

# pandas\_\_basic

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## 1 Pandas - Basics

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Github: [https://github.com/sandeepreetam/python\\_notebooks/blob/main/Pandas%20Basics.ipynb](https://github.com/sandeepreetam/python_notebooks/blob/main/Pandas%20Basics.ipynb)

```
[40]: import pandas as pd
import warnings

pd.set_option('display.max_rows', 10)
warnings.filterwarnings("ignore")
```

## 2 Creating DataFrame

```
[2]: # Empty Dataframe

df = pd.DataFrame(columns=['Name', 'Grade'])
df
```

```
[2]: Empty DataFrame
Columns: [Name, Grade]
Index: []
```

```
[3]: # List of Lists

lst = [['Name', 'Grade'], ['Sandeep', 'F'], ['Sam', 'A+']]

df = pd.DataFrame(lst[1:], columns=lst[0])
df
```

```
[3]:      Name Grade
0  Sandeep      F
1       Sam    A+
```

```
[4]: # Dictionary
# Keys - Column Names
# Values - List - Row Items
```

```
dic = {
    'Names' : ['Sandeep', 'Sam']
    , 'Grade' : ['F', 'A+']
}

df = pd.DataFrame(dic)
df
```

```
[4]:      Names Grade
0  Sandeep      F
1       Sam     A+
```

```
[5]: # Reading Data
pokemon_url = 'https://gist.githubusercontent.com/armgilles/
↳194bcff35001e7eb53a2a8b441e8b2c6/raw/
↳92200bc0a673d5ce2110aaad4544ed6c4010f687/pokemon.csv'

df = pd.read_csv(pokemon_url)
```

### 3 Exploring DataFrame

```
[6]: # Sample Data
df.tail(5)
df.head(3)
```

```
[6]:      #      Name Type 1  Type 2  Total  HP  Attack  Defense  Sp. Atk  Sp. Def  \
0  1  Bulbasaur  Grass  Poison    318  45    49    49    65    65
1  2   Ivysaur  Grass  Poison    405  60    62    63    80    80
2  3   Venusaur  Grass  Poison    525  80    82    83   100   100

      Speed  Generation  Legendary
0     45           1      False
1     60           1      False
2     80           1      False
```

```
[7]: # Num of Rows and Columns
df.shape
```

```
[7]: (800, 13)
```

```
[8]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 800 entries, 0 to 799
Data columns (total 13 columns):
#   Column      Non-Null Count  Dtype
---

```

```

0   #                800 non-null    int64
1   Name             800 non-null    object
2   Type 1           800 non-null    object
3   Type 2           414 non-null    object
4   Total             800 non-null    int64
5   HP               800 non-null    int64
6   Attack            800 non-null    int64
7   Defense           800 non-null    int64
8   Sp. Atk          800 non-null    int64
9   Sp. Def           800 non-null    int64
10  Speed             800 non-null    int64
11  Generation        800 non-null    int64
12  Legendary         800 non-null    bool
dtypes: bool(1), int64(9), object(3)
memory usage: 75.9+ KB

```

```
[9]: # Stats
df.describe()
```

```
[9]:
```

	#	Total	HP	Attack	Defense	Sp. Atk \
count	800.000000	800.000000	800.000000	800.000000	800.000000	800.000000
mean	362.813750	435.102500	69.258750	79.001250	73.842500	72.820000
std	208.343798	119.963040	25.534669	32.457366	31.183501	32.722294
min	1.000000	180.000000	1.000000	5.000000	5.000000	10.000000
25%	184.750000	330.000000	50.000000	55.000000	50.000000	49.750000
50%	364.500000	450.000000	65.000000	75.000000	70.000000	65.000000
75%	539.250000	515.000000	80.000000	100.000000	90.000000	95.000000
max	721.000000	780.000000	255.000000	190.000000	230.000000	194.000000

	Sp. Def	Speed	Generation
count	800.000000	800.000000	800.000000
mean	71.902500	68.277500	3.323750
std	27.828916	29.060474	1.661290
min	20.000000	5.000000	1.000000
25%	50.000000	45.000000	2.000000
50%	70.000000	65.000000	3.000000
75%	90.000000	90.000000	5.000000
max	230.000000	180.000000	6.000000

```
[10]: # Unique Values
df.nunique()
```

```
[10]: #                721
Name             800
Type 1            18
Type 2            18
Total            200
...
```

```

Sp. Atk      105
Sp. Def      92
Speed       108
Generation    6
Legendary     2
Length: 13, dtype: int64

```

```

[11]: # Null Values
df.isna().sum()

