

${\bf 6CCS3PRJ}$ Data Visualisation for Migration Data

Final Project Report

Author: Yanpu Huang

Supervisor: Prof. Dr. Rita Borgo

Student ID: 1725298

April 21, 2020

Abstract

Human migration has formed the culture of each continent. In today's society, the formation of each country can not do without the keyword of immigration. The immigration data in London can show the total number of long-term and short-term immigrants in London, and the total number of immigrants in various regions of London. We can find out what other factors influence London and the UK by the trend of migration from these data, to find the connection between immigration and other thematic data. London Data Store is an official database website in London, which stores data statistics of various themes in London. The purpose of this project is to carry out data visualization processing for immigration data of London data store and some data of other topics and to provide a visualization website for users to do data analysis and interaction for the city of London.

Originality Avowal

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Yanpu Huang April 21, 2020

Acknowledgements

I would like to express my sincere thanks to my supervisor Professor. Dr. Rita Borgo. At the beginning of the project theme selection and project resources, she gave me a lot of help. And in the process of the project, she helped me to improve many points to think about, which helped me to expand my thinking. Thanks to Department of information staff and it services at King's College London. Thanks to the public data resources from the London Data Store official website.

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Introduction

1.1 Project Background

This project is about data visualisation from the London Data Store website. I download and extract data from this website, import it into my project, and visually process the data to get the display effect that I want. The goal of this project is to complete software to meet the needs of users for data analysis. Users can analyse the data in a more deeply way through visualisation and can interact with the software at the same time.

The theme I chose was immigration data in London and the UK. Immigration takes place in every country. As a developed country in the world, Britain has attracted numerous overseas immigrants. According to statistics, thousands of immigrants go into the UK every year, which has amounts of impact on the economy, employment, housing and other fields of the UK. Therefore, immigration is a field that can not be ignored for a country, and its importance is undeniable. So what do these immigrants want? Has their immigration had a good or bad impact on all areas of the UK? What factors affect migration? What factors do immigrants affect? These conclusions can be obtained through visual analysis of immigration-related data in the London Data Store.

When my tutor told me to go to the London Data Store website and search for a theme from this website to complete the visualisation project, I was attracted by the urban planning at the beginning. My idea at the start was to explore more potential areas of London by looking for housing, population, income and other data. However, in the process of looking for data, many datasets are not enough for me to complete this topic, so I began to search for other themes. In this process, I looked at the data of income, unemployment, employment and education. Finally, I found the complete data that I wanted to support the analysis in an immigration dataset called "Migration indicators". I was amazed by this, so I located the theme of my project and reported it to my tutor.

I chose to implement this project with Python and bokeh libraries and make it a web page. Because Python is easy to learn, it's straightforward for me to get started for novices. At the same time, Python's functions for web development are also potent. The reason I chose bokeh is that bokeh has powerful visualisation function. Its library has many visualisation options and widgets. The same thing is that it also has the characteristics of being easy to use. After comparing the evaluation of Plotly, Matplotlib and Seaborn on the Internet, I found that compared with bokeh, these visualisation development libraries are more complex. Although some of them can develop very complex visualisation projects, for my single-personal project, I don't need to use such complex and powerful functions. At the same time, bokeh is a data visualisation library for web development, which is just in line with my project objectives. So I finally chose Python and bokeh.

1.2 Project Aim

The goal of my project is to complete a data visualisation website that supports user analysis. In this website, users can browse many visual forms of immigration data, and there are other aspects of data such as unemployment rate, employment data to compare, they can get the conclusion of the desired research direction through analysis.

The site needs to include accurate charts to represent the data, including histogram, line chart, stack chart, multiple column chart and various line charts. They must correspond with the data on the datasets accurately so that users can analyse the real and practical data. At the same time, these visualisation charts must be complete so that users can observe the trend in a sufficient range of data. On the web page, enough parts to support the user's operation are also necessary. They will allow the user to choose the direction of observation

and analysis.

1.3 Report Structure

This report covers multiple contents, including introduction background, development process specifications requirements design implementation, legal, social, ethical and professional issues evaluation analysis conclusion reference appendix.

Each content has its own topics.

Background contains the context by motivating the subject matter and relating it to existing published work. The background will include a critical evaluation of the existing literature in the migration and data visualisation area. I will also introduce the where the data sets come from. Sections of Background are Migration and Population, Migration and Labours, Migration and Education Level, Short-Term Migration, Long-term Migration.

Working process contains the planning of my whole work. Includes my first impressions, time arrangement(it will show by Gannt Chart), working plan, and the final attempt.

Design & Specification are split by design and specification. The design part contains design inspiration, visualisation design, interaction design. The specification part contains visualisation sketch, interaction on adobe.

Requirement & implementation are split by requirement and implementation. Requirement contains user requirement, functional requirement, non-functional requirement. Implementation contains programming language, visualisation tool, work flow, requirement solutions, forepart version, final version.

Legal, social, ethical and professional issues include the four topics as the section title shows.

Evaluation analysis includes software testing, applied analysis of three topics, they are short-term migration, migration employment, reason for migration.

The conclusion and future work contains unsolved requirements, program review(if I start from beginning), learning from work, Challenge, future development.

Background

2.1 Migration and Population

Migrants for tens of thousands of years had been on the vanguard of the advancement of civilisations. The first era of globalisation in the second half of the nineteenth century was associated with the first mass voluntary movement of people, as millions of people migrated internationally in search of greater security and opportunity. The advent of steamships made long-distance travel more affordable, safer and quicker, facilitating voyage to the Americas, Southern Africa, and Australia. This 'age of mass migration' from around 1840 to the First World War in 1914, increased the working population of North America and Australia by at least a third, and Argentina by half, with the number of Europeans migrating rising from around 300,000 per year in the 1850s to over 3 million migrants per year in the early 20th century. The peak of the industrial revolution was the main period of British and German migration to North America, and between 1800 and 1860 two-thirds of the migrants to the U.S. were from Britain and 20 per cent from Germany, as displaced workers sought opportunity elsewhere. From 1860 to 1920 most of the 30 million immigrants to the U.S. came from Scandinavia, Ireland, Italy, Spain, and Eastern Europe. With many of the Irish and Eastern European migrants going first to Britain, the relative share of migrants in Britain and the United States was higher than today. (Lead author Professor Ian Goldin, Professor of Globalisation and Development at the University of Oxford" Migration and the Economy: Economic Realities, Social Impacts and

Political Choices"19).

The above historical information describes the impact of these immigrants on the population of different regions of the world. This graduation project opportunity allowed me to explore the migration datasets in London, from which I can analyse the relationship between population and migration population to realise the inspiration I got from this paper.

To realise this visual analysis, I downloaded the dataset of the population by borough 1939 to 2039.xlsx from the London data store. This dataset contains an excel workbook showing through population estimates and projects for the period 1939-2039 and a summary of population change in the capital. In 2015 London's population survived its previous peak of 8.6 million people, it was closely related to the immigration situation in London at that time.

2.2 Migration and Labours

World War Two led to the death of well over 50 million people in combat and concentration camps and the displacement of over 30 million people. As the European economy began to recover in the 1950s, it experienced a growing labour shortage and the demand for migrants and for displaced people to settle increased. (Lead author Professor Ian Goldin, Professor of Globalisation and Development at the University of Oxford Migration and the Economy: Economic Realities, Social Impacts and Political Choices 21).

As we can see from the reference, the author discussed about the labours market demand and the demand for migration. I began to think about what the migration alternation and the transformation of labor force brought to these two places if a group of people moved from one place to another

Therefore, I confirmed the relationship between migration and labours of a country are closely related, they also provide high volume for researching. As the population increases, the migration number is positive cross bonding to it, so the migration number will increase as well. As the migration number increases, the labours demand will increases as well. The internal reason that make this happened is worth for discussing.

So the above ideas inspired me, it could be work in a city as well, why don't I look for the connection between immigrants and labour force in London? Labour means the number of people working in the market, which also means the chances of people finding jobs are closely related to the situation of immigrants. Immigration may have a positive or negative impact on employment and unemployment in London. So I downloaded underemployment.xlsx from the London data store, which records the total employees/self employed (16+; part-time employees; part-time: could not find full-time job number; percentage underemployed from 2004 to 2018 in London and the UK. To a certain extent, it can give me enough data support to help me complete a visual chart of the underemployment rate and employment number.

	London					UK				
	Total employees/ self-employed (16+)	Part-time	Part-time: could not find full- time job		Total employees/ self-employed (16+)	Part-time	Part-time: could not find full- time job	Percentage underemployed		
Year	n	n	n	%	95% CI	n	n	n	%	95% CI
2004	3467600	714900	69400	2.0	0.2	21494400	5327700	428100	2.0	0.1
2005	3515700	718300	94600	2.7	0.3	21964200	5378200	478300	2.2	0.1
2006	3578400	712700	88100	2.5	0.3	28803100	7230700	634000	2.2	0.1
2007	3652200	758300	103100	2.8	0.3	29104500	7324000	679800	2.3	0.1
2008	3747800	777400	105500	2.8	0.3	29237500	7373600	728300	2.5	0.1
2009	3750400	827800	141100	3.8	0.3	28806900	7528600	981300	3.4	0.1
2010	3773700	864800	169000	4.5	0.4	28846500	7687700	1154400	4.0	0.1
2011	3852800	881800	198200	5.1	0.4	28985600	7779100	1269300	4.4	0.1
2012	3937900	908400	199800	5.1	0.4	29214000	7921200	1374300	4.7	0.1
2013	4041200	923000	223900	5.5	0.4	29614800	7977900	1428000	4.8	0.1
2014	4208900	956700	207900	4.9	0.4	30245800	8121300	1326400	4.4	0.1
2015	4,368,300	994,000	204,900	4.7	0.4	30,939,300	8,293,800	1,254,700	4.1	0.1
2016	4,506,000	1,017,800	209,200	4.6	0.4	31,264,400	8,293,300	1,148,600	3.7	0.1
2017	4,593,900	1,002,600	167,700	3.7	0.3	31,747,200	8,389,300	1,049,600	3.3	0.1
2018	4,587,700	9,175,500	153,700	3.4	0.3	31,975,500	63,950,900	942,100	2.9	0.1

Figure 2.1: Underemployment.xlsx

2.3 Migration and Education Level

The gap in labor market outcomes between migrants and natives is closely linked to education level. to be specific, the lower the education level, the more favorable the labor market outcomes of migrants in comparison to natives. (Lead author Professor Ian Goldin, Professor of Globalisation and Development at the University of Oxford"Migration and the Economy: Economic Realities, Social Impacts and Political Choices"71).

As what we mentioned in section 2.2, the labours market is highly related to the migration. Then we can get the point that the education level is related to the migration too. The discussion of immigration and education level can be beneficial to the development of social civilization level. For a country, the level of education may vary in different regions due to different immigration situations.

Therefore, the research of migration and education level is potential and beneficial for the whole society.

