

COVID-19 Project

May 27, 2020

1 COVID-19

We are given two DataFrames that provides information about COVID-19. Our task is to visualize this data to understand it better. Let's import all required Data-sets.

```
[13]: import pandas as pd
import itertools
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
from matplotlib.ticker import NullFormatter
import matplotlib.ticker as ticker
from sklearn import preprocessing
from sklearn.model_selection import train_test_split
from sklearn.linear_model import LogisticRegression
from sklearn.metrics import jaccard_similarity_score
from sklearn import metrics
import folium
import geopandas as gpd
import json
```

1.1 Data Inputting and Data Cleaning.

```
[14]: df1=pd.read_csv('COVID-19.csv')
df2=pd.read_csv('2COVID-19.csv')
df1.head()
```

```
[14]: Province/State Country/Region Last Update Confirmed Deaths \
0 Hubei China 2020-03-17T11:53:10 67799 3111
1 NaN Italy 2020-03-17T18:33:02 31506 2503
2 NaN Iran 2020-03-17T15:13:09 16169 988
3 NaN Spain 2020-03-17T20:53:02 11748 533
4 NaN Germany 2020-03-17T18:53:02 9257 24

Recovered Latitude Longitude
0 56003 30.9756 112.2707
1 2941 41.8719 12.5674
```

2	5389	32.4279	53.6880
3	1028	40.4637	-3.7492
4	67	51.1657	10.4515

```
[15]: df2.head()
```

```
[15]:      Entity Code  Day since outbreak  Total confirmed cases of COVID-19
0  Afghanistan  AFG                35                1
1  Afghanistan  AFG                36                1
2  Afghanistan  AFG                37                1
3  Afghanistan  AFG                38                1
4  Afghanistan  AFG                39                1
```

It can be seen **df1** can be modified to make it more workable. Particularly, Variable **Last Update** will be changed. There are some countries for which data about provinces have also been given, these countries will be separated from other ones.

```
[16]: df1['Last Update'] = pd.to_datetime(df1['Last Update'])

# a DataFrame that has countries for which provincial information is provided.
provinces_c = df1.dropna()
provinces_c.reset_index(inplace=True)
provinces_c.drop('index',axis=1,inplace=True)

# a DataFrame that only has countries for which provincial information is not
→provided.
countries_c = df1[pd.isnull(df1['Province/State'])]
countries_c.drop('Province/State', axis=1, inplace=True)
countries_c.head()
```

```
[16]: Country/Region      Last Update  Confirmed  Deaths  Recovered  Latitude  \
1      Italy 2020-03-17 18:33:02      31506     2503       2941    41.8719
2      Iran 2020-03-17 15:13:09      16169      988       5389    32.4279
3      Spain 2020-03-17 20:53:02      11748      533       1028    40.4637
4      Germany 2020-03-17 18:53:02       9257       24         67    51.1657
5  Korea, South 2020-03-17 10:33:03       8320       81      1407    35.9078

      Longitude
1      12.5674
2      53.6880
3      -3.7492
4      10.4515
5      127.7669
```

```
[5]: provinces_c.head()
```

```
[5]:
```

	Province/State	Country/Region	Last Update	Confirmed	Deaths	\
0	Hubei	China	2020-03-17 11:53:10	67799	3111	
1	France	France	2020-03-17 19:13:08	7652	148	
2	United Kingdom	United Kingdom	2020-03-17 15:13:09	1950	55	
3	New York	US	2020-03-17 22:53:03	1706	13	
4	Netherlands	Netherlands	2020-03-17 15:13:11	1705	43	

	Recovered	Latitude	Longitude
0	56003	30.9756	112.2707
1	12	46.2276	2.2137
2	52	55.3781	-3.4360
3	0	42.1657	-74.9481
4	2	52.1326	5.2913

Now that we have separated our data into 2, the data from provinces will be summed up to get information about its country.

```
[6]: df6=countries_c.drop('Last Update', axis=1)
df6.drop('Latitude', axis=1, inplace=True)
df6.drop('Longitude', axis=1, inplace=True)
df6=df6.groupby('Country/
→Region',as_index=False)['Confirmed','Deaths','Recovered'].sum()
df5=provinces_c.groupby('Country/
→Region',as_index=False)['Confirmed','Deaths','Recovered'].sum()
frames = [df5, df6]
countries_total = pd.concat(frames)
countries_total=countries_total.sort_values(by=['Confirmed'], ascending=False)
countries_total.head()
```

```
[6]:
```

