

```
In [13]: 1 #General Libraries for
2
3 import pandas as pd
4 import numpy as np
5 import matplotlib.pyplot as plt
6 import matplotlib
7 from matplotlib.pyplot import figure
8 from sklearn.metrics import mean_absolute_error
9 import statsmodels.tsa.statespace.sarimax
10
11 import warnings
12 warnings.filterwarnings('ignore')
13 warnings.warn('DelftStack')
14 warnings.warn('Do not show this message')
15 print("No Warning Shown")
16
17 # Libraries Specifically for Neural Nets:
18
19 from sklearn.preprocessing import MinMaxScaler
20 from tensorflow.keras.models import Sequential
21 from tensorflow.keras.layers import Dense
22 from tensorflow.keras.layers import LSTM
23 from keras.preprocessing.sequence import TimeseriesGenerator
24 from tensorflow.keras.models import load_model
25 from tensorflow import keras
26
27
```

No Warning Shown

```
In [3]: 1 acc_growers = [73177, 91259, 66015, 60706, 399593]
```

```

In [4]: 1 def sarimax_vs_lstm(RegionID, graph="Go", run=1):
2
3     #Pulling Data
4
5     test_df = pd.read_csv(f'{RegionID}.csv')
6
7     test_df['time'] = pd.to_datetime(test_df['time'])
8
9     test_df.set_index('time', inplace = True)
10
11     test_df.columns = ['Drop', 'RegionName', 'RegionID', 'SizeRank', 'C
12         'Metro', 'CountyName', 'value']
13
14     test_df.drop('Drop', axis = 'columns', inplace = True)
15
16     #Preparing X_train and y_train
17
18     X_train = test_df[['value']].head(len(test_df) - 12)
19     y_train = test_df[['value']].tail(12)
20
21     #Scale Values
22
23     scaler = MinMaxScaler()
24
25     scaler.fit(X_train)
26
27     X_train_scaled = scaler.transform(X_train)
28     y_train_scaled = scaler.transform(y_train)
29
30     #Time Series Genertor
31
32     n_input = 12
33     n_features = 1
34     generator = TimeseriesGenerator(X_train_scaled, X_train_scaled, len
35
36     #Building Actual Model
37
38     model = Sequential()
39     model.add(LSTM(100, activation='relu', input_shape=(n_input, n_fea
40     model.add(Dense(1))
41     model.compile(optimizer='adam', loss='mse')
42
43     #Fitting Model
44
45     model.fit(generator, epochs = 32, verbose=0)
46
47     #Getting Predictions
48
49     test_predictions = []
50
51     first_eval_batch = X_train_scaled[-n_input:]
52     current_batch = first_eval_batch.reshape((1, n_input, n_features))
53
54     for i in range(len(y_train_scaled)):
55
56         # get the prediction value for the first batch

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57     current_pred = model.predict(current_batch)[0]
58
59     # append the prediction into the array
60     test_predictions.append(current_pred)
61
62     # use the prediction to update the batch and remove the first
63     current_batch = np.append(current_batch[:,1:,:], [[current_pred
64
65     #Inverse Transforming Preds into Timeseries Data:
66
67     preds = scaler.inverse_transform(test_predictions)
68
69     y_train['time'] = y_train.index
70
71     f_steps = y_train[['time']]
72
73     f_steps.index = [0,1,2,3,4,5,6,7,8,9,10,11]
74
75     preds = pd.DataFrame(preds)
76
77     preds = pd.concat([preds, f_steps], axis=1)
78
79     preds['time'] = pd.to_datetime(preds['time'])
80
81     preds.set_index('time', inplace = True)
82
83     preds.columns = ['value']
84
85     #Retrieving Sarimax Preds from Database
86
87     sarimax_preds = pd.read_csv(f'{RegionID}_preds.csv')
88
89     sarimax_preds.columns=['time', 'value']
90
91     sarimax_preds['time'] = pd.to_datetime(sarimax_preds['time'])
92
93     sarimax_preds.set_index('time', inplace = True)
94
95     sarimax_preds
96
97     # Showing Results
98
99     y_train_iso = y_train[['value']]
100
101     nn_mae = mean_absolute_error(preds, y_train_iso)
102
103     if graph=="Go":
104
105         plt.plot(preds, color='green')
106         plt.plot(y_train_iso, color='blue')
107         plt.plot(sarimax_preds, color='purple')
108         plt.title(f'{RegionID} Comparative Analysis')
109
110         print(f'Mean Absolute Error for {RegionID} Neural Net: {mean_al
111         print(f'mean Absolute Error for {RegionID} SARIMAX: {mean_abso
112
113     else:

```

```
114
115     model.save(f'{RegionID}_model_{run}.h5') # creates a HDF5 file
116     # del model # deletes the existing model
117
118     return nn_mae
119
120
```

In [5]: 1 sarimax_vs_lstm(73177, graph="Stop", run=1)

2021-10-25 16:44:15.770473: I tensorflow/core/platform/cpu_feature_guard.cc:142] This TensorFlow binary is optimized with oneAPI Deep Neural Network Library (oneDNN) to use the following CPU instructions in performance-critical operations: SSE4.1 SSE4.2

To enable them in other operations, rebuild TensorFlow with the appropriate compiler flags.

2021-10-25 16:44:15.903719: I tensorflow/compiler/mlir/mlir_graph_optimization_pass.cc:185] None of the MLIR Optimization Passes are enabled (registered 2)

Out[5]: 1117.8625139097373

In [12]: 1 # reconstructed_model = keras.models.load_model("73177_model_1.h5")

```

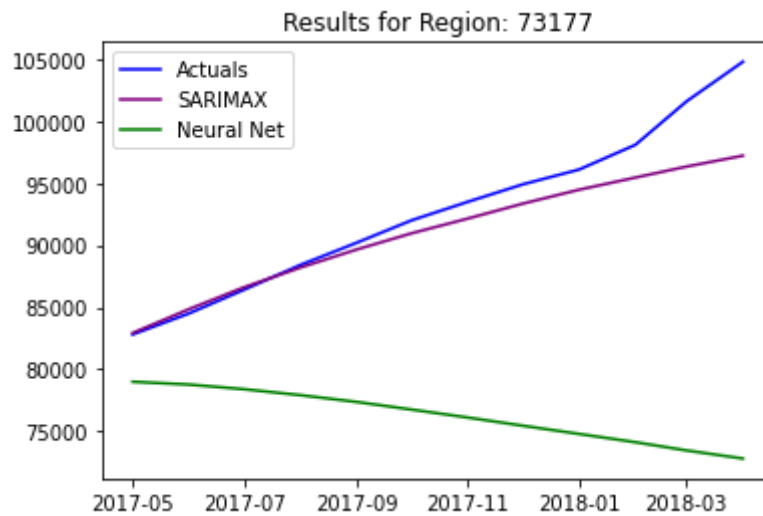
In [14]: 1 #Pulling Data
2
3 def reconstructed_test(RegionID, run):
4
5     reconstructed_model = keras.models.load_model(f'{RegionID}_model_{run}.h5')
6
7     test_df = pd.read_csv(f'{RegionID}.csv')
8
9     test_df['time'] = pd.to_datetime(test_df['time'])
10
11     test_df.set_index('time', inplace = True)
12
13     test_df.columns = ['Drop', 'RegionName', 'RegionID', 'SizeRank', 'CountyName',
14                       'Metro', 'CountyName', 'value']
15
16     test_df.drop('Drop', axis = 'columns', inplace = True)
17
18     #Preparing X_train and y_train
19
20     X_train = test_df[['value']].head(len(test_df) - 12)
21     y_train = test_df[['value']].tail(12)
22
23     #Scale Values
24
25     scaler = MinMaxScaler()
26
27     scaler.fit(X_train)
28
29     X_train_scaled = scaler.transform(X_train)
30     y_train_scaled = scaler.transform(y_train)
31
32     #Time Series Genertor
33
34     n_input = 12
35     n_features = 1
36     generator = TimeseriesGenerator(X_train_scaled, y_train_scaled, len(y_train_scaled), n_input, n_features)
37
38     #Getting Predictions
39
40     test_predictions = []
41
42     first_eval_batch = X_train_scaled[-n_input:]
43     current_batch = first_eval_batch.reshape((1, n_input, n_features))
44
45     for i in range(len(y_train_scaled)):
46
47         # get the prediction value for the first batch
48         current_pred = reconstructed_model.predict(current_batch)[0]
49
50         # append the prediction into the array
51         test_predictions.append(current_pred)
52
53         # use the prediction to update the batch and remove the first element
54         current_batch = np.append(current_batch[:,1:,:], [[current_pred]], axis=-1)
55
56     #Inverse Transforming Preds into Timeseries Data:

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```
57
58     preds = scaler.inverse_transform(test_predictions)
59
60     y_train['time'] = y_train.index
61
62     f_steps = y_train[['time']]
63
64     f_steps.index = [0,1,2,3,4,5,6,7,8,9,10,11]
65
66     preds = pd.DataFrame(preds)
67
68     preds = pd.concat([preds, f_steps], axis=1)
69
70     preds['time'] = pd.to_datetime(preds['time'])
71
72     preds.set_index('time', inplace = True)
73
74     preds.columns = ['value']
75
76     #Retrieving Sarimax Preds from Database
77
78     sarimax_preds = pd.read_csv(f'73177_preds.csv')
79
80     sarimax_preds.columns=['time', 'value']
81
82     sarimax_preds['time'] = pd.to_datetime(sarimax_preds['time'])
83
84     sarimax_preds.set_index('time', inplace = True)
85
86     sarimax_preds
87
88     # Showing Results
89
90     y_train_iso = y_train[['value']]
91
92     nn_mae = mean_absolute_error(preds, y_train_iso)
93
94     plt.plot(y_train_iso, color='blue', label='Actuals')
95     plt.plot(sarimax_preds, color='purple', label='SARIMAX')
96     plt.plot(preds, color='green', label='Neural Net')
97     plt.title(f'Results for Region: {RegionID}')
98     plt.legend()
99
100     print(f'Mean Absolute Error of {nn_mae}')
```

```
In [15]: 1 reconstructed_test(73177, 2)
```

