## CSC110 Project Report

# Educational Crisis - A Closer Examination on the Correlations Between COVID-19 and School Closures Around the Globe

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## 1 Introduction

COVID-19 profoundly impacted students' learning environment and strategies. Therefore, we are curious about how this global pandemic correlates with school closures all around the world as time passes, which is one of the main influencing factors that entirely changed our way of learning and living. We will compare the levels of School Closure with the severity of COVID-19 of different countries in a specified time frame.

As a group of students, COVID-19 changed our way of learning from face-to-face to online for quite a long time. In 2021, results from the National Survey of Public Education's Response to COVID-19 had shown that more than  $46\%^1$  of the students in the US across all grades are studying remotely. However, after COVID-19 eased a little bit, some of our schools reverted to the traditional in-person learning classes. A very prevalent issue amongst students is frequently switching between online and in-person learning. Under such circumstances, learning became increasingly hard as time passed.

Besides, as international students, we were energetic and excited about future university life. However, everything became harsh and unpredictable after the emergence of COVID-19. We are now bothered by expensive flight tickets, personal safety issues, and potential school closures as a result of the pandemic. For example, two of our group members are currently living in China because of COVID-19 and are troubled by the inconveniences of timezone differences.

Therefore, we aim to discover a general relationship between COVID-19 and school closures. With the help of the observed correlation, we could be more prepared in countering the impacts of COVID-19 as individuals. For example, we could reasonably predict the next virus outbreak based on our project and switch to online classes beforehand.

Additionally, from a broader scope, our project could provide intuitions to educational institutions about the trend of school closures and COVID-19 cases. Therefore, they could identify whether they made a correct decision of closing/opening schools during the pandemic, and draft plans to minimize the impacts in the future. In other words, we could utilize our project as a guide to help prevent future impacts that could rain onto the educational sectors that suffered during the current pandemic.

 $<sup>^1\</sup>mathrm{National}$  Survey of Public Education's Response to COVID-19 Infographic, https://www.air.org/sites/default/files/2021-07/infographic-results-national-covid-survey-june-2021\_1.pdf

## 2 Dataset Description

We have identified two main datasets that will be relevant for our project's implementation.

These are:

- 1. Global School Closures for COVID-19<sup>2</sup> Obtained from The Humanitarian Data Exchange, compiled by Saleh Ahmed Rony, sourced from UNESCO.
- 2. COVID-19 Data Repository by the Center for Systems Science and Engineering (CSSE) at Johns Hopkins University<sup>3</sup> Obtained from GitHub, compiled by JHU, sourced from WHO, ECDC, DXY, US CDC, etc.

Both datasets will be stored in a Comma Separated Value file, which will allow us to read from them easily through Python's csv library.

Furthermore, both datasets are very credible as they are sourced from multiple sites, including but not limited to WHO, ECDC, and US CDC. Furthermore, these datasets are also licensed under the Creative Commons Attribution 4.0 International (CC BY 4.0), which allows us to utilize these data for our own needs.

The datasets that we have downloaded and utilized in this project were chosen because they were compiled in a way that allows easy access and manipulation. By using datasets that are already organized could improve the efficiency and robustness of our program.

The Global COVID-19 Dataset (Time series) has the following structure:

Province/State	Country/Region	Lat	Long	1/22/20	1/23/20	1/24/20	
	Afghanistan	33.93911	67.70995	0	0	0	
	Albania	41.1533	20.1683	0	0	0	
		•••	•••	•••	•••	•••	

The headers extend up until November 1, 2021 for the dataset that we will be using in our application.

Starting from column 5 and onwards (for the Global COVID-19 Dataset) contains the amount of cumulative cases for the specified country in the date shown in the header row.

The School Closure Dataset has the following structure:

Date	ISO	Country	Status	Note
17/02/2020	CHN	China	Partially open	
17/02/2020	MNG	Mongolia	Closed due to COVID-19	

The data is organized by entries of different country each day.

