Import Libraries

```
In []: # pip install folium

In []: # pip install --upgrade matplotlib

In []: # storing and anaysis
    import numpy as np
    import pandas as pd

# visualization
    import matplotlib.pyplot as plt
    import seaborn as sns
    import plotly.express as px
    import folium
```

Import Dataset

```
In [ ]: # data from Kaggle:
        # https://www.kagqle.com/datasets/cptspark/novel-coronavirus-cdr-202011feb?resou
In [ ]: # importing datasets
        conf df = pd.read csv('time series 2019-ncov-Confirmed.csv')
        deaths_df = pd.read_csv('time_series_2019-ncov-Deaths.csv')
        recv_df = pd.read_csv('time_series_2019-ncov-Recovered.csv')
In [ ]: conf df.head()
        # deaths_df.head()
        # recv_df.head()
Out[]:
                                                               1/21/2020 1/22/2020 1/23/202
            Province/State Country/Region
                                                Lat
                                                        Long
                                                                   22:00
                                                                              12:00
                                                                                          12:0
                                                                                            C
         0
                    Anhui
                            Mainland China 31.82571
                                                                                 1.0
                                                    117.2264
                                                                    NaN
         1
                            Mainland China 40.18238
                                                                     10.0
                                                                                           22
                   Beijing
                                                    116.4142
                                                                                14.0
         2
                Chongqing
                            Mainland China 30.05718
                                                    107.8740
                                                                     5.0
                                                                                 6.0
                                                                                            C
         3
                    Fujian
                            Mainland China 26.07783
                                                    117.9895
                                                                    NaN
                                                                                 1.0
         4
                            Mainland China 36.06110 103.8343
                                                                    NaN
                                                                               NaN
                    Gansu
        5 rows × 43 columns
In [ ]: conf_df.columns
        # deaths_df.columns
        # recv_df.columns
```

In []: conf_df.info()

<class 'pandas.core.frame.DataFrame'> RangeIndex: 73 entries, 0 to 72 Data columns (total 43 columns):

#	Column	Non-Null Count	Dtype
0	Province/State	52 non-null	object
1	Country/Region	73 non-null	object
2	Lat	73 non-null	float64
3	Long	73 non-null	float64
4	1/21/2020 22:00	16 non-null	float64
5	1/22/2020 12:00	29 non-null	float64
6	1/23/2020 12:00	37 non-null	float64
7	1/24/2020 0:00	38 non-null	float64
8	1/24/2020 12:00	40 non-null	float64
9	1/25/2020 0:00	42 non-null	float64
10	1/25/2020 12:00	43 non-null	float64
11	1/25/2020 22:00	43 non-null	float64
12	1/26/2020 11:00	49 non-null	float64
13	1/26/2020 23:00	49 non-null	float64
14	1/27/2020 9:00	50 non-null	float64
15	1/27/2020 19:00	51 non-null	float64
16	1/27/2020 20:30	52 non-null	float64
17	1/28/2020 13:00	53 non-null	float64
18	1/28/2020 18:00	53 non-null	float64
19	1/28/2020 23:00	53 non-null	float64
20	1/29/2020 13:30	56 non-null	float64
21	1/29/2020 14:30	55 non-null	float64
22	1/29/2020 21:00	57 non-null	float64
23	1/30/2020 11:00	59 non-null	float64
24	1/31/2020 14:00	65 non-null	float64
25	2/1/2020 10:00	67 non-null	float64
26	2/2/2020 21:00	68 non-null	float64
27	2/3/2020 21:00	69 non-null	float64
28	2/4/2020 9:40	70 non-null	float64
29	2/4/2020 22:00	70 non-null	float64
30	2/5/2020 9:00	70 non-null	float64
31	2/5/2020 23:00	71 non-null	float64
32	2/6/2020 9:00	71 non-null	float64
33	2/6/2020 14:20	71 non-null	float64
34		72 non-null	float64
35		72 non-null	float64
36	2/8/2020 22:04	72 non-null	float64
37	2/8/2020 23:04	72 non-null	float64
38	2/9/2020 10:30	72 non-null	float64
39	2/9/2020 23:20		float64
40			float64
41			float64
42	2/11/2020 10:50 es: float64(40), :		int64
	es: Tidal64(40), . ev usage: 24.6+ KI	· · ·	(4)

memory usage: 24.6+ KB

```
In [ ]: # Filter the DataFrame to select rows where the 'Province/State' column is 'Diam
        ship_Confirmed = conf_df[conf_df['Province/State'] == 'Diamond Princess cruise s
        # Display the resulting DataFrame containing confirmed cases on the Diamond Prin
        ship_Confirmed
```