```

```

[11]: #
Name      0
Type 1    0
Type 2    386
Total     0

...
Sp. Atk    0
Sp. Def    0
Speed      0
Generation 0
Legendary  0
Length: 13, dtype: int64

```

## 4 Filtering Data

```

[12]: # Boolean Indexing

df[['Name', 'Type 1']]

df[(df['Type 1'] == 'Grass') & (df['Type 2'] == 'Poison')]

df[(df['Type 1'] == 'Grass') & (df['Type 2'] == 'Poison')][['Name', 'HP']]

```

```

[12]:
      Name  HP
0   Bulbasaur  45
1    Ivysaur  60
2   Venusaur  80
3  VenusaurMega Venusaur  80
48   Oddish  45
..      ...  ...
344  Roselia  50
451   Budew  40
452  Roserade  60
651   Foongus  69
652  Amoonguss 114

```

[15 rows x 2 columns]

```
[13]: # Query

df.query("`Type 1` == 'Fire'")

max_hp = 200

df.query('HP > @max_hp')
```

```
[13]:      #      Name  Type 1 Type 2  Total  HP  Attack  Defense  Sp. Atk  \
121  113  Chansey  Normal    NaN   450  250      5         5      35
261  242  Blissey  Normal    NaN   540  255     10        10      75

      Sp. Def  Speed  Generation  Legendary
121     105     50           1      False
261     135     55           2      False
```

```
[14]: # loc and iloc

df.loc[0:10:3, 'Name': 'Speed']

df.loc[[0,6,9], ['Name', 'Type 1', 'HP', 'Attack', 'Speed']]

df.iloc[0:100:3, 0:10:2]
```

```
[14]:      #  Type 1  Total  Attack  Sp. Atk
0     1   Grass   318     49     65
3     3   Grass   625    100    122
6     6    Fire   534     84    109
9     7   Water   314     48     50
12    9   Water   630    103    135
..    ..    ...    ...    ...
87   80   Water   590     75    130
90   83  Normal   352     65     58
93   86   Water   325     45     45
96   89  Poison   500    105     65
99   92   Ghost   310     35    100
```

[34 rows x 5 columns]

## 5 Sorting

```
[15]: df.sort_index()
df[['Name', 'HP', 'Attack']].sort_values(by = ['HP', 'Attack'], ascending =_
↳ [False, True])
```

```
[15]:      Name    HP  Attack
261  Blissey  255    10
121  Chansey  250     5
217  Wobbuffet 190    33
351  Wailord  170    90
655  Alomomola 165    75
..    ...    ...
487  Mime Jr.   20    25
186   Pichu    20    40
388  Duskull   20    40
55   Diglett   10    55
316  Shedinja   1    90
```

[800 rows x 3 columns]

## 6 Derived Columns

```
[16]: df['Special_Index'] = df['HP'] * df ['Attack']
df
```

```
[16]:      #      Name  Type 1  Type 2  Total  HP  Attack  Defense  \
0      1      Bulbasaur  Grass  Poison   318  45     49     49
1      2      Ivysaur   Grass  Poison   405  60     62     63
2      3      Venusaur  Grass  Poison   525  80     82     83
3      3  VenusaurMega Venusaur  Grass  Poison   625  80    100    123
4      4      Charmander  Fire    NaN   309  39     52     43
..    ...
795  719      Diancie    Rock  Fairy   600  50    100    150
796  719  DiancieMega Diancie    Rock  Fairy   700  50    160    110
797  720  HoopaHoopa Confined  Psychic  Ghost   600  80    110     60
798  720  HoopaHoopa Unbound  Psychic   Dark   680  80    160     60
799  721      Volcanion  Fire   Water   600  80    110    120
```

```
      Sp. Atk  Sp. Def  Speed  Generation  Legendary  Special_Index
0           65       65    45           1      False        2205
1           80       80    60           1      False        3720
2          100      100    80           1      False        6560
3          122      120    80           1      False        8000
4           60       50    65           1      False        2028
..    ...    ...    ...
795        100      150    50           6       True        5000
796        160      110   110           6       True        8000
797        150      130    70           6       True        8800
798        170      130    80           6       True       12800
799        130       90    70           6       True        8800
```

