Boston University CS506 Bay State Banner Final Deliverable

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1. Introduction

The Bay State Banner is an independent newspaper primarily geared toward the readership interests of the African-American community in Boston, Massachusetts. It owns news weekly that reports on the political, economic, social and cultural issues that are of interest to African American and English speaking Latinos in Boston and throughout New England. Started in 1965 by Melvin B. Miller, a graduate of Harvard College and Columbia Law School, the Banner provides its estimated 120,000 weekly print readers and 300,000 online readers with reports on a mix of local, national, international news and cultural events. The Banner is the newspaper of record for this community and has chronicled the struggles and successes of the last 50 years.

To carry out the political plans, politicians need a large amount of money to support the activities. And they need donors. Actually, the real estate industry is the largest donor to Massachusetts politicians. It covers brokers, developers, architects, and anyone with a vested investment in building. They acquire a large number of profits from the real estate industry and become the power of the politicians to support the politicians' activities.

The real estate industry covers many people who have a vested investment in building, including brokers, developers, architects and ect.. Our client Yawu Miller, a journalist writing for the Bay State banner would like to examine the lobbying power of the real estate industry in Massachusetts.

2. Data Collection & Processing

2.1 Data Source

Our data source are The Secretary of Commonwealth's website:

http://corp.sec.state.ma.us/corpweb/CorpSearch/CorpSearch.aspx

Our task is to collect all business filings for the past 10 years that specify "real estate" as the industry. We need to type "a" or "b" or "c", etc...then view filings, annual report, extract PDFs from all links; and extract names of bulist "real estate" as industry. Actually we type "aa" or "ab", etc...to get results because of the large amount of data.

2.2 Scraping & Data Downloading

We use Python code to scrape the Secretary of Commonwealth's website.

Since we were not familiar with the scraping, we use Selenium IDE to create the basic skeleton of the code. Then we modified the code to the one that works for our scraping. And we choose the Chrome driver as the driver scraping the data, so we download the Chrome driver to help the scraping.

You can find our Python code in the "code" folder. Just run the *Scraping.py* and we can download all the PDFs automatically.

When we scrape data, the biggest problem is that we are rejected by the website due to the high frequency of visiting. To solve the problem, we added the *sleep()* to change the frequency of visiting. Also, we restarted the Chrome driver every 100 downloading so that we will not be rejected anymore.

2.3 Changing File Format

Just run the *Modify.py* in the "code" folder and we can change all the files format from ".aspx" into ".pdf".

2.4 Extracting

Run the *extracter.py* in the "code" folder and we can extract some information from all the PDFs. We save the information as a .csv file. Then we clean the information using the Excel and then get the final dataset.

We have two kinds of dataset extracted from the downloaded PDFs. One only contains name and description and the other contains many other detailed information like address and member information. Our project manager also provided us OCPF data to do the filtering. All of them are saved in excel files.

2.5 Filtering & Data Preparation

We use the following keywords related to real estate to filter the two kinds of data from the secretary website using the column "description":

Realtor Real Estate Contractor Construction Building Builder Property Carpenter Painter **Property Management** Architect (ambiguous) Surveyor Developer (ambiguous) Civil Engineer/ing Planner Realtor Environmental Realty Reviewer Surveyor

Also, we use the following name of PACS to filter the OCPF data using the name of PACS (This is only a part of it. We don't list all the names of PACS here.). We also use the keywords shown above to filter the OCPF data using columns "Occupation" and "Employer". Also, we use APPENDIX in the keywords document to filter the data using column "Last Name":

Greater Boston Real
Estate Board PAC
NAIOP MA Commercial
Real Estate
Development Political
Action Committee

Real Estate Bar
Association for MA PAC

The keywords of real estate can be find here:

https://docs.google.com/document/d/1ITRwlff2TkTwBaKpSVPL5vO5QYOzsp2ib35SkLZ GCdQ/edit

We will show the filtered data in the next part.

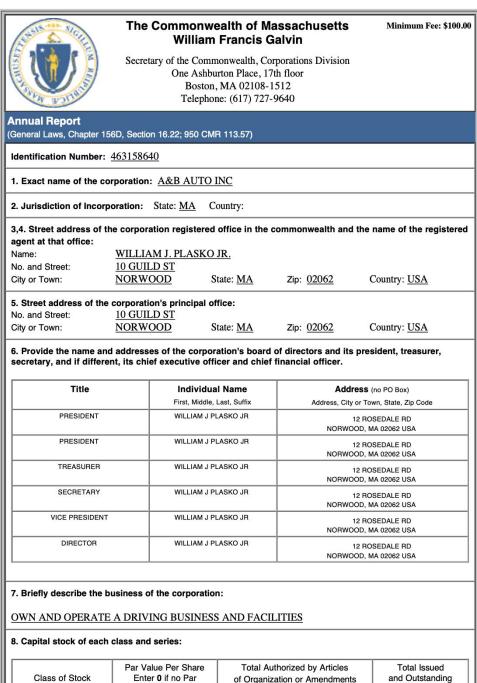
3. Data Description & Visualization

You can view our filtered data here:

