data analytics project of consumer complaints

```
In [2]: import pandas as pd
    import numpy as np
    import os
    import matplotlib.pyplot as plt
    import seaborn as sns
```

project analysis

- 1. business problem
- 2. data extraction
- 3. basics analysis
- 4. eda
- 5. data cleaning

```
In [3]: os.chdir(r"C:\machine learning\consumer complaints")
In [7]: complaint=pd.read_csv("consumer_complaints.csv")
```

In [8]: | complaint.head()

Out[8]:

	date_received	product	sub_product	issue	sub_issue	consumer_complaint_narrative	company_publ
0	08/30/2013	Mortgage	Other mortgage	Loan modification,collection,foreclosure	NaN	NaN	
1	08/30/2013	Mortgage	Other mortgage	Loan servicing, payments, escrow account	NaN	NaN	
2	08/30/2013	Credit reporting	NaN	Incorrect information on credit report	Account status	NaN	
3	08/30/2013	Student loan	Non-federal student loan	Repaying your loan	Repaying your loan	NaN	
4	08/30/2013	Debt collection	Credit card	False statements or representation	Attempted to collect wrong amount	NaN	

```
In [10]: complaint.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 555957 entries, 0 to 555956
         Data columns (total 18 columns):
              Column
                                            Non-Null Count
                                                             Dtype
          0
              date_received
                                            555957 non-null object
          1
              product
                                            555957 non-null object
              sub product
                                            397635 non-null object
          3
              issue
                                            555957 non-null object
                                            212622 non-null object
          4
              sub issue
              consumer_complaint_narrative 66806 non-null
                                                             object
              company_public_response
                                            85124 non-null
                                                             object
          7
              company
                                            555957 non-null object
              state
                                            551070 non-null object
              zipcode
                                            551452 non-null object
          10 tags
                                            77959 non-null
                                                             object
          11 consumer_consent_provided
                                            123458 non-null object
          12 submitted via
                                            555957 non-null object
                                            555957 non-null object
          13 date_sent_to_company
          14 company_response_to_consumer 555957 non-null object
          15 timely response
                                            555957 non-null object
          16 consumer disputed?
                                            555957 non-null
                                                             object
          17 complaint id
                                            555957 non-null int64
         dtypes: int64(1), object(17)
         memory usage: 76.3+ MB
In [12]: complaint.shape
Out[12]: (555957, 18)
In [13]: complaint.describe()
Out[13]:
                complaint_id
          count 5.559570e+05
          mean 9.600510e+05
            std 5.504296e+05
           min 1.000000e+00
           25% 4.863230e+05
           50% 9.737830e+05
           75% 1 441702e+06
           max 1.895894e+06
In [14]: def missing(data):
             per=data.isnull().sum()/len(data)*100
             miss=data.isnull().sum()
             missing_v=pd.concat([miss,per],keys=["missing","percentage"],axis=1)
             missing_val=missing_v[missing_v["missing"]>=1]#missing values in the data
             return missing val
In [16]: missing_data=missing(complaint)
         #missing_data.to_csv(r"C:\machine learning\consumer complaints\missing_per.csv")
```

```
In [17]: missing_data
```

Out[17]:

```
missing percentage
                                        28.477382
                              158322
                sub_product
                               343335
                                        61.755675
                  sub_issue
                               489151
                                        87.983603
consumer_complaint_narrative
   company_public_response
                               470833
                                        84.688744
                                4887
                                         0.879025
                       state
                     zipcode
                                4505
                                         0.810314
                               477998
                                        85.977513
                        tags
 consumer_consent_provided
                               432499
                                        77.793606
```

```
In [19]: missing_data.columns
Out[19]: Index(['missing', 'percentage'], dtype='object')
In [20]: complaint.columns
Out[20]: Index(['date_received', 'product', 'sub_product', 'issue', 'sub_issue',
                  'consumer_complaint_narrative', 'company_public_response', 'company',
                  'state', 'zipcode', 'tags', 'consumer_consent_provided',
                 'submitted_via', 'date_sent_to_company', 'company_response_to_consumer', 'timely_response', 'consumer_disputed?', 'complaint_id'],
                dtype='object')
In [31]: product=complaint["product"].value counts()/len(complaint["product"])*100
          product
Out[31]: Mortgage
                                       33.541263
          Debt collection
                                       18.176226
          Credit reporting
                                       16.521781
          Credit card
                                       11.955601
          Bank account or service
                                       11.253208
          Consumer Loan
                                        3.775472
          Student loan
                                       2.848961
          Payday loan
                                        0.697356
          Money transfers
                                        0.685665
          Prepaid card
                                        0.444279
          Other financial service
                                        0.100188
          Name: product, dtype: float64
In [34]: #product.to csv("C:\machine learning\consumer complaints\product.csv")
In [38]: ! pip install plotly
```

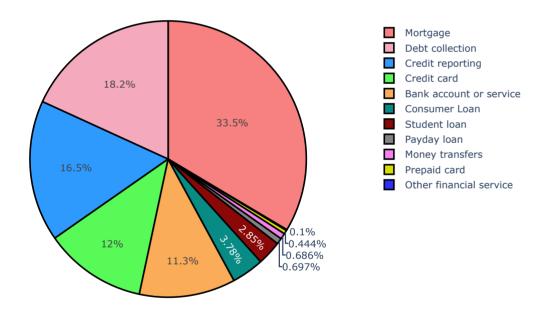
Requirement already satisfied: plotly in c:\users\aksha\anaconda3\lib\site-packages (4.11.0)

