```
In [1]: import pandas as pd
        from pandas import Series, DataFrame
        import numpy as np
In [2]: import matplotlib.pyplot as plt
        import seaborn as sns
        sns.set_style('whitegrid')
        %matplotlib inline
In [3]: from future import division
In [4]: import requests
In [5]: from StringIO import StringIO
In [6]: url = 'http://elections.huffingtonpost.com/pollster/2016-general-electio
        n-trump-vs-clinton.csv'
        source = requests.get(url).text
        poll data = StringIO(source)
In [7]: poll df = pd.read csv(poll data)
In [8]: poll df.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 1377 entries, 0 to 1376
        Data columns (total 17 columns):
        Pollster
                                   1377 non-null object
        Start Date
                                   1377 non-null object
        End Date
                                   1377 non-null object
                                  1377 non-null object
        Entry Date/Time (ET)
        Number of Observations
                                  906 non-null float64
                                  1377 non-null object
        Population
        Mode
                                  1377 non-null object
                                  1377 non-null float64
        Trump
        Clinton
                                  1377 non-null float64
        Other
                                  947 non-null float64
        Undecided
                                  1322 non-null float64
        Pollster URL
                                  1377 non-null object
                                  1377 non-null object
        Source URL
        Partisan
                                  1377 non-null object
        Affiliation
                                  1377 non-null object
        Question Text
                                  602 non-null object
        Question Iteration
                                  1377 non-null int64
        dtypes: float64(5), int64(1), object(11)
        memory usage: 183.0+ KB
```

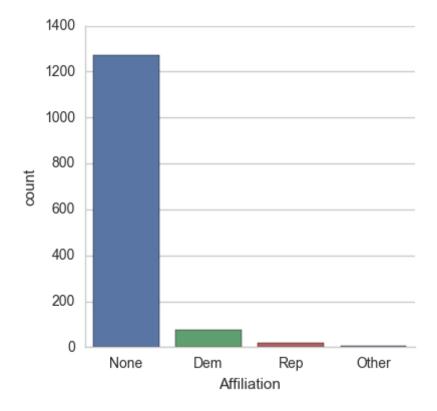
In [9]: poll\_df.head()

Out[9]:

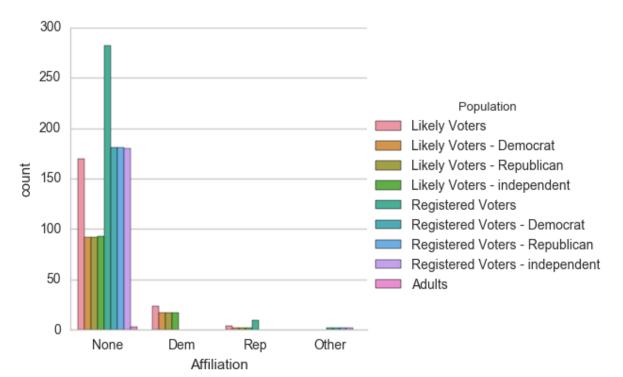
$\vdash$	Polister	Date	Date	Date/ Time Observations		Population	wode	ITUIIID
				<b>(Επ)</b> γ				
$\vdash$	Pollster	Start	End	Date/Time	Number of	Population	Mode	Trump
	Polistei	Date	Date		Observations	Population	WIOGE	ITUIIIP
				(ET)				
0	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	953.0	Likely Voters	Internet	37.0
1	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	NaN	Likely Voters - Democrat	Internet	5.0
2	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	NaN	Likely Voters - Republican	Internet	74.0
3	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	NaN	Likely Voters - independent	Internet	31.0
4	Rasmussen	2016- 10-07		2016-10- 12T12:39:57Z	1500.0	Likely Voters	IVR/Online	39.0

In [10]: sns.factorplot('Affiliation',data=poll\_df, kind = 'count')

Out[10]: <seaborn.axisgrid.FacetGrid at 0x1148ffe10>



Out[11]: <seaborn.axisgrid.FacetGrid at 0x116ccc2d0>



In [12]: poll\_df.head()

Out[12]:

