



DEPARTMENT OF COMPUTER SCIENCE

MASTER'S PROJECT

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# Visualizing 10 Years (2005-2015) of Life in Hampton Roads

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I want to thank **Mr. James Clary** from the Hampton Roads District Planning Commission for originally proposing this idea and providing all the data sources required for this project. I would like to acknowledge the work done by **Shawn and Valentina Jones** in creating the map of Hampton Roads using D3.js, whose work I have used in my project.

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# 1 Preface

The goal of this project is to analyze different data sources from U.S. Bureau of Labor Statistics, U.S Census Bureau and Virginia Department of Education, gather insights about the data and make these data insights actionable through high-quality visualizations.

This project also aims to fulfill the goals addressed by the Hampton Roads Planning District Commission (hereby referred to as HRPDC), who provided the links to all the data sources. Below are the list of goals that were laid out by HRPDC:

- Indicate visually the change in and size of employment by industry over time with the relative incomes of those industries
- Measuring the change in incomes of the industry along with changes in employment
- Indicate visually the change in employment by occupation over time along with the relative incomes of the occupation
- Examine the changes in graduation rates for each of the localities in Hampton Roads
- Show the flows of commuters throughout the region of Hampton Roads

## 2 Motivation

The idea was originally proposed by Mr. James Clary, Senior Economist at HRPDC in Dr. Weigle's Spring 2015 class, Information Visualization. Mr. Clary does not hold the position of Senior Economist at HRPDC anymore. Folks at HRPDC wanted to see trends in income and employment data spread across different industries and occupations, over time. They also wanted to know about the different high school graduation rates and commuting patterns in the Hampton Roads area.

They wanted to use the results from this project and then compare it with the overall average of U.S, to see where things need to be improved. I was also curious myself to know about the area I have lived in for the past 2 years and also my passion about dealing with large data sets and converting them into meaningful visualizations led me to do this project.

### 3 Data Sources

For the data on income and employment for different industries and occupations, I referred to the “Bureau of Labor Statistics”. Links to the same can be found below:

- Quarterly Census of Employment and Wages - (<http://www.bls.gov/cew/datatoc.htm>)
- Occupational Employment Statistics - ([http://www.bls.gov/oes/current/oes\\_47260.htm](http://www.bls.gov/oes/current/oes_47260.htm))



Figure 1: Snapshot of Occupational Data



Figure 2: Snapshot of Industry Data

For the data on commuting patterns and high school graduation rates, I referred to U.S Census Bureau and Virginia Department of Education. Links to the same can be found below:

- American Community Survey and Decennial Census Journey to work data - (<https://www.census.gov/hhes/commuting/data/commutingflows.html>)
- Virginia Cohort Reports - ([http://www.doe.virginia.gov/statistics\\_reports/index.shtml](http://www.doe.virginia.gov/statistics_reports/index.shtml))