[800 rows x 14 columns]

```
[17]: df.rename(columns = {'Special_Index': 'power_index'})
```

```
[17]:      #      Name  Type 1  Type 2  Total  HP  Attack  Defense  \
0      1      Bulbasaur    Grass  Poison    318  45      49      49
1      2      Ivysaur    Grass  Poison    405  60      62      63
2      3      Venusaur    Grass  Poison    525  80      82      83
3      3  VenusaurMega Venusaur    Grass  Poison    625  80     100     123
4      4      Charmander    Fire     NaN    309  39      52      43
..    ...
795  719      Diancie    Rock   Fairy    600  50     100     150
796  719  DiancieMega Diancie    Rock   Fairy    700  50     160     110
797  720  HoopaHoopa Confined  Psychic  Ghost    600  80     110      60
798  720  HoopaHoopa Unbound  Psychic   Dark    680  80     160      60
799  721      Volcanion    Fire    Water    600  80     110     120
```

```
      Sp. Atk  Sp. Def  Speed  Generation  Legendary  power_index
0           65       65     45           1      False      2205
1           80       80     60           1      False      3720
2          100      100     80           1      False      6560
3          122      120     80           1      False      8000
4           60       50     65           1      False      2028
..      ...
795        100      150     50           6       True      5000
796        160      110    110           6       True      8000
797        150      130     70           6       True      8800
798        170      130     80           6       True     12800
799        130       90     70           6       True      8800
```

[800 rows x 14 columns]

## 7 Aggregations

```
[18]: df.HP.mean()
```

```
[18]: 69.25875
```

```
[19]: df[df.HP == df.HP.min()]
```

```
[19]:      #      Name  Type 1  Type 2  Total  HP  Attack  Defense  Sp. Atk  \
316  292  Shedinja    Bug  Ghost    236   1      90      45      30

      Sp. Def  Speed  Generation  Legendary  Special_Index
316        30     40           3      False           90
```

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

```
[20]:
```

	#	Total	HP	Attack	Defense	Sp. Atk \
count	800.000000	800.00000	800.000000	800.000000	800.000000	800.000000
mean	362.813750	435.10250	69.258750	79.001250	73.842500	72.820000
std	208.343798	119.96304	25.534669	32.457366	31.183501	32.722294
min	1.000000	180.00000	1.000000	5.000000	5.000000	10.000000
25%	184.750000	330.00000	50.000000	55.000000	50.000000	49.750000
50%	364.500000	450.00000	65.000000	75.000000	70.000000	65.000000
75%	539.250000	515.00000	80.000000	100.000000	90.000000	95.000000
max	721.000000	780.00000	255.000000	190.000000	230.000000	194.000000

	Sp. Def	Speed	Generation	Special_Index
count	800.000000	800.000000	800.00000	800.000000
mean	71.902500	68.277500	3.32375	5821.158750
std	27.828916	29.060474	1.66129	3724.069946
min	20.000000	5.000000	1.00000	90.000000
25%	50.000000	45.000000	2.00000	3000.000000
50%	70.000000	65.000000	3.00000	5100.000000
75%	90.000000	90.000000	5.00000	7906.000000
max	230.000000	180.000000	6.00000	24000.000000

```
[21]: df.agg(
{
    'HP': ['min', 'max']
    , 'Attack' : ['mean']
    , 'Defense' : ['median']
})
```

```
[21]:
```

	HP	Attack	Defense
min	1.0	NaN	NaN
max	255.0	NaN	NaN
mean	NaN	79.00125	NaN
median	NaN	NaN	70.0

```
[22]: df.groupby('Type 1').mean()
```

```
[22]:
```

	#	Total	HP	Attack	Defense \
Type 1					
Bug	334.492754	378.927536	56.884058	70.971014	70.724638
Dark	461.354839	445.741935	66.806452	88.387097	70.225806
Dragon	474.375000	550.531250	83.312500	112.125000	86.375000
Electric	363.500000	443.409091	59.795455	69.090909	66.295455
Fairy	449.529412	413.176471	74.117647	61.529412	65.705882
...	...	...	...	...	...
Poison	251.785714	399.142857	67.250000	74.678571	68.821429
Psychic	380.807018	475.947368	70.631579	71.456140	67.684211
Rock	392.727273	453.750000	65.363636	92.863636	100.795455



Steel	442.851852	487.703704	65.222222	92.703704	126.370370
Water	303.089286	430.455357	72.062500	74.151786	72.946429

	Sp. Atk	Sp. Def	Speed	Generation	Legendary \
Type 1					
Bug	53.869565	64.797101	61.681159	3.217391	0.000000
Dark	74.645161	69.516129	76.161290	4.032258	0.064516
Dragon	96.843750	88.843750	83.031250	3.875000	0.375000
Electric	90.022727	73.704545	84.500000	3.272727	0.090909
Fairy	78.529412	84.705882	48.588235	4.117647	0.058824
...	...	...	...	...	...
Poison	60.428571	64.392857	63.571429	2.535714	0.000000
Psychic	98.403509	86.280702	81.491228	3.385965	0.245614
Rock	63.340909	75.477273	55.909091	3.454545	0.090909
Steel	67.518519	80.629630	55.259259	3.851852	0.148148
Water	74.812500	70.517857	65.964286	2.857143	0.035714