	Polister Date Date		Date/ Time		Population Ivioue Irump			
		Date	Date	(Enit)y	Observations	-		
	Pollster	Start Date	End Date	Date/Time (ET)	Number of Observations	Population	Mode	Trump
0	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	953.0	Likely Voters	Internet	37.0
1	Insights West	2016- 10-10		2016-10- 12T14:34:44Z	NaN	Likely Voters - Democrat	Internet	5.0
2	Insights West	2016- 10-10		2016-10- 12T14:34:44Z	NaN	Likely Voters - Republican	Internet	74.0
3	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	NaN	Likely Voters - independent	Internet	31.0
4	Rasmussen	2016- 10-07	2016- 10-11	2016-10- 12T12:39:57Z	1500.0	Likely Voters	IVR/Online	39.0

In [14]:	avg	0	

Out[14]:

	0
Trump	40.727669
Clinton	42.792302
Other	5.921859
Undecided	9.660363

```
In [15]: std = pd.DataFrame (poll_df.std())
std.drop('Number of Observations', axis = 0, inplace = True)
std.drop('Question Iteration', axis = 0, inplace = True)
```

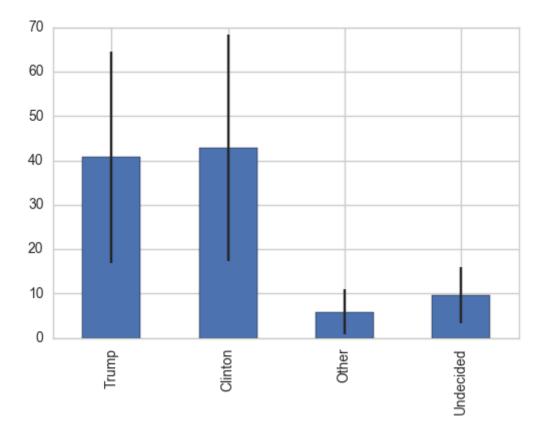
In [16]: std.head()

Out[16]:

	0
Trump	23.735443
Clinton	25.477141
Other	5.118286
Undecided	6.383558

```
In [17]: avg.plot(yerr = std, kind = 'bar', legend = False)
```

Out[17]: <matplotlib.axes.\_subplots.AxesSubplot at 0x1178fd550>



Average STD

Since Trump and Clinton is very closed to each other, the 'Undecided' can make a big difference in who will win the race

```
In [18]: poll_avg = pd.concat([avg, std], axis = 1)
```

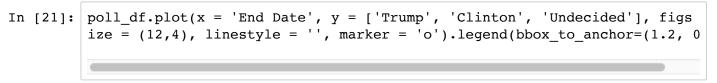
Out[19]:

	Average	STD
Trump	40.727669	23.735443
Clinton	42.792302	25.477141
Other	5.921859	5.118286
Undecided	9.660363	6.383558

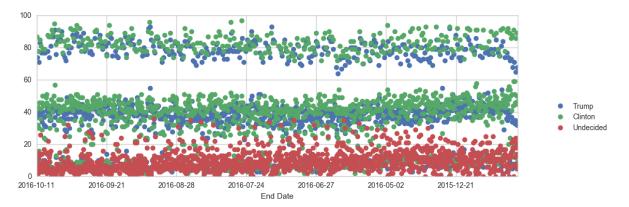
In [20]: poll\_df.head()

Out[20]:

$\equiv$	Date   Date		Date/ Hille	Observations	Population Iwode Irump			
		Hentily (		Observations				
	Pollster	Start Date	End Date	Date/Time (ET)	Number of Observations	Population	Mode	Trump
0	Insights West	2016- 10-10		2016-10- 12T14:34:44Z	953.0	Likely Voters	Internet	37.0
1	Insights West	2016- 10-10		2016-10- 12T14:34:44Z	NaN	Likely Voters - Democrat	Internet	5.0
2	Insights West	2016- 10-10		2016-10- 12T14:34:44Z	NaN	Likely Voters - Republican	Internet	74.0
3	Insights West	2016- 10-10		2016-10- 12T14:34:44Z	NaN	Likely Voters - independent	Internet	31.0
4	Rasmussen	2016- 10-07		2016-10- 12T12:39:57Z	1500.0	Likely Voters	IVR/Online	39.0



