## Problem 3 ¶

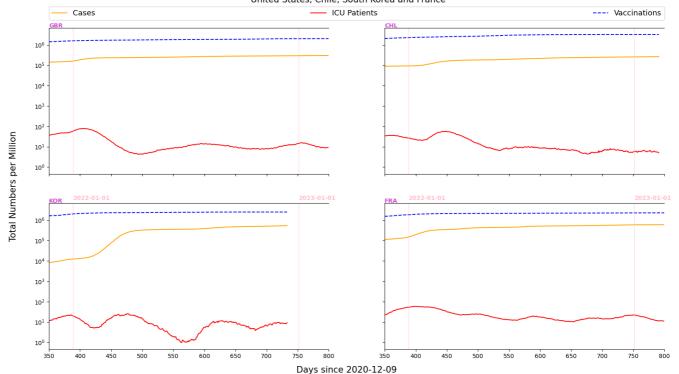
```
In [37]: import matplotlib.pyplot as plt
import numpy as np
import pandas as pd
import warnings
from wordcloud import WordCloud
warnings.simplefilter('ignore')
```

#### Part 3.1A

```
In [38]: df = pd.read csv('/Users/elliottoates/Library/CloudStorage/OneDrive-UniversityofE
         #only relevant collumns
         df = df.loc[:, ['iso_code', 'date', 'total_cases_per_million', 'total_vaccination
         #convert vax into per mill
         df['total vaccinations per million'] = df['total vaccinations per hundred'] * 100
         df.drop('total_vaccinations per hundred', axis=1, inplace=True)
         # date column to a datetime object
         df['date'] = pd.to datetime(df['date'])
         # only the four chosen countries and rows for 350 days or more since 2020-12-09
         countries = ['USA', 'CHL', 'KOR', 'FRA']
         start_date = pd.to_datetime('2020-12-09')
         df = df[df['iso_code'].isin(countries) & (df['date'] >= start_date + pd.Timedelta
         # collumn for number of days since 2020-12-09 for x axis
         start_date = pd.to_datetime('2020-12-09')
         df['days_since'] = (df['date'] - start_date).dt.days
         # Drop old date column for new "days since" column
         df.drop('date', axis=1, inplace=True)
         df.insert(1, 'days since', df.pop('days since'))
```

```
In [39]: #USA
         df_USA = df[df['iso_code'].str.contains('USA')]
         df_USA.dropna(how='any', inplace=True)
         df_USA = df_USA.reset_index(drop=True)
         #CHL
         df CHL = df[df['iso code'].str.contains('CHL')]
         df_CHL.dropna(how='any', inplace=True)
         df_CHL = df_CHL.reset_index(drop=True)
         #KOR
         df_KOR = df[df['iso_code'].str.contains('KOR')]
         df_KOR.dropna(how='any', inplace=True)
         df KOR= df KOR.reset index(drop=True)
         #FRA
         df_FRA = df[df['iso_code'].str.contains('FRA')]
         df FRA.dropna(how='any', inplace=True)
         df FRA = df FRA.reset index(drop=True)
```

```
In [40]: #figure
         fig, axes = plt.subplots(nrows=2, ncols=2, figsize=(19,10), sharex = True, sharey=Tr
         #axes objects
         axes = axes.ravel().tolist()
         plt.suptitle('Total Covid-19 cases, ICU patients, and vaccinations per million in
         fig.supxlabel('Days since 2020-12-09', size = 15, y = 0.05)
         fig.supylabel('Total Numbers per Million', size = 15, x = 0.075)
         #DATA
         x = 'days since'
         y1 = 'total_cases_per_million'
         y2 = 'icu patients per million'
         y3 = 'total vaccinations per million'
         data = [df_USA,df_CHL,df_KOR,df_FRA]
         #subplot - axes
         for z,i in enumerate (data) :
             i.plot(x=x,y =[y1,y2] ,ax=axes[z],legend =False,logy=True,color = ['orange','
             i.plot(x=x,y =y3 ,ax=axes[z],legend =False,logy=True,color = 'blue',linestyle
             axes[z].set_xlim(left=350,right =800)
             axes[z].set(xlabel=None)
             axes[z].axvline(x=389,ymin = 0, ymax = 1,color = 'pink',alpha = 0.4)
             axes[z].axvline(x=752,ymin = 0, ymax = 1,color = \frac{\text{pink}}{\text{nalpha}} = 0.4)
             axes[z].spines["right"].set_visible(False)
             axes[z].tick_params(axis='y', which='minor', left=False)
             axes[z].grid(False)
         #pink lines
         axes[0].text(x=350,y=7000000,s = 'GBR', color = 'm', weight='demi', alpha = 0.7)
         axes[1].text(x=350,y=7000000,s = 'CHL', color = 'm', weight='demi', alpha = 0.7)
         axes[2].text(x=350,y=7000000,s = 'KOR', color = 'm',weight='demi',alpha = 0.7)
         axes[3].text(x=350,y=7000000,s = 'FRA', color = 'm', weight='demi', alpha = 0.7)
         axes[2].text(x=389,y=10000000,s = '2022-01-01', color = 'pink',weight='demi',alph')
         axes[2].text(x=752,y=10000000,s = '2023-01-01', color = 'pink',weight='demi',alph')
         axes[3].text(x=389,y=10000000,s = '2022-01-01', color = 'pink',weight='demi',alph
         axes[3].text(x=752,y=100000000,s = '2023-01-01', color = 'pink',weight='demi',alph'
         #legend
         axes[0].plot([], [], color='orange', label='Cases')
         axes[0].plot([], [], color='red', label='ICU Patients')
         axes[0].plot([], [], color='blue', linestyle='--', label='Vaccinations')
         handles, labels = axes[0].get_legend_handles_labels()
         fig.legend(handles, labels [3:], loc= 'upper center', ncol=3, mode = 'expand', bb
```