	Special_Index
Type 1	
Bug	4370.333333
Dark	6125.709677
Dragon	9925.250000
Electric	4421.659091
Fairy	5089.235294
...	...
Poison	5291.607143
Psychic	5356.421053
Rock	6465.977273
Steel	6263.740741
Water	5663.651786

[18 rows x 11 columns]

```
[23]: df.groupby(['Type 1', 'Type 2'])['HP', 'Attack', 'Defense'].mean()
```

<ipython-input-23-5cd67bc49d54>:1: FutureWarning: Indexing with multiple keys (implicitly converted to a tuple of keys) will be deprecated, use a list instead.

```
df.groupby(['Type 1', 'Type 2'])['HP', 'Attack', 'Defense'].mean()
```

```
[23]:
```

		HP	Attack	Defense
Type 1	Type 2			
Bug	Electric	60.000000	62.000000	55.000000
	Fighting	80.000000	155.000000	95.000000
	Fire	70.000000	72.500000	60.000000
	Flying	63.000000	70.142857	61.571429
	Ghost	1.000000	90.000000	45.000000
...	...	...	...	...

Water	Ice	90.000000	83.333333	113.333333
	Poison	61.666667	68.333333	58.333333
	Psychic	87.000000	73.000000	104.000000
	Rock	70.750000	82.750000	112.750000
	Steel	84.000000	86.000000	88.000000

[136 rows x 3 columns]

```
[24]: df.pivot_table(values = 'HP', index = 'Type 1', columns = 'Type 2', aggfunc=
      ↪ 'max')
```

```
[24]: Type 2      Bug      Dark      Dragon      Electric      Fairy      Fighting      Fire      Flying \
Type 1
Bug          NaN      NaN      NaN          70.0      NaN          80.0      85.0      86.0
Dark          NaN      NaN      92.0          NaN      NaN          65.0      75.0     126.0
Dragon        NaN      NaN      NaN          100.0     75.0          NaN     100.0     105.0
Electric      NaN      NaN      90.0          NaN     67.0          NaN      50.0      90.0
Fairy         NaN      NaN      NaN          NaN      NaN          NaN      NaN      85.0
...
Poison        40.0     103.0      65.0          NaN      NaN          83.0      NaN      85.0
Psychic        NaN      80.0      NaN          NaN     68.0         106.0     100.0     106.0
Rock          75.0     100.0      82.0          NaN     50.0          91.0      NaN      80.0
Steel          NaN      NaN     100.0          NaN     57.0          91.0      NaN      65.0
Water          NaN      95.0      90.0         125.0     100.0          91.0      NaN      95.0

Type 2      Ghost      Grass      Ground      Ice      Normal      Poison      Psychic      Rock      Steel \
Type 1
Bug           1.0      75.0      60.0      NaN      NaN          70.0      NaN      70.0      75.0
Dark          50.0      NaN      NaN      70.0      NaN          NaN          86.0      NaN      65.0
Dragon         NaN      NaN     108.0     125.0      NaN          NaN          80.0      NaN      NaN
Electric       50.0     50.0      NaN      50.0     62.0          NaN          NaN      NaN      70.0
Fairy          NaN      NaN      NaN      NaN      NaN          NaN          NaN      NaN      NaN
...
Poison         NaN      NaN      90.0      NaN      NaN          NaN          NaN      NaN      NaN
Psychic        80.0     100.0      NaN      NaN      NaN          NaN          NaN      NaN      NaN
Rock           NaN      86.0      80.0     123.0      NaN          NaN          70.0      NaN      60.0
Steel          60.0      NaN      75.0      NaN      NaN          NaN         100.0      70.0      NaN
Water         100.0     80.0     111.0     130.0      NaN          80.0          95.0     100.0      84.0

Type 2      Water
Type 1
Bug          40.0
Dark          NaN
Dragon        NaN
Electric      50.0
Fairy         NaN
...
```

```
Poison      50.0
Psychic      NaN
Rock        72.0
Steel        NaN
Water        NaN
```

```
[18 rows x 18 columns]
```

## 8 Combining DataFrames

```
[25]: fire_pokemon = df[df['Type 1'] == 'Fire']
      water_pokemon = df[df['Type 1'] == 'Water']
```

```
[26]: fire_water_pokemon = pd.concat([fire_pokemon, water_pokemon], axis = 0, keys = ['fire', 'water'])
      fire_water_pokemon
```

```
[26]:
```