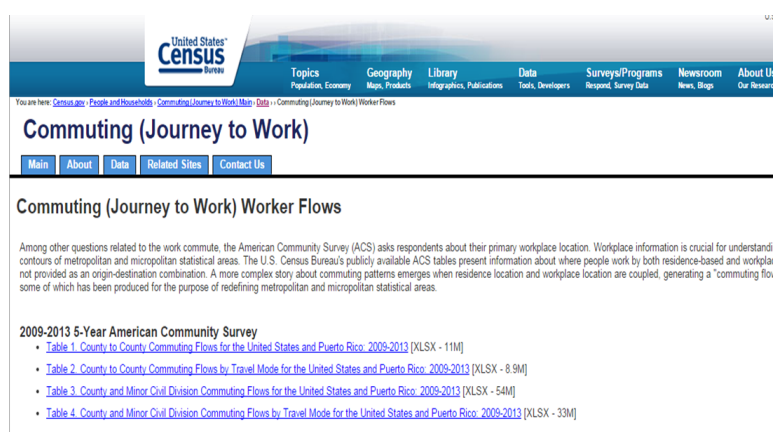


Figure 3: Snapshot of Commuting Data

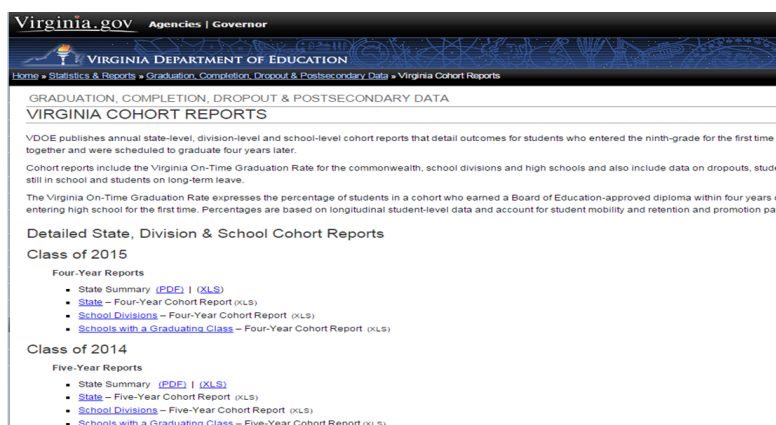


Figure 4: Snapshot of Graduation Data

## 4 Data Set and Cleaning

Data-sets were available in the form of Excel spreadsheets from all the data sources. Some of the spreadsheets were direct downloads whereas others were available part of a zip package. There were roughly 50,000 - 160,000 records on each of the spreadsheet. All the data was structured and each column carried a heading using standard naming conventions according to the respective Bureau.

Even though the data was structured, the format was not consistent throughout all the years. This made it hard for me to automate the process of cleaning the data. There are plenty of libraries available in Python<sup>1</sup> to manipulate excel files, but due to the inconsistency in the format of the data, I chose to clean the data manually. It did take me more time to do it this way, but in the end I was able to clean the data the way I wanted. I got rid of the standard headers and used my own naming for easier understanding. I used data filters in Excel to get what I want. Below is an example of the data inconsistency -

RIM_STA	AREA	AREA_NAME	OCC_CODE	OCC_TITLE	GROUP	TOT_EMP
VA	5720	Norfolk-Virginia Beach	11-0000	Management occupati	major	25020
VA	5720	Norfolk-Virginia Beach	13-0000	Business and financial	major	32200
VA	5720	Norfolk-Virginia Beach	15-0000	Computer and mathen	major	17150
VA	5720	Norfolk-Virginia Beach	17-0000	Architecture and engir	major	20730
VA	5720	Norfolk-Virginia Beach	19-0000	Life, physical, and soci	major	5210
VA	5720	Norfolk-Virginia Beach	21-0000	Community and social	major	8880
VA	5720	Norfolk-Virginia Beach	23-0000	Legal occupations	major	4270
VA	5720	Norfolk-Virginia Beach	25-0000	Education, training, an	major	45620
VA	5720	Norfolk-Virginia Beach	27-0000	Arts, design, entertain	major	7400
VA	5720	Norfolk-Virginia Beach	29-0000	Healthcare practitione	major	32330
VA	5720	Norfolk-Virginia Beach	31-0000	Healthcare support occ	major	16160
VA	5720	Norfolk-Virginia Beach	33-0000	Protective service occ	major	17650
VA	5720	Norfolk-Virginia Beach	35-0000	Food preparation and	major	61990

Snapshot of 2005

RIM_STAT	AREA	AREA_NAME	OCC_CODE	OCC_TITL	BCC_GROU	TOT_EMP
VA	47260	Virginia Beach-Norfolk-New	11-0000	Managem	major	26,720
VA	47260	Virginia Beach-Norfolk-New	13-0000	Business	major	40,390
VA	47260	Virginia Beach-Norfolk-New	15-0000	Computer	major	22,570
VA	47260	Virginia Beach-Norfolk-New	17-0000	Architect	major	21,120
VA	47260	Virginia Beach-Norfolk-New	19-0000	Life, Physi	major	5,310
VA	47260	Virginia Beach-Norfolk-New	21-0000	Communi	major	10,860
VA	47260	Virginia Beach-Norfolk-New	23-0000	Legal Occ	major	3,990
VA	47260	Virginia Beach-Norfolk-New	25-0000	Education	major	45,120
VA	47260	Virginia Beach-Norfolk-New	27-0000	Arts, Desig	major	7,770
VA	47260	Virginia Beach-Norfolk-New	29-0000	Healthcar	major	42,900
VA	47260	Virginia Beach-Norfolk-New	31-0000	Healthcar	major	19,380
VA	47260	Virginia Beach-Norfolk-New	33-0000	Protective	major	18,910
VA	47260	Virginia Beach-Norfolk-New	35-0000	Food Prep	major	71,680
VA	47260	Virginia Beach-Norfolk-New	37-0000	Building a	major	24,240

Snapshot of 2014

Figure 5: Example of Data inconsistency

<sup>1</sup><http://www.python-excel.org/>



## 5 Overview of the System

The whole system was split into 4 different sub-systems. I used a combination of Tableau<sup>2</sup> and D3.js<sup>3</sup> to create all the visualizations. To see the trends in “Income and Employment by Industry” I created line charts to show the change in and size of income and employment over time and bar charts to measure these changes on a percentage scale. To see the trends in “Income and Employment by Occupation”, I created line charts to show the change in and size of income and employment over time. All of this was achieved using Tableau and Microsoft Excel.

