Peoples_IST736_Notebook

March 10, 2019

```
In [9]: import json
       import tweepy
       import pandas as pd
       auth = tweepy.OAuthHandler([REDACTED], [REDACTED])
       auth.set_access_token([REDACTED], [REDACTED])
       api = tweepy.API(auth)
       members = []
       names = []
       for member in tweepy.Cursor(api.list_members
                                    'members-of-congress').items():
           members.append(member.screen_name)
           names.append(member.name)
       congress = pd.DataFrame(data={'Name':names,'Twitter':members})
       congress.to_csv('./congress.csv')
In [11]: congress = pd.read_csv('./congress.csv'
                               , encoding = 'latin-1')
        congress.head()
Out[11]:
                         Name Congress
                                             State District
                                                                  Year Seniority \
              Abby Finkenauer
                                              Iowa
                                                          1 1/3/2019
                                    H Virginia
           Abigail Spanberger
                                                          7 1/3/2019
                                                                               0
        1
                                                        14 1/3/2019
        2
               Adam Kinzinger
                                    H
                                          New York
                                                                               0
                  Adam Schiff
                                                         3 1/3/2019
        3
                                    H New Jersey
                                                                               0
                 Adrian Smith
                                    Η
                                          Michigan
                                                           9 1/3/2019
          Party
                        Twitter
                  RepFinkenauer
        0
                  RepSpanberger
        2
                   RepKinzinger
        3
                  RepAdamSchiff
              D RepAdrianSmith
In [12]: congress.describe()
```

```
Out[12]:
                  District
                            Seniority
        count 527.000000 527.000000
        mean
                  8.248577
                            8.191651
        std
                 10.465264 8.436482
        min
                  0.000000 0.000000
        25%
                  1.000000
                              2.000000
        50%
                  4.000000
                           6.000000
        75%
                 11.000000
                             12.000000
                 53.000000
                            46.000000
        max
In [68]: # tk, tk2, tka, tka2 are redacted App API Keys from Twitter Developer
         auth = tweepy.OAuthHandler(tk, tk2)
         auth.set_access_token(tka, tka2)
         api = tweepy.API(auth)
         import datetime
         import time
         from tqdm import tqdm_notebook as tqdm
         import re
         import emoji
        RE_EMOJI = emoji.get_emoji_regexp()
         def strip_emoji(text):
             return RE_EMOJI.sub(r'', text)
         for member in congress['Twitter']:
             while True:
                 try:
                     tweets = []
                     with open("./congress/"+member+".txt", "wb") as text_file:
                         for status in tweepy.Cursor(api.user_timeline
                                                 , id=member
                                                 , tweet_mode='extended').items(200):
                             text = status.full_text.replace(
                                 '\n','').translate(non_bmp_map)
                             text = ' '.join(
                                 word for word in text.split(' ') if 'http' not in word)
                             text = ' '.join(
                                 word for word in text.split(' ') if '&amp' not in word)
                             text = strip_emoji(text+'\n').encode('utf-8')
                             tweets.append(text)
                             text_file.write(text)
                     print(member, len(tweets))
                 except:
                     print("Rate limit exceeded")
                     for i in tqdm(range(60*15)):
                         time.sleep(1)
```

continue

break

RepFinkenauer 85 RepSpanberger 200 RepKinzinger 200 RepAdamSchiff 200 RepAdrianSmith 200 RepEspaillat 200 RepAlGreen 200 RepLowenthal 200 RepSires 200 RepHastingsFL 200 RepAlexMooney 200 RepAOC 16 RepAlLawsonJr 200 RepAdams 200 RepAmata 200 RepBera 200 SenAmyKlobuchar 200 RepAndreCarson 200 RepAndyHarrisMD 200 RepAndyKimNJ 110 RepAndyBarr 200 RepAndyBiggsAZ 200 RepAndyLevin 170 RepAngieCraig 163 SenAngusKing 200 RepKirkpatrick 200 RepAnnWagner 200 RepAnnaEshoo 200 RepAnnieKuster 200 RepBrindisi 199 RepAGonzalez 101 repdelgado 200 RepMcEachin 200 AustinScottGA08 200 RepPressley 200 RepBarbaraLee 200 RepLoudermilk 200 SenatorCardin 200 RepBenMcAdams 200 repbenraylujan 200 SenSasse 200 RepBenCline 84 BennieGThompson 200 SenSanders 200