Out[]:		Province/State	Country/Region	Lat	Long	1/21/2020 22:00			/202 12:0
	71	Diamond Princess cruise ship	Others	35.4437	129.638	NaN	N	aN	Naľ
	1 ro	ows × 43 columns	5						
	4								•
In []:	dea	aths_df.head()							
Out[]:		Province/State	Country/Region	Lat	Long	1/21/20 22:00	1/22/20 12:00	1/23/20 12:00	1/2
	0	Anhui	Mainland China	31.82571	117.2264	NaN	NaN	NaN	
	1	Beijing	Mainland China	40.18238	116.4142	NaN	NaN	NaN	
	2	Chongqing	Mainland China	30.05718	107.8740	NaN	NaN	NaN	
	3	Fujian	Mainland China	26.07783	117.9895	NaN	NaN	NaN	
	4	Gansu	Mainland China	36.06110	103.8343	NaN	NaN	NaN	
	5 ro	ows × 43 columns	5						
	4								>
In []:	rec	cv_df.head()							
Out[]:		Province/State	Country/Region	Lat	Long	1/21/20 22:00	1/22/20 12:00	1/23/20 12:00	1/2
	0	Anhui	Mainland China	31.82571	117.2264	NaN	NaN	NaN	
	1	Beijing	Mainland China	40.18238	116.4142	NaN	NaN	NaN	
	2	Chongqing	Mainland China	30.05718	107.8740	NaN	NaN	NaN	
	3	Fujian	Mainland China	26.07783	117.9895	NaN	NaN	NaN	
	4	Gansu	Mainland China	36.06110	103.8343	NaN	NaN	NaN	
	5 ro	ows × 43 columns	5						
	4								•

Data Wrangling

```
Out[]: ['1/22/20',
          '1/23/20',
          '1/24/20',
          '1/25/20',
          '1/26/20',
          '1/27/20',
          '1/28/20',
          '1/29/20',
          '1/30/20',
          '1/31/20',
          '2/1/20',
          '2/2/20',
          '2/3/20',
          '2/4/20',
          '2/5/20',
          '2/6/20',
          '2/7/20',
          '2/8/20',
          '2/9/20',
          '2/10/20',
          '2/11/20',
          '2/12/20',
          '2/13/20',
          '2/14/20',
          '2/15/20',
          '2/16/20',
          '2/17/20',
          '2/18/20',
          '2/19/20']
In [ ]: conf_df_long = conf_df.melt(id_vars=['Province/State', 'Country/Region', 'Lat',
                                     value_vars=conf_df.columns[4:], var_name='Date', val
        deaths_df_long = deaths_df.melt(id_vars=['Province/State', 'Country/Region', 'La
                                     value_vars=deaths_df.columns[4:], var_name='Date', v
        recv_df_long = recv_df.melt(id_vars=['Province/State', 'Country/Region', 'Lat',
                                      value_vars=recv_df.columns[4:], var_name='Date', val
        full_table = pd.concat([conf_df_long, deaths_df_long['Deaths'], recv_df_long['Re
                                axis=1, sort=False)
        full_table.head()
```

Out[]:		Province/State	Country/Region	Lat	Long	Date	Confirmed	Deaths
	0	Anhui	Mainland China	31.82571	117.2264	1/21/2020 22:00	NaN	NaN
	1	Beijing	Mainland China	40.18238	116.4142	1/21/2020 22:00	10.0	NaN
	2	Chongqing	Mainland China	30.05718	107.8740	1/21/2020 22:00	5.0	NaN
	3	Fujian	Mainland China	26.07783	117.9895	1/21/2020 22:00	NaN	NaN
	4	Gansu	Mainland China	36.06110	103.8343	1/21/2020 22:00	NaN	NaN
	4							+

