	2138 non-null	float64
77	21	no3	2130 non-null	float64
78	22	po4	0 non-null	float64
79	23	hardness_temporal	2138 non-null	float64
80	24	hardness_permanent	2138 non-null	float64
81	25	ph	2138 non-null	float64
82	26	eh	0 non-null	float64
83	27	co2_free	2138 non-null	float64
84	28	co2_depend	2138 non-null	float64
85	29	co2_infiltrate	2137 non-null	float64
86	30	oxygen	0 non-null	float64
87	31	lienhe	0 non-null	float64

File - main							
88							
89	33 oxygen_dissolve 0 non-null float64						
90	34 sio2 2137 non-null float64						
91	35 color 2138 non-null object						
92	36 smell 2138 non-null object						
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94	38	tds105	2138 non-null	float64			
95	39	tds180	0 non-null	float64			
96	<pre>dtypes: datetime64[ns](2), float64(31), int64(1), object(6)</pre>						
97	<del>-</del>						
	, 3						
	Checking Info Done!!Exploring						
99	· -						
400	DoneProcessing						
100	_						
	Started						
	Missing Values Preprocessing initiated						
	Done!!						
	Transforming features initiated						
	Done!!						
	Creating Water Quality index						
	Done!!						
107	Processing						
	Done						
	Removing Correlated Columns						
	Done!!						
	Encoding Labels						
	Done!!						
	Model Name: RF, Fold Number: 0						
	Elapsed time: 0.19869089126586914						
	Model Name: XGB, Fold Number: 0						
115	5 Elapsed time: 0.09660911560058594						
116	Model Name: LGBM, Fold Number: 0						

```
117 Elapsed time: 0.2164020538330078
118 Model Name: AILGBM, Fold Number: 0
119 Elapsed time: 0.08267569541931152
120 Model Name: RF, Fold Number: 1
121 Elapsed time: 0.18846726417541504
122 Model Name: XGB, Fold Number: 1
123 Elapsed time: 0.08768153190612793
124 Model Name: LGBM, Fold Number: 1
125 Elapsed time: 0.23154258728027344
126 Model Name: AILGBM, Fold Number: 1
127 Elapsed time: 0.1022498607635498
128 Model Name: RF, Fold Number: 2
129 Elapsed time: 0.196563720703125
130 Model Name: XGB, Fold Number: 2
131 Elapsed time: 0.10620927810668945
132 Model Name: LGBM, Fold Number: 2
133 Elapsed time: 0.2068493366241455
134 Model Name: AILGBM, Fold Number: 2
135 Elapsed time: 0.07314109802246094
136 Model Name: RF, Fold Number: 3
137 Elapsed time: 0.1965329647064209
138 Model Name: XGB, Fold Number: 3
139 Elapsed time: 0.08886885643005371
140 Model Name: LGBM, Fold Number: 3
141 Elapsed time: 0.22029948234558105
142 Model Name: AILGBM, Fold Number: 3
143 Elapsed time: 0.07051634788513184
144 Model Name: RF, Fold Number: 4
145 Elapsed time: 0.19774842262268066
146 Model Name: XGB, Fold Number: 4
147 Elapsed time: 0.08151054382324219
148 Model Name: LGBM, Fold Number: 4
149 Elapsed time: 0.18939828872680664
150 Model Name: AILGBM, Fold Number: 4
151 Elapsed time: 0.0765237808227539
152 Accuracy of Meta model: 1.0
153 Elapsed time for Meta Prediction: 0.
    004997968673706055 for fold 0:
154 Accuracy of Meta model: 0.984375
155 Elapsed time for Meta Prediction: 0.
    04951953887939453 for fold 1:
```

```
156 Accuracy of Meta model: 0.984375
157 Elapsed time for Meta Prediction: 0.
    04800081253051758 for fold 2:
158 Accuracy of Meta model: 1.0
159 Elapsed time for Meta Prediction: 0.
    032004356384277344 for fold 3:
160 Accuracy of Meta model: 0.9846153846153847
161 Elapsed time for Meta Prediction: 0.
    05151176452636719 for fold 4:
162 Ensemble accuracy: 1.0
163 Elapsed time for RF model: 0.19468164443969727
164 Random Forest Individual Performance: 1.0
165 Elapsed time for XGB model: 0.0886528491973877
166 XGBoost Individual Performance: 1.0
167 Elapsed time for LightGBM model: 0.20503616333007812
168 LightGBM Individual Performance: 1.0
169 Elapsed time for AILGBM model: 0.10952425003051758
170 AI-LightGBM Individual Performance: 0.99812734082397
171
172 Process finished with exit code 0
173
```