Some of the country names in our datasets contain characters that are not part of the standard ASCII table. An example would be "Curação", where "ç" is a French (Latin script) letter.

Since these letters are not in the standard ASCII Table, displaying and encoding issues may arise. So for convenience, we will filter them out.

For the purpose of this project, we will simplify the standard ASCII Table to only contain characters from "a-z", "A-Z", "0-9", "!-~".

<sup>&</sup>lt;sup>2</sup>Global School Closures COVID-19, https://data.humdata.org/dataset/global-school-closures-covid19

<sup>&</sup>lt;sup>3</sup>One of the most used COVID-19 Cases Database, github.com/CSSEGISandData/COVID-19

## 3 Computational Overview

We divided our project into 3 main parts: data pre-processing, Graphical User Interface (GUI) implementation, and interactive data manipulations (filtering, aggregation, searching, etc).

#### 3.1 Data Pre-Processing

#### 3.1.1 Resource Initialization

In this part of the implementation, we utilized requests, os, and hashlib to download required resources (data sets, icons, etc) and verify their completeness.

The requests library allowed our application to get the contents of certain URLs. We used this library in combination with os to download and save those resources into the working directory, so our application can run with the specified data. Specifically, we used requests get, which allowed us to retrieve the information contained in the specified URL, and os.makedirs, which allowed us to create directories to store our files in. Also, we set up a public GitHub repository to hold all of our codes and resources, so our application can visit those permanent raw links and download all of the resources.

We also implemented a MD5 Hash function<sup>4</sup> to calculate the unique identifiers of our resources. For those newly downloaded resources, our application will compare their hash values with the predefined valid hash values to ensure that the files downloaded are what we expected.

To put all of these together, we implemented a module called resource\_manager, containing a Resource class, other helper functions, and some constants. An instance of the Resource class represents a resource file of our application. Each resource instance contains a remote path, a unique identifier, and a local path so we can download and verify the files. Also, we built the whole resource manager in an extendable way: By maintaining a dict that maps resource name to the Resource instance, we could simply register, or add, a new resource to the dict if needed. Then, our application will automatically handle all downloading and file manipulating tasks without any further modifications. TODO: Add config part

#### 3.1.2 Algorithms

To simplify our data manipulations, we abstracted out few generic algorithms such as sorting, grouping, searching, etc. in a new module: algorithms.

All of the algorithms in algorithms are generic, meaning they can handle all data types with the help of some callable parameters. To be more specific, we used a generic type T to represent any type of arguments passed into our algorithms. However, not all data types support the operations an algorithm needed (such as compare operation in sorting algorithm). Thus, we added another callable parameter to specify how the operations are performed on the passed data type T.

Additionally, we implemented multiple sorting algorithms for the purposes of showing the impact of algorithm running time complexity:

Bubble Sort: \$\mathcal{O}(n^2)\$
Selection Sort: \$\mathcal{O}(n^2)\$
Insertion Sort: \$\mathcal{O}(n^2)\$
Merge Sort: \$\mathcal{O}(n \log(n))\$

Upon the initialization of the application, the user should choose a sorting algorithm for the whole application and then initialize the data. This is achieved by assigning a new sorting function reference (defined in algorithms) to the project sorting function defined in settings. That is, our project will always call the sorting function defined in settings instead of the sorting functions in algorithms.

Also, we implemented some grouping and searching algorithms for data manipulations like grouping all data by a categorical variable or searching for a date in all the date values we have.

 $<sup>^{4}</sup> Implementation\ referenced\ from\ StackOverFlow,\ https://stackoverflow.com/questions/3431825/generating-an-md5-checksum-of-a-file and the control of the control of$ 

#### 3.1.3 Data Initialization

We read all the data into Python in the module called data with help of the csv library

For the COVID-19 Dataset, we only used the columns with the headers "Country" and "Dates", as they provide the information for us to visualize.

For the School Closure Dataset, we used all of the columns aside from the "Note" column, as it provides irrelevant and hard-to-process information.

