ML_Assignment

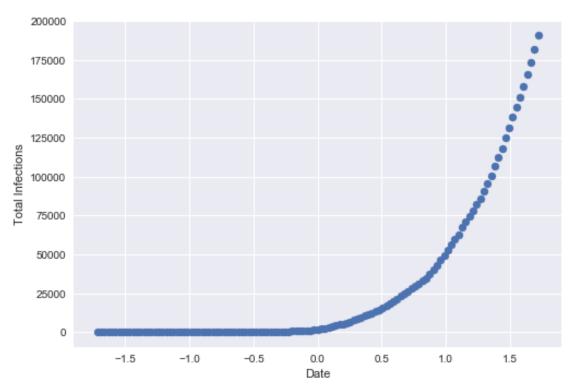
June 4, 2020

```
[1]: import numpy as np
     import pandas as pd
     import matplotlib.pyplot as plt
    0.0.1 Pred 1: Total Cases till 31st July
[2]: df=pd.read_csv('/Users/shivam_goyal/Downloads/ML Assignment/cases.csv')
[3]: df['Date_numbers']=np.arange(len(df))
     df.head()
[3]:
        cases_time_series/dailyconfirmed cases_time_series/dailydeceased
     0
                                                                           0
     1
                                         0
                                                                           0
     2
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                                                                           0
     3
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     4
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        cases_time_series/dailyrecovered cases_time_series/date
     0
                                                      30 January
                                         0
                                                      31 January
     1
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                                         0
                                                     01 February
     3
                                                     02 February
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        cases_time_series/totalconfirmed cases_time_series/totaldeceased
     0
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     4
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                                                                            0
        cases_time_series/totalrecovered
                                            statewise/active statewise/confirmed
                                                     93517.0
                                                                          190791.0
     0
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                                                     36040.0
                                                                           67655.0
     1
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                                                                           22333.0
     3
                                                     10893.0
                                                                           19844.0
```

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4
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                                                                            16794.0
                                                       5837.0
        statewise/deaths
                                                              tested/source
     0
                  5408.0
                                        Press_Release_ICMR_13March2020.pdf
     1
                   2286.0
                                  ICMR_website_update_18March_6PM_IST.pdf
     2
                   176.0
                              ICMR_website_update_19March_10AM_IST_V2.pdf
                                  ICMR_website_update_19March_6PM_IST.pdf
     3
                   473.0
     4
                   1038.0
                                 ICMR_website_update_20March_10AM_IST.pdf
        tested/testpositivityrate
                                    tested/testsconductedbyprivatelabs
     0
                             1.20%
                                                                     NaN
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       tested/testsperconfirmedcase
                                      tested/testspermillion
     0
                               83.33
                                                           5.0
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     1
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     3
                               77.88
                                                          11.0
                               69.79
     4
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        tested/totalindividualstested tested/totalpositivecases
     0
                                5900.0
                                                                78
     1
                               12235.0
                                                               150
     2
                               12426.0
                                                               168
     3
                               13285.0
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       tested/totalsamplestested tested/updatetimestamp
                                                           Date_numbers
                                      13/03/2020 00:00:00
     0
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                                      19/03/2020 10:00:00
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     3
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                                     19/03/2020 18:00:00
                          14376.0
                                      20/03/2020 10:00:00
                                                                       4
     [5 rows x 32 columns]
[4]: df=df.values
[5]: y_train=df[:,4]
     x_train=df[:,-1]
     u=x_train.mean()
     std=x_train.std()
     print(u,std)
     x_train=(x_train-u)/std
```

61.0 35.505868059613285

```
[6]: plt.style.use('seaborn')
  plt.xlabel('Date')
  plt.ylabel('Total Infections')
  plt.scatter(x_train,y_train)
  plt.show()
```



```
[7]: x_orig=x_train
y_orig=y_train
print(x_train.shape,y_train.shape)
```

(123,) (123,)

```
[8]: # LOCALLY WEIGHTED REGRESSION

def getW(query_point,X,tau):
    M=X.shape[0]
    W=np.mat(np.eye(M))
    for i in range(M):
        xi=X[i].astype(float)
        x=query_point
        W[i,i]=np.exp(np.dot((xi-x),(xi-x).T)/(-2*tau*tau))
    return W
```