2.4 Short-Term Migration

that of economic migrants from poor nations to advanced market economy countries. Most economic analyses agree that economic migration" as distinct from refugee flows. ("The Management Of International Migration: Short-Term", author: Jeannette Money, 1998)

As far as I know, a large part of Chinese students' families have short-term migration. During the period of studying in the United Kingdom or the United States and other countries, they will apply for a student visa. When they have enough time to study abroad and meet the criteria for local residence qualification, they will choose to apply for a local residence permit to achieve the purpose of short-term immigration.

There are many purposes for short-term migration, such as work, residence and investment. Short term migration brings economic benefits and labour force to a city or even a country, and the group of overseas students is the talent transmission channel of a town or a country. At the same time, the living needs of short-term immigrants have also brought income increase to all walks of life of the country.

From British news reports, we can often hear stories of immigrants, a large part of which are short-term immigrants. This drove me to understand the current situation of short-term migration. I downloaded the data set of "short term migration.xlsx" from the London data store, which contains the number of short-term immigrants from 2008 to 2017 in various regions of London. These data can support my visual analysis on the time and area of short-term migration, and also enable users to understand the current situation of short-term migration in London.

2.5 Long-Term Migration

Long term migration refers to people who live in the country of immigration for a long time and enjoy similar benefits and obligations as the citizens of the country. Many of their aims are

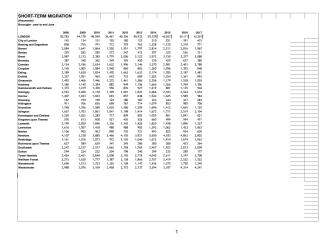


Figure 2.2: Short-term migration.xlsx

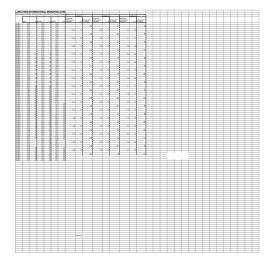
to be satisfied with the living environment of the country and want to live here for a long time. These people provide population input for the country or region, even marry and have children in the local area, bringing different cultures of their own country to a new country. Therefore, they bring not only economic benefits impact, resource impact, but also cultural impact.

Implementing the immigrant policy is a long process, so it required time to evaluate the effect of the policy. Two economists attempt a longer-term historical perspective in a new Centre for Economic Policy Research paper.

I believe that the research on long-term migration will give the government suggestions on the issue of long-term migration policy, and issue a reasonable and group benefits policy for the country or region. For the immigrant groups, they will see the immigration data of different years, observe the migration trend of a country, which makes the number of these immigrants change. They can also create their own decisions based on these studies. It will be a study that will benefit both the government and the migrants.

I downloaded the dataset Long term international migration.xlsx from London Data Store, it contains the data of long-term international migration from 2002-2018 to/from UK and London:

2.6 Reasons For Migration



1

Figure 2.3: Long-term international migration.xlsx

Figure 2.4: Reason for migration

Working Process

3.1 First Impression

When I received this project, my first impression was wondering what data visualisation was. My idea of the word data visualisation is that it often appears in advertisements on Web pages. I can't help but think of it, is it related to big data? What is visualisation? When the supervisor recommended my data visualisation books, and through my exploration of the keyword "data visualisation" in the network, and after enjoying many excellent visualisations works, I slowly understood the meaning of the word. Data visualisation is scientific and technological research on the visual representation of data. Among them, the visual representation of this data is defined as information extracted in some summary form, including various attributes and variables of corresponding information units. It is an evolving concept, and its boundaries are constantly expanding. It mainly refers to the more advanced technical methods, which allow the use of graphics, image processing, computer vision and user interface, through the expression, modelling and display of three-dimensional, surface, attribute and animation, to interpret the data visually. Compared with the specialised technical methods such as stereo modelling, data visualisation covers a lot of mechanical methods.

At the same time, this project is also significant for the exploration of London data store. I am very excited about the official database of London, an international metropolis. I

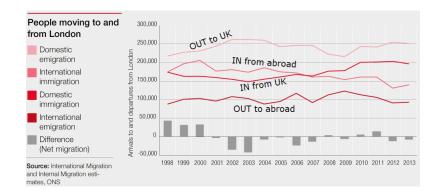


Figure 3.1: Online example of migration visualisation

began to think about what kind of achievement is valuable, what benefits it will bring to society and people, or what practical technical support it will bring to the government of London.

This project is my first step in data visualisation. It allows me to think about problems I never thought about and opens a new door for me.

3.2 Working Plan

After a meeting with the supervisor, she wanted us to use a Gantt chart to draw our plans. I divide my plan into learning-related coding, read the associated resource, analyse the dataset, visualise the datasets, develop a GUI, review the program, write the report, prepare for presentation.

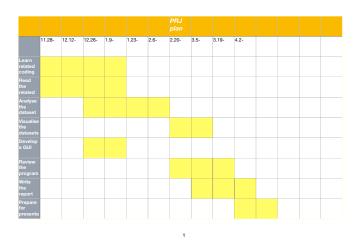


Figure 3.2: Gantt chart

3.3 Reality

In reality, my actual completion is much longer than the plan. But fortunately, I took a faster time to complete the Python code learning, which did not affect my progress. When the tutor asked us to write BSPR, I didn't have a particular direction and idea. My idea was still vague, so I submitted a BSPR that was not very clear at that time. However, later, I accelerated the efficiency of drawing my initial London immigration data visualisation project and revised it several times in the later stage. There were three versions, which used two methods to realise the project, and my final version also met my requirements in operability and aesthetics.

Design & Specification

4.1 Design

4.1.1 Design Inspiration

My design inspiration comes from the completed data visualisation project and data visualisation teaching website on the internet. Public projects on the internet always express beautiful and complete data. First of all, colour is a significant factor. Colour is the main impact on human's vision. It enables users to clearly distinguish the characteristics of different data when face to the visualisation charts. Second, choose the appropriate graph to represent different data. In the visual vocabulary website, the purpose of various charts is introduced in detail. Different types of chart within the category to form some initial ideas about what might work best. Third, it also needs careful design to put multiple data together for comparison. What kind of way they will produce accurate and beautiful visual effect combination, also can let users obtain data at the same time, and praise such design. In this book (Fundamentals of data visualisation, Claus O. Wilke), the author introduces many ways to combine data, such as visualising many distributions at once, multi-panel figures, etc., which can effectively compare data.

4.1.2 Visualisation Design

When I started designing visualisation charts, I found that I was just a beginner. In the beginning, I set myself the goal of simple line chart and histogram. A line chart can show the trend of time flow, data rising or falling. The histogram can explain the difference between different kinds of data. I intend to use these two kinds of images, even multiple histograms and multiple line chart. My choice of colour is bright and conspicuous so that users can distinguish data more clearly when browsing.

Short-Term Migration

When I designed the first dataset, short-term migration.xlsx, I chose the region as the x-axis variable and an annual number of immigrants as the y-axis variable. Therefore, the histogram will be the most appropriate representation chart. The histogram with different length and colour in each region will more clearly express the different total number of short-term immigrants in each district every year than the table of data. In the beginning, I had the idea of drawing a basic choropleth map. Still, the map could not sincerely show the specific value comparison of the number of immigrants in each region, so I gave up the idea and adopted the original Barchart design.

I also drew a multi-line chart to show the trend of short-term migration in each region as the year increased. In this multi-line chart, the x-axis becomes time. From 2008 to 2017, users will be able to observe the trend comparison of various regions.

Long-Term International Migration

The second dataset is long term international migration.xlsx. This dataset has the data of London input and London output, UK input and skout. They have different data every year, but the unit of the Y-axis is the same, so I decided to draw a multiple line chart to compare the four data. The four data will be used in different colours to achieve better contrast effect.

Employment And Underemployment

The third dataset is underemplacement.xlsx. This dataset has two data: the underemployment rate and total employees number. Because the two data units are different, I decided to draw two multiple line charts for them, and compare the unemployment rate in London and the UK, and the total employment in London and the UK.

Reason For Migration

The fourth data set is the LTIM reason.xlsx. This data set covers the causes of long-term international migration. We can find that each reason in this dataset contains three data: the UK in, the UK out and UK net. So we can draw three histograms for one reason, and group them into one group, thus forming multiple histograms. The x-axis will be the cause of each long-term international migration, and the y-axis will show the number of immigrants from each purpose.

4.1.3 Interaction Design

Interaction design is also essential for visualisation projects. It can increase the user's sense of experience and meet the user's various exploration purposes.

Interfaces Swich

In the design of the whole interface, I use three buttons to distinguish three topics of the panel. Each button corresponds to an interface layout. Click different buttons to display different interfaces. The first interface button is short-term migration(London areas). Click this button to view the histogram and multi-line chart of London's short term migration. The second interface button is migration vs employment(London UK). Click it to display the London short-term migration line chart, the London and UK long-term international migration input and output line chart, the London and UK employment line chart, and the London and UK unemployment rate line chart. The third interface button is the reason for migration(UK). Clicking this button will display the histogram of British immigration reasons.

Small Widgets

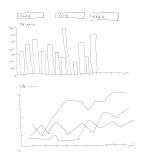
In terms of small widget design, I chose to select menu and checkboxes. In the widget design of the histogram of each region in the short term migration, I decide to use the select list. When the user clicks the menu, the years from 2008 to 2017 can be displayed. When he clicks one of the years, the histogram will jump to the corresponding year data. The user can choose the year he wants to browse for specific analysis. In the reason for migration icon, I also selected the select widget, which allows users to select different years to compare. On the short term migration multi-line map of each region, I choose to use the checkboxes widget, because, in this way, users can select multiple parts for comparative analysis, and selectively increase or decrease the number of regions they want to analyse.

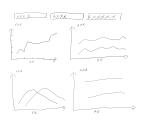
Passive Interaction

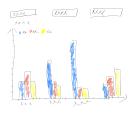
In the design of passive interaction, I added "hover", "panbox", "zoom", "save" and other functions. "Hover"'s function is that when the user's mouse moves to an absolute value of the chart, the chart will automatically display the corresponding accurate value next to the mouse. "Pan" function is to move the chart, and users can drag the chart to the desired position. The function of the "boxzoom" is to select and enlarge the chart. When the chart is chosen to the specified location, the chart in this part will be expanded and displayed. The function of "save" is that when the user clicks, the chart will be downloaded from the browser to the user's computer.

4.2 Specification

4.2.1 Visualisation Sketch







Requirement & Implementation

5.1 Requirement

5.1.1 User Requirements

- Users can analyse the migration data with other parts of data of London.(At least 5 topics)
- Users can select the immigration visualization theme they want to browse.
- Users can navigate the data of different years in the short term migration histogram.
- Users can select the immigration visualization theme they want to browse.
- Users can navigate the data of different years in the short term migration histogram.
- Users can browse different year data of multiple histograms of the reason for migration.
- Users can navigate the data from various regions in the short term migration line chart.
- Users can view the value of a point on the graph.
- Users can drag and drop graph.
- Users can enlarge the figure.
- Users can narrow the chart.

- Users can choose to expand the chart area.

- Users can save the chart.

- Users can reset the chart.

Functional Requirements 5.1.2

- The select menu of the short-term migration histogram can contain all the years 2008-

2017.

