PrimaryDataAnalysis

October 3, 2019

1 Democratic Primary Analysis

Summary:

- 75 Responses
- Collected from 9/29/2019 to 10/3/2019 (5 days)

```
[1]: #Datacol names:
    cols = ["Timestamp", "Status", "Gender", "Ethnicity", "Age Range",
    →"Household Income",
     "Region", "Voting Registration", "Party Registration", "Primary/Caucus", ___
     →"Ideology",
     "First Candidate", "Second Candidate", "GE Odds", "Biden Fav", "Warren Fav",

¬"Sanders Fav",
     "Buttigieg Fav", "Harris Fav", "Yang Fav", "First Republican", "Trump⊔
     →Approval",
     "Impeachment Approval", "Biden V Trump", "Warren V Trump", "Sanders V Trump", "
     \rightarrow "Buttigieg V Trump",
     "Harris V Trump", "Yang V Trump", "2016 Primary", "2016 GE", "Electoral
     →College Approval",
     "Top Issue", "Gun Reform Approval", "Climate Change Approval"]
[2]: #Libraries
    import pandas as pd
    import numpy as np
    import matplotlib.pyplot as plt
    import seaborn as sns
    from math import sqrt
[3]: poll_data = pd.read_csv("data/ DemPoll.csv")
    poll_data.columns = cols
    poll_data.shape
[3]: (75, 35)
[4]: poll_data.head()
```

```
status Gender \
[4]:
                        Timestamp
       2019/09/28 10:58:19 AM AST
                                    Current Student
                                                      Male
    1 2019/09/28 10:58:47 AM AST
                                    Current Student
                                                      Male
    2 2019/09/28 11:00:51 AM AST
                                    Current Student
                                                      Male
    3 2019/09/28 11:14:00 AM AST
                                    Current Student
                                                      Male
    4 2019/09/28 11:17:58 AM AST
                                    Current Student
                                                      Male
                       Ethnicity Age Range
                                                       Household Income
                                                                             Region \
                                                   Under $50,000 a year
    0
              Hispanic or Latino
                                      26-29
                                                                          NorthEast
    1
              White or Caucasian
                                      18-21
                                             $50,000 to $100,000 a year
                                                                          NorthEast
    2
             Other or Mixed Race
                                             $50,000 to $100,000 a year
                                      18-21
                                                                            MidWest
       Black or African American
                                      18-21
                                             $50,000 to $100,000 a year
                                                                          NorthEast
                                                   Under $50,000 a year
                                                                          NorthEast
              White or Caucasian
                                      18-21
      Voting Registration Party Registration
                                                             Primary/Caucus
                                                                              . . .
                            Democratic Party
                                               Democratic Primary or Caucus
    0
                      Yes
    1
                            Democratic Party
                                               Democratic Primary or Caucus
                      Yes
    2
                            Democratic Party
                                               Democratic Primary or Caucus
                      Yes
    3
                       No
                            Democratic Party
                                                                      Unsure
                      Yes
                            Democratic Party Democratic Primary or Caucus
     Sanders V Trump
                        Buttigieg V Trump
                                                Harris V Trump
                                                                       Yang V Trump
    0 Bernie Sanders
                           Pete Buttigieg
                                                 Kamala Harris
                                                                        Andrew Yang
    1 Bernie Sanders
                                                 Kamala Harris
                           Pete Buttigieg
                                                                        Andrew Yang
    2 Bernie Sanders
                       3rd Party/Write in
                                                 Kamala Harris
                                                               3rd Party/Write in
    3 Bernie Sanders
                                            3rd Party/Write in
                           Pete Buttigieg
                                                                        Andrew Yang
    4 Bernie Sanders
                           Pete Buttigieg
                                            3rd Party/Write in
                                                                        Andrew Yang
                  2016 Primary
                                                 2016 GE
      Did not vote/ineligible
                                         Hillary Clinton
     Did not vote/ineligible Did not vote/ineligible
    2
               Hillary Clinton
                                         Hillary Clinton
    3 Did not vote/ineligible
                               Did not vote/ineligible
    4 Did not vote/ineligible
                                         Hillary Clinton
       Electoral College Approval
                                         Top Issue
                                                    Gun Reform Approval \
    0
                               No
                                      Health Care
                                                            More Likely
                                    Climate Change
                                                            More Likely
    1
                               No
    2
                                   Climate Change
                                                            More Likely
                               No
    3
                                   Climate Change
                                                            More Likely
                               No
    4
                                   Climate Change
                                                            More Likely
       Climate Change Approval
    0
                Very Important
    1
                Very Important
    2
                Very Important
    3
                Very Important
```