Requirement already satisfied: six in c:\users\aksha\anaconda3\lib\site-packages (from plotly) (1.14.0) Requirement already satisfied: retrying>=1.3.3 in c:\users\aksha\anaconda3\lib\site-packages (from plot

ly) (1.3.3)

```
import plotly.tools as tls
#import chart_studio.plotly as py
import plotly.figure_factory as ff
import plotly.graph_objs as go
from plotly.offline import download_plotlyjs, init_notebook_mode, plot, iplot
init_notebook_mode(connected=True)
```

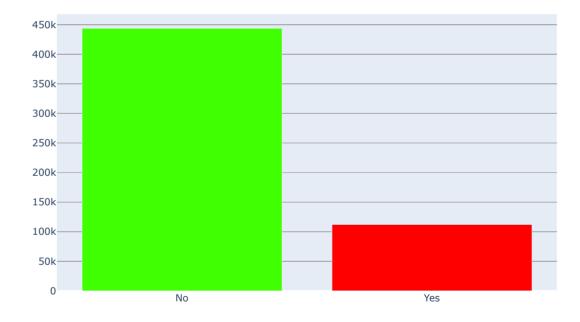
Product Types



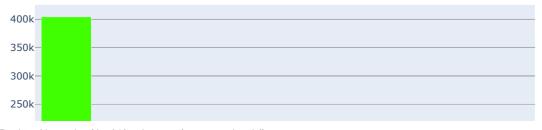
```
In [52]: def count values in column(data, feature):
              total=data.loc[:,feature].value_counts(dropna=False)
              percentage=round(data.lo[:,feature].value_counts(dropna=False,normalize=True)*100,2)
              return pd.concat([total,percentage],axis=1,keys=['Total','Percentage'])
In [53]: count_values_in_column(complaint,"company_response_to_consumer")
Out[53]:
                                        Total
                                              Percentage
                 Closed with explanation
                                      404293
                                                   72.72
           Closed with non-monetary relief
                                       70237
                                                   12.63
                                                    6.88
              Closed with monetary relief
                                       38262
                    Closed without relief
                                                    3.22
                                        17909
                                        13399
                                                    2.41
                               Closed
                       Closed with relief
                                        5305
                                                    0.95
                           In progress
                                        3763
                                                    0.68
                     Untimely response
                                        2789
                                                    0.50
In [54]: count_values_in_column(complaint,"consumer_disputed?")
Out[54]:
                 Total Percentage
               443823
                            79.83
           Yes 112134
                            20.17
In [58]: disputed=complaint["consumer_disputed?"].value_counts()
In [61]: consumer=complaint["company response to consumer"].value counts()
```

```
In [63]: total_complaints_plotly = go.Bar(
                     x=disputed.index.values,
                     y=disputed.values,
             text = 'Complaints',
             showlegend=False,
             marker=dict(
                 color=['#40FF00', '#FF0000'])
         layout = go.Layout(title='consumer disputed')
         fig = go.Figure(data=[total_complaints_plotly], layout=layout)
         iplot(fig)
         complaints_plotly = go.Bar(
                     x=consumer.index.values,
                     y=consumer.values,
             text = 'Complaints',
             showlegend=False,
             marker=dict(
                 color=['#40FF00', '#FF0000', '#2E9AFE', '#58FA58', '#FAAC58', '#088A85', '#840808', '#848484'])
         layout1 = go.Layout(title='consumer response')
         fig = go.Figure(data=[complaints_plotly], layout=layout1)
         iplot(fig)
```

consumer disputed



consumer response





In [79]: top_5=count_values_in_column(com_dis_yes,"company")[:5]
top_5

Out[79]:

	Total	Percentage
Bank of America	12480	11.13
Wells Fargo & Company	9644	8.60
JPMorgan Chase & Co.	7716	6.88
Equifax	6647	5.93
Citibank	5245	4.68

In [80]: least_5=count_values_in_column(com_dis_No,"company")[:5]
least_5

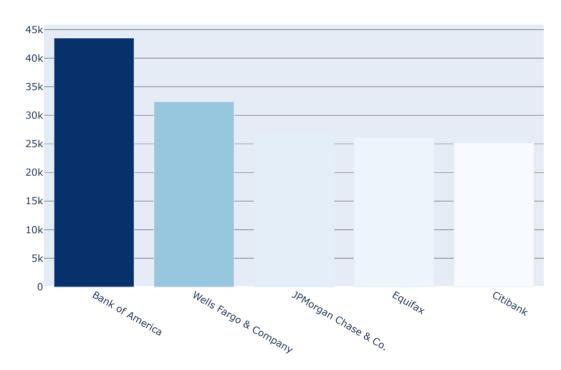
Out[80]:

	Total	Percentage
Bank of America	43518	9.81
Wells Fargo & Company	32380	7.30
Experian	27014	6.09
JPMorgan Chase & Co.	26165	5.90
Equifax	25181	5.67

```
In [85]: least5=com_dis_No["company"].value_counts()[:5]
```

In [86]: top5=com_dis_yes["company"].value_counts()[:5]

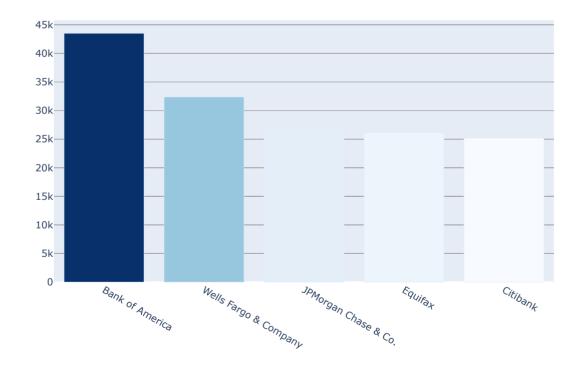
consumer response



Out[101]:

	iotai	Percentage
Bank of America	43518	9.81
Wells Fargo & Company	32380	7.30
Experian	27014	6.09
JPMorgan Chase & Co.	26165	5.90
Equifax	25181	5.67

consumer response



top 5 companies most desputes by year

```
In [104]: complaint.columns
Out[104]: Index(['date received', 'product', 'sub product', 'issue', 'sub issue',
                   'consumer_complaint_narrative', 'company_public_response', 'company',
                  'state', 'zipcode', 'tags', 'consumer_consent_provided',
                  'submitted_via', 'date_sent_to_company', 'company_response_to_consumer', 'timely_response', 'consumer_disputed?', 'complaint_id'],
                 dtype='object')
In [105]: complaint.dtypes
Out[105]: date_received
                                             object
           product
                                             object
           sub_product
                                             object
           issue
                                             object
           sub issue
                                             object
           consumer_complaint_narrative
                                             object
           company_public_response
                                             object
           company
                                             object
           state
                                             object
           zipcode
                                             object
           tags
                                             object
           consumer_consent_provided
                                             object
           submitted via
                                             object
           date sent to company
                                             object
           company response to consumer
                                             object
           timely_response
                                             object
           consumer_disputed?
                                             object
           complaint_id
                                              int64
           dtype: object
In [106]: import datetime as dt
In [107]: complaint["date received"]=pd.to datetime(complaint["date received"])
In [108]: complaint["date_received"].dtype
Out[108]: dtype('<M8[ns]')</pre>
In [109]: complaint["date received"]
Out[109]: 0
                    2013-08-30
           1
                    2013-08-30
           2
                    2013-08-30
           3
                    2013-08-30
                    2013-08-30
                    2014-07-01
           555952
           555953
                    2014-07-01
           555954
                    2012-07-10
           555955
                    2015-04-14
           555956
                    2014-08-14
           Name: date_received, Length: 555957, dtype: datetime64[ns]
In [110]: |],complaint["date_received_month"]=complaint["date_received"].dt.year,complaint["date_received"].dt.month
```

```
In [115]: complaint.iloc[:,-2:]
```

Out[115]:

	date_received_year	date_received_month
0	2013	8
1	2013	8
2	2013	8
3	2013	8
4	2013	8
555952	2014	7
555953	2014	7
555954	2012	7
555955	2015	4
555956	2014	8

555957 rows × 2 columns

```
In [116]: complaint.columns
Out[116]: Index(['date_received', 'product', 'sub_product', 'issue', 'sub_issue',
                   consumer_complaint_narrative', 'company_public_response', 'company',
                  'state', 'zipcode', 'tags', 'consumer_consent_provided',
                  'submitted_via', 'date_sent_to_company', 'company_response_to_consumer', 'timely_response', 'consumer_disputed?', 'complaint_id',
                  'date_received_year', 'date_received_month'],
                 dtype='object')
In [122]: group=complaint.groupby(["date_received_year","consumer_disputed?"])["company"].apply(lambda x: x.value_d
In [129]: grou_d={"crm":group}
In [130]: grou_d
Out[130]: {'crm': date_received_year consumer_disputed?
                                                      Bank of America
            2011
                                 No
                                                                                        432
                                                      JPMorgan Chase & Co.
                                                                                        298
                                                                                         255
                                                      Citibank
                                                      Capital One
                                                                                        201
                                                      Wells Fargo & Company
                                                                                        170
            2016
                                 Yes
                                                      United PanAm Financial Corp.
                                                                                          1
                                                      Prince Parker & Associates
                                                                                          1
                                                      Blitt and Gaines, P.C.
                                                                                          1
                                                      Avante
                                                                                          1
                                                      Ragan & Ragan, PC
            Name: company, Length: 13399, dtype: int64}
In [137]: crm=pd.DataFrame(data=grou_d).reset_index()
           crm=crm.sort_values(by="crm",ascending=False)
           crm.columns
Out[137]: Index(['date_received_year', 'consumer_disputed?', 'level_2', 'crm'], dtype='object')
```

```
In [139]: crm.rename(columns={"level 2":"company"},inplace=True)
In [140]: crm
Out[140]:
                   date_received_year consumer_disputed?
                                                                     company
                                                                                crm
              782
                               2013
                                                   No
                                                                Bank of America
                                                                               12889
                               2012
              112
                                                   No
                                                                Bank of America
                                                                               12323
             6364
                               2015
                                                                      Experian
                                                                               9448
                                                   No
                               2015
             6365
                                                                               9332
                                                                       Equifax
                                                   Nο
                               2014
             2890
                                                                               8996
                                                   Nο
                                                                      Experian
             9001
                               2015
                                                   No
                                                          Seashine Financial, LLC
                                                                                   1
             9000
                               2015
                                                   No
                                                            G & D COMPLIANCE
             8999
                               2015
                                                        Cannon & Cannon Firm PC
                                                   No
             8998
                               2015
                                                   No
                                                        Bifulco and Associates, P.C.
            13398
                               2016
                                                   Yes
                                                             Ragan & Ragan, PC
                                                                                   1
           13399 rows × 4 columns
In [141]: crm.head()
Out[141]:
                  date_received_year consumer_disputed?
                                                           company
                                                                       crm
             782
                              2013
                                                                     12889
                                                  No
                                                      Bank of America
             112
                              2012
                                                      Bank of America
                                                                     12323
                                                   Nο
                              2015
            6364
                                                   No
                                                            Experian
                                                                      9448
            6365
                              2015
                                                             Equifax
                                                                      9332
                                                   No
            2890
                              2014
                                                   No
                                                            Experian
                                                                      8996
In [145]: top5#top 5 bank list of the data
Out[145]: Bank of America
                                      12480
           Wells Fargo & Company
                                       9644
           JPMorgan Chase & Co.
                                        7716
           Equifax
                                        6647
           Citibank
                                        5245
           Name: company, dtype: int64
In [147]: boa=crm[(crm["company"]=="Bank of America")&(crm["consumer_disputed?"]=="Yes")]
           wfc=crm[(crm["company"]=="Wells Fargo & Company")&(crm["consumer_disputed?"]=="Yes")]
           jpmorgan=crm[(crm["company"]=="JPMorgan Chase & Co.")&(crm["consumer_disputed?"]=="Yes")]
           equi=crm[(crm["company"]=="Equifax")&(crm["consumer_disputed?"]=="Yes")]
           citi=crm[(crm["company"]=="Citibank")&(crm["consumer disputed?"]=="Yes")]
In [148]: boa.columns
Out[148]: Index(['date received year', 'consumer disputed?', 'company', 'crm'], dtype='object')
In [159]: years=crm["date_received_year"].unique().tolist()
```

```
In [151]: boa_amount=boa["crm"].values.tolist()
    wfc_amount=wfc["crm"].values.tolist()
    jp_amount=jpmorgan["crm"].values.tolist()
    equi_amount=equi["crm"].values.tolist()
    citi_amount=citi["crm"].values.tolist()

In [155]: boa_text=[str(b) + " \n disputes" for b in boa_amount]
    wfc_text=[str(w) + " \n disputes" for w in wfc_amount]
    jp_text=[str(j) + " \n disputes" for j in jp_amount]
    eq_text=[str(e) + " \n disputes" for e in equi_amount]
    citi_text=[str(c) + " \n disputes" for c in citi_amount]
```

```
In [165]: boa disputes chart = go.Scatter(
              x=years,
              y=boa_amount,
              text=boa_text,
              name='Bank of America',
              hoverinfo='x+text',
              mode='lines',
              line=dict(width=1,
                        color='rgb(0, 22, 235)',
                        ),
              fill='tonexty'
          wfc_disputes_chart = go.Scatter(
              x=years,
              y=wfc_amount,
              text=wfc_text,
              name='Wells Fargo & Company',
              hoverinfo='x+text',
              mode='lines'.
              line=dict(width=1,
                        color='rgb(275, 170, 0)',
                        ),
              fill='tonexty'
          jp_disputes_chart = go.Scatter(
              x=years,
              y=jp_amount,
              text=jp_text,
              name='jp morgan & Company',
              hoverinfo='x+text',
              mode='lines',
              line=dict(width=1,
                        color='rgb(200, 0, 135)',
                        ),
              fill='tonexty'
          )
          equi_disputes_chart = go.Scatter(
              x=years,
              y=equi_amount,
              text=eq_text,
              name='equi & Company',
              hoverinfo='x+text',
              mode='lines',
              line=dict(width=1,
                        color='rgb(0, 145, 175)',
                        ),
              fill='tonexty'
          )
          citi_disputes_chart = go.Scatter(
              x=years,
              y=citi_amount,
              text=citi_text,
              name='citi bank & Company',
              hoverinfo='x+text',
              mode='lines',
              line=dict(width=1,
                        color='rgb(100, 22, 170)',
                        ),
              fill='tonexty'
          layout = dict(title = 'Number of Disputes <br> (Top 5 Companies)',
                         xaxis = dict(title = 'Year'),
                        yaxis = dict(title = 'Number of Disputes')
          data=[boa_disputes_chart,wfc_disputes_chart,jp_disputes_chart,equi_disputes_chart,citi_disputes_chart]
          fig = dict(data=data, layout=layout)
```

iplot(fig, filename='basic-area-no-bound')

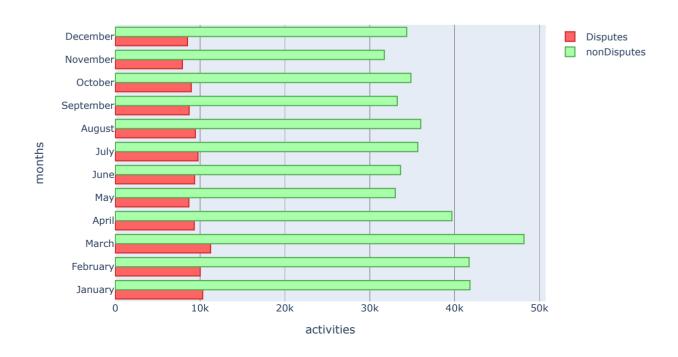
Number of Disputes (Top 5 Companies)



```
In [173]:
         dis jan=len(customerservice per month(1, "Yes"))
         dis_feb=len(customerservice_per_month(2,"Yes"))
         dis_mar=len(customerservice_per_month(3,"Yes"))
         dis_apr=len(customerservice_per_month(4,"Yes"))
         dis_may=len(customerservice_per_month(5,"Yes"))
         dis jun=len(customerservice per month(6, "Yes"))
         dis jul=len(customerservice per month(7, "Yes"))
          dis aug=len(customerservice per month(8, "Yes"))
         dis_sep=len(customerservice_per_month(9,"Yes"))
         dis_oct=len(customerservice_per_month(10,"Yes"))
         dis_nov=len(customerservice_per_month(11,"Yes"))
          dis dec=len(customerservice per month(12, "Yes"))
In [172]: ndis_jan=len(customerservice_per_month(1, "No"))
          ndis_feb=len(customerservice_per_month(2,"No"))
          ndis_mar=len(customerservice_per_month(3,"No"))
          ndis apr=len(customerservice per month(4, "No"))
         ndis_may=len(customerservice_per_month(5,"No"))
         ndis_jun=len(customerservice_per_month(6,"No"))
         ndis jul=len(customerservice per month(7, "No"))
         ndis_aug=len(customerservice_per_month(8,"No"))
         ndis_sep=len(customerservice_per_month(9,"No"))
         ndis_oct=len(customerservice_per_month(10,"No"))
         ndis nov=len(customerservice per month(11, "No"))
         ndis dec=len(customerservice per month(12, "No"))
         In [174]:
         disputes_bymonth=[dis_jan,dis_feb,dis_mar,dis_apr,dis_may,dis_jun,dis_jul,dis_aug,dis_sep,dis_oct,
                          dis_nov,dis_dec]
          ndisputes bymonth=[ndis jan,ndis feb,ndis mar,ndis apr,ndis may,ndis jun,ndis jul,ndis aug,ndis sep,ndis
                          ndis_nov,ndis_dec]
```

```
In [184]:
          disputes_chart = go.Bar(
              y=months,
              x=disputes_bymonth,
              orientation='h',
              name='Disputes',
              text='Disputes',
              marker=dict(
                  color='#FF6464',
              line=dict(
                  color='#CD3232',
                  width=1.5
              ))
          ndisputes_chart = go.Bar(
              y=months,
              x=ndisputes_bymonth,
              orientation='h',
              name='nonDisputes',
              text='nonDisputes',
              marker=dict(
                  color='#A9FFA9',
              line=dict(
                  color='#59AF59',
                  width=1.5
              ))
          data=[disputes chart, ndisputes chart]
          layout = dict(title = 'Number of activities by month',
                         xaxis = dict(title = 'activities'),
                        yaxis = dict(title = 'months')
          fig = dict(data=data,layout=layout)
          iplot(fig, filename='basic-area-no-bound')
```

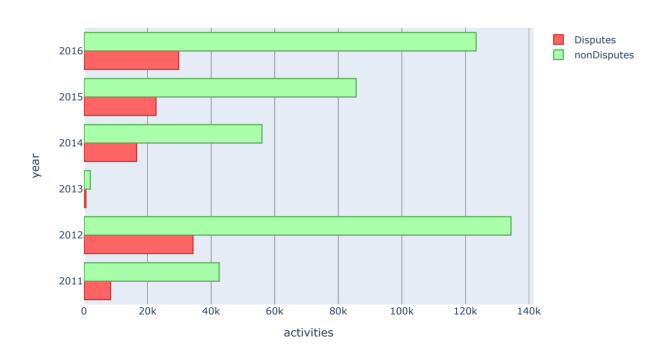
Number of activities by month



```
In [237]: complaint["date received year"].value counts()
Out[237]: 2015
                  168621
          2014
                  153138
          2013
                  108273
          2012
                   72523
          2016
                   50853
          2011
                    2549
          Name: date_received_year, dtype: int64
In [239]: dis 11=len(customerservice per month1(2011, "Yes"))
          dis_12=len(customerservice_per_month1(2012, "Yes"))
          dis_13=len(customerservice_per_month1(2013, "Yes"))
          dis_14=len(customerservice_per_month1(2014,"Yes"))
          dis 15=len(customerservice per month1(2015, "Yes"))
          dis_16=len(customerservice_per_month1(2016, "Yes"))
In [240]: ndis 11=len(customerservice per month1(2011, "No"))
          ndis_12=len(customerservice_per_month1(2012,"No"))
          ndis_13=len(customerservice_per_month1(2013,"No"))
          ndis_14=len(customerservice_per_month1(2014,"No"))
          ndis_15=len(customerservice_per_month1(2015,"No"))
          ndis_16=len(customerservice_per_month1(2016,"No"))
In [241]: disputes year=[dis 11,dis 12,dis 13,dis 14,dis 15,dis 16]
          non disputes year=[ndis 11,ndis 12,ndis 13,ndis 14,ndis 15,ndis 16]
```

```
In [242]: disputes_chart1 = go.Bar(
               y=year,
               x=disputes_year,
               orientation='h',
               name='Disputes',
               text='Disputes',
               marker=dict(
                   color='#FF6464',
               line=dict(
                   color='#CD3232',
                   width=1.5
               ))
           )
           ndisputes_chart1 = go.Bar(
               y=year,
               x=non_disputes_year,
               orientation='h',
               name='nonDisputes',
               text='nonDisputes',
               marker=dict(
                   color='#A9FFA9',
               line=dict(
                   color='#59AF59',
                   width=1.5
               ))
           data=[disputes_chart1,ndisputes_chart1]
           layout = dict(title = 'Number of activities by year',
                         xaxis = dict(title = 'activities'),
yaxis = dict(title = 'year')
           fig = dict(data=data,layout=layout)
           iplot(fig, filename='basic-area-no-bound')
```

Number of activities by year



```
In [ ]:
In [186]: #from collections import Counter
           import nltk
           import matplotlib.pyplot as plt
           import seaborn as sns
           from wordcloud import WordCloud, STOPWORDS
In [188]: stopwords=set(STOPWORDS)
           complaint.columns
Out[188]: Index(['date_received', 'product', 'sub_product', 'issue', 'sub_issue',
                   consumer_complaint_narrative', 'company_public_response', 'company',
                  'state', 'zipcode', 'tags', 'consumer_consent_provided',
                  'submitted_via', 'date_sent_to_company', 'company_response_to_consumer', 'timely_response', 'consumer_disputed?', 'complaint_id',
                  'date_received_year', 'date_received_month'],
                 dtype='object')
In [189]: |complaint["issue"].value_counts()
Out[189]: Loan modification, collection, foreclosure
                                                          97191
           Incorrect information on credit report
                                                          66718
           Loan servicing, payments, escrow account
                                                          60375
           Cont'd attempts collect debt not owed
                                                          42285
           Account opening, closing, or management
                                                          26661
           Lost or stolen money order
                                                             25
           Incorrect exchange rate
                                                             16
           Lender damaged or destroyed vehicle
                                                              5
                                                              5
           Lender sold the property
           Lender damaged or destroyed property
                                                              1
           Name: issue, Length: 95, dtype: int64
In [193]: dis issue=complaint["issue"].loc[complaint["consumer disputed?"]=="Yes"]
           ndis_issue=complaint["issue"].loc[complaint["consumer_disputed?"]=="No"]
```

```
In [274]: disputed wordcloud = WordCloud(
              background_color='black',
              stopwords=stopwords,
              max_words=200,
              max font size=40,
              random state=42
              ).generate(str(dis_issue)
          ndisputed_wordcloud = WordCloud(
              background_color='black',
              stopwords=stopwords,
              max_words=200,
              max_font_size=40,
              random state=42
              ).generate(str(ndis_issue)
          fig = plt.figure(figsize=(16,8))
          fig.add_subplot(221)
          plt.imshow(disputed_wordcloud)
          plt.title('Main Issues with Disputes', fontsize=16)
          plt.axis('off')
          fig = plt.figure(figsize=(16,8))
          fig.add subplot(221)
          plt.imshow(ndisputed_wordcloud)
          plt.title('Main Issues with non Disputes', fontsize=16)
          plt.axis('off')
```

Out[274]: (-0.5, 399.5, 199.5, -0.5)

Main Issues with Disputes

```
account Loan representation
statements line Repaying
processing modification
Application modification
Managing collection closing object
foreclosure caused issue tength problems payments delay servicing Falsedtype opening management
```

Main Issues with non Disputes

```
debt Coan Cont'd issue debt Incorrect decrease collection credit Owed servicing object Withdrawals line dtype modification collect report information attempts foreclosure Deposits payments
```

```
In [195]: top5

Out[195]: Bank of America 12480
Wells Fargo & Company 9644
JPMorgan Chase & Co. 7716
Equifax 6647
Citibank 5245
Name: company, dtype: int64
```

```
In [207]: disputed wordcloud boa = WordCloud(
              background_color='rgb(195, 36, 36)',
              stopwords=stopwords,
              max_words=200,
              max font size=40,
              random state=42
              ).generate(str(boa)
          disputed_wordcloud_wfs = WordCloud(
              background_color='rgb(195, 36, 36)',
              stopwords=stopwords,
              max words=200,
              max font size=40,
              random_state=42
              ).generate(str(wfc)
          disputed_wordcloud_jp = WordCloud(
              background_color='rgb(195, 36, 36)',
              stopwords=stopwords,
              max_words=200,
              max_font_size=40,
              random state=42
              ).generate(str(jp)
          disputed_wordcloud_eq = WordCloud(
              background color='rgb(195, 36, 36)',
              stopwords=stopwords,
              max words=200,
              max_font_size=40,
              random_state=42
              ).generate(str(eqi)
          )
          disputed wordcloud cit = WordCloud(
              background_color='rgb(195, 36, 36)',
              stopwords=stopwords,
              max_words=200,
              max_font_size=40,
              random state=42
              ).generate(str(cit)
          fig = plt.figure(figsize=(16,8))
          fig.add_subplot(221)
          plt.imshow(disputed_wordcloud_boa)
          plt.title('Main Issues with Disputes bank of america', fontsize=16)
          plt.axis('off')
          fig = plt.figure(figsize=(16,8))
          fig.add_subplot(221)
          plt.imshow(disputed_wordcloud_wfs)
          plt.title('Main Issues with Disputes Wells Fargo & Company', fontsize=16)
          plt.axis('off')
          fig = plt.figure(figsize=(16,8))
          fig.add_subplot(221)
          plt.imshow(disputed_wordcloud_jp)
          plt.title('Main Issues with Disputes jp morgan and co.', fontsize=16)
          plt.axis('off')
          fig = plt.figure(figsize=(16,8))
          fig.add subplot(221)
          plt.imshow(disputed_wordcloud_eq)
          plt.title('Main Issues with Disputes equi', fontsize=16)
          plt.axis('off')
          fig = plt.figure(figsize=(16,8))
          fig.add_subplot(221)
```

```
plt.imshow(disputed_wordcloud_cit)
plt.title('Main Issues with Disputes city bank ', fontsize=16)
plt.axis('off')
```

Out[207]: (-0.5, 399.5, 199.5, -0.5)