- The checkboxes of the short term migration multiline chart can include all regions of

London.

- The select menu of multiple histograms of the reason for migration can contain all years

2003-2019.

- All visualisation graphs will have the functions of selecting, zooming in, zooming out,

displaying values, dragging, undo, reset and saving pictures.

5.2 **Implementation**

As I plan to design this visualization project as a website, which requires a tool that can not

only complete the visualization requirements, but also construct the website. At the same

time, I need to determine a programming language I want to use to write this program. In this

section I will also show my workflow and achieved implementation of the requirement.

5.2.1 **Programming Language**

Python2.7

[kihikobokus-MacBook-Pro:dv calvinhuangk\$ python

Python 2.7.16 (default, Dec 3 2019, 02:03:47)
[GCC 4.2.1 Compatible Apple LLVM 9.0.0 (clang-900.0.31)] on darwin Type "help", "copyright", "credits" or "license" for more information.

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I started comparing Python, R, JavaScript, and then I chose Python as my programming language. In the process of machine learning at King's College London, the professor decided to use Python as our teaching programming language, so I have more experience in Python resource and syntax. At the same time, I compared the online comments on JavaScript, R and Python applied to visualization on the Internet. Python is the programming language that supports the most visual tool libraries, which enables users to make timely changes when selecting visualization tools, or to modify the design in the middle of the way. Not only that, but Python is also the easiest of the three for me, and its syntactic convenience stands out.

As we all know, Python is a cross-platform computer programming language. It is a high-level scripting language that combines interpretability, compilation, interactivity and object-oriented—originally designed to write automated scripts (shells), with the continuous update of versions and the addition of new language features, more and more are used for independent, large-scale project development. Because of the simplicity, readability and extensibility of Python language, it has been used by many users.

After I chose Python, I reported it to my project supervisor Rita. The use of Python is both unfamiliar and familiar to me because the use of Python visualization is still a new challenge to me. With the encouragement and advice from my tutor, I learned Python's syntax again and recorded all of Python's data import methods. Panda and openpyxl, which are commonly used by everyone, can read, write, extract unit data and self-made unit data. Import data is vital for my project because if we want to obtain all kinds of immigration data from the London data store; meanwhile, it is the first difficulty in importing and extracting its table data. At first, I thought about the method of import API from web pages. Still, later I found that there were only a few data providing API, some of which needed to be crawled by web crawlers, so I gave up the way of using JSON to enter the website API to extract data. I chose panda and openpyxl libraries, which can import and operate CSV files and xlsx files. They are speedy and convenient. Just download the form files provided on the website, and then import them into panda or openpyxl based on their format. The data extraction of the London Data Store has achieved the desired effect.

5.2.2 Visualisation Tool

bokeh1.4.0, Tornado 5.1.1

kihikobokus-MacBook-Pro:dv calvinhuangk\$ bokeh serve 2020-04-18 11:49:13,637 Starting Bokeh server version 2.0.1 (running on Tornado 6.0.4) 2020-04-18 11:49:13,641 Cannot start Bokeh server, port 5006 is already in use kihikobokus-MacBook-Pro:dv calvinhuangk\$ ■

On the way of looking for visualization tools, I searched many materials online, many articles and blogs recorded the users' evaluation and experience records after using these visualization tools. To a certain extent, this makes me very confused, because as a novice in visualization, I have never been exposed to visualization tools at all. I don't know which tool is the most suitable one for me. I need to choose a visualization tool that can be combined with Python and is ideal for me to learn and website develop.

I emailed Rita, my tutor, to recommend some proper visualization tools. In a meeting with her, she approved plot, bokeh, Seaborn. I went to the Internet and focused on these three kinds of software.

Plotly is a common and powerful open source data visualization framework. It can display information by building interactive charts in the form of web-based on browser display and can create dozens of exquisite charts and maps.

Bokeh is a visualization tool developed for browsers. Like Matplotlib, bokeh has a series of API interfaces. For example, glyphs interface, which is very similar to the artists' interface in Matplotlib, is mainly used to draw ring graph, square graph and polygon diagram. Recently, bokeh has opened a new graphic interface, which is used primarily for process dictionary data or data frame data, and to draw can map.

Seaborn is a more advanced API encapsulation based on Matplotlib, which makes drawing easier. In most cases, using Seaborn can make beautiful drawings, while using Matplotlib can make drawings with more characteristics. Seaborn should be seen as a complement to Matplotlib, not a substitute. At the same time, it can be highly compatible with NumPy and pandas data structures and statistical models such as SciPy and statsmodels.

For me, bokeh is an interactive visual class library based on Python language displayed

in new browsers. Bokeh provides a fast and straightforward high-performance interactive, elegant and concise chart making based on big data and streaming data. These characteristics are just in line with my original intention. I am a personal project, which does not need too many intricate functions. At the same time, bokeh can display the project directly in the browser, which can achieve the purpose that I want to complete the data visualization web page display. Bokeh's data-based function is convenient and beautiful, which is my favourite display effect, so I chose it for decisively. Plotly used to be my first choice, but because of the related guides online are not that much as bokeh, so I gave up Plotly. And seaborn has a comprehensive list of its functions, but to develop web application, I don't need too many complicated functions. So in the end, bokeh wins.

5.2.3 Workflow

Import Data

When I started programming, importing data became my first job. I decided to draw a simple line graph from the data set of long-term international migration.xlsx, so I set up a function named "plotLongTermMigration()". I import data through the openpyxl library and use the function of openpyxl, loadWordbook function. When the data is imported successfully, I will form different lists with the cells I need in the table, so that the abscissa and ordinate data of the line chart can be obtained. Later, I used openpyxl for short-term migration.xlsx, LTIM reason.xlsx, underemplacement.xlsx to import and collect data successfully.

```
def plot_long_term_migration():
    wb = openpyxl.load_workbook('data/Long term international migration.xlsx') # Import datasets
    ws = wb['Data']
```

Figure 5.1: Pieces of data inport codes

Build Charts

In the process of drawing, bokeh's simple grammar helped me a lot. First, I create a figure of the desired size, in which many attributes can be set, such as Y-axis label, tools bar, Y-axis and X-axis length, etc. Then I use the existing chart generation functions of bokeh, such as line (), vbar (), to generate various visualisation charts. I used histogram and multi-line chart

in the theme of short-term immigration, and I used line chart, multi-line chart and dot chart in the topic of immigration and employment. I used multi histogram in the theme of immigration reasons. In the function of creating a graph, the setting up of each attribute is critical, such as colour, label, X-axis, Y-axis, and even a significant feature of bokeh: columndatasource, which can directly arrange the data into a column list form, so that the data can instantly generate the corresponding chart. The display between the chart and chart also needs the layout function to arrange. Row(), column(), layout(), gridplot(), these methods can arrange the chart to form an orderly arrangement in the web page for users to browse.

Figure 5.2: Pieces of figure plotting code

Set Widgets

In the process of widget design, I used the select menu, dropdown menu and checkboxes. These three parts are respectively built in the function of plot charts, and then a callback (update) method is created in the function of setting up the image, to achieve the effect of the callback of widgets button function. Among them, in the bar charts of short term migration, I used the select menu, which will cover all the years of 2008-2017. Each time I click one of the years, I can call up the data of the selected year and show it in the chart. I choose to use checkboxes in the polyline chart of short term migration, and I use js code callback in its callback function, which refers to JavaScript code. In the image of the reason for migration, I choose to use the dropdown menu and then use the callback of the transformation data.

In the process of implementing the page switch button, I set up three buttons, which are connected by the onclick method and callback method, respectively. In the callback method, the visible method is used to display different layouts.

```
select = Select(title="choose year", value=year_list[0], options=year_list)

def callback_select(attr, old, new):
    year = select.value
    counts_list = []
    display_data_dict = year2data[year]
    for areas in areas_list:
        counts_list.append(display_data_dict[areas])

    p_vbar.data_source.data['counts_list'] = counts_list

select.on_change('value', callback_select)
select.width = 100

return p_year, select
```

Figure 5.3: Pieces of widgets setting codes

5.2.4 Small Interaction

I used hover, pan, boxzoom, save, reset, undo, zoom in, zoom out, wheelzoom and other methods in the tools module to set them in the attribute of chart during the plot chart. The tools contain passive and active interaction.

```
tools="hover,pan,box_zoom,save,reset,undo,zoom_in,zoom_out,wheel_zoom"
```

Figure 5.4: Pieces of interaction-tool implementation codes

5.2.5 Forepart Version

In earlier versions, I didn't know about how to implement interaction, so I could only sort and combine multiple images in layout to form an interface.

We can find that the limitations and visual clutter of this website have brought a lot of troubles to user analysis. Without the guidance of a small topic, users will not know where to start when facing the visualisation of many different data. At the same time, the lack of interaction design leads to the loss of many experiences for users of this version of the website. In Figure 5.5, in the short term migration column chart, we can see the checkboxes of the interactive selection at that time, which enables us to select multiple column charts. But the overlapping of histogram blocks a lot of data that should have been seen by users, so the design of checkboxes is meaningless, which will affect the user's independent analysis of data. Therefore, in the later version, I cancelled the plan and changed it to select menu.

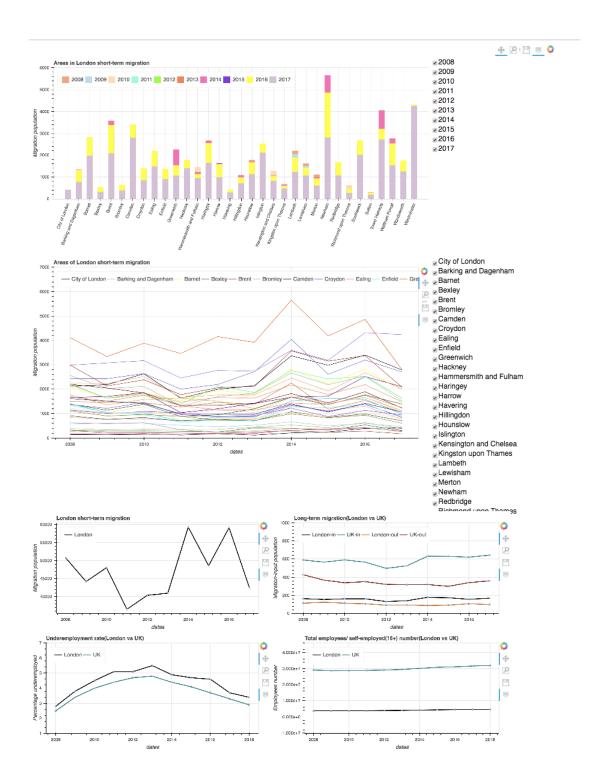


Figure 5.5: Earlier version

5.2.6 Final Version

In the final version, I achieved the interaction design of the web interfacethe web could be ran on the bokeh serve.

We can see that there are three main buttons to switch the interface, to enable users to browse immigration data of different topics. At the same time, in Figure 5.6, checkboxes were changed to select menu design. Compared with the previous version, I also added the data visualization chart of the theme reason for migration.