#### Part 3.1B

In [41]: df = pd.read csv(

```
'/Users/elliottoates/Library/CloudStorage/OneDrive-UniversityofExeter/Second

In [42]:

def make_dfs(x):
    # Filter data for the given ISO code and calculate days since first vaccinati
    y = df[df['iso_code'].str.contains(x)]
    y['date'] = y['date'].apply(pd.to_datetime)
    y['Days Since lst Case'] = (y['date'] - (y.loc[df['total_cases'] >= 1, 'date')

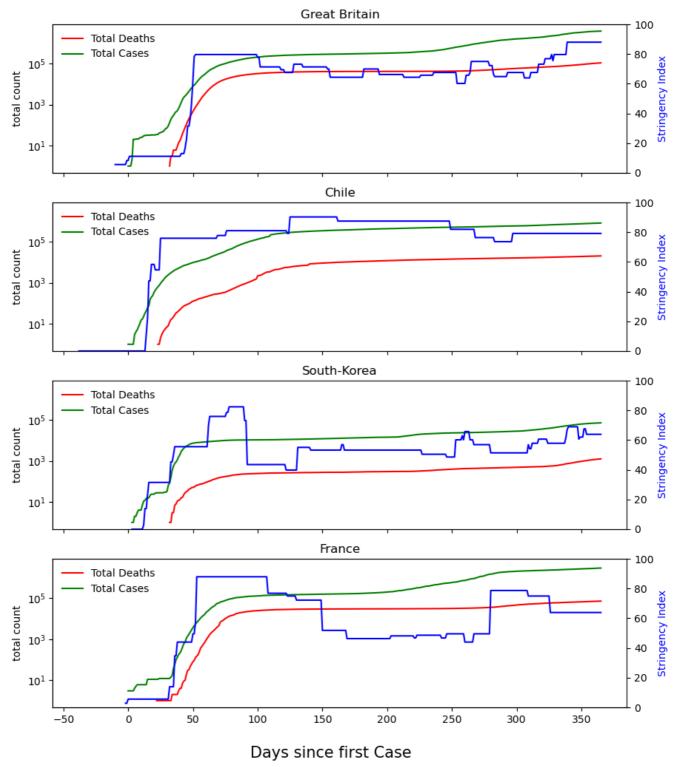
# Filter data to only include dates within a certain range and select relevan
    y = y[y['Days Since lst Case'] <= 365]
    y = y[y['Days Since lst Case'] >= -365]
    y = y[['iso_code', 'total_deaths', 'total_cases', 'stringency_index', 'Days S

# Remove any rows with missing data in the stringency_index column and reset
    y = y[y['stringency_index'].notna()]
    y = y.reset_index(drop=True)

return y
```

```
In [43]: # Create a figure with 4 subplots, each representing a different country
         fig, (ax, ax1, ax2, ax3) = plt.subplots(4, 1, figsize=(10, 12), sharex=True, shar
         plt.suptitle('Total Covid 19 Deaths, Cases, and Stringency Index a year from firs
                      weight='ultralight', y=0.925)
         fig.supxlabel('Days since first Case', size=15, y=0.05)
         # List of the four subplots
         axes = [ax, ax1, ax2, ax3]
         # Add plot titles for each subplot
         ax.set(title='Great Britain')
         ax1.set(title='Chile')
         ax2.set(title='South-Korea')
         ax3.set(title='France')
         isocodes = ['GBR','CHL','KOR','FRA']
         # Remove gridlines from all subplots
         ax.grid(False)
         ax1.grid(False)
         ax2.grid(False)
         ax3.grid(False)
         # Loop through each ISO code and corresponding subplot
         for i, z in zip(isocodes, axes):
             axa = z.twinx()
             # Create a DataFrame for the current ISO code and extract relevant columns
             x = make_dfs(i)['Days Since 1st Case']
             y1 = make_dfs(i)['total_deaths']