BettyMcCollumO4 200

SenBillCassidy 200 RepBillFlores 200 RepBillFoster 200 RepHuizenga 200 RepBillJohnson 200 USRepKeating 200 BillPascrell 200 congbillposey 200 USRepLong 200 RepBlaine 200 SenBobCasey 200 RepBobGibbs 200 boblatta 200 SenatorMenendez 200 RepBobbyRush 200 RepBonnie 200 RepSchneider 200 BradSherman 200 RepBradWenstrup 200 RepByrne 200 RepLawrence 200 RepBrendanBoyle 200 RepGuthrie 200 RepBrianBabin 200 brianschatz 200 RepBrianFitz 200 RepBrianHiggins 200 RepBrianMast 200 RepWesterman 200 RepBryanSteil 149 RepBuddyCarter 200 RepCarolMiller 105 Rate limit exceeded

A Jupyter Widget

RepMaloney 200
SenCortezMasto 200
cathymcmorris 200
RepRichmond 200
RepChuck 200
RepChuck 200
chelliepingree 200
RepCheri 200
RepChipRoy 200
RepChrisCollins 200

ChrisCoons 200

RepChrisPappas 200

RepChrisSmith 200

RepChrisStewart 200

ChrisVanHollen 200

RepHoulahan 200

ChrisMurphyCT 200

ChuckGrassley 200

SenSchumer 200

RepCindyAxne 161

SenHydeSmith 200

RepClayHiggins 200

RepColinAllred 145

RepConorLamb 162

SenBooker 200

SenCoryGardner 200

RepAdamSmith 200

RepDanKildee 200

RepMeuser 108

RepNewhouse 200

RepDanCrenshaw 118

RepLipinski 200

SenDanSullivan 200

RepWebster 200

RepDannyDavis 200

RepLaHood 200

RepDarrenSoto 200

daveloebsack 200

RepDaveJoyce 200

RepDavidKustoff 200

RepMcKinley 200

davidcicilline 200

sendavidperdue 200

RepDavidEPrice 200

RepDavidRouzer 200

RepDavid 200

repdavidscott 200

RepDavidTrone 153

RepDeanPhillips 99

SenatorFischer 200

RepDebDingell 200

RepDLesko 200

RepDMP 200

SenStabenow 200

RepDWStweets 200

RepDebHaaland 200

RepDennyHeck 200

RepRiggleman 200

RepDerekKilmer 200 RepDevinNunes 154 RepDianaDeGette 200 SenFeinstein 200 SenatorDurbin 200 repdinatitus 200 RepDonBacon 200 repdonyoung 200 DonaldNorcross 200 RepDonaldPayne 200 RepDonBeyer 200 RepShalala 200 DorisMatsui 200 RepDougCollins 200 SenDougJones 200 RepLaMalfa 200 RepDLamborn 200 RepDrewFerguson 200 Rep_Hunter 200 RepDustyJohnson 110 Call_Me_Dutch 200 RepDwightEvans 200 repblumenauer 200 RepEdCase 72 SenMarkey 200 RepPerlmutter 200 RepEBJ 200 RepElaineLuria 200 EleanorNorton 200 RepCummings 200 RepEliotEngel 200 RepStefanik 200 RepSlotkin 135 SenWarren 200 Rate limit exceeded

A Jupyter Widget

repcleaver 200
RepSwalwell 200
JimPressOffice 200
RepFilemonVela 200
RepRooney 200
RepFrankLucas 200
FrankPallone 200
RepFredUpton 200