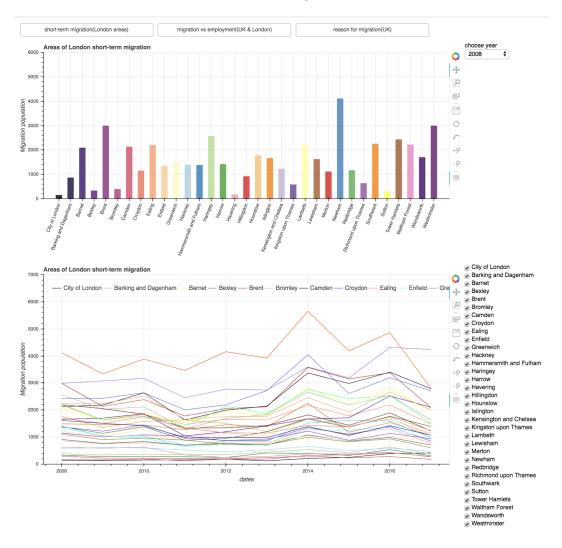


Figure 5.6: First interface

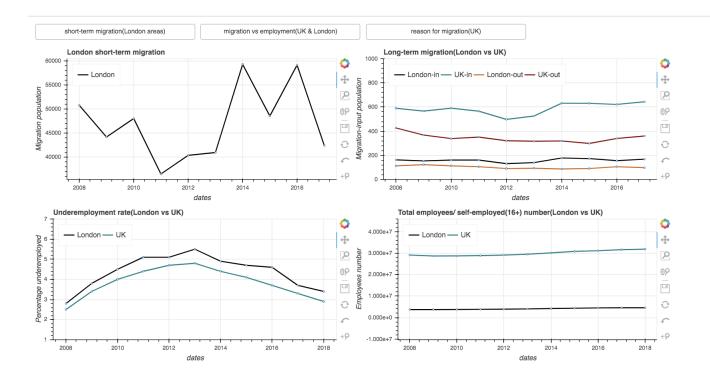


Figure 5.7: Second interface

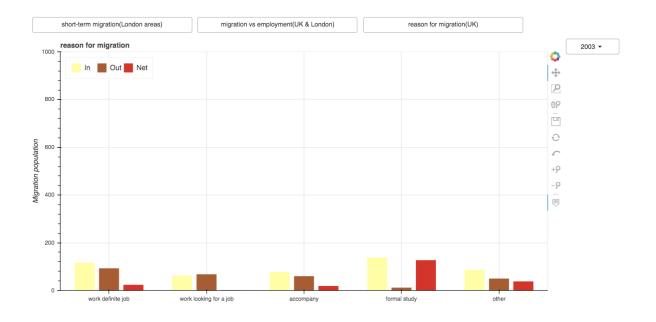


Figure 5.8: Third interface

Legal, Social, Ethical and

Professional Issues

The project is mainly based on data visualization and analysis, involving the real immigration data of the UK and London of the London data store, and the results do not represent any political position of the project author.

During design and implementation of the project, great concern has been shown to abide by the Code of Conduct Code of Good Practice which is issued by the British Computer Society (BCS). With any project, code of conduct should be abided by because if not can have serious legal and ethical implications. Rules also help protect work an intellectual property from being used unlawfully. Using material without authorisation of the owner is regarded unethical. Great care has been taken in this project to make sure any Open-Source code or libraries used are explicitly stated. This project consists of: my own work; Open-Source libraries on the internet.

The software consists of my own work unless explicitly stated so.

Results/Evaluation

7.1 Software Testing

I let a few friends experience my web and evaluate it. In terms of interaction, most of the evaluations given are smooth and straightforward, and the communication of the site is also direct and clear. In terms of browsing visual data, the data visualisation of immigrants accounts for the majority, and the data analysis of immigrants may take the most percentage. The raters can read the accurate trend of immigration data. Still, they also admit that there are too few other data to compare with immigration data, only the number of employees, unemployment rate and immigration reasons. This is a common shortcoming after evaluation. There are too few comparative analysis charts for this project, most of which can only analyse the time trend of immigrants; comparative analysis between regions; comparative analysis between long-term and short-term immigrants, etc.

At the same time, I also encountered a problem that hasn't been solved when I was coding, that is, when I was in plotline chart of short term migration, there were too many legends corresponding to the broken lines of this chart so that I couldn't see all the legends in a plot. I hope that in the future, we can try to create a new blank plot next to the line graph, and input the legend into the blank plot so that we can all represent it.

7.2 Applied Analysis

7.2.1 Short-Term Migration(London Areas)

Bar Chart

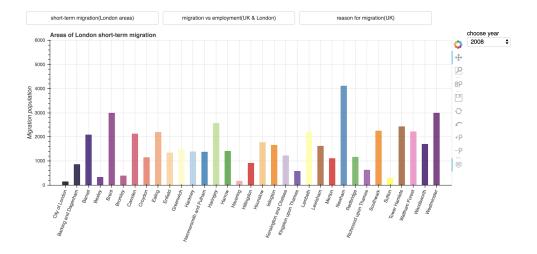


Figure 7.1: short term migration bar chart(London areas)

In Figure 7.1, we can take the region as the comparison unit and make a comparative analysis from the top value of the histogram. We can see that except in 2017 (the most significant number of short-term immigrants in 2017 is Westminster, reaching more than 4000), the region with the most significant amount of short-term immigrants is Newham. The total value of short-term immigrants in Newham in 2014 reached more than 5000, which is the only region with more than 5000 from 2008-2017 in all areas. The lowest number of short-term immigrants in 2008-2017 was the City of London, Havering and Sutton.

We can see that there is a significant gap in the number of immigrants between different regions of London, and the number of immigrants is not even among different areas. 2009 is the year in which the number of immigrants from different regions is most averagely distributed to each other.

Line Chart

In the line chart, we can observe the trend of the number of short-term immigrants in different regions of London with a float of years. In the Figure 7.2, we can see that before 2014, the

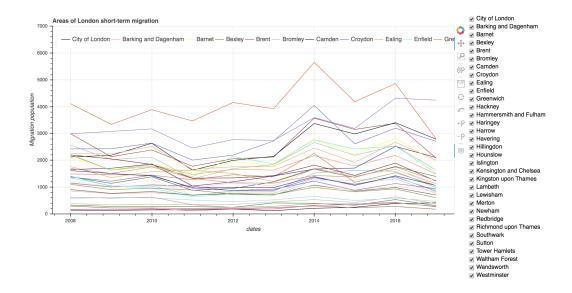


Figure 7.2: short term migration linec chart(London areas)

number of short-term immigrants in the various areas was in a general trend of growth, accompanied by small sections increase or decrease. The general trend in the short-term migration in 2014-2017 is a gradual decline.

City of London, Bexley, Bromley, Havering and Sutton are in a relatively gentle trend. In the graph, they approximately parallel to X-axis, indicating that the short-term immigrants in these areas are not popular and could be regarded as the areas with more indigenous people. However, in areas with a large number of short-term immigrants, the fluctuation is relatively large, such as Newham, Westminster and Brent. Harrow, Haringey and other regions are located in the middle height area of the line chart, which belongs to the trend of slight fluctuation. By 2017, the area with the most significant increase in the immigration area is Westminster. In 2017, the number of short-term immigrants in Westminster reached the highest in all regions, more than one thousand short-term immigrants units ahead of the second region Newham.

7.2.2 Migration & Employment

At this panel we have 4 charts, includes long term migration of UK and London, Short-term migration of London. they are build here for compare with the other two charts which are total employee number and the underemployment rate of London and UK.

Employee Number

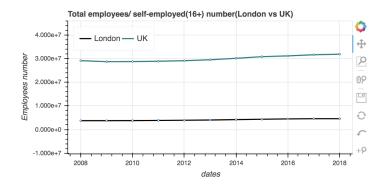


Figure 7.3: Total employees/self-employed(16+) number(London vs UK, 2008-2017)

In Figure 7.3, we can analyse that the total employee number in London and the UK is an increasing trend from 2008-2017, which is relatively gentle, and the trend is close to the parallel line. The UK employment curve has a higher slope and slightly steeper than London's.

Underemployment Rate

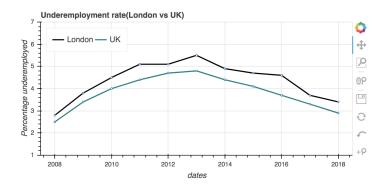


Figure 7.4: Underemployment rate (London vs UK, 2008-2017)

In Figure 7.4, we can analyse that the underemployment rate in London and the UK is increasing first and then decreasing from 2008-2017. And unexpectedly, the underemployment rate in London is more significant than that in the UK, because the London line chart is at the top of the UK line chart.

The underemployment rate peaked in London and the UK in 2013. In 2008, the underemployment rate in London and the UK was the lowest, and the gap between them was the smallest. The underemployment rate in London and the UK had the most significant difference in 2016.

Migration & Employment Comparing

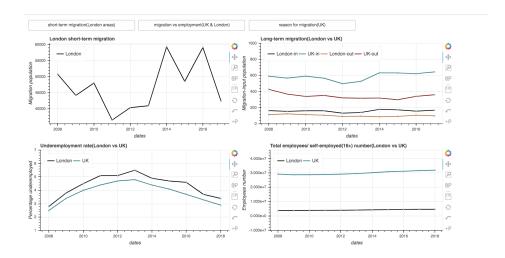


Figure 7.5: Second Interface

In Figure 7.5, we can compare and try to find the connection between employment and migration, including long-term international migration and short-term migration.

We can find that in the long run, the comparison between the long-term international immigration input curve and employment number curve is positively correlated. Whether UK or London, the final value they reach is higher than the starting value (although the international immigration input curve had a slight depression in 2012-2013, it does not affect the last growth trend). The employment number curve in London is as flat as the long-term international immigration input curve in London, and the slope is not as high as the employment curve and long-term international immigration input curve in Britain.

There are differences in the output curve. When the international migration output curve is relative to the employment number curve, the UK one shows a negative correlation, while London one indicates a positive relationship. Although there is a positive correlation between the employment number in London and the output of international migration, its slope is not as big as the input curve of international migration. So we can conclude that employment in the UK and London is positively correlated with long-term international migration net number(net = input - out).

Now watch the underemployment chart. We have analysed this curve before as a trend of growth firstly then followed by a decrease. The peak of growth is 2013, which is the same time as the curve of long-term international migration input depression in 2012-2013. At the same

time, in the comparison between the underemployment rate curve and the short-term migration curve, we can find that the bottom of the short-term migration curve is just 2011-2013, which also matches the peak of the unemployment rate curve. We can boldly conclude that perhaps the increase in the unemployment rate is related to the decrease in immigrants' input, and there may be many factors among them. My analysis is that the decline of immigrants' input may lead to a reduction of local job opportunities, but it needs to be discussed, which is not a confirmed conclusion.