             y2 = make_dfs(i)['stringency_index']
             y3 = make_dfs(i)['total_cases']
             # Plot total deaths and total vaccinations on the left y-axis
             deaths_line, = z.plot(x, y1, color='r', label='Total Deaths')
             cases_line, = z.plot(x, y3, color='g', label='Total Cases')
             # Plot stringency index on the first right y-axis
             axa.plot(x, y2, color='b')
             # Add y-axis labels and set scales for each axis
             z.set_ylabel('total count', color='black')
             z.set(yscale='log')
             axa.set ylabel('Stringency Index', color='b')
             axa.set_ylim(0, 100)
             # Customize the ticks
             axa.grid(False)
             # Create a custom legend without Stringency Index and with no border
             legend_lines = [deaths_line, cases_line]
             legend_labels = [line.get_label() for line in legend_lines]
             z.legend(legend lines, legend labels, loc='upper left', frameon=False)
         plt.show()
```

Total Covid 19 Deaths, Cases, and Stringency Index a year from first Case



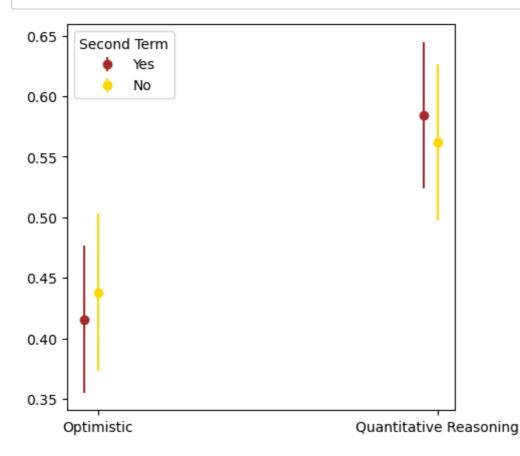
The figure above allows us to visualise govornments responses at the start of the pandemic. One can observe that countries all tended to raise the stringency index to a small degree between the recording of the first cases and the first death. Then once faced with a positive total death count, governments (apart from the United Kingdom) more drastically increased the "stringency" of their response as they came to the stark realisation of the gravity of the oncoming pandemic.

The figure also is usefull in depicting the relationship between total cases, total deaths and stringency index. In the case of france between days 150 and 275 the strinengcy index was lowered as the govornment relaxed their response. Then after they saw a rise in cases from this they once againe raised their response in order to limit this raise in deaths.