		#	Name	Type 1	Type 2	Total	HP	Attack	\
fire	4	4	Charmander	Fire	NaN	309	39	52	
	5	5	Charmeleon	Fire	NaN	405	58	64	
	6	6	Charizard	Fire	Flying	534	78	84	
	7	6	CharizardMega Charizard X	Fire	Dragon	634	78	130	
	8	6	CharizardMega Charizard Y	Fire	Flying	634	78	104	
...	...		...	...	...	...			
water	724	656	Froakie	Water	NaN	314	41	56	
	725	657	Frogadier	Water	NaN	405	54	63	
	726	658	Greninja	Water	Dark	530	72	95	
	762	692	Clauncher	Water	NaN	330	50	53	
	763	693	Clawitzer	Water	NaN	500	71	73	

		Defense	Sp. Atk	Sp. Def	Speed	Generation	Legendary	\
fire	4	43	60	50	65	1	False	
	5	58	80	65	80	1	False	
	6	78	109	85	100	1	False	
	7	111	130	85	100	1	False	
	8	78	159	115	100	1	False	
...	...	...	...	...	...	...		
water	724	40	62	44	71	6	False	
	725	52	83	56	97	6	False	
	726	67	103	71	122	6	False	
	762	62	58	63	44	6	False	
	763	88	120	89	59	6	False	

		Special_Index
fire	4	2028
	5	3712

```

        6          6552
        7          10140
        8           8112
...
water 724          2296
      725          3402
      726          6840
      762          2650
      763          5183

```

[164 rows x 14 columns]

```
[27]: hindi_names = pd.DataFrame({'English':['Fire', 'Water'], 'Hindi': ['Agni',
↪ 'Pani']})
hindi_names
```

```
[27]:   English Hindi
0    Fire  Agni
1   Water  Pani
```

```
[28]: pd.merge(fire_water_pokemon, hindi_names, how = 'outer', left_on = 'Type 1',
↪ right_on = 'English')
```

```
[28]:   #           Name Type 1  Type 2  Total  HP  Attack  \
0     4           Charmander   Fire    NaN    309  39     52
1     5           Charmeleon   Fire    NaN    405  58     64
2     6           Charizard   Fire  Flying    534  78     84
3     6  CharizardMega Charizard X   Fire  Dragon    634  78    130
4     6  CharizardMega Charizard Y   Fire  Flying    634  78    104
..  ...
159  656           Froakie   Water    NaN    314  41     56
160  657           Frogadier  Water    NaN    405  54     63
161  658           Greninja  Water   Dark    530  72     95
162  692           Clauncher  Water    NaN    330  50     53
163  693           Clawitzer  Water    NaN    500  71     73

      Defense  Sp. Atk  Sp. Def  Speed  Generation  Legendary  Special_Index  \
0           43      60      50     65           1      False        2028
1           58      80      65     80           1      False        3712
2           78     109      85    100           1      False        6552
3          111     130      85    100           1      False       10140
4           78     159     115    100           1      False        8112
..  ...
159        40      62      44     71           6      False        2296
160        52      83      56     97           6      False        3402
161        67     103      71    122           6      False        6840
162        62      58      63     44           6      False        2650
```

```
163      88      120      89      59      6      False      5183
```

```
      English Hindi
0      Fire  Agni
1      Fire  Agni
2      Fire  Agni
3      Fire  Agni
4      Fire  Agni
..      ...  ...
159    Water  Pani
160    Water  Pani
161    Water  Pani
162    Water  Pani
163    Water  Pani
```