```
[9]: x_=(183-u)/std
      print(x_)
     3.436051747704511
[10]: x_{train}=x_{train}.reshape((123,-1))
      y_train=y_train.reshape((123,-1))
      x_train=np.mat(x_train,dtype=float)
      y_train=np.mat(y_train,dtype=float)
      print(x train.shape)
     (123, 1)
[11]: M=x_train.shape[0]
      print(M)
     123
[12]: W=getW(x_,x_train,0.5)
      print(W.shape)
      print(W)
     (123, 123)
     [[8.44023350e-24 0.0000000e+00 0.0000000e+00 ... 0.0000000e+00
       0.0000000e+00 0.0000000e+001
      [0.00000000e+00 1.50603984e-23 0.00000000e+00 ... 0.00000000e+00
       0.00000000e+00 0.0000000e+001
      [0.00000000e+00 0.00000000e+00 2.67880113e-23 ... 0.00000000e+00
       0.0000000e+00 0.0000000e+001
      [0.00000000e+00 0.0000000e+00 0.0000000e+00 ... 1.84243276e-03
       0.0000000e+00 0.0000000e+00]
      [0.0000000e+00 0.0000000e+00 0.0000000e+00 ... 0.0000000e+00
       2.24654757e-03 0.00000000e+00]
      [0.00000000e+00 0.0000000e+00 0.0000000e+00 ... 0.0000000e+00
       0.00000000e+00 2.73062214e-03]]
[13]: def predict(X,Y,query_x,tau):
          ones=np.ones((M,1))
          X_=np.hstack((X,ones))
          print('X',X_.shape)
          qx=np.mat([query_x,1])
          print('qx',qx.shape)
          print('Y',Y.shape)
          W=getW(qx,X_,tau)
          print('W',W.shape)
          theta=np.linalg.pinv(X_.T*(W*X_.))*(X_.T*(W*Y))
          print(theta.shape)
```

```
pred=np.dot(qx,theta)
          return theta, pred
[14]: theta,pred_july=predict(x_train,y_train,x_,0.5)
     X (123, 2)
     qx (1, 2)
     Y (123, 1)
     W (123, 123)
     (2, 1)
[15]: print(pred_july)
     [[586109.75123282]]
     The total number of cases till 31st july should be approx 586110
[16]: # 137-> jan to june
      # 183-> jan to july
      time_period=[]
      pred_values_infections=[]
      for i in range(137,183):
          e=(i-u)/std
          time_period.append(e)
          theta,pred=predict(x_train,y_train,time_period[i-137],0.5)
          pred_values_infections.append(pred)
     X (123, 2)
     qx (1, 2)
     Y (123, 1)
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- X (123, 2)
- qx (1, 2)
- Y (123, 1)

