Week 3: Segmenting and Clustering Neighborhoods in Toronto In this assignment, you will be required to explore, segment, and cluster the neighborhoods in the city of Toronto. However, unlike New York, the neighborhood data is not readily available on the internet. What is interesting about the field of data science is that each project can be challenging in its unique way, so you need to learn to be agile and refine the skill to learn new libraries and tools quickly depending on the project. For the Toronto neighborhood data, a Wikipedia page exists that has all the information we need to explore and cluster the neighborhoods in Toronto. You will be required to scrape the Wikipedia page and wrangle the data, clean it, and then read it into a pandas dataframe so that it is in a structured format like the New York dataset. Once the data is in a structured format, you can replicate the analysis that we did to the New York City dataset to explore and cluster the neighborhoods in the city of Toronto. **Section 1** Use the Notebook to build the code to scrape the following Wikipedia page, https://en.wikipedia.org/wiki/List of postal codes of Canada: M, in order to obtain the data that is in the table of postal codes and to transform the data into a pandas dataframe. Import libraries In [1]: import requests import bs4 import lxml.html as lh import pandas as pd pd.set option('display.max\_rows',200) import folium In [2]: res = requests.get("https://en.wikipedia.org/wiki/List of postal codes of Canada: M") In [3]: | #Store the contents of the website under doc doc = lh.fromstring(res.content) In [4]: print(doc) <Element html at 0x2afd0b35ae0> In [5]: #Parse data that are stored between ... of HTML tr\_elements = doc.xpath('//tr') In [6]: | #Check the length of the first 12 rows [len(T) for T in tr\_elements[:12]] Out[6]: [3, 3, 3, 3, 3, 3, 3, 3, 3, 3] In [7]: #Parse Table Header tr\_elements = doc.xpath('//tr') In [8]: #Create empty list col=[] i=0 #For each row, store each first element (header) and an empty list for t in tr\_elements[0]: name=t.text\_content() print('%d:"%s"' %(i,name)) col.append((name,[])) 1:"Postal Code 2: "Borough 3:"Neighbourhood In [9]: print(col) [('Postal Code\n', []), ('Borough\n', []), ('Neighbourhood\n', [])] In [10]: col Out[10]: [('Postal Code\n', []), ('Borough\n', []), ('Neighbourhood\n', [])] type(col) In [11]: Out[11]: list col = [('Postal Code', []), ('Borough', []), ('Neighbourhood', [])] In [12]: In [13]: print(col) [('Postal Code', []), ('Borough', []), ('Neighbourhood', [])] In [14]: #Since out first row is the header, data is stored on the second row onwards for j in range(1,len(tr\_elements)): #T is our j'th row T=tr\_elements[j] #If row is not of size 3, the //tr data is not from our table **if** len(T)!=3: break #i is the index of our column #Iterate through each element of the row for t in T.iterchildren(): data=t.text\_content() #Check if row is empty **if** i>0: #Convert any numerical value to integers try: data=int(data) except: pass #Append the data to the empty list of the i'th column col[i][1].append(data) #Increment i for the next column In [15]: print(col) [('Postal Code', ['M1A\n', 'M2A\n', 'M3A\n', 'M5A\n', 'M6A\n', 'M7A\n', 'M8A\n', 'M9A\n', 'M 1B\n', 'M2B\n', 'M3B\n', 'M4B\n', 'M5B\n', 'M6B\n', 'M7B\n', 'M8B\n', 'M9B\n', 'M1C\n', 'M2C\n', 'M3C \n', 'M4C\n', 'M5C\n', 'M6C\n', 'M7C\n', 'M8C\n', 'M9C\n', 'M1E\n', 'M2E\n', 'M3E\n', 'M4E\n', 'M5E \n', 'M6E\n', 'M7E\n', 'M8E\n', 'M9E\n', 'M1G\n', 'M2G\n', 'M3G\n', 'M4G\n', 'M5G\n', 'M6G\n', 'M7G  $\label{eq:continuous} $$ \n', 'M9G\n', 'M1H\n', 'M2H\n', 'M3H\n', 'M4H\n', 'M5H\n', 'M6H\n', 'M7H\n', 'M8H\n', 'M9H\n', 'M9H\n'$  $\label{eq:lambda} $$ n', 'M1J\n', 'M2J\n', 'M3J\n', 'M4J\n', 'M5J\n', 'M6J\n', 'M7J\n', 'M8J\n', 'M9J\n', 'M1K\n', 'M2K\n', 'M2$ \n', 'M3K\n', 'M4K\n', 'M5K\n', 'M6K\n', 'M7K\n', 'M8K\n', 'M9K\n', 'M1L\n', 'M2L\n', 'M3L\n', 'M4L \n', 'M5L\n', 'M6L\n', 'M7L\n', 'M8L\n', 'M9L\n', 'M1M\n', 'M2M\n', 'M3M\n', 'M4M\n', 'M5M\n', 'M6M \n', 'M7M\n', 'M8M\n', 'M9M\n', 'M1N\n', 'M2N\n', 'M3N\n', 'M4N\n', 'M5N\n', 'M6N\n', 'M7N\n', 'M8N 'M9N\n', 'M1P\n', 'M2P\n', 'M3P\n', 'M4P\n', 'M5P\n', 'M6P\n', 'M7P\n', 'M8P\n', 'M9P\n', \n', 'M2R\n', 'M3R\n', 'M4R\n', 'M5R\n', 'M6R\n', 'M7R\n', 'M8R\n', 'M9R\n', 'M1S\n', 'M2S\n', 'M3S \n', 'M4S\n', 'M5S\n', 'M6S\n', 'M7S\n', 'M8S\n', 'M9S\n', 'M1T\n', 'M2T\n', 'M3T\n', 'M4T\n', 'M5T  $\label{eq:linear_n', 'M6T} $$ 'M7T\n', 'M8T\n', 'M9T\n', 'M1V\n', 'M2V\n', 'M3V\n', 'M4V\n', 'M5V\n', 'M6V\n', 'M7V\n', 'M7V\n'$  $\label{eq:control_n', 'M8V'n', 'M9V'n', 'M1W'n', 'M2W'n', 'M3W'n', 'M4W'n', 'M5W'n', 'M6W'n', 'M7W'n', 'M8W'n', 'M9W'n', 'M9W'n$  $\label{eq:lambda} $$ \n', 'M1X\n', 'M2X\n', 'M3X\n', 'M4X\n', 'M5X\n', 'M6X\n', 'M7X\n', 'M8X\n', 'M9X\n', 'M1Y\n', 'M2Y\n', 'M$ \n', 'M3Y\n', 'M4Y\n', 'M5Y\n', 'M6Y\n', 'M7Y\n', 'M8Y\n', 'M9Y\n', 'M1Z\n', 'M2Z\n', 'M3Z\n', 'M4Z  $\n'$ , 'M5Z\n', 'M6Z\n', 'M7Z\n', 'M8Z\n', 'M9Z\n', '\n']), ('Borough', ['Not assigned\n', 'Not assigned\n', 'Not assigned\n', 'Not assigned\n', 'M6Z\n', ' d\n', 'North York\n', 'North York\n', 'Downtown Toronto\n', 'North York\n', 'Downtown Toronto\n', 'No t assigned\n', 'Etobicoke\n', 'Scarborough\n', 'Not assigned\n', 'North York\n', 'East York\n', 'Down in the context of the second sec  $town \ Toronto \ '', \ 'North \ York \ '', \ 'Not \ assigned \ '', \ 'Etobicoke \ '', \ 'Scarborough \ '', \ '' \ North \ York \ '', \ '' \ North \ '', \ '' \ North \ York \ '', \ '' \ North \ York \ '', \ '' \ North \ York \ '' \ North \ York \ '', \ '' \ North \ York \ '',$ 'Not assigned\n', 'North York\n', 'East York\n', 'Downtown Toronto\n', 'York\n', 'Not assigned\n', 'N ot assigned\n', 'Etobicoke\n', 'Scarborough\n', 'Not assigned\n', 'Not assigned\n', 'East Toronto\n', 'Downtown Toronto\n', 'York\n', 'Not assigned\n', 'Not assigned\n', 'Not assigned\n', 'Scarborough \n', 'Not assigned\n', 'Not assigned\n', 'East York\n', 'Downtown Toronto\n', 'Downtown Toronto\n', 'Not assigned\n', 'Not assigned\n', 'Not assigned\n', 'Scarborough\n', 'North York\n', 'North York \n', 'East York\n', 'Downtown Toronto\n', 