7.2.3 Reason For Migration

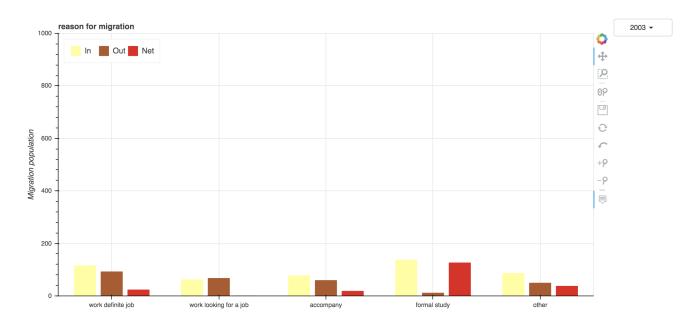


Figure 7.6: Migration Reason 2003

In Figure 7.6, we can see the multiple histograms of immigration reasons, which shows the number of reasons for immigration input, immigration output and net increase (decrease) of immigration in the UK.

When I browse the data of each year, I find that the immigration output of "work looking for a job" module is the only one who has more immigration output than the input. "Formal study" is the module in which the input of immigrants is much higher than the output, has the greatest positive net number. We can conclude that the reason for the most substantial proportion of the UK's immigration output is to leave the UK to find jobs. In contrast, the most significant percentage of immigration input is the international students who come to

study in the UK.

When browsing different years, it can be found that before 2010, Britain's immigration input and output were basically no more than 200. However, after 2010, there has been a qualitative leap in the import and export of immigrants. We can see in the Figure 7.7, in 2010 the reasons for the migration input had generally reached more than 200, especially the import of international students, which has reached more than 900 and has lasted until 2011. It's astounding. After 2011, global student input has never reached more than 900. We can conclude that, combined with the previous long-term migration chart and short-term migration chart, 2010 is indeed a wave of international immigration into the UK.

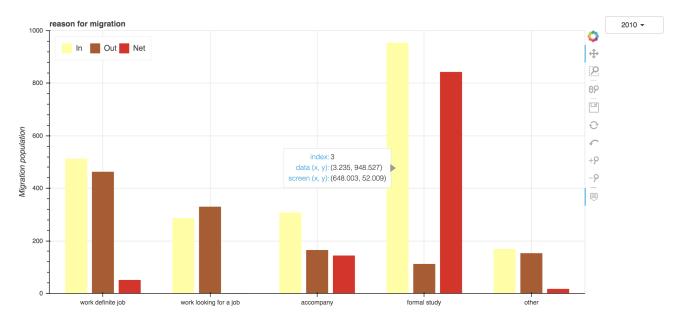


Figure 7.7: Migration Reason 2010

Chapter 8

Conclusion and Future Work

8.1 Unsolved Requirements

- Users can analyse the migration data with other parts of data of London.(At least 5 topics)

I didn't implement this user requirement. Because I was not familiar with the interaction design during the design process, so I spent too much time in the interaction design. Resulting in no time to import data of other topics to compare with the immigration data, so I didn't complete the user requirements of "at least five topics and immigration data comparative analysis".

8.2 Program Review/If I start from beginning

Looking back at the process of doing this project, I found it essential to find a clear goal at the beginning. Maybe it's because we didn't decide which topics could be discussed and contributed to society at the beginning, which led to wasting a lot of time to make meaningless choices. In the design process, the typesetting of which chart to analyse is very vague, so the software will not have guidance.

When I chose the theme of immigration, my research on this theme is not enough. What are the elements of the migration theme that need to be analysed? I haven't carefully read many essays about the migration topic. Their research will be beneficial for me to determine which direction to design the project.

If I do this project again, I will spend more time thinking about the theme selection, whether this theme contributes to society, whether it has enough value to analyse, and whether it is the theme that users want to study. And after topic selection, I will look for research papers on this topic, make an assessment of their research direction, and work out a meaningful research direction that I can do, which may cause the project more targeted, and enrich the background information of the project, and enable users to get correct conclusions in the desired field.

In terms of time management, I will also reexamine myself. I planned my future working time on the Gantt chart. Still, in reality, I didn't make the same arrangement as expected, which resulted in a considerable reduction in the time I spent writing reports and reading documents. Therefore, if I redo this project, I hope I can do it according to the planned time, and leave more time for reading background literature and writing report.

And for the tools part, I feel like I can use more tools and combine them together. For example, I can use flask to generate a web and combine with plenty of visualisation tools, bokeh is just one of them. More tools to combine together might form a better project.

For the plotting part, the default plot of short-term migration line chart is too complicated, too many lines appear on the figure. It actually affects the ornamental and makes users confused.

8.3 Learn from work

I learned a lot of new experience from this project. Python can refer to many resource packages in the application, and the simplicity of the language makes it easy for novices to get started. For example, combining openpyxl, panda, NumPy and bokeh will be enough to achieve many goals in data analysis. In the future, I hope to expand more possibilities in Python to develop new things.

Bokeh is a beautiful and straightforward visualisation software. I have learned many

basic attribute requirements of visualisation drawing. The charts in other tools will require the features of the same attribute to plot a figure as well.

This project also extends my Thinking on data matrix arrangement, how to integrate data to draw dynamic and renewable interactive charts. In the import and extraction of data stage, "for loop" is very helpful to extract row and column data. It is an excellent method to add data to a list by using the cell function of openpyxl. Bokeh's ColumnDataSource function gives me a lot of thinking space. It forms the arrangement of data and provides convenience for data transformation and update in the future.

In the interaction design, the callback function of bokeh has a lot of possibilities. The CustomJS method makes JavaScript code have significant advantages in the use of bokeh. The combination of JavaScript and Python makes the processes of interaction design more flexible. Through my interpretation of the source code of the open-source project on the official bokeh website, I learned more about the various writing methods of the interactive update method. Each coder's understanding of the project, structural layout and writing method are different, so the final update method is also different. Most of their coding functions are entirely different from mine, which is also the place where I need to learn to change. They will not take one graph after another Return. Instead, they wrote a method to generate datasets and plot. This provides more possibilities for future interaction methods. I don't need too many figures for the scheme and save more code space. This makes me have a deeper understanding and Thinking of logic, writing methods, and project code layout.

I learned the importance of data analysis in the study of migration. The knowledge in statistics will be applied to the analysis of charts. These contents will not be a simple positive correlation, negative correlation and slope. Maybe a simple chart, students who have studied statistics and data science will gain more information.

Finally, I learned that data visualisation is not just a simple "plot figure". Behind the plot figure, it covers the philosophy of whether you can grasp the critical point. This key point can be what you need to understand when facing a pile of background data of the same subject. It requires you to have a deep understanding of the issue, and be ready for the research in this direction in the early stage. Therefore, when reading datasets, you should take notes, be prepared to visualise which data you want, whether they are worth plotting out by you, and whether they are worth analysing this chart by users. Therefore, the ability to grab core data

in a pile of data is crucial.

On the other hand, whether these data are suitable for display and how they will be displayed are the best, which is also the place that data visualisation chemical authors need to think deeply. There are many kinds of charts, and more robust data visualisation experts can make a variety of beautiful charts combining different charts. I also genuinely feel the research on the characteristics of various charts from this project. What visual impact they bring to users, and what aspects users will pay attention to first, is an essential knowledge I have to learn.

8.4 Future Development/Challenges

There are many possibilities for the future extension of the project because the theme of migration is closely related to many factors.

I can add another six interfaces, which are about income, house price/rent, education level, crime rate, the support rate for Brexit and the relationship between COVID-19 and migration situation or international travelling situation. These factors will be the focus of people' attention.

In the design of plot figure, I will expand more ideas. For example, in the small theme of short term migration of London areas, I can make a stacked vertical bar chart, to have a more considerable improvement in both viewing and research. The application of the map is also feasible. We can use spatial data visualization to show the situation of immigrants in various regions. The colour of areas with more immigrants will be darker, and vice versa.

I will also add more widgets to the design in the future, such as sliders, to observe the time changes of the immigration chart.

Appendix A

Appendix

A.1 Definition

- "The UK" stands for the United Kingdom.
- Due to the emergence of new types of short-term migration different from tourism in the international migration mode, the United Nations defines another type of migration, namely short-term migration, as "people who have moved to a non resident country for at least three months and less than 12 months, except those who go to the country for entertainment, vacation, visit relatives and friends, business, medical treatment or religious worship purposes."
- "Long-term international migration" refers to "people who have moved to a non resident country for at least one year, so that the destination country actually becomes its new resident country

A.2 Reading Resources/Data sets resources

The following are the documents I read when I wrote the project, and I also used some of them when I wrote the report.

References

- [1] Foundation of Data Visualization. [Online]. https://serialmentor.com/dataviz/introduction.htmlugly-bad-and-wrong-figures
- [2] What is visualization really for?.[Online]. https://arxiv.org/abs/1305.5670
- [3] Visual Thinking for Design. (Colin Ware).
- [4] Information Visualization: Perception for Design. (Colin Ware).
- [5] Schneiderman's Mantra. [Online]. Feburuary 26, 2016 / HAMPDATAVISUALIZATION. https://hampdatavisualization.wordpress.com/2016/02/26/schneidermans-mantra/
- [6] City Intelligence Data Design Guidelines. [Online]. June 18th, 2019. (Mike Brondbjerg). https://data.london.gov.uk/blog/city-intelligence-data-design-guidelines/
- [7] Visual Vocabulary.[Online]. Inspired by the Graphic Continuum by Jon Schwabish and Severino Ribecca. https://ft-interactive.github.io/visual-vocabulary/
- [8] MIgraiotn indicators.[Online]. Greater London Authority(GLA). https://data.london.gov.uk/dataset/migration-indicators
- [9] Underemployment.[Online] Office for National Statistics (ONS). https://data.london.gov.uk/dataset/underemployment
- [10] Migration and the Economy: Economic Realities, Social Impacts and Political Choices. [Online]. Lead author: Professor Ian Goldin, Professor of Globalisation and Development at the University of OxfordMigration and the Economy: Economic Realities, Social Impacts and Political Choices
- [11] The Management Of International Migration: Short-Term". [Online]. Author: Jeannette Money, 1998

Appendix B

User Guide

B.1 Instructions

- 1. Install python 2.7
- 2. Install bokeh(set the path to python 2.7 site-packages)
- 3. Install pandas(set the path to python 2.7 site-packages)
- 4. Install numpy(set the path to python 2.7 site-packages)
- 5. Install openpyxl(set the path to python 2.7 site-packages)
- 6. Open terminal, run: python -m bokeh serve —show web.py, wait for the respond from browser