	Country/Region	Confirmed	Deaths	Recovered
2	China	81058	3230	68798
67	Italy	31506	2503	2941
63	Iran	16169	988	5389
128	Spain	11748	533	1028
47	Germany	9257	24	67

1.2 VISUALIZATION

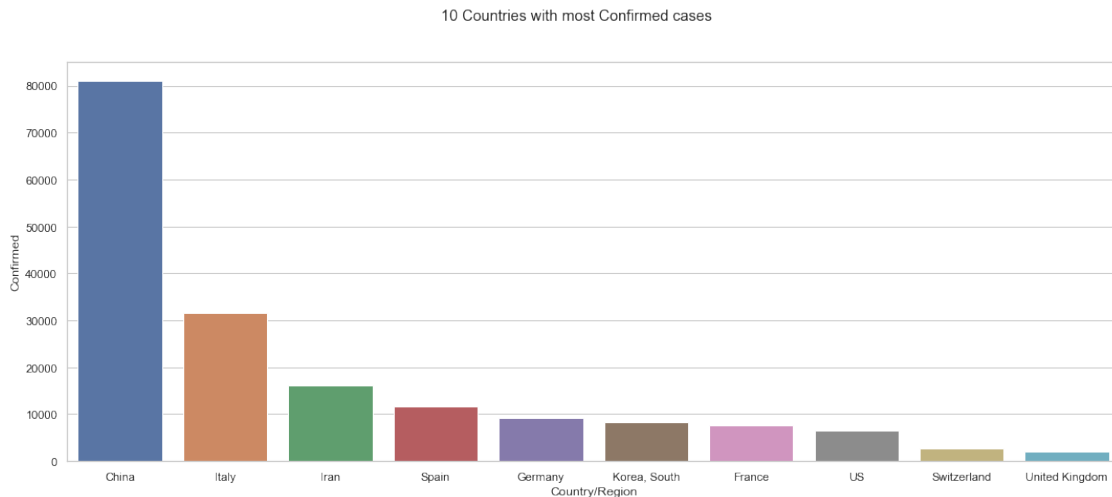
1.2.1 Which countries have the most number of cases in March?

Let's make a bar chart to see 10 countries which have most confirmed cases.

```
[7]: countries_total_sub = countries_total[:10]
plt.figure(figsize=(18, 7))
sns.set(style="whitegrid")
sns.barplot(x=countries_total_sub['Country/
→Region'],y=countries_total_sub['Confirmed'])
plt.suptitle('10 Countries with most Confirmed cases')
```

```
#sns.set(style="whitegrid")
#sns.barplot(x=countries_total['Country/Region'],y=countries_total['Confirmed'])
#plt.title('10 Countries with most Confirmed cases')
```

[7]: Text(0.5, 0.98, '10 Countries with most Confirmed cases')



1.2.2 How many Infected patients have recovered in Different Provinces Of China?

I have excluded the province **Hubei** from the graph because their recovery amount is the highest, more than 60000, creating a very unpleasant visualization.

```
[8]: Chine_dic={'Province': [], 'Recovered': []}
for item in range(len(provinces_c['Country/Region'])):
    if provinces_c['Country/Region'][item] == 'China':
        prov = provinces_c['Province/State'][item]
        recov = provinces_c['Recovered'][item]
        Chine_dic['Province'].append(prov)
        Chine_dic['Recovered'].append(recov)

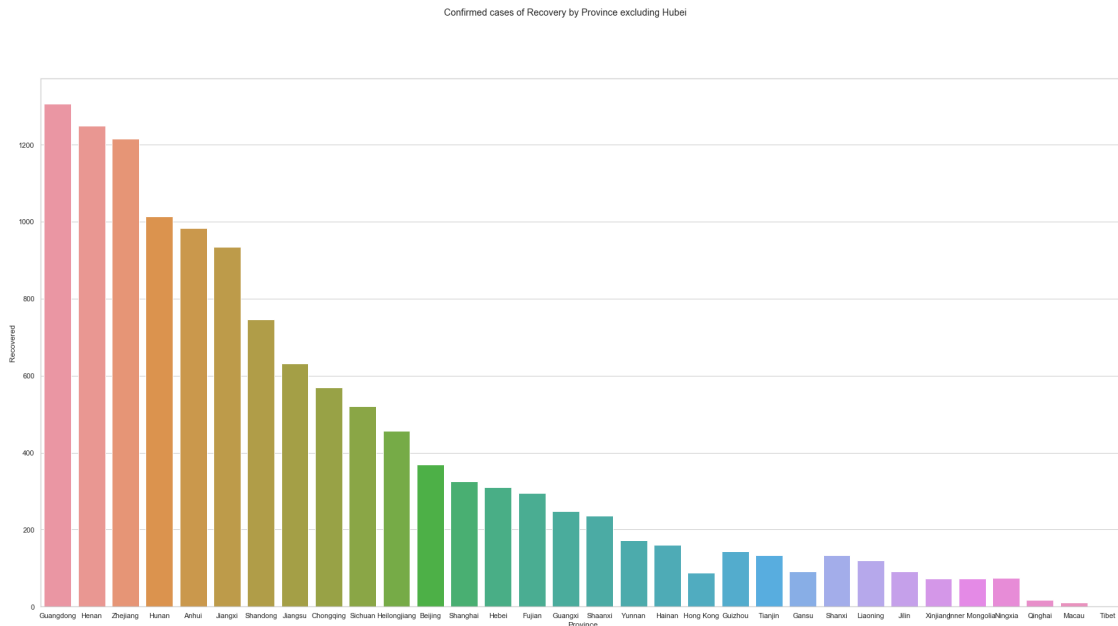
#DataFrame Consisting of China's Provinces and Recovery amount.
Chine_prov = pd.DataFrame(Chine_dic)

#Removing province Hubei
Chine_prov_1 = Chine_prov[1:]
#Chine_prov_1 = Chine_prov[:]#Uncomment this and comment out the line above to
    →include Hubei

#Plotting.
plt.figure(figsize=(30, 15))
sns.set(style="whitegrid")
```

```
sns.barplot(x=Chine_prov_1['Province'],y=Chine_prov_1['Recovered'])
plt.suptitle('Confirmed cases of Recovery by Province excluding Hubei')
```

