Tamil Nadu Covid-19 Analysis

Web Mining Project

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Import packages

```
In [1]: import numpy as np import pandas as pd
           import matplotlib.pyplot as plt
           import datetime
           import requests
           import warnings
           warnings.filterwarnings('ignore')
           import plotly.express as px
import plotly.graph_objects as go
           import seaborn as sn
```

Read CSV

```
In [2]: df=pd.read_csv('covid19-in-india/covid_19_india.csv')
```

Preliminary Data Analysis

```
In [3]: df
Out[3]:
                                               Time State/UnionTerritory ConfirmedIndianNational ConfirmedForeignNational Cured Deaths Confirmed
                                    Date
                          1 30/01/20 6:00 PM
                                                                                                                                                                        0
                   0
                                                                         Kerala
                                                                                                                                                  0
                                                                                                                                                            0
                   1 2 31/01/20 6:00 PM
                                                                        Kerala
                                                                                                                1
                                                                                                                                                  0
                                                                                                                                                            0
                                                                                                                                                                        0
                   2 3 01/02/20 6:00 PM
                                                                                                               2
                                                                        Kerala
                                                                                                                                                  0
                                                                                                                                                            Ω
                                                                                                                                                                        0
                                                                                                                                                                                       2
                         4 02/02/20 6:00 PM
                                                                      Kerala
                   3
                                                                                                               3
                                                                                                                                                  0
                                                                                                                                                          0
                                                                                                                                                                       0
                                                                                                                                                                                       3
                          5 03/02/20 6:00 PM
                                                                       Kerala
                                                                                                               3
                                                                                                                                                  0
                                                                                                                                                          0
                                                                                                                                                                       0
                                                                                                                                                                                      3
               1699 1700 07/05/20 8:00 AM
                                                                    Telengana
                                                                                                                                                         628
                                                                                                                                                                      29
                                                                                                                                                                                   1107
               1700 1701 07/05/20 8:00 AM
                                                                       Tripura
                                                                                                                                                          2
                                                                                                                                                                       0
                                                                                                                                                                                     43
               1701 1702 07/05/20 8:00 AM
                                                                  Uttarakhand
                                                                                                                                                          39
                                                                                                                                                                      1
                                                                                                                                                                                     61
               1702 1703 07/05/20 8:00 AM
                                                                 Uttar Pradesh
                                                                                                                                                        1130
                                                                                                                                                                      60
                                                                                                                                                                                   2998
               1703 1704 07/05/20 8:00 AM
                                                                 West Bengal
                                                                                                                                                         364
                                                                                                                                                                     144
                                                                                                                                                                                   1456
              1704 rows × 9 columns
 In [4]: df['State/UnionTerritory'].unique()
Out[4]: array(['Kerala', 'Telengana', 'Delhi', 'Rajasthan', 'Uttar Pradesh', 'Haryana', 'Ladakh', 'Tamil Nadu', 'Karnataka', 'Maharashtra', 'Punjab', 'Jammu and Kashmir', 'Andhra Pradesh', 'Uttarakhand', 'Odisha', 'Puducherry', 'West Bengal', 'Chhattisgarh', 'Chandigarh', 'Gujarat', 'Himachal Pradesh', 'Madhya Pradesh', 'Bihar', 'Manipur', 'Mizoram', 'Andaman and Nicobar Islands', 'Goa', 'Unassigned', 'Assam', 'Jharkhand', 'Arunachal Pradesh', 'Tripura', 'Nagaland', 'Meghalaya', 'Nagaland#', 'Jharkhand#', 'Dadar Nagar Haveli'], dtype=object)
In [5]: df['State/UnionTerritory'].nunique()
 In [6]: tn=df[df['State/UnionTerritory']=='Tamil Nadu']
```

In [7]: tn.head(20)

Out[7]:

	Sno	Date	Time	State/UnionTerritory	ConfirmedIndianNational	ConfirmedForeignNational	Cured	Deaths	Confirmed
61	62	07/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
67	68	08/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
79	80	09/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
94	95	10/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
105	106	11/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
116	117	12/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
129	130	13/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
142	143	14/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
156	157	15/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
171	172	16/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
186	187	17/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
202	203	18/03/20	6:00 PM	Tamil Nadu	1	0	0	0	1
220	221	19/03/20	6:00 PM	Tamil Nadu	2	0	1	0	2
240	241	20/03/20	6:00 PM	Tamil Nadu	3	0	1	0	3
262	263	21/03/20	6:00 PM	Tamil Nadu	3	0	1	0	3
285	286	22/03/20	6:00 PM	Tamil Nadu	5	2	1	0	7
308	309	23/03/20	6:00 PM	Tamil Nadu	7	2	1	0	9
332	333	24/03/20	6:00 PM	Tamil Nadu	13	2	1	0	15
357	358	25/03/20	6:00 PM	Tamil Nadu	16	2	1	0	18
387	388	26/03/20	6:00 PM	Tamil Nadu	20	6	1	1	26

In [8]: tn.info()

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 62 entries, 61 to 1698
Data columns (total 9 columns):
                                                                62 non-null int64
62 non-null object
62 non-null object
Date
 Time
                                                                62 non-null object
62 non-null object
62 non-null object
62 non-null object
 State/UnionTerritory
ConfirmedIndianNational
ConfirmedForeignNational
Cured
```

62 non-null int64 62 non-null int64 62 non-null int64 Deaths Confirmed

dtypes: int64(4), object(5) memory usage: 4.8+ KB

In [9]: tn.isnull().sum()

Out[9]: Sno Date 0 0 Time 0 0 State/UnionTerritory
ConfirmedIndianNational 0 0 0 ${\tt ConfirmedForeignNational}$ Cured Deaths Confirmed dtype: int64

No NULL Values

In [10]: tn.describe()

Out[10]:

	Sno	Cured	Deaths	Confirmed
count	62.000000	62.000000	62.000000	62.000000
mean	769.322581	327.338710	9.741935	945.258065
std	513.685455	506.741825	11.011076	1117.872481
min	62.000000	0.000000	0.000000	1.000000
25%	291.750000	1.000000	0.000000	7.500000
50%	719.000000	8.000000	5.000000	596.000000
75%	1209.000000	590.500000	17.750000	1577.000000
may	1699 000000	1516 000000	35,000000	4829 000000

No peculiarities in data



No Correlation between the attributes.

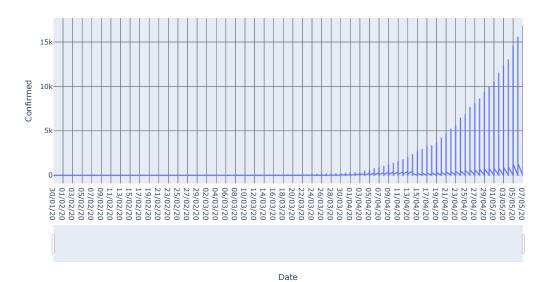
Sno

Cured

Deaths

Confirmed

Interactive Time Series graph with Covid-19 Cases Thoughout India

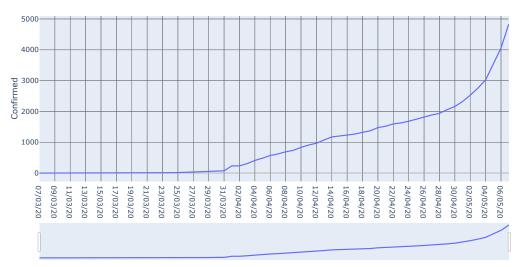


Graph shows an increasing amount of Daily cases in India.

Dropping unwanted columns

Selecting data from the state Tamil Nadu

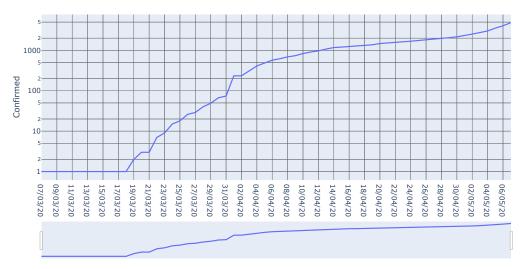
Interactive Time Series graph with Covid-19 Cases in Tamil Nadu



Date

In [21]: fig.update_layout(yaxis_type="log")

Interactive Time Series graph with Covid-19 Cases in Tamil Nadu



Date

In [22]: data['State/UnionTerritory'].unique()

Out[22]: array(['Tamil Nadu'], dtype=object)