## Out[21]: <matplotlib.legend.Legend at 0x1179cd650>



The graph scatter pretty evenly thoroughout the time line. Clinton seems to always on top of Trump

```
In [22]: from datetime import datetime
In [23]: poll_df['Difference'] = (poll_df.Clinton - poll_df.Trump)/100
```

In [24]: poll\_df.head()

Out[24]:

H	Date Date Date		Observations   Population   Ivioue			пипр		
		Start	End	<b>(#:7it)</b> y	Number of			
	Pollster	Date	Date	Date/Time (ET)	Observations	Population	Mode	Trump
0	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	953.0	Likely Voters	Internet	37.0
1	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	NaN	Likely Voters - Democrat	Internet	5.0
2	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	NaN	Likely Voters - Republican	Internet	74.0
3	Insights West	2016- 10-10	2016- 10-11	2016-10- 12T14:34:44Z	NaN	Likely Voters - independent	Internet	31.0
4	Rasmussen	2016- 10-07		2016-10- 12T12:39:57Z	1500.0	Likely Voters	IVR/Online	39.0

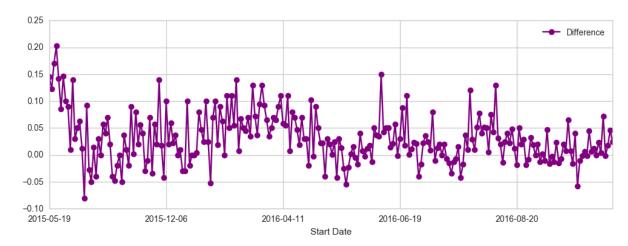
Positive number in the Difference column means Clinton is leading Negative number in the Difference column means Trump is leading

In [25]:	po Si D	tart = ate	Number of groupby Observations	⁄Trluˈm͡sþ́́	Chinton	Öther	บี <del>ก่ขื่อให้เ</del> บ•	Question Farseion Iteration	ൻfference	
	poll	_df.he	ead()							

Out[25]:

	Start Date	Number of Observations	Trump	Clinton	Other	Undecided	Question Iteration	Difference
0	2015- 05-19	1046.00	34.25	48.75	2.5	14.00	1.0	0.1450
1	2015- 06-20	420.75	35.00	47.25	NaN	17.75	1.0	0.1225
2	2015- 06-21	1005.00	34.00	51.00	3.0	12.00	1.0	0.1700
3	2015- 06-26	890.00	36.75	57.00	6.0	0.00	1.0	0.2025
4	2015- 07-09	499.25	35.25	49.50	NaN	16.00	1.0	0.1425

Out[26]: <matplotlib.axes.\_subplots.AxesSubplot at 0x117ae0cd0>



Up means people favor Clintin more, Down means people favor Trump more

```
In [27]:
    row_in = 0
    xlimit = []

for date in poll_df['Start Date']:
    if date[0:7] == '2016-09':
        xlimit.append(row_in)
        row_in += 1
    else:
        row_in += 1

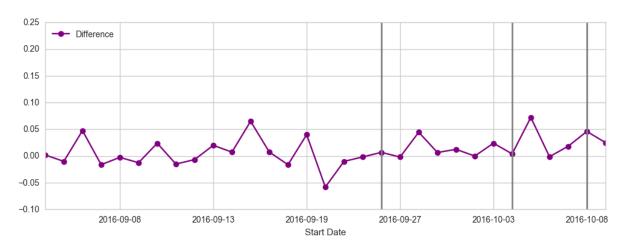
print min(xlimit)
print max(xlimit)
```

211233

```
In [28]: poll_df.plot('Start Date', 'Difference', figsize = (12,4), marker = 'o',
    linestyle = '-', color = 'purple', xlim = (211,241))

#Sep 26 First Debate
    plt.axvline(x = 211 + 18, linewidth = 2, color = 'grey')
    #Tues 4 Vice Pre Debate
    plt.axvline(x = 211 + 25, linewidth = 2, color = 'grey')
    #Oct 8 Trump Scandal Tape
    plt.axvline(x = 211+ 29, linewidth = 2, color = 'grey')
```

## Out[28]: <matplotlib.lines.Line2D at 0x117ffc890>



## CAMPAIGN DONATIONS FOR TRUMP AND CLINTON

In [29]: Trump\_donor = pd.read\_csv('TrumpDonation.csv', index\_col = False, dtype={
 x. CPC': pd.np.float64})