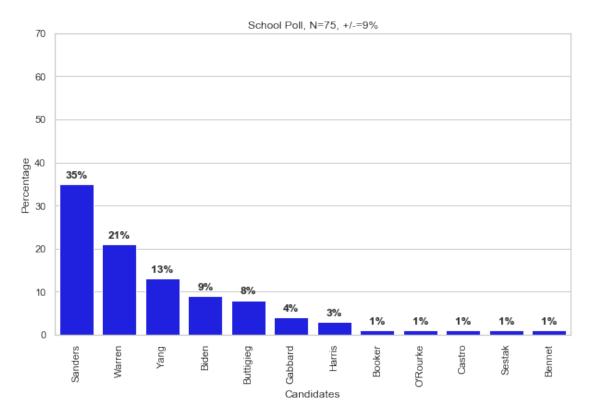
[5 rows x 35 columns] [5]: last_name = lambda x: x.split()[1] [6]: poll_data["First Candidate"] = poll_data["First Candidate"].apply(last_name) poll_data["First Candidate"] [6]: 0 Sanders 1 Warren 2 Warren 3 Biden 4 Sanders 70 Harris 71 Sanders 72 Buttigieg 73 Yang 74 Warren Name: First Candidate, Length: 75, dtype: object [7]: poll_data["Second Candidate"] = poll_data["Second Candidate"].apply(last_name) poll_data["GE Odds"] = poll_data["GE Odds"].apply(last_name) poll_data["First Republican"] = poll_data["First Republican"].apply(last_name) poll_data["Biden V Trump"] = poll_data["Biden V Trump"].apply(last_name) poll_data["Warren V Trump"] = poll_data["Warren V Trump"].apply(last_name) poll_data["Sanders V Trump"] = poll_data["Sanders V Trump"].apply(last_name) poll_data["Buttigieg V Trump"] = poll_data["Buttigieg V Trump"].apply(last_name) poll_data["Harris V Trump"] = poll_data["Harris V Trump"].apply(last_name) poll_data["Yang V Trump"] = poll_data["Yang V Trump"].apply(last_name) poll_data.head() [7]: Timestamp status Gender 0 2019/09/28 10:58:19 AM AST Current Student Male 1 2019/09/28 10:58:47 AM AST Current Student Male 2 2019/09/28 11:00:51 AM AST Current Student Male 3 2019/09/28 11:14:00 AM AST Current Student Male 4 2019/09/28 11:17:58 AM AST Current Student Male Household Income Region \ Ethnicity Age Range 0 Hispanic or Latino 26-29 Under \$50,000 a year NorthEast 1 White or Caucasian \$50,000 to \$100,000 a year NorthEast 18-21 Other or Mixed Race \$50,000 to \$100,000 a year 2 18-21 MidWest Black or African American \$50,000 to \$100,000 a year NorthEast 3 18-21 18-21 White or Caucasian Under \$50,000 a year NorthEast 4 Voting Registration Party Registration Primary/Caucus Democratic Party Democratic Primary or Caucus 0 Yes