https://drive.google.com/drive/folders/0AONGMu03aGUKUk9PVA

3.1 PDFs from the Secretary Website

According to the PDFs we have downloaded, most PDFs have the same format like this image:



| | | Num of Shares | Total Par Value | Num of Shares | | | | | | | | | | |
|--|------------------|---------------|-----------------|---------------|--|--|--|--|--|--|--|--|--|--|
| CNP | \$0.00000 | 10,000 | \$0.00 | 10,000 | | | | | | | | | | |
| 9. Check here if the stock of the corporation is publicly traded: | | | | | | | | | | | | | | |
| 10. Report is filed for fiscal year ending: $12/31/2016$ | | | | | | | | | | | | | | |
| Signed by WILLIAM J PLASKO JR, its PRESIDENT on this 27 Day of April, 2017 | | | | | | | | | | | | | | |
| © 2001 - 2017 Commonwealth of All Rights Reserved | of Massachusetts | | | | | | | | | | | | | |

3.2 Extracted Data from PDFs

The two kinds of dataset collected after filtering are shown below.

3.2.1 The file containing name and description

| Name | Description |
|--|---|
| JML HOLDING COMPANY I | REAL ESTATE |
| THE WALNUT HILL GROUP, LLC | PROVIDE REAL ESTATE BROKERAGE SERVICES AS WELL AS NOTARY SERVICES. |
| THE WARBY GROUP LLC | SCIENCE EDUCATION, AND ENVIRONMENTAL CONSULTING; AND ANYTHING ELSE LEGAL |
| THE WARREN GROUP, INC. | PUBLICATION OF REAL ESTATE & BANKING NEWS & DATA |
| THE WATER CONNECTION, LLC | REAL ESTATE HOLDING COMPANY |
| THE WATER PLANET COMPANY | ENVIRONMENTAL CONSULTING AND OPERATIONS |
| THE WATERMAN REALTY MANAGEMENT | COMMERCIAL REAL ESTATE MANAGEMENT |
| TWC LIQUIDATION, INC. | SPECIALTY SUBCONTRACTOR |
| THE WATERPROOFING COMPANY, LLC | SPECIALTY SUBCONTRACTOR WATERPROOFING, DAMPROOFING, CAULKING AND MASO |
| THE WAY CONSTRUCTION, INC | CONSTRUCTION |
| THE WEATHERIZE GUYZ, LLC | CONSTRUCTION |
| THE WECO GROUP, LTD. | REAL ESTATE |
| THE WEEPING BEECH, INC. | LANDSCAPE DESIGN & CONSTRUCTION |
| THE WELL FOR INTEGRATIVE MEDICINE, LLC | THE PURPOSES OF THE LIMITED LIABILITY COMPANY ARE TO RENT REAL PROPERTY AND |
| JL INFORMATION AND INSIGHTS INC. | OCCUPATIONAL AND ENVIRONMENTAL SAFETY & COMPLIANCE |
| THE WESTFORD LLC | SINGLE FAMILY HOME PURCHASE, RENOVATION, AND SALE. INVESTMENT PROPERTY. |
| THE WESTWOOD GROUP PROPERTY | PROPERTY OWNERSHIP, DESIGN AND CONSTRUCTION AND OTHER PURPOSES PERMITTED |
| THE WHALE LLC | REAL ESTATE |
| THE WHARF PROPERTIES LLC | REAL ESTATE |
| THE WHEELRIGHT, LLC | PURCHASING, MANAGING, AND SELLING REAL ESTATE, AND ANY OR ALL OTHER LAWFUL |
| THE WHITING-TURNER CONTRACTING COMPANY | CONSTRUCTION MANAGER/GENERAL CONTRACTOR |
| THE WILBUR GROUP, INC. | CONSTRUCTION/REMODELING |
| THE WILDER COMPANIES, LTD. | REAL ESTATE MANAGEMENT & LEASING |
| WILDER & CHAVEZ LLC | REAL ESTATE DEVELOPMENT |
| THE WILEMPAT, L.L.C. | PURCHASE, REPAIR, RENOVATE, RENT AND SELL ALL KINDS OF REAL ESTATE FOR INVEST |
| THE WILLI MANAGEMENT CORPORATION | MANAGEMENT OF REAL ESTATE |
| THE WILLIAM FALL GROUP, INC. | REAL ESTATE VALUATION |
| THE WILLIAM GERALD GROUP LLC | TO OWN, OPERATE, SELL AND DEVELOP REAL ESTATE |
| THE WILLIAMSVILLE CENTER, LLC | OWNERSHIP AND INVESTMENT IN REAL ESTATE AND OWNERSHIP AND OPERATION OF AL |
| THE WILMAT COMPANY, INC. | RESIDENTIAL/COMMERCIAL CONSTRUCTION AND REMODELING |