Main Issues with Disputes bank of america

```
originator Loan account
ApplicationDeposits sescrow escrow modifications disputes
foreclosure mortgage broker
payments servicing
Billing collection Name Length
```

Main Issues with Disputes Wells Fargo & Company

```
Company
Fargo crmYes

consumer_disputed
Wells date_received_year
```

Main Issues with Disputes jp morgan and co.

```
opening Loan account management payments ATM escrow collection dispute foreclosure Cancelling debit Closing Deposits debt Name Modification dtype
```

Main Issues with Disputes equi

```
investigation companyreport
score Length reporting Incorrect information
```

Main Issues with Disputes city bank



In []:

complaint top 5 company

In []:

In [256]: top5

Out[256]: Bank of America 12480 Wells Fargo & Company 9644 JPMorgan Chase & Co. 7716 Equifax 6647 Citibank 5245 Name: company, dtype: int64

In [246]: dispute_presence = complaint.loc[complaint['consumer_disputed?'] == 'Yes'] cross_month = pd.crosstab(dispute_presence['state'], dispute_presence['company']).apply(lambda x: x/x.sun cross_month.head()#while using cross tab state will be row and company will be column

Out[246]:

company	1st Alliance Lending	1st Capital Mortgage, LLC	1st Franklin Financial Corporation	1st Maryland Mortgage Corporation	1st Midwest Mortgage Corp	1st Money Center, Inc.	1st Priority Mortgage, Inc.	21st Mortgage Corporation	360 Mortgage	3rd Generation, Inc.	 2
state											
AA	0.0	0.0	0.000000	0.0	0.0	0.0	0.0	0.0	0.0	0.0	 _
AE	0.0	0.0	0.000000	0.0	0.0	0.0	0.0	0.0	0.0	0.0	
AK	0.0	0.0	0.000000	0.0	0.0	0.0	0.0	0.0	0.0	0.0	
AL	0.0	0.0	44.44444	0.0	0.0	0.0	0.0	0.0	0.0	0.0	
AP	0.0	0.0	0.000000	0.0	0.0	0.0	0.0	0.0	0.0	0.0	

5 rows × 2105 columns

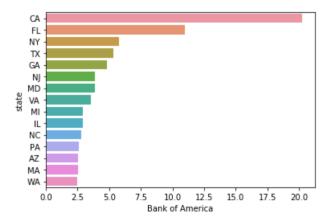
In [261]: df_boa = pd.DataFrame(cross_month['Bank of America']).reset_index().sort_values(by="Bank of America", asc
boa_2=df_boa[df_boa["Bank of America"]>=2]
boa_2

Out[261]:

	state	Bank of America
8	CA	20.22
13	FL	11.00
42	NY	5.78
53	TX	5.33
15	GA	4.82
39	NJ	3.89
26	MD	3.86
55	VA	3.54
29	MI	2.91
20	IL	2.90
35	NC	2.82
46	PA	2.60
7	AZ	2.56
25	MA	2.55
58	WA	2.48

In [255]: sns.barplot(boa_2["Bank of America"],boa_2["state"])

Out[255]: <matplotlib.axes._subplots.AxesSubplot at 0x1dd20628088>



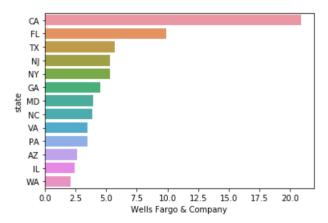
```
In [260]: df_wfs = pd.DataFrame(cross_month['Wells Fargo & Company']).reset_index().sort_values(by="Wells Fargo & Co
```

Out[260]:

		state	Wells Fargo & Company
	8	CA	20.88
1	3	FL	9.86
5	3	TX	5.67
3	9	NJ	5.32
4	2	NY	5.29
1	5	GA	4.54
2	6	MD	3.92
3	5	NC	3.87
5	5	VA	3.49
4	6	PA	3.48
	7	AZ	2.59
2	0	IL	2.41
5	8	WA	2.13

```
In [262]: sns.barplot(wfs_2["Wells Fargo & Company"],wfs_2["state"])
```

Out[262]: <matplotlib.axes._subplots.AxesSubplot at 0x1dd1ec0d848>



```
In [263]: top5
```

Out[263]: Bank of America 12480
Wells Fargo & Company 9644
JPMorgan Chase & Co. 7716
Equifax 6647
Citibank 5245
Name: company, dtype: int64

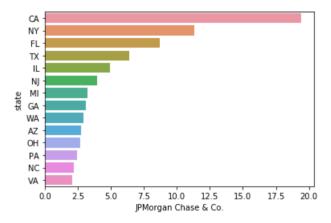
```
In [264]: jp = pd.DataFrame(cross_month['JPMorgan Chase & Co.']).reset_index().sort_values(by="JPMorgan Chase & Co.
jp
jp=jp[jp["JPMorgan Chase & Co."]>=2]
jp
```

Out[264]:

	state	JPMorgan Chase & Co.
8	CA	19.40
42	NY	11.34
13	FL	8.72
53	TX	6.39
20	IL	4.94
39	NJ	3.95
29	MI	3.21
15	GA	3.09
58	WA	2.92
7	AZ	2.76
43	ОН	2.67
46	PA	2.42
35	NC	2.20
55	VA	2.09

```
In [266]: sns.barplot(jp["JPMorgan Chase & Co."],jp["state"])
```

Out[266]: <matplotlib.axes._subplots.AxesSubplot at 0x1dd1d4a6708>



```
In [267]: top5
```