```
In [23]: data.head()
  Out[23]:
                  Date State/UnionTerritory Cured Deaths Confirmed
            61 07/03/20
                             Tamil Nadu 0
                                               0
            67 08/03/20
                             Tamil Nadu
                                               0
            79 09/03/20
                             Tamil Nadu
                                       0
                                            0
                                                       1
            94 10/03/20
                             Tamil Nadu
                                      0
            105 11/03/20
                             Tamil Nadu
                                       0
Creating new column such that the number of days from Mach 7th is displayed
  In [24]: data['Day']=np.arange(len(data))+1
  In [25]: data
  Out[25]:
                  Date State/UnionTerritory Cured Deaths Confirmed Day
            61 07/03/20
                        Tamil Nadu 0 0 1 1
             67 08/03/20
                              Tamil Nadu
                                         0
                                                0
             79 09/03/20
                              Tamil Nadu
                                         0
                                               0
                                                        1
                                                             3
                                              0
             94 10/03/20
                              Tamil Nadu
                                         0
                                                        1
                                              0
                                                       1 5
            105 11/03/20
                              Tamil Nadu
                                        0
                                   ...
                                               ...
                                                       ... ...
            1568 03/05/20
                              Tamil Nadu 1341
                                               29
                                                      2757 58
            1600 04/05/20
                              Tamil Nadu 1379
                                               30
                                                      3023 59
                                              31 3550 60
            1632 05/05/20
                              Tamil Nadu 1409
            1665 06/05/20
                              Tamil Nadu 1485
                                             33 4058 61
                                                      4829 62
            1698 07/05/20
                              Tamil Nadu 1516
                                               35
           62 rows × 6 columns
creating an separate column for Active Covid-19 cases
  In [26]: data.insert(6, "Active", 0, True)
  In [27]: data
  Out[27]:
                  Date State/UnionTerritory Cured Deaths Confirmed Day Active
                              Tamil Nadu
             61 07/03/20
                                         0
                                                0
                                                        1
                                                            1
                                                                   0
                                       0
             67 08/03/20
                              Tamil Nadu
                                                0
                                                            2
                                                                   0
                                             0
                                                        1 3
                                                                   0
             79 09/03/20
                              Tamil Nadu 0
                                             0
                                                                   0
             94 10/03/20
                              Tamil Nadu 0
                                                       1 4
                              Tamil Nadu 0
                                             0
                                                       1 5
            105 11/03/20
                                                                   0
            1568 03/05/20
                              Tamil Nadu 1341
                                               29 2757 58
                                                                   0
            1600 04/05/20
                              Tamil Nadu 1379
                                             30 3023 59
                                                                   0
            1632 05/05/20
                              Tamil Nadu 1409
                                             31 3550 60
                                                                   0
            1665 06/05/20
                              Tamil Nadu 1485 33
                                                      4058 61
                                                                   0
            1698 07/05/20
                              Tamil Nadu 1516
                                               35
                                                      4829 62
                                                                   0
           62 rows × 7 columns
```

In [28]: count=0
 lis=[]

t3=data['Deaths']

data.reset_index(drop=True, inplace=True)
t1=data['Confirmed']
t2=data['Cured']

```
In [30]: lis
Out[30]: [1,
            1,
1,
1,
1,
1,
1,
1,
1,
1,
2,
6,
8,
17,
24,
27,
34,
62,
69,
227,
302,
            403,
            476,
558,
            608,
            664,
709,
            805,
            859,
915,
            1014,
1104,
            1110,
1072,
            1025,
            992,
1051,
            1046,
943,
            949,
            911,
867,
            838,
            841,
            812,
            865,
            925,
1038,
            1186,
            1387,
            1614,
2110,
            2540,
            3278]
In [31]: data['Active'] = lis
In [32]: data=data.drop('Date',axis=1)
In [33]: data
Out[33]:
                State/UnionTerritory Cured Deaths Confirmed Day Active
             0
                         Tamil Nadu
                                        0
                                                 0
             1
                         Tamil Nadu
                                        0
                                                 0
                                                                 2
             2
                         Tamil Nadu
                                        0
                                                 0
                                                                 3
             3
                         Tamil Nadu
                                        0
                                                0
                                                                 4
             4
                         Tamil Nadu
                                        0
                                                0
                                                          ...
            57
                         Tamil Nadu 1341
                                               29
                                                         2757 58
            58
                         Tamil Nadu 1379
                                                30
                                               31
                         Tamil Nadu 1485
                                               33
                                                         4058 61
                         Tamil Nadu 1516
                                                         4829 62
           62 rows × 6 columns
In [34]: data.reset_index(drop=True, inplace=True)
```

```
In [35]: data
```

Out[35]:

	State/UnionTerritory	Cured	Deaths	Confirmed	Day	Active
0	Tamil Nadu	0	0	1	1	1
1	Tamil Nadu	0	0	1	2	1
2	Tamil Nadu	0	0	1	3	1
3	Tamil Nadu	0	0	1	4	1
4	Tamil Nadu	0	0	1	5	1
57	Tamil Nadu	1341	29	2757	58	1387
58	Tamil Nadu	1379	30	3023	59	1614
59	Tamil Nadu	1409	31	3550	60	2110
60	Tamil Nadu	1485	33	4058	61	2540
61	Tamil Nadu	1516	35	4829	62	3278

62 rows × 6 columns

Plotting the Cured, Deceased, Confirmed Covid-19 cases and Active Covid-19 cases

```
In [36]: fig = go.Figure()
    fig.add_trace(go.Scatter(x=data['Day'], y=data['Cured'],mode='lines',name='Cured'))
    fig.add_trace(go.Scatter(x=data['Day'], y=data['Deaths'],mode='lines+markers',name='Deceased'))
    fig.add_trace(go.Scatter(x=data['Day'], y=data['Confirmed'],mode='markers', name='Confirmed Cases'))
    fig.add_trace(go.Scatter(x=data['Day'], y=data['Active'],mode='lines', name='Active Cases'))
    fig.show()
```



Prediction of Confirmed Cases