Mean Absolute Error of 16544.22244131565



```
In [12]: 1 # results = []
2
3 # for region in acc_growers:
4 #     for item in [1,2,3, 4, 5, 6, 7, 8, 9,10,11,12,13,14,15,16,17,18,1
5 #         nn_mae = sarimax_vs_lstm(region, graph="Stop", run=item)
6 #         results.append([region, item, nn_mae])
7 #         print([region, nn_mae, item])
8
```

```

In [28]: 1 # best_models = []
          2
          3 # for item in acc_growers:
          4 #     df = print_best_model(item)
          5 #     best_models.append([round(df.iloc[0]['RegionID']), round(df.iloc[
          6
          7 # best_models = pd.DataFrame(best_models)
          8
          9 # best_models.columns = ['RegionID', 'Run', 'MAE']
          10
          11 # best_models
          12
          13 # best_models_stored = []
          14
          15 best_nn_models = pd.read_excel('Best NN Models.xlsx').iloc[:,1:]
          16
          17 best_nn_models

```

Out[28]:

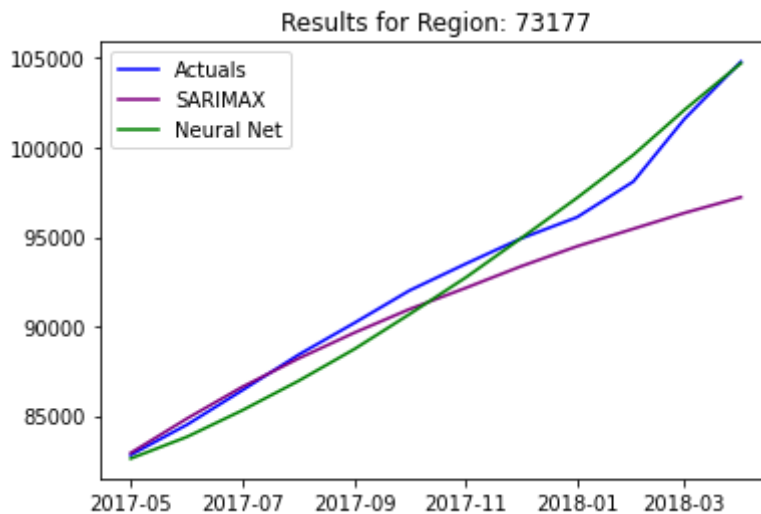
	RegionID	Run	MAE
0	73177	18	848.61
1	91259	10	1173.71
2	66015	3	746.66
3	60706	9	7711.63
4	399593	5	4343.45

```

In [17]: 1 reconstructed_test(73177, 18)

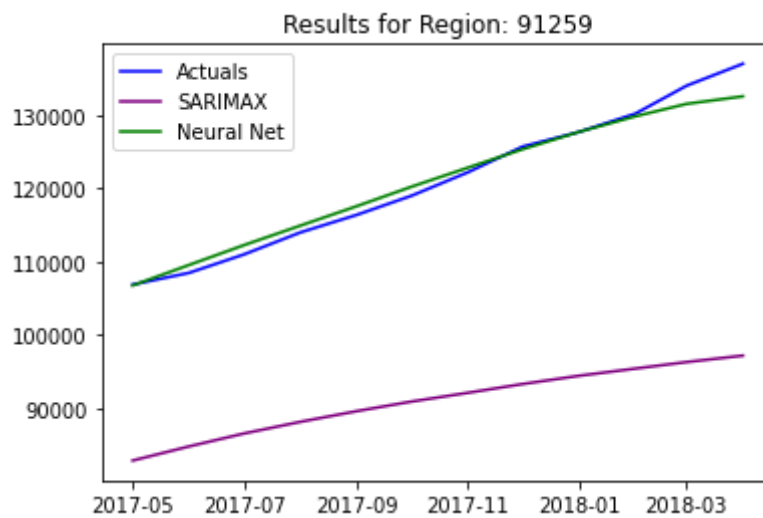
```