Data Cleaning and Preprocessing

```
In [ ]: # Step 1: Convert 'Date' Column to DateTime Format
        full_table['Date'] = pd.to_datetime(full_table['Date'])
        # This line converts the 'Date' column to a proper datetime format. This is impo
        # Step 2: Replace 'Mainland China' with 'China' in 'Country/Region' Column
        full_table['Country/Region'] = full_table['Country/Region'].replace('Mainland Ch
        # This line replaces occurrences of 'Mainland China' with 'China' in the 'Countr
        # Step 3: Fill Missing Values in 'Confirmed', 'Deaths', and 'Recovered' Columns
        full_table[['Confirmed', 'Deaths', 'Recovered']] = full_table[['Confirmed', 'Dea
        # Missing values in the 'Confirmed', 'Deaths', and 'Recovered' columns are fille
        # Step 4: Convert 'Recovered' Column to Integer Data Type
        full_table['Recovered'] = full_table['Recovered'].astype('int')
        # The 'Recovered' column is converted to integer data type. This ensures that th
        # Step 5: Fill Missing Values in 'Province/State' Column
        full_table[['Province/State']] = full_table[['Province/State']].fillna('NA')
        # Missing values in the 'Province/State' column are filled with 'NA' to indicate
        full_table[['Province/State']] = full_table[['Province/State']].fillna('Diamond')
        # Step 6: Extract Data Related to Diamond Princess Cruise Ship
        ship = full_table[full_table['Province/State'] == 'Diamond Princess cruise ship'
        # A new DataFrame 'ship' is created, containing data related to the Diamond Prin
        # Step 7: Remove Diamond Princess Data from 'full table'
        full_table = full_table[full_table['Province/State'] != 'Diamond Princess cruise
        # Data related to the Diamond Princess cruise ship is removed from the 'full_tab
        # Step 8: Display the First Few Rows of the Cleaned DataFrame
        full_table.head()
```

Out[]:	Province/State	Country/Region	Lat	Long	Date	Confirmed	Deaths	Re
	0 Anhui	China	31.82571	117.2264	2020- 01-21 22:00:00	0.0	0.0	
	1 Beijing	China	40.18238	116.4142	2020- 01-21 22:00:00	10.0	0.0	
	2 Chongqing	China	30.05718	107.8740	2020- 01-21 22:00:00	5.0	0.0	
	3 Fujian	China	26.07783	117.9895	2020- 01-21 22:00:00	0.0	0.0	
	4 Gansu	China	36.06110	103.8343	2020- 01-21 22:00:00	0.0	0.0	
	4							•
In []:	# cases in the D			•				
	ship = full_table	e[full_table['Pr	ovince/St	ate J== D	iamond Pr	incess crui	ise snip]
	ship.head()							
Out[]:	Province/State	Country/Region	Lat Long	Date Co	onfirmed	Deaths Rec	covered	
In []:	# full_table.inf	0()						
In []:	<pre># Create a DataF china = full_tab</pre>		_			China' cour	ntry	
	<pre># Create a DataF row = full_table</pre>		_	-		egions other	than '(Chi
	<pre># Create a DataF, full_latest = fu</pre>			-				
	<pre># Create a DataF china_latest = f</pre>	_		-		_	for 'Cl	hin
	<pre># Create a DataF row_latest = ful</pre>	_		-		-	ountries,	/re
	# Group the 'ful full_latest_grou	_	-		-			-
	# Group the 'chi china_latest_gro	_	-					
	# Group the 'row row_latest_group		_					

```
C:\Users\ADMIN\AppData\Local\Temp\ipykernel_3208\1272672933.py:17: FutureWarning:

Indexing with multiple keys (implicitly converted to a tuple of keys) will be deprecated, use a list instead.

C:\Users\ADMIN\AppData\Local\Temp\ipykernel_3208\1272672933.py:20: FutureWarning:

Indexing with multiple keys (implicitly converted to a tuple of keys) will be deprecated, use a list instead.

C:\Users\ADMIN\AppData\Local\Temp\ipykernel_3208\1272672933.py:23: FutureWarning:

Indexing with multiple keys (implicitly converted to a tuple of keys) will be deprecated, use a list instead.
```

EDA

Current Situation

```
In [ ]: # Group the 'full_latest' DataFrame by both 'Country/Region' and 'Province/State
# Calculate the maximum values of 'Confirmed', 'Deaths', and 'Recovered' for eac
temp = full_latest.groupby(['Country/Region', 'Province/State'])['Confirmed', 'D

# Apply a background gradient style to the 'temp' DataFrame
# The 'background_gradient' function applies a color gradient to cells based on
# Here, 'cmap' specifies the color map used for the gradient, 'Pastel1_r' in thi
styled_temp = temp.style.background_gradient(cmap='Pastel1_r')

# The styled DataFrame 'styled_temp' now has the background gradient applied
# It can be displayed to visualize the data with color-coded cells
styled_temp
```

C:\Users\ADMIN\AppData\Local\Temp\ipykernel_3208\487413045.py:3: FutureWarning:

Indexing with multiple keys (implicitly converted to a tuple of keys) will be deprecated, use a list instead.