'West Toronto\n', 'Not assigned\n', 'Not assigned\n', 'Not  $assigned \verb|\| 'Scarborough \verb|\| 'North York \verb|\| 'North York \verb|\| 'East 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$\n'$ , 'Etobicoke $\n'$ , 'Scarborough $\n'$ , 'North York $\n'$ , 'Not assigned $\n'$ , 'Central Tor onto\n', 'Central Toronto\n', 'West Toronto\n', 'Mississauga\n', 'Not assigned\n', 'Etobicoke\n', 'Sc  $arborough \verb|\n', 'Not assigned \verb|\n', 'Central Toronto \verb|\n', 'Downtown Toronto \verb|\n', 'West Toronto \verb|\n', 'Mest Toronto \verb|\n', 'Not assigned \verb|\n', 'Not$ ronto\n', 'Not assigned\n', 'Not assigned\n', 'Not assigned\n', 'Scarborough\n', 'Not assigned\n', 'N ot assigned\n', 'Central Toronto\n', 'Downtown Toronto\n', 'Not assigned\n', 'Not assigned\n', 'Not a  $ssigned \verb|\n', 'Not assigned \verb|\n', 'Scarborough \verb|\n', 'Not assigned \verb|\n', 'Not assigned \verb|\n', 'Central Toronto assigned \verb|\n', 'Not assigned \|\n', 'N$ \n', 'Downtown Toronto\n', 'Not assigned\n', 'Not assigned\n', 'Etobicoke\n', 'Etobicoke\n', 'Scarbor  $ough\n'$ , 'Not assigned\n', 'Downtown Toronto\n', 'Downtown Toronto\n', 'Not assigned\n', 'Not assig  $d\n'$ , 'Not 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Gardens \ ', \ 'Garden \ District, \ Ryerson \ ', \ 'Glencairn \ ', \ 'Not \ assigned \ ', \ 'Not \ ', \ 'Not \ assigned \ ', \ 'Not \ ',$ ed\n', 'West Deane Park, Princess Gardens, Martin Grove, Islington, Cloverdale\n', 'Rouge Hill, Port Union, Highland Creek\n', 'Not assigned\n', 'Don Mills\n', 'Woodbine Heights\n', 'St. James Town\n', 'Humewood-Cedarvale\n', 'Not assigned\n', 'Not assigned\n', 'Eringate, Bloordale Gardens, Old Burnham thorpe, Markland Wood\n', 'Guildwood, Morningside, West Hill\n', 'Not assigned\n', 'Not assigned\n', 'The Beaches\n', 'Berczy Park\n', 'Caledonia-Fairbanks\n', 'Not assigned\n', 'Not assigned\n', 'Not a ssigned\n', 'Woburn\n', 'Not assigned\n', 'Not assigned\n', 'Leaside\n', 'Central Bay Street\n', 'Chr istie\n', 'Not assigned\n', 'Not assigned\n', 'Not assigned\n', 'Cedarbrae\n', 'Hillcrest Village\n', 'Bathurst Manor, Wilson Heights, Downsview North\n', 'Thorncliffe Park\n', 'Richmond, Adelaide, King  $\n', 'Dufferin, Dovercourt Village \n', 'Not 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Newtonbrook\n', 'Downsview\n', 'Studio Dis trict\n', 'Bedford Park, Lawrence Manor East\n', 'Del Ray, Mount Dennis, Keelsdale and Silverthorn  $\n', 'Not assigned\n', 'Not assigned\n', 'Humberlea, Emery\n', 'Birch Cliff, Cliffside West\n', 'Will Institute of the content of the conte$ owdale, Willowdale East\n', 'Downsview\n', 'Lawrence Park\n', 'Roselawn\n', 'Runnymede, The Junction North\n', 'Not assigned\n', 'Not assigned\n', 'Weston\n', 'Dorset Park, Wexford Heights, Scarborough Town Centre $\n'$ , 'York Mills West $\n'$ , 'Not assigned $\n'$ , 'Davisville North $\n'$ , 'Forest Hill North & Wes t, Forest Hill Road Park\n', 'High Park, The Junction South\n', 'Not assigned\n', 'Not assigned\n', to West, Lawrence Park\n', 'The Annex, North Midtown, Yorkville\n', 'Parkdale, Roncesvalles\n', 'Can ada Post Gateway Processing Centre\n', 'Not assigned\n', 'Kingsview Village, St. Phillips, Martin Gro ve Gardens, Richview Gardens $\n'$ , 'Agincourt $\n'$ , 'Not assigned $\n'$ , 'Not assigned $\n'$ , 'Davisville $\n'$ , 'Davisvil 'University of Toronto, Harbord\n', 'Runnymede, Swansea\n', 'Not assigned\n', 'Not assigned\n', 'Not assigned\n', "Clarks Corners, Tam O'Shanter, Sullivan\n", 'Not assigned\n', 'Not assigned\n', 'Moore Park, Summerhill East\n', 'Kensington Market, Chinatown, Grange Park\n', 'Not assigned\n', 'Not assig ned\n', 'Not assigned\n', 'Not assigned\n', "Milliken, Agincourt North, Steeles East, L'Amoreaux East \n", 'Not assigned\n', 'Not assigned\n', 'Summerhill West, Rathnelly, South Hill, Forest Hill SE, Dee r Park\n', 'CN Tower, King and Spadina, Railway Lands, Harbourfront West, Bathurst Quay, South Niagar a, Island airport\n', 'Not assigned\n', 'Not assigned\n', 'New Toronto, Mimico South, Humber Bay Shor es\n', 'South Steeles, Silverstone, Humbergate, Jamestown, Mount Olive, Beaumond Heights, Thistletow n, Albion Gardens\n', "Steeles West, L'Amoreaux West\n", 'Not assigned\n', 'Not assigned\n', 'Rosedal e\n', 'Stn A PO Boxes\n', 'Not assigned\n', 'Not assigned\n', 'Alderwood, Long Branch\n', 'Northwest, West Humber - Clairville $\n'$ , 'Upper Rouge $\n'$ , 'Not assigned $\n'$ , 'Not assigned $\n'$ , 'St. James Town, Ca bbagetown\n', 'First Canadian Place, Underground city\n', 'Not assigned\n', 'Not assigned\n', 'The Ki ngsway, Montgomery Road, Old Mill North\n', 'Not assigned\n', 'Not assigned\n', 'Not assigned\n', 'No t assigned\n', 'Church and Wellesley\n', 'Not assigned\n', 'Not assigned\n', 'Business reply mail Pro cessing Centre, South Central Letter Processing Plant Toronto\n', "Old Mill South, King's Mill Park, Sunnylea, Humber Bay, Mimico NE, The Queensway East, Royal York South East, Kingsway Park South East  $\n''$ , 'Not assigned $\n'$ ssigned\n', 'Not assigned\n', 'Not assigned\n', 'Mimico NW, The Queensway West, South of Bloor, Kings way Park South West, Royal York South West\n', 'Not assigned\n', '\n'])] In [16]: [len(C) for (title,C) in col] Out[16]: [181, 181, 181] In [17]: Dict = {title:column for (title,column) in col} df = pd.DataFrame(Dict) In [18]: df.head() Out[18]: **Postal Code Borough** Neighbourhood 0 M1A\n Not assigned\n Not assigned\n 1 M2A\n Not assigned\n Not assigned\n M3A\n North York\n Parkwoods\n Victoria Village\n 3 M4A\n North York\n Downtown Toronto\n Regent Park, Harbourfront\n In [19]: df.tail() Out[19]: **Postal Code** Borough Neighbourhood Not assigned\n 176 M6Z\n Not assigned\n 177 M7Z\n Not assigned\n Not assigned\n 178 M8Z\n Etobicoke\n Mimico NW, The Queensway West, South of Bloor,... 