In order to show the trends in high school graduation rates, I created interactive line charts to exam the changes by each locality. I also used a combination of Choropleth map<sup>4</sup> and static line charts to display the graduation rates for each locality based on factors such as gender, race and socio-economic factors. Users can click on the region they are interested in on the map and it will show the line charts accordingly.

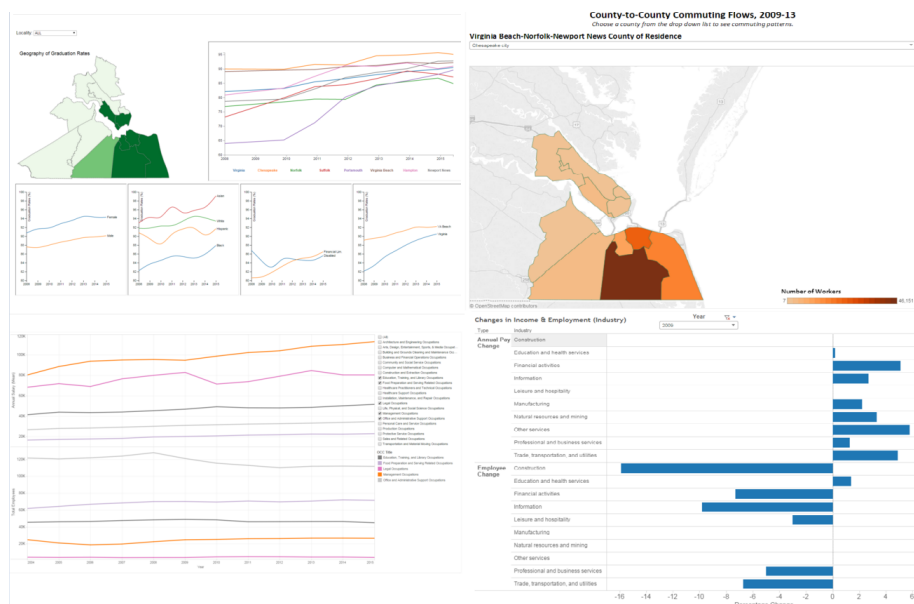


Figure 6: Overview of the System

<sup>2</sup><http://www.tableau.com/>

<sup>3</sup><https://d3js.org/>

<sup>4</sup>A choropleth map is a thematic map in which areas are shaded or patterned in proportion to the measurement of the statistical variable being displayed on the map, such as population density or per-capita income - [https://en.wikipedia.org/wiki/Choropleth\\_map](https://en.wikipedia.org/wiki/Choropleth_map)

To achieve this I used D3.js, JSON, HTML, CSS, jQuery and JavaScript. In order to show the commuting patterns in Hampton Roads, I created a Choropleth map using Tableau and included tooltip to highlight the number of commuters in each region. I had to find out the latitude and longitude of each cities and then use that to draw the map in Tableau. To find out the latitudes and longitudes, I used this website - <http://www.latlong.net/>

Finally, all the sub-systems were put together into one main system using Bootstrap<sup>5</sup> framework. I have listed down all the goals for each system and the valuable insights that I gained from each system besides it. All of this can be viewed on the project website which can be accessed by following this link - [www.cs.odu.edu/~psajjan/cs698/](http://www.cs.odu.edu/~psajjan/cs698/)

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<sup>5</sup><http://getbootstrap.com/>

## 6 Insights

After developing all the visualizations, I started examining each of them individually to see if I could gain some meaningful insights from it. I carefully observed each of the sub-systems and have listed down all my insights regarding each of the sub-system below -

### 6.1 Income and Employment by Industry

- **Trade, transportation and utilities** industry employed the highest number of people whereas **Natural resources and mining** industry employed the least number of people.
- **Manufacturing** industry had the highest annual pay whereas **Leisure and hospitality** industry had the lowest annual pay.
- After the “Great recession”<sup>6</sup> in the U.S, all the industries experienced a decline in the number of employment but Education and health services saw a steady increase
- **Construction** industry had the highest impact from the “Great recession”, where there was a 16% decline in employment in the year 2009.

### 6.2 Income and Employment by Occupation

- **Office and administrative** support occupation had the highest number of employees whereas **Legal** occupation had the least number of employees.
- **Management** occupation paid the highest annual salary whereas **Food preparation and serving** related occupation paid the lowest annual salary.
- The “Great recession” did not have a major impact on any of the occupations since the trends looked steady over the period of 10 years.