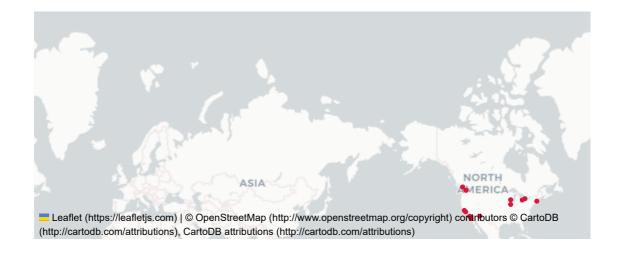
Out[]: Confirmed Deaths Recovered

		Commined	Deaths	necovered
Country/Region	Province/State			
	New South Wales	4.000000	0.000000	2
A	Queensland	5.000000	0.000000	0
Australia	South Australia	2.000000	0.000000	0
	Victoria	4.000000	0.000000	0
Belgium	NA	1.000000	0.000000	0
Cambodia	NA	1.000000	0.000000	0
	British Columbia	4.000000	0.000000	0
Canada	London, ON	1.000000	0.000000	0
	Toronto, ON	2.000000	0.000000	0
China	Anhui	860.000000	4.000000	105
	Beijing	342.000000	3.000000	48
	Chongqing	489.000000	2.000000	72
	Fujian	267.000000	0.000000	45
	Gansu	86.000000	2.000000	24
	Guangdong	1177.000000	1.000000	212
	Guangxi	215.000000	1.000000	33
	Guizhou	127.000000	1.000000	17
	Hainan	144.000000	3.000000	20
	Hebei	239.000000	2.000000	48
	Heilongjiang	360.000000	8.000000	28
	Henan	1105.000000	7.000000	218
	Hubei	31728.000000	974.000000	2310
	Hunan	912.000000	1.000000	247
	Inner Mongolia	58.000000	0.000000	5
	Jiangsu	515.000000	0.000000	93
	Jiangxi	804.000000	1.000000	128
	Jilin	81.000000	1.000000	18
	Liaoning	111.000000	0.000000	19
	Ningxia	53.000000	0.000000	22
	Qinghai	18.000000	0.000000	5
	Shaanxi	219.000000	0.000000	32
	Shandong	487.000000	1.000000	80