We created the following data classes:

- ClosureStatus An Enum class that maps the different status of school closure to an int value
- Location A class that represents a location.
- Country A class that represents a country, inherited from Location.
- Province A class that represents a province, inherited from Location.
- BaseData A basic class that represents a piece of data.
- TimeBasedData A class that represents a time-based data, inherited from BaseData.
- CovidCaseData A class that represents an entry in COVID-19 data, inherited from TimeBasedData.
- SchoolClosureData A class that represents an entry in Closure Data, inherited from TimeBasedData.

We created the following GLOBAL CONSTANTS:

- ALL\_COVID\_CASES A list of all CovidCaseData objects read from the data set, including country-wide and provincial data.
- COUNTRIES\_TO\_COVID\_CASES A dictionary mapping from a country name to all of its respective CovidCaseData.
- GLOBAL\_COVID\_CASES A list of all CovidCaseData that contains COVID-19 cases summed across all countries on a certain date.
- ALL\_SCHOOL\_CLOSURES A list of all SchoolClosureData that is read from the data set.
- COUNTRIES\_TO\_SCHOOL\_CLOSURES A dictionary mapping from a country name to its respective SchoolClosureData.
- GLOBAL\_SCHOOL\_CLOSURES A list of SchoolClosureData with only dates and the status of the majority of the schools in that date.
- COUNTRIES A set of Country objects that are read from the data set.
- SORTED\_COUNTRIES A list of sorted Country objects by country name.

Then, we converted the raw data read from the data set into the classes specified above, so we could easily utilize them in practice. Also, by filtering, grouping, and sorting the data we have loaded into Python, we obtained those GLOBAL CONSTANTS defined above that could be utilized by other modules.

This brings us to the next part of our project, which is the Graphical User Interface implementation.

## 3.2 Graphical User Interface

We utilized PyQt5 to generate an interactive graphical user interface and Matplotlib to plot graphs.

We implemented the following functionalities:

- A fully functional Graphical User Interface with menu bar, multiple buttons, input date edits, sliders, etc.
- A progress bar on the status bar displaying the progress of data initialization.
- Panning and zooming functionalities on the graph by left click, drag, and scrolling.
- COVID-19 cumulative cases scatter plot and school closures visualizations.
- Customizable line color, style, and marker.
- And many more details...

#### 3.2.1 Utilities

We created a module called gui\_utils that contains many helper functions, classes, and constants.

In this module, we created the following classes that inherited from their PyQt Widget Parents and extended their capabilities to better suit our needs:

- StandardLabel: A standard text label for displaying strings and pixels.
- StandardPushButton: A standard button that can be pushed (clicked).
- StandardComboBox: A standard combo box that can help the user select an item from a list of items.
- StandardDateEdit: A standard date editor for displaying and editing dates (Not date and time).
- StandardCheckbox: A standard checkbox that can be checked or unchecked.
- StandardRadioButton: A standard radio button that can be checked or unchecked.
- StandardProgress Bar: A standard progress bar for displaying the progress.
- StandardGroupBox: A standard group box that can group many other widgets together.
- ...

#### 3.2.2 Main Window

Our main window is defined in module gui\_main, which consists of a "frontend" and a "backend".

The "frontend" is the MainWindowUI class that is responsible for creating widgets, initializing widgets' attributes, and managing the layout of all widgets. Also, it represents the "true" window itself and defines all the attributes of the window.

The "backend" is the combination of multiple classes including PlotCanvas and MainWindow. Technically, all the codes besides the "frontend" part are responsible for running our "backend".

The PlotCanvas class represents our plots and is responsible for handling all user's inputs to the plot such as mouse moving or dragging. We implemented the full zooming and panning functionalities by ourselves because we did not like how Matplotlib implemented them. Also, we constructed a cross-hair that is always centered on the data entry that is closest to the cursor position.

All the user's inputs on the main window, such as clicking a button, selecting a country, or sliding a slider are handled by the MainWindow class. We utilized PyQt5 signals and slots mechanism to achieve most of the functionalities. For example, when a button is clicked, then the button sends a signal to a callback function to perform some actions. The callback functions are the slots, and the signals are the information passed into the callback functions.