```
In [37]: dff=data.drop('Cured',axis=1)
    dff=dff.drop('Deaths',axis=1)
    dff=dff.drop('Active',axis=1)

In [38]: f=dff['Day'].values
    y=dff['Confirmed'].values

In [39]: f1=np.array([i for i in f])
    y1=np.array([i for i in y])
```

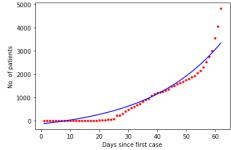
```
In [40]: theta=0.4
           n=len(f)
           s=np.empty(n)
           def yp(f,tau,theta,gam,b):
    z=tau/(1+np.exp(-gam*(f-theta)))+b
                return(z)
           p0=[max(y1), np.median(f1),1,min(y1)]
print(yp(f1,max(y1), np.median(f1),1,min(y1)))
           [1.00000000e+00 1.00000000e+00 1.0000000e+00 1.00000001e+00
            1.00000001e+00 1.00000004e+00 1.00000011e+00 1.00000030e+00
            1.00000082e+00 1.00000222e+00 1.00000604e+00 1.00001641e+00 1.00004461e+00 1.00012126e+00 1.00032961e+00 1.00089597e+00
            1.00243549e+00 1.00662035e+00 1.01799594e+00 1.04891773e+00
            1.13296985e+00 1.36143243e+00 1.98234888e+00 3.66936804e+00 8.24920912e+00 2.06546950e+01 5.40559460e+01 1.42548762e+02
            3.67319151e+02 8.81932854e+02 1.82414389e+03 3.00685611e+03
            3.94906715e+03 4.46368085e+03 4.68845124e+03 4.77694405e+03
            4.81034530e+03 4.82275079e+03 4.82733063e+03 4.82901765e+03
            4.82963857e+03 4.82986703e+03 4.82995108e+03 4.82998200e+03 4.82999338e+03 4.82999756e+03 4.82999910e+03 4.82999967e+03
            4.82999988e+03 4.82999996e+03 4.82999998e+03 4.82999999e+03
            4.83000000e+03 4.83000000e+03]
In [41]: from scipy.optimize import curve_fit
           c,cov=curve_fit(yp,f1,y1,p0,method='dogbox', maxfev=6000)
In [42]: yo=yp(f1,c[0],c[1],c[2],c[3])
In [43]: from sklearn.metrics import r2_score
           print(r2_score(yo,f1))
           -0.9508575186522852
```

Plotting Result: Prediction of Confirmed Cases

```
In [44]: plt.plot(f1,y1,'r.')
    plt.plot(f1,y0,'b-')
    plt.xlabel("Days since first case")
    plt.ylabel("No. of patients")

Out[44]: Text(0, 0.5, 'No. of patients')

**Text(0, 0.5, 'No. of patients')
```



Red dotted line denotes the actual data Blue Line dentotes the predicted value

Prediction of the Deceased

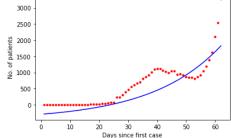
```
In [45]: df3=data.drop('Cured',axis=1)
    df3=df3.drop('Deaths',axis=1)
    df3=df3.drop('Confirmed',axis=1)

In [46]: f2=df3['Day'].values
    y2=df3['Active'].values
    f21=np.array([i for i in f2])
    y21=np.array([i for i in y2])
```

```
In [47]: theta=0.4
           n=len(f2)
           s2=np.empty(n)
          def yp2(f,tau,theta,gam,b):
    z=tau/(1+np.exp(-gam*(f-theta)))+b
               return(z)
           p0=[max(y21), np.median(f21),1,min(y21)]
           print(yp2(f21,max(y21), np.median(f21),1,min(y21)))
           [1.00000000e+00 1.00000000e+00 1.0000000e+00 1.00000000e+00
            1.00000001e+00 1.00000003e+00 1.00000008e+00 1.00000020e+00
           1.00000055e+00 1.00000151e+00 1.00000410e+00 1.00001114e+00
           1.00003028e+00 1.00008231e+00 1.00022374e+00 1.00060820e+00 1.00165325e+00 1.00449400e+00 1.01221592e+00 1.03320611e+00
            1.09026200e+00 1.24534593e+00 1.66683363e+00 2.81200837e+00
           5.92087544e+00 1.43419114e+01 3.70151979e+01 9.70854924e+01 2.49663114e+02 5.98990867e+02 1.23857831e+03 2.04142169e+03
           2.68100913e+03 3.03033689e+03 3.18291451e+03 3.24298480e+03
            3.26565809e+03 3.27407912e+03 3.27718799e+03 3.27833317e+03
            3.27875465e+03 3.27890974e+03 3.27896679e+03 3.27898778e+03
            3.27899551e+03 3.27899835e+03 3.27899939e+03 3.27899978e+03
            3.27899992e+03 3.27899997e+03 3.27899999e+03 3.27900000e+03
            3.27900000e+03 3.27900000e+03 3.27900000e+03 3.27900000e+03
            3.27900000e+03 3.27900000e+03 3.27900000e+03 3.27900000e+03
            3.27900000e+03 3.27900000e+03]
In [48]: | from scipy.optimize import curve_fit
           c2,cov2=curve_fit(yp2,f21,y21,p0,method='lm', maxfev=5000)
In [49]: yo2=yp2(f21,c2[0],c2[1],c2[2],c[3])
In [50]: from sklearn.metrics import r2 score
          print(r2_score(yo2,y21))
          0.5878413765131831
```

Plotting Result : Prediction of the Deceased

```
In [51]: plt.plot(f21,y21,'r.')
plt.plot(f21,y02,'b-')
           plt.xlabel("Days since first case")
           plt.ylabel("No. of patients")
Out[51]: Text(0, 0.5, 'No. of patients')
               2500
            ₽ 2000
```



The predicted of deaths is low due to the data being ununiform (no pattern) and high variation in the death data.

Forecasting Covid-19 Cases in Tamil Nadu