179 M9Z\n Not assigned\n Not assigned\n 180 Canadian postal codes\n \n In [20]: df.shape Out[20]: (181, 3) In [21]: #Remove \n df = df.replace('\n','', regex=True) In [22]: df Out[22]: **Postal Code Borough** Neighbourhood 0 M1A Not assigned Not assigned 1 M2A Not assigned Not assigned 2 МЗА North York Parkwoods 3 North York Victoria Village M4A Regent Park, Harbourfront 4 M5A **Downtown Toronto** 5 M6A North York Lawrence Manor, Lawrence Heights Queen's Park, Ontario Provincial Government 6 M7A **Downtown Toronto** 7 M8A Not assigned Not assigned 8 M9A Etobicoke Islington Avenue, Humber Valley Village 9 M<sub>1</sub>B Scarborough Malvern, Rouge 10 M2B Not assigned Not assigned 11 МЗВ Don Mills North York East York 12 M4B Parkview Hill, Woodbine Gardens 13 M5B **Downtown Toronto** Garden District, Ryerson North York 14 M6B Glencairn 15 M7B Not assigned Not assigned Not assigned 16 M8B Not assigned 17 M9B Etobicoke West Deane Park, Princess Gardens, Martin Grov... M<sub>1</sub>C Scarborough Rouge Hill, Port Union, Highland Creek 18 M2C 19 Not assigned Not assigned 20 M<sub>3</sub>C North York Don Mills M4C Woodbine Heights 21 East York 22 M5C **Downtown Toronto** St. James Town M6C Humewood-Cedarvale York 23 24 M7C Not assigned Not assigned 25 M8C Not assigned Not assigned Etobicoke M9C Eringate, Bloordale Gardens, Old Burnhamthorpe... 26 M1E 27 Scarborough Guildwood, Morningside, West Hill 28 M2E Not assigned Not assigned МЗЕ 29 Not assigned Not assigned 30 M4E East Toronto The Beaches M5E Berczy Park Downtown Toronto 31 Caledonia-Fairbanks 32 M6E York M7E 33 Not assigned Not assigned Not assigned 34 M8E Not assigned 35 M9E Not assigned Not assigned M<sub>1</sub>G Scarborough Woburn 36 Not assigned M2G 37 Not assigned Not assigned M3G Not assigned 38 M4G 39 East York Leaside 40 M5G **Downtown Toronto** Central Bay Street M6G **Downtown Toronto** Christie 41 Not assigned M7G Not assigned M8G 43 Not assigned Not assigned Not assigned 44 M9G Not assigned M1H Scarborough Cedarbrae 45 M2H North York Hillcrest Village 46 МЗН 47 North York Bathurst Manor, Wilson Heights, Downsview North East York M4H Thorncliffe Park 49 M5H **Downtown Toronto** Richmond, Adelaide, King M6H West Toronto Dufferin, Dovercourt Village 50 M7H Not assigned 51 Not assigned M8H Not assigned Not assigned 52 M9H Not assigned 53 Not assigned M1J Scarborough Scarborough Village M2J North York Fairview, Henry Farm, Oriole 55 M3J North York Northwood Park, York University 56 M4J East York East Toronto, Broadview North (Old East York) 57 M5J **Downtown Toronto** Harbourfront East, Union Station, Toronto Islands 58 59 M6J West Toronto Little Portugal, Trinity M7J Not assigned Not assigned 60 M8J Not assigned 61 Not assigned M9J Not assigned 62 Not assigned M1K Kennedy Park, Ionview, East Birchmount Park 63 Scarborough 64 M2K North York **Bayview Village** M3K North York Downsview 65 M4K East Toronto The Danforth West, Riverdale 67 M5K **Downtown Toronto** Toronto Dominion Centre, Design Exchange M6K West Toronto Brockton, Parkdale Village, Exhibition Place 68 M7K 69 Not assigned Not assigned M8K Not assigned Not assigned 70 M9K Not assigned 71 Not assigned M1L Scarborough Golden Mile, Clairlea, Oakridge York Mills, Silver Hills 73 M2L North York M3L North York Downsview M4L East Toronto India Bazaar, The Beaches West 75 76 M5L **Downtown Toronto** Commerce Court, Victoria Hotel M6L North York North Park, Maple Leaf Park, Upwood Park 77 78 M7L Not assigned Not assigned M8L Not assigned Not assigned 79 80 M9L North York **Humber Summit** M1M Cliffside, Cliffcrest, Scarborough Village West 81 Scarborough 82 M2M North York Willowdale, Newtonbrook 83 МЗМ North York Downsview 84 M4M **East Toronto** Studio District M5M North York Bedford Park, Lawrence Manor East 85 86 M6M York Del Ray, Mount Dennis, Keelsdale and Silverthorn Not assigned Not assigned 87 M7M 88 M8M Not assigned Not assigned 89 M9M North York Humberlea, Emery Birch Cliff, Cliffside West 90 M1N Scarborough M2N Willowdale, Willowdale East 91 North York 92 M3N North York Downsview 93 M4N Central Toronto Lawrence Park M5N Central Toronto Roselawn M6N 95 Runnymede, The Junction North York M7N Not assigned 96 Not assigned M8N 97 Not assigned Not assigned M9N York Weston 98 99 M1P Scarborough Dorset Park, Wexford Heights, Scarborough Town... M2P York Mills West 100 North York МЗР 101 Not assigned Not assigned M4P 102 Central Toronto Davisville North M5P Forest Hill North & West, Forest Hill Road Park 103 Central Toronto West Toronto 104 M6P High Park, The Junction South 105 M7P Not assigned Not assigned M8P Not assigned 106 Not assigned M9P 107 Etobicoke Westmount M1R Wexford, Maryvale 108 Scarborough 109 M2R North York Willowdale, Willowdale West M3R 110 Not assigned Not assigned M4R North Toronto West, Lawrence Park 111 Central Toronto M5R Central Toronto 112 The Annex, North Midtown, Yorkville M6R 113 West Toronto Parkdale, Roncesvalles Canada Post Gateway Processing Centre 114 M7R Mississauga M8R 115 Not assigned Not assigned Kingsview Village, St. Phillips, Martin Grove ... M9R 116 Etobicoke M1S Scarborough 117 Agincourt M2S Not assigned 118 Not assigned 119 M3S Not assigned Not assigned M4S Davisville 120 Central Toronto M5S **Downtown Toronto** University of Toronto, Harbord 121 M6S West Toronto Runnymede, Swansea 122 M7S 123 Not assigned Not assigned 124 M8S Not assigned Not assigned M9S 125 Not assigned Not assigned 126 M1T Clarks Corners, Tam O'Shanter, Sullivan Scarborough M2T 127 Not assigned Not assigned M3T 128 Not assigned Not assigned 129 M4T Central Toronto Moore Park, Summerhill East M5T **Downtown Toronto** Kensington Market, Chinatown, Grange Park 130 131 M6T Not assigned Not assigned 132 M7T Not assigned Not assigned 133 M8T Not assigned Not assigned 134 M9T Not assigned Not assigned M1V Scarborough Milliken, Agincourt North, Steeles East, L'Amo... 135 M2V 136 Not assigned Not assigned Not assigned M3V Not assigned 137 Summerhill West, Rathnelly, South Hill, Forest... 138 M4V Central Toronto M5V **Downtown Toronto** CN Tower, King and Spadina, Railway Lands, Har... 139 M7V Not assigned Not assigned 141 Etobicoke 142 M8V New Toronto, Mimico South, Humber Bay Shores South Steeles, Silverstone, Humbergate, Jamest... 