

In [10]:

```

1 def doARIMA(df_train, df_val, col, res_std_factor=5, plot=1):
2     t1 = time.time()
3     print ('')
4     print (' ----- col : ', col, ' ----- ')
5
6     p = range(1, 5)
7     q = range(1, 5)
8     best_aic      = np.inf
9     model_train_best = None
10    best_p = -1;
11    best_q = -1
12
13
14
15    for p_ in p:
16        for q_ in q:
17            try:
18                # model = smt.ARIMA(data, order=(p_,0,q_)).fit(method='mle',
19                model_train = ARIMA(df_train[col], order=(p_,0,q_)).fit(method='mle')
20                if model_train.aic < best_aic:
21                    best_aic      = model_train.aic
22                    best_p        = p_
23                    best_q        = q_
24                    model_train_best = model_train
25            except:
26                pass
27                # traceback.print_exc()
28            print(' - ARIMA Results : ', best_p, best_q, ' || AIC : ', best_aic, '(1
29
30            threshold_train = -1
31            threshold_val   = -1
32            rmse           = -1
33            anomalies      = 0;
34            TN = 0; FN = 0; TP=0; FP=0;
35
36
37            try:
38                if (model_train_best != None):
39
40                    threshold_train = res_std_factor * np.std(model_train_best.resid)
41                    if (plot):
42                        # Step2 - We plot the residual errors to see if there may sti
43                        print (' -- Threshold Train : ', round(threshold_train,3))
44                        f,axarr = plt.subplots(3,1, figsize=(15,10))
45                        axarr[0].plot(df_train[col])
46                        axarr[0].set_title('Train Data - ' + col)
47                        axarr[1].plot(list(model_train_best.resid))
48                        axarr[1].plot([0,len(model_train_best.resid)], [threshold_trai
49                        axarr[1].set_title('ARMA Residual Error - ' + str(col)))
50                        residuals = pd.DataFrame(model_train_best.resid)
51                        residuals.plot(kind='kde', ax=axarr[2], title='Density Plot o
52                        plt.show()
53
54                    # Step3 -
55                    model_val = ARIMA(df_val[col], order=(best_p,0,best_q)).fit(method='mle'
56                    threshold_val = res_std_factor * np.std(model_val.resid)
57                    if (plot):
58                        print (' -- Threshold Val: ', round(threshold_val,3))
59                        f,axarr = plt.subplots(3,1, figsize=(15,10))

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60     axarr[0].plot(df_val[col])
61     axarr[0].set_title('Val Data - ' + col)
62     axarr[1].plot(list(model_val.resid))
63     axarr[1].plot([0,len(model_val.resid)], [threshold_val, threshold_val])
64     axarr[1].set_title('ARMA Residual Error - ' + str(col))
65     residuals = pd.DataFrame(model_val.resid)
66     residuals.plot(kind='kde', ax=axarr[2], title='Density Plot of Residuals')
67     plt.show()
68
69     Y_predict = model_val.predict()
70     mse = mean_squared_error(df_val[col], Y_predict)
71     rmse = np.sqrt(mse)
72     if plot:
73         f,axarr = plt.subplots(1, figsize=(15,5))
74         plt.plot(Y_predict)
75         plt.plot(df_val[col])
76         print (' - Val MSE : ', round(mse, 2), ' || Val RMSE : ', round(rmse, 2))
77         plt.title('Prediction - Validation - Col:' + col + ' (RMSE:' + str(rmse) + ')')
78         plt.show()
79
80
81
82     if (1):
83         Y_true      = df_val['ATT_FLAG']
84         anomalies = Counter(Y_true)[1]
85         Y_predict = model_val.resid
86         Y_predict[Y_predict >= threshold_val] = 1
87         Y_predict[Y_predict < threshold_val] = -999;
88         Y_predict = Y_predict.astype(int)
89         conf_matrix = confusion_matrix(Y_true, Y_predict)
90         TN = conf_matrix[0][0]
91         FN = conf_matrix[1][0]
92         FP = conf_matrix[0][1]
93         TP = conf_matrix[1][1]
94         print (' -- TP : ', TP, ' || FP : ', FP)
95         # import pdb; pdb.set_trace()
96     else:
97         det_anom_lit = model_val.resid[model_val.resid > threshold_val]
98         ind = []
99         TP = 0
100        FP = 0
101        for index, a in det_anom_lit.items():
102            ind.append(index)
103            if df_val['ATT_FLAG'][index] == 1 : TP += 1
104            else : FP += 1
105        print (' -- TP : ', TP, ' || FP : ', FP)
106
107    except:
108        print (' - Error : ', col)
109        # traceback.print_exc()
110    pass
111
112    res = [col, best_p, best_q, best_aic, threshold_train, threshold_val, rmse]
113    return res
114
115 if __name__ == "__main__":
116     data = []
117     for i,col in enumerate(df_train.columns[:-1]):
118         if i > 30:
119             tmp = doARIMA(df_train, df_val, col, plot=0)
120             data.append(tmp)