```
In [52]: fut=np.arange(42, 102)
In [53]: yo2_pred=yp(fut,c[0],c[1],c[2],c2[3])
In [54]: plt.plot(fut,yo2_pred,'b-')
          plt.xlabel("Days since first case")
          plt.ylabel("No. of Confirmed Cases")
Out[54]: Text(0, 0.5, 'No. of Confirmed Cases')
             16000
             14000
             12000
           of Confirmed
             10000
              8000
           9
              4000
```

The forecasting shows that the number of confirmed cases in Tamil Nadu will increase to about 7,750 Covid-19 cased by June 2020

Days since first case

Tamil Nadu Testing analysis

In [55]: test=pd.read_csv('covid19-in-india/StatewiseTestingDetails.csv')

In [56]: test

Out[56]:

	Date	State	TotalSamples	Negative	Positive
0	2020-04-17	Andaman and Nicobar Islands	1403.0	1210.0	12.0
1	2020-04-24	Andaman and Nicobar Islands	2679.0	NaN	27.0
2	2020-04-27	Andaman and Nicobar Islands	2848.0	NaN	33.0
3	2020-05-01	Andaman and Nicobar Islands	3754.0	NaN	33.0
4	2020-04-02	Andhra Pradesh	1800.0	1175.0	132.0
754	2020-04-30	West Bengal	16525.0	NaN	758.0
755	2020-05-01	West Bengal	18566.0	NaN	NaN
756	2020-05-02	West Bengal	20976.0	NaN	795.0
757	2020-05-03	West Bengal	22915.0	NaN	922.0
758	2020-05-04	West Bengal	25116.0	NaN	1259.0

759 rows × 5 columns

In [57]: tn=test[test['State']=='Tamil Nadu']

In [58]: tn.reset_index(drop=True, inplace=True)

In [59]: tn

z... [35].

Out[59]:

	Date	State	TotalSamples	Negative	Positive
0	2020-04-03	Tamil Nadu	3684.0	2789.0	411.0
1	2020-04-08	Tamil Nadu	5305.0	4414.0	690.0
2	2020-04-09	Tamil Nadu	7267.0	5824.0	834.0
3	2020-04-10	Tamil Nadu	8410.0	6838.0	911.0
4	2020-04-11	Tamil Nadu	9842.0	7779.0	969.0
5	2020-04-12	Tamil Nadu	10655.0	NaN	1075.0
6	2020-04-13	Tamil Nadu	12746.0	NaN	1173.0
7	2020-04-14	Tamil Nadu	19255.0	13234.0	1204.0
8	2020-04-15	Tamil Nadu	21994.0	15210.0	1242.0
9	2020-04-16	Tamil Nadu	26005.0	18743.0	1267.0
10	2020-04-17	Tamil Nadu	29673.0	21628.0	1323.0
11	2020-04-18	Tamil Nadu	35036.0	27192.0	1372.0
12	2020-04-19	Tamil Nadu	40876.0	31853.0	1477.0
13	2020-04-20	Tamil Nadu	46985.0	38082.0	1520.0
14	2020-04-21	Tamil Nadu	53045.0	43582.0	1596.0
15	2020-04-22	Tamil Nadu	59023.0	49506.0	1629.0
16	2020-04-23	Tamil Nadu	65977.0	56836.0	1683.0
17	2020-04-24	Tamil Nadu	72403.0	62596.0	1755.0
18	2020-04-25	Tamil Nadu	80110.0	69390.0	1821.0
19	2020-04-26	Tamil Nadu	87605.0	77133.0	1885.0
20	2020-04-27	Tamil Nadu	94781.0	83021.0	1937.0
21	2020-04-28	Tamil Nadu	101874.0	97908.0	2058.0
22	2020-04-29	Tamil Nadu	109961.0	105864.0	2162.0
23	2020-04-30	Tamil Nadu	119748.0	115761.0	2323.0
24	2020-05-01	Tamil Nadu	129363.0	124852.0	2526.0
25	2020-05-02	Tamil Nadu	139490.0	135698.0	2757.0
26	2020-05-03	Tamil Nadu	150107.0	145520.0	3023.0
27	2020-05-04	Tamil Nadu	162970.0	158558.0	3550.0

In [60]: tn.describe()

Out[60]:

	TotalSamples	Negative	Positive
count	28.000000	26.000000	28.000000
mean	60863.928571	58454.269231	1649.035714
std	49213.379674	48755.330025	719.709174
min	3684.000000	2789.000000	411.000000
25%	17627.750000	16093.250000	1196.250000
50%	50015.000000	46544.000000	1558.000000
75%	96554.250000	94186.250000	1967.250000
max	162970.000000	158558.000000	3550.000000

```
In [61]: tn.isna().sum()
Out[61]: Date
         TotalSamples
                         a
         Negative
         Positive
         dtype: int64
In [62]: tn=tn.fillna(tn.mean())
In [63]: tn
Out[63]:
                  Date
```

State TotalSamples Negative Positive 0 2020-04-03 Tamil Nadu 3684.0 2789.000000 411.0 1 2020-04-08 Tamil Nadu 5305.0 4414.000000 690.0 2 2020-04-09 Tamil Nadu 7267.0 5824.000000 834.0 3 2020-04-10 Tamil Nadu 8410.0 6838.000000 911.0 4 2020-04-11 Tamil Nadu 9842.0 7779.000000 969.0 5 2020-04-12 Tamil Nadu 10655.0 58454.269231 1075.0 6 2020-04-13 Tamil Nadu 12746.0 58454.269231 1173.0 7 2020-04-14 Tamil Nadu 19255.0 13234.000000 1204.0 8 2020-04-15 Tamil Nadu 21994.0 15210.000000 1242.0 2020-04-16 Tamil Nadu 26005.0 18743.000000 1267.0 2020-04-17 Tamil Nadu 29673.0 21628.000000 2020-04-18 Tamil Nadu 35036.0 27192.000000 2020-04-19 Tamil Nadu 40876.0 31853.000000 1477.0 2020-04-20 Tamil Nadu 46985.0 38082.000000 1520.0 2020-04-21 Tamil Nadu 53045.0 43582.000000 2020-04-22 Tamil Nadu 59023.0 49506.000000 1629.0 15 2020-04-23 Tamil Nadu 65977.0 56836.000000 1683.0 2020-04-24 Tamil Nadu 72403.0 62596.000000 1755.0 2020-04-25 Tamil Nadu 80110.0 69390.000000 1821.0 18 2020-04-26 Tamil Nadu 87605.0 77133.000000 1885.0 20 2020-04-27 Tamil Nadu 94781.0 83021.000000 1937.0 101874.0 97908.000000 2058.0 21 2020-04-28 Tamil Nadu 109961.0 105864.000000 2162.0 22 2020-04-29 Tamil Nadu 119748.0 115761.000000 2323.0 23 2020-04-30 Tamil Nadu 129363.0 124852.000000 2526.0 24 2020-05-01 Tamil Nadu 25 2020-05-02 Tamil Nadu 139490.0 135698.000000 2757.0 26 2020-05-03 Tamil Nadu 150107.0 145520.000000 3023.0 162970.0 158558.000000 27 2020-05-04 Tamil Nadu 3550.0

Total number of tests done in Tamil Nadu

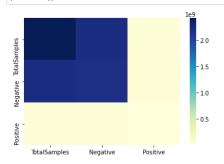
```
In [64]: tn_testing=tn.iloc[27, 2]
         tn testing
Out[64]: 162970.0
```

Total number positive test in Tamil Nadu

```
In [65]: tn_positive = tn.iloc[27,4]
          tn_positive
Out[65]: 3550.0
```

Finding Relation between the attributes

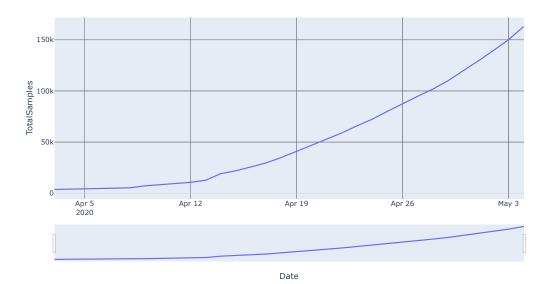
```
In [66]: covMatrix = pd.DataFrame.cov(tn)
         sn.heatmap(covMatrix, annot=False, fmt='g',cmap="YlGnBu")
         plt.show()
```



Cumulative Time Series graph on the testing done in Tamil Nadu

```
In [67]: fig = px.line(tn, x='Date', y='TotalSamples', title='Interactive Time Series graph with Covid-19 Cases in Tamil Nadu',hover_name='TotalSample
s')
fig.update_xaxes(rangeslider_visible=True)
fig.show()
```

Interactive Time Series graph with Covid-19 Cases in Tamil Nadu



Plotting of the Total cases, +ve covid-19 cases and -ve covid-19 cases

```
In [68]: fig = go.Figure()
fig.add_trace(go.Scatter(x=tn['Date'], y=tn['TotalSamples'],mode='lines',name='Total tests'))
fig.add_trace(go.Scatter(x=tn['Date'], y=tn['Positive'],mode='lines+markers',name='Test Covid +ve'))
fig.add_trace(go.Scatter(x=tn['Date'], y=tn['Negative'],mode='markers', name='Test Covid -ve'))

fig.show()
```



This tells us that more number of samples, more the chances of the test being negative.