143 M9V Etobicoke 144 M1W Scarborough Steeles West, L'Amoreaux West M2W Not assigned 145 Not assigned Not assigned 146 M3W Not assigned M4W Rosedale 147 **Downtown Toronto** Stn A PO Boxes 148 M5W **Downtown Toronto** M6W Not assigned 149 Not assigned 150 M7W Not assigned Not assigned Alderwood, Long Branch M8W Etobicoke 151 M9W 152 Etobicoke Northwest, West Humber - Clairville 153 M1X Scarborough Upper Rouge 154 M2X Not assigned Not assigned M3X Not assigned 155 Not assigned **Downtown Toronto** St. James Town, Cabbagetown 156 M4X M5X First Canadian Place, Underground city 157 **Downtown Toronto** 158 M6X Not assigned Not assigned M7X Not assigned Not assigned 159 160 M8X Etobicoke The Kingsway, Montgomery Road, Old Mill North M9X Not assigned Not assigned 161 162 M1Y Not assigned Not assigned 163 M2Y Not assigned Not assigned 164 M3Y Not assigned Not assigned M4Y **Downtown Toronto** Church and Wellesley 165 166 M5Y Not assigned Not assigned Not assigned Not assigned 167 M6Y 168 M7Y East Toronto Business reply mail Processing Centre, South C... Etobicoke Old Mill South, King's Mill Park, Sunnylea, Hu... 169 M8Y 170 M9Y Not assigned Not assigned 171 M1Z Not assigned Not assigned 172 M2Z Not assigned Not assigned 173 M3Z Not assigned Not assigned 174 M4Z Not assigned Not assigned M5Z Not assigned Not assigned 175 Not assigned 176 M6Z Not assigned M7Z Not assigned 177 Not assigned Etobicoke 178 M8Z Mimico NW, The Queensway West, South of Bloor,... 179 Not assigned Not assigned M9Z Canadian postal codes 180 In [23]: df.shape Out[23]: In [24]: #Remove the last row df = df[0:180]In [25]: df Out [25]: **Postal Code** Borough Neighbourhood Not assigned 0 M1A Not assigned 1 M2A Not assigned Not assigned 2 North York МЗА Parkwoods 3 M4A North York Victoria Village M5A **Downtown Toronto** Regent Park, Harbourfront 5 M6A North York Lawrence Manor, Lawrence Heights 6 M7A **Downtown Toronto** Queen's Park, Ontario Provincial Government 7 M8A Not assigned Not assigned 8 M9A Etobicoke Islington Avenue, Humber Valley Village 9 M<sub>1</sub>B Scarborough Malvern, Rouge 10 M2B Not assigned Not assigned МЗВ North York Don Mills 11 Parkview Hill, Woodbine Gardens 12 M4B East York Garden District, Ryerson 13 M5B **Downtown Toronto** 14 M6B North York Glencairn M7B Not assigned Not assigned 15 16 M8B Not assigned Not assigned West Deane Park, Princess Gardens, Martin Grov... 17 M9B Etobicoke 18 M1C Scarborough Rouge Hill, Port Union, Highland Creek Not assigned M2C 19 Not assigned Don Mills 20 M3C North York M4C East York Woodbine Heights 21 **Downtown Toronto** 22 M5C St. James Town 23 M6C York Humewood-Cedarvale 24 M7C Not assigned Not assigned M8C 25 Not assigned Not assigned 26 M9C Etobicoke Eringate, Bloordale Gardens, Old Burnhamthorpe... Scarborough M1E Guildwood, Morningside, West Hill 27 28 M2E Not assigned Not assigned МЗЕ 29 Not assigned Not assigned The Beaches 30 M4E East Toronto M5E **Downtown Toronto** Berczy Park 31 Caledonia-Fairbanks 32 M6E York 33 M7E Not assigned Not assigned 34 M8E Not assigned Not assigned M9E Not assigned 35 Not assigned 36 M1G Scarborough Woburn M2G 37 Not assigned Not assigned 38 M3G Not assigned Not assigned M4G East York 39 Leaside **Downtown Toronto** 40 M5G Central Bay Street **Downtown Toronto** Christie 41 M6G Not assigned 42 M7G Not assigned 43 Not assigned M8G Not assigned 44 M9G Not assigned Not assigned M1H 45 Scarborough Cedarbrae North York 46 M2H Hillcrest Village Bathurst Manor, Wilson Heights, Downsview North 47 МЗН North York M4H East York Thorncliffe Park **Downtown Toronto** 49 M5H Richmond, Adelaide, King West Toronto Dufferin, Dovercourt Village M6H M7H Not assigned 51 Not assigned 52 M8H Not assigned Not assigned М9Н Not assigned Not assigned 53 Scarborough Village M1J Scarborough North York Fairview, Henry Farm, Oriole 55 M2J Northwood Park, York University M3J North York East Toronto, Broadview North (Old East York) 57 M4J East York **Downtown Toronto** Harbourfront East, Union Station, Toronto Islands 58 M5J M6J West Toronto Little Portugal, Trinity 59 M7J Not assigned Not assigned M8J Not assigned Not assigned 61 Not assigned M9J Not assigned 63 M1K Kennedy Park, Ionview, East Birchmount Park Scarborough Bayview Village M2K North York M3K North York 65 Downsview East Toronto M4K The Danforth West, Riverdale 66 Toronto Dominion Centre, Design Exchange 67 M5K **Downtown Toronto** M6K West Toronto Brockton, Parkdale Village, Exhibition Place 68 M7K Not assigned Not assigned 69 M8K Not assigned Not assigned 70 71 M9K Not assigned Not assigned Golden Mile, Clairlea, Oakridge M1L Scarborough 73 M2L North York York Mills, Silver Hills North York M<sub>3</sub>L Downsview M4L India Bazaar, The Beaches West 75 East Toronto **Downtown Toronto** Commerce Court, Victoria Hotel M5L 77 M6L North York North Park, Maple Leaf Park, Upwood Park M7L Not assigned Not assigned 79 M8L Not assigned Not assigned M9L North York **Humber Summit** M1M Scarborough Cliffside, Cliffcrest, Scarborough Village West 81 Willowdale, Newtonbrook M2M North York МЗМ North York Downsview 83 M4M East Toronto Studio District Bedford Park, Lawrence Manor East M5M North York 85 Del Ray, Mount Dennis, Keelsdale and Silverthorn M6M 86 York 87 M7M Not assigned Not assigned M8M Not assigned Not assigned 88 89 M9M Humberlea, Emery North York M<sub>1</sub>N Birch Cliff, Cliffside West 90 Scarborough North York Willowdale, Willowdale East M2N 91 92 M3N North York Downsview M4N Central Toronto Lawrence Park 93 M5N Central Toronto Roselawn Runnymede, The Junction North 95 M6N York Not assigned M7N Not assigned Not assigned 97 M8N Not assigned 98 M9N York Weston M<sub>1</sub>P Dorset Park, Wexford Heights, Scarborough Town... 99 Scarborough 100 M2P North York York Mills West M3P 101 Not assigned Not assigned 102 M4P Central Toronto Davisville North 103 M5P Central Toronto Forest Hill North & West, Forest Hill Road Park 104 M6P West Toronto High Park, The Junction South 105 M7P Not assigned Not assigned 106 M8P Not assigned Not assigned M9P 107 Etobicoke Westmount 108 M1R Scarborough Wexford, Maryvale M2R Willowdale, Willowdale West 109 North York 110 M3R Not assigned Not assigned M4R North Toronto West, Lawrence Park 111 Central Toronto 112 M5R Central Toronto The Annex, North Midtown, Yorkville 113 M6R West Toronto Parkdale, Roncesvalles M7R Canada Post Gateway Processing Centre Mississauga 115 M8R Not assigned Not assigned 116 M9R Etobicoke Kingsview Village, St. Phillips, Martin Grove ... 