RepWilson 200

RepFrenchHill 200

GKButterfield 200

RepGarretGraves 200

USRepGaryPalmer 200

SenGaryPeters 200

RepHolding 200

GerryConnolly 200

RepGilCisneros 200

RepGrothman 200

CongressmanGT 200

RepGusBilirakis 200

RepGraceMeng 200

gracenapolitano 200

RepGregPence 130

RepGregStanton 76

RepGregSteube 73

repgregwalden 200

RepGregoryMeeks 200

GReschenthaler 200

RepGwenMoore 200

RepMGriffith 200

RepJeffries 200

RepHalRogers 200

RepHaleyStevens 200

RepHankJohnson 200

RepHarley 198

RepCuellar 200

Ilhan 200

SenJackReed 200

RepSpeier 200

RepWalorski 200

SenJackyRosen 200

RepJahanaHayes 200

HerreraBeutler 200

WhipClyburn 200

KYComer 200

SenatorLankford 200

RepRaskin 200

janschakowsky 200

RepGolden 163

RepHuffman 200

RepJasonCrow 200

RepJasonSmith 200

SenatorShaheen 200

RepJeffDuncan 200

SenJeffMerkley 200

CongressmanJVD 95

JeffFortenberry 200 RepWexton 200 RepJenniffer 200 RepJerryNadler 200 RepMcNerney 200 JerryMoran 200 RepChuyGarcia 128 RepJimBaird 32 repjimcooper 200 RepJimCosta 200 RepHagedorn 103 jahimes 200 JimInhofe 200 Jim Jordan 200 JimLangevin 200 RepMcGovern 200 SenatorRisch 200 RepJimmyGomez 200 RepJimmyPanetta 200 JoaquinCastrotx 200 RepArrington 200 CongressmanHice 200 RepJoeCourtney 200 RepCunningham 169 Sen_JoeManchin 200 RepJoeNeguse 200 RepJoeWilson 200 RepJohnYarmuth 200 SenJohnBarrasso 200 JohnBoozman 200 JudgeCarter 200 JohnCornyn 200 RepJohnCurtis 200 RepGaramendi 200 SenJohnHoeven 200 RepJohnJoyce 131 Rate limit exceeded

A Jupyter Widget

RepJohnKatko 200
RepJohnLarson 200
repjohnlewis 200
RepMoolenaar 200
SenJohnKennedy 200
RepRatcliffe 200

RepJohnRose 52

RepRutherfordFL 200

RepSarbanes 200

RepShimkus 200

SenJohnThune 200

SenatorIsakson 200

SenatorTester 200

SenJoniErnst 200

RepJoseSerrano 200

RepJoeKennedy 200

RepJoeMorelle 200

RepJoshG 200

RepJoshHarder 123

SenHawleyPress 95

RepBeatty 200

RepJuanVargas 200

RepJudyChu 200

RepBrownley 200

justinamash 200

SenKamalaHarris 200

RepKarenBass 200

RepKClark 200

RepKathleenRice 200

USRepKCastor 200

RepKatieHill 200

RepKatiePorter 176

RepKayGranger 200

RepArmstrongND 119

RepKenBuck 200

KenCalvert 200

RepKendraHorn 75

RepKenMarchant 200

RepKevinBrady 200

SenKevinCramer 200

repkevinhern 98

GOPLeader 200

RepKimSchrier 94

gillibrandny 200

RepSchrader 200

SenatorSinema 200

SenAlexander 200

RepLanceGooden 49

RepLarryBucshon 200

RepUnderwood 124

RepLeeZeldin 200

RepLindaSanchez 200

LindseyGrahamSC 200

RepLBR 200

lisamurkowski 200 RepLizCheney 200 RepFletcher 152 RepLloydDoggett 200 RepSmucker 200 RepLoisFrankel 200 RepLoriTrahan 200 RepLouCorrea 200 replouiegohmert 200 RepRoybalAllard 200 RepLucyMcBath 76 MacTXPress 200 RepDean 200 SenatorHassan 200 RepVeasey 200 RepMarciaFudge 200 marcorubio 200 RepMarcyKaptur 200 SenatorCantwell 200 MarioDB 200 MarkAmodeiNV2 200 RepDeSaulnier 200 RepMarkGreen 200 RepMarkMeadows 200 repmarkpocan 200 RepMarkTakano 200 RepMarkWalker 200 MarkWarner 200 RepMullin 200 MarshaBlackburn 200 SenMcSallyAZ 200 RepMarthaRoby 200 MartinHeinrich 200 RepMGS 200 RepCartwright 200 RepMattGaetz 200 RepMaxRose 175 RepMaxineWaters 200 maziehirono 200 Rate limit exceeded