```
In [69]: pop=pd.read_csv('covid19-in-india/population_india_census2011.csv')
```

In [70]: pop

Out[70]	:

	Sno	State / Union Territory	Population	Rural population	Urban population	Area	Density	Gender Ratio
0	1	Uttar Pradesh	199812341	155317278	44495063	240,928 km2 (93,023 sq mi)	828/km2 (2,140/sq mi)	912
1	2	Maharashtra	112374333	61556074	50818259	307,713 km2 (118,809 sq mi)	365/km2 (950/sq mi)	929
2	3	Bihar	104099452	92341436	11758016	94,163 km2 (36,357 sq mi)	1,102/km2 (2,850/sq mi)	918
3	4	West Bengal	91276115	62183113	29093002	88,752 km2 (34,267 sq mi)	1,029/km2 (2,670/sq mi)	953
4	5	Madhya Pradesh	72626809	52557404	20069405	308,245 km2 (119,014 sq mi)	236/km2 (610/sq mi)	931
5	6	Tamil Nadu	72147030	37229590	34917440	130,058 km2 (50,216 sq mi)	555/km2 (1,440/sq mi)	996
6	7	Rajasthan	68548437	51500352	17048085	342,239 km2 (132,139 sq mi)	201/km2 (520/sq mi)	928
7	8	Karnataka	61095297	37469335	23625962	191,791 km2 (74,051 sq mi)	319/km2 (830/sq mi)	973
8	9	Gujarat	60439692	34694609	25745083	196,024 km2 (75,685 sq mi)	308/km2 (800/sq mi)	919
9	10	Andhra Pradesh	49577103	34966693	14610410	162,968 km2 (62,922 sq mi)	303/km2 (780/sq mi)	993
10	11	Odisha	41974218	34970562	7003656	155,707 km2 (60,119 sq mi)	269/km2 (700/sq mi)	979
11	12	Telengana	35003674	21395009	13608665	112,077 km2 (43,273 sq mi)	312/km2 (810/sq mi)	988
12	13	Kerala	33406061	17471135	15934926	38,863 km2 (15,005 sq mi)	859/km2 (2,220/sq mi)	1084
13	14	Jharkhand	32988134	25055073	7933061	79,714 km2 (30,778 sq mi)	414/km2 (1,070/sq mi)	948
14	15	Assam	31205576	26807034	4398542	78,438 km2 (30,285 sq mi)	397/km2 (1,030/sq mi)	954
15	16	Punjab	27743338	17344192	10399146	50,362 km2 (19,445 sq mi)	550/km2 (1,400/sq mi)	895
16	17	Chhattisgarh	25545198	19607961	5937237	135,191 km2 (52,198 sq mi)	189/km2 (490/sq mi)	991
17	18	Haryana	25351462	16509359	8842103	44,212 km2 (17,070 sq mi)	573/km2 (1,480/sq mi)	879
18	19	Uttarakhand	10086292	7036954	3049338	53,483 km2 (20,650 sq mi)	189/km2 (490/sq mi)	963
19	20	Himachal Pradesh	6864602	6176050	688552	55,673 km2 (21,495 sq mi)	123/km2 (320/sq mi)	972
20	21	Tripura	3673917	2712464	961453	10,486 km2 (4,049 sq mi)	350/km2 (910/sq mi)	960
21	22	Meghalaya	2966889	2371439	595450	22,429 km2 (8,660 sq mi)	132/km2 (340/sq mi)	989
22	23	Manipur	2570390	1793875	776515	22,327 km2 (8,621 sq mi)	122/km2 (320/sq mi)	992
23	24	Nagaland	1978502	1407536	570966	16,579 km2 (6,401 sq mi)	119/km2 (310/sq mi)	931
24	25	Goa	1458545	551731	906814	3,702 km2 (1,429 sq mi)	394/km2 (1,020/sq mi)	973
25	26	Arunachal Pradesh	1383727	1066358	317369	83,743 km2 (32,333 sq mi)	17/km2 (44/sq mi)	938
26	27	Mizoram	1097206	525435	571771	21,081 km2 (8,139 sq mi)	52/km2 (130/sq mi)	976
27	28	Sikkim	610577	456999	153578	7,096 km2 (2,740 sq mi)	86/km2 (220/sq mi)	890
28	29	Delhi	16787941	419042	16368899	1,484 km2 (573 sq mi)	11,297/km2 (29,260/sq mi)	868
29	30	Jammu and Kashmir	12267032	9064220	3202812	125,535 km2 (48,469 sq mi)	98/km2 (250/sq mi)	890
30	31	Puducherry	1247953	395200	852753	479 km2 (185 sq mi)	2,598/km2 (6,730/sq mi)	1037
31	32	Chandigarh	1055450	28991	1026459	114 km2 (44 sq mi)	9,252/km2 (23,960/sq mi)	818
32	33	Dadra and Nagar Haveli and Daman and Diu	585764	243510	342254	603 km2 (233 sq mi)	970/km2 (2,500/sq mi)	711
33	34	Andaman and Nicobar Islands	380581	237093	143488	8,249 km2 (3,185 sq mi)	46/km2 (120/sq mi)	876
34	35	Ladakh	274000	43840	230160	96,701 km2 (37,336 sq mi)	2.8/km2 (7.3/sq mi)	853
35	36	Lakshadweep	64473	14141	50332	32 km2 (12 sq mi)	2,013/km2 (5,210/sq mi)	946

In [71]: pop.describe()

Out[71]:

	Sno	Population	Rural population	Urban population	Gender Ratio
count	36.000000	3.600000e+01	3.600000e+01	3.600000e+01	36.000000
mean	18.500000	3.362689e+07	2.315336e+07	1.047353e+07	937.583333
std	10.535654	4.305758e+07	3.212429e+07	1.312631e+07	65.544478
min	1.000000	6.447300e+04	1.414100e+04	5.033200e+04	711.000000
25%	9.750000	1.439840e+06	5.451570e+05	6.652765e+05	907.750000
50%	18.500000	2.106970e+07	1.278679e+07	5.167890e+06	947.000000
75%	27.250000	5.229275e+07	3.496766e+07	1.604342e+07	976.750000
max	36.000000	1.998123e+08	1.553173e+08	5.081826e+07	1084.000000

In [72]: pop=pop[pop['State / Union Territory']=='Tamil Nadu']

In [73]: pop.reset_index(drop=True, inplace=True)

In [74]: pop

Out[74]:

	Sno	State / Union Territory	Population	Rural population	Urban population	Area	Density	Gender Ratio
0	6	Tamil Nadu	72147030	37229590	34917440	130,058 km2 (50,216 sq mi)	555/km2 (1,440/sq mi)	996

In [75]: tn_population=pop.iloc[0, 2]

In [76]: tn_population

Out[76]: 72147030

In [77]: tn_testing

Out[77]: 162970.0

Population of Tamil Nadu: 72,147,030

Total testing by May 4th: 162,970

Only 2.18 % of the tests are turned out to be positive

Tamil Nadu Testing Prediction