Country/Region Province/State Shanghai 303.000000 1.000000 52 Shanxi 122.000000 0.000000 30 Sichuan 417.000000 1.000000 85 Tianjin 105.000000 2.000000 10 Xinjiang 55.000000 0.000000 20 Zhejiang 1117.000000 0.000000 270 Finland NA 1.000000 0.000000 0 Germany NA 11.000000 0.000000 0 Germany NA 14.000000 0.000000 0 Hong Kong Hong Kong 49.000000 0.000000 0 Hataly NA 3.000000 0.000000 0 Japan NA 26.000000 0.000000 0 Macau Macau 10.000000 0.000000 1 Malaysia NA 18.000000 0.000000 0 Philippines NA 1.000000 0.000000 0			Confirmed	Deaths	Recovered
Shanxi 122,000000 0,000000 30 Sichuan 417,000000 1,000000 85 Tianjin 105,000000 2,000000 10 Kinjiang 55,000000 0,000000 3 Yunnan 153,000000 0,000000 20 Zhejiang 1117,00000 0,000000 20 Finland NA 1,000000 0,000000 0 Germany NA 14,000000 0,000000 0 Hong Kong Hong Kong 49,00000 0,000000 0 Hataly NA 3,000000 0,000000 0 Japan NA 26,000000 0,00000 0 Macau Macau 10,00000 0,00000 1 Malaysia NA 18,00000 0,00000 3 Nepal NA 1,00000 0,00000 0 Philippines NA 3,00000 1,00000 0 Russia NA 2,00000 0,00000 0 </th <th>Country/Region</th> <th>Province/State</th> <th></th> <th></th> <th></th>	Country/Region	Province/State			
Sichuan 417,000000 1,000000 85 Tianjin 105,000000 2,000000 10 Xinjiang 55,000000 0,000000 3 Yunnan 153,000000 0,000000 20 Zhejiang 1117,000000 0,000000 270 Finland NA 1,000000 0,000000 0 Germany NA 1,000000 0,000000 0 Germany NA 14,000000 0,000000 0 Hong Kong Hong Kong 49,000000 0,000000 0 India NA 3,000000 0,000000 0 Japan NA 26,000000 0,000000 0 Malaysia NA 18,000000 0,000000 1 Malaysia NA 1,000000 0,000000 0 Philippines NA 3,000000 0,000000 0 Russia NA 2,000000 0,000000 0 South Korea NA 2,000000		Shanghai	303.000000	1.000000	52
Tianjin 105.000000 2.000000 10 Tibet		Shanxi	122.000000	0.000000	30
Tibet 1.000000 0.000000 0 Xinjiang 55.000000 0.000000 3 Yunnan 153.000000 0.000000 20 Zhejiang 1117.000000 0.000000 270 Finland NA 1.000000 0.000000 0 Germany NA 11.000000 0.000000 0 Hong Kong Hong Kong 49.000000 0.000000 3 India NA 3.000000 0.000000 0 Japan NA 3.000000 0.000000 0 Japan NA 26.000000 0.000000 1 Macau Macau 10.000000 0.000000 1 Malaysia NA 1.000000 0.000000 0 Philippines NA 3.000000 0.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 2.000000 0.000000 0 South Korea NA 1.00000		Sichuan	417.000000	1.000000	85
Xinjiang 55,000000 0,000000 3 Yunnan 153,000000 0,000000 20 Zhejiang 1117,000000 0,000000 270 Finland NA 1,000000 0,000000 0 France NA 11,000000 0,000000 0 Germany NA 14,000000 0,000000 0 Hong Kong Hong Kong 49,000000 0,000000 0 India NA 3,000000 0,000000 0 Italy NA 3,000000 0,000000 0 Japan NA 26,000000 0,000000 1 Macau Macau 10,00000 0,000000 1 Malaysia NA 18,00000 0,000000 0 Philippines NA 3,00000 0,000000 0 Russia NA 2,00000 0,000000 0 Singapore NA 45,00000 0,000000 0 Sri Lanka NA		Tianjin	105.000000	2.000000	10
Yunnan 153,000000 0,000000 20 Zhejiang 1117,000000 0,000000 270 Finland NA 1,000000 0,000000 0 France NA 11,000000 0,000000 0 Germany NA 14,000000 0,000000 0 Hong Kong Hong Kong 49,000000 0,000000 3 India NA 3,000000 0,000000 0 Japan NA 26,000000 0,000000 1 Macau Macau 10,00000 0,000000 1 Malaysia NA 18,00000 0,000000 3 Nepal NA 1,000000 0,000000 0 Philippines NA 3,000000 1,000000 0 Russia NA 2,000000 0,000000 7 South Korea NA 2,000000 0,000000 1 Spain NA 2,000000 0,000000 0 Sri Lanka		Tibet	1.000000	0.000000	0
Finland NA 1.000000 0.000000 270 Finland NA 1.000000 0.000000 0 France NA 11.000000 0.000000 0 Germany NA 14.000000 0.000000 0 Hong Kong Hong Kong 49.000000 0.000000 3 India NA 3.000000 0.000000 0 Japan NA 3.000000 0.000000 1 Macau Macau 10.000000 0.000000 10 Malaysia NA 18.000000 0.000000 3 Nepal NA 1.000000 0.000000 0 Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 7 South Korea NA 28.00000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 0		Xinjiang	55.000000	0.000000	3
Finland NA 1.000000 0.000000 0 France NA 11.000000 0.000000 0 Germany NA 14.000000 0.000000 0 Hong Kong Hong Kong 49.000000 0.000000 3 India NA 3.000000 0.000000 0 Japan NA 26.000000 0.000000 1 Macau Macau 10.00000 0.000000 1 Malaysia NA 18.000000 0.000000 3 Nepal NA 1.000000 0.000000 0 Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 7 South Korea NA 2.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 0		Yunnan	153.000000	0.000000	20
France NA 11.000000 0.000000 0 Germany NA 14.000000 0.000000 0 Hong Kong Hong Kong 49.00000 0.000000 3 India NA 3.000000 0.000000 0 Japan NA 26.000000 0.000000 1 Macau Macau 10.00000 0.000000 1 Malaysia NA 18.00000 0.00000 3 Nepal NA 1.000000 0.00000 0 Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 1 South Korea NA 2.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 0 Taiwan Taiwan Taiwan 18.000000 0.000000		Zhejiang	1117.000000	0.000000	270
Germany NA 14.000000 0.000000 0 Hong Kong Hong Kong 49.000000 0.000000 3 India NA 3.000000 0.000000 0 Japan NA 26.000000 0.000000 1 Macau Macau 10.000000 0.000000 1 Malaysia NA 18.000000 0.000000 0 Philippines NA 1.000000 0.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 1 Spain NA 2.000000 0.000000 1 Spain NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 0 UK NA 3.000000 0.000000 0 UK NA 3.000000 0.000000 0	Finland	NA	1.000000	0.000000	0
Hong Kong	France	NA	11.000000	0.000000	0
India	Germany	NA	14.000000	0.000000	0
Italy NA 3.000000 0.000000 0 Japan NA 26.000000 0.000000 1 Macau Macau 10.000000 0.000000 10 Malaysia NA 18.000000 0.000000 3 Nepal NA 1.000000 0.000000 0 Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 7 South Korea NA 28.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 0 UK NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0	Hong Kong	Hong Kong	49.000000	0.000000	3
Japan NA 26.000000 0.000000 1 Macau Macau 10.000000 0.000000 10 Malaysia NA 18.000000 0.000000 3 Nepal NA 1.000000 0.000000 0 Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 7 South Korea NA 28.000000 0.000000 1 Spain NA 1.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0.000000 0 <	India	NA	3.000000	0.000000	0
Macau Macau 10.000000 0.000000 10 Malaysia NA 18.000000 0.000000 3 Nepal NA 1.000000 0.000000 0 Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 7 South Korea NA 28.000000 0.000000 1 Spain NA 1.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 1 Thailand NA 32.000000 1.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0.000000	Italy	NA	3.000000	0.000000	0
Malaysia NA 18.000000 0.000000 3 Nepal NA 1.000000 0.000000 0 Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 7 South Korea NA 28.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 0 UK NA 32.000000 1.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Japan	NA	26.000000	0.000000	1
Nepal NA 1.000000 0.000000 0 Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 7 South Korea NA 28.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 0 UK NA 32.000000 1.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Macau	Macau	10.000000	0.000000	10
Philippines NA 3.000000 1.000000 0 Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 7 South Korea NA 28.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 0 UK NA 32.000000 1.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Malaysia	NA	18.000000	0.000000	3
Russia NA 2.000000 0.000000 0 Singapore NA 45.000000 0.000000 7 South Korea NA 28.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 1 Thailand NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Nepal	NA	1.000000	0.000000	0
Singapore NA 45.000000 0.000000 7 South Korea NA 28.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 1 Thailand NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Philippines	NA	3.000000	1.000000	0
South Korea NA 28.000000 0.000000 1 Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 1 Thailand NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Russia	NA	2.000000	0.000000	0
Spain NA 2.000000 0.000000 0 Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 1 Thailand NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Singapore	NA	45.000000	0.000000	7
Sri Lanka NA 1.000000 0.000000 1 Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 1 Thailand NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	South Korea	NA	28.000000	0.000000	1
Sweden NA 1.000000 0.000000 0 Taiwan Taiwan 18.000000 0.000000 1 Thailand NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Spain	NA	2.000000	0.000000	0
Taiwan Taiwan 18.000000 0.000000 1 Thailand NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Sri Lanka	NA	1.000000	0.000000	1
Thailand NA 32.000000 1.000000 0 UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Sweden	NA	1.000000	0.000000	0
UK NA 8.000000 0.000000 0 US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Taiwan	Taiwan	18.000000	0.000000	1
US Boston, MA 1.000000 0.000000 0 Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	Thailand	NA	32.000000	1.000000	0
Chicago, IL 2.000000 0.000000 0 Los Angeles, CA 1.000000 0.000000 0	UK	NA	8.000000	0.000000	0
Los Angeles, CA 1.000000 0.000000 0	US	Boston, MA	1.000000	0.000000	0
-		Chicago, IL	2.000000	0.000000	0
Madison. WI 1.000000 0.000000 0		Los Angeles, CA	1.000000	0.000000	0
		Madison, WI	1.000000	0.000000	0