117 M1S Scarborough Agincourt M2S 118 Not assigned Not assigned 119 M3S Not assigned Not assigned M4S Davisville 120 Central Toronto University of Toronto, Harbord 121 M5S **Downtown Toronto** 122 M6S West Toronto Runnymede, Swansea M7S 123 Not assigned Not assigned 124 M8S Not assigned Not assigned 125 M9S Not assigned Not assigned 126 M1T Scarborough Clarks Corners, Tam O'Shanter, Sullivan 127 M2T Not assigned Not assigned 128 МЗТ Not assigned Not assigned 129 M4T Central Toronto Moore Park, Summerhill East 130 M5T **Downtown Toronto** Kensington Market, Chinatown, Grange Park 131 M6T Not assigned Not assigned 132 M7T Not assigned Not assigned 133 M8T Not assigned Not assigned 134 M9T Not assigned Not assigned 136 M2V Not assigned Not assigned 137 M3V Not assigned Not assigned M4V Central Toronto Summerhill West, Rathnelly, South Hill, Forest... 138 139 M5V **Downtown Toronto** CN Tower, King and Spadina, Railway Lands, Har... 140 M6V Not assigned Not assigned M7V 141 Not assigned Not assigned 142 M8V Etobicoke New Toronto, Mimico South, Humber Bay Shores 143 M9V Etobicoke South Steeles, Silverstone, Humbergate, Jamest... Scarborough M1W Steeles West, L'Amoreaux West 144 M2W 145 Not assigned Not assigned M3W Not assigned 146 Not assigned 147 M4W **Downtown Toronto** Rosedale Stn A PO Boxes 148 M5W **Downtown Toronto** M6W Not assigned 149 Not assigned M7W Not assigned Not assigned 150 151 M8W Alderwood, Long Branch Etobicoke 152 M9W Etobicoke Northwest, West Humber - Clairville 153 M1X Scarborough **Upper Rouge** M2X 154 Not assigned Not assigned M3X 155 Not assigned Not assigned **Downtown Toronto** St. James Town, Cabbagetown 156 M4X 157 M5X **Downtown Toronto** First Canadian Place, Underground city M6X 158 Not assigned Not assigned 159 M7X Not assigned Not assigned M8X Etobicoke The Kingsway, Montgomery Road, Old Mill North 160 161 M9X Not assigned Not assigned Not assigned 162 M<sub>1</sub>Y Not assigned M2Y Not assigned 163 Not assigned M3Y Not assigned 164 Not assigned Church and Wellesley 165 M4Y **Downtown Toronto** 166 M5Y Not assigned Not assigned 167 M6Y Not assigned Not assigned M7Y **East Toronto** Business reply mail Processing Centre, South C... 168 M8Y Old Mill South, King's Mill Park, Sunnylea, Hu... 169 Etobicoke M9Y 170 Not assigned Not assigned M1Z Not assigned Not assigned 171 172 M2Z Not assigned Not assigned 173 M3Z Not assigned Not assigned M4Z 174 Not assigned Not assigned 175 M5Z Not assigned Not assigned M6Z 176 Not assigned Not assigned 177 M7Z Not assigned Not assigned 178 M8Z Etobicoke Mimico NW, The Queensway West, South of Bloor,... M9Z 179 Not assigned Not assigned

In [26]: | #Save to csv to check in Excel #df.to csv("canadapostalcodes.csv",index=False) **Data cleaning** In [27]: df.Borough.str.contains("Not assigned") Out[27]: 0 True 1 True 2 False 3 False 4 False 5 False 6 False 7 True False 8 9 False 10 True 11 False 12 False 13 False 14 False 15 True 16 True 17 False 18 False 19 True 20 False 21 False 22 False 23 False 24 True 25 True 26 False 27 False 28 True True 29 30 False 31 False 32 False 33 True 34 True 35 True 36 False 37 True 38 True 39 False 40 False 41 False 42 True 43 True 44 True 45 False 46 False 47 False 48 False 49 False 50 False 51 True 52 True 53 True 54 False False 55 56 False 57 False 58 False False 59 60 True 61 True 62 True 63 False 64 False 65 False 66 False False 67 68 False 69 True 70 True 71 True 72 False 73 False 74 False 75 False 76 False 77 False 78 True 79 True 80 False 81 False 82 False 83 False 84 False 85 False 86 False 87 True 88 True 89 False 90 False 91 False 92 False 93 False 94 False 95 False 96 True 97 True 98 False 99 False 100 False 101 True 102 False 103 False 104 False 105 True 106 True 107 False 108 False 109 False 110 True 111 False 112 False 113 False 114 False 115 True 116 False 117 False 118 True 119 True 120 False 121 False 122 False 123 True 124 True 125 True 126 False 127 True 128 True 129 False 130 False 131 132 True 133 True 134 True 135 False 136 True 137 True False 138 139 False 140 True 141 True 142 False 143 False 144 False 145 True 146 True False 147 148 False 149 True 150 True 151 False 152 False 153 False 154 True 155 True 156 False 157 False 158 True 159 True 160 False 161 True 162 True 163 True 164 True 165 False 166 True 167 True 168 False 169 False 170 True 171 True 172 True 173 True 174 True 175 True 176 True 177 True 178 False 179 True Name: Borough, dtype: bool In [28]: df1 = df[~df.Borough.str.contains("Not assigned")] In [29]: df1.shape Out[29]: (103, 3)In [30]: df1 Out[30]: **Postal Code Borough** Neighbourhood 2 МЗА North York Parkwoods 3 M4A North York Victoria Village M5A Regent Park, Harbourfront 4 **Downtown Toronto** 5 M6A North York Lawrence Manor, Lawrence Heights 6 M7A **Downtown Toronto** Queen's Park, Ontario Provincial Government M9A 8 Etobicoke Islington Avenue, Humber Valley Village 9 M1B Scarborough Malvern, Rouge МЗВ North York Don Mills 11 M4B East York Parkview Hill, Woodbine Gardens 12 M5B **Downtown Toronto** Garden District, Ryerson 13 14 M6B North York Glencairn 17 M9B Etobicoke West Deane Park, Princess Gardens, Martin Grov... 18 M1C Scarborough Rouge Hill, Port Union, Highland Creek 20 M3C North York Don Mills M4C East York Woodbine Heights 22 M5C **Downtown Toronto** St. James Town 23 M6C York Humewood-Cedarvale M9C Etobicoke Eringate, Bloordale Gardens, Old Burnhamthorpe... 