/Users/tedlam/anaconda/envs/py27/lib/python2.7/site-packages/IPython/core/interactiveshell.py:2717: DtypeWarning: Columns (11) have mixed type s. Specify dtype option on import or set low\_memory=False. interactivity=interactivity, compiler=compiler, result=result)

In [30]: Trump\_donor

Out[30]:

	emte_id	eand_id	eand_nm	eentbr_nm	eentbr_eity	eentbr.
0	C00580100	P80001571	Trump, Donald J.	ECKERSALL, LAWRENCE	DPO	AA
1	C00580100	P80001571	Trump, Donald J.	VANBEUGE, ROBERT	APO	AA
2	C00580100	P80001571	Trump, Donald J.	VANBEUGE, ROBERT	APO	AA
3	C00580100	P80001571	Trump, Donald J.	VANBEUGE, ROBERT	APO	AA
4	C00580100	P80001571	Trump, Donald J.	RIVERA, JOSEPH	APO	AE
5	C00580100	P80001571	Trump, Donald J.	RIVERA, JOSEPH	APO	AE
6	C00580100	P80001571	Trump, Donald J.	LINDELL, TIMOTHY	FPO	AE
7	C00580100	P80001571	Trump, Donald J.	LINDELL, TIMOTHY	FPO	AE
8	C00580100	P80001571	Trump, Donald J.	LECOMTE, BEATRIZ	APO	AE
9	C00580100	P80001571	Trump, Donald J.	NASIR, SHAHRIYAR	TORONTO	AE
10	C00580100	P80001571	Trump, Donald J.	LINDELL, TIMOTHY	FPO	AE
11	C00580100	P80001571	Trump, Donald J.	COLLINS, DAVE	FPO	AE
12	C00580100	P80001571	Trump, Donald J.	COLLINS, DAVE	FPO	AE
13	C00580100	P80001571	Trump, Donald J.	COLLINS, DAVE	FPO	AE
14	C00580100	P80001571	Trump, Donald J.	LINDELL, TIMOTHY	FPO	AE
15	C00580100	P80001571	Trump, Donald J.	COLLINS, DAVE	FPO	AE
16	C00580100	P80001571	Trump, Donald J.	LASAGE- BISHOP, JEAN-PIERRE	FAIRBANKS	AK

	cmte_id	cand_id	cand_nm	contbr_nm	contbr_city	contbr
17	C00580100	P80001571	Trump, Donald J.	EGGER, PATRICK	WASILLA	AK
18	C00580100	P80001571	Trump, Donald J.	MECHON, LINDA	ANCHORAGE	AK
19	C00580100	P80001571	Trump, Donald J.	COWDERY, PAMELA	ANCHORAGE	AK
20	C00580100	P80001571	Trump, Donald J.	CUELLAR, BEN	ANCHORAGE	AK
21	C00580100	P80001571	Trump, Donald J.	JACKSON, SHERRI	ANCHORAGE	AK
22	C00580100	P80001571	Trump, Donald J.	JANELLI, REBECCA T	ANCHORAGE	AK
23	C00580100	P80001571	Trump, Donald J.	JANELLI, REBECCA T	ANCHORAGE	AK
24	C00580100	P80001571	Trump, Donald J.	RICE, JIMMY	SOLDOTNA	AK
25	C00580100	P80001571	Trump, Donald J.	RICE, JIMMY	SOLDOTNA	AK
26	C00580100	P80001571	Trump, Donald J.	BARNES, WILLIAM	PALMER	AK
27	C00580100	P80001571	Trump, Donald J.	HORJES, JOHN	ANCHORAGE	AK
28	C00580100	P80001571	Trump, Donald J.	MANNING, SLADE	ANCHORAGE	AK
29	C00580100	P80001571	Trump, Donald J.	MINOGUE, JOHN	NORTH POLE	AK
394578	C00580100	P80001571	Trump, Donald J.	FANTASKEY, MATTHEW	WORLAND	WY
394579	C00580100	P80001571	Trump, Donald J.	CUBIN, FREDERICK	CASPER	WY
394580	C00580100	P80001571	Trump, Donald J.	CUBIN, WILLIAM	CASPER	WY
394581	C00580100	P80001571	Trump, Donald J.	FLYNN, DENNIS	GLENROCK	WY