Appendix C

Source Code

C.1 Source Code

Listing C.1: $ug_f y p_r eport_t emplates - master/FrontMatter/web.py$

```
, , ,
 1
    Instruction: 6CCS3PRJ
 2
                Data Visualisation of Migration Data
 3
 4
    Code Author: Yanpu Huang,
 5
 6
                1725298,
 7
                K1763861,
                Kings College London,
 8
                Computer Science,
                3rd year student
10
11
    supervisor: Prof.Dr.Rita Borgo
13
```

```
14
    User guide: Install python 2.7
15
                Install bokeh(set the path to python 2.7 site-packages)
16
                Install pandas(set the path to python 2.7 site-packages)
                Install numpy(set the path to python 2.7 site-packages)
17
                Install openpyxl(set the path to python 2.7 site-packages)
18
19
                open terminal, run: python -m bokeh serve --show web.py, wait for
                    the respond from browser
    , , ,
20
21
22
    import openpyxl
23
    import numpy as np
24
    import pandas as pd
25
   from bokeh import events
26
   from bokeh.plotting import figure, curdoc, output_file, show
27
    from bokeh.models import ColumnDataSource, HoverTool, CustomJS
   from bokeh.layouts import row, column, gridplot, widgetbox, layout
28
   from bokeh.models.widgets import Button, RadioButtonGroup, Select, Slider,
29
       Dropdown, Toggle, Tabs, Panel, CheckboxGroup
30
   from bokeh.transform import linear_cmap, factor_cmap, dodge
31
   from bokeh.io import export_png
32
   import warnings
33
   from bokeh.core.properties import value
34
35
   output_file("LondonDataStoreDataVisualisation.html",title="Migration Data
       Visualisation") #output file
36
   # Make line chart of long term migration(London vs UK) by years
37
```

```
38
   def plot_long_term_migration():
       wb = openpyxl.load_workbook('data/Long term international migration.xlsx')
39
             # Import datasets
40
       ws = wb['Data']
41
42
       x=[]
43
       y1=[]
       y2=[]
44
45
       y3=[]
       y4=[]
46
47
       for row in range(32,72,4):
            x.append(ws.cell(row = row,column = 1).value[:4]) # append dates by
48
               years
            y1.append(ws.cell(row = row,column = 8).value) # append number of
49
               people migrated into London
50
            y2.append(ws.cell(row = row, column = 2).value) # append numebr of
               people migrated into UK
51
            y3.append(ws.cell(row = row, column = 11).value) # append numebr of
               people migrated out London
           y4.append(ws.cell(row = row, column = 4).value) # append numebr of
52
               people migrated out UK
53
54
       #print(x)
55
        #print(y1)
56
       #print(y2)
57
        #print(y3)
        #print(y4)
58
```

```
59
60
        source1 = ColumnDataSource(data = dict(dates = x, values = y1))
61
       source2 = ColumnDataSource(data = dict(dates = x, values = y2))
       source3 = ColumnDataSource(data = dict(dates = x, values = y3))
62
       source4 = ColumnDataSource(data = dict(dates = x, values = y4))
63
64
65
       p = figure(plot_width = 600, plot_height = 300,x_axis_label = "dates",
66
           y_range = (0,1000),
67
                y_axis_label = "Migration-input population", tools = "hover, pan,
                   box_zoom,save,reset,undo,zoom_in,zoom_out,wheel_zoom",title="
                   Long-term migration(London vs UK)") # Create a new figure
68
       p.line(x = "dates", y = "values", line_width = 2, source = source1, color
69
           = "black", legend = "London-in") # draw a line chart
70
       p.line(x = "dates", y = "values", line_width = 2, source = source2, color
           = "teal", legend = "UK-in") # draw a line chart
71
       p.line(x = "dates", y = "values", line_width = 2, source = source3, color
           = "chocolate", legend = "London-out") # draw a line chart
72
       p.line(x = "dates", y = "values", line width = 2, source = source4, color
           = "darkred", legend = "UK-out") # draw a line chart
73
       p.legend.location = "top_left"
74
       p.legend.orientation = "horizontal"
75
       p.circle(x = "dates", y = "values", fill_color = 'white',size = 3,source =
            source1) # point of line chart
76
       p.circle(x = "dates", y = "values", fill_color = 'white',size = 3,source =
            source2) # point of line chart
```

```
p.circle(x = "dates", y = "values", fill_color = 'white',size = 3,source =
77
             source3) # point of line chart
        p.circle(x = "dates", y = "values", fill_color = 'white',size = 3,source =
78
             source4) # point of line chart
79
80
        return p
81
82
83
    # Make line chart of employment (London vs UK) by years
84
    def plot_employment_population():
        wb = openpyxl.load_workbook('data/underemployment.xlsx') # Import datasets
85
86
        ws = wb.get_sheet_by_name('Data')
87
88
        x = []
89
        y1 = []
        y2 = []
90
91
        for row in range(8,19):
92
            x.append(ws.cell(row = row,column = 1).value)
93
            y1.append(ws.cell(row = row,column = 2).value)
94
            y2.append(ws.cell(row = row,column = 7).value)
95
96
        #print(x)
97
        #print(y1)
        #print(y2)
98
99
        source1 = ColumnDataSource(data = dict(dates = x, values = y1))
100
101
        source2 = ColumnDataSource(data = dict(dates = x, values = y2))
```

```
102
        p = figure(plot width = 600, plot height = 300, x axis label = "dates",
103
104
                     y_axis_label = "Employees number", tools = "hover,pan,box_zoom
                         ,save,reset,undo,zoom_in,zoom_out,wheel_zoom", title="
                         Total employees/ self-employed(16+) number(London vs UK)")
                          # Create a new figure
105
106
107
        p.line(x = "dates", y = "values", line_width = 2, source = source1, color =
              "black",legend = "London") # draw a line chart
        p.line(x = "dates", y = "values", line_width = 2,source = source2, color =
108
              "teal", legend = "UK") # draw a line chart
        p.circle(x = "dates", y = "values", fill_color = 'white',size = 3,source =
109
              source1) # draw point of line chart
110
        p.circle(x = "dates", y = "values", fill_color = 'white', size = 3, source =
              source2) # draw point of line chart
111
        p.legend.location = "top_left"
112
113
        p.legend.orientation = "horizontal"
114
        p.y_range.range_padding = 1
115
116
        return p
117
     # Make line chart of underemployment rate(London vs UK) by years
118
119
    def plot_underemployment_rate():
        wb = openpyxl.load_workbook('data/underemployment.xlsx') # Import datasets
120
        ws = wb.get_sheet_by_name('Data')
121
```

```
122
         x = []
123
124
         y1 = []
125
         y2 = []
126
         for row in range(8,19):
127
             x.append(ws.cell(row = row,column = 1).value)
             y1.append(ws.cell(row = row,column = 5).value)
128
129
             y2.append(ws.cell(row = row,column = 10).value)
130
131
         #print(x)
132
         #print(y1)
133
         #print(y2)
134
135
         source1 = ColumnDataSource(data = dict(dates = x, values = y1))
         source2 = ColumnDataSource(data = dict(dates = x, values = y2))
136
137
         p = figure(plot_width = 600, plot_height = 300, x_axis_label = "dates",
138
                     y_axis_label = "Percentage underemployed", tools = "hover,pan,
139
                         box zoom, save, reset, undo, zoom in, zoom out, wheel zoom",
                         title="Underemployment rate(London vs UK)") #Create a new
                         figure
140
141
         p.line(x = "dates", y = "values", line_width = 2, source = source1, color
142
             = "black", legend = "London") #draw a line chart
         p.line(x = "dates", y = "values", line_width = 2, source = source2, color =
143
              "teal", legend = "UK") #draw a line chart
```

```
144
        p.circle(x = "dates", y = "values", fill_color = 'white',size = 3,source =
            source1) #point of line chart
        p.circle(x = "dates", y = "values", fill_color = 'white',size = 3,source =
145
            source2) #point of line chart
146
147
        p.legend.location = "top_left"
        p.legend.orientation = "horizontal"
148
149
        p.y_range.range_padding = 1
150
151
        return p
152
153
    # Make line chart fo short-term migration(London areas) by years
154
    def plot_linechart_areas_short_term_migration():
155
        wb = openpyxl.load_workbook('data/Short term migration.xlsx') # Import
           datasets
156
        ws = wb.get_sheet_by_name('Data')
157
        x = []
        areas = []
158
159
        y1,y2,y3,y4,y5,y6,y7,y8,y9,y10,y11,y12,y13,y14,y15,y16,y17,y18,y19,y20,y21
            ,y22,y23,y24,y25,y26,y27,y28,y29,y30,y31,y32,y33,y34 =
            160
        #Rearrange data
        for column in range (2,12):
161
162
            areas.append(ws.cell(row = row,column = 1).value)
163
           x.append(ws.cell(row = 5,column = column).value)
164
           y1.append(ws.cell(row = 6,column = column).value)
```

```
165
             y2.append(ws.cell(row = 7,column = column).value)
166
             y3.append(ws.cell(row = 8,column = column).value)
167
             v4.append(ws.cell(row = 9,column = column).value)
             y5.append(ws.cell(row = 10,column = column).value)
168
             y6.append(ws.cell(row = 11,column = column).value)
169
             y7.append(ws.cell(row = 12,column = column).value)
170
171
             y8.append(ws.cell(row = 13,column = column).value)
172
             y9.append(ws.cell(row = 14,column = column).value)
173
             y10.append(ws.cell(row = 15,column = column).value)
             y11.append(ws.cell(row = 16,column = column).value)
174
175
             y12.append(ws.cell(row = 17,column = column).value)
176
             y13.append(ws.cell(row = 18,column = column).value)
             y14.append(ws.cell(row = 19,column = column).value)
177
             y15.append(ws.cell(row = 20,column = column).value)
178
             y16.append(ws.cell(row = 21,column = column).value)
179
             y17.append(ws.cell(row = 22,column = column).value)
180
             y18.append(ws.cell(row = 23,column = column).value)
181
182
             y19.append(ws.cell(row = 24,column = column).value)
183
             y20.append(ws.cell(row = 25,column = column).value)
             y21.append(ws.cell(row = 26,column = column).value)
184
             y22.append(ws.cell(row = 27,column = column).value)
185
186
             y23.append(ws.cell(row = 28,column = column).value)
             y24.append(ws.cell(row = 29,column = column).value)
187
             y25.append(ws.cell(row = 30,column = column).value)
188
189
             y26.append(ws.cell(row = 31,column = column).value)
             y27.append(ws.cell(row = 32,column = column).value)
190
             y28.append(ws.cell(row = 33,column = column).value)
191
```

```
192
            y29.append(ws.cell(row = 34,column = column).value)
193
            y30.append(ws.cell(row = 35,column = column).value)
194
            y31.append(ws.cell(row = 36,column = column).value)
            y32.append(ws.cell(row = 37,column = column).value)
195
            y33.append(ws.cell(row = 38,column = column).value)
196
197
            y34.append(ws.cell(row = 39,column = column).value)
198
199
200
        p_areas = figure(plot_width = 1000, plot_height = 500, x_axis_label = "
            dates",
201
                     y_axis_label = "Migration population",y_range = (0,7000),
202
                     tools = "hover,pan,box_zoom,save,reset,undo,zoom_in,zoom_out,
                         wheel_zoom", title="Areas of London short-term migration")
                         #Create a new figure
203
        p2 = p_areas.line(x = x, y = y2, line_width = 1, color = "#000003",legend
            = "City of London") #draw a line chart
        p3 = p_areas.line(x = x, y = y3, line_width = 1, color = "#140D35",legend
204
            = "Barking and Dagenham") #draw a line chart
        p4 = p areas.line(x = x, y = y4, line width = 1, color = "#3BOF6F",legend
205
            = "Barnet") #draw a line chart
206
        p5 = p_areas.line(x = x, y = y5, line_width = 1, color = "#63197F",legend
            = "Bexley") #draw a line chart