3.2.2 The file containing many other detailed information

| Name of Corporation | Street Address | Street Address of Corporation Principal Office | Registered Agent | Description | Member Title | Member Individual Name | Member Address |
|--------------------------------------|----------------|--|---------------------|---------------------|--------------|------------------------|---|
| NETCOV MANAGED IT SERVICES LLC | 3 ELECTRONICS | 3 ELECTRONICS AVE UNIT 102, DANVERS, MA, 03 | .92: TERRANCE L LEI | MANAGED SERVICE P | MANAGER | TERRANCE L LEDGER | 19A BAYNS HILL ROAD BOXFORD, MA 01921 USA |
| NETCOV MANAGED IT SERVICES LLC | 3 ELECTRONICS | 3 ELECTRONICS AVE UNIT 102, DANVERS, MA, 0. | 92: TERRANCE L LEI | C MANAGED SERVICE P | ROVIDER FOR | INFORMATION TECHNOL | OGY SERVICES |
| NETCOV MANAGED IT SERVICES LLC | 3 ELECTRONICS | 3 ELECTRONICS AVE UNIT 102, DANVERS, MA, 03 | 92: TERRANCE L LEI | MANAGED SERVICE P | ROVIDER FOR | Information Technol | OGY SERVICES |
| NAIL STYLUS CORPOR | RATION | 55 OAKWOOD AVE 2. REVERE, MA. 02151, USA | | NAIL CARE SERVICE | PRESIDENT | BILLY K HUYNH | 55 OAKWOOD AVE. 2 REVERE. MA 02151 USA |
| NAIL STYLUS CORPOR | RATION | 55 OAKWOOD AVE 2, REVERE, MA, 02151, USA | | NAIL CARE SERVICE | PRESIDENT | BILLY KIM HUYNH | 55 OAKWOOD AVE #2 REVERE, MA 02151 USA |
| NAIL STYLUS CORPOR | RATION | 55 OAKWOOD AVE 2, REVERE, MA, 02151, USA | | NAIL CARE SERVICE | PRESIDENT | BILLY KIM HUYNH | 55 OAKWOOD AVE #2 REVERE, MA 02151 USA |
| NAIL STYLUS CORPOR | RATION | 55 OAKWOOD AVE 2, REVERE, MA, 02151, USA | | NAIL CARE SERVICE | PRESIDENT | BILLY KIM HUYNH | 55 OAKWOOD AVE #2 REVERE, MA 02151 USA |
| NAIL STYLUS CORPOR | RATION | 55 OAKWOOD AVE 2, REVERE, MA, 02151, USA | | NAIL CARE SERVICE | TREASURER | BILLY KIM HUYNH | 55 OAKWOOD AVE #2 REVERE, MA 02151 USA |
| NAIL STYLUS CORPOR | RATION | 55 OAKWOOD AVE 2, REVERE, MA, 02151, USA | | NAIL CARE SERVICE | SECRETARY | BILLY KIM HUYNH | 55 OAKWOOD AVE #2 REVERE, MA 02151 USA |
| NAIL STYLUS CORPORATION | | 55 OAKWOOD AVE 2, REVERE, MA, 02151, USA | | NAIL CARE SERVICE | DIRECTOR | BILLY KIM HUYNH | 55 OAKWOOD AVE #2 REVERE, MA 02151 USA |
| NATWELLS TRADING, | | 8 MIKAILA WAY, WOBURN, MA, 01801, USA | | ENERGY TRADING | PRESIDENT | HONGYANG LIU | 8 MIKAILA WAYWOBURN, MA 01801 USA |
| NATWELLS TRADING, INC. | | 8 MIKAILA WAY, WOBURN, MA, 01801, USA | | ENERGY TRADING | TREASURER | BECK CHEN | 8 MIKAILA WAYWOBURN, MA 01801 USA |
| NATWELLS TRADING, INC. | | 8 MIKAILA WAY, WOBURN, MA, 01801, USA | | ENERGY TRADING | SECRETARY | BECK CHEN | 8 MIKAILA WAYWOBURN, MA 01801 USA |
| NATWELLS TRADING, | | 8 MIKAILA WAY, WOBURN, MA, 01801, USA | | ENERGY TRADING | DIRECTOR | HONGYANG LIU | 8 MIKAILA WAYWOBURN, MA 01801 USA |
| NATWELLS TRADING, | | 8 MIKAILA WAY, WOBURN, MA, 01801, USA | | ENERGY TRADING | DIRECTOR | BECK CHEN | 8 MIKAILA WAYWOBURN, MA 01801 USA |
| NORTHEAST FLEX HE | | 251 FORGE RD., WESTPORT, MA, 02790, USA | | MANUFACTURER | PRESIDENT | CHARLES MICHAUD | 251 FORGE RD. WESTPORT, MA 02790 USA |
| NORTHEAST FLEX HE | ATERS, INC. | 251 FORGE RD., WESTPORT, MA, 02790, USA | | MANUFACTURER | PRESIDENT | CHARLES MICHAUD | 251 FORGE RD. WESTPORT, MA 02790 USA |