A Jupyter Widget

SenatorBennet 200 michaelcburgess 200 RepCloudTX 46 USRepMikeDoyle 200

RepMichaelGuest 125

CongMikeSimpson 200

RepMcCaul 200

RepMikeTurner 200

RepMichaelWaltz 200

RepBost 200

SenatorBraun 150

ConawayTX11 200

MikeCrapo 200

SenatorEnzi 200

RepGallagher 200

RepMikeJohnson 200

MikeKellyPA 200

SenMikeLee 200

RepMikeLevin 176

RepMikeQuigley 200

RepMikeRogersAL 200

SenatorRounds 200

RepThompson 200

RepSherrill 161

senatemajldr 200

SenatorRomney 118

RepMoBrooks 200

SpeakerPelosi 200

RepBarragan 200

DrNealDunnFL2 200

NitaLowey 200

NormaJTorres 200

NydiaVelazquez 200

SenPatRoberts 200

SenToomey 200

SenatorLeahy 200

PatrickMcHenry 200

PattyMurray 200

RepPaulCook 200

RepGosar 200

RepPaulMitchell 200

RepPaulTonko 200

RepPeteAguilar 200

RepPeteStauber 108

RepPeterDeFazio 200

RepPeteOlson 200

RepPeteKing 200

RepVisclosky 200

PeterWelch 200

DrPhilRoe 200

RepJayapal 200

CongressmanRaja 200 RepAbraham 200 RepRalphNorman 200 RandPaul 200 TXRandy14 200 RepRashida 128 RepRaulGrijalva 200 CongressmanRuiz 200 SenBlumenthal 200 SenatorBurr 200 RepRichHudson 200 RepRichardNeal 200 SenShelby 200 RepRickCrawford 200 RepRickLarsen 200 SenRickScott 200 RepRoKhanna 200 senrobportman 200 RepRobWoodall 200 RepRobBishop 0 Robert_Aderholt 200 BobbyScott 200 RobWittman 200 RepRobinKelly 200 RodneyDavis 200 RepMarshall 0 SenatorWicker 200 RepRWilliams 200 RepRonEstes 200 RonWyden 200 SenRonJohnson 200 RepRonKind 200 RepRonWright 107 rosadelauro 200 RepRossSpano 59 RoyBlunt 200 RepRubenGallego 200 RepRussFulcher 50 RepCarbajal 200 SanfordBishop 200 DesJarlaisTNO4 200 RepScottPerry 200 RepScottPeters 200 Rate limit exceeded

A Jupyter Widget

RepTipton 200

RepCasten 200

RepSeanDuffy 200

RepSeanMaloney 200

sethmoulton 200

RepDavids 200

JacksonLeeTX18 200

SenWhitehouse 200

SenCapito 200

SenSherrodBrown 200

LeaderHoyer 200

RepStephMurphy 200

RepStephenLynch 200

RepSteveChabot 200

RepCohen 200

SteveDaines 200

SteveKingIA 200

SteveScalise 200

RepSteveStivers 200

Rep_Watkins 127

rep_stevewomack 200

RepHorsford 200

CongPalazzo 200

SusanWBrooks 200

SenatorCollins 200

RepSusanDavis 200

RepSusanWild 200

RepSusieLee 200

RepDelBene 200

RepBonamici 200

RepSylviaGarcia 200

SenatorBaldwin 200

SenDuckworth 200

RepTedBudd 200

SenTedCruz 200

RepTedLieu 200

RepTedYoho 200

RepTerriSewell 200

RepTedDeutch 200

SenThomTillis 200

RepThomasMassie 200

RepTimBurchett 105

timkaine 200

RepTimRyan 200

SenatorTimScott 200

RepWalberg 200

SenTinaSmith 200

RepTjCox 200

SenToddYoung 200 SenatorCarper 200 TomColeOKO4 200 SenTomCotton 200 RepTomEmmer 200 RepTomGraves 200 RepMalinowski 45 RepMcClintock 200 RepOHalleran 200 RepTomReed 200 RepTomRice 200 RepTomSuozzi 200 SenatorTomUdall 200 RepCardenas 200 RepTrentKelly 200 RepTrey 200 RepBalderson 129 TulsiPress 200 RepValDemings 200 RepVanTaylor 55 VernBuchanan 200 RepEscobar 200 RepHartzler 200 virginiafoxx 200 WarrenDavidson 200 HurdOnTheHill 200 LacyClayM01 200 reptimmons 41 RepTorresSmall 79 RepYvetteClarke 200 RepZoeLofgren 200

In [74]: import os

```
, 'RepRussFulcher', 'Rep_Watkins', 'RepTimBurchett', 'RepMalinowski'
                      ,'RepBalderson','RepVanTaylor','reptimmons','RepTorresSmall']
         for member in reattempt:
             os.remove("./congress/"+member+".txt")
             while True:
                 try:
                     tweets = []
                     with open("./congress/"+member+".txt", "wb") as text_file:
                         for status in tweepy.Cursor(api.user_timeline
                                                  , id=member
                                                  , tweet_mode='extended').items(200):
                             text = status.full_text.replace(
                                 '\n','').translate(non_bmp_map)
                             text = ' '.join(
                                 word for word in text.split(' ') if 'http' not in word)
                             text = ' '.join(
                                 word for word in text.split(' ') if '&amp' not in word)
                             text = strip_emoji(text+'\n').encode('utf-8')
                             tweets.append(text)
                             text_file.write(text)
                     print(member, len(tweets))
                 except:
                     print("Rate limit exceeded")
                     for i in tqdm(range(60*15)):
                         time.sleep(1)
                     continue
                 break
RepFinkenauer 85
RepAOC 16
RepAndyKimNJ 111
RepAndyLevin 170
RepAngieCraig 163
RepBrindisi 199
RepAGonzalez 101
RepBenCline 84
RepBryanSteil 150
RepCarolMiller 105
RepCindyAxne 161
RepColinAllred 145
RepConorLamb 162
RepDanCrenshaw 118
RepDavidTrone 153
RepDevinNunes 154
RepDustyJohnson 110
RepEdCase 72
RepSlotkin 138
```