[8]: Text(0.5, 0.98, 'Confirmed cases of Recovery by Province excluding Hubei')



We can see after Hubei, **Guangdong** has highest amount of recovery.

1.2.3 How has the number of patients infected with COVID-19 increased over time in the UK and other countries.

Lets create a DataFrame for UK and 9 other countries with highest confirmed cases.

```
[9]: # Cases by day for UK.
UK_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'United Kingdom':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        UK_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        UK_dic['Cases of COVID-19'].append(Cases)
df_UK = pd.DataFrame(UK_dic)

# Cases by day for US.
US_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'United States':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
```

```

        Cases = df2['Total confirmed cases of COVID-19'][item]
        US_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        US_dic['Cases of COVID-19'].append(Cases)
df_US = pd.DataFrame(US_dic)

# Cases by day for Iran.
Iran_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'Iran':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        Iran_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        Iran_dic['Cases of COVID-19'].append(Cases)
df_Iran = pd.DataFrame(Iran_dic)

# Cases by day for China.
Chine_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'China':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        Chine_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        Chine_dic['Cases of COVID-19'].append(Cases)
df_China = pd.DataFrame(Chine_dic)

# Cases by day for Italy.
Italy_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'Italy':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        Italy_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        Italy_dic['Cases of COVID-19'].append(Cases)
df_Italy = pd.DataFrame(Italy_dic)

# Cases by day for Spain.
Spain_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'Spain':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        Spain_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        Spain_dic['Cases of COVID-19'].append(Cases)
df_Spain = pd.DataFrame(Spain_dic)

# Cases by day for Germany.
Germany_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}

```

```

for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'Germany':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        Germany_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        Germany_dic['Cases of COVID-19'].append(Cases)
df_Germany = pd.DataFrame(Germany_dic)

# Cases by day for Sout_Korea.
South_Korea_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'South Korea':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        South_Korea_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        South_Korea_dic['Cases of COVID-19'].append(Cases)
df_South_Korea = pd.DataFrame(South_Korea_dic)

# Cases by day for France.
France_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'France':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        France_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        France_dic['Cases of COVID-19'].append(Cases)
df_France = pd.DataFrame(France_dic)

# Cases by day for Switzerland.
Switzerland_dic={'Days Since Outbreak':[], 'Cases of COVID-19':[]}
for item in range(len(df2['Entity'])):
    if df2['Entity'][item] == 'Switzerland':
        Days_Since_Outbreak = df2['Day since outbreak'][item]
        Cases = df2['Total confirmed cases of COVID-19'][item]
        Switzerland_dic['Days Since Outbreak'].append(Days_Since_Outbreak)
        Switzerland_dic['Cases of COVID-19'].append(Cases)
df_Switzerland = pd.DataFrame(Switzerland_dic)