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W (123, 123)
     (2, 1)
     X (123, 2)
     qx (1, 2)
     Y (123, 1)
     W (123, 123)
     (2, 1)
     X (123, 2)
     qx(1, 2)
     Y (123, 1)
     W (123, 123)
     (2, 1)
     X (123, 2)
     qx(1, 2)
     Y (123, 1)
     W (123, 123)
     (2, 1)
[17]: b=np.array(pred values infections)
      b=b.flatten()
      b
[17]: array([254317.12899852, 260553.90705421, 266851.13354357, 273207.50056603,
             279621.7033718, 286092.44223478, 292618.42421826, 299198.36483443,
             305830.98959867, 312515.03548041, 319249.25225258, 326032.40374194,
             332863.26898264, 339740.64327611, 346663.33915993, 353630.18728874,
             360640.03723059, 367691.75818149, 374784.23960188, 381916.39177787,
             389087.14631089, 396295.45653873, 403540.29789131, 410820.66818435,
             418135.58785417, 425484.10013655, 432865.27119269, 440278.19018552,
             447721.96930868, 455195.74377158, 462698.67174279, 470229.93425487,
             477788.73507251, 485374.30052747, 492985.87932166, 500622.74230155,
             508284.1822056 , 515969.51338688 , 523678.0715137 , 531409.2132491 ,
             539162.31591183, 546936.77712082, 554732.01442415, 562547.46491487,
             570382.58483524, 578236.84917024])
[18]: print(type(b))
      print(b.shape[0])
     <class 'numpy.ndarray'>
     46
     0.0.2 Pred 2: Number of deaths till 31st july
[19]: df2=pd.read csv('/Users/shivam goyal/Downloads/ML Assignment/cases.csv')
[20]: df2['Date_numbers']=np.arange(len(df))
      df2.head()
```

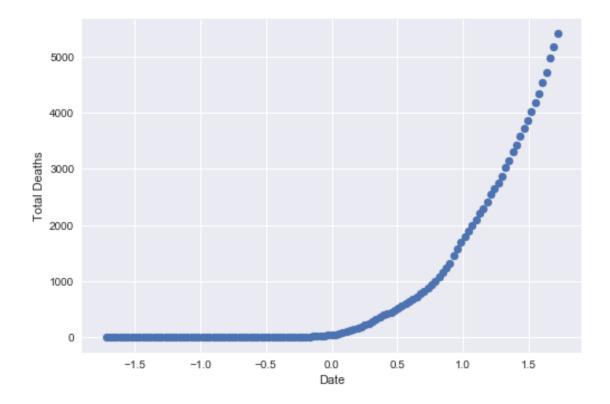
```
cases_time_series/dailyconfirmed
[20]:
                                            cases_time_series/dailydeceased
      0
                                                                             0
                                          0
                                                                             0
      1
      2
                                          0
                                                                             0
      3
                                          1
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      4
                                                                             0
         cases_time_series/dailyrecovered cases_time_series/date
      0
                                          0
                                                        30 January
                                          0
                                                        31 January
      1
      2
                                          0
                                                       01 February
      3
                                          0
                                                       02 February
      4
                                          0
                                                       03 February
         cases_time_series/totalconfirmed
                                             cases_time_series/totaldeceased
      0
      1
                                          1
                                                                             0
      2
                                                                             0
                                          1
      3
                                          2
                                                                             0
      4
                                          3
         cases time series/totalrecovered
                                             statewise/active
                                                               statewise/confirmed
                                                                            190791.0
      0
                                                       93517.0
                                          0
                                                       36040.0
                                                                             67655.0
      1
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      3
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         statewise/deaths
                                                               tested/source \
      0
                    5408.0
                                         Press_Release_ICMR_13March2020.pdf
                                    ICMR_website_update_18March_6PM_IST.pdf
      1
                    2286.0
                     176.0
                                ICMR_website_update_19March_10AM_IST_V2.pdf
      2
      3
                     473.0
                                    ICMR_website_update_19March_6PM_IST.pdf
      4
                    1038.0
                                   ICMR_website_update_20March_10AM_IST.pdf
                                     tested/testsconductedbyprivatelabs
         tested/testpositivityrate
                              1.20%
      0
                                                                       NaN
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        tested/testsperconfirmedcase
                                        tested/testspermillion
                                                            5.0
      0
                                83.33
      1
                                87.50
                                                           10.0
      2
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                                                           10.0
      3
                                77.88
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```

```
tested/totalindividualstested tested/totalpositivecases
      0
                                5900.0
      1
                               12235.0
                                                              150
      2
                               12426.0
                                                              168
      3
                               13285.0
                                                              182
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                                                              206
        tested/totalsamplestested tested/updatetimestamp Date_numbers
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                                     13/03/2020 00:00:00
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                                     18/03/2020 18:00:00
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                          13316.0
                                     19/03/2020 10:00:00
      3
                          14175.0
                                     19/03/2020 18:00:00
                                                                      3
      4
                          14376.0
                                     20/03/2020 10:00:00
                                                                      4
      [5 rows x 32 columns]
[21]: df=df2.values
      y_train=df[:,5]
      x_train=df[:,-1]
      u=x_train.mean()
      std=x_train.std()
      print(u,std)
      x_train=(x_train-u)/std
     61.0 35.505868059613285
[22]: plt.style.use('seaborn')
      plt.xlabel('Date')
      plt.ylabel('Total Deaths')
      plt.scatter(x_train,y_train)
      plt.show()
```

11.0

69.79

4



```
y_train=y_train.reshape((123,-1))
      x_train=np.mat(x_train,dtype=float)
      y_train=np.mat(y_train,dtype=float)
      print(x_train.shape)
     (123, 1)
[24]: W=getW(x_,x_train,0.5)
      print(W.shape)
      print(W)
     (123, 123)
     [[8.44023350e-24 0.00000000e+00 0.00000000e+00 ... 0.00000000e+00
       0.00000000e+00 0.0000000e+00]
      [0.00000000e+00 1.50603984e-23 0.00000000e+00 ... 0.00000000e+00
       0.0000000e+00 0.0000000e+00]
      [0.00000000e+00 0.00000000e+00 2.67880113e-23 ... 0.00000000e+00
       0.0000000e+00 0.0000000e+00]
      [0.00000000e+00 0.00000000e+00 0.00000000e+00 ... 1.84243276e-03
       0.0000000e+00 0.0000000e+00]
      [0.00000000e+00 0.00000000e+00 0.0000000e+00 ... 0.00000000e+00
```

[23]: x_train=x_train.reshape((123,-1))