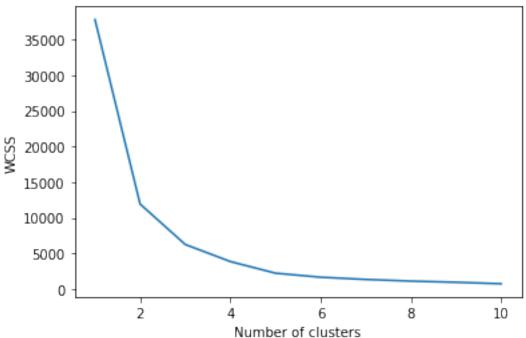
```
RepGregPence 130
RepGregStanton 76
RepGregSteube 74
RepHarley 198
RepGolden 163
CongressmanJVD 95
RepChuyGarcia 128
RepHagedorn 103
RepCunningham 169
RepJohnJoyce 131
RepJohnRose 52
RepJoshHarder 123
RepKatiePorter 177
RepArmstrongND 119
RepKendraHorn 75
repkevinhern 98
RepKimSchrier 94
RepLanceGooden 49
RepUnderwood 124
RepFletcher 152
RepLucyMcBath 76
RepMaxRose 175
RepCloudTX 46
SenatorBraun 150
RepMikeLevin 176
RepSherrill 161
SenatorRomney 118
RepPeteStauber 108
RepRashida 128
RepRobBishop 0
RepMarshall 0
RepRonWright 107
RepRussFulcher 50
Rep_Watkins 127
RepTimBurchett 105
RepMalinowski 45
RepBalderson 129
RepVanTaylor 55
reptimmons 41
RepTorresSmall 79
In [94]: import numpy as np
         import matplotlib.pyplot as plt
         import pandas as pd
         from sklearn.cluster import KMeans
         congress = pd.read_csv('./congress.csv', encoding = 'latin-1')
```

```
c50 = pd.read_csv('./mallet/50-congress-topics.csv', encoding = 'latin-1')
congress = congress.merge(c50, on="twitter")

X = congress.iloc[:,2:]

wcss = []
for i in range(1, 11):
    kmeans = KMeans(n_clusters = i, init = 'k-means++', random_state = 42)
    kmeans.fit(X)
    wcss.append(kmeans.inertia_)
plt.plot(range(1, 11), wcss)
plt.title('The Elbow Method')
plt.xlabel('Number of clusters')
plt.ylabel('WCSS')
plt.show()
```

The Elbow Method



```
1
            1
                      0
                                1
                                           8
                                              0.000013 0.000032 0.000010
2
            0
                                1
                                           8
                                             0.000011
                                                        0.013607 0.000009
                      1
3
                                              0.000009
                                                        0.000024
            1
                      0
                                1
                                          16
                                                                 0.015297
4
            1
                      0
                                0
                                          17
                                              0.000013 0.017745 0.000011
                          50_c5
                                                                      50_c43 \
      50_c3
                50_c4
                                . . .
                                        50_c40
                                                  50_c41
                                                            50_c42
0 0.000009
            0.000005
                       0.000011
                                 . . .
                                      0.000107
                                                0.000014
                                                          0.000006
                                                                    0.119941
  0.000012
             0.014366
                       0.000016
                                 . . .
                                                0.000020
                                      0.000600
                                                          0.000008
                                                                    0.066160
2 0.000011
             0.000006
                       0.000014
                                      0.001683
                                                0.000017
                                                          0.000007
                                                                    0.187946
                                 . . .
3 0.000009
             0.000005
                       0.000012
                                      0.027368
                                                0.000015
                                                          0.000006
                                                                    0.106178
                                 . . .
4 0.000013
            0.000007
                       0.000016
                                                0.001885
                                 . . .
                                      0.076129
                                                          0.000009 0.134437
                                 50_c47
     50_c44
               50_c45
                         50_c46
                                             50_c48
                                                       50_c49
0 0.023519
             0.000007
                       0.000010
                                 0.000051 0.000060 0.000081
1 0.001078
             0.000010
                       0.000015
                                 0.000072
                                           0.001880 0.000115
2 0.022270
             0.000008
                       0.000013
                                 0.000062
                                          0.000074 0.040836
3 0.000134
             0.002666
                       0.000011
                                 0.000053
                                           0.000728
                                                    0.000085
4 0.027220
             0.000010
                       0.000016 0.012659 0.000089 0.024822
```

[5 rows x 54 columns]