PandasTraining

October 7, 2020

1 Pandas Training

1.1 Loading Data into Pandas

```
[1]: import pandas as pd
[2]: df = pd.read_csv('matches.csv')
[3]: \# df
     df.head()
     # df.head(3)
     # df.tail()
[3]:
        id
            season
                          city
                                      date
                                                                   team1
     0
         1
              2017
                   Hyderabad
                               2017-04-05
                                                    Sunrisers Hyderabad
                         Pune
                               2017-04-06
                                                          Mumbai Indians
     1
         2
              2017
     2
         3
              2017
                       Rajkot
                               2017-04-07
                                                           Gujarat Lions
     3
         4
              2017
                                2017-04-08
                                                 Rising Pune Supergiant
                       Indore
     4
         5
              2017
                    Bangalore
                                2017-04-08
                                            Royal Challengers Bangalore
                                                       toss_winner toss_decision \
                               team2
        Royal Challengers Bangalore
                                      Royal Challengers Bangalore
                                                                           field
     1
             Rising Pune Supergiant
                                           Rising Pune Supergiant
                                                                           field
     2
              Kolkata Knight Riders
                                            Kolkata Knight Riders
                                                                           field
                                                  Kings XI Punjab
     3
                    Kings XI Punjab
                                                                           field
                   Delhi Daredevils
                                     Royal Challengers Bangalore
                                                                             bat
                                                           win_by_runs
        result
                dl_applied
                                                  winner
     0 normal
                                     Sunrisers Hyderabad
                                                                    35
     1 normal
                          0
                                  Rising Pune Supergiant
                                                                     0
     2 normal
                         0
                                   Kolkata Knight Riders
                                                                     0
     3 normal
                          0
                                         Kings XI Punjab
                                                                     0
     4 normal
                            Royal Challengers Bangalore
                                                                    15
        win_by_wickets player_of_match
                                                                              venue \
     0
                          Yuvraj Singh
                                        Rajiv Gandhi International Stadium, Uppal
                     7
                              SPD Smith
                                           Maharashtra Cricket Association Stadium
     1
     2
                    10
                                CA Lynn
                                            Saurashtra Cricket Association Stadium
```

```
3
                       6
                               GJ Maxwell
                                                                 Holkar Cricket Stadium
     4
                       0
                                KM Jadhav
                                                                  M Chinnaswamy Stadium
                umpire1
                                 umpire2 umpire3
     0
            AY Dandekar
                                NJ Llong
                                               NaN
     1
        A Nand Kishore
                                  S Ravi
                                              NaN
     2
            Nitin Menon
                               CK Nandan
                                              NaN
     3
           AK Chaudhary
                          C Shamshuddin
                                              NaN
     4
                     NaN
                                     NaN
                                              NaN
[4]: df = pd.read_csv('pokemon_data.csv')
     df.head()
[4]:
        #
                               Name Type 1
                                             Type 2
                                                      ΗP
                                                           Attack
                                                                    Defense
                                                                              Sp. Atk
     0
        1
                                     Grass
                                             Poison
                                                      45
                                                               49
                                                                         49
                                                                                   65
                         Bulbasaur
                                                                         63
     1
        2
                                             Poison
                                                               62
                           Ivysaur
                                     Grass
                                                      60
                                                                                   80
     2
        3
                          Venusaur
                                                      80
                                                               82
                                                                                  100
                                     Grass
                                             Poison
                                                                         83
     3
        3
           VenusaurMega Venusaur
                                     Grass
                                             Poison
                                                              100
                                                                        123
                                                                                  122
                                                      80
     4
        4
                        Charmander
                                       Fire
                                                 NaN
                                                      39
                                                               52
                                                                         43
                                                                                   60
                          Generation Legendary
        Sp. Def
                   Speed
     0
              65
                      45
                                     1
                                            False
     1
              80
                      60
                                     1
                                            False
     2
             100
                      80
                                     1
                                            False
     3
             120
                      80
                                     1
                                            False
     4
              50
                      65
                                     1
                                            False
```

For Reading Excel Files Need to Install a Third Party Package called xlrd

You can make use of 'pip install xlrd' from scripts directory otherwise in Jupyter Notebook as shown below.,

[5]: !pip install xlrd

Requirement already satisfied: xlrd in /Users/rajath/.virtualenvs/ai/lib/python3.8/site-packages (1.2.0)

```
[6]: df_xlsx = pd.read_excel('pokemon_data.xlsx')
    df_xlsx.head()
```

```
[6]:
        #
                                                                               Sp. Atk
                               Name Type 1
                                              Type 2
                                                       ΗP
                                                            Attack
                                                                     Defense
                                                                                        \
        1
                                                       45
                                                                49
                                                                          49
                                                                                     65
     0
                         Bulbasaur
                                      Grass
                                              Poison
        2
     1
                                                                62
                                                                                     80
                            Ivysaur
                                      Grass
                                              Poison
                                                       60
                                                                           63
     2
        3
                           Venusaur
                                              Poison
                                                       80
                                                                82
                                                                           83
                                                                                    100
                                      Grass
     3
        3
                                                                         123
            VenusaurMega Venusaur
                                      Grass
                                              Poison
                                                       80
                                                               100
                                                                                    122
     4
        4
                         Charmander
                                       Fire
                                                 NaN
                                                       39
                                                                52
                                                                           43
                                                                                     60
```