	cmte_id	cand_id	cand_nm	contbr_nm	contbr_city	contbr
394582	C00580100	P80001571	Trump, Donald J.	CUNDY, BRAD	MILLS	WY
394583	C00580100	P80001571	Trump, Donald J.	BUSH, BRIAN	GILLETTE	WY
394584	C00580100	P80001571	Trump, Donald J.	COSNER, DIANNA	WRIGHT	WY
394585	C00580100	P80001571	Trump, Donald J.	GABRIELSON, STEVEN	JACKSON	WY
394586	C00580100	P80001571	Trump, Donald J.	GABRIELSON, STEVEN	JACKSON	WY
394587	C00580100	P80001571	Trump, Donald J.	NORRIS, JOHN MR.	RAWLINS	WY
394588	C00580100	P80001571	Trump, Donald J.	MCQUISTEN, ROBERT E MR.	CHEYENNE	WY
394589	C00580100	P80001571	Trump, Donald J.	MAGARITY, RUSSELL	WILSON	WY
394590	C00580100	P80001571	Trump, Donald J.	MAIER, JANICE MRS.	SHERIDAN	WY
394591	C00580100	P80001571	Trump, Donald J.	MEYER, E.G.	LARAMIE	WY
394592	C00580100	P80001571	Trump, Donald J.	WOLF, MARVIN MR.	CHEYENNE	WY
394593	C00580100	P80001571	Trump, Donald J.	MADDEN, SHAWN	TORRINGTON	WY
394594	C00580100	P80001571	Trump, Donald J.	PAYNE, KAREN R MS.	LARAMIE	WY
394595	C00580100	P80001571	Trump, Donald J.	WORMUS, PATSY L MRS.	CASPER	WY
394596	C00580100	P80001571	Trump, Donald J.	WYNN, MARILYN	EVANSTON	WY
394597	C00580100	P80001571	Trump, Donald J.	YOUNG, TAMARA	CODY	WY
394598	C00580100	P80001571	Trump, Donald J.	WOLF, JOY MS.	CODY	WY

	cmte_id	cand_id	cand_nm	contbr_nm	contbr_city	contbr
394599	C00580100	P80001571	Trump, Donald J.	WOLF, JOY MS.	CODY	WY
394600	C00580100	P80001571	Trump, Donald J.	MARTTINEN, MIKKO	LAHTI	ZZ
394601	C00580100	P80001571	Trump, Donald J.	JONES, KEVIN	APO	ZZ
394602	C00580100	P80001571	Trump, Donald J.	ZALESKI, HENRYK	HORTEN,3181,NORWAY	ZZ
394603	C00580100	P80001571	Trump, Donald J.	PIERROT, MARC	HONG KONG	ZZ
394604	C00580100	P80001571	Trump, Donald J.	GEDDES, C	AUCKLAND NEW ZEALAND	ZZ
394605	C00580100	P80001571	Trump, Donald J.	GELFAND, BEN	TORONTO	ZZ
394606	C00580100	P80001571	Trump, Donald J.	SYKES, C E R	HUDDERSFIELD ENGLAND	ZZ
394607	C00580100	P80001571	Trump, Donald J.	ZALESKI, HENRYK	HORTEN,3181,NORWAY	ZZ

394608 rows × 18 columns

In [31]: Clinton\_donor = pd.read\_csv('Clinton.csv', index\_col = False, dtype={'Ma
 x. CPC': pd.np.float64})

/Users/tedlam/anaconda/envs/py27/lib/python2.7/site-packages/IPython/core/interactiveshell.py:2717: DtypeWarning: Columns (6,11) have mixed types. Specify dtype option on import or set low\_memory=False. interactivity=interactivity, compiler=compiler, result=result)

In [32]: Clinton\_donor.head()

Out[32]:

	cmte_id	cand_id	cand_nm	contbr_nm	contbr_city	contbr_st	contbr_zip	•
0	C00575795	P00003392	Clinton, Hillary Rodham	LARSEN, CARLENE	DPO	AA	3.4005e+08	1
1	C00575795	P00003392	Clinton, Hillary Rodham	ABUNDO, FRANK	MONTREUX	AA	NaN	I
2	C00575795	P00003392	Clinton, Hillary Rodham	FRASCARELLI, RAFFAELLA	ROME	AA	NaN	ı
3	C00575795	P00003392	Clinton, Hillary Rodham	FRIES- LAFFAILLE, SUSAN	PARIS	AA	NaN	I
4	C00575795	P00003392	Clinton, Hillary Rodham	ROBINSON, TODD	DPO	AA	3.4024e+08	1