3.3 OCPF Data

After filtering OCPF data in the "Last_Name" column using the name of PACS, we can get the information under the "Committee" type as below.

| A | В | С | D | E | F | G | Н | - 1 | J | K | L | М | N | 0 | Р | Q | R S | Т | U | V | W | × |
|--------|------------|-----------------------|----------------|--------------|---------------|-------|------------|------------|----------|-------------|------------|-----------|-----------|---------------|---------------|--------------|-----------------------|------------|-------------|-------------|--------------|---------|
| mount | First_Name | Last_Name | Expr1003 | Address | City | State | Zip | Occupation | Employer | Contributor | Date | myDate | Report_ID | Full_Name | Full_Name_ | District | District_Cod Category | Report_Can | Report_Can | Report_Offi | Report_Com | ım_Name |
| 250.00 | | Sheet Metal Worker | s L 2015-01-22 | 1157 Adam | ns Dorchester | MA | 02124 | | | Committee | 2015-01-22 | 2015/1/22 | 215677 | Timothy J. T | Toomey Jr., | 26th Middle | 283 D | Timothy J. | Toomey Jr. | Cambridge | Toomey Cor | mmittee |
| 500.00 | | New England Region | na 2015-03-30 | 750 Dorche | ≅ Boston | MA | 02125-1132 | | | Committee | 2015-03-30 | 2015/3/30 | 217668 | Jason Palits | Palitsch, Jas | 11th Worce | 354 N | Jason | Palitsch | House, 11th | Palitsch Cor | nmittee |
| 500.00 | | Assoc Builders & Co | nt 2015-03-19 | 100 Unicor | n Woburn | MA | 01801 | | | Committee | 2015-03-19 | 2015/3/19 | 308915 | Hannah Kar | Kane, Hann | 11th Worce | 354 N | Hannah | Kane | House 11th | Kane Comm | ittee |
| 250.00 | | Ma & Northern Ne I | al 2015-04-06 | 7 Laborers' | Hopkinton | MA | 01748 | | | Committee | 2015-04-06 | 2015/4/6 | 537661 | Susannah N | Lee, Susann | 2nd Franklii | 241 N | Susannah N | Lee | House 2nd | Lee Commit | tee |
| 500.00 | | MA & Northern NE | La 2015-05-18 | 7 Laborers' | Hopkinton | MA | 01748 | | | Committee | 2015-05-18 | 2015/5/18 | 538302 | Denise Prov | Provost, De | 27th Middle | 284 N | Denise | Provost | House 27th | Provost Cor | nmittee |
| 500.00 | | MA Laborers' Distric | t (2015-04-30 | 7 Laborers' | Hopkinton | MA | 01748 | | | Committee | 2015-04-30 | 2015/4/30 | 538777 | Dennis Rosa | Rosa, Denn | 4th Worces | 347 N | Dennis | Rosa | House 4th V | Rosa Comm | ittee |
| 500.00 | | Ma & Northern Ne I | Lal 2015-05-22 | 7 Laborers' | Hopkinton | MA | 01748 | | | Committee | 2015-05-22 | 2015/5/22 | 538882 | Ellen Story | Story, Ellen | 3rd Hampsh | 257 N | Ellen | Story | House 3rd H | Story Comm | nittee |
| 250.00 | | MA Laborers' Distric | 1 (2015-04-21 | 7 Laborers' | Hopkinton | MA | 01748 | | | Committee | 2015-04-21 | 2015/4/21 | 538945 | Fred J. Barro | Barrows, Fre | 1st Bristol | 209 N | Fred J. | Barrows | House 1st B | Barrows Con | nmittee |