Sp. Def Speed Generation Legendary

```
0
         65
                 45
                                1
                                        False
1
         80
                                        False
                 60
                                1
2
        100
                 80
                                1
                                         False
3
        120
                 80
                                1
                                         False
4
         50
                 65
                                1
                                         False
```

```
[7]: df_tab = pd.read_csv('pokemon_data.txt')
df_tab.head()
```

- [7]: #\tName\tType 1\tType 2\tHP\tAttack\tDefense\tSp. Atk\tSp. Def\tSpeed\tGeneration\tLegendary
 - 0 1\tBulbasaur\tGrass\tPoison\t45\t49\t49\t65\t6...
 - $2\tIvysaur\tGrass\tPoison\t60\t62\t63\t80\t.$
 - $3\tVenusaur\tGrass\tPoison\t80\t82\t83\t100\t1...$
 - 3 3\tVenusaurMega Venusaur\tGrass\tPoison\t80\t1...
 - $4\tCharmander\tFire\t\t39\t52\t43\t60\t50\t65\...$

```
[8]: df_tab = pd.read_csv('pokemon_data.txt', delimiter='\t')
df_tab.head()
```

[8]:		#	Name	Type 1	Type 2	HP	Attack	Defense	Sp. Atk	\
	0	1	Bulbasaur	Grass	Poison	45	49	49	65	
	1	2	Ivysaur	Grass	Poison	60	62	63	80	
	2	3	Venusaur	Grass	Poison	80	82	83	100	
	3	3	VenusaurMega Venusaur	Grass	Poison	80	100	123	122	
	4	4	Charmander	Fire	NaN	39	52	43	60	

	Sp.	Def	Speed	Generation	Legendary
0		65	45	1	False
1		80	60	1	False
2		100	80	1	False
3		120	80	1	False
4		50	65	1	False

1.1.1 Reading Data in Pandas

```
[9]: df.columns
```

Reading a Particular Column

```
[10]: # df['Name']
df['Name'] [0:5]
# df.Name
```

```
1
                          Ivysaur
      2
                        Venusaur
      3
           VenusaurMega Venusaur
      4
                       Charmander
      Name: Name, dtype: object
     Reading Multiple Columns
[11]: print(df[['Name', 'Speed', 'Generation']][0:5])
                          Name Speed
                                       Generation
     0
                     Bulbasaur
                                    45
                                                 1
     1
                       Ivysaur
                                    60
                                                 1
     2
                      Venusaur
                                   80
                                                 1
        VenusaurMega Venusaur
                                   80
                                                 1
                    Charmander
                                                 1
                                    65
     Reading Each Row
[12]: # Reading a Particular Row
      print(df.iloc[1])
     #
                          2
     Name
                    Ivysaur
     Type 1
                      Grass
     Type 2
                     Poison
     ΗP
                         60
     Attack
                         62
                         63
     Defense
     Sp. Atk
                         80
     Sp. Def
                         80
     Speed
                         60
     Generation
                          1
     Legendary
                      False
     Name: 1, dtype: object
[13]: # Reading a Set of Rows
      print(df.iloc[0:4])
        #
                             Name Type 1 Type 2
                                                   ΗP
                                                       Attack Defense
                                                                         Sp. Atk \
     0
        1
                        Bulbasaur Grass Poison
                                                   45
                                                            49
                                                                     49
                                                                               65
     1
        2
                          Ivysaur Grass
                                           Poison
                                                   60
                                                            62
                                                                     63
                                                                              80
     2
        3
                         Venusaur
                                   Grass
                                           Poison
                                                   80
                                                            82
                                                                     83
                                                                             100
     3
        3 VenusaurMega Venusaur Grass
                                          Poison 80
                                                           100
                                                                    123
                                                                             122
        Sp. Def
                 Speed Generation Legendary
     0
              65
                     45
                                   1
                                          False
     1
              80
                     60
                                   1
                                          False
```

[10]: 0

Bulbasaur

```
2 100 80 1 False
3 120 80 1 False
```

Iterating over the data frame

```
[14]: # for index, row in df.iterrows():
    # print(index, row['Name'])
    # print(index, row)
    df.loc[df['Type 1'] == 'Fire'][0:5]
```

```
[14]:
         #
                                   Name Type 1
                                                  Type 2
                                                          ΗP
                                                               Attack
                                                                       Defense
                                                                                 Sp. Atk
      4
         4
                             Charmander
                                           Fire
                                                     NaN
                                                          39
                                                                   52
                                                                             43
                                                                                       60
      5
         5
                             Charmeleon
                                           Fire
                                                     NaN
                                                          58
                                                                   64
                                                                             58
                                                                                       80
      6
         6
                              Charizard
                                           Fire Flying
                                                          78
                                                                   84
                                                                             78
                                                                                      109
             CharizardMega Charizard X
      7
         6
                                           Fire
                                                 Dragon
                                                          78
                                                                  130
                                                                            111
                                                                                      130
      8
         6
             CharizardMega Charizard Y
                                           Fire Flying
                                                                  104
                                                                             78
                                                                                      159
```

	Sp. Def	Speed	Generation	Legendary
4	50	65	1	False
5	65	80	1	False
6	85	100	1	False
7	85	100	1	False
8	115	100	1	False

1.1.2 Sorting / Describing Data

```
[15]: df.describe()
```

```
[15]:
                       #
                                                       Defense
                                                                    Sp. Atk
                                                                                 Sp. Def
                                  ΗP
                                           Attack
             800.000000
                          800.000000
                                                    800.00000
                                                                800.00000
                                                                             800.000000
      count
                                       800.00000
             362.813750
                           69.258750
                                        79.001250
                                                     73.842500
                                                                  72.820000
                                                                              71.902500
      mean
      std
             208.343798
                           25.534669
                                        32.457366
                                                     31.183501
                                                                  32.722294
                                                                              27.828916
      min
                1.000000
                            1.000000
                                         5.000000
                                                      5.000000
                                                                  10.000000
                                                                              20.000000
      25%
             184.750000
                           50.000000
                                        55.000000
                                                     50.000000
                                                                  49.750000
                                                                              50.000000
      50%
             364.500000
                           65.000000
                                        75.000000
                                                     70.000000
                                                                  65.000000
                                                                              70.00000
      75%
             539.250000
                           80.000000
                                       100.000000
                                                     90.000000
                                                                  95.000000
                                                                              90.000000
             721.000000
                          255.000000
                                       190.000000
                                                    230.000000
                                                                194.000000
                                                                             230.000000
      max
```

	Speed	Generation
count	800.000000	800.00000
mean	68.277500	3.32375
std	29.060474	1.66129
min	5.000000	1.00000
25%	45.000000	2.00000
50%	65.000000	3.00000
75%	90.000000	5.00000
max	180.000000	6.00000

```
[16]: # df.sort_values('Name')[0:5]
      # df.sort_values('Name', ascending=False)[0:5]
      df.sort_values(['Type 1', 'HP'], ascending=[True, False])[0:5]
[16]:
             #
                                     Name Type 1
                                                     Type 2
                                                              ΗP
                                                                  Attack
                                                                           Defense
      520
                                                                      76
                                                                                86
           469
                                  Yanmega
                                              Bug
                                                     Flying
                                                              86
      698
           637
                                Volcarona
                                              Bug
                                                       Fire
                                                              85
                                                                      60
                                                                                65
      231 214
                                Heracross
                                              Bug
                                                   Fighting
                                                              80
                                                                     125
                                                                                75
      232 214
                HeracrossMega Heracross
                                              Bug
                                                   Fighting
                                                              80
                                                                     185
                                                                               115
      678
           617
                                 Accelgor
                                              Bug
                                                         {\tt NaN}
                                                              80
                                                                      70
                                                                                40
           Sp. Atk
                     Sp. Def
                               Speed
                                      Generation
                                                   Legendary
      520
                116
                          56
                                  95
                                                       False
      698
                135
                                                5
                                                       False
                          105
                                 100
                                                2
      231
                 40
                          95
                                  85
                                                       False
      232
                 40
                         105
                                  75
                                                2
                                                       False
      678
                100
                          60
                                 145
                                                5
                                                       False
     Making Changes to the Data
[17]: df['Total'] = df['HP']+df['Attack']
[18]: df.head(5)
[18]:
         #
                               Name Type 1
                                            Type 2
                                                                            Sp. Atk \
                                                     ΗP
                                                         Attack
                                                                  Defense
      0
         1
                         Bulbasaur
                                     Grass
                                            Poison
                                                     45
                                                              49
                                                                        49
                                                                                 65
      1
         2
                            Ivysaur
                                     Grass Poison
                                                     60
                                                              62
                                                                       63
                                                                                 80
      2
                          Venusaur
                                                              82
                                                                       83
                                                                                100
                                     Grass
                                            Poison
                                                     80
      3
         3
            VenusaurMega Venusaur
                                     Grass
                                                     80
                                                             100
                                                                       123
                                                                                122
                                             Poison
      4
         4
                        Charmander
                                      Fire
                                                {\tt NaN}
                                                     39
                                                              52
                                                                        43
                                                                                 60
                   Speed Generation Legendary
         Sp. Def
      0
              65
                      45
                                    1
                                            False
                                                      94
              80
                      60
                                    1
                                            False
                                                     122
      1
      2
              100
                      80
                                    1
                                            False
                                                     162
      3
              120
                      80
                                    1
                                            False
                                                     180
      4
              50
                      65
                                            False
                                                      91
     df = df.drop(columns=['Total'])
[20]:
     df.head(5)
[20]:
         #
                                            Type 2
                                                         Attack
                               Name Type 1
                                                     ΗP
                                                                  Defense
                                                                            Sp. Atk \
      0
         1
                                     Grass
                                            Poison
                                                              49
                                                                        49
                                                                                 65
                         Bulbasaur
                                                     45
         2
      1
                            Ivysaur
                                     Grass Poison
                                                     60
                                                              62
                                                                                 80
                                                                        63
      2
                          Venusaur Grass
                                            Poison
                                                              82
                                                                        83
                                                                                100
                                            Poison
         3 VenusaurMega Venusaur Grass
                                                     80
                                                             100
                                                                      123
                                                                                122
```

```
4 4
                        Charmander
                                     Fire
                                               NaN 39
                                                             52
                                                                      43
                                                                                60
                  Speed
         Sp. Def
                         Generation Legendary
      0
              65
                      45
                                   1
      1
              80
                      60
                                   1
                                           False
      2
             100
                      80
                                   1
                                           False
      3
             120
                      80
                                   1
                                           False
      4
              50
                      65
                                   1
                                           False
[21]: df['Total'] = df.iloc[:,4:6].sum(axis=1)
[22]: df.head(5)
[22]:
         #
                              Name Type 1 Type 2 HP
                                                        Attack Defense
                                                                          Sp. Atk \
      0
         1
                         Bulbasaur Grass Poison
                                                    45
                                                             49
                                                                      49
                                                                                65
                           Ivysaur
      1
         2
                                    Grass Poison
                                                    60
                                                             62
                                                                      63
                                                                                80
      2
         3
                          Venusaur
                                                    80
                                                             82
                                                                      83
                                    Grass
                                           Poison
                                                                               100
      3
         3 VenusaurMega Venusaur
                                    Grass
                                           Poison
                                                    80
                                                            100
                                                                     123
                                                                               122
      4
         4
                        Charmander
                                                             52
                                                                                60
                                     Fire
                                               NaN
                                                    39
                                                                      43
                  Speed
                         Generation Legendary Total
         Sp. Def
              65
                      45
      0
                                   1
                                           False
                                                     94
      1
              80
                      60
                                   1
                                           False
                                                    122
      2
             100
                                   1
                                                    162
                      80
                                           False
      3
             120
                      80
                                    1
                                           False
                                                    180
      4
              50
                      65
                                   1
                                           False
                                                     91
[23]: cols = df.columns.values
[24]:
      cols
[24]: array(['#', 'Name', 'Type 1', 'Type 2', 'HP', 'Attack', 'Defense',
             'Sp. Atk', 'Sp. Def', 'Speed', 'Generation', 'Legendary', 'Total'],
            dtype=object)
      cols = list(df.columns)
[26]:
      cols
[26]: ['#',
       'Name',
       'Type 1',
       'Type 2',
       'HP',
       'Attack',
       'Defense',
       'Sp. Atk',
```

```
'Sp. Def',
       'Speed',
       'Generation',
       'Legendary',
       'Total']
[27]: df = df[cols[0:4] + [cols[-1]] + cols[4:12]]
[28]:
      df.head()
[28]:
                             Name Type 1 Type 2
                                                                      Defense
                                                  Total
                                                          ΗP
                                                              Attack
         1
                        Bulbasaur Grass Poison
                                                      94
                                                          45
                                                                  49
                                                                            49
                          Ivysaur Grass Poison
      1
         2
                                                     122
                                                          60
                                                                  62
                                                                            63
      2
                                                                  82
        3
                         Venusaur Grass Poison
                                                     162
                                                          80
                                                                            83
      3
        3 VenusaurMega Venusaur Grass Poison
                                                     180
                                                          80
                                                                 100
                                                                           123
      4
                       Charmander
                                                                  52
                                                                            43
                                    Fire
                                              NaN
                                                      91
                                                          39
                           Speed
                                  Generation Legendary
         Sp. Atk Sp. Def
      0
              65
                       65
                              45
                                            1
                                                   False
              80
                       80
                              60
                                            1
                                                   False
      1
      2
             100
                      100
                              80
                                                   False
                                            1
      3
             122
                      120
                              80
                                            1
                                                   False
      4
              60
                       50
                              65
                                            1
                                                   False
[29]: df.to_csv('modified.csv', index=False)
     To Save File in Excel need to install third party library called 'openpyxl'
[30]: !pip install openpyxl
     Requirement already satisfied: openpyxl in
     /Users/rajath/.virtualenvs/ai/lib/python3.8/site-packages (3.0.5)
     Requirement already satisfied: jdcal in
     /Users/rajath/.virtualenvs/ai/lib/python3.8/site-packages (from openpyxl)
     Requirement already satisfied: et-xmlfile in
     /Users/rajath/.virtualenvs/ai/lib/python3.8/site-packages (from openpyx1)
     (1.0.1)
[31]: df.to_excel('modified.xlsx', index=False)
[32]: df.to_csv('modified.txt', index=False, sep='\t')
     Filtering of Data
[33]: df.loc[(df['Type 1'] == 'Grass') & (df['Type 2'] == 'Poison')][0:10]
      df.loc[(df['Type 1'] == 'Grass') | (df['Type 2'] == 'Poison')][0:10]
```

```
new_df = df.loc[(df['Type 1'] == 'Grass') & (df['Type 2'] == 'Poison') &_{\sqcup}
       \hookrightarrow (df['HP'] > 70)][0:10]
[34]: new df
[34]:
              #
                                   Name Type 1 Type 2 Total
                                                                   ΗP
                                                                        Attack
                                                                                Defense
      2
              3
                               Venusaur
                                          Grass Poison
                                                             162
                                                                            82
                                                                                      83
                                                                   80
      3
                 VenusaurMega Venusaur
                                                                           100
                                                                                     123
              3
                                          Grass Poison
                                                             180
                                                                   80
      50
             45
                              Vileplume
                                                             155
                                                                   75
                                                                            80
                                                                                      85
                                          Grass Poison
      77
             71
                             Victreebel
                                          Grass Poison
                                                             185
                                                                   80
                                                                           105
                                                                                      65
      652
           591
                              Amoonguss
                                          Grass Poison
                                                             199
                                                                            85
                                                                                      70
                                                                  114
            Sp. Atk
                     Sp. Def
                               Speed
                                       Generation Legendary
      2
                100
                          100
                                  80
                                                 1
                                                        False
      3
                122
                          120
                                  80
                                                 1
                                                        False
      50
                110
                           90
                                  50
                                                 1
                                                        False
      77
                100
                           70
                                  70
                                                 1
                                                        False
      652
                 85
                           80
                                  30
                                                 5
                                                        False
      # new_df = new_df.reset_index()
[35]:
[36]:
      # new df
     new_df.reset_index(drop=True, inplace=True)
[38]:
     new_df
[38]:
            #
                                 Name Type 1
                                               Type 2
                                                        Total
                                                                 HP
                                                                      Attack
                                                                              Defense
      0
            3
                             Venusaur
                                        Grass
                                               Poison
                                                           162
                                                                 80
                                                                          82
                                                                                    83
               VenusaurMega Venusaur Grass
                                                                                   123
      1
            3
                                               Poison
                                                           180
                                                                 80
                                                                         100
      2
                            Vileplume Grass
                                                                          80
          45
                                               Poison
                                                           155
                                                                 75
                                                                                    85
      3
          71
                           Victreebel
                                        Grass
                                               Poison
                                                           185
                                                                         105
                                                                                    65
                                                                 80
         591
                            Amoonguss Grass
                                               Poison
                                                           199
                                                                114
                                                                          85
                                                                                    70
         Sp. Atk
                   Sp. Def
                             Speed
                                     Generation Legendary
      0
              100
                        100
                                80
                                               1
                                                      False
              122
                        120
                                                      False
      1
                                80
                                               1
      2
              110
                         90
                                50
                                                      False
                                               1
      3
              100
                         70
                                70
                                               1
                                                      False
      4
               85
                         80
                                30
                                                      False
[39]: df.loc[~ df['Name'].str.contains('Mega')][0:5]
[39]:
         #
                   Name Type 1
                                 Type 2
                                          Total
                                                 ΗP
                                                      Attack
                                                               Defense
                                                                         Sp. Atk
                                                                                  Sp. Def
         1
                          Grass
                                 Poison
                                             94
                                                  45
                                                           49
                                                                    49
                                                                              65
                                                                                        65
      0
              Bulbasaur
         2
                                                           62
      1
                Ivysaur
                          Grass
                                 Poison
                                            122
                                                  60
                                                                     63
                                                                              80
                                                                                        80
      2
         3
                                            162
                                                           82
               Venusaur
                          Grass
                                 Poison
                                                  80
                                                                    83
                                                                             100
                                                                                       100
```

```
4
         4
            Charmander
                          Fire
                                    NaN
                                             91
                                                 39
                                                         52
                                                                   43
                                                                             60
                                                                                      50
      5
            Charmeleon
                                            122 58
                                                          64
                                                                   58
                                                                             80
                                                                                      65
         5
                          Fire
                                    {\tt NaN}
         Speed
                 Generation Legendary
      0
            45
                          1
                                  False
            60
                          1
      1
                                  False
      2
            80
                          1
                                  False
      4
                          1
            65
                                  False
      5
            80
                          1
                                  False
[40]: import re
      df.loc[df['Type 1'].str.contains('Fire|Grass', regex=True)][0:5]
[40]:
         #
                               Name Type 1
                                            Type 2 Total
                                                            ΗP
                                                                 Attack
                                                                        Defense
                                                                                  \
      0
         1
                         Bulbasaur Grass
                                            Poison
                                                        94
                                                             45
                                                                     49
                                                                               49
      1
         2
                                                                     62
                           Ivysaur
                                     Grass
                                            Poison
                                                       122
                                                             60
                                                                               63
      2
         3
                          Venusaur
                                     Grass
                                            Poison
                                                       162
                                                             80
                                                                     82
                                                                               83
      3
            VenusaurMega Venusaur
                                            Poison
                                                       180
                                                             80
                                                                    100
                                                                              123
                                     Grass
                        Charmander
                                      Fire
                                                        91
                                                             39
                                                                     52
                                                                               43
      4
                                                NaN
                  Sp. Def
                            Speed
                                    Generation Legendary
         Sp. Atk
      0
              65
                        65
                                45
                                              1
                                                     False
      1
              80
                        80
                                60
                                              1
                                                     False
      2
              100
                       100
                                80
                                              1
                                                     False
      3
              122
                       120
                                80
                                              1
                                                     False
      4
              60
                        50
                                65
                                                     False
[41]: df.loc[df['Type 1'].str.contains('Fire|Grass', flags=re.I, regex=True)][0:5]
[41]:
         #
                               Name Type 1
                                            Type 2
                                                     Total
                                                            ΗP
                                                                 Attack
                                                                         Defense
      0
         1
                         Bulbasaur
                                     Grass
                                            Poison
                                                        94
                                                             45
                                                                     49
                                                                               49
      1
         2
                           Ivysaur
                                     Grass
                                            Poison
                                                       122
                                                             60
                                                                     62
                                                                               63
      2
         3
                          Venusaur
                                                       162
                                                             80
                                                                     82
                                                                               83
                                     Grass
                                            Poison
      3
         3
                                                       180
            VenusaurMega Venusaur
                                     Grass
                                            Poison
                                                             80
                                                                    100
                                                                              123
      4
         4
                        Charmander
                                      Fire
                                                NaN
                                                        91
                                                             39
                                                                     52
                                                                               43
                  Sp. Def
                            Speed
                                    Generation
                                                Legendary
         Sp. Atk
      0
                                45
              65
                        65
                                              1
                                                     False
      1
              80
                        80
                                60
                                              1
                                                     False
      2
              100
                       100
                                80
                                              1
                                                     False
      3
              122
                       120
                                80
                                              1
                                                     False
      4
              60
                        50
                                65
                                              1
                                                     False
[42]: df.loc[df['Name'].str.contains('^pi[a-z]*', flags=re.I, regex=True)][0:5]
```

```
[42]:
           #
                               Name
                                       Type 1
                                                Type 2
                                                        Total
                                                                ΗP
                                                                    Attack Defense
      20
                                                                40
                                                                         45
                                                                                   40
          16
                            Pidgey
                                       Normal
                                                Flying
                                                            85
      21
          17
                         Pidgeotto
                                       Normal
                                                Flying
                                                           123
                                                                63
                                                                         60
                                                                                   55
      22
          18
                           Pidgeot
                                       Normal
                                                Flying
                                                           163
                                                                83
                                                                         80
                                                                                   75
      23
              PidgeotMega Pidgeot
                                       Normal
                                                Flying
                                                           163
                                                                83
                                                                         80
                                                                                  80
          18
      30
          25
                           Pikachu Electric
                                                   NaN
                                                            90
                                                                35
                                                                         55
                                                                                   40
                              Speed
          Sp. Atk
                    Sp. Def
                                    Generation
                                                  Legendary
      20
                35
                         35
                                 56
                                                      False
                                               1
                50
                         50
                                               1
                                                      False
      21
                                 71
      22
                70
                         70
                                101
                                               1
                                                      False
      23
               135
                         80
                                121
                                               1
                                                      False
      30
                50
                         50
                                 90
                                               1
                                                      False
     Conditional Changes
[43]: df.loc[df['Type 1'] == 'Fire', 'Type 1'] = 'Flamer'
[44]: df.head()
[44]:
         #
                                     Type 1 Type 2
                                                      Total
                                                              ΗP
                                                                  Attack
                                                                           Defense
                               Name
                                      Grass Poison
         1
                         Bulbasaur
      0
                                                          94
                                                              45
                                                                       49
                                                                                49
      1
         2
                                      Grass Poison
                                                         122
                                                                       62
                            Ivysaur
                                                              60
                                                                                63
      2
         3
                          Venusaur
                                      Grass Poison
                                                         162
                                                              80
                                                                       82
                                                                                83
      3
            VenusaurMega Venusaur
                                      Grass Poison
                                                         180
                                                              80
                                                                      100
                                                                               123
      4
         4
                        Charmander Flamer
                                                 NaN
                                                          91
                                                              39
                                                                       52
                                                                                43
                   Sp. Def
                            Speed
                                    Generation
                                                 Legendary
         Sp. Atk
      0
               65
                        65
                                45
                                                     False
                                              1
      1
              80
                        80
                                              1
                                                     False
                                60
      2
              100
                       100
                                80
                                              1
                                                     False
      3
              122
                       120
                                80
                                              1
                                                     False
      4
              60
                        50
                                65
                                              1
                                                     False
[45]: df.loc[df['Type 1'] == 'Grass', 'Legendary'] = True
     df.head()
[46]:
[46]:
         #
                                             Type 2
                                                      Total
                                                                           Defense
                               Name
                                     Type 1
                                                              ΗP
                                                                  Attack
      0
         1
                         Bulbasaur
                                      Grass Poison
                                                          94
                                                              45
                                                                       49
                                                                                49
      1
         2
                            Ivysaur
                                      Grass Poison
                                                         122
                                                              60
                                                                       62
                                                                                63
      2
         3
                          Venusaur
                                      Grass Poison
                                                         162
                                                              80
                                                                       82
                                                                                83
      3
            VenusaurMega Venusaur
                                                         180
                                                                               123
         3
                                      Grass
                                              Poison
                                                              80
                                                                      100
      4
         4
                        Charmander
                                     Flamer
                                                 NaN
                                                          91
                                                                       52
                                                                                43
                                                              39
         Sp. Atk Sp. Def
                            Speed
                                    Generation
                                                 Legendary
      0
               65
                        65
                                45
                                              1
                                                      True
```

```
1
              80
                        80
                               60
                                             1
                                                      True
      2
             100
                       100
                                                      True
                               80
                                             1
      3
             122
                       120
                               80
                                             1
                                                      True
      4
              60
                        50
                               65
                                             1
                                                    False
[47]: df.loc[df['Speed'] > 10, ['Generation', 'Legendary']] = ['Test 1', 'Test 2']
[48]: df.head()
[48]:
         #
                                     Type 1 Type 2 Total
                                                             ΗP
                                                                 Attack
                                                                          Defense
                              Name
      0
         1
                         Bulbasaur
                                      Grass Poison
                                                         94
                                                                     49
                                                             45
                                                                               49
      1
         2
                           Ivysaur
                                      Grass Poison
                                                        122
                                                             60
                                                                     62
                                                                               63
      2
                          Venusaur
                                      Grass Poison
                                                        162
                                                             80
                                                                     82
                                                                               83
         3 VenusaurMega Venusaur
                                                        180
                                                                     100
      3
                                      Grass Poison
                                                             80
                                                                              123
      4
         4
                        Charmander Flamer
                                                NaN
                                                         91
                                                             39
                                                                     52
                                                                               43
                            Speed Generation Legendary
                  Sp. Def
         Sp. Atk
      0
                        65
                               45
                                       Test 1
                                                 Test 2
              65
      1
              80
                        80
                               60
                                       Test 1
                                                 Test 2
      2
                                       Test 1
             100
                       100
                               80
                                                 Test 2
      3
             122
                       120
                               80
                                       Test 1
                                                 Test 2
      4
              60
                        50
                                                 Test 2
                               65
                                       Test 1
[49]: df = pd.read_csv('pokemon_data.csv')
      df.head()
[49]:
                              Name Type 1
                                            Type 2
                                                                 Defense
                                                                           Sp. Atk
         #
                                                    ΗP
                                                         Attack
      0
         1
                         Bulbasaur Grass
                                           Poison
                                                    45
                                                             49
                                                                       49
                                                                                65
      1
         2
                           Ivysaur
                                    Grass
                                            Poison
                                                    60
                                                             62
                                                                       63
                                                                                80
      2
         3
                                                    80
                                                             82
                                                                       83
                                                                               100
                          Venusaur
                                    Grass
                                           Poison
                                            Poison
      3
         3
           VenusaurMega Venusaur
                                    Grass
                                                    80
                                                            100
                                                                      123
                                                                               122
         4
                        Charmander
                                                    39
                                                             52
                                                                       43
                                                                                60
                                      Fire
                                               NaN
                  Speed
                         Generation Legendary
         Sp. Def
                                           False
      0
              65
                      45
                                    1
      1
              80
                      60
                                    1
                                           False
      2
             100
                      80
                                    1
                                           False
      3
             120
                      80
                                    1
                                           False
      4
              50
                      65
                                    1
                                           False
     Aggregate Statistics (GroupBy)
[50]: df.groupby(['Type 1']).mean().sort_values('Defense', ascending=False)
[50]:
                          #
                                    ΗP
                                             Attack
                                                         Defense
                                                                    Sp. Atk
                                                                                Sp. Def \
      Type 1
                                          92.703704 126.370370 67.518519
      Steel
                442.851852 65.222222
```

```
Rock
                392.727273
                             65.363636
                                         92.863636
                                                     100.795455
                                                                  63.340909
                                                                             75.477273
                474.375000
                             83.312500
                                         112.125000
                                                      86.375000
                                                                  96.843750
                                                                             88.843750
      Dragon
      Ground
                356.281250
                             73.781250
                                         95.750000
                                                      84.843750
                                                                  56.468750
                                                                             62.750000
      Ghost
                486.500000
                             64.437500
                                         73.781250
                                                      81.187500
                                                                 79.343750
                                                                             76.468750
      Water
                                                      72.946429
                                                                  74.812500
                303.089286
                             72.062500
                                         74.151786
                                                                             70.517857
                                                                             76.291667
      Ice
                423.541667
                             72.000000
                                         72.750000
                                                      71.416667
                                                                  77.541667
                                                      70.800000
      Grass
                344.871429
                             67.271429
                                         73.214286
                                                                 77.500000
                                                                             70.428571
      Bug
                334.492754
                             56.884058
                                         70.971014
                                                      70.724638
                                                                  53.869565
                                                                             64.797101
      Dark
                461.354839
                             66.806452
                                         88.387097
                                                      70.225806
                                                                 74.645161
                                                                             69.516129
      Poison
                             67.250000
                                                      68.821429
                                                                  60.428571
                251.785714
                                         74.678571
                                                                             64.392857
      Fire
                327.403846
                             69.903846
                                         84.769231
                                                      67.769231
                                                                  88.980769
                                                                             72.211538
      Psychic
                380.807018
                             70.631579
                                         71.456140
                                                      67.684211
                                                                  98.403509
                                                                             86.280702
      Electric
                363.500000
                             59.795455
                                         69.090909
                                                      66.295455
                                                                  90.022727
                                                                             73.704545
      Flying
                677.750000
                             70.750000
                                         78.750000
                                                      66.250000
                                                                  94.250000
                                                                             72.500000
      Fighting
                363.851852
                             69.851852
                                         96.777778
                                                      65.925926
                                                                  53.111111
                                                                             64.703704
      Fairy
                449.529412
                             74.117647
                                         61.529412
                                                      65.705882
                                                                  78.529412
                                                                             84.705882
      Normal
                319.173469
                             77.275510
                                         73.469388
                                                      59.846939
                                                                  55.816327
                                                                             63.724490
                      Speed
                             {\tt Generation}
                                         Legendary
      Type 1
      Steel
                 55.259259
                               3.851852
                                          0.148148
      Rock
                 55.909091
                               3.454545
                                          0.090909
                 83.031250
                               3.875000
                                          0.375000
      Dragon
      Ground
                 63.906250
                               3.156250
                                          0.125000
      Ghost
                 64.343750
                               4.187500
                                          0.062500
      Water
                 65.964286
                               2.857143
                                          0.035714
                                          0.083333
      Ice
                 63.458333
                               3.541667
      Grass
                 61.928571
                               3.357143
                                          0.042857
      Bug
                 61.681159
                               3.217391
                                          0.000000
      Dark
                 76.161290
                               4.032258
                                          0.064516
      Poison
                 63.571429
                               2.535714
                                          0.000000
      Fire
                 74.442308
                               3.211538
                                          0.096154
      Psychic
                 81.491228
                               3.385965
                                          0.245614
      Electric
                 84.500000
                               3.272727
                                          0.090909
                               5.500000
                                          0.500000
      Flying
                102.500000
      Fighting
                 66.074074
                               3.370370
                                          0.000000
                                          0.058824
      Fairy
                 48.588235
                               4.117647
      Normal
                               3.051020
                                          0.020408
                 71.551020
[51]: df.groupby(['Type 1']).mean().sort_values('Speed', ascending=False)
[51]:
                          #
                                    HP
                                                                               Sp. Def
                                             Attack
                                                        Defense
                                                                    Sp. Atk
      Type 1
      Flying
                677.750000
                             70.750000
                                         78.750000
                                                      66.250000
                                                                  94.250000
                                                                             72.500000
      Electric
                363.500000
                             59.795455
                                         69.090909
                                                      66.295455
                                                                 90.022727
                                                                             73.704545
      Dragon
                474.375000
                             83.312500
                                         112.125000
                                                      86.375000
                                                                  96.843750
                                                                             88.843750
      Psychic
                             70.631579
                                         71.456140
                                                      67.684211
                380.807018
                                                                  98.403509
                                                                             86.280702
```

```
Dark
                 461.354839
                             66.806452
                                          88.387097
                                                       70.225806
                                                                  74.645161
                                                                              69.516129
      Fire
                 327.403846
                             69.903846
                                          84.769231
                                                       67.769231
                                                                  88.980769
                                                                              72.211538
      Normal
                 319.173469
                             77.275510
                                          73.469388
                                                       59.846939
                                                                  55.816327
                                                                              63.724490
      Fighting
                 363.851852
                             69.851852
                                          96.777778
                                                       65.925926
                                                                  53.111111
                                                                              64.703704
      Water
                 303.089286
                             72.062500
                                                       72.946429
                                                                  74.812500
                                          74.151786
                                                                              70.517857
      Ghost
                 486.500000
                             64.437500
                                          73.781250
                                                       81.187500
                                                                  79.343750
                                                                              76.468750
      Ground
                 356.281250
                             73.781250
                                                       84.843750
                                          95.750000
                                                                  56.468750
                                                                              62.750000
      Poison
                 251.785714
                             67.250000
                                          74.678571
                                                       68.821429
                                                                  60.428571
                                                                              64.392857
      Ice
                 423.541667
                             72.000000
                                          72.750000
                                                       71.416667
                                                                  77.541667
                                                                              76.291667
      Grass
                 344.871429
                             67.271429
                                                       70.800000
                                                                  77.500000
                                                                              70.428571
                                          73.214286
      Bug
                 334.492754
                             56.884058
                                          70.971014
                                                       70.724638
                                                                  53.869565
                                                                              64.797101
      Rock
                 392.727273
                             65.363636
                                          92.863636
                                                     100.795455
                                                                  63.340909
                                                                              75.477273
      Steel
                 442.851852
                             65.222222
                                          92.703704
                                                     126.370370
                                                                  67.518519
                                                                              80.629630
      Fairy
                 449.529412
                             74.117647
                                          61.529412
                                                       65.705882
                                                                  78.529412
                                                                              84.705882
                      Speed
                             Generation
                                          Legendary
      Type 1
                 102.500000
                               5.500000
                                           0.500000
      Flying
      Electric
                  84.500000
                               3.272727
                                           0.090909
                  83.031250
                               3.875000
                                           0.375000
      Dragon
      Psychic
                  81.491228
                               3.385965
                                           0.245614
      Dark
                               4.032258
                  76.161290
                                           0.064516
      Fire
                  74.442308
                               3.211538
                                           0.096154
      Normal
                 71.551020
                               3.051020
                                           0.020408
      Fighting
                  66.074074
                               3.370370
                                           0.000000
      Water
                  65.964286
                               2.857143
                                           0.035714
      Ghost
                               4.187500
                  64.343750
                                           0.062500
      Ground
                                           0.125000
                  63.906250
                               3.156250
                  63.571429
      Poison
                               2.535714
                                           0.000000
      Ice
                  63.458333
                               3.541667
                                           0.083333
      Grass
                  61.928571
                               3.357143
                                           0.042857
      Bug
                  61.681159
                               3.217391
                                           0.000000
      Rock
                  55.909091
                               3.454545
                                           0.090909
      Steel
                  55.259259
                               3.851852
                                           0.148148
      Fairy
                  48.588235
                               4.117647
                                           0.058824
[52]: df.groupby(['Type 1']).sum()
      df.groupby(['Type 1']).count()
                      Name
                            Type 2
                                      HP
                                          Attack
                                                  Defense
                                                            Sp. Atk Sp. Def
                                                                               Speed \
      Type 1
                  69
                                52
                                      69
                                              69
                                                        69
                                                                 69
                                                                           69
                                                                                  69
      Bug
                        69
                                21
                                              31
                                                                 31
                                                                           31
      Dark
                  31
                        31
                                      31
                                                        31
                                                                                  31
      Dragon
                  32
                        32
                                21
                                      32
                                              32
                                                        32
                                                                 32
                                                                           32
                                                                                  32
      Electric
                  44
                        44
                                17
                                      44
                                              44
                                                        44
                                                                 44
                                                                           44
                                                                                  44
                                 2
                                      17
                                                                 17
                                                                           17
                                                                                  17
      Fairy
                  17
                        17
                                              17
                                                        17
      Fighting
                  27
                                 7
                                      27
                                              27
                                                        27
                                                                 27
                                                                           27
                                                                                  27
                        27
```

[52]:

Fire	52	52	24	52	52	52	52	52	52
Flying	4	4	2	4	4	4	4	4	4
Ghost	32	32	22	32	32	32	32	32	32
Grass	70	70	37	70	70	70	70	70	70
Ground	32	32	19	32	32	32	32	32	32
Ice	24	24	11	24	24	24	24	24	24
Normal	98	98	37	98	98	98	98	98	98
Poison	28	28	13	28	28	28	28	28	28
Psychic	57	57	19	57	57	57	57	57	57
Rock	44	44	35	44	44	44	44	44	44
Steel	27	27	22	27	27	27	27	27	27
Water	112	112	53	112	112	112	112	112	112

Generation	Legendary

Type 1		
Bug	69	69
Dark	31	31
Dragon	32	32
Electric	44	44
Fairy	17	17
Fighting	27	27
Fire	52	52
Flying	4	4
Ghost	32	32
Grass	70	70
Ground	32	32
Ice	24	24
Normal	98	98
Poison	28	28
Psychic	57	57
Rock	44	44
Steel	27	27
Water	112	112

Working with Large Amounts of Data

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