Mean Absolute Error of 848.6076898872852



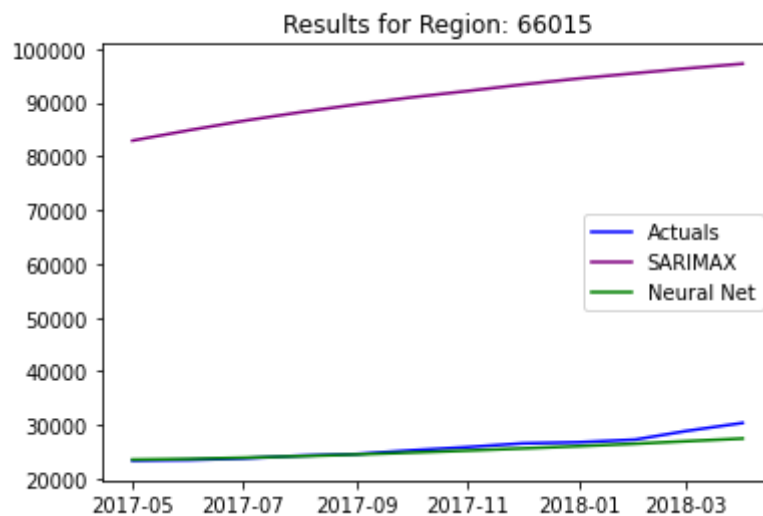

```
In [18]: 1 reconstructed_test(91259, 10)
```

Mean Absolute Error of 1173.708751797676



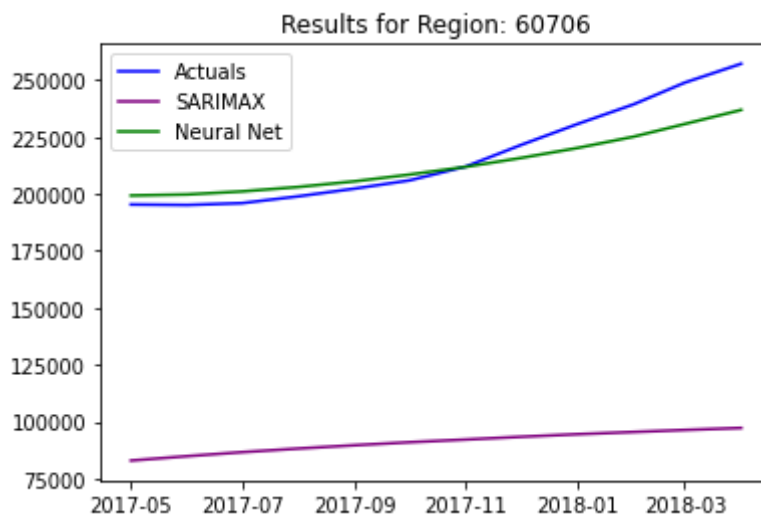
```
In [19]: 1 reconstructed_test(66015, 3)
```