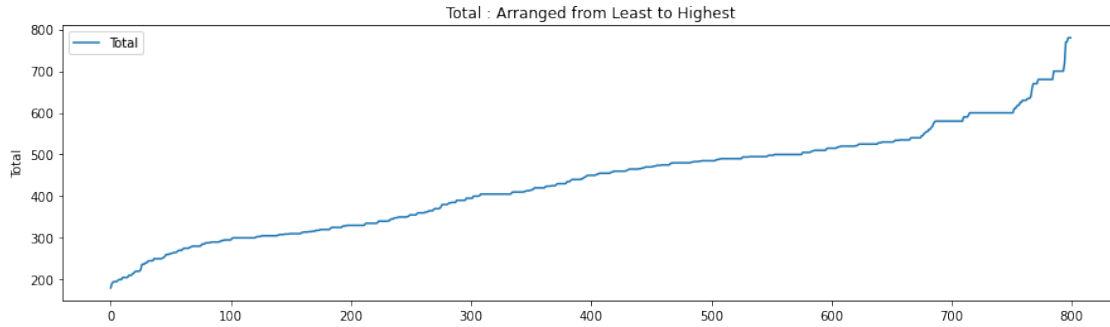
```
[164 rows x 16 columns]
```

## 9 Plotting

1. Line
2. Bar
3. Histogram
4. Pie
5. Scatter
6. Area
7. Box Plot
8. KDE

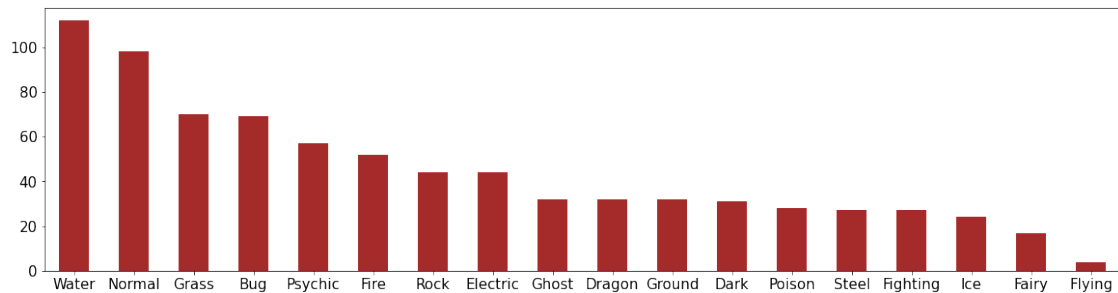
```
[29]: # Line
index_v_total = df.Total.sort_values().reset_index()

index_v_total
index_v_total.plot(
    kind = 'line'
    , y='Total'
    , figsize = (15,4)
    , title = 'Total : Arranged from Least to Highest'
    , ylabel = 'Total'
);
```



```
[30]: # Bar

count_of_pokemon = df['Type 1'].value_counts()
count_of_pokemon.plot(
    kind = 'bar'
    , figsize = (20,5)
    , fontsize = 15
    , rot = 0
    , color = 'brown'
);
```

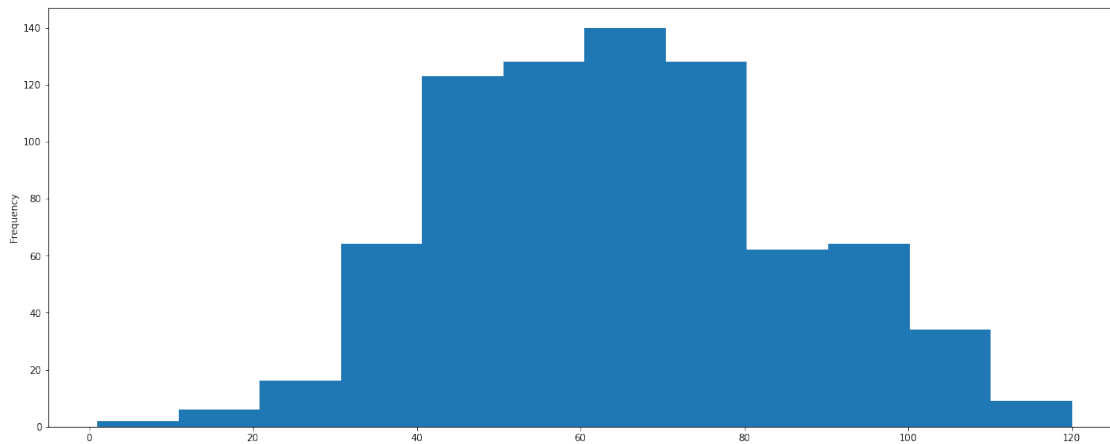


```
[31]: # Histogram

HP_buckets = df[df['HP'].between(0,120)]['HP']

HP_buckets.plot(
    kind = 'hist'
    , figsize = (20,8)
    , bins = 12
)
```