26 Guildwood, Morningside, West Hill 27 M1E Scarborough 30 M4E **East Toronto** The Beaches 31 M5E **Downtown Toronto** Berczy Park 32 M6E Caledonia-Fairbanks York M1G 36 Scarborough Woburn 39 M4G East York Leaside Central Bay Street 40 M5G **Downtown Toronto** 41 M6G **Downtown Toronto** Christie Cedarbrae 45 M1H Scarborough 46 M2H North York Hillcrest Village Bathurst Manor, Wilson Heights, Downsview North 47 МЗН North York 48 M4H East York Thorncliffe Park 49 M5H **Downtown Toronto** Richmond, Adelaide, King 50 M6H West Toronto Dufferin, Dovercourt Village 54 M1J Scarborough Scarborough Village Fairview, Henry Farm, Oriole M2J North York 55 M3J North York Northwood Park, York University 56 East York 57 M4J East Toronto, Broadview North (Old East York) 58 M5J **Downtown Toronto** Harbourfront East, Union Station, Toronto Islands West Toronto M6J Little Portugal, Trinity 59 M1K Scarborough Kennedy Park, Ionview, East Birchmount Park Bayview Village M2K North York 64 65 M3K North York Downsview M4K **East Toronto** The Danforth West, Riverdale 66 **Downtown Toronto** 67 M5K Toronto Dominion Centre, Design Exchange Brockton, Parkdale Village, Exhibition Place 68 M6K West Toronto Golden Mile, Clairlea, Oakridge 72 M1L Scarborough 73 M2L North York York Mills, Silver Hills 74 M3L North York Downsview India Bazaar, The Beaches West M4L East Toronto 75 Commerce Court, Victoria Hotel 76 M5L **Downtown Toronto** M6L North York North Park, Maple Leaf Park, Upwood Park 77 80 M9L North York **Humber Summit** 81 M1M Scarborough Cliffside, Cliffcrest, Scarborough Village West M2M North York Willowdale, Newtonbrook Downsview 83 МЗМ North York M4M East Toronto Studio District 85 M5M North York Bedford Park, Lawrence Manor East 86 M6M York Del Ray, Mount Dennis, Keelsdale and Silverthorn North York M9M Humberlea, Emery 89 Birch Cliff, Cliffside West 90 M1N Scarborough 91 M2N North York Willowdale, Willowdale East M3N North York Downsview 93 M4N Lawrence Park Central Toronto M5N Central Toronto Roselawn M6N Runnymede, The Junction North 95 York Weston 98 M9N York 99 M1P Scarborough Dorset Park, Wexford Heights, Scarborough Town... 100 M2P North York 102 M4P Central Toronto Davisville North 103 M5P Central Toronto Forest Hill North & West, Forest Hill Road Park High Park, The Junction South 104 M6P West Toronto 107 M9P Etobicoke Westmount M1R Wexford, Maryvale 108 Scarborough North York Willowdale, Willowdale West 109 M2R M4R **Central Toronto** North Toronto West, Lawrence Park 111 112 M5R Central Toronto The Annex, North Midtown, Yorkville 113 M6R West Toronto Parkdale, Roncesvalles Mississauga 114 M7R Canada Post Gateway Processing Centre M9R 116 Etobicoke Kingsview Village, St. Phillips, Martin Grove ... Agincourt M1S Scarborough M4S Davisville 120 Central Toronto 121 M5S **Downtown Toronto** University of Toronto, Harbord M6S Runnymede, Swansea 122 West Toronto 126 M1T Scarborough Clarks Corners, Tam O'Shanter, Sullivan Moore Park, Summerhill East 129 M4T Central Toronto 130 M5T **Downtown Toronto** Kensington Market, Chinatown, Grange Park 135 M1V Scarborough Milliken, Agincourt North, Steeles East, L'Amo... Summerhill West, Rathnelly, South Hill, Forest... 138 M4V Central Toronto 139 M5V **Downtown Toronto** CN Tower, King and Spadina, Railway Lands, Har... Etobicoke 142 M8V New Toronto, Mimico South, Humber Bay Shores M9V 143 Etobicoke South Steeles, Silverstone, Humbergate, Jamest... 144 M1W Scarborough Steeles West, L'Amoreaux West **Downtown Toronto** 147 M4W Rosedale 148 M5W **Downtown Toronto** Stn A PO Boxes M8W Alderwood, Long Branch 151 Etobicoke 152 M9W Etobicoke Northwest, West Humber - Clairville 153 M1X Scarborough Upper Rouge 156 **Downtown Toronto** St. James Town, Cabbagetown First Canadian Place, Underground city 157 M5X **Downtown Toronto** The Kingsway, Montgomery Road, Old Mill North 160 Etobicoke 165 M4Y **Downtown Toronto** Church and Wellesley M7Y East Toronto Business reply mail Processing Centre, South C... 168 M8Y Old Mill South, King's Mill Park, Sunnylea, Hu... 169 Etobicoke M8Z Etobicoke Mimico NW, The Queensway West, South of Bloor,... In [31]: df1.reset\_index(drop=True,inplace=True) In [32]: #See and check all rows Out[32]: **Postal Code Borough** Neighbourhood 0 МЗА North York Parkwoods 1 M4A North York Victoria Village M5A **Downtown Toronto** Regent Park, Harbourfront 3 M6A North York Lawrence Manor, Lawrence Heights M7A **Downtown Toronto** Queen's Park, Ontario Provincial Government 5 M9A Etobicoke Islington Avenue, Humber Valley Village 6 M1B Scarborough Malvern, Rouge 7 МЗВ North York Don Mills 8 M4B East York Parkview Hill, Woodbine Gardens 9 **Downtown Toronto** M5B Garden District, Ryerson 10 M6B North York Glencairn M9B West Deane Park, Princess Gardens, Martin Grov... Etobicoke 11 M1C Scarborough Rouge Hill, Port Union, Highland Creek 13 МЗС North York Don Mills M4C East York Woodbine Heights 14 M5C **Downtown Toronto** St. James Town 15 M6C Humewood-Cedarvale M9C Etobicoke Eringate, Bloordale Gardens, Old Burnhamthorpe... 17 M1E Guildwood, Morningside, West Hill 18 Scarborough M4E East Toronto The Beaches 19 **Downtown Toronto** 20 M5E Berczy Park 21 M6E York Caledonia-Fairbanks 22 M<sub>1</sub>G Scarborough Woburn 23 M4G East York Leaside Central Bay Street 24 M5G **Downtown Toronto** 25 M6G **Downtown Toronto** Christie M1H Cedarbrae 26 Scarborough M2H North York Hillcrest Village 27 МЗН Bathurst Manor, Wilson Heights, Downsview North 28 North York Thorncliffe Park 29 M4H East York Richmond, Adelaide, King 30 M5H **Downtown Toronto** 31 M6H West Toronto Dufferin, Dovercourt Village 32 M1J Scarborough Scarborough Village 33 M2J North York Fairview, Henry Farm, Oriole Northwood Park, York University 34 M3J North York M4J East Toronto, Broadview North (Old East York) 35 East York Harbourfront East, Union Station, Toronto Islands 36 M5J **Downtown Toronto** 37 M6J West Toronto Little Portugal, Trinity M1K Scarborough Kennedy Park, Ionview, East Birchmount Park 38 M2K North York 39 **Bayview Village** M3K North York 40 Downsview M4K East Toronto The Danforth West, Riverdale 41 42 M5K **Downtown Toronto** Toronto Dominion Centre, Design Exchange M6K West Toronto Brockton, Parkdale Village, Exhibition Place 43 Scarborough M1L Golden Mile, Clairlea, Oakridge 44 M2L North York York Mills, Silver Hills 45 M3L North York Downsview 46 47 M4L East Toronto India Bazaar, The Beaches West **Downtown Toronto** Commerce Court, Victoria Hotel 48 M5L M6L North York North Park, Maple Leaf Park, Upwood Park 49 