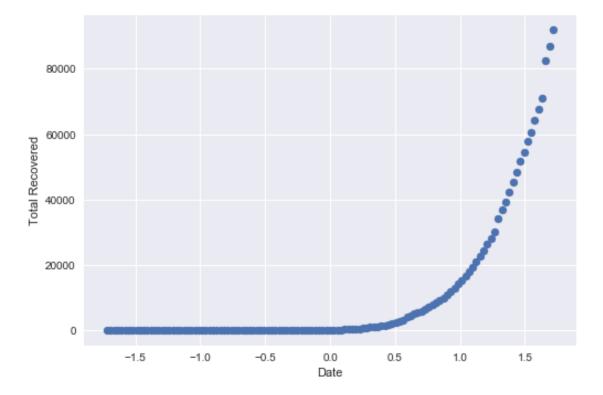
```
2.24654757e-03 0.00000000e+00]
      [0.00000000e+00 0.0000000e+00 0.0000000e+00 ... 0.0000000e+00
       0.00000000e+00 2.73062214e-03]]
[25]: theta,pred=predict(x_train,y_train,x_,0.5)
     X (123, 2)
     qx (1, 2)
     Y (123, 1)
     W (123, 123)
     (2, 1)
[26]: print(pred)
     [[15522.38508576]]
     The total number of deaths till 31st july should be approx 15522
     0.0.3 Pred 3: Recovery and Death Rate from 15th June - 31st July
[27]: df3=pd.read_csv('/Users/shivam_goyal/Downloads/ML Assignment/cases.csv')
      df3['Date_numbers']=np.arange(len(df))
      df3.head()
[27]:
         cases_time_series/dailyconfirmed cases_time_series/dailydeceased
                                         0
                                                                           0
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      3
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         cases_time_series/dailyrecovered cases_time_series/date \
      0
                                                      30 January
                                                      31 January
      1
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         cases_time_series/totalconfirmed cases_time_series/totaldeceased
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         statewise/deaths
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                                         Press_Release_ICMR_13March2020.pdf
                    5408.0
      0
                                    ICMR_website_update_18March_6PM_IST.pdf
                    2286.0
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                     473.0
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                                   ICMR_website_update_20March_10AM_IST.pdf
         tested/testpositivityrate
                                      tested/testsconductedbyprivatelabs
      0
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                                        tested/testspermillion
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                                                            5.0
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                                83.33
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                                13285.0
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                                13486.0
                                                                206
        tested/totalsamplestested tested/updatetimestamp
                                                             Date_numbers
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                            6500.0
                                       13/03/2020 00:00:00
                                                                         0
                           13125.0
                                                                         1
      1
                                       18/03/2020 18:00:00
      2
                           13316.0
                                      19/03/2020 10:00:00
                                                                         2
      3
                           14175.0
                                      19/03/2020 18:00:00
                                                                         3
                           14376.0
                                      20/03/2020 10:00:00
                                                                         4
      [5 rows x 32 columns]
[28]: df=df3.values
      y_train_recover=df[:,6]
      y_train_death=df[:,5]
      x_train=df[:,-1]
      u=x_train.mean()
      std=x_train.std()
```

```
print(u,std)
x_train=(x_train-u)/std
```

61.0 35.505868059613285

```
[29]: plt.style.use('seaborn')
   plt.xlabel('Date')
   plt.ylabel('Total Recovered')
   plt.scatter(x_train,y_train_recover)
   plt.show()
```



```
[30]: x_train=x_train.reshape((123,-1))
y_train_recover=y_train_recover.reshape((123,-1))
y_train_death=y_train_death.reshape((123,-1))
x_train=np.mat(x_train,dtype=float)
y_train_recover=np.mat(y_train_recover,dtype=float)
print(x_train.shape)
```

(123, 1)

```
[31]: # 137-> jan to june
# 183-> jan to july
time_period=[]
```

```
pred_values_recover=[]
pred_values_death=[]
for i in range(137,183):
    e=(i-u)/std
    time_period.append(e)
    theta,pred_recover=predict(x_train,y_train_recover,time_period[i-137],0.5)
    pred_values_recover.append(pred_recover)
    theta,pred_death=predict(x_train,y_train_death,time_period[i-137],0.5)
    pred_values_death.append(pred_death)
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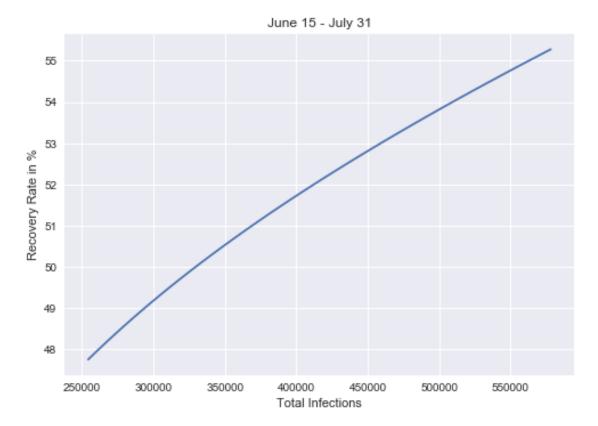
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[32]: r=np.array(pred_values_recover)
      r=r.flatten()
      r
```