| 500.00 | | MA & Northern NE | La 2015-04-06 | 7 Laborers' | Hopkinton | MA | 01748 | | | Committee | 2015-04-06 | 2015/4/6 | 538961 | Josh Cutler | Cutler, Josh | 6th Plymou | 317 N | Josh | Cutler | House 6th F | Cutler Comr | nittee |
| 125.00 | | Carpenters Local Un | io 2015-06-03 | 21 Mazzeo | E Randolph | MA | 02368 | | | Committee | 2015-06-03 | 2015/6/3 | 538961 | Josh Cutler | Cutler, Josh | 6th Plymou | 317 N | Josh | Cutler | House 6th F | Cutler Comr | nittee |
| 250.00 | | Sheet Metal Worker | s L 2015-05-15 | 1157 Adam | ns Dorchester | MA | 02124 | | | Committee | 2015-05-15 | 2015/5/15 | 538961 | Josh Cutler | Cutler, Josh | 6th Plymou | 317 N | Josh | Cutler | House 6th F | Cutler Comr | nittee |
| 400.00 | | Ma Assoc, of Realto | rs 2015-03-21 | 1400 Main | S Waltham | MA | 02451 | | | Committee | 2015-03-21 | 2015/3/21 | 538961 | Josh Cutler | Cutler, Josh | 6th Plymou | 317 N | Josh | Cutler | House 6th F | Cutler Comr | nittee |
| 100.00 | | Int'l Union of Opera | tir 2015-06-15 | 16 Trotter I | D Medway | MA | 02053 | | | Committee | 2015-06-15 | 2015/6/15 | 538961 | Josh Cutler | Cutler, Josh | 6th Plymou | 317 N | Josh | Cutler | House 6th F | Cutler Comr | nittee |
| 250.00 | | Plumbers Union Loc | al 2015-06-17 | 1240 Massi | ac Boston | MA | 02125 | | | Committee | 2015-06-17 | 2015/6/17 | 538961 | Josh Cutler | Cutler, Josh | 6th Plymou | 317 N | Josh | Cutler | House 6th F | Cutler Comr | nittee |
| 500.00 | | MA & Northern NE | la 2015-05-01 | 7 Laborers' | Hookinton | MA | 01748 | | | Committee | 2015-05-01 | 2015/5/1 | 538972 | Ruth B. Bals | Balser, Ruth | 12th Middle | 269 N | Ruth B. | Balser | House 12th | Balser Comr | nittee |
| 300.00 | | MA Assoc. of Realto | | | | MA | 02451 | | | | 2015-04-08 | | | Stephen Ku | | | | Stephen | Kulik | House 1st F | Kulik Comm | ittee |
| 500.00 | | MA & Northern NE | | | | MA | 01748 | | | | 2015-04-18 | | | Stephen Ku | | | | Stephen | Kulik | House 1st F | Kulik Comm | ittee |
| 200.00 | | Real Estate Bar Asso | | | | MA | 02101 | | | | 2015-05-19 | | | Louis L. Kaf | | | | Louis L. | Kafka | | Kafka Comn | |
| 200.00 | | Greater Boston Real | | | | MA | 02108 | | | | 2015-05-19 | | | Louis L. Kaf | | | | Louis L. | Kafka | House 8th N | | |
| 500.00 | | MA & Northern NE | | | | | 01748 | | | | 2015-05-19 | | | Louis L. Kaf | | | | Louis L. | Kafka | House 8th N | | |
| 500.00 | | MA Laborers' Distric | | | | | 01748 | | | | 2015-03-22 | | | Angelo J. Pa | | | | | Puppolo Jr. | | | |
| 100.00 | | Carpenters Local #1 | | | | | 01108 | | | | 2015-06-19 | | | Angelo J. Pi | | | | Angelo J. | | House 12th | | |
| 200.00 | | Pipefitters Local #53 | | | | MA | 02134 | | | | 2015-06-20 | | | Angelo J. Pr | | | | Angelo J. | | House 12th | | |
| 500.00 | | Ma & Northern Ne L | | | | | 01748 | | | | 2015-06-26 | | | Todd M. Sm | | | | Todd M. | Smola | | Smola Com | |