## Part 3.2A

In [44]: df\_LLM = pd.read\_csv('/Users/elliottoates/Library/CloudStorage/OneDrive-Universit

```
In [45]: import pandas as pd
         import matplotlib.pyplot as plt
         df LLM = df LLM[(df LLM['Inaugural Address'] == 'First Inaugural Address') | (df
         # Prepare data for plotting
         df_LLM['Second Term'] = df_LLM['Inaugural Address'].apply(lambda x: 'Yes' if x ==
         df LLM = df LLM.melt(id vars=['Second Term'], value vars=['Optimistic', 'QuantLLM'
         # Calculate mean and standard deviation
         mean_values = df_LLM.groupby(['Category', 'Second Term']).mean()
         std_values = df_LLM.groupby(['Category', 'Second Term']).std()
         # Create the point plot
         fig, ax = plt.subplots(figsize=(5, 5))
         x_labels = ['Optimistic', 'QuantLLMQuant']
         x_{tick_positions} = [0.25, 1.25]
         for i, (label, xpos) in enumerate(zip(x_labels, x_tick_positions)):
             y_yes = mean_values.loc[(label, 'Yes'), 'Value']
             y_no = mean_values.loc[(label, 'No'), 'Value']
             std_yes = std_values.loc[(label, 'Yes'), 'Value']
             std_no = std_values.loc[(label, 'No'), 'Value']
             ax.errorbar(xpos - 0.04, y yes, yerr=std_yes, fmt='o', color='brown', label='
             ax.errorbar(xpos, y_no, yerr=std_no, fmt='o', color='gold', label='No' if i =
         ax.set_xticks(x_tick_positions)
         ax.set_xticklabels(['Optimistic','Quantitative Reasoning'])
         ax.legend(title='Second Term', loc='upper left')
         ax.grid(False)
         plt.show()
```



#### Part 3.2B

```
In [46]: df_LLM = pd.read_csv('/Users/elliottoates/Library/CloudStorage/OneDrive-Universit
In [47]: |#Finding words unique to reelection & no reelection speeches
         import string
         # convert lists of words into sets (reeleciton)
         reelection speeches = df LLM[df LLM['Inaugural Address'] != 'Inaugural Address'][
         reelection_words = set()
         for speech in reelection speeches:
             words = speech.split()
             # alphabetical characters only
             words = [word.translate(str.maketrans('', '', string.punctuation)).lower() fo
             reelection words.update(words)
         # list into set for no relection
         not_reelection_speeches = df_LLM[df_LLM['Inaugural Address'] == 'Inaugural Addres
         not_reelection_words = set()
         for speech in not reelection speeches:
             words = speech.split()
             # alphabetical
             words = [word.translate(str.maketrans('', '', string.punctuation)).lower() fo
             not_reelection_words.update(words)
         #create unique word sets
         unique to not reelection = not reelection words.difference(reelection words)
         unique to reelection = reelection words.difference(not reelection words)
```

```
In [48]: fig, (ax1, ax2) = plt.subplots(1, 2, figsize=(10,5))
         wordcloud = WordCloud(width = 800, height = 800,
                               background color ='white',
                               min font size = 20)
         # no re-election wordcloud
         wordcloud.generate_from_text(' '.join(unique_to_not_reelection))
         ax1.imshow(wordcloud)
         ax1.axis("off")
         ax1.set_title('"Big No-Go\'s"', fontsize=16)
         # re-election wordcloud
         wordcloud.generate from text(' '.join(unique to reelection))
         ax2.imshow(wordcloud)
         ax2.axis("off")
         ax2.set_title('"Hidden Secrets"', fontsize=16)
         # title
         fig.suptitle('Words unique to speeches that did or didn\'t get reelected', fontsi
         plt.tight_layout()
         plt.show()
```

# Words unique to speeches that did or didn't get reelected "Big No-Go's" "Hidden Secrets"





The above plot shows words that are unique to speaches that went on to not get re-election and those that didnt. I think that wordclouds in this case are a brilliant way to convey the information. It highlights particular words that an incoming US president should think twice about using in their speech and those that should be included. However this is still somewhat trivial since these are singular words so in many cases there is not context or sentiment that can be interpreted.