```
In [84]: tn.columns
Out[84]: Index(['Date', 'State', 'TotalSamples', 'Negative', 'Positive'], dtype='object')
In [85]: tn['Day']=np.arange(len(tn))+1
In [86]: dff=tn.drop('State',axis=1)
            dff=dff.drop('Negative',axis=1)
dff=dff.drop('Positive',axis=1)
dff=dff.drop('Date',axis=1)
In [87]: f2=dff['Day'].values
    y2=dff['TotalSamples'].values
    f21=np.array([i for i in f2])
    y21=np.array([i for i in y2])
In [88]: theta=0.4
             n=len(f2)
            s2=np.empty(n)
def yp2(f,tau,theta,gam,b):
                  z=tau/(1+np.exp(-gam*(f-theta)))+b
                 return(z)
            p0=[max(y21), np.median(f21),1,min(y21)]
            print(yp2(f21,max(y21), np.median(f21),1,min(y21)))
            [ 3684.2234249
                                     3684.6073304
                                                         3685.65088463
                                                                              3688.48749158
                                    3717.15249461 3774.08633446 3928.64767238
5474.54204051 8461.01424555 16046.60759806
                3696.1976897
                4347.31034356
               33413.88761472 65211.80279403 105126.19720597 136924.11238528
             154291.39240194 161876.98575445 164863.45795949 165990.68965644 166409.35232762 166563.91366554 166620.84750539 166641.8023103
             166649.51250842 166652.34911537 166653.3926696 166653.7765751 ]
In [89]: from scipy.optimize import curve_fit
c2,cov2=curve_fit(yp2,f21,y21,p0,method='dogbox', maxfev=2000)
In [90]: yo2=yp2(f21,c2[0],c2[1],c2[2],c[3])
In [91]: from sklearn.metrics import r2_score
            print(r2_score(yo2,y21))
```

0.8983137329480259

```
In [92]: plt.plot(f21,y21,'r.')
plt.plot(f21,y02,'b-')
plt.xlabel("Days since first Test")
plt.ylabel("No. of Total Tests")

Out[92]: Text(0, 0.5, 'No. of Total Tests')

175000
150000
150000
25000
25000
```

Tamil Nadu Testing Forecasting

From the above forecasting, a total number of 3 lakh tests are expected to be performed by the end of May-2020

10 15 Days since first Test

```
In [96]: indi=pd.read_csv('covid19-in-india/IndividualDetails.csv')
In [97]: indi
Out[97]:
                        id government_id diagnosed_date
                                                                               detected_city detected_district detected_state nationality
                                                             age
                                                                  gender
                                                                                                                                           current_status status_change_date
                                                                                                                                                                                         notes
                                                                                                                                                                                  Travelled from
                 0
                        0
                                 KL-TS-P1
                                                 30/01/2020
                                                              20
                                                                        F
                                                                                    Thrissur
                                                                                                      Thrissur
                                                                                                                       Kerala
                                                                                                                                     India
                                                                                                                                               Recovered
                                                                                                                                                                    14/02/2020
                                                                                                                                                                                  Travelled from
                                 KL-AL-P1
                                                 02/02/2020 NaN
                                                                      NaN
                                                                                  Alappuzha
                                                                                                    Alappuzha
                                                                                                                       Kerala
                                                                                                                                     India
                                                                                                                                               Recovered
                                                                                                                                                                    14/02/2020
                                                                                                                                                                                  Travelled from Wuhan
                                 KL-KS-P1
                                                 03/02/2020 NaN
                                                                      NaN
                                                                                                                                                                    14/02/2020
                                                                                  Kasaragod
                                                                                                    Kasaragod
                                                                                                                        Kerala
                                                                                                                                     India
                                                                                                                                                Recovered
                                                                            East Delhi (Mayur
Vihar)
                                                                                                                                                                                  Travelled from
Austria, Italy
                                                 02/03/2020
                                    DL-P1
                                                              45
                                                                                                     East Delhi
                                                                                                                         Delhi
                                                                                                                                                                    15/03/2020
                                                                                                                                     India
                                                                                                                                               Recovered
                                                                                                                                                                                  Travelled from
                                                                                                                                                                                      Dubai to
                                    TS-P1
                                                 02/03/2020
                                                              24
                                                                        М
                                                                                  Hyderabad
                                                                                                    Hyderabad
                                                                                                                     Telangana
                                                                                                                                     India
                                                                                                                                               Recovered
                                                                                                                                                                    02/03/2020
                                                                                                                                                                                  Bangalore on
20th Feb,...
            27885 27886
                                      NaN
                                                 26/04/2020 NaN
                                                                      NaN
                                                                                        NaN
                                                                                                         NaN
                                                                                                                         Delhi
                                                                                                                                      NaN
                                                                                                                                               Hospitalized
                                                                                                                                                                    26/04/2020
                                                                                                                                                                                Details awaited
            27886 27887
                                      NaN
                                                 26/04/2020
                                                                      NaN
                                                                                        NaN
                                                                                                         NaN
                                                                                                                   Uttarakhand
                                                                                                                                      NaN
                                                                                                                                               Hospitalized
                                                                                                                                                                    26/04/2020
            27887 27888
                                                 26/04/2020
                                                                                        NaN
                                                                                                                         Bihar
                                                                                                                                               Hospitalized
                                                                                                                                                                    26/04/2020
                                                                                                       Munger
            27888 27889
                                      NaN
                                                 26/04/2020
                                                                                        NaN
                                                                                                       Munger
                                                                                                                         Bihar
                                                                                                                                      NaN
                                                                                                                                               Hospitalized
                                                                                                                                                                    26/04/2020
            27889 27890
                                                 26/04/2020
                                                              17
                                                                                        NaN
                                                                                                                         Bihar
                                                                                                                                               Hospitalized
                                                                                                                                                                    26/04/2020
                                                                                                       Munger
           27890 rows × 12 columns
In [98]: ind=indi[indi['detected state']=='Tamil Nadu']
```