| 500.00 | | Massachusetts & No | | | | | 01748-2684 | | | | 2015-04-01 | | | Paul J. Dona | | | | rodu IV. | Siliola | HOUSE ISLI | Friends of P | |
| 250.00 | | Sheet Metal Worker | | | | | 02124-5710 | | | | 2015-04-03 | | | Paul J. Dona | | | | | | | Friends of P | |
| 500.00 | | Ma & Northern Ne I | | | | | 01748 | | | | 2015-03-18 | | | Jennifer Ber | | | | Jennifer | Benson | | Benson Con | |
| 125.00 | | Nixon Peabody Llp | | | | NY | 14604 | | | Committee | | 2015/6/1 | | Jennifer Ber | | | | Jennifer | Benson | | Benson Con | |
| 500.00 | | International Brothe | | | | MA | 02122 | | | | 2015-06-02 | | | Jennifer Ber | | | | Jennifer | Benson | House 37th | | |
| 400.00 | | Ma Assoc, of Realto | | | | MA | 02122 | | | | 2015-06-02 | | | Jennifer Ber | | | | Jennifer | Benson | House 37th | | |
| 500.00 | | Pipefitters Local #53 | | | | MA | 02134 | | | | 2015-06-09 | | | Jennifer Ber | | | | Jennifer | Benson | House 37th | | |
| 500.00 | | Assoc Builders & Co | | | | MA | 01801 | | | | 2015-06-09 | | | Jennifer Ber | | | | Jennifer | Benson | House 37th | | |
| 200.00 | | Greater Boston Real | | | | MA | 02108 | | | | 2015-06-09 | | | Jennifer Ber | | | | Jennifer | Benson | House 37th | | |
| | | | | | | MA | 02108 | | | | | | | Jennifer Ber | | | | Jennifer | Benson | House 37th | | |
| 200.00 | | MA Systems Contrac | | | | | 02067 | | | | 2015-06-06 | | | Denise Garl | | | | Denise | Garlick | House 13th | | |
| 200.00 | | MA Building Trades | | | | | 02122 | | | | 2015-06-04 | | | | | | | | | | | |
| 500.00 | | MA Laborers' Distric | | | | | 01748 | | | | 2015-03-25 | | | Denise Garli | | | | Denise | Garlick | House 13th | | |
| 500.00 | | MA & Northern NE | | | | | 01748 | | | | 2015-06-11 | | | Cory Atkins | | | | Cory | Atkins | | Atkins Com | |
| 500.00 | | MA & Northern NE | | | | | | | | | 2015-04-03 | | | Tom Sannic | | | | Tom | | House 7th N | | |
| 200.00 | | Associated Subconti | | | | MA | 02109 | | | | 2015-05-27 | | | Tom Sannic | | | | Tom | | House 7th N | | |
| 100.00 | | Pipefitters Local #53 | | | | MA | 02134 | | | | 2015-02-27 | | | James Murp | | | | James | Murphy | | Murphy Cor | |
| 100.00 | | Ironworkers Union L | | | | | 02127 | | | | 2015-03-05 | | | James Murp | | | | James | | House 4th N | | |
| 250.00 | | International Brothe | | | | MA | 02122 | | | | 2015-03-09 | | | James Murp | | | | James | Murphy | | Murphy Cor | |
| 250.00 | | U.A. Plumbers and 0 | | | | MA | 02125 | | | | 2015-03-16 | | | James Murp | | | 300 N | James | Murphy | | Murphy Cor | |
| 100.00 | | Laborers Local 133 F | | | | MA | 02269 | | | | 2015-04-24 | | | James Murp | | | 300 N | James | Murphy | House 4th N | | |
| 500.00 | | MA & Northern NE | La 2015-04-24 | 7 Laborers | 1Hopkinton | MA | 01748 | | | Committee | 2015-04-24 | 2015/4/24 | 539249 | James Murp | Murphy, Jan | 4th Norfolk | 300 N | James | Murphy | House 4th N | Murphy Cor | nmittee |