Mean Absolute Error of 746.6633679966131



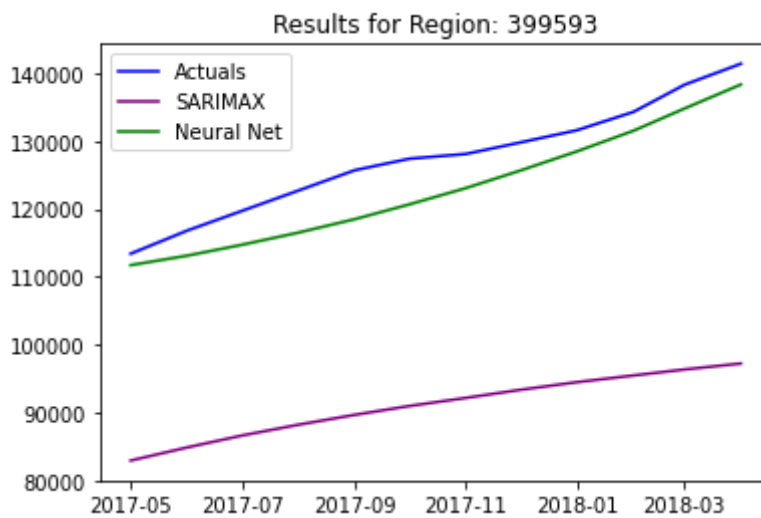
```
In [20]: 1 reconstructed_test(60706, 9)
```

Mean Absolute Error of 7711.633028214176



```
In [21]: 1 reconstructed_test(399593, 5)
```

Mean Absolute Error of 4343.453592558687



```
In [31]: 1 acc_growers_df
```

Out[31]:

	RegionID	City	State	Metro	CountyName	MAE	Comp Error
0	73177	Holiday	FL	Tampa	Pasco	1872.961447	0.02
1	91259	Fort Worth	TX	Dallas-Fort Worth	Tarrant	4541.077453	0.04
2	66015	Reading	PA	Reading	Berks	1921.952964	0.08
3	60706	Paterson	NJ	New York	Passaic	16572.053604	0.08
4	399593	Southfield	MI	Detroit	Oakland	10998.247600	0.09

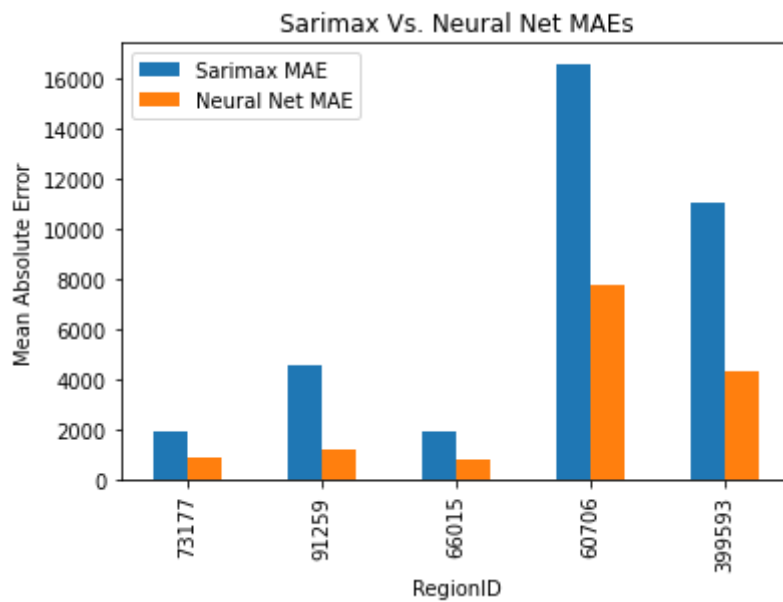
```
In [39]: #Comparisson of Models
2
acc_growers_df = pd.read_excel('acc_growers.xlsx').iloc[:,1:]
4
#Joining Models
6
sarimax_vs_nn = acc_growers_df.merge(best_nn_models, how='inner', left_on=
8
sarimax_vs_nn.columns = ['RegionID', 'City', 'State', 'Metro', 'CountyName
10
sarimax_vs_nn[['RegionID', 'Sarimax MAE', 'Neural Net MAE']]
```

Out[39]:

	RegionID	Sarimax MAE	Neural Net MAE
0	73177	1872.961447	848.61
1	91259	4541.077453	1173.71
2	66015	1921.952964	746.66
3	60706	16572.053604	7711.63
4	399593	10998.247600	4343.45

```
In [51]: 1 sarimax_vs_nn.plot(x="RegionID", y=["Sarimax MAE", "Neural Net MAE"], k
2 plt.title('Sarimax Vs. Neural Net MAEs')
3 plt.ylabel('Mean Absolute Error')
```

```
Out[51]: Text(0, 0.5, 'Mean Absolute Error')
```



```
In [ ]: 1
```