The interaction logics of our GUI is that our visualization (plot) will update as the user update the filters (a country or a data range).

#### 3.3 Misc

Aside from the libraries mentioned, we also employed sys, logging, time, typing, and ctypes.

The libraries sys and logging are used to log the information, warnings, or errors in the console to inform the user what our application is doing.

The time library is used to evaluate the time that it takes for us to initialize the data and to output the time in the console log.

We used typing to specify the types of inputs that our functions will be taking and some generic types mentioned earlier.

Lastly, we used ctypes to specifically set an identifier for our application when running in Windows platform, so the icon will be displayed normally on the task bar when the application window is active.

## 4 Instructions

Before everything start, please make sure you have a stable Internet connection.

- 1 Download the zipped file we provided on MarkUs. The zipped file should contain "algorithms.py, data.py, gui\_main.py, gui\_utils.py, main.py, resource\_manager.py, settings.py, and requirements.txt."
- 2 Unzip the file in an empty directory (It is better to make sure the path to the directory only contains English letters).
- 3 Boot up PyCharm and open "requirements.txt" in the directory you just unzipped the files in. Click "Install requirements" to automatically download all the libraries needed.
  - Alternatively, you could open the terminal in the directory and run "pip install -r requirements.txt."
- 4 Either use PyCharm or a terminal to run "main.py" and you should be able to see a window popup.
- 5 Select a "Sorting algorithm" and click the initialize button. After a few seconds, our application should be ready.
- 6 You should be able to set the start and end dates for the plot, pan and zoom on the plot, select countries and plot the result again, and utilize the menu bar for more customizable configurations.
- 7 Feel free to explore the application from this point onwards!

#### 4.1 Notes

- We only tested our application in Windows 10/11 platform with Python 3.10.1. Although we were trying our best to make it compatible with others, we could not guarantee the behaviors under other operating systems.
- $\bullet$  It can run on a M1 Mac with an extensive setup. (You need to run Terminal on Rosetta and install the x86\_64 version of all libraries used through pip)
- We are unsure of the performance of our application in an Intel Mac.
- We haven't tested our application on any Linux distributions.

#### 4.2 Remedy

If our application failed to download all **required** resources, please download this compressed file and unzip it in the same directory as the main.py. Make sure that the **resources** folder is in the same directory as the main.py. TODO: Add the link before we submit.

Or you could clone our repository and everything will be right in the correct place. TODO: Add github.

## 5 Changes from the Proposal

- Added MLA Style Footnote in multiple occasions.
- Added more details in Computational Overview.
- Added features to download dataset and write in working directories.
- Added features to hash a file in MD5 to ensure its completeness.
- Removed some unused references and added new ones.
- Removed the US COVID-19 Dataset as it is unnecessary for our analysis purposes.

#### 6 Discussion

#### 6.1 Results and Conclusion

Our application can be utilized to visually determine if there are any correlations between COVID-19 Cases of a certain country and School Closure status of the certain country. This would be enough for us to answer the research

question, because we can clearly identify a trend between COVID-19 Cases and School Closure statuses.

Furthermore, we can also utilize this application to generate plots about data around the world that can be shared to raise awareness, which could allow educational sectors to be more prepared for future events similar to the COVID-19 Pandemic.

We can also identify some of the "Outliers" from the general trend for some countries. These may exist because their country officials decided for schools to continue operating amidst the severe conditions posed.

#### 6.2 Limitations

- A major limitation of our application is the fact that our data is not a 100% accurate data from all around the globe. School Closure Data being used is uploaded by an individual. The COVID-19 Data may also contain inaccurate information.
- Furthermore, we recklessly removed some of the country names in our datasets because they contain non-ASCII characters, which limits the amount of data.
- We also removed some country names because they were not present in both datasets, making the actual data presented in our application even more limited.
- We did not introduce the vaccination data and this impacts our scope of analysis. That is, most countries resume in-person learning after most individuals were vaccinated.