4. Data

Presentation

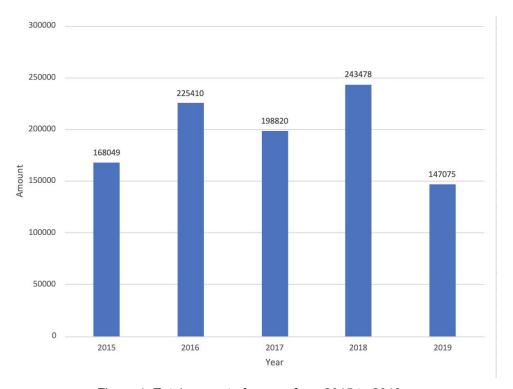


Figure 1: Total amount of money from 2015 to 2019

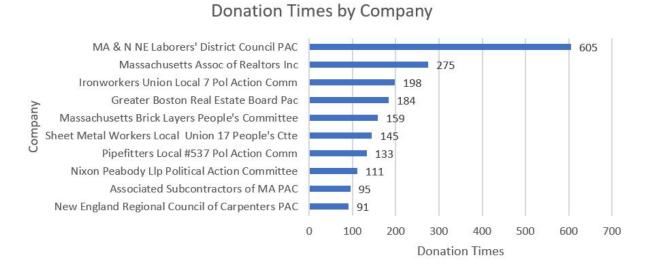


Figure 2: Top 10 companies which donated most times from 2015 to 2019

Donation Amount by Company

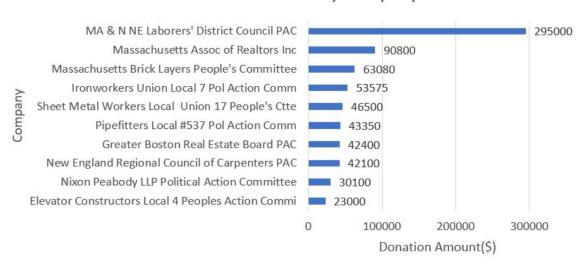


Figure 3: Top 10 companies which donated most money from 2015 to 2019

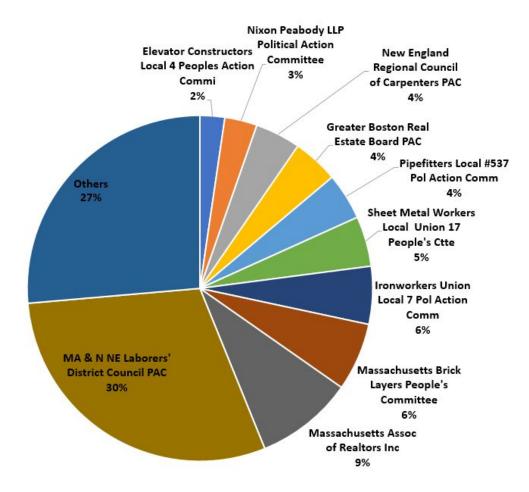


Figure 4: Distribution of donations from 2015 to 2019

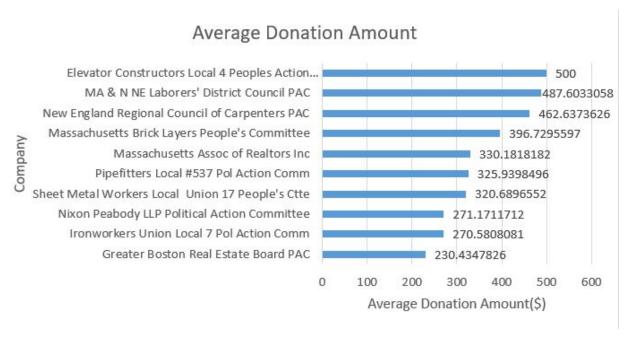


Figure 5: Top 10 average donation amount from 2015 to 2019



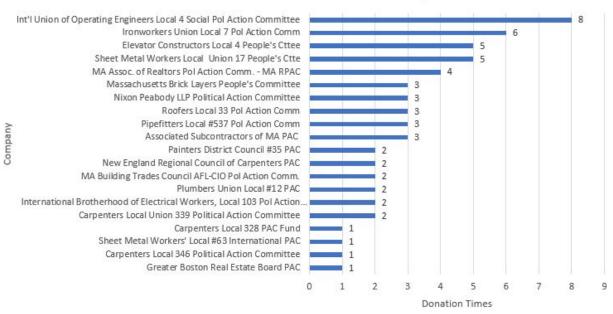


Figure 6: Companies which donated most times in November and December, 2019

Donation Amoutn in November and December, 2019

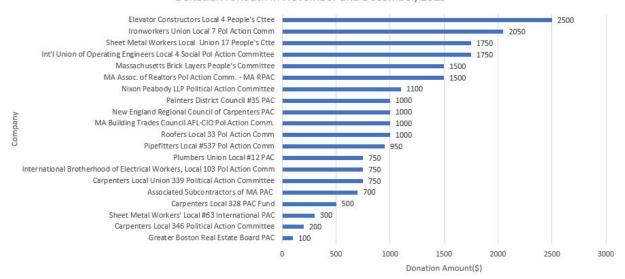


Figure 7: Companies which donated most money in November and December, 2019

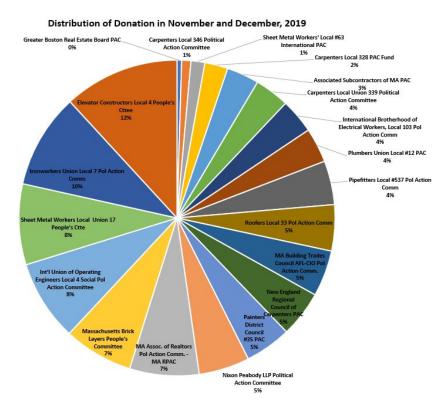


Figure 8: Distribution of donations in November and December, 2019

Average Donation in November and December, 2019

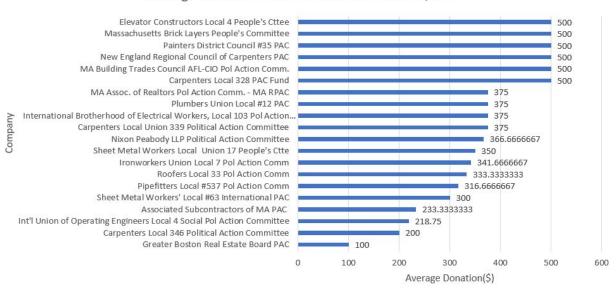


Figure 9: Average donation amount in November and December, 2019

5. Analysis

The question to be answered is "Which companies and unions and PACS are engaged in the political process through donations, i.e. donating most often to elected officials?".

Actually, we have answered 3 related questions:

- Who donated most often to elected officials?
 From figure 2, we can see that Ma & Northern NE Laborers' District Council PAC donated most times from 2015 to 2019. It donated more than 600 times while others donated up to 275 times.
- 2) Who donated the most money? From figure 3, we can see that Ma & Northern NE Laborers' District Council PAC donated most money from 2015 to 2019. It donated 295,000 dollars while others donated less than 100,000 dollars.
 - Also, from figure 4, there are more than 60 companies in total. "Others" include more than 50 companies, which took up only 27% of total donated money. However, the donation of *Ma & Northern NE Laborers' District Council PAC* took up 30%, which is more than the sum of 50 companies. No companies donated more than 10%.
- 3) Who made the most contributions? From figure 5, *Ma & Northern NE Laborers' District Council PAC* also ranks top 2 in the average donation amount list. Combining figures 1, 2, 3 and 4, we can conclude that *Ma & Northern NE Laborers' District Council PAC* has made the most contributions from 2015 to 2019.

Also, we were asked to analyze the data in November and December, 2019.

- 1) Who donated most often to elected officials?
 From figure 6, we can see that *Int'l Union of Operating Engineers Local 4 Social Pol Action Committee* donated most times in November and December, 2019. It donated 8 times while most companies donated less than 5 times.
- 2) Who donated the most money?
 - From figure 7, we can see that *Elevator Constructors Local 4 People's Cttee* donated most money in November and December, 2019. It donated 2,500 dollars while most companies donated less than 2,000 dollars.