In [33]: donor = [Trump\_donor, Clinton\_donor]

In [34]: donor\_df = pd.concat(donor)

In [35]: donor\_df.head()

Out[35]:

	cmte_id	cand_id	cand_nm	contbr_nm	contbr_city	contbr_st	contbr_zip	cor
0	C00580100	P80001571	Trump, Donald J.	ECKERSALL, LAWRENCE	DPO	AA	34004	L-3 CO VEF AEF
1	C00580100	P80001571	Trump, Donald J.	VANBEUGE, ROBERT	APO	AA	34022	U.S OF
2	C00580100	P80001571	Trump, Donald J.	VANBEUGE, ROBERT	APO	AA	34022	U.S OF
3	C00580100	P80001571	Trump, Donald J.	VANBEUGE, ROBERT	APO	AA	34022	U.S OF
4	C00580100	P80001571	Trump, Donald J.	RIVERA, JOSEPH	APO	AE	9643	US

In [36]: donor\_df['contb\_receipt\_amt'].value\_counts()

Out[36]:

25.00 100.00 50.00 5.00 10.00 250.00 19.00 8.00 40.00 80.00 20.00 28.00 38.00 2700.00 75.00 200.00 500.00 1000.00 15.00 3.00 1.00 160.00 24.00 4.00 2.40 11.00 12.00	324509 204168 191429 169088 155761 102702 88725 65093 63633 56243 53380 53261 50776 49041 45013 42884 41372 33567 30262 25604 21764 20028 13968 10569 9354 8395 7477 7312 6931 6907
12000.00 496.13 262.39 4.55 261.36 239.55 52.73 48.07 52.27 112.92 1198.55 1192.70 507.12 6.96 47.75 234.30 113.17 1188.30 34.26 234.55 113.08 232.70 1302.87 52.77 233.05 112.83	1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1

```
217.68 1
266.64 1
232.45 1
155.78 1
Name: contb_receipt_amt, dtype: int64
```

```
In [37]: don_mean = donor_df['contb_receipt_amt'].mean()
    don_std = donor_df['contb_receipt_amt'].std()
    print 'The average donation was %.2f with a std %.2f' %(don_mean, don_st d)
```

The average donation was 177.01 with a std 12444.56

```
In [38]: top_donor = donor_df['contb_receipt_amt'].copy()
     top_donor.sort()
     top_donor
```

/Users/tedlam/anaconda/envs/py27/lib/python2.7/site-packages/ipykernel/ \_\_main\_\_.py:3: FutureWarning: sort is deprecated, use sort\_values(inplace=True) for INPLACE sorting app.launch\_new\_instance() Out[38]:

175921	-84236.80
545860	-20000.00
381740	-6574.19
376112	-5463.57
376113	-5463.57
381739	-5459.49
940085	-5400.00
1252498	-5400.00
573376	-5400.00
908439	-5400.00
1217962	-5400.00
1217945	-5400.00
118675	-5400.00
1217794	-5400.00
231077	-5400.00
1212059	-5400.00
1588433	-5400.00
265666	-5400.00
143123	-5400.00
1211966	-5400.00
143207	-5400.00
930067	-5400.00
26220	-5400.00
545756	-5400.00
1168682	-5400.00
70373	-5200.00
70139	-5200.00
1143210	-5000.00
265529	-5000.00
1170202	-5000.00
11/0202	-3000.00
	• • •
1266583	5400.00
586205	5400.00
327652	5400.00
65054	5400.00
558066	5400.00
1558047	5400.00
1237448	5400.00
390485	5400.00
395030	7300.00
91965	10000.00
163957	10000.00
228782	10000.00
210306	10000.00
380550	10000.00
378837	10030.24
255560	12000.00
118669	12500.00
557920	20000.00
175999	86936.80
1333268	
	1467070.94
	1467070.94
1323962	1603724.41
1323962	1603724.41
1323962 1240153 1312765	1603724.41 1797624.94 2069248.84
1323962 1240153 1312765 1369111	1603724.41 1797624.94 2069248.84 3600489.08
1323962 1240153 1312765 1369111 1242816	1603724.41 1797624.94 2069248.84 3600489.08 3686373.26
1323962 1240153 1312765 1369111	1603724.41 1797624.94 2069248.84 3600489.08