M9L North York 50 **Humber Summit** Cliffside, Cliffcrest, Scarborough Village West 51 M1M Scarborough Willowdale, Newtonbrook 52 M2M North York M3M North York 53 Downsview M4M **East Toronto** Studio District 54 Bedford Park, Lawrence Manor East 55 M5M North York M6M Del Ray, Mount Dennis, Keelsdale and Silverthorn 56 York M9M North York Humberlea, Emery 57 M<sub>1</sub>N Scarborough Birch Cliff, Cliffside West 58 M2N North York Willowdale, Willowdale East 59 M3N North York 60 Downsview M4N Central Toronto Lawrence Park 61 62 M5N Central Toronto Roselawn M6N Runnymede, The Junction North 63 York M9N Weston 64 York M1P Dorset Park, Wexford Heights, Scarborough Town... 65 Scarborough M2P North York York Mills West 66 M4P Central Toronto Davisville North 67 M5P Central Toronto Forest Hill North & West, Forest Hill Road Park 68 M6P West Toronto High Park, The Junction South 69 M9P Etobicoke Westmount 70 Wexford, Maryvale 71 M1R Scarborough 72 M2R North York Willowdale, Willowdale West M4R **Central Toronto** North Toronto West, Lawrence Park 73 74 M5R Central Toronto The Annex, North Midtown, Yorkville M6R West Toronto Parkdale, Roncesvalles 75 M7R Canada Post Gateway Processing Centre 76 Mississauga M9R Etobicoke Kingsview Village, St. Phillips, Martin Grove ... 77 M1S Agincourt 78 Scarborough M4S Central Toronto Davisville 79 **Downtown Toronto** University of Toronto, Harbord 80 M5S M6S 81 West Toronto Runnymede, Swansea 82 M1T Scarborough Clarks Corners, Tam O'Shanter, Sullivan M4T 83 Central Toronto Moore Park, Summerhill East 84 M5T **Downtown Toronto** Kensington Market, Chinatown, Grange Park Scarborough Milliken, Agincourt North, Steeles East, L'Amo... 85 M1V M4V 86 Central Toronto Summerhill West, Rathnelly, South Hill, Forest... CN Tower, King and Spadina, Railway Lands, Har... 87 M5V **Downtown Toronto** New Toronto, Mimico South, Humber Bay Shores 88 M8V Etobicoke M9V 89 Etobicoke South Steeles, Silverstone, Humbergate, Jamest... Steeles West, L'Amoreaux West 90 M1W Scarborough 91 M4W **Downtown Toronto** Rosedale 92 M5W **Downtown Toronto** Stn A PO Boxes M8W 93 Etobicoke Alderwood, Long Branch M9W Etobicoke Northwest, West Humber - Clairville 94 95 M1X Scarborough Upper Rouge **Downtown Toronto** 96 M4X St. James Town, Cabbagetown **Downtown Toronto** First Canadian Place, Underground city 97 M5X Etobicoke 98 M8X The Kingsway, Montgomery Road, Old Mill North **Downtown Toronto** Church and Wellesley 99 M4Y **East Toronto** 100 M7Y Business reply mail Processing Centre, South C... Old Mill South, King's Mill Park, Sunnylea, Hu... 101 M8Y Etobicoke 102 M8Z Etobicoke Mimico NW, The Queensway West, South of Bloor,... In [33]: print("The number of rows of the dataframe:", dfl.shape) The number of rows of the dataframe: (103, 3) #df1.to csv('postcodecleaned.csv',index=False) #save a csv file In [34]: Section 2 Now that you have built a dataframe of the postal code of each neighborhood along with the borough name and neighborhood name, in order to utilize the Foursquare location data, we need to get the latitude and the longitude coordinates of each neighborhood. Use the Geocoder package or the csv file to create the following dataframe In [35]: #Import the geospatial data geodata = pd.read csv('Geospatial Coordinates.csv') In [36]: geodata.head() Out[36]: Latitude Longitude Postcode 0 M1B 43.806686 -79.194353 1 M1C 43.784535 -79.160497 43.763573 -79.188711 3 43.770992 -79.216917 M1G M1H 43.773136 -79.239476 In [37]: df1.head() Out[37]: Postal Code **Borough** Neighbourhood 0 МЗА North York Parkwoods 1 M4A North York Victoria Village **Downtown Toronto** Regent Park, Harbourfront 2 M5A 3 M6A North York Lawrence Manor, Lawrence Heights M7A df2 = df1.merge(geodata, how="inner", left on="Postal Code", right on="Postcode") In [38]: **Dataframe for Section 2 is below:** In [39]: df2.head() Out[39]: **Postal Code** Borough Neighbourhood Postcode Latitude Longitude North York 43.753259 -79.329656 МЗА Parkwoods МЗА Victoria Village 1 M4A North York M4A 43.725882 -79.315572 2 M5A **Downtown Toronto** Regent Park, Harbourfront M5A 43.654260 -79.360636 3 M6A North York Lawrence Manor, Lawrence Heights M6A 43.718518 -79.464763 M7A 43.662301 -79.389494 In [40]: df2.drop(["Postcode"],axis=1,inplace=True) In [41]: df2 Out[41]: Neighbourhood **Postal Code** Borough Latitude Longitude -79.329656 0 МЗА North York 43.753259 Parkwoods 1 M4A North York Victoria Village 43.725882 -79.315572 2 M5A **Downtown Toronto** Regent Park, Harbourfront 43.654260 -79.360636 3 M6A North York Lawrence Manor, Lawrence Heights 43.718518 -79.464763 4 M7A **Downtown Toronto** Queen's Park, Ontario Provincial Government 43.662301 -79.389494 5 Islington Avenue, Humber Valley Village 43.667856 M9A Etobicoke -79.532242 Malvern, Rouge 6 M<sub>1</sub>B Scarborough 43.806686 -79.194353 7 МЗВ North York Don Mills 43.745906 -79.352188 8 M4B Parkview Hill, Woodbine Gardens East York 43.706397 -79.309937 9 M5B **Downtown Toronto** Garden District, Ryerson 43.657162 -79.378937 Glencairn 10 M6B North York 43.709577 -79.445073 11 M9B Etobicoke West Deane Park, Princess Gardens, Martin Grov... 43.650943 12 M1C Scarborough Rouge Hill, Port Union, Highland Creek 43.784535 -79.160497 43.725900 13 M3C North York Don Mills -79.340923 14 M4C -79.318389 East York Woodbine Heights 43.695344 15 M5C **Downtown Toronto** St. James Town 43.651494 -79.375418 43.693781 M6C Humewood-Cedarvale -79.428191 16 York 17 M9C Etobicoke Eringate, Bloordale Gardens, Old Burnhamthorpe... 