```

Let's make a line plot for UK and then for China.

```

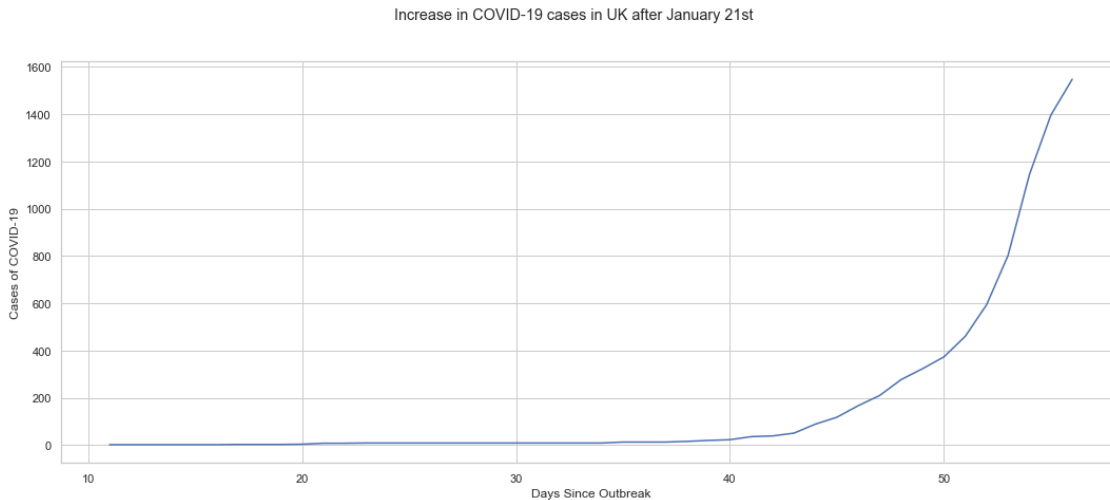
[10]: plt.figure(figsize=(18, 7))
      sns.set(style="whitegrid")
      sns.lineplot(x="Days Since Outbreak", y="Cases of COVID-19", data=df_UK)
      plt.suptitle('Increase in COVID-19 cases in UK after January 21st')

```

```

[10]: Text(0.5, 0.98, 'Increase in COVID-19 cases in UK after January 21st')

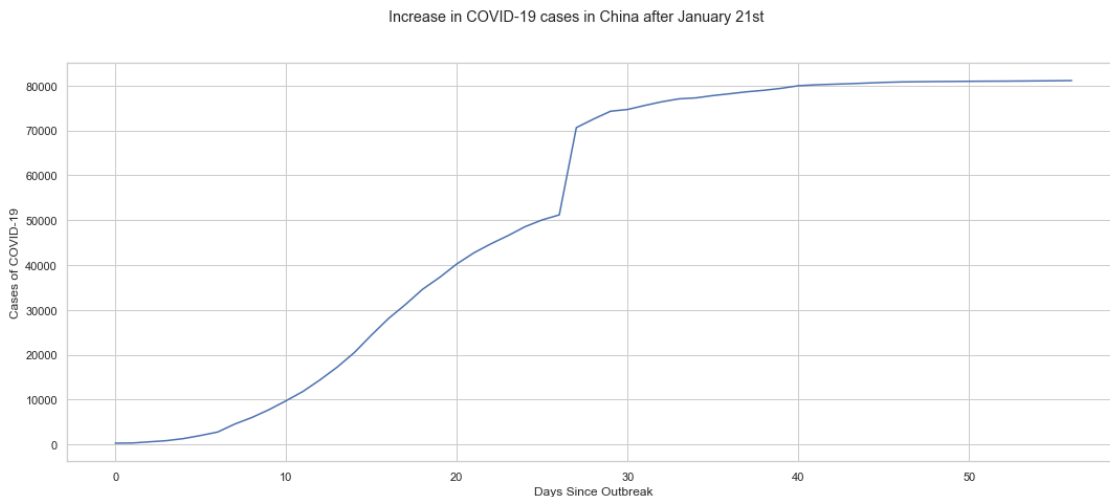
```



As it can be seen, Cases were relatively low until the 40 days. After which we see an exponential increase.

```
[11]: plt.figure(figsize=(18, 7))
sns.set(style="whitegrid")
sns.lineplot(x="Days Since Outbreak", y="Cases of COVID-19", data=df_China)
plt.suptitle('Increase in COVID-19 cases in China after January 21st')
```

```
[11]: Text(0.5, 0.98, 'Increase in COVID-19 cases in China after January 21st')
```