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<sup>6</sup>[https://en.wikipedia.org/wiki/Great\\_Recession\\_in\\_the\\_United\\_States](https://en.wikipedia.org/wiki/Great_Recession_in_the_United_States)

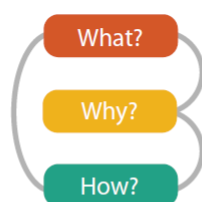
### 6.3 High school Graduation rates

- **Chesapeake** city had the highest graduation rates and way above Virginia state's average graduation rate, whereas **Portsmouth** city had the lowest graduation rates.
- **Females** dominated over males in each of the 7 counties, **White** and **Asian(minority)** race had the highest graduation rate among all the races.

### 6.4 Commuting Patterns

- **Virginia Beach** city had the highest number of daily commuters(226,779), whereas Mathews county had the lowest number of daily commuters(3,422)
- **Norfolk** city had the highest retention rate, where 67.63% of the city's daily commuters worked within the city and York county had the lowest, where 27.89% of the commuters worked within the county.

## 7 WHAT-WHY-HOW Framework



Three-part analysis framework for a vis instance: *why* is the task being performed, *what* data is shown in the views, and *how* is the vis idiom constructed in terms of design choices.

Figure 7: Overview of What-Why-How Framework

The What-Why-How framework described by Tamara Munzner in her “Visualization Analysis and Design” textbook, acts as a basic guideline and framework for visualization any form of data. I will discuss how this framework was effectively applied in my project below -

### 7.1 What: Data

All the data-sets were tables with multiple attributes and items. All these tables were stored in Excel spreadsheets. The entire data-set was a static file. Here, the attributes will be used as filters and items are the values for each attribute. The attribute types are categorical attributes and quantitative attributes. The Choropleth map developed using Tableau uses the latitude and longitude to represent each county/city in the area. For the map created using D3.js, I borrowed code from Shawn and Valentina Jones<sup>7</sup> Github repository and modified it according to my needs. The bar-charts and line-charts use quantitative data.

### 7.2 Why: Actions and Abstract Tasks

Based on the list of actions available my visualization uses analyze and query actions. The users can analyze the data and discover some interesting patterns. The user can also query the visualization by using the different filters available and summarize them. The viewers can perform cross-attribute comparison, for example comparing different industries and occupations.

<sup>7</sup><https://github.com/shawnmjones/hr-contracting>

### **7.3 How: Encode**

Most of the colors used in my visualizations are color blind safe. In the Choropleth map, the channel hue is used to show the count of commuters for each city/county. The channel area is used to encode the quantitative income and salary data in the form of line charts and bar charts. Different color coding is used for each industry and occupation in the line charts.

### **7.4 How: Reduce/Manipulate**

In order to perform reduction the users can perform dynamic filtering and aggregation using the filters provided. Viewers can also zoom in and out to view the name of the states or countries on the Chorpleth map.

## 8 Challenges

Overall, I had a lot of fun working in this project but there were a few challenges which made some of the tasks difficult to achieve. These were minor challenges and nothing major to deviate entirely from the project's idea. Below are the list of some of the minor challenges that I came across while I was working on the project -

- Data inside the Excel spreadsheets was structured but not easy to read. What I mean by this is, even though the data was structured into rows and columns, the column headers for each of the columns were not easy to read. They were named using standard conventions followed by each of the government agency and the expansion of these headers was not available inside the spreadsheet. I had to manually go look for them on the website, which was located at an entirely different location.
- Initially I thought I could just use the name of the cities and counties to draw the map through Tableau. But, later I found out it was only possible by finding out latitudes and longitudes of each city/county in order to draw the map using Tableau. Then I used latlong.net to find the latitude, longitude of each city and county.
- Even though Mr. Clary shared a document with all the links to the data sources, they were not direct links. It is very easy to get lost of a government website and figure out where you are. I had to browse through different sections of the websites to finally arrive at the place and find the data-sets I was looking for.

## 9 Future Work

Even though the work done in this project is substantial, it can be further improved upon as explained below -

- The data sources that are mentioned above are available for all the regions in the U.S and not just Hampton Roads. Hence, the study made in this project can be expanded to any region in the U.S
- We only studied the graduation patterns in the Hampton Roads area and showed the trends visually. Further work can be done to study the factors affecting these graduation rates such as cost of living, crime rate in the area, total household income etc.
- With respect to commuting patterns, data shows that some people living in Hampton Roads actually commuted to other states out of Virginia. This can be shown on the map since in my current project, I only show commuting patterns within the Hampton Roads area.