		Confirmed	Deaths	Recovered
Country/Region	Province/State			
	Orange, CA	1.000000	0.000000	0
	San Benito, CA	2.000000	0.000000	0
	San Diego County, CA	1.000000	0.000000	0
	Santa Clara, CA	2.000000	0.000000	0
	Seattle, WA	1.000000	0.000000	2
	Tempe, AZ	1.000000	0.000000	9
United Arab Emirates	NA	8.000000	0.000000	0
Vietnam	NA	15.000000	0.000000	1

Out[]: Make this Notebook Trusted to load map: File -> Trust Notebook
+



Top 10 Countries with most no. of reported cases

```
In [ ]: temp_f = full_latest_grouped[['Country/Region', 'Confirmed']]
    temp_f = temp_f.sort_values(by='Confirmed', ascending=False)
    temp_f = temp_f.reset_index(drop=True)
    temp_f.head(10).style.background_gradient(cmap='Pastel1_r')
```

Out[]: Country/Region Confirmed

0	China	42670.000000
1	Hong Kong	49.000000
2	Singapore	45.000000
3	Thailand	32.000000
4	South Korea	28.000000
5	Japan	26.000000
6	Taiwan	18.000000
7	Malaysia	18.000000
8	Australia	15.000000
9	Vietnam	15.000000

- Massive number of cases are reported in Mainland China Compared to reset of the world
- The next few countries are infact are the neighbours of China

Top 10 Provinces in China with most no. of reported cases

```
In []: temp_c = china_latest_grouped[['Province/State', 'Confirmed']]
  temp_c = temp_c.sort_values(by='Confirmed', ascending=False)
  temp_c = temp_c.reset_index(drop=True)
  temp_c.head(10).style.background_gradient(cmap='Pastel1_r')
```

• Even in China most of the cases reported are from a particular Province Hubei.