4

Very Important

```
1
                      Yes
                            Democratic Party
                                               Democratic Primary or Caucus
    2
                                               Democratic Primary or Caucus
                            Democratic Party
                      Yes
    3
                       No
                            Democratic Party
                                                                      Unsure
                                                                              . . .
    4
                      Yes
                            Democratic Party Democratic Primary or Caucus
     Sanders V Trump Buttigieg V Trump Harris V Trump Yang V Trump
    0
              Sanders
                              Buttigieg
                                                 Harris
                                                                 Yang
    1
              Sanders
                              Buttigieg
                                                 Harris
                                                                 Yang
    2
              Sanders
                            Party/Write
                                                 Harris Party/Write
    3
              Sanders
                              Buttigieg
                                            Party/Write
    4
              Sanders
                              Buttigieg
                                            Party/Write
                                                                 Yang
                  2016 Primary
                                                 2016 GE \
       Did not vote/ineligible
                                         Hillary Clinton
       Did not vote/ineligible
                                Did not vote/ineligible
    1
    2
               Hillary Clinton
                                         Hillary Clinton
                                Did not vote/ineligible
    3 Did not vote/ineligible
    4 Did not vote/ineligible
                                         Hillary Clinton
       Electoral College Approval
                                         Top Issue
                                                    Gun Reform Approval \
    0
                                                            More Likely
                                       Health Care
    1
                                   Climate Change
                                                            More Likely
                               Nο
    2
                               No Climate Change
                                                            More Likely
    3
                               No Climate Change
                                                            More Likely
    4
                               No Climate Change
                                                            More Likely
       Climate Change Approval
    0
                Very Important
    1
                Very Important
    2
                Very Important
                Very Important
    3
    4
                Very Important
    [5 rows x 35 columns]
[8]: main_poll = poll_data[[" status", "Gender", "Ethnicity", "Age Range", __
     →"Household Income",
     "Region", "Voting Registration", "Party Registration", "Primary/Caucus", [
     →"Ideology",
     "First Candidate", "Second Candidate"]]
[9]: main_poll.head()
[9]:
               status Gender
                                                Ethnicity Age Range
       Current Student
                                       Hispanic or Latino
                         Male
                                                               26-29
    1 Current Student
                         Male
                                       White or Caucasian
                                                               18-21
    2 Current Student
                         Male
                                      Other or Mixed Race
                                                               18-21
    3 Current Student
                         Male
                               Black or African American
                                                               18-21
```

```
4 Current Student
                          Male
                                        White or Caucasian
                                                               18-21
                  Household Income
                                        Region Voting Registration \
     0
              Under $50,000 a year
                                    NorthEast
     1 $50,000 to $100,000 a year
                                    NorthEast
                                                               Yes
     2 $50,000 to $100,000 a year
                                       MidWest
                                                               Yes
     3 $50,000 to $100,000 a year NorthEast
                                                                No
     4
              Under $50,000 a year
                                    NorthEast
                                                               Yes
       Party Registration
                                          Primary/Caucus
                                                                  Ideology \
         Democratic Party Democratic Primary or Caucus
                                                               Very Liberal
        Democratic Party Democratic Primary or Caucus
                                                               Very Liberal
     1
     2
        Democratic Party Democratic Primary or Caucus
                                                              Very Liberal
     3
        Democratic Party
                                                  Unsure Somewhat Liberal
         Democratic Party Democratic Primary or Caucus
                                                              Very Liberal
       First Candidate Second Candidate
     0
               Sanders
                                 Warren
     1
                Warren
                                 Sanders
     2
                                 Harris
                Warren
     3
                 Biden
                                 Sanders
               Sanders
                                 Warren
[10]: main_poll.shape
[10]: (75, 12)
[12]: # Create a dataframe of aggregate candidate choices
     first candidate = main poll["First Candidate"].value counts()
     first_candidate = (first_candidate * 100) / first_candidate.sum()
     first candidate = pd.DataFrame(first candidate.items())
     first_candidate.columns = ["Candidates", "Percentage"]
     first_candidate["Percentage"] = first_candidate["Percentage"].apply(lambda x:__
      \rightarrowround(x))
     first_candidate["labels"] = first_candidate["Percentage"].apply(lambda x: "{}%".
      \rightarrowformat(x))
     # Margin of Error
     s_e = sqrt((first_candidate.loc[0,"Percentage"]/100)*(1-(first_candidate.
     →loc[0, "Percentage"]/100))/main_poll.shape[0])
     cv = 1.64
     ME = s_e * cv
     # Create plot
     plt.figure(figsize=(10, 6))
     sns.set(style = "whitegrid")
```



```
[13]: first_candidate[["Candidates","labels"]]
```

```
[13]:
        Candidates labels
     0
            Sanders
                        35%
             Warren
                        21%
     1
                        13%
     2
               Yang
     3
              Biden
                         9%
     4
                         8%
          Buttigieg
     5
            Gabbard
                         4%
```

```
6
                        3%
            Harris
     7
            Booker
                        1%
     8
          0'Rourke
                        1%
     9
            Castro
                        1%
     10
            Sestak
                        1%
            Bennet
                        1%
     11
[14]: # Second Candidates
     second_choices = main_poll[["First Candidate", "Second Candidate"]]
     second_choices = second_choices[second_choices["First Candidate"] !=_
      →second_choices["Second Candidate"]]
     second_choices["Count"] = 1
     second_choices.groupby(["First Candidate", "Second Candidate"]).count()
[14]:
                                         Count
     First Candidate Second Candidate
                      Biden
     Bennet
                                             1
     Biden
                      Buttigieg
                                             1
                      Delaney
                                             1
                      Gabbard
                                             1
                      Harris
                                             1
                      Sanders
                                             1
                      Warren
                                             1
                      Yang
                                             1
     Booker
                      Yang
                                             1
                                             2
     Buttigieg
                      Biden
                      Harris
                                             3
                      Warren
                                             1
     Castro
                      Warren
                                             1
     Gabbard
                      Booker
                                             1
     Harris
                      Delaney
                                             1
                      Sanders
                                             1
     O'Rourke
                      Sanders
                                             1
     Sanders
                      Biden
                                             2
                      Castro
                                             1
                      Gabbard
                                             1
                      Warren
                                            16
                      Williamson
                                             3
                                             3
                      Yang
     Warren
                      Bennet
                                             1
                      Biden
                                             4
                      Booker
                                             1
                      Buttigieg
                                             1
                                             2
                      Harris
                      O'Rourke
                                             1
                                             6
                      Sanders
                      Gabbard
                                             2
     Yang
                                             5
                      Sanders
```

[]:[