```

```
121      df = pd.DataFrame(data, columns=['col', 'best_p', 'best_q', 'best_aic',  
122          'display(df)  
123      """  
124      - plot the ATT_FLAG=1 on the residual errors  
125      """  
126      
```

executed in 14m 44s, finished 00:56:37 2019-05-28

```
----- col : P_J280 -----  
- ARIMA Results : 1 1 || AIC : -77557.26245388955 (Time : 26.04  
s)  
- Error : P_J280  
  
----- col : P_J269 -----  
- ARIMA Results : 4 2 || AIC : 41210.80570088172 (Time : 72.21  
s)  
-- TP : 0 || FP : 0  
  
----- col : P_J300 -----  
- ARIMA Results : 3 3 || AIC : 33068.103252975576 (Time : 99.35  
s)  
- Error : P_J300  
  
----- col : P_J256 -----  
- ARIMA Results : 4 2 || AIC : 53823.769227670404 (Time : 53.0  
s)  
- Error : P_J256  
  
----- col : P_J289 -----  
- ARIMA Results : 3 3 || AIC : 33006.912736432285 (Time : 82.48  
s)  
-- TP : 0 || FP : 0  
  
----- col : P_J415 -----  
- ARIMA Results : 1 4 || AIC : 59451.69353818527 (Time : 44.9 s)  
-- TP : 0 || FP : 0  
  
----- col : P_J302 -----  
- ARIMA Results : 4 4 || AIC : 45407.3910830636 (Time : 57.71 s)  
-- TP : 0 || FP : 0  
  
----- col : P_J306 -----  
- ARIMA Results : 4 4 || AIC : 58087.92571338611 (Time : 64.65  
s)  
- Error : P_J306  
  
----- col : P_J307 -----  
- ARIMA Results : 4 2 || AIC : 45659.8635829541 (Time : 69.44 s)  
- Error : P_J307  
  
----- col : P_J317 -----  
- ARIMA Results : 1 1 || AIC : 54177.59082820872 (Time : 24.62  
s)  
-- TP : 0 || FP : 0  
  
----- col : P_J14 -----  
- ARIMA Results : 4 4 || AIC : 41854.7268278508 (Time : 145.97  
s)  
-- TP : 0 || FP : 0
```

```
----- col : P_J422 -----
- ARIMA Results : 4 2 || AIC : 32092.867027130793 (Time : 82.9
s)
- Error : P_J422
```

	col	best_p	best_q	best_aic	threshold_train	threshold_val	val_rmse	aic
0	P_J280	1	1	-77557.262454	0.159517	-1.000000	-1.000000	0
1	P_J269	4	2	41210.805701	12.820843	13.201846	2.640386	2
2	P_J300	3	3	33068.103253	8.093216	-1.000000	-1.000000	0
3	P_J256	4	2	53823.769228	26.489329	-1.000000	-1.000000	0
4	P_J289	3	3	33006.912736	8.061574	8.350942	1.670915	2
5	P_J415	1	4	59451.693538	36.239494	36.893530	7.378732	2
6	P_J302	4	4	45407.391083	16.157152	17.535715	3.507156	2
7	P_J306	4	4	58087.925713	33.517824	-1.000000	-1.000000	0
8	P_J307	4	2	45659.863583	16.397698	-1.000000	-1.000000	0
9	P_J317	1	1	54177.590828	26.863130	28.731715	5.746986	2
10	P_J14	4	4	41854.726828	13.260807	14.806103	2.961227	2
11	P_J422	4	2	32092.867027	7.686919	-1.000000	-1.000000	0

◀ ▶

Out[10]:

```
'\n - plot the ATT_FLAG=1 on the residual errors\n'
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In []:

1

Tmp

[...]