        p6 = p_areas.line(x = x, y = y6, line_width = 1, color = "#8C2980",legend
207
            = "Brent") #draw a line chart
208
        p7 = p_areas.line(x = x, y = y7, line_width = 1, color = "#B53679",legend
            = "Bromley") #draw a line chart
```

```
209
        p8 = p areas.line(x = x, y = y8, line width = 1, color = "#DD4968",legend
            = "Camden") #draw a line chart
210
        p9 = p areas.line(x = x, y = y9, line width = 1, color = "#F66E5B", legend
            = "Croydon") #draw a line chart
        p10 = p_areas.line(x = x, y = y10, line_width = 1, color = "#FD9F6C",
211
            legend = "Ealing") #draw a line chart
        p11 = p_areas.line(x = x, y = y11, line_width = 1, color = "#FDCD90",
212
            legend = "Enfield") #draw a line chart
213
        p12 = p_areas.line(x = x, y = y12, line_width = 1, color = "#FBFCBF",
            legend = "Greenwich") #draw a line chart
        p13 = p areas.line(x = x, y = y13, line width = 1, color = "#a6cee3",
214
            legend = "Hackney") #draw a line chart
        p14 = p_areas.line(x = x, y = y14, line_width = 1, color = "#1f78b4",
215
            legend = "Hammersmith and Fulham") #draw a line chart
216
        p15 = p\_areas.line(x = x, y = y15, line\_width = 1, color = "#b2df8a",
            legend = "Haringey") #draw a line chart
        p16 = p_areas.line(x = x, y = y16, line_width = 1, color = "#33a02c",
217
            legend = "Harrow") #draw a line chart
        p17 = p_areas.line(x = x, y = y17, line_width = 1, color = "#fb9a99",
218
            legend = "Havering") #draw a line chart
219
        p18 = p_areas.line(x = x, y = y18, line_width = 1, color = "#e31a1c",
            legend = "Hillingdon") #draw a line chart
        p19 = p_areas.line(x = x, y = y19, line_width = 1, color = "#fdbf6f",
220
            legend = "Hounslow") #draw a line chart
221
        p20 = p_areas.line(x = x, y = y20, line_width = 1, color = "#ff7f00",
            legend = "Islington") #draw a line chart
```

```
222
        p21 = p_areas.line(x = x, y = y21, line_width = 1, color = "#cab2d6",
            legend = "Kensington and Chelsea") #draw a line chart
223
        p22 = p_areas.line(x = x, y = y22, line_width = 1, color = "#6a3d9a",
            legend = "Kingston upon Thames") #draw a line chart
        p23 = p\_areas.line(x = x, y = y23, line\_width = 1, color = "#ffff99",
224
            legend = "Lambeth") #draw a line chart
        p24 = p_areas.line(x = x, y = y24, line_width = 1, color = "#b15928",
225
            legend = "Lewisham") #draw a line chart
226
        p25 = p_areas.line(x = x, y = y25, line_width = 1, color = "#e41a1c",
            legend = "Merton") #draw a line chart
        p26 = p areas.line(x = x, y = y26, line width = 1, color = "#377eb8",
227
            legend = "Newham") #draw a line chart
        p27 = p_areas.line(x = x, y = y27, line_width = 1, color = "#4daf4a",
228
            legend = "Redbridge") #draw a line chart
229
        p28 = p_areas.line(x = x, y = y28, line_width = 1, color = "#984ea3",
            legend = "Richmond upon Thames") #draw a line chart
        p29 = p_areas.line(x = x, y = y29, line_width = 1, color = "#ff7f00",
230
            legend = "Southwark") #draw a line chart
        p30 = p areas.line(x = x, y = y30, line width = 1, color = "#ffff33",
231
            legend = "Sutton") #draw a line chart
232
        p31 = p_areas.line(x = x, y = y31, line_width = 1, color = "#a65628",
            legend = "Tower Hamlets") #draw a line chart
        p32 = p\_areas.line(x = x, y = y32, line\_width = 1, color = "#f781bf",
233
            legend = "Waltham Forest") #draw a line chart
234
        p33 = p_areas.line(x = x, y = y33, line_width = 1, color = "#410967",
            legend = "Wandsworth") #draw a line chart
```

```
235
        p34 = p_areas.line(x = x, y = y34, line_width = 1, color = "#6A176E",
            legend = "Westminster") #draw a line chart
236
237
        #Set legend location adn legemd orientation
238
        p_areas.legend.location = "top_left"
239
        p_areas.legend.orientation = "horizontal"
240
         #Set callback function after click checkboxes
241
        display_event = CustomJS(code="""
242
                                 p2.visible = false;
243
                                 p3.visible = false;
244
                                 p4.visible = false;
245
                                 p5.visible = false;
246
                                 p6.visible = false;
247
                                 p7.visible = false;
248
                                 p8.visible = false;
249
                                 p9.visible = false;
250
                                 p10.visible = false;
251
                                 p11.visible = false;
252
                                 p12.visible = false;
253
                                 p13.visible = false;
254
                                 p14.visible = false;
255
                                 p15.visible = false;
256
                                 p16.visible = false;
257
                                 p17.visible = false;
258
                                 p18.visible = false;
259
                                 p19.visible = false;
260
                                 p20.visible = false;
```

```
261
                                 p21.visible = false;
262
                                 p22.visible = false;
                                 p23.visible = false;
263
264
                                 p24.visible = false;
                                 p25.visible = false;
265
266
                                 p26.visible = false;
267
                                 p27.visible = false;
268
                                 p28.visible = false;
269
                                 p29.visible = false;
270
                                 p30.visible = false;
271
                                 p31.visible = false;
272
                                 p32.visible = false;
273
                                 p33.visible = false;
274
                                 p34.visible = false;
275
                                 if(cb_obj.active.includes(0)){
276
277
                                     p2.visible = true;
                                 }
278
279
                                 if (cb_obj.active.includes(1)){
280
                                     p3.visible = true;
                                 }
281
                                 if (cb_obj.active.includes(2)){
282
283
                                     p4.visible = true;
284
                                 }
285
                                 if (cb_obj.active.includes(3)){
286
                                     p5.visible = true;
                                 }
287
```

```
288
                                  if (cb_obj.active.includes(4)){
289
                                      p6.visible = true;
                                  }
290
291
                                   if (cb_obj.active.includes(5)){
292
                                      p7.visible = true;
                                  }
293
294
                                  if (cb_obj.active.includes(6)){
295
                                      p8.visible = true;
                                  }
296
297
                                  if (cb_obj.active.includes(7)){
298
                                      p9.visible = true;
299
                                  }
300
                                  if (cb_obj.active.includes(8)){
301
                                      p10.visible = true;
302
                                  }
303
                                  if (cb_obj.active.includes(9)){
304
                                      p11.visible = true;
                                  }
305
306
                                  if (cb_obj.active.includes(10)){
                                      p12.visible = true;
307
                                  }
308
                                  if (cb_obj.active.includes(11)){
309
310
                                      p13.visible = true;
311
                                  }
312
                                  if (cb_obj.active.includes(12)){
313
                                      p14.visible = true;
                                  }
314
```

```
315
                                  if (cb_obj.active.includes(13)){
316
                                      p15.visible = true;
                                  }
317
318
                                  if (cb_obj.active.includes(14)){
319
                                      p16.visible = true;
                                  }
320
321
                                  if (cb_obj.active.includes(15)){
322
                                      p17.visible = true;
                                  }
323
324
                                  if (cb_obj.active.includes(16)){
325
                                      p18.visible = true;
326
                                  }
327
                                  if (cb_obj.active.includes(17)){
328
                                      p19.visible = true;
                                  }
329
330
                                  if (cb_obj.active.includes(18)){
331
                                      p20.visible = true;
                                 }
332
333
                                  if (cb_obj.active.includes(19)){
                                      p21.visible = true;
334
                                  }
335
                                  if (cb_obj.active.includes(20)){
336
337
                                      p22.visible = true;
338
                                  }
339
                                  if (cb_obj.active.includes(21)){
340
                                      p23.visible = true;
                                  }
341
```

```
342
                                  if (cb_obj.active.includes(22)){
343
                                      p24.visible = true;
                                  }
344
345
                                  if (cb_obj.active.includes(23)){
346
                                      p25.visible = true;
                                  }
347
348
                                  if (cb_obj.active.includes(24)){
349
                                      p26.visible = true;
                                  }
350
351
                                  if (cb_obj.active.includes(25)){
352
                                      p27.visible = true;
353
                                  }
354
                                  if (cb_obj.active.includes(26)){
355
                                      p28.visible = true;
                                  }
356
357
                                  if (cb_obj.active.includes(27)){
358
                                      p29.visible = true;
                                 }
359
360
                                  if (cb_obj.active.includes(28)){
                                      p30.visible = true;
361
                                  }
362
                                  if (cb_obj.active.includes(29)){
363
364
                                      p31.visible = true;
365
                                  }
366
                                  if (cb_obj.active.includes(30)){
367
                                      p32.visible = true;
                                  }
368
```

```
369
                                  if (cb_obj.active.includes(31)){
370
                                      p33.visible = true;
                                  }
371
372
                                  if (cb_obj.active.includes(32)){
373
                                      p34.visible = true;
                                  }
374
375
                                  """,args={'p2': p2, 'p3': p3, 'p4': p4,
376
                                  'p5': p5,'p6': p6,'p7': p7,'p8': p8,'p9': p9,'p10'
                                      : p10,
                                  'p11': p11, 'p12': p12, 'p13': p13, 'p14': p14, 'p15':
377
                                       p15, 'p16': p16,
378
                                  'p17': p17, 'p18': p18, 'p19': p19, 'p20': p20, 'p21':
                                       p21, 'p22': p22,
                                  'p23': p23,'p24': p24,'p25': p25,'p26': p26,'p27':
379