```
In [99]: ind.describe(include="all")
 Out[99]:
                              id government_id diagnosed_date age gender detected_city detected_district detected_state nationality current_status status_change_date
                                                                                                                                                                             notes
              count
                     1885.000000
                                           1885
                                                           1885 420
                                                                         1013
                                                                                       103
                                                                                                       1885
                                                                                                                      1885
                                                                                                                                  60
                                                                                                                                               1885
                                                                                                                                                                   1885
                                                                                                                                                                              1882
             unique
                            NaN
                                           1885
                                                             40
                                                                  80
                                                                           2
                                                                                        35
                                                                                                         36
                                                                                                                                    4
                                                                                                                                                  3
                                                                                                                                                                     39
                                                                                                                                                                                56
                                                                                                                                                                            Details
awaited
                            NaN
                                       TN-P1476
                                                      01/04/2020
                                                                                                                                 India
                                                                                                                                         Hospitalized
                                                                                                                                                              01/04/2020
                top
                                                                           M Mettupalayam
                                                                                                    Chennai
                                                            110
               freq
                            NaN
                                                                   16
                                                                                                                      1885
                                                                                                                                                                    110
                    10133.529973
                                                           NaN
                                                                NaN
                                                                         NaN
                                                                                                       NaN
                                                                                                                      NaN
                                                                                                                                                NaN
                                                                                                                                                                              NaN
                     7701.043559
                                                           NaN
                                                                 NaN
                                                                         NaN
                                                                                                       NaN
                                                                                                                      NaN
                                                                                                                                                NaN
                                                                                                                                                                              NaN
                                                                 NaN
                       33.000000
                                                           NaN
                                                                         NaN
                                                                                                       NaN
                                                                                                                      NaN
               min
                     3439.000000
               25%
                                           NaN
                                                                                       NaN
                                                                                                       NaN
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                                                                                                                                                                              NaN
                                                           NaN
                                                                 NaN
                                                                         NaN
               50%
                     7968.000000
                                           NaN
                                                                                       NaN
                                                                                                       NaN
                                                                                                                      NaN
                                                                                                                                 NaN
                                                                                                                                                NaN
                                                                                                                                                                   NaN
                                                                                                                                                                              NaN
                                                           NaN
                                                                 NaN
                                                                         NaN
               75% 16189.000000
                                           NaN
                                                           NaN
                                                                                       NaN
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                                                                                                                      NaN
                                                                                                                                 NaN
                                                                                                                                                NaN
                                                                                                                                                                   NaN
                                                                                                                                                                              NaN
                                                                 NaN
                                                                         NaN
               max 26593.000000
                                           NaN
                                                           NaN
                                                                                       NaN
                                                                                                       NaN
                                                                                                                                 NaN
                                                                                                                                                NaN
                                                                                                                                                                              NaN
                                                                 NaN
                                                                         NaN
                                                                                                                      NaN
                                                                                                                                                                   NaN
In [100]: ind['detected_district'].unique()
'Kamanathapuram', 'Thiruvallur', 'Nagapattinam', 'Cuddalore',
'Kallakurichi', 'Perambalur', 'Tiruchirappalli', 'Nilgiris',
'Ariyalur', 'Tenkasi', 'Pudukkottai', 'Dharmapuri'], dtype=object)
In [101]: ind.isnull().sum()
Out[101]: id
                                         0
            government_id
diagnosed_date
                                         0
            age
                                      1465
            gender
                                       872
            detected_city
                                      1782
            detected_district
detected_state
                                         0
            nationality
                                      1825
            current_status
status_change_date
                                         0
            notes
                                         3
            dtype: int64
```

There are missing values in of age, gender, city, and nationality

But all the districts are recorded

```
In [102]: df=ind['detected_district'].value_counts()
In [103]: type(df)
Out[103]: pandas.core.series.Series
In [104]: df.unique()
Out[104]: array([528, 141, 112, 79, 75, 70, 65, 59, 55, 54, 51, 44, 41,
                 38, 35, 32, 31, 30,
                                             26,
                                                 23,
                                                      18,
                                                          16, 15,
                                                                    12,
                                    1], dtype=int64)
                           6,
                               5,
In [105]: count=0
          lis=[]
          for i in range(36):
              count=df[i]
              lis.append(count)
```

```
In [108]: df = pd.DataFrame(list(zip(11, lis)),columns =['Districts', 'Count'])
df
```

Out[108]:

	Districts	Count
0	Chennai	528
1	Coimbatore	141
2	Tiruppur	112
3	Dindigul	79
4	Madurai	75
5	Erode	70
6	Tirunelveli	65
7	Namakkal	59
8	Thanjavur	55
9	Chengalpattu	55
10	Thiruvallur	54
11	Viluppuram	51
12	Tiruchirappalli	51
13	Nagappattinam	44
14	Theni	44
15	Karur	41
16	Ranipet	38
17	Tenkasi	35
18	Virudunagar	32
19	Salem	31
20	Thiruvarur	30
21	Thoothukkudi	27
22	Cuddalore	26
23	Vellore	23
24	Kancheepuram	18
25	Tirupathur	18
26	Kanniyakumari	16
27	Ramanathapuram	15
28	Sivaganga	12
29	Tiruvannamalai	11
30	The Nilgiris	9
31	Perambalur	7
32	Kallakurichi	6
33	Ariyalur	5
34	Pudukkottai	1
35	Dharmapuri	1
36	Krishnagiri	0

```
In [109]: import geopandas as gpd
fp = "covid19-in-india/gadm36_IND_2.shp"
map_df = gpd.read_file(fp)

map_df = map_df[['NAME_1', 'NAME_2', 'geometry']]
map_df = map_df[map_df['NAME_1']=='Tamil Nadu']
map_df.plot()

map_df.head()
```

Out[109]:

	NAME_1	NAME_2	geometry
508	Tamil Nadu	Ariyalur	POLYGON ((79.25848 10.97425, 79.25031 10.96728
509	Tamil Nadu	Chennai	POLYGON ((80.23345 12.96909, 80.22396 12.95902
510	Tamil Nadu	Coimbatore	POLYGON ((77.15656 10.78965, 77.15119 10.78552
511	Tamil Nadu	Cuddalore	POLYGON ((79.63276 11.23497, 79.62713 11.23186
512	Tamil Nadu	Dharmapuri	POLYGON ((78.70405 11.96791, 78.69788 11.94817



```
In [110]: map_df = map_df[['NAME_2', 'geometry']]
map_df.plot()
```

Out[110]: <matplotlib.axes._subplots.AxesSubplot at 0x28ca66f4f98>



```
In [111]: district_wise = df[['Districts', 'Count']]
    district_wise
```

Out[111]:

	Districts	Count
0	Chennai	528
1	Coimbatore	141
2	Tiruppur	112
3	Dindigul	79
4	Madurai	75
5	Erode	70
6	Tirunelveli	65
7	Namakkal	59
8	Thanjavur	55
9	Chengalpattu	55
10	Thiruvallur	54
11	Viluppuram	51
12	Tiruchirappalli	51
13	Nagappattinam	44
14	Theni	44
15	Karur	41
16	Ranipet	38
17	Tenkasi	35
18	Virudunagar	32
19	Salem	31
20	Thiruvarur	30
21	Thoothukkudi	27
22	Cuddalore	26
23	Vellore	23
24	Kancheepuram	18
25	Tirupathur	18
26	Kanniyakumari	16
27	Ramanathapuram	15
28	Sivaganga	12
29	Tiruvannamalai	11
30	The Nilgiris	9
31	Perambalur	7
32	Kallakurichi	6
33	Ariyalur	5
34	Pudukkottai	1
35	Dharmapuri	1
36	Krishnagiri	0