[32]: array([121431.42085998, 124953.74320456, 128523.65706024, 132140.57242255, 135803.89997682, 139513.05241399, 143267.44564026, 147066.49988131,

```
166711.81394139, 170767.01407741, 174863.00907697, 178999.28141419,
             183175.32342871, 187390.63751962, 191644.73627117, 195937.14251502,
             200267.38933388, 204635.0200112 , 209039.58793174, 213480.65643763,
             217957.79864425, 222470.59722043, 227018.64413712, 231601.54038844,
             236218.89568899, 240870.32815111, 245555.46394529, 250273.93694726,
             255025.38837433, 259809.46641435, 264625.82584918, 269474.12767586,
             274354.03872684, 279265.23129186, 284207.38274331, 289180.17516614,
             294183.29499439, 299216.43265539, 304279.28222278, 309371.54107932,
             314492.90959058, 319643.09078983])
[33]: d=np.array(pred_values_death)
      d=d.flatten()
      d
[33]: array([7116.750246443891, 7275.192917006905, 7434.923876036697,
             7595.92583763583, 7758.181944310223, 7921.675747744195,
             8086.3911890059135, 8252.312578449417, 8419.42457554683,
             8587.712168855267, 8757.160656306329, 8927.755625971411,
             9099.482937433855, 9272.328703883179, 9446.27927501166,
             9621.321220788175, 9797.44131615677, 9974.626526688184,
             10152.863995213931, 10332.141029434912, 10512.445090509473,
             10693.763782596892, 10876.084843335924, 11059.396135224362,
             11243.685637863542, 11428.941441025274, 11615.151738494367,
             11802.30482264301, 11990.389079683075, 12179.392985547987,
             12369.305102355676, 12560.114075404308, 12751.808630641088,
             12944.37757258086, 13137.809782597324, 13332.094217576294,
             13527.219908867723, 13723.175961499972, 13919.951553641647,
             14117.535936246604, 14315.918432872688, 14515.088439645551,
             14715.03542532698, 14915.748931479578, 15117.218572709167,
             15319.434036941628], dtype=object)
     recovery rate from 15th June to 31st July
[34]: for i in range(b.shape[0]):
          rr=(r*100/b)
      print(rr)
      print(rr.shape)
      print(type(rr))
     [47.74803071 47.95696392 48.16305457 48.36637799 48.56700976 48.7650255
      48.9605007 49.15351057 49.34412987 49.53243276 49.71849265 49.90238207
      50.08417253 50.2639344 50.44173679 50.61764743 50.79173262 50.96405708
      51.13468391 51.3036745 51.47108848 51.63698363 51.80141587 51.96443922
      52.12610574 52.2864655 52.44556661 52.60345517 52.76017526 52.91576897
      53.07027639 53.22373561 53.37618275 53.52765199 53.67817557 53.82778386
      53.97650534 54.12436666 54.27139271 54.41760661 54.56302978 54.70768198
```

150909.64068168, 154796.29980131, 158725.91601152, 162697.93579332,

54.85158136 54.99474451 55.1371865 55.27892096]



death rate from 15th June to 31st July

```
[37]: for i in range(b.shape[0]):
         dr=(d*100/b)
    print(dr)
    print(dr.shape)
    print(type(dr))
```

```
[2.7983762928077476 2.792202580747841 2.7861691188292 2.7802771965991036
2.77452781767606 2.7689217114108313 2.7634593449161153 2.7581409353677255
2.7529664624881036 2.7479356811277826 2.743048133869345
2.7383031635830286 2.7336999258720995 2.7292374013512903
2.7249144077083223 2.7207296115058264 2.7166815396850814
2.712768590740256 2.7089890455369567 2.705341077751993 2.701822763918723
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2.686103061749549 2.683318000192246 2.6806471648459076 2.678088166680139
2.6756385911331395 2.673296004020417 2.6710579570624633
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2.6538878069336898 2.652638579116815 2.6514649628252682
2.6503646805899352 2.649335485783166]
(46,)
<class 'numpy.ndarray'>
```

```
[38]: plt.xlabel('Total Infections')
  plt.ylabel('Death Rate in %')
  plt.title('June 15 - July 31')
  plt.plot(b,dr)
  plt.show()
```