                                       p27, 'p28': p28,
                                  'p29': p29, 'p30': p30, 'p31': p31, 'p32': p32, 'p33':
380
                                       p33, 'p34': p34
381
                                  })
382
         #Set widgets checkboxes
         selection_box = CheckboxGroup(labels= [
383
384
         "City of London",
385
         "Barking and Dagenham",
386
         "Barnet",
387
         "Bexley",
388
         "Brent",
389
         "Bromley",
390
         "Camden",
```

```
391
         "Croydon",
392
         "Ealing",
         "Enfield",
393
394
         "Greenwich",
395
         "Hackney",
396
         "Hammersmith and Fulham",
397
         "Haringey",
398
         "Harrow",
399
         "Havering",
400
         "Hillingdon",
401
         "Hounslow",
402
         "Islington",
403
         "Kensington and Chelsea",
         "Kingston upon Thames",
404
405
         "Lambeth",
406
         "Lewisham",
407
         "Merton",
408
         "Newham",
409
         "Redbridge",
         "Richmond upon Thames",
410
411
         "Southwark",
         "Sutton",
412
413
         "Tower Hamlets",
414
         "Waltham Forest",
415
         "Wandsworth",
416
         "Westminster"],active =
             [0,1,2,3,4,5,6,7,8,9,10,11,12,13,14,15,16,17,18,19,20,21,22,23,24,25,26,27,28,29,30,31,32,
```

```
417
418
         selection_box.js_on_click(display_event)
419
         row_1 = [p_areas, selection_box] #Make selection boxes located besides
             line chart
420
         return row_1
421
422
423
     def plot_linechart_London_short_term_migration():
424
         wb = openpyxl.load_workbook('data/Short term migration.xlsx') # Import
             datasets
         ws = wb.get_sheet_by_name('Data')
425
         x = []
426
         y = []
427
428
         for column in range (2,12):
429
             x.append(ws.cell(row = 5,column = column).value)
430
             y.append(ws.cell(row = 6,column = column).value)
431
         p_London = figure(plot_width = 600, plot_height = 300, x_axis_label = "
432
             dates",
                     y_axis_label = "Migration population",
433
434
                     tools = "hover,pan,box_zoom,save,reset,undo,zoom_in,zoom_out,
                         wheel_zoom", title="London short-term migration") #Create
                         a new figure
435
         p_London.line(x = x, y = y, line_width = 2, color = "black", legend = "
436
             London")
```

```
437
        p_London.circle(x = x, y = y, fill_color = 'white', size = 3)
        p_London.legend.location = "top_left"
438
439
        p_London.legend.orientation = "horizontal"
440
        return p_London
441
442
     def plot_shortterm_vbar():
443
        wb = openpyxl.load_workbook('data/Short term migration.xlsx') # Import
444
            datasets
445
        ws = wb.get_sheet_by_name('Data')
446
447
         #Rearrange data, append them into new lists
        year2data = {}
448
        areas_list = []
449
450
        year_list = []
451
        for column in range (2,12):
452
             year = str(ws.cell(row = 5,column = column).value)
453
            year_list.append(year)
             data dict = {}
454
455
             for row in range(7, 40):
                 areas = ws.cell(row = row,column = 1).value
456
457
                 if areas not in areas_list:
458
                     areas_list.append(areas)
                 data_dict[areas] = ws.cell(row=row, column=column).value
459
460
             year2data[year] = data_dict
461
462
```

```
463
         defult_year = year_list[0]
464
         counts list = []
465
         display_data_dict = year2data[defult_year]
466
        for areas in areas_list:
467
             counts_list.append(display_data_dict[areas])
468
469
         source = ColumnDataSource(data=dict(areas_list=areas_list, counts_list=
             counts_list))
470
471
         #plot new figure
472
        p_year = figure(plot_width=1000, plot_height=500,
473
                    y_axis_label="Migration population", x_range=areas_list,
474
                    y_range=(0, 6000), tools="hover,pan,box_zoom,save,reset,undo,
                        zoom_in,zoom_out,wheel_zoom",
475
                    title="Areas of London short-term migration")
         #set colour
476
477
         colors = ['#000003', '#140D35', '#3B0F6F', '#63197F', '#8C2980',
                   '#B53679', '#DD4968', '#F66E5B', '#FD9F6C', '#FDCD90',
478
                   '#FBFCBF', '#a6cee3', '#1f78b4', '#b2df8a', '#33a02c',
479
480
                   '#fb9a99', '#e31a1c', '#fdbf6f', '#ff7f00', '#cab2d6',
481
                   '#6a3d9a', '#ffff99', '#b15928', '#e41a1c', '#377eb8',
482
                   '#4daf4a', '#984ea3', '#ff7f00', '#ffff33', '#a65628',
483
                   '#f781bf', '#410967', '#6A176E']
484
         #implement vertical bar chart
485
        p_vbar = p_year.vbar(x='areas_list', top='counts_list', source=source,
             width=0.5, alpha=0.8, color=factor_cmap('areas_list', palette=colors,
            factors=areas_list))
```

```
486
         p_year.xaxis.major_label_orientation = 1.2
487
         p_year.x_range.range_padding = 0.05
         p_year.legend.location = "top_left"
488
489
         p_year.legend.orientation = "horizontal"
490
491
         #set select menu
492
         select = Select(title="choose year", value=year_list[0], options=year_list
             )
493
494
         #set callback funciton when click select menu
495
         def callback_select(attr, old, new):
496
             year = select.value
497
             counts_list = []
498
             display_data_dict = year2data[year]
499
             for areas in areas_list:
500
                 counts_list.append(display_data_dict[areas])
501
502
             p_vbar.data_source.data['counts_list'] = counts_list
503
504
505
506
         select.on_change('value', callback_select)
507
         select.width = 100
508
509
         return p_year, select
510
511
```

```
512
     def plot_multi_stackvbar():
513
         wb = openpyxl.load_workbook('data/LTIM reason (1).xlsx') # Import
514
             datasets
515
         ws = wb.get_sheet_by_name('Data')
516
517
         #append data into lists
         year2data = {}
518
519
         years = []
520
         index = ['work definite job', 'work looking for a job', 'accompany', '
             formal study', 'other']
         for row in range(4, 66):
521
             if ws.cell(row=row, column=2).value:
522
523
                 year = str(ws.cell(row = row,column = 1).value)[:4]
524
                 if year not in years:
525
                     years.append(year)
526
                 data_dict = year2data.get(year, {'In': [0,0,0,0,0], 'Out':
                     [0,0,0,0,0], 'Net': [0,0,0,0,0]})
                 data_in = data_dict['In']
527
                 data_out = data_dict['Out']
528
529
                 data_net = data_dict['Net']
530
                 ws_in = [ws.cell(row = row,column = 2).value, ws.cell(row = row,
                     column = 6).value,
531
                            ws.cell(row=row, column=10).value, ws.cell(row = row,
                                column = 14).value,
                            ws.cell(row=row, column=18).value]
532
```

```
533
                 ws_out = [ws.cell(row=row, column=3).value, ws.cell(row=row,
                     column=7).value,
534
                          ws.cell(row=row, column=11).value, ws.cell(row=row,
                              column=15).value,
535
                          ws.cell(row=row, column=19).value]
536
                 ws_net = [ws_in[0]-ws_out[0], ws_in[1]-ws_out[1], ws_in[2]-ws_out
                     [2], ws_in[3]-ws_out[3], ws_in[4]-ws_out[4]]
537
538
                 total_in = [data_in[0]+ws_in[0], data_in[1]+ws_in[1], data_in[2]+
                     ws_in[2], data_in[3]+ws_in[3], data_in[4]+ws_in[4]]
                 total_out = [data_out[0]+ws_out[0], data_out[1]+ws_out[1],
539
                     data_out[2]+ws_out[2], data_out[3]+ws_out[3], data_out[4]+
                     ws_out[4]]
                 total_net = [data_net[0]+ws_net[0], data_net[1]+ws_net[1],
540
                     data_net[2]+ws_net[2], data_net[3]+ws_net[3], data_net[4]+
                     ws_net[4]]
541
                 data_dict['In'] = total_in
542
543
                 data_dict['Out'] = total_out
                 data_dict['Net'] = total_net
544
545
                 year2data[year] = data_dict
546
547
                 #arrange data into new form
548
549
         defaul_year = years[0]
         data_dict = year2data[defaul_year]
550
         df = pd.DataFrame(data_dict, index=index)
551
```

```
552
         x_index = df.index.tolist()
553
         type work = df.columns.tolist()
554
         data = {'index': x_index}
555
556
         for type in type_work:
557
             data[type] = df[type].tolist()
         print(data)
558
559
560
         source = ColumnDataSource(data=data)
561
562
         #Plot new figure
         p = figure(plot_width=1000, plot_height=500, y_axis_label="Migration")
563
             population", x_range=x_index,
564
                     y_range=(0, 1000), tools="hover,pan,box_zoom,save,reset,undo,
                         zoom_in,zoom_out,wheel_zoom", title="reason for migration"
                         )
565
         p_vbar_in = p.vbar(x=dodge('index', -0.25, range=p.x_range), top='In',
566
             width=0.2, source=source, color="#ffff99",legend=value("In"))
567
         p_vbar_out = p.vbar(x=dodge('index', 0.0, range=p.x_range), top='Out',
             width=0.2, source=source, color="#b15928",legend=value("Out"))
568
         p_vbar_net = p.vbar(x=dodge('index', 0.25, range=p.x_range), top='Net',
             width=0.2, source=source, color="#e41a1c",legend=value("Net"))
569
570
         p.legend.location = "top_left"
571
         p.legend.orientation = "horizontal"
572
```

```
573
        menu = years
         dropdown = Dropdown(label=defaul year, menu=menu) #Set new dropdown menu
574
575
         def callback_dropdown(attr, old, new): #set call back function of dropdown
             menu
576
             year = dropdown.value
577
             dropdown.label = year
578
             display_data_dict = year2data[year]
579
             p_vbar_in.data_source.data['In'] = display_data_dict['In']
580
            p_vbar_out.data_source.data['Out'] = display_data_dict['Out']
             p_vbar_net.data_source.data['Net'] = display_data_dict['Net']
581
582
583
             dropdown.label = year
584
585
         dropdown.on_change('value', callback_dropdown)
586
         dropdown.width = 100
587
         dropdown.height = 30
588
589
        return p, dropdown
590
591
592
     #set callback functions of interfaces switch buttons
     def callback1():
593
594
        layout_1.visible = True
595
        layout_2.visible = False
596
        layout_3.visible = False
597
598
    def callback2():
```

```
599
         layout_1.visible = False
600
        layout 2.visible = True
601
        layout_3.visible = False
602
603
    def callback3():
604
        layout_1.visible = False
605
        layout_2.visible = False
606
        layout_3.visible = True
607
608
    #set interfaces switch buttons
609
    button_1 = Button(label="short-term migration(London areas)")
610
    button_2 = Button(label="migration vs employment(UK & London)")
611
    button_3 = Button(label="reason for migration(UK)")
612
    button_1.on_click(callback1)
613
    button_2.on_click(callback2)
614
    button_3.on_click(callback3)
615
    p_year, select = plot_shortterm_vbar()
616
617
    bt_row = row(button_1, button_2, button_3)
618
    row_year = row(p_year, select)
619
    row_1 = row(plot_linechart_London_short_term_migration(),
        plot_long_term_migration())
620
    row_2 = row(plot_underemployment_rate(),plot_employment_population())
621
622
    p_reason_mig, dropdown = plot_multi_stackvbar()
623
    row_reason_mig = row(p_reason_mig, dropdown)
624
```

```
625
    #set layout
    bt_layout = layout(bt_row)
626
    layout_1 = layout(row_year, plot_linechart_areas_short_term_migration())
627
628
    layout_2 = layout(row_1,row_2)
629
    layout_3 = layout(row_reason_mig)
    layouts = layout(bt_layout, layout_1, layout_2, layout_3)
630
631
632
    #show(layouts)
633
    curdoc().add_root(layouts)
634
635
636
    # python -m bokeh serve --show web.py
    # By python 2.7
637
```