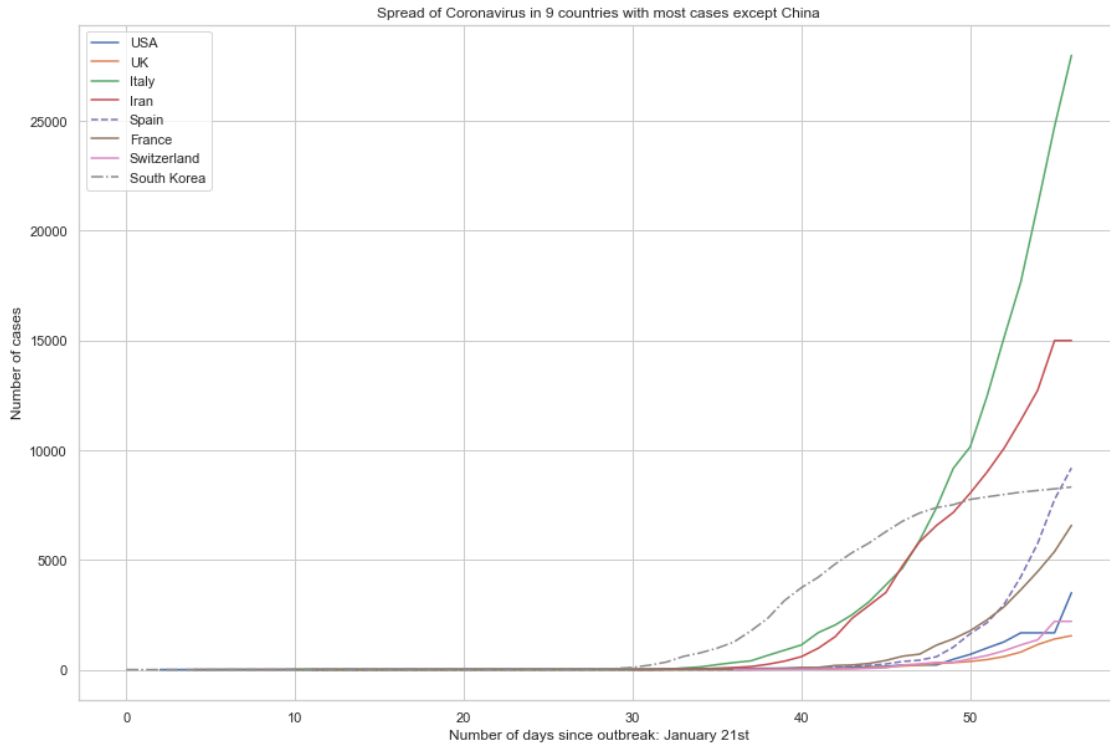


It seems we see an exponential raise in daily number of cases in China until day 30. After which, Due to preventive and protective measures **China** took, the curve has relatively flattened.

Now we will show spread of COVID-19 in 9 countries with highest number of cases. **China** is

excluded in this graph as it makes a very unpleasant visualization.

```
[12]: fig=plt.figure(figsize=(15,10))
ax=fig.add_subplot(111)
ax.set_title('Spread of Coronavirus in 9 countries with most cases except China')
plt.xlabel('Number of days since outbreak: January 21st')
plt.ylabel('Number of cases')
#Please uncomment the line below if want to include China.
#ax.plot(df_China['Days Since Outbreak'],df_China['Cases of COVID-19'],
→label='China')
ax.plot(df_US['Days Since Outbreak'],df_US['Cases of COVID-19'], label='USA')
ax.plot(df_UK['Days Since Outbreak'],df_UK['Cases of COVID-19'], label='UK')
ax.plot(df_Italy['Days Since Outbreak'],df_Italy['Cases of COVID-19'],
→label='Italy')
ax.plot(df_Iran['Days Since Outbreak'],df_Iran['Cases of COVID-19'],
→label='Iran')
ax.plot(df_Spain['Days Since Outbreak'],df_Spain['Cases of COVID-19'],'--',
→label='Spain')
ax.plot(df_France['Days Since Outbreak'],df_France['Cases of COVID-19'],
→label='France')
ax.plot(df_Switzerland['Days Since Outbreak'],df_Switzerland['Cases of
→COVID-19']\
    , label='Switzerland')
ax.plot(df_South_Korea['Days Since Outbreak'],df_South_Korea['Cases of
→COVID-19'],'-.', label='South Korea')
plt.legend(loc='best')
plt.show()
```



The graph shows interesting information. It clearly shows, Outside of China, **Italy** has the highest amount of COVID-19 spread. The graph shows cases first started to rise exponentially in **South Korea** around day 30 after outbreak. Slowly after, cases started to rise at a similar exponential rate in **Iran** and **Italy**. While every country's number of cases increase by the day, **South Korea** and **China's** curve flattens relatively around day 45 and 30 respectively.