• It is no surprise, because Hubei's capital is **Wuhan**, where the first cases are reported

Countries with deaths reported

```
In [ ]: temp_flg = full_latest_grouped[['Country/Region', 'Deaths']]
        temp_flg = temp_flg.sort_values(by='Deaths', ascending=False)
        temp_flg = temp_flg.reset_index(drop=True)
        temp_flg = temp_flg[temp_flg['Deaths']>0]
        temp_flg.style.background_gradient(cmap='Pastel1_r')
Out[ ]:
           Country/Region
                                Deaths
         0
                     China
                            1016.000000
         1
                 Philippines
                               1.000000
         2
                   Thailand
                               1.000000
In [ ]: fig = px.choropleth(full_latest_grouped[full_latest_grouped['Deaths']>0],
                             locations="Country/Region", locationmode='country names',
                             color="Deaths", hover_name="Country/Region",
                             range_color=[1,50], color_continuous_scale="Peach",
                             title='Countries with Deaths Reported')
        fig.update(layout coloraxis showscale=False)
        fig.show()
```

Outside China, there hasn't been a lot of deaths due to COVID-19 has reported

Countries with all the cases recovered

```
In []: # Countries with all the cases recovered
    temp = row_latest_grouped[row_latest_grouped['Confirmed']==row_latest_grouped['Fountry/Region', 'Confirmed', 'Recovered']]
    temp = temp.sort_values('Confirmed', ascending=False)
    temp = temp.reset_index(drop=True)
    temp.style.background_gradient(cmap='Greens')
Out[]: Country/Region Confirmed Recovered

0 Macau 10.000000 10

1 Sri Lanka 1.000000 1
```

Most Recent Stats

```
In [ ]: temp = full_table.groupby('Date')['Confirmed', 'Deaths', 'Recovered'].sum()
   temp = temp.reset_index()
   temp = temp.sort_values('Date', ascending=False)
   temp.head(1).style.background_gradient(cmap='Pastel1')
```

```
C:\Users\ADMIN\AppData\Local\Temp\ipykernel_3208\894495828.py:1: FutureWarning:
Indexing with multiple keys (implicitly converted to a tuple of keys) will be dep recated, use a list instead.
```

```
        Out[]:
        Date
        Confirmed
        Deaths
        Recovered

        38
        2020-02-11 10:50:00
        43006.000000
        1018.000000
        4340
```