 - Also, from figure 8, there are 20 companies in total. *Elevator Constructors Local 4 People's Cttee* took up 12% while others took up less than 10%.
- 3) Who made the most contributions?

 From figure 9, there are 6 companies that have the same rank in the average donation amount list. *Elevator Constructors Local 4 People's Cttee* ranks 1st in

the average donation amount list, ranks 4th in donation times list, and ranks 1st in donation amount list. Combining figures 6, 7, 8 and 9, we can conclude that *Elevator Constructors Local 4 People's Cttee* has made the most contributions in November and December, 2019.

6. Project Complexity and Team Creativity

6.1 Challenges and obstacles

- 1) Because of the huge amount of data, we cannot go to the next page when searching for some letters which contain more than hundreds millions of links. We solved this problem by choosing to show all links when searching the letters. Also, we search "aa" or "ab" etc. to reduce the number of links each time.
- 2) It is our first time doing scraping and we are not familiar with it. We spent a lot of time studying it.
- 3) When we were scraping the website, at first we were using Octoparse to scrape the website since it is very convenient. However, we were rejected by the website due to the high frequency of visiting. Then we chose to write our own Python code to do the scraping since it can modify the code so that we can solve the problem.
 - We added a random *sleep()* function in the code to reduce the frequency of visiting. Also, we tried to restart the chrome driver every 100 times downloading so that we wouldn't be rejected. Then we could download PDFs without rejecting.
- 4) Another problem is that there are millions of PDFs to download. We have been downloading for a whole week and we got only about 100,000 PDFs. It may take more than a month to download all the PDFs. Then our project manager provided us the data from Campaign Finance Team since we are using the same website and data.

6.2 Limitation

Although we have solved the problems and collected data successfully, there are still some limitations in our project. All the PDFs from the Secretary of Commonwealth's website do not have exactly the same format. When we were extracting information from PDFs, we may skip some PDFs with different formats automatically. So we may lose some data, which may cause a slight bias to our results.

6.3 Team Creativity

When solving the rejecting problem, we have tried many ways to solve the problem. Finally we find our own way to avoid being rejected. Adding *sleep()* function and restarting chrome driver every 100 downloads can solve the problem well.

6.4 Conclusion

In this project, we primarily learned two skills, scraping and extracting information from PDFs. These are completely new experiences to us. We have tried all kinds of ways to solve the problems in the process and then improved our ability of solving the problems. We really learned a lot in the project.