1330636

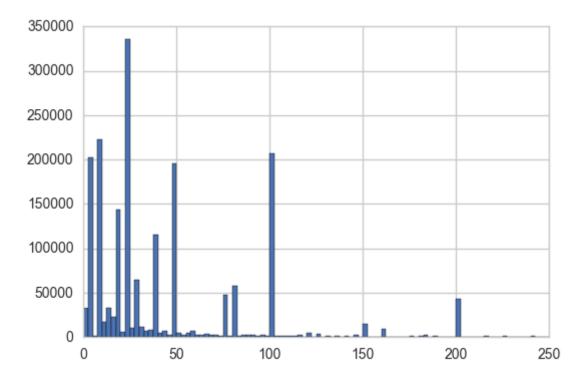
4904860.51

```
1290608
                      6358481.89
         1314211
                      7402361.45
         1165273
                     12777705.58
         Name: contb_receipt_amt, dtype: float64
In [39]:
         top_donor = top_donor [top_donor > 0]
         top_donor.sort()
         top donor.value counts().head(10)
         /Users/tedlam/anaconda/envs/py27/lib/python2.7/site-packages/ipykernel/
          main__.py:3: FutureWarning: sort is deprecated, use sort_values(inpla
         ce=True) for INPLACE sorting
           app.launch_new_instance()
Out[39]: 25.0
                   324509
         100.0
                  204168
         50.0
                  191429
         5.0
                   169088
         10.0
                   155761
         250.0
                   102702
         19.0
                    88725
         8.0
                    65093
         40.0
                    63633
         80.0
                    56243
         Name: contb_receipt_amt, dtype: int64
```

The top most donation amount

```
In [40]: com_don = top_donor[top_donor < 250]
    com_don.hist(bins = 100)</pre>
```

Out[40]: <matplotlib.axes.\_subplots.AxesSubplot at 0x13bc181d0>



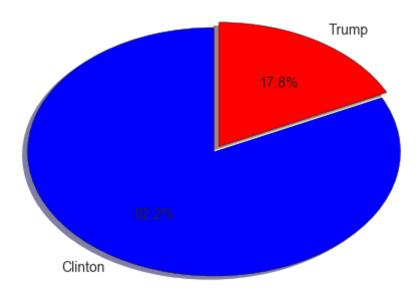
## The graph of most common donations

```
In [41]: donor_df.groupby('cand_nm')['contb_receipt_amt'].count()
```

Out[41]: cand\_nm

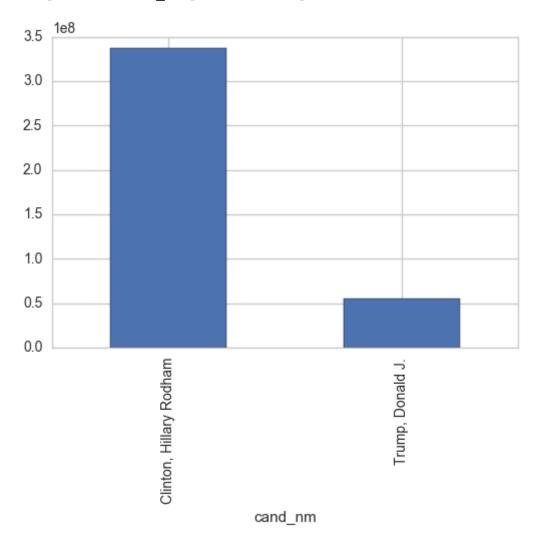
Clinton, Hillary Rodham 1818440
Trump, Donald J. 394608
Name: contb\_receipt\_amt, dtype: int64

In [42]: from pylab import \*



Clinton has 82.2% of donor

Out[44]: <matplotlib.axes.\_subplots.AxesSubplot at 0x1198e47d0>



In [46]: pwd
Out[46]: u'/Users/tedlam'

In [ ]: