

# **Elections Data Analysis**

### **Data Cleaning**

#### 1. Importing Libraries

```
[1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sb
import plotly.express as px
import geopandas as gpd
```

# 2. Reading 2014 data

```
[2]: df_2014 = pd.read_csv('datasets/constituency_wise_results_2014.csv')
df_2014.head(2)
```

```
candidate sex
[2]:
                state
                         pc_name
                                                    age category party \
    O Andhra Pradesh Adilabad
                                  GODAM NAGESH
                                                   49.0
                                                              ST
                                                                   TRS
    1 Andhra Pradesh Adilabad
                                        NARESH
                                                M 37.0
                                                              ST
                                                                   INC
      party_symbol general_votes postal_votes total_votes
                                                             total_electors
```

0 Car 425762 5085 430847 1386282 1 Hand 257994 1563 259557 1386282

#### 3. Reading 2019 data

```
[3]: df_2019 = pd.read_csv('datasets/constituency_wise_results_2019.csv') df_2019.head(2)
```

```
[3]: state pc_name candidate \
O Andhra Pradesh Aruku KISHORE CHANDRA DEO
1 Andhra Pradesh Aruku Dr. KOSURI KASI VISWANADHA VEERA VENKATA SATYA...

sex age category party party_symbol_general_votes postal_votes \
```

 Sex
 age category party party\_symbol general\_votes
 general\_votes
 postal\_votes
 votes

 0
 MALE
 72.0
 ST
 TDP
 Bicycle
 336163
 1938

 1
 MALE
 54.0
 ST
 BJP
 Lotus
 17578
 289

```
[4]: df_sc = pd.read_csv('datasets/dim_states_codes.csv') df_sc.head(2)
```

```
[4]: state_name abbreviation

O Andaman & Nicobar Islands AN

1 Andhra Pradesh AP
```

```
[5]: # renaming state_name to state to match it with other df
df_sc.rename(columns = {'state_name':'state'}, inplace=True)
df_sc.head(2)
```

```
[5]: state abbreviation

0 Andaman & Nicobar Islands AN

1 Andhra Pradesh AP
```

# 5. Looking into DataTypes & Null Values of 2014 & 2019 columns

```
[6]: df_2014.info()
df_2019.info()
#null values in sex & age are for NOTA
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 8355 entries, 0 to 8354
Data columns (total 12 columns):

#	Column	Non-Null Count	Dtype	
0	state	8355 non-null	object	
1	pc_name	8355 non-null	object	
2	candidate	8355 non-null	object	
3	sex	7845 non-null	object	
4	age	7845 non-null	float64	
5	category	7845 non-null	object	
6	party	8355 non-null	object	
7	party_symbol	8355 non-null	object	
8	general_votes	8355 non-null	int64	
9	postal_votes	8355 non-null	int64	
10	total_votes	8355 non-null	int64	
11	total_electors	8355 non-null	int64	
dtypes: float64(1), int64(4), object(7)				
memory usage: 783.4+ KB				
<pre><class 'pandas.core.frame.dataframe'=""></class></pre>				

```
Data columns (total 12 columns):
                         Non-Null Count Dtype
     #
         Column
         ____
     0
         state
                         8597 non-null
                                         object
     1
         pc_name
                         8597 non-null
                                         object
     2
         candidate
                         8597 non-null
                                         object
     3
         sex
                         8054 non-null
                                         object
                         8054 non-null
     4
         age
                                         float64
     5
         category
                         8054 non-null
                                         object
     6
                         8597 non-null
         party
                                         object
     7
         party_symbol
                         8054 non-null
                                         object
         general_votes
                         8597 non-null
                                         int64
         postal_votes
                         8597 non-null
                                         int64
     10 total_votes
                         8597 non-null
                                          int64
     11 total_electors 8597 non-null
                                         int64
    dtypes: float64(1), int64(4), object(7)
    memory usage: 806.1+ KB
    6. Getting Unique Values
[7]: df_2014['state'].nunique()
     df_2014['state'].unique()
[7]: array(['Andhra Pradesh', 'Arunachal Pradesh', 'Assam', 'Bihar', 'Goa',
            'Gujarat', 'Haryana', 'Himachal Pradesh', 'Jammu & Kashmir',
            'Karnataka', 'Kerala', 'Madhya Pradesh', 'Maharashtra', 'Manipur',
            'Meghalaya', 'Mizoram', 'Nagaland', 'Punjab', 'Rajasthan',
            'Sikkim', 'Tamil Nadu', 'Tripura', 'Uttar Pradesh', 'West Bengal',
            'Jharkhand', 'Uttarakhand', 'Andaman & Nicobar Islands',
            'Chandigarh', 'Dadra & Nagar Haveli', 'Daman & Diu',
            'NCT OF Delhi', 'Lakshadweep', 'Puducherry'], dtype=object)
[8]: df_2019['state'].nunique()
     df_2019['state'].unique()
[8]: array(['Andhra Pradesh', 'Arunachal Pradesh', 'Assam', 'Bihar', 'Goa',
            'Gujarat', 'Haryana', 'Himachal Pradesh', 'Jammu & Kashmir',
            'Karnataka', 'Kerala', 'Madhya Pradesh', 'Maharashtra', 'Manipur',
            'Meghalaya', 'Mizoram', 'Nagaland', 'Odisha', 'Punjab',
            'Rajasthan', 'Sikkim', 'Tamil Nadu', 'Tripura', 'Uttar Pradesh',
            'West Bengal', 'Chhattisgarh', 'Jharkhand', 'Uttarakhand',
            'Telangana', 'Andaman & Nicobar Islands', 'Chandigarh',
            'Dadra & Nagar Haveli', 'Daman & Diu', 'NCT OF Delhi',
            'Lakshadweep', 'Puducherry'], dtype=object)
```

State of AP gets bifurcation in 2014 and Telangana is formed.

RangeIndex: 8597 entries, 0 to 8596

7. Replacing state name for Telengana constituencies in df 2014

```
[9]: # getting constituencies that got seperated in 2014 from AP
      df_2019[df_2019['state'] == 'Telangana']['pc_name'].unique()
 [9]: array(['Adilabad ', 'Peddapalle ', 'Karimnagar ', 'Nizamabad',
             'Zahirabad', 'Medak', 'Malkajgiri', 'Secundrabad', 'Hyderabad',
             'CHEVELLA', 'Mahbubnagar', 'Nagarkurnool', 'Nalgonda', 'Bhongir',
             'Warangal', 'Mahabubabad', 'Khammam'], dtype=object)
[10]: telangana_pc_names = ['Adilabad', 'Peddapalle', 'Karimnagar', 'Nizamabad',
             'Zahirabad', 'Medak', 'Malkajgiri', 'Secundrabad', 'Hyderabad',
             'CHEVELLA', 'Mahbubnagar', 'Nagarkurnool', 'Nalgonda', 'Bhongir',
             'Warangal', 'Mahabubabad', 'Khammam']
[11]: df_2014.loc[df_2014['pc_name'].isin(telangana_pc_names), 'state'] = 'Telangana'
      df_2014['state'].unique()
[11]: array(['Telangana', 'Andhra Pradesh', 'Arunachal Pradesh', 'Assam',
             'Bihar', 'Goa', 'Gujarat', 'Haryana', 'Himachal Pradesh',
             'Jammu & Kashmir', 'Karnataka', 'Kerala', 'Madhya Pradesh',
             'Maharashtra', 'Manipur', 'Meghalaya', 'Mizoram', 'Nagaland',
             'Punjab', 'Rajasthan', 'Sikkim', 'Tamil Nadu', 'Tripura',
             'Uttar Pradesh', 'West Bengal', 'Jharkhand', 'Uttarakhand',
             'Andaman & Nicobar Islands', 'Chandigarh', 'Dadra & Nagar Haveli',
             'Daman & Diu', 'NCT OF Delhi', 'Lakshadweep', 'Puducherry'],
            dtype=object)
[12]: df_2014['state'].nunique()
      #telangana has been added
```

[12]: 34

#### 8. Replacing consituencies name

Few states have same constituency names. So replacing constituency name followed by the respective state name to differentiate

```
[13]: counts = df_2014.groupby('pc_name').size()

[14]: for index, row in df_2014.iterrows():
        if counts[row['pc_name']] > 1:
            df_2014.at[index, 'pc_name'] = f"{row['pc_name']}_{row['state']}"

[15]: countb = df_2019.groupby('pc_name').size()

[16]: for index, row in df_2019.iterrows():
        if countb[row['pc_name']] > 1:
            df_2019.at[index, 'pc_name'] = f"{row['pc_name']}_{row['state']}"
```

```
[17]: df_2019.head(3)
[17]:
                  state
                                        pc name \
                        Aruku _Andhra Pradesh
       Andhra Pradesh
      1 Andhra Pradesh
                        Aruku Andhra Pradesh
        Andhra Pradesh
                         Aruku _Andhra Pradesh
                                                  candidate
                                                                       age category \
                                                                 sex
      0
                                        KISHORE CHANDRA DEO
                                                               MALE
                                                                    72.0
                                                                                 ST
      1
        Dr. KOSURI KASI VISWANADHA VEERA VENKATA SATYA...
                                                             MALE 54.0
                                                                               ST
      2
                                           GODDETI. MADHAVI FEMALE 26.0
                                                                                 ST
         party party_symbol general_votes postal_votes total_votes
      0
           TDP
                    Bicycle
                                     336163
                                                     1938
                                                                 338101
      1
           BJP
                      Lotus
                                      17578
                                                      289
                                                                  17867
                                                     4629
        YSRCP
                Ceiling Fan
                                     557561
                                                                562190
         total_electors
      0
                1451418
      1
                1451418
      2
                1451418
     10. Obtaining the descriptive statistics for the dataframe
```

```
[18]: df_2014.describe() df_2019.describe()
```

```
[18]:
                          general votes
                                         postal_votes
                                                         total votes
                                                                      total_electors
                     age
             8054.000000
                           8.597000e+03
                                           8597.000000
                                                        8.597000e+03
                                                                        8.597000e+03
      count
                                            267.469699 7.144037e+04
     mean
               47.065185
                           7.117290e+04
                                                                        1.705181e+06
               12.140434
                           1.735669e+05
                                            929.319680
                                                        1.742342e+05
                                                                        2.969405e+05
      std
               24.000000
                           8.400000e+01
                                              0.000000 8.400000e+01
                                                                        5.518900e+04
     min
      25%
               38.000000
                           1.315000e+03
                                              1.000000 1.317000e+03
                                                                        1.553385e+06
      50%
               46.000000
                           3.341000e+03
                                              4.000000 3.350000e+03
                                                                        1.703279e+06
      75%
               56.000000
                           1.239100e+04
                                             36.000000 1.242100e+04
                                                                        1.856791e+06
      max
               90.000000
                           1.066824e+06
                                         19367.000000 1.068569e+06
                                                                        3.150313e+06
```

#### **Data Analysis & Visualisation**

1. List top 5/bottom 5 constituencies of 2014 and 2019 in terms of voter turnout ratio

#### 2014

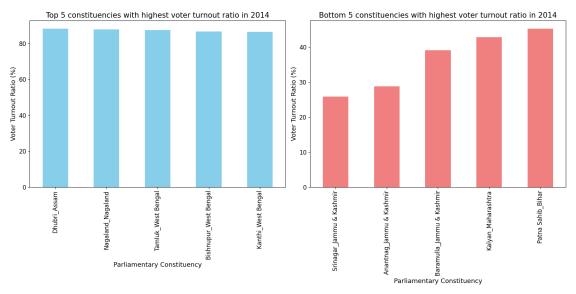
[19]: #Voter Turnout Ratio = (Total Votes Cast / Total Electors) × 100%

#The percentage of registered voters who actually cast their votes in anuselection.

```
voter_turnout_ratio_2014 = round((df_2014.groupby('pc_name')['total_votes'].
       ⇒sum()
                                         /df_2014.groupby('pc_name')['total_electors']
                                         .max())*100,2)
[20]: #top 5
      voter_turnout_ratio_2014_desc = voter_turnout_ratio_2014.
       ⇔sort_values(ascending=False)
      top5_constituencies14 = voter_turnout_ratio_2014_desc.head(5)
      top5 constituencies14
[20]: pc name
     Dhubri Assam
                                88.35
     Nagaland_Nagaland
                                87.82
      Tamluk_West Bengal
                               87.59
      Bishnupur_West Bengal
                               86.72
      Kanthi_West Bengal
                               86.61
      dtype: float64
[21]: #bottom 5
      voter_turnout_ratio_2014_asc = voter_turnout_ratio_2014.sort_values()
      bottom5_constituencies14 = voter_turnout_ratio_2014_asc.head(5)
      bottom5_constituencies14
[21]: pc name
      Srinagar_Jammu & Kashmir
                                    25.86
      Anantnag_Jammu & Kashmir
                                    28.84
      Baramulla_Jammu & Kashmir
                                    39.13
      Kalyan_Maharashtra
                                   42.88
      Patna Sahib_Bihar
                                    45.33
      dtype: float64
[22]: fig, axes = plt.subplots(nrows=1, ncols=2, figsize=(16,8))
      top5_constituencies14.plot(kind='bar',ax=axes[0], color='skyblue')
      axes[0].set_title('Top 5 constituencies with highest voter turnout ratio in_
       \hookrightarrow2014', size=15)
      axes[0].set_xlabel('Parliamentary Constituency', size=13)
      axes[0].set_ylabel('Voter Turnout Ratio (%)', size=13)
      axes[0].tick params(axis='x', labelsize=12)
      axes[0].tick_params(axis='y', labelsize=12)
      bottom5_constituencies14.plot(kind='bar',ax=axes[1], color='lightcoral')
      axes[1].set_title('Bottom 5 constituencies with highest voter turnout ratio in_
       \hookrightarrow2014', size=15)
      axes[1].set xlabel('Parliamentary Constituency', size=13)
      axes[1].set_ylabel('Voter Turnout Ratio (%)', size=13)
```

```
axes[1].tick_params(axis='x', labelsize=12)
axes[1].tick_params(axis='y', labelsize=12)

plt.tight_layout()
plt.show()
```



#### 2019

```
[23]: #Voter Turnout Ratio = (Total Votes Cast / Total Electors) × 100%

#The percentage of registered voters who actually cast their votes in anuselection.

voter_turnout_ratio_2019 = round((df_2019.groupby('pc_name')['total_votes'].

sum()

/df_2019.groupby('pc_name')['total_electors']

.max())*100,2)

voter_turnout_ratio_2019
```

# [23]: pc\_name

ARUNACHAL EAST_Arunachal Pradesh	86.46
ARUNACHAL WEST_Arunachal Pradesh	77.26
Adilabad _Telangana	71.40
Agra_Uttar Pradesh	59.11
Ahmadnagar _Maharashtra	64.67
	•••
Warangal_Telangana	 63.69
Warangal_Telangana Wardha_Maharashtra	
8 = 8	63.69
Wardha_Maharashtra	63.69 61.53

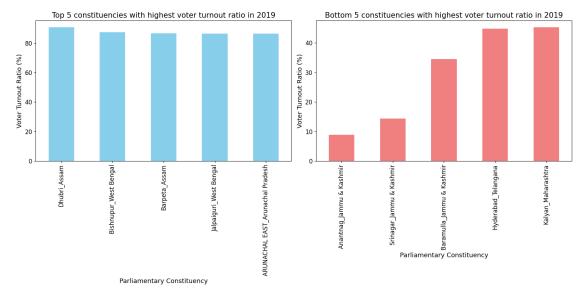
```
Length: 543, dtype: float64
[24]: #top 5
      voter_turnout_ratio_2019_desc = voter_turnout_ratio_2019.

sort_values(ascending=False)
      top5_constituencies19 = voter_turnout_ratio_2019_desc.head(5)
      top5_constituencies19
[24]: pc_name
     Dhubri Assam
                                          90.66
      Bishnupur_West Bengal
                                          87.31
      Barpeta Assam
                                           86.55
      Jalpaiguri_West Bengal
                                           86.49
      ARUNACHAL EAST Arunachal Pradesh
                                          86.46
      dtype: float64
[25]: #bottom 5
      voter_turnout_ratio_2019_asc = voter_turnout_ratio_2019.sort_values()
      bottom5_constituencies19 = voter_turnout_ratio_2019_asc.head(5)
      bottom5_constituencies19
[25]: pc_name
      Anantnag Jammu & Kashmir
                                    8.94
      Srinagar Jammu & Kashmir
                                   14.43
      Baramulla Jammu & Kashmir
                                   34.57
      Hyderabad_Telangana
                                   44.84
                                   45.29
      Kalyan_Maharashtra
      dtype: float64
[26]: | fig, axes = plt.subplots(nrows=1, ncols=2, figsize=(16,8))
      top5_constituencies19.plot(kind='bar',ax=axes[0], color='skyblue')
      axes[0].set_title('Top 5 constituencies with highest voter turnout ratio in⊔
       \hookrightarrow2019', size=15)
      axes[0].set_xlabel('Parliamentary Constituency', size=13)
      axes[0].set ylabel('Voter Turnout Ratio (%)', size=13)
      axes[0].tick_params(axis='x', labelsize=12)
      axes[0].tick_params(axis='y', labelsize=12)
      bottom5_constituencies19.plot(kind='bar',ax=axes[1], color='lightcoral')
      axes[1].set_title('Bottom 5 constituencies with highest voter turnout ratio in_
      ⇔2019', size=15)
      axes[1].set_xlabel('Parliamentary Constituency', size=13)
      axes[1].set_ylabel('Voter Turnout Ratio (%)', size=13)
      axes[1].tick_params(axis='x', labelsize=12)
      axes[1].tick_params(axis='y', labelsize=12)
```

69.69

Zahirabad\_Telangana

```
plt.tight_layout()
plt.show()
```



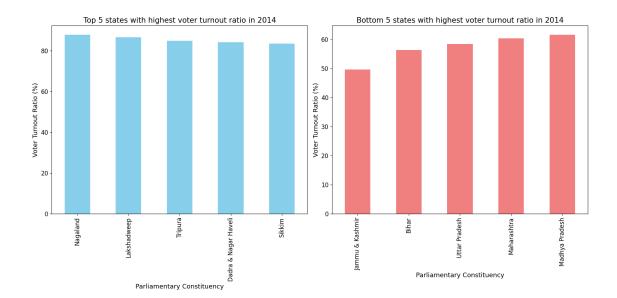
#### 2. List top 5/bottom 5 states of 2014 and 2019 in terms of voter turnout ratio

#### 2014

```
[28]: #top5
top5_state14 = voter_turnout_ratio_state14.sort_values(ascending=False).head(5)
top5_state14
```

```
Dadra & Nagar Haveli
                              83.33
      Sikkim
      dtype: float64
[29]: #bottom5
      bottom5_state14 = voter_turnout_ratio_state14.sort_values().head(5)
      bottom5_state14
[29]: state
      Jammu & Kashmir
                         49.66
                         56.25
      Bihar
     Uttar Pradesh
                         58.42
                         60.29
      Maharashtra
     Madhya Pradesh
                         61.59
      dtype: float64
[30]: fig, axes = plt.subplots(nrows=1, ncols=2, figsize=(16,8))
      top5_state14.plot(kind='bar',ax=axes[0], color='skyblue')
      axes[0].set_title('Top 5 states with highest voter turnout ratio in 2014', __
       ⇔size=15)
      axes[0].set_xlabel('Parliamentary Constituency', size=13)
      axes[0].set_ylabel('Voter Turnout Ratio (%)', size=13)
      axes[0].tick_params(axis='x', labelsize=12)
      axes[0].tick_params(axis='y', labelsize=12)
      bottom5_state14.plot(kind='bar',ax=axes[1], color='lightcoral')
      axes[1].set_title('Bottom 5 states with highest voter turnout ratio in 2014', __
       ⇒size=15)
      axes[1].set_xlabel('Parliamentary Constituency', size=13)
      axes[1].set_ylabel('Voter Turnout Ratio (%)', size=13)
      axes[1].tick_params(axis='x', labelsize=12)
      axes[1].tick_params(axis='y', labelsize=12)
      plt.tight_layout()
      plt.show()
```

84.07



```
2019
[31]: #getting unique totalelectors per pc_name
unique_df_2019 = df_2019.drop_duplicates(subset=['pc_name'])

#getting totalelectors per state
total_electors_state19 = unique_df_2019.groupby('state')['total_electors'].sum()

#getting totalvotes per state
total_voters_state19 = df_2019.groupby('state')['total_votes'].sum()

#getting voter_turnout_ratio_2014 by state
voter_turnout_ratio_state19 = round((total_voters_state19/
ototal_electors_state19)*100,2)
```

```
[32]: #top5
top5_state19 = voter_turnout_ratio_state19.sort_values(ascending=False).head(5)
top5_state19
```

[33]: #bottom5
bottom5\_state19 = voter\_turnout\_ratio\_state19.sort\_values().head(5)

#### $bottom5\_state19$

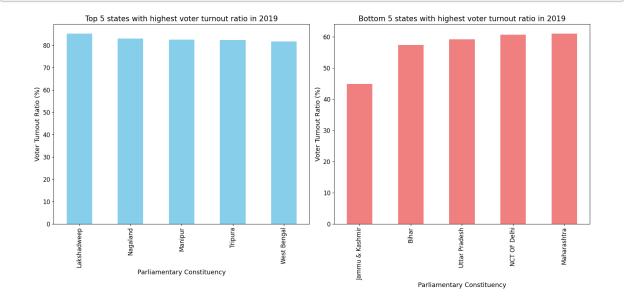
Jammu & Kashmir

plt.show()

44.84

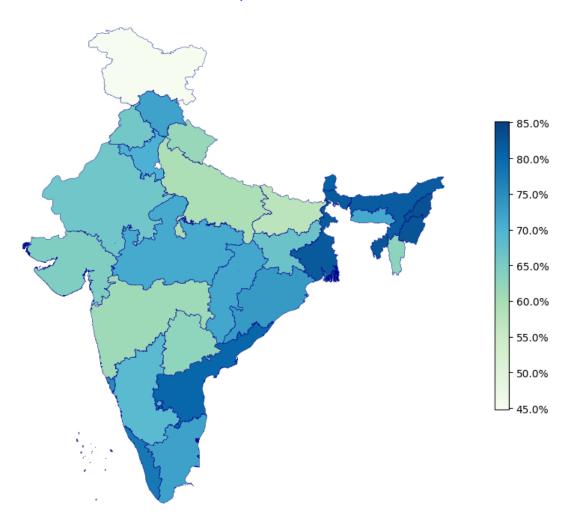
[33]: state

```
Bihar
                         57.30
      Uttar Pradesh
                         59.18
      NCT OF Delhi
                         60.58
      Maharashtra
                         60.96
      dtype: float64
[34]: fig, axes = plt.subplots(nrows=1, ncols=2, figsize=(16,8))
      top5_state19.plot(kind='bar',ax=axes[0], color='skyblue')
      axes[0].set_title('Top 5 states with highest voter turnout ratio in 2019', u
       ⇔size=15)
      axes[0].set_xlabel('Parliamentary Constituency', size=13)
      axes[0].set_ylabel('Voter Turnout Ratio (%)', size=13)
      axes[0].tick_params(axis='x', labelsize=12)
      axes[0].tick_params(axis='y', labelsize=12)
      bottom5_state19.plot(kind='bar',ax=axes[1], color='lightcoral')
      axes[1].set_title('Bottom 5 states with highest voter turnout ratio in 2019', __
       ⇔size=15)
      axes[1].set_xlabel('Parliamentary Constituency', size=13)
      axes[1].set_ylabel('Voter Turnout Ratio (%)', size=13)
      axes[1].tick_params(axis='x', labelsize=12)
      axes[1].tick_params(axis='y', labelsize=12)
      plt.tight_layout()
```



#### Creating a choropleth map to show voter turnout ration per states in 2019

# Voter turnout ratio per state in 2019



3. Which constituencies have elected the same party for two consecutive elections, rank them by % of votes to that winning party in 2019

```
[38]: #merge two df for comparison
      df_merged_ep = pd.merge(df_elected_party14, df_elected_party19, on='pc_name',
                               suffixes=('_14','_19'))
      #filtering parties winning consecutively
      df_{matching_parties} = 

¬df_merged_ep[df_merged_ep['party_14'] == df_merged_ep['party_19']]

      #finding percentage change
      df_matching_parties['percentage_change'] =__
       →round(((df_matching_parties['total_votes_19']
                                                         Ш
       →-df matching parties['total votes 14'])

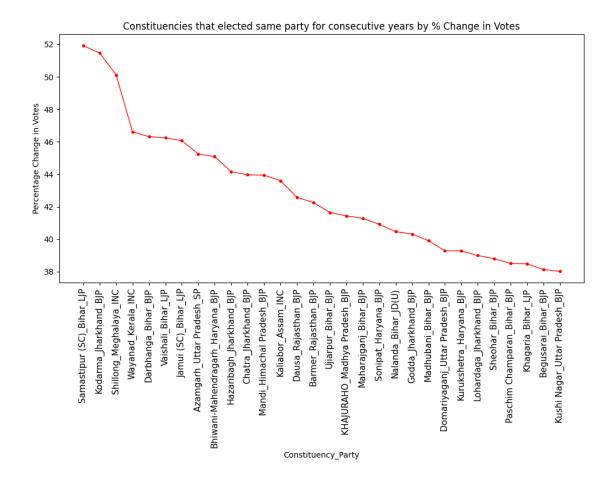
→df_matching_parties['total_votes_19']
                                                          *100),2)
      #sorting by percentage
      df_wp_ranked = df_matching_parties.sort_values(by = 'percentage_change',
                                                       ascending=False)
      print(df_wp_ranked[['pc_name','party_14','total_votes_14','party_19','total_votes_19',_
       ⇔'percentage change']])
                           pc_name party_14 total_votes_14 party_19 \
     420
            Samastipur (SC) Bihar
                                        LJP
                                                      270401
                                                                  LJP
     266
                Kodarma Jharkhand
                                                      365410
                                                                  BJP
                                        BJP
     431
               Shillong_Meghalaya
                                        INC
                                                      209340
                                                                  INC
     503
                    Wayanad_Kerala
                                        INC
                                                      377035
                                                                  INC
     131
                   Darbhanga_Bihar
                                        BJP
                                                      314949
                                                                  BJP
     . .
     130
          Daman & diu_Daman & Diu
                                        BJP
                                                       46960
                                                                  BJP
     377
            Peddapalle _Telangana
                                                      565496
                                                                  TRS
                                        TRS
     423
                    Sangrur_Punjab
                                       AAAP
                                                      533237
                                                                 AAAP
     267
                   Kokrajhar_Assam
                                        IND
                                                      634428
                                                                  IND
     265
                 Kishanganj_Bihar
                                        INC
                                                      493461
                                                                  INC
          total_votes_19 percentage_change
     420
                   562443
                                       51.92
     266
                   753016
                                       51.47
                                       50.12
     431
                   419689
     503
                   706367
                                       46.62
     131
                   586668
                                       46.32
     . .
                                      -24.90
     130
                    37597
     377
                   441321
                                      -28.14
     423
                   413561
                                      -28.94
```

```
267 484560 -30.93
265 367017 -34.45
[333 rows x 6 columns]
```

Plotting constituencies that elected same party for consecutive years by % Change in Votes

```
[39]: #plotting top 30 constituencies
      df_wp = df_wp_ranked.head(30)
      #concatinating constituency and party name
      labels = [f'{cons}_{party}' for cons, party in zip(df_wp['pc_name'],__

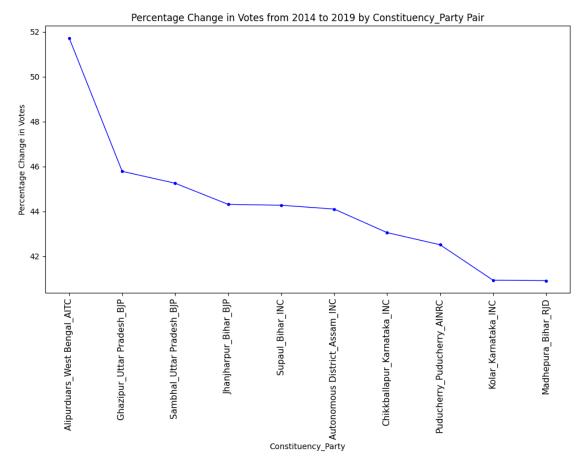
df_wp['party_14'])]
      #plot
      plt.figure(figsize=(10,8))
      plt.plot(labels,df_wp['percentage_change'], 'r.-', linewidth=1)
      plt.xlabel('Constituency_Party')
      plt.ylabel('Percentage Change in Votes')
      plt.title('Constituencies that elected same party for consecutive years by %__
      ⇔Change in Votes')
      plt.tick_params(axis='x', labelrotation=90, labelsize=11)
      plt.tick_params(axis='y', labelsize=10)
      plt.grid=True
      plt.tight_layout()
      plt.show()
```



4. Which constituencies have voted for different parties in two elections (list top 10 based on the difference (2019-2014) in voter percentage in two elections)

```
#finding percentage change
      df_changed_parties['percentage_change'] =__
       →round(((df_changed_parties['total_votes_19']
                                                        Ш
       →-df changed parties['total votes 14'])
       ⇔df_changed_parties['max_total_votes']*100),2)
      #sorting by percentage
      df_cp_ranked = df_changed_parties.sort_values(by = 'percentage_change',_
       ⇒ascending=False).head(10)
     print(df_cp_ranked[['pc_name','party_14','total_votes_14','party_19','total_votes_19',_
       ⇔'percentage_change']])
                             pc_name party_14 total_votes_14 party_19
     13
            Alipurduars_West Bengal
                                         AITC
                                                        362453
                                                                    BJP
                                                                    BSP
     175
             Ghazipur_Uttar Pradesh
                                          BJP
                                                        306929
              Sambhal_Uttar Pradesh
     421
                                          BJP
                                                        360242
                                                                     SP
     225
                   Jhanjharpur_Bihar
                                                        335481
                                                                  JD(U)
                                          BJP
     454
                        Supaul Bihar
                                          INC
                                                        332927
                                                                  JD(U)
     42
          Autonomous District Assam
                                          INC
                                                        213152
                                                                    BJP
            Chikkballapur Karnataka
                                          INC
                                                        424800
                                                                    BJP
     116
     385
              Puducherry Puducherry
                                        AINRC
                                                        255826
                                                                    INC
     268
                     Kolar Karnataka
                                          INC
                                                                    BJP
                                                        418926
     297
                     Madhepura_Bihar
                                          RJD
                                                        368937
                                                                  JD(U)
          total_votes_19 percentage_change
     13
                   750804
                                       51.72
                   566082
                                       45.78
     175
                                       45.25
     421
                   658006
     225
                   602391
                                       44.31
     454
                                       44.27
                   597377
     42
                   381316
                                       44.10
     116
                   745912
                                       43.05
     385
                   444981
                                       42.51
     268
                   709165
                                       40.93
     297
                   624334
                                       40.91
     Plotting percentage Change in Votes from 2014 to 2019 by Constituency-Party Pair
[41]: #concatinating constituency and party name
      labels = [f'{cons}_{party}' for cons, party in zip(df_cp_ranked['pc_name'],_

df_cp_ranked['party_14'])]
```



#### 5. Top 5 candidates based on margin difference with runners in 2014 and 2019

```
#calculating difference between each
      top2_parties14['margin_difference'] = top2_parties14.

¬groupby('pc_name')['total_votes'].diff().abs()

      #filtering top 5 runners based on largest margin
      top5_runners_margin = top2_parties14.nlargest(5, 'margin_difference')
      #filling NaN values
      df_winners_runners = top2_parties14.fillna(method='bfill')
      #qetting winners
      top_winners = df_winners_runners.groupby('pc_name').apply(lambda x: x.
       →nlargest(1, 'margin_difference')).reset_index(drop=True)
      #filtering top 5 winners based on largest margin
      top5_winners_margin = top_winners.nlargest(5, 'margin_difference')
[43]: #merging both winners and runners
      top_margin = pd.merge(top5_winners_margin,top5_runners_margin, on='pc_name')
      #renaming columns
      top_margin.rename(columns = {'candidate_x':'winning_candidate',
                                    'candidate_y': 'runner_candidate',
                                    'party x':'winning party',
                                    'party_y': 'runner_party',
                                    'margin difference y': 'margin difference'},,,
       →inplace=True)
      #printing both winners and runners by largest margin
      print(top margin[['pc name', 'winning candidate', 'winning party', 'runner candidate', 'runner par
                                        winning_candidate winning_party \
                        pc_name
     0
               Vadodara_Gujarat
                                            NARENDRA MODI
                                                                    BJP
        Ghaziabad Uttar Pradesh
                                        VIJAY KUMAR SINGH
                                                                    BJP
     2
                Navsari_Gujarat
                                              C. R. PATIL
                                                                    BJP
     3
               Jaipur_Rajasthan
                                         RAMCHARAN BOHARA
                                                                    BJP
                  Surat_Gujarat DARSHANA VIKRAM JARDOSH
     4
                                                                    B.JP
                     runner_candidate runner_party margin_difference
             MISTRI MADHUSUDAN DEVRAM
     0
                                                INC
                                                              570128.0
     1
                           RAJ BABBAR
                                                INC
                                                              567260.0
     2
                                                INC
                         MAKSUD MIRZA
                                                              558116.0
     3
                     DR. MAHESH JOSHI
                                                INC
                                                              539345.0
        DESAI NAISHADHBHAI BHUPATBHAI
                                                INC
                                                              533190.0
```

```
[44]: #qetting top 2 parties of each constituency
      top2_parties19 = df_2019.groupby('pc_name').apply(lambda x: x.nlargest(2,__
       d'total_votes', 'all')).reset_index(drop=True)
      #calculating difference between each
      top2_parties19['margin_difference'] = top2_parties19.
       ⇒groupby('pc_name')['total_votes'].diff().abs()
      #filtering top 5 runners based on largest margin
      top5_runners_margin = top2_parties19.nlargest(5, 'margin_difference')
      #filling NaN values
      df_winners_runners = top2_parties19.fillna(method='bfill')
      #qetting winners
      top_winners = df_winners_runners.groupby('pc_name').apply(lambda x: x.
       →nlargest(1, 'margin_difference')).reset_index(drop=True)
      #filtering top 5 winners based on largest margin
      top5_winners_margin = top_winners.nlargest(5, 'margin_difference')
[45]: #merging both winners and runners
      top_margin = pd.merge(top5_winners_margin,top5_runners_margin, on='pc_name')
      #renaming columns
      top_margin.rename(columns = {'candidate_x':'winning_candidate',
                                   'candidate_y': 'runner_candidate',
                                   'party_x':'winning_party',
                                   'party_y': 'runner_party',
                                   'margin_difference_y':'margin_difference'},
       →inplace=True)
      #printing both winners and runners by largest margin
      print(top_margin[['pc_name', 'winning_candidate', 'winning_party', 'runner_candidate', 'runner_par
                   pc_name
                                  winning_candidate winning_party \
     0
           Navsari_Gujarat
                                        C. R. Patil
                                                               BJP
            Karnal_Haryana
                                      Sanjay Bhatia
     1
                                                               BJP
        Faridabad_Haryana
                                        KRISHAN PAL
     2
                                                               BJP
     3 Bhilwara_Rajasthan SUBHASH CHANDRA BAHERIA
                                                               BJP
          Vadodara_Gujarat
                                    RANJANBEN BHATT
                                                               BJP
                   runner_candidate runner_party margin_difference
     O PATEL DHARMESHBHAI BHIMBHAI
                                             INC
                                                            689668.0
                      Kuldip Sharma
                                             INC
                                                            656142.0
     1
                AVTAR SINGH BHADANA
     2
                                             INC
                                                            638239.0
     3
                     RAM PAI. SHARMA
                                             INC
                                                            612000.0
```

#### 6. % Split of votes of parties between 2014 vs 2019 at national level

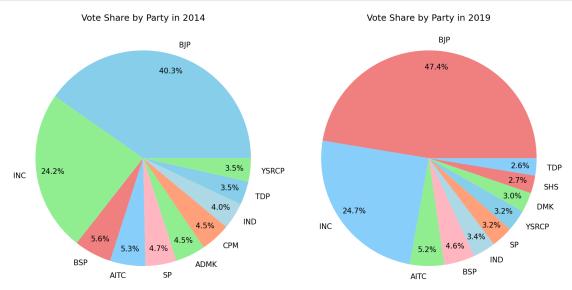
```
[46]: #votes for each party in 2014
      party_votes14 = df_2014.groupby('party')['total_votes'].sum().reset_index()
      #total votes in 2014 elections
      total_votes14 = df_2014['total_votes'].sum()
      #calculating percentage per party
      party_votes14['percentage'] = (party_votes14['total_votes']/total_votes14)*100
      #top 10 parties by percentage
      top10_parties14 = party_votes14.sort_values(by='percentage', ascending=False).
       \rightarrowhead(10)
      #votes for each party in 2019
      party_votes19 = df_2019.groupby('party')['total_votes'].sum().reset_index()
      #total votes in 2019 elections
      total_votes19 = df_2019['total_votes'].sum()
      #calculating percentage per party
      party_votes19['percentage'] = (party_votes19['total_votes']/total_votes19)*100
      #top 10 parties by percentage
      top10_parties19 = party_votes19.sort_values(by='percentage', ascending=False).
       \rightarrowhead(10)
```

```
[47]: #setting variable for plotting
      labels14 = top10_parties14['party']
      share14 = top10_parties14['percentage']
      labels19 = top10_parties19['party']
      share19 = top10_parties19['percentage']
      colors14 =
       →['skyblue','lightgreen','lightcoral','lightskyblue','lightpink','lightgreen','lightsalmon',
      colors19 =
       →['lightcoral','lightskyblue','lightgreen','lightpink','lightblue','lightsalmon|,'skyblue','
      #plotting pie chart showing % split of votes of parties between 2014 vs 2019 at \Box
       ⇔national level
      fig, axes = plt.subplots(nrows=1, ncols=2, figsize=(16,8))
      share14.plot(kind='pie', ax=axes[0], colors=colors14, labels=labels14,__

→autopct='%1.1f%%', pctdistance=0.85, textprops = {'fontsize': 15})
      axes[0].set_title('Vote Share by Party in 2014', size=18)
      axes[0].set_ylabel('')
      share19.plot(kind='pie', ax=axes[1], colors=colors19, labels=labels19, __
       autopct='%1.1f%%', pctdistance=0.85, textprops = {'fontsize': 15})
```

```
axes[1].set_title('Vote Share by Party in 2019', size=18)
axes[1].set_ylabel('')

plt.tight_layout()
plt.show()
```



# 7. % Split of votes of parties between 2014 vs 2019 at state level

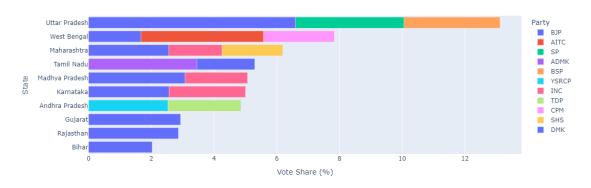
```
[48]: #grouping votes by states
     state_votes14 = df_2014.groupby(['state','party'])['total_votes'].sum().
       →reset index()
     #total votes
     total_state_votes14 = state_votes14['total_votes'].sum()
     #calculating votes percentage
     state_votes14['vote_share']=(state_votes14['total_votes']/

state_votes14)*100

     #sorting top20 states for plotting
     sorted_state_votes14 = state_votes14.sort_values(by='vote_share',__
       ⇒ascending=False).head(20)
      #plotting graph
     fig = px.bar(sorted_state_votes14, x='vote_share', y='state',

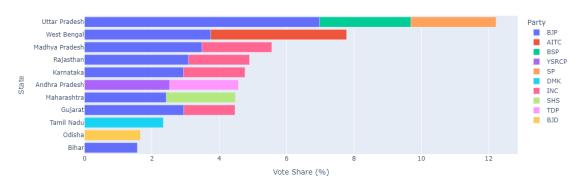
color='party', orientation='h',
                  labels={'state':'State', 'vote_share':'Vote Share%', 'party':
       title='Vote Share of Parties in Top States in 2014',
                  hover_data={'vote_share': ':.2f'})
```

Vote Share of Parties in Top States in 2014



```
[49]: #grouping votes by states
      state_votes19 = df_2019.groupby(['state','party'])['total_votes'].sum().
       →reset_index()
      #total votes
      total_state_votes19 = state_votes19['total_votes'].sum()
      #calculating votes percentage
      state_votes19['vote_share']=(state_votes19['total_votes']/
       →total_state_votes19)*100
      #sorting top20 states for plotting
      sorted_state_votes19 = state_votes19.sort_values(by='vote_share',_
       ⇒ascending=False).head(20)
      #plotting graph
      fig = px.bar(sorted_state_votes19, x='vote_share', y='state',
       ⇔color='party', orientation='h',
                   labels={'state':'State', 'vote_share':'Vote Share%', 'party':
       title='Vote Share of Parties in Top States in 2019',
                  hover_data={'vote_share': ':.2f'})
      fig.update_layout(yaxis={'categoryorder':'total ascending'},
```

Vote Share of Parties in Top States in 2019



# 8. List top 5 constituencies for two major national parties where they have gained vote share in 2019 as compared to 2014

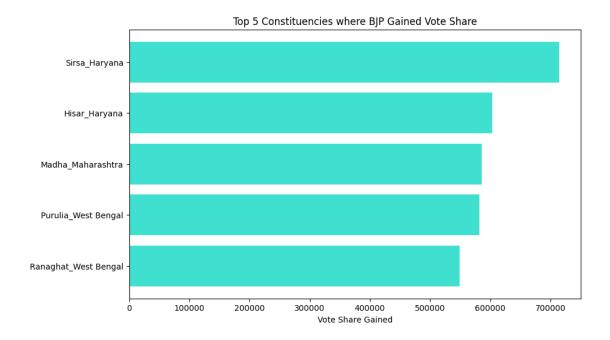
```
[50]: #2 major national parties
      national_parties = ['BJP','INC']
      #pivoting df
      party_votes14 = df_2014.groupby(['pc_name', 'party'])['total_votes'].sum().
       →unstack(fill_value=0)
      party_votes19 = df_2019.groupby(['pc_name', 'party'])['total_votes'].sum().

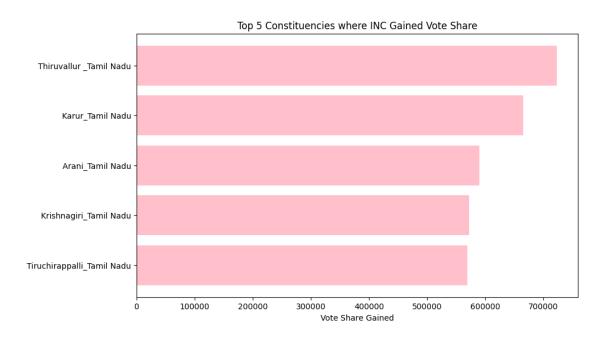
unstack(fill_value=0)

      #substracting pivotted of to get difference in votes
      vote_share_gained = party_votes19 - party_votes14
      #filtering difference for only major parties
      national_parties_votes = vote_share_gained[national_parties]
      #sorting by top5
      top5_constituencies_BJP = national_parties_votes['BJP'].
       ⇒sort_values(ascending=False).head(5)
      top5_constituencies_INC = national_parties_votes['INC'].
       ⇒sort values(ascending=False).head(5)
      #printing result
```

```
print("Top 5 constituencies where BJP gained vote share:")
      print(top5_constituencies_BJP)
      print("\nTop 5 constituencies where INC gained vote share:")
      print(top5_constituencies_INC)
     Top 5 constituencies where BJP gained vote share:
     pc_name
     Sirsa_Haryana
                             714351.0
     Hisar_Haryana
                             603289.0
     Madha_Maharashtra
                             586314.0
     Purulia_West Bengal
                             581871.0
     Ranaghat_West Bengal
                             549583.0
     Name: BJP, dtype: float64
     Top 5 constituencies where INC gained vote share:
     pc_name
     Thiruvallur _Tamil Nadu
                                   723332.0
     Karur_Tamil Nadu
                                   665238.0
     Arani_Tamil Nadu
                                   590043.0
     Krishnagiri_Tamil Nadu
                                   572413.0
     Tiruchirappalli_Tamil Nadu
                                   569748.0
     Name: INC, dtype: float64
[51]: #plotting for BJP
      plt.figure(figsize=(10,6))
      plt.barh(top5_constituencies_BJP.index, top5_constituencies_BJP,_

color='turquoise')
      plt.xlabel('Vote Share Gained')
      plt.title('Top 5 Constituencies where BJP Gained Vote Share')
      plt.gca().invert_yaxis()
      plt.show()
      #plotting for INC
      plt.figure(figsize=(10,6))
      plt.barh(top5_constituencies_INC.index, top5_constituencies_INC, color='pink')
      plt.xlabel('Vote Share Gained')
      plt.title('Top 5 Constituencies where INC Gained Vote Share')
      plt.gca().invert_yaxis()
      plt.show()
```





# 9. List top 5 constituencies for two major national parties where they have lost vote share in 2019 as compared to 2014

```
[52]: #2 major national parties
national_parties = ['BJP','INC']
```

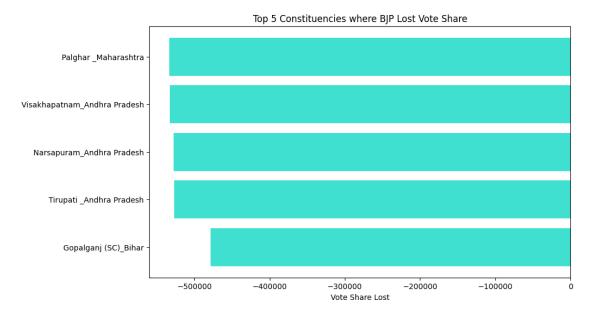
```
#pivoting df
      party_votes14 = df_2014.groupby(['pc_name', 'party'])['total_votes'].sum().

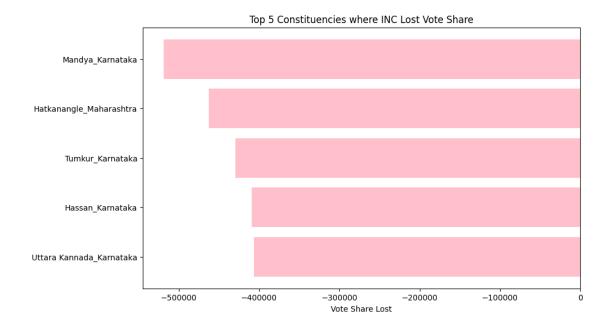
unstack(fill_value=0)

      party_votes19 = df_2019.groupby(['pc_name', 'party'])['total_votes'].sum().

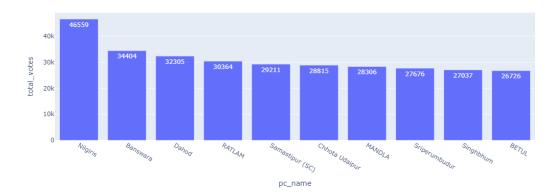
unstack(fill_value=0)

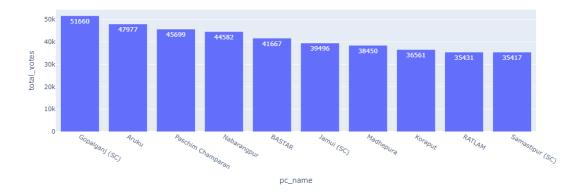
      #substracting pivotted of to get difference in votes
      vote_share_gained = party_votes19 - party_votes14
      #replacing votes to NaN where it is 0 or more
      vote_share_gained[vote_share_gained>=0] = np.nan
      #filtering difference for only major parties
      national_parties_votes = vote_share_gained[national_parties]
      #sorting by top5
      top5_constituencies_lost_BJP = national_parties_votes['BJP'].
       ⇔sort_values(ascending=True).head(5)
      top5_constituencies_lost_INC = national_parties_votes['INC'].
       ⇔sort_values(ascending=True).head(5)
      #printing result
      print("Top 5 constituencies where BJP lost vote share:")
      print(top5_constituencies_lost_BJP)
      print("\nTop 5 constituencies where INC lost vote share:")
      print(top5_constituencies_lost_INC)
     Top 5 constituencies where BJP lost vote share:
     pc_name
     Palghar _Maharashtra
                                    -533201.0
     Visakhapatnam_Andhra Pradesh
                                   -532940.0
     Narsapuram_Andhra Pradesh
                                    -527892.0
     Tirupati _Andhra Pradesh
                                    -526826.0
     Gopalganj (SC)_Bihar
                                    -478773.0
     Name: BJP, dtype: float64
     Top 5 constituencies where INC lost vote share:
     pc_name
     Mandya Karnataka
                                -518852.0
     Hatkanangle Maharashtra
                                -462618.0
     Tumkur Karnataka
                                -429868.0
     Hassan Karnataka
                                -409379.0
                                -406239.0
     Uttara Kannada_Karnataka
     Name: INC, dtype: float64
[53]: #plotting for BJP
      plt.figure(figsize=(10,6))
```





#### 10. Which constituency has voted the most for NOTA?





# 11. Which constituencies have elected candidates whose party has less than 10% vote share at state level in 2019

```
[56]: # Calculating total votes cast for each party in each constituency
      party_votes = df_2019.
       Groupby(['state','pc_name','candidate','party'])['total_votes'].sum().
       →reset_index()
      # Determining the winning party for each constituency
      winning_party_indices = party_votes.groupby('pc_name')['total_votes'].idxmax()
      winning_party = party_votes.loc[winning_party_indices]
      # Calculating total votes cast in each state
      total_votes_state = df_2019.groupby('state')['total_votes'].sum().reset_index()
      #merging the two df
      winning_parties = pd.merge(winning_party, total_votes_state, on='state',_
       ⇔suffixes=['_party','_total'])
      # Calculating percentage vote share for the winning party in each constituency ____
       ⇔by state
      winning_parties['vote_share_percentage'] = __
       ⇔(winning_parties['total_votes_party']/
       ⇔winning_parties['total_votes_total'])*100
      #Identifying constituencies with less than 10% vote share
      constituencies_less_than_10_percent =
       ⇔winning_parties[winning_parties['vote_share_percentage']<10]</pre>
      [['pc_name','candidate','party','vote_share_percentage']]
      #printing constituencies name
```

Constituencies where the winning party's vote share is less than 10% at the state level in 2019:

```
state
                                           pc_name
                                                               candidate party
67 Uttar Pradesh
                          Kaushambi_Uttar Pradesh
                                                      VINOD KUMAR SONKAR
                                                                           BJP
85 Uttar Pradesh
                         Pratapgarh Uttar Pradesh
                                                        SANGAM LAL GUPTA
                                                                           BJP
94 Uttar Pradesh
                          Shrawasti Uttar Pradesh
                                                           RAM SHIROMANI
                                                                           BSP
88 Uttar Pradesh
                        Robertsganj Uttar Pradesh
                                                         PAKAURI LAL KOL
                                                                          ADAL
96 Uttar Pradesh
                          Sultanpur_Uttar Pradesh MANEKA SANJAI GANDHI
                                                                           BJP
                  Sant Kabir Nagar_Uttar Pradesh PRAVEEN KUMAR NISHAD
92 Uttar Pradesh
                                                                           BJP
90 Uttar Pradesh
                           Salempur_Uttar Pradesh
                                                                RAVINDER
                                                                           BJP
24 Uttar Pradesh
                             Amethi_Uttar Pradesh
                                                            Smriti Irani
                                                                           BJP
66 Uttar Pradesh
                             Kanpur_Uttar Pradesh
                                                       Satyadev Pachauri
                                                                           BJP
31 Uttar Pradesh
                             Ballia_Uttar Pradesh
                                                          Virendra Singh
                                                                           BJP
    total_votes_party total_votes_total
                                          vote_share_percentage
67
               383009
                                86481398
                                                        0.442880
85
               436291
                                86481398
                                                        0.504491
94
               441771
                                86481398
                                                        0.510828
88
               447914
                                86481398
                                                        0.517931
96
               459196
                                86481398
                                                        0.530977
92
               467543
                                86481398
                                                        0.540628
90
               467940
                                86481398
                                                        0.541087
24
               468514
                                86481398
                                                        0.541751
66
                                                        0.542240
               468937
                                86481398
31
               469114
                                86481398
                                                        0.542445
```

12. Is there a correlation between postal votes % and voter turnout %?

```
[57]: #2014
#postal votes of states
postal_votes_state14 = df_2014.groupby('state')['postal_votes'].sum()

#total postal votes of country
postal_votes_total14 = df_2014['postal_votes'].sum()

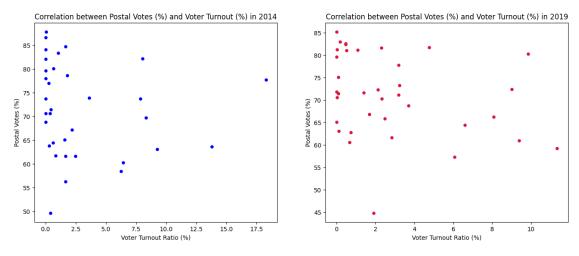
#postal votes%
postal_votes_pct14 = round((postal_votes_state14/postal_votes_total14)*100,2)

#filtering total electors per constituency
unique_df_2014 = df_2014.drop_duplicates(subset=['pc_name'])

#total electors state
total_electors_state14 = unique_df_2014.groupby('state')['total_electors'].sum()
```

```
total_electors_state14
      #total votes state
      total_votes_state14 = df_2014.groupby('state')['total_votes'].sum()
      #voter turnout%
      voter_turnout_pct14 = round((total_votes_state14/total_electors_state14)*100,2)
      #creating correlation dataframe
      correlation_df_2014 = pd.DataFrame({'Postal Votes (%) 2014':postal_votes_pct14,
                                          'Voter Turnout (%) 2014':
      ⇔voter_turnout_pct14})
      #----
      #2019
      #postal votes of states
      postal votes state19 = df 2019.groupby('state')['postal votes'].sum()
      #total postal votes of country
      postal_votes_total19 = df_2019['postal_votes'].sum()
      #postal votes%
      postal_votes_pct19 = round((postal_votes_state19/postal_votes_total19)*100,2)
      #filtering total electors per constituency
      unique_df_2019 = df_2019.drop_duplicates(subset=['pc_name'])
      #total electors state
      total_electors_state19 = unique_df_2019.groupby('state')['total_electors'].sum()
      total_electors_state19
      #total votes state
      total_votes_state19 = df_2019.groupby('state')['total_votes'].sum()
      #voter turnout%
      voter_turnout_pct19 = round((total_votes_state19/total_electors_state19)*100,2)
      #creating correlation dataframe
      correlation_df_2019 = pd.DataFrame({'Postal Votes (%) 2019':postal_votes_pct19,
                                         'Voter Turnout (%) 2019':
       ⇔voter_turnout_pct19})
[58]: fig, axes = plt.subplots(nrows=1, ncols=2, figsize=(16,6))
      correlation_df_2014.plot(kind='scatter', ax=axes[0], color='blue', x='Postalu

¬Votes (%) 2014', y='Voter Turnout (%) 2014')
```



### 13. Is there a correlation between GDP of a state and voter turnout %?

```
[59]: #defined in question above
    correlation_df_2019

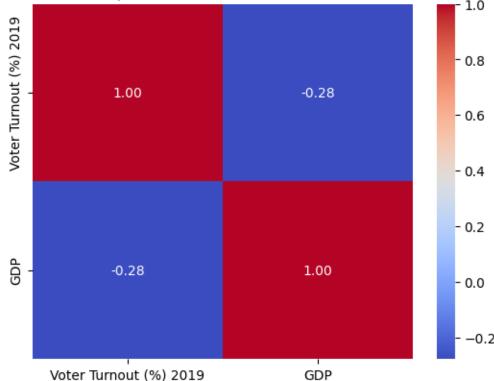
#importing GDP data
    df_gdp = pd.read_csv('GDP.csv')
    df_gdp

#merging the two
    gdp_vto = pd.merge(correlation_df_2019, df_gdp, on='state')

#plotting
```

```
# gdp_vto.plot(kind='scatter', color='blue', x='GDP', y='Voter Turnout (%)_\(\)
sb.heatmap(gdp_vto[['Voter Turnout (%) 2019','GDP']].corr(), annot=True,\(\)
\(\)
cmap='coolwarm', fmt=".2f")
plt.title('Correlation Heatmap between GDP and Voter Turnout (%) in 2019')
plt.show()
```





#### 14. Is there a correlation between literacy % of the state and voter turnout %?

```
[60]: #defined in question above
    correlation_df_2019

#importing csv file containg literacy% by state
    df_literacy = pd.read_csv('literacy rate.csv')

#merging the two
    lr_vto = pd.merge(correlation_df_2019, df_literacy, on='state', how='right')

#sb.heatmap(lr_vto[['Voter Turnout (%) 2019', 'literacy_rate']].corr(), \_
    \underset{annot=True, cmap='coolwarm', fmt=".2f")}
```

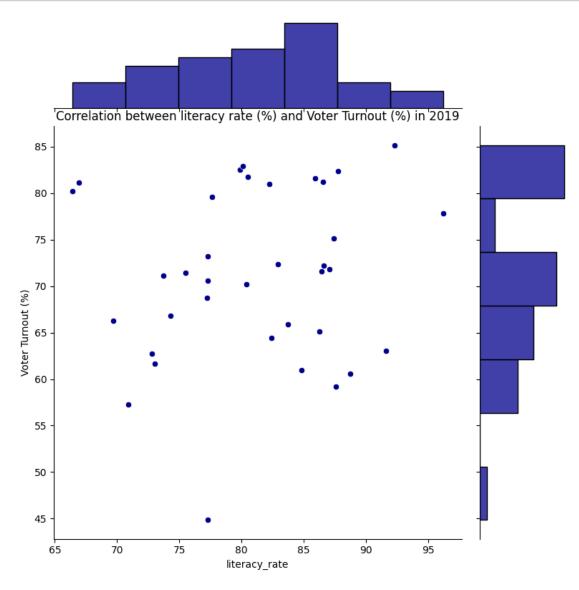
```
sb.jointplot(data=lr_vto, x='literacy_rate', y='Voter Turnout (%)_
$\times 2019', height=8, ratio=4, cmap='Purples', color='darkblue')$

plt.title('Correlation between literacy rate (%) and Voter Turnout (%) in_
$\times 2019', size=12)$

plt.xlabel('literacy_rate')

plt.ylabel('Voter Turnout (%)')

plt.show()
```



# 15. Candidates ratio based on gender in 2014 and 2019

```
[61]: #gender count from 2014
male_candidates14 = (df_2014['sex']=='M').sum()
female_candidates14 = (df_2014['sex']=='F').sum()
```

```
#gender count from 2019
male_candidates19 = (df_2019['sex']=='MALE').sum()
female_candidates19 = (df_2019['sex']=='FEMALE').sum()
#setting up values in list/arrays
data14 = [male_candidates14,female_candidates14]
data19 = [male_candidates19,female_candidates19]
labels mf = ['MALE', 'FEMALE']
explodeTuple = (0.1, 0.0)
color14 = ['dodgerblue', 'hotpink']
color19 = ['steelblue', 'deeppink']
#plotting
fig, axes = plt.subplots(nrows=1, ncols=2, figsize=(16,8))
axes[0].pie(data14, colors=color14, explode=(0.1,0.0), labels=labels_mf,_u
 \rightarrowautopct='%1.1f%%',
            pctdistance=0.85, startangle=90, textprops={'color':"w", 'size':
⇔15,'weight':'bold'})
axes[0].set_title('Male vs Female ratio in 2014', size=16)
axes[0].legend(labels_mf, title="Gender", loc="center left", bbox_to_anchor=(1,_
 0.5, 1)
axes[1].pie(data19, colors=color19, explode=(0.1,0.0), labels=labels_mf,_u
 \rightarrowautopct='%1.1f%%',
            pctdistance=0.85, startangle=90, textprops={'color':"w", 'size':
 axes[1].set_title('Male vs Female ratio in 2019', size=16)
axes[1].legend(labels_mf, title="Gender", loc="center left", bbox_to_anchor=(1,_
 0, 0.5, 1)
plt.show()
```