• There are more recovered cases than deaths at this point of time

Diamond Princess Cruise ship Status

```
In [ ]: ship.head()
Out[ ]:
          Province/State Country/Region Lat Long Date Confirmed Deaths Recovered
In [ ]: # Cases in the Diamond Princess Cruise Ship
        temp = ship.sort_values(by='Date', ascending=False).head(1)
        temp = temp[['Province/State', 'Confirmed', 'Deaths', 'Recovered']].reset_index(
        temp.style.background_gradient(cmap='Pastel1')
Out[]:
          Province/State Confirmed Deaths Recovered
In [ ]: # China
        temp = ship[ship['Date'] == max(ship['Date'])].reset_index()
        m = folium.Map(location=[35.4437, 139.638], tiles='cartodbpositron',
                       min_zoom=8, max_zoom=12, zoom_start=10)
        folium.Circle(location=[temp.iloc[0]['Lat'], temp.iloc[0]['Long']],
                color='crimson',
                            '<bold>Ship : '+str(temp.iloc[0]['Province/State'])+
                tooltip =
                            '<bold>Confirmed : '+str(temp.iloc[0]['Confirmed'])+
                            '<bold>Deaths : '+str(temp.iloc[0]['Deaths'])+
                            '<bold>Recovered : '+str(temp.iloc[0]['Recovered']),
                radius=int(temp.iloc[0]['Confirmed'])**1).add_to(m)
```

```
ValueError
                                          Traceback (most recent call last)
d:\Data science & Python 2022\0. Data Analyst_2023\Portfolio_Thach\I. Beginner 1
evel\3. COVID-19 - Analysis, Visualization & Comparisons\Covid-19 analysis visual
ization comparisons.ipynb Cell 46 in 3
      <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%20202
2/0.%20Data%20Analyst_2023/Portfolio_Thach/I.%20Beginner%20level/3.%20COVID-19%20
-%20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visuali
zation%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=0'>1</a> # China
---> <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%20202
2/0.%20Data%20Analyst_2023/Portfolio_Thach/I.%20Beginner%20level/3.%20COVID-19%20
-%20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visuali
zation%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=2'>3</a> temp = ship[ship['Dat
e'] == max(ship['Date'])].reset_index()
      <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%20202</pre>
2/0.%20Data%20Analyst 2023/Portfolio Thach/I.%20Beginner%20level/3.%20COVID-19%20
-%20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visuali
zation%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=4'>5</a> m = folium.Map(location
=[35.4437, 139.638], tiles='cartodbpositron',
      <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%20202</pre>
2/0.%20Data%20Analyst 2023/Portfolio Thach/I.%20Beginner%20level/3.%20COVID-19%20
-%20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visuali
zation%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=5'>6</a>
=8, max_zoom=12, zoom_start=10)
      <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%20202
2/0.%20Data%20Analyst_2023/Portfolio_Thach/I.%20Beginner%20level/3.%20COVID-19%20
-%20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visuali
zation%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=7'>8</a> folium.Circle(location=
[temp.iloc[0]['Lat'], temp.iloc[0]['Long']],
      <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%20202</pre>
2/0.%20Data%20Analyst 2023/Portfolio Thach/I.%20Beginner%20level/3.%20COVID-19%20
-%20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visuali
zation%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=8'>9</a>
                                                                   color='crimso
     <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%202022/</pre>
0.%20Data%20Analyst_2023/Portfolio_Thach/I.%20Beginner%20level/3.%20COVID-19%20-%
20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visualiza
tion%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=9'>10</a>
                                                                tooltip = '<li
><bold>Ship : '+str(temp.iloc[0]['Province/State'])+
   (\ldots)
     <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%202022/</pre>
0.%20Data%20Analyst 2023/Portfolio Thach/I.%20Beginner%20level/3.%20COVID-19%20-%
20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visualiza
tion%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=12'>13</a>
i><bold>Recovered : '+str(temp.iloc[0]['Recovered']),
     <a href='vscode-notebook-cell:/d%3A/Data%20science%20%26%20Python%20%202022/</pre>
0.%20Data%20Analyst 2023/Portfolio Thach/I.%20Beginner%20level/3.%20COVID-19%20-%
20Analysis%2C%20Visualization%20%26%20Comparisons/Covid-19%20analysis%20visualiza
tion%20comparisons.ipynb#X61sZmlsZQ%3D%3D?line=13'>14</a>
                                                                   radius=int(tem
p.iloc[0]['Confirmed'])**1).add_to(m)
ValueError: max() arg is an empty sequence
```

- The ship was carrying 3,700 people in total
- https://www.princess.com/news/notices_and_advisories/notices/diamond-princessupdate.html

Visual EDA

Spread Across the Globe

```
In [ ]: formated_gdf = full_table.groupby(['Date', 'Country/Region'])['Confirmed', 'Deat
        formated_gdf = formated_gdf.reset_index()
        formated_gdf = formated_gdf[formated_gdf['Country/Region']!='China']
        formated_gdf['Date'] = pd.to_datetime(formated_gdf['Date'])
        formated_gdf['Date'] = formated_gdf['Date'].dt.strftime('%m/%d/%Y')
        fig = px.scatter_geo(formated_gdf[formated_gdf['Country/Region']!='China'],
                             locations="Country/Region", locationmode='country names',
                             color="Confirmed", size='Confirmed', hover_name="Country/Re
                             range_color= [0, max(formated_gdf['Confirmed'])+2],
                             projection="natural earth", animation_frame="Date",
                             title='Spread outside China over time')
        fig.update(layout_coloraxis_showscale=False)
        fig.show()
        china_map = china.groupby(['Date', 'Province/State'])['Confirmed', 'Deaths', 'Re
                                                               'Lat', 'Long'].max()
        china_map = china_map.reset_index()
        china_map['size'] = china_map['Confirmed'].pow(0.5)
        china_map['Date'] = pd.to_datetime(china_map['Date'])
        china map['Date'] = china map['Date'].dt.strftime('%m/%d/%Y')
        china_map.head()
        fig = px.scatter_geo(china_map, lat='Lat', lon='Long', scope='asia',
                             color="size", size='size', hover_name='Province/State',
                             hover_data=['Confirmed', 'Deaths', 'Recovered'],
                             projection="natural earth", animation_frame="Date",
                             title='Spread in China over time')
        fig.update(layout_coloraxis_showscale=False)
        fig.show()
```

Number of Places to which COVID-19 Spread

• COVID-19 spread to all the provinces of the China really fast and early

 Number of countries to which COVID-19 spread hasn't increased that much after first few weeks

Recovery and Mortality Rate Over The Time

- During the first few weeks the there were more Deaths reported per day than Recoverd cases
- Over the time that has changed drastically
- Although the death rate hasn't come down, the number of recovered cases has defenitly increased

Proportion of Cases