#### 6.3 Obstacles

- Our application crashes all day, all night, 24 \* 7, non-stop. Making us want to drop out of CSC110. But nevertheless, we still overcame the difficulties and produced a "Functioning" application.
- One of the biggest challenges we faced is the implementation of the progress bar.

If we want to display a progress bar monitoring the progress of something like initialization, we need three tasks to be performed simultaneously, or asynchronously:

- 1. The initialization process itself.
- 2. Display the current progress (GUI).
- 3. Continuously monitor the current progress and send the progress to the GUI to display.

Therefore, we need 2 more threads, in addition to the main GUI thread, to make the progress bar work as intended. But here comes the problems, we had no prior knowledge in multithreading and specifically, multithreading with PyQt5.

Then, we searched on the Internet, read the full documentation of PyQt5 which is in C++, study others' examples, and experimented endless times.

We firstly used threading module to run the progress bar on another window on another thread, but after many crashes without error message, we found that PyQt5 doesn't like the Python native threading module. After running QApplication, any operations from threading module will block the main thread, which is totally not what we expected.

Then, we switched to QThread which is preferred by PyQt5. However, another problem arose that as we know, PyQt5 is thread-safe which means that it doesn't allow any modifications from another QThread. Thus, we could not simply run initialization on another QThread and directly report the progress to the PyQt5.

The struggle with the implementation of the progress bar continued on for days. However, on the verge of giving up, we remembered that PyQt5 had signals and slots mechanism (explained earlier), and we could actually create a new signal in our monitor thread and send this signal to the main GUI thread every time the progress updated. This way, we utilized the built-in mechanism of PyQt5 and prevented any thread-unsafe operations.

Retrospectively, because we learned many valuable knowledge from this challenge and now we know how to tackle it, the progress bar is not very difficult. However, although the progress bar itself is trivial, the processes involved in overcoming the challenge are pivotal to us.

• The other challenge is about optimizations.

In our plot, we implemented a cross-hair that centered on the closet point in the line from the cursor. We successfully implemented it with binary search and many data transformations and calculations. However, the frame rate per second (FPS) was very low when moving the cross-hair.

To investigate the root of the problem, we analyzed the running time of our algorithms, but it turned out that the running time was fairly decent  $(\mathcal{O}(n))$ .

Then, we used time module and divided the codes into segments to calculate the real times each piece took. Finally, we found that the root cause of this issue is actually from the Matplotlib#Canvas.draw() function call. But another issue arose along with this discovery: we cannot modify the code from matplotlib to make it faster.

After many researches, we found out that we could solve this issue with a relatively advanced method: blit. Since we already had many experiences from the previous challenge, by reading through the documentation, experimenting with many small examples, and updating the whole implementation of PlotCanvas, we successfully implement blit to fix the issue.

We firstly draw the figure, excluding the cross-hair, and save the figure background to cache it. Then, every time the cursor moves, we only draw the cross-hair and restore the figure from cache. In this way, the previous cross-hair disappears because the figure background does not contain the cross-hair - we draw the figure before the cross-hair, and we don't need to redraw the background frequently.

This largely improved the frame rate and now the cross-hair is rendered very smoothly.

## 6.4 Next Steps

- We will be carrying the skills we developed in this project into other projects in the future. We have now
  acquired the ability to download, process, and hash data. These abilities would be necessary to create many
  more applications in the future.
- We also acquired one of the most important skills in the Computer Science Industry, which is to design a Graphical User Interface. This is the ultimate version of "Designer to User" contract, which provides a very "Easy to use" interface so that users without any knowledge in Computer Science can also use this application to their advantage.
- This project will be held public on GitHub repository for anyone to fork and create an updated version of the application. We have included docstrings and comments everywhere around our code.
- We will also claim copyright, specifically MIT License 2.0 in the GitHub repository, so no harm will be done to the University of Toronto's CSC110Y1 Fall's instructing team.

## 7 References

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