```
In [112]: district_wise = df[['Districts', 'Count']]
             merged = map_df.set_index('NAME_2').join(district_wise.set_index('Districts'))
Out[112]:
                                                                        geometry Count
                      NAME 2
                       Ariyalur POLYGON ((79.25848 10.97425, 79.25031 10.96728...
                                                                                       5
                      Chennai POLYGON ((80.23345 12.96909, 80.22396 12.95902...
                                                                                     528
                               POLYGON ((77.15656 10.78965, 77.15119 10.78552...
                               POLYGON ((79.63276 11.23497, 79.62713 11.23186...
                    Cuddalore
                    Dharmapuri POLYGON ((78.70405 11.96791, 78.69788 11.94817...
                       Dindigul POLYGON ((78.15361 10.08057, 78.15300 10.08310...
                                                                                      79
                               POLYGON ((77.84909 11.23407, 77.85358 11.22551...
                                                                                      70
                 Kancheepuram MULTIPOLYGON (((79.96208 12.22216, 79.96208 12...
                 Kanniyakumari MULTIPOLYGON (((77.55596 8.07903, 77.55596 8.0...
                         Karur POLYGON ((78.49814 10.68002, 78.48006 10.68318...
                    Krishnagiri POLYGON ((78.63942 12.24634, 78.64082 12.23947...
                       Madurai POLYGON ((78.06779 9.74771, 78.06450 9.73725, ...
                 Nagappattinam MULTIPOLYGON (((79.74597 10.27736, 79.74541 10...
                     Namakkal POLYGON ((78.43343 11.33039, 78.43341 11.32425...
                    Perambalur POLYGON ((78.99304 11.04352, 78.98911 11.04572...
                   Pudukkottai
                               POLYGON ((78.95749 9.98304, 78.95445 9.98641, ...
              Ramanathapuram MULTIPOLYGON (((79.53009 9.38596, 79.53014 9.3...
                                                                                      15
                        Salem POLYGON ((78.22656 11.90686, 78.22643 11.90152...
                    Sivaganga POLYGON ((78.70577 9.69627, 78.72670 9.69614, ...
                                                                                      12
                    Thanjavur MULTIPOLYGON (((79.51510 10.32097, 79.51486 10...
                                                                                      55
                    The Nilgiris POLYGON ((76.85727 11.34142, 76.85609 11.33792...
                               POLYGON ((77.34090 9.59505, 77.32851 9.57323, ...
                         Theni
                    Thiruvallur MULTIPOLYGON (((80.02853 13.12436, 80.02964 13...
                                                                                      54
                    Thiruvarur MULTIPOLYGON (((79.62569 10.34375, 79.62569 10...
                                                                                      30
                  Thoothukkudi MULTIPOLYGON (((78.11542 8.61681, 78.11542 8.6...
                                                                                      27
                  Tiruchirappalli POLYGON ((78.36396 10.29705, 78.35506 10.29553...
                                                                                      51
                     Tirunelyeli MULTIPOLYGON (((77.96347 8.32891, 77.96347 8.3...
                                                                                      65
                      Tiruppur POLYGON ((77.43851 11.11145, 77.44918 11.10544...
                                                                                     112
                 Tiruvannamalai POLYGON ((79.50778 12.34159, 79.50247 12.33965...
                                                                                      11
                       Vellore POLYGON ((78.84798 12.62251, 78.84678 12.61580...
                                                                                      23
                    Viluppuram MULTIPOLYGON (((79.94625 12.21915, 79.94625 12...
                                                                                      51
                   Virudunagar POLYGON ((77.96670 9.24325, 77.95448 9.23935, ...
                                                                                      32
In [113]: merged.isna().sum()
Out[113]: geometry
             dtype: int64
In [114]: with pd.option_context('display.max_rows', None, 'display.max_columns', None): # more options can be specified also
                  print(merged)
                                                                                      geometry Count
             NAME_2
             Ariyalur
                                  POLYGON ((79.25848 10.97425, 79.25031 10.96728...
             Chennai
                                  POLYGON ((80.23345 12.96909, 80.22396 12.95902...
                                                                                                      528
             Coimbatore
                                   POLYGON
                                            ((77.15656 10.78965, 77.15119 10.78552...
                                                                                                     141
                                  POLYGON ((79.63276 11.23497, 79.62713 11.23186...
POLYGON ((78.70405 11.96791, 78.69788 11.94817...
             Cuddalore
                                                                                                      26
             Dharmapuri
                                  POLYGON ((78.15361 10.08057, 78.15300 10.08310...
             Dindigul
                                                                                                       79
                                  POLYGON ((77.84909 11.23407, 77.85358 11.22551...
MULTIPOLYGON (((79.96208 12.22216, 79.96208 12...
             Frode
                                                                                                       70
             Kancheepuram
                                                                                                       18
                                  MULTIPOLYGON (((77.55596 8.07903, 77.55596 8.0...
             Kanniyakumari
                                  POLYGON ((78.49814 10.68002, 78.48006 10.68318...
POLYGON ((78.63942 12.24634, 78.64082 12.23947...
             Karur
                                                                                                      41
             Krishnagiri
             Madurai
                                  POLYGON ((78.06779 9.74771, 78.06450 9.73725, ...
MULTIPOLYGON (((79.74597 10.27736, 79.74541 10...
                                                                                                      75
                                                                                                      44
             Nagappattinam
             Namakkal
                                  POLYGON ((78.43343 11.33039, 78.43341 11.32425...
                                                                                                       59
             Perambalur
                                  POLYGON ((78.99304 11.04352, 78.98911 11.04572...
POLYGON ((78.95749 9.98304, 78.95445 9.98641, ...
             Pudukkottai
             Ramanathapuram
                                  MULTIPOLYGON (((79.53009 9.38596, 79.53014 9.3...
             Salem
                                  POLYGON ((78.22656 11.90686, 78.22643 11.90152...
POLYGON ((78.70577 9.69627, 78.72670 9.69614, ...
                                                                                                       31
             Sivaganga
                                                                                                       12
             Thaniavur
                                  MULTIPOLYGON (((79.51510 10.32097, 79.51486 10...
                                                                                                       55
             The Nilgiris
                                  POLYGON ((76.85727 11.34142, 76.85609 11.33792...
POLYGON ((77.34090 9.59505, 77.32851 9.57323, ...
                                                                                                        9
             Theni
             Thiruvallur
                                  MULTIPOLYGON (((80.02853 13.12436, 80.02964 13...
                                                                                                       54
                                                                                                      30
             Thiruvarur
                                  MULTIPOLYGON (((79.62569 10.34375, 79.62569 10...
             Thoothukkudi
                                   MULTIPOLYGON (((78.11542 8.61681, 78.11542 8.6...
                                  POLYGON ((78.36396 10.29705, 78.35506 10.29553...
MULTIPOLYGON (((77.96347 8.32891, 77.96347 8.3...
             Tiruchirappalli
                                                                                                       51
             Tirunelveli
                                                                                                      65
                                   POLYGON ((77.43851 11.11145, 77.44918 11.10544...
             Tiruppur
                                                                                                      112
                                  POLYGON ((79.50778 12.34159, 79.50247 12.33965...
POLYGON ((78.84798 12.62251, 78.84678 12.61580...
             Tiruvannamalai
                                                                                                      11
             Vellore
                                                                                                       23
```

32

Viluppuram

Virudunagar

MULTIPOLYGON (((79.94625 12.21915, 79.94625 12... POLYGON ((77.96670 9.24325, 77.95448 9.23935, ...

District wise Covid-19 Cases Thoughout Tamil Nadu