43.643515 -79.577201 M1E Guildwood, Morningside, West Hill 18 Scarborough 43.763573 -79.188711 The Beaches 43.676357 -79.293031 19 M4E East Toronto Berczy Park 43.644771 -79.373306 20 M5E **Downtown Toronto** 21 M6E York Caledonia-Fairbanks 43.689026 -79.453512 Scarborough Woburn 43.770992 -79.216917 22 M<sub>1</sub>G Leaside 23 M4G East York 43.709060 -79.363452 24 **Downtown Toronto** Central Bay Street M5G 43.657952 -79.387383 -79.422564 25 M6G **Downtown Toronto** Christie 43.669542 M1H -79.239476 26 Scarborough Cedarbrae 43.773136 27 M2H North York Hillcrest Village 43.803762 -79.363452 North York Bathurst Manor, Wilson Heights, Downsview North 28 МЗН 43.754328 -79.442259 29 M4H East York Thorncliffe Park 43.705369 -79.349372 30 **Downtown Toronto** -79.384568 M5H Richmond, Adelaide, King 43.650571 West Toronto 31 M6H Dufferin, Dovercourt Village 43.669005 -79.442259 M1J Scarborough Village 32 Scarborough 43.744734 -79.239476 33 M2J North York Fairview, Henry Farm, Oriole 43.778517 -79.346556 Northwood Park, York University M3J 43.767980 34 North York -79.487262 East Toronto, Broadview North (Old East York) 35 M4J East York Harbourfront East, Union Station, Toronto Islands -79.381752 36 M5J **Downtown Toronto** 43.640816 37 M6J West Toronto Little Portugal, Trinity 43.647927 38 M1K Kennedy Park, Ionview, East Birchmount Park Scarborough 43.727929 -79.262029 Bayview Village 39 M2K North York 43.786947 -79.385975 40 M3K North York Downsview 43.737473 -79.464763 **East Toronto** The Danforth West, Riverdale 43.679557 41 M4K M5K **Downtown Toronto** Toronto Dominion Centre, Design Exchange 43.647177 42 -79.381576 43 M6K West Toronto Brockton, Parkdale Village, Exhibition Place 43.636847 -79.428191 43.711112 M1L Golden Mile, Clairlea, Oakridge 44 Scarborough -79.284577 M2L North York York Mills, Silver Hills 43.757490 46 M3L North York Downsview 43.739015 -79.506944 M4L East Toronto India Bazaar, The Beaches West 43.668999 Commerce Court, Victoria Hotel 43.648198 M5L **Downtown Toronto** 48 -79.379817 -79.490074 49 M6L North York North Park, Maple Leaf Park, Upwood Park 43.713756 M9L -79.565963 North York **Humber Summit** 43.756303 50 Scarborough M1M Cliffside, Cliffcrest, Scarborough Village West 43.716316 -79.239476 M2M North York Willowdale, Newtonbrook 43.789053 52 -79.408493 53 МЗМ North York Downsview 43.728496 -79.495697 M4M Studio District 43.659526 -79.340923 54 East Toronto 55 M5M North York Bedford Park, Lawrence Manor East 43.733283 Del Ray, Mount Dennis, Keelsdale and Silverthorn 56 M6M York 43.691116 -79.476013 57 M9M North York Humberlea, Emery 43.724766 Birch Cliff, Cliffside West 43.692657 -79.264848 M1N 58 Scarborough 59 M2N North York Willowdale, Willowdale East 43.770120 -79.408493 M3N North York Downsview 43.761631 -79.520999 60 M4N Central Toronto Lawrence Park 43.728020 -79.388790 M5N 43.711695 -79.416936 62 Central Toronto Roselawn -79.487262 M6N York Runnymede, The Junction North 43.673185 63 M9N 64 York Weston 43.706876 -79.518188 Dorset Park, Wexford Heights, Scarborough Town... 65 M1P Scarborough 43.757410 66 M2P North York York Mills West 43.752758 -79.400049 67 M4P Central Toronto Davisville North 43.712751 -79.390197 M5P 68 Forest Hill North & West, Forest Hill Road Park 43.696948 Central Toronto -79.411307 69 M6P West Toronto High Park, The Junction South 43.661608 -79.464763 Westmount 43.696319 70 M9P -79.532242 Etobicoke -79.295849 71 M1R Scarborough Wexford, Maryvale 43.750072 M2R North York Willowdale, Willowdale West 43.782736 -79.442259 72 73 M4R Central Toronto North Toronto West, Lawrence Park 43.715383 -79.405678 M5R The Annex, North Midtown, Yorkville 74 Central Toronto 43.672710 -79.405678 West Toronto 75 M6R Parkdale, Roncesvalles 43.648960 -79.456325 76 M7R Mississauga Canada Post Gateway Processing Centre 43.636966 -79.615819 77 M9R Etobicoke Kingsview Village, St. Phillips, Martin Grove ... 43.688905 Agincourt 43.794200 78 M1S Scarborough -79.262029 79 M4S Central Toronto Davisville 43.704324 -79.388790 **Downtown Toronto** University of Toronto, Harbord 43.662696 -79.400049 80 M5S 81 M6S West Toronto Runnymede, Swansea 43.651571 -79.484450 M1T Clarks Corners, Tam O'Shanter, Sullivan 43.781638 -79.304302 82 Scarborough 83 M4T Central Toronto Moore Park, Summerhill East 43.689574 -79.383160 Kensington Market, Chinatown, Grange Park 43.653206 84 M5T **Downtown Toronto** -79.400049 85 M1V Scarborough Milliken, Agincourt North, Steeles East, L'Amo... M4V 86 Central Toronto Summerhill West, Rathnelly, South Hill, Forest... 43.686412 -79.400049 87 M5V **Downtown Toronto** CN Tower, King and Spadina, Railway Lands, Har... M8V New Toronto, Mimico South, Humber Bay Shores 88 Etobicoke 43.605647 -79.501321 89 M9V Etobicoke South Steeles, Silverstone, Humbergate, Jamest... -79.588437 M1W Scarborough Steeles West, L'Amoreaux West 43.799525 -79.318389 90 91 M4W **Downtown Toronto** Rosedale 43.679563 -79.377529 M5W Stn A PO Boxes 43.646435 -79.374846 92 **Downtown Toronto** 93 M8W Etobicoke Alderwood, Long Branch 43.602414 94 M9W Northwest, West Humber - Clairville Etobicoke 43.706748 -79.594054 95 M1X Scarborough **Upper Rouge** 43.836125 -79.205636 St. James Town, Cabbagetown **Downtown Toronto** 96 M4X 43.667967 -79.367675 First Canadian Place, Underground city 97 M5X **Downtown Toronto** 43.648429 -79.382280 98 M8X Etobicoke The Kingsway, Montgomery Road, Old Mill North 43.653654 -79.506944 Church and Wellesley 99 M4Y **Downtown Toronto** 43.665860 -79.383160 100 M7Y East Toronto Business reply mail Processing Centre, South C... 43.662744 -79.321558 101 M8Y Etobicoke Old Mill South, King's Mill Park, Sunnylea, Hu... 43.636258 -79.498509 M8Z 102 Mimico NW, The Queensway West, South of Bloor,... 43.628841 -79.520999 #df2.to\_csv("postalcodecomplete.csv",index=False) In [42]: **Section 3** Explore and cluster the neighborhoods in Toronto. You can decide to work with only boroughs that contain the word Toronto and then replicate the same analysis we did to the New York City data. It is up to you. (df2["Borough"] == "Mississauga").value\_counts() In [43]: Out[43]: False 102 True Name: Borough, dtype: int64 In [44]: latitude = 43.636966longitude = -79.615819In [45]: # Create map of Mississauga using latitude and longitude values map = folium.Map(location=[latitude, longitude], zoom start=11) In [46]: map Out[46]: 427 Brampton Toronto Billy Bishop Toronto City Airport Mississauga lton Leaflet | Data by © OpenStreetMap, under ODbL. In [47]: #Define markers tooltip = 'Click me!' folium.Marker([latitude,longitude], popup='<b>Canada Post Gateway Processing Centre</b>', tooltip=toolt ip) .add\_to(map) Out[47]: <folium.map.Marker at 0x2afd0c546a0>