#### Part 3.3A

```
In [11]: import cartopy.crs as crs
    import cartopy.feature as cfeature
    import matplotlib.pyplot as plt
    df = pd.read_csv('/Users/elliottoates/Library/CloudStorage/OneDrive-UniversityofE

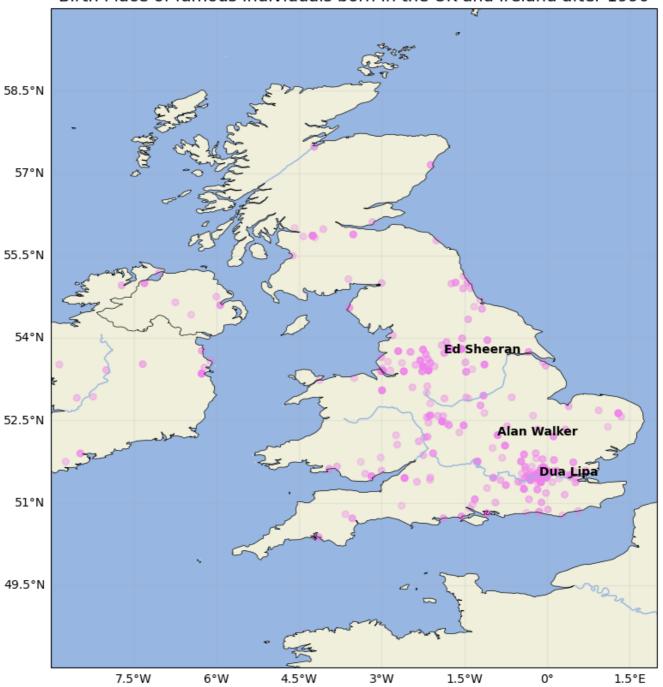
In [12]: #Filtering
    #year
    df = df[df['birthyear'] > 1990]

#lat and long have values
    df = df[(df['bplace_lat'].notnull()) & (df['bplace_lon'].notnull())]

#from uk & ireland
    df = df[df['bplace_country'].isin(['United Kingdom', 'Ireland'])]
```

```
In [13]: figure = plt.figure(figsize=(15,10))
         #Draw map and UK and choose features
         ax = figure.add_subplot(1,1,1, projection=crs.PlateCarree())
         ax.add feature(cfeature.BORDERS,linewidth=0.5)
         ax.add feature(cfeature.COASTLINE,linewidth=0.5)
         ax.add feature(cfeature.LAND)
         ax.add feature(cfeature.OCEAN)
         ax.add feature(cfeature.RIVERS)
         ax.set extent( [-9, 2, 48, 60], crs=crs.PlateCarree())
         ax.set_title('Birth Place of famous Individuals born in the UK and Ireland after
         #Draw feint gridlines and ticks on axis
         coordinates = ax.gridlines(draw_labels=True,alpha=0.2)
         coordinates.xlabels top = False
         coordinates.ylabels right = False
         #Plot points on graph
         plt.scatter(
             x=df["bplace_lon"],
             y=df["bplace_lat"],
             color="violet",
             s=30,
             alpha=df['hpi']/100,
             transform=crs.PlateCarree()
         )
         #put top 3 rows name on map
         for index,row in df.head(3).iterrows():
             plt.text(
                 x=row["bplace_lon"],
                 y=row["bplace_lat"],
                 s=row["name"],
                 weight='bold',
                 transform=crs.PlateCarree(),)
         #title
         plt.show()
```

Birth Place of famous Individuals born in the UK and Ireland after 1990



### Part 3.3B

In [17]: df = pd.read\_csv('/Users/elliottoates/Library/CloudStorage/OneDrive-UniversityofE