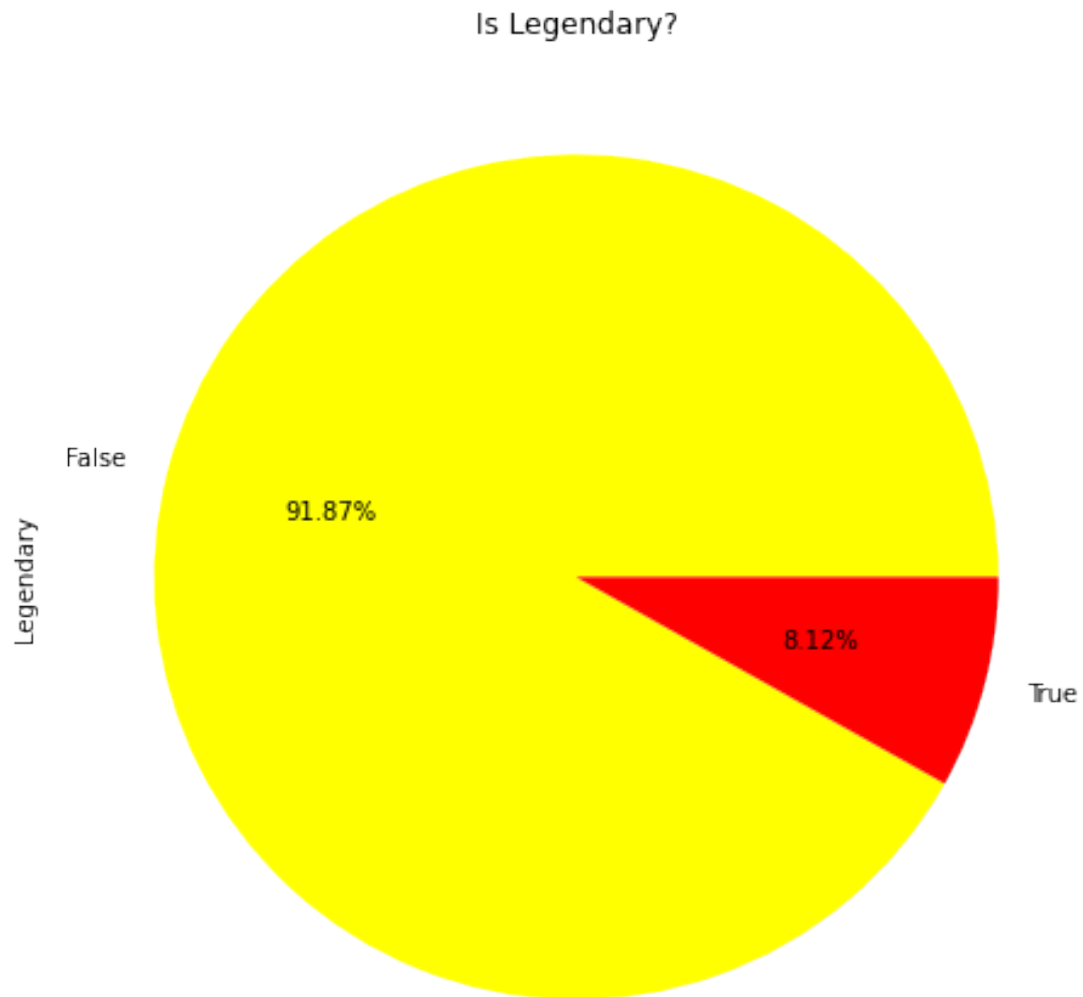
```
[31]: <AxesSubplot:ylabel='Frequency'>
```



```
[32]: # Pie

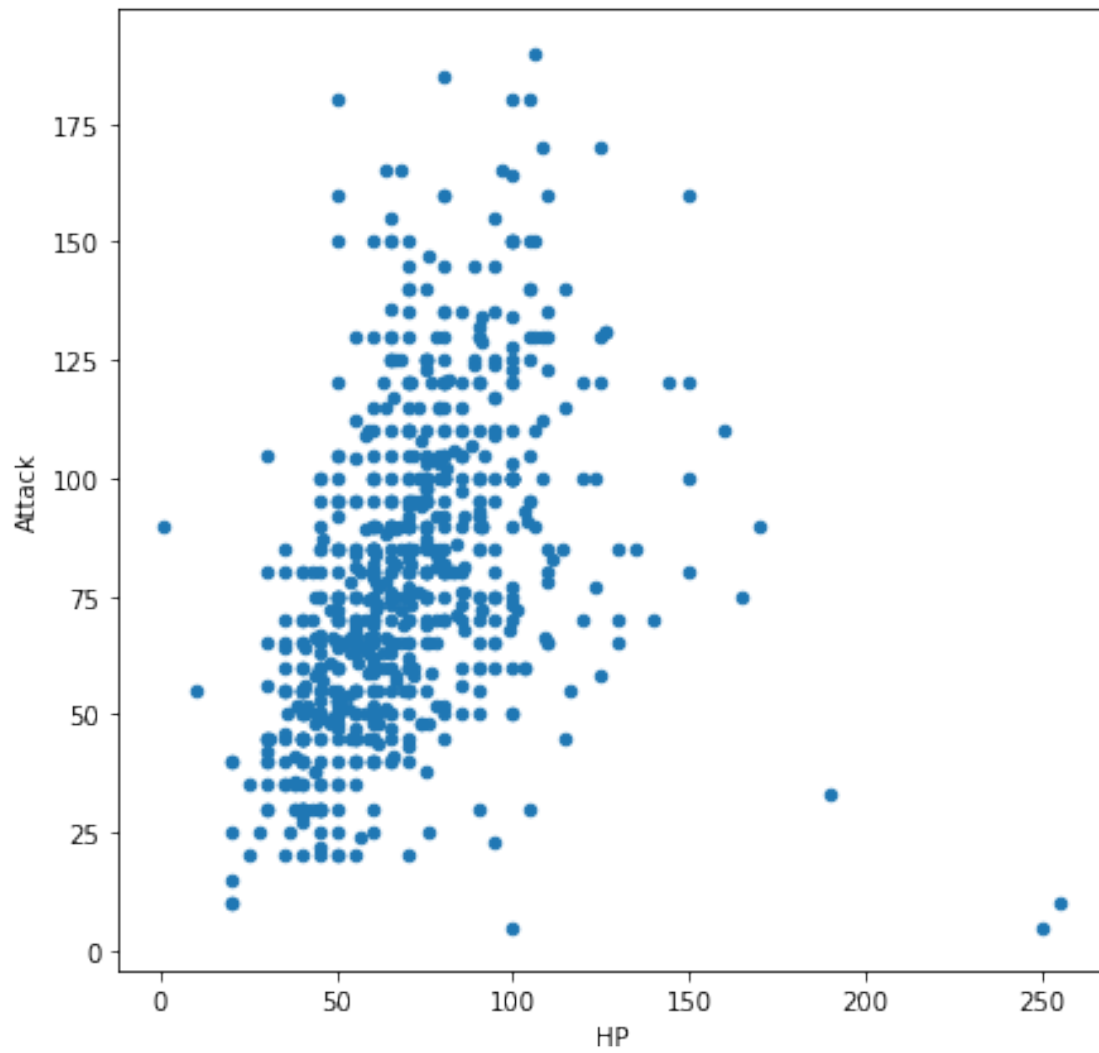
legendary_split = df.Legendary.value_counts()

legendary_split.plot(
    kind = 'pie'
    ,figsize = (8,8)
    ,colors = ['Yellow', 'Red']
    ,autopct = '%0.2f%%'
    ,title = 'Is Legendary?'
);
```