Out[267]: Bank of America 12480

Wells Fargo & Company 9644
JPMorgan Chase & Co. 7716
Equifax 6647
Citibank 5245

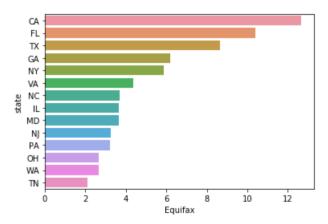
Name: company, dtype: int64

Out[268]:

	state	Equifax
8	CA	12.65
13	FL	10.38
53	TX	8.67
15	GA	6.18
42	NY	5.86
55	VA	4.37
35	NC	3.69
20	IL	3.66
26	MD	3.66
39	NJ	3.27
46	PA	3.21
43	ОН	2.66
58	WA	2.65
52	TN	2.10

```
In [269]: sns.barplot(eq["Equifax"],eq["state"])
```

Out[269]: <matplotlib.axes._subplots.AxesSubplot at 0x1dd1ee5ea08>



```
In [270]: top5
```

Out[270]: Bank of America 12480
Wells Fargo & Company 9644
JPMorgan Chase & Co. 7716
Equifax 6647
Citibank 5245

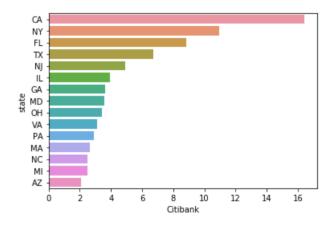
Name: company, dtype: int64

Out[271]:

	state	Citibank
8	CA	16.43
42	NY	10.96
13	FL	8.85
53	TX	6.73
39	NJ	4.92
20	IL	3.94
15	GA	3.64
26	MD	3.60
43	ОН	3.42
55	VA	3.10
46	PA	2.90
25	MA	2.67
35	NC	2.48
29	MI	2.48
7	AZ	2.08

```
In [272]: sns.barplot(ci["Citibank"],ci["state"])
```

Out[272]: <matplotlib.axes._subplots.AxesSubplot at 0x1dd0f729288>

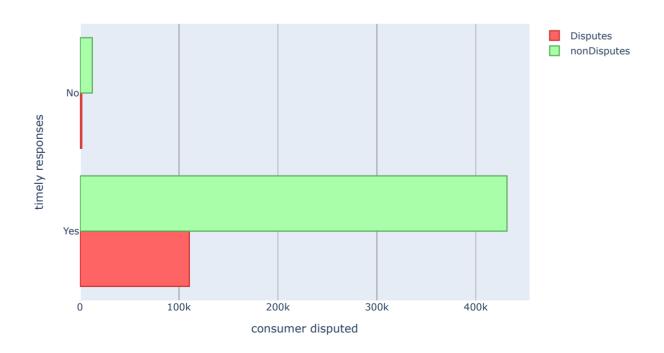


dtype='object')

```
In [289]: time=complaint["timely response"].unique().tolist()
In [279]: def customerservice_timely_res(time_res, dispute):
              result = complaint.loc[(complaint['timely response'] == time res) & (complaint['consumer disputed?']
              return result
In [285]: dis yes=len(customerservice timely res("Yes","Yes"))
          dis_no=len(customerservice_timely_res("No","Yes"))
          ndis yes=len(customerservice timely res("Yes","No"))
          ndis_no=len(customerservice_timely_res("No","No"))
In [286]:
          print("timely responses when disputed {} ".format(dis_yes))
          print("timely no-responses when disputed {} ".format(dis_no))
          print("timely responses when non-disputed {} ".format(ndis_yes))
          print("timely no-responses when non-disputed {} ".format(ndis_no))
          timely responses when disputed 110421
          timely no-responses when disputed 1713
          timely responses when non-disputed 431488
          timely no-responses when non-disputed 12335
In [291]: dispute=[dis yes,dis no]
          non_dispute=[ndis_yes,ndis_no]
```

```
In [293]: disputes chart1 = go.Bar(
               y=time,
               x=dispute,
               orientation='h',
               name='Disputes',
               text='Disputes',
               marker=dict(
                   color='#FF6464',
               line=dict(
                    color='#CD3232',
                    width=1.5
               ))
           ndisputes_chart1 = go.Bar(
               y=time,
               x=non_dispute,
               orientation='h',
               name='nonDisputes',
               text='nonDisputes',
               marker=dict(
                   color='#A9FFA9',
               line=dict(
                   color='#59AF59',
                   width=1.5
               ))
           data=[disputes_chart1,ndisputes_chart1]
           layout = dict(title = 'Number of timely responses',
                          xaxis = dict(title = 'consumer disputed'),
yaxis = dict(title = 'timely responses')
           fig = dict(data=data,layout=layout)
           iplot(fig, filename='basic-area-no-bound')
```

Number of timely responses



conclusion report

1. state wise top companies disposed report we have to sse that during analysis or visualizing the plots most of the companies disputed complaints in CA states that state were registered in all the companies trhe compalints

issue with compalints problems

- 1. bank of america issue lots of complaint relatec to loan, servicing ,mortgage and many problems
- 2. city bank also faces same modification,loan,opening of account,foreclosure of account,fraud and jp also face similar issues
- 3. equi co. faces some issues credit and information regarding issue and wfs are less issue faces

year and month wise face disputes

in year 2012 and 2016 has face more disputes by company but non disputes also in both the year that means data are very populated in both the year and the months wise march month faces the disputes problem

timely responses

when consumer has timely responses more but they can disputes

In []:	
In []:	

In []:	
In []:	
In []:	