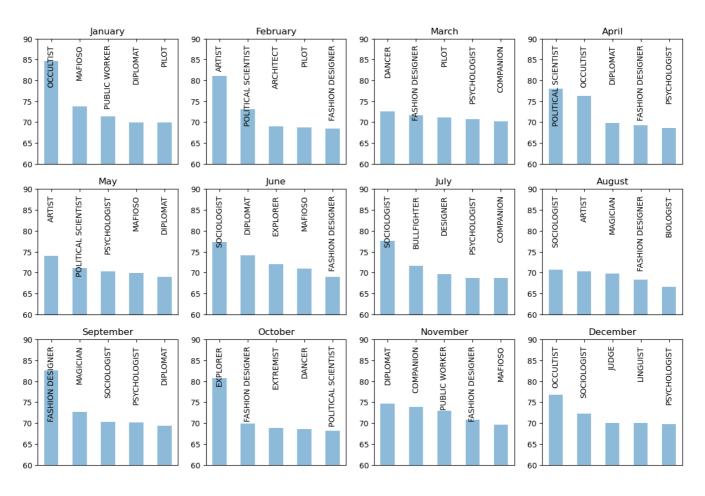
#### Out[17]:

	id	wd_id	wp_id	slug	name	occupation
0	18934	Q9458	18934	Muhammad	Muhammad	RELIGIOUS FIGURE
1	17414699	Q720	17414699	Genghis_Khan	Genghis Khan	MILITARY PERSONNEL
2	18079	Q762	18079	Leonardo_da_Vinci	Leonardo da Vinci	INVENTOR
3	14627	Q935	14627	Isaac_Newton	Isaac Newton	PHYSICIST
4	17914	Q255	17914	Ludwig_van_Beethoven	Ludwig van Beethoven	COMPOSER
88932	64119467	Q95877306	64119467	Siarhei_Tsikhanouski	Siarhei Tsikhanouski	YOUTUBER
88933	61153000	Q64840184	61153000	Irfaan_Ali	Irfaan Ali	POLITICIAN
88934	63320558	Q87075301	63320558	Guadalupe_Campanur_Tapia	Guadalupe Campanur Tapia	SOCIAL ACTIVIST
88935	62810909	Q83648587	62810909	Charli_D'Amelio	Charli D'Amelio	YOUTUBER
88936	63911513	Q93839274	63911513	Prince_Charles_of_Luxembourg_(born_2020)	Prince Charles of Luxembourg	NOBLEMAN

88937 rows × 34 columns

```
In [4]:
        import matplotlib.pyplot as plt
        import pandas as pd
        import calendar
        # load data
        df = pd.read csv('/Users/elliottoates/Library/CloudStorage/OneDrive-UniversityofE
        # filter data
        df = df[df['birthdate'].notnull()]
        df = df[df['birthyear'] > 1900]
        # calculate average HPI by occupation and birth month
        df['birthmonth'] = pd.to_datetime(df['birthdate'], format='%Y-%m-%d').dt.month
        df['hpi'] = df['hpi'].fillna(0)
        avg hpi = df.groupby(['birthmonth', 'occupation'])['hpi'].mean().reset index(name
        # create subplots
        fig, axs = plt.subplots(3, 4, figsize=(15, 10))
        # iterate over each month
        for i, ax in enumerate(axs.flatten(), start=1):
            # get top 3 occupations for this month
            top_occupations = avg_hpi[avg_hpi['birthmonth'] == i].sort_values(by='avg_hpi
            # plot bar chart of top 3 occupations
            ax.bar(top_occupations['occupation'], top_occupations['avg_hpi'], width =0.5, a
            ax.set_xticklabels(top_occupations['occupation'],rotation=90)
            ax.tick params(axis='x', direction='in',pad = -155, top = True, bottom = Fals
            ax.set_title(calendar.month_name[i])
            ax.set_ylim([60, 90])
            ax.grid(False)
        # set overall title
        fig.suptitle('Top 3 Occupations by Average HPI for Each Birth Month', size = 20, w
        #plt.tight layout()
        plt.show()
```

Top 3 Occupations by Average HPI for Each Birth Month



The plot displays the top five occupations by average HPI for each birth month, with each subplot representing a different month. This visualization is interesting because it provides insights into the distribution of occupations memorability by birth month. For example, we can see that certain occupations, such as oculists and diplomats, consistently appear in the top five for multiple months. Although this figure could perhaps be more usefull if the metric was by frequency in the respective birth month rather than mean hpi, the fact that this data set is centred around famous people and is based largley on wikepedia pages has resulted in there being certain occupations that have a massive amount of persons and so all months show the exact same occupations (there are 17000 footballers in the filtered dataset, compared to 1 bullfighter).