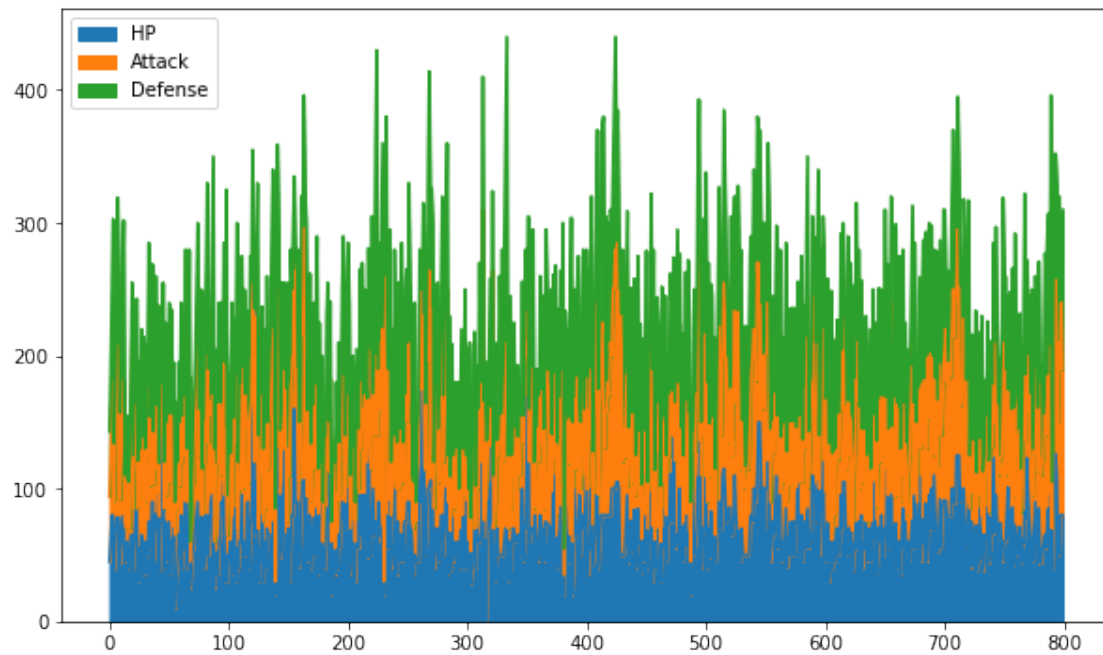


```
[33]: # Scatter  
  
HPvAttack = df[['HP', 'Attack']]  
  
HPvAttack.plot(  
    kind = 'scatter'  
    ,x = 'HP'  
    ,y = 'Attack'  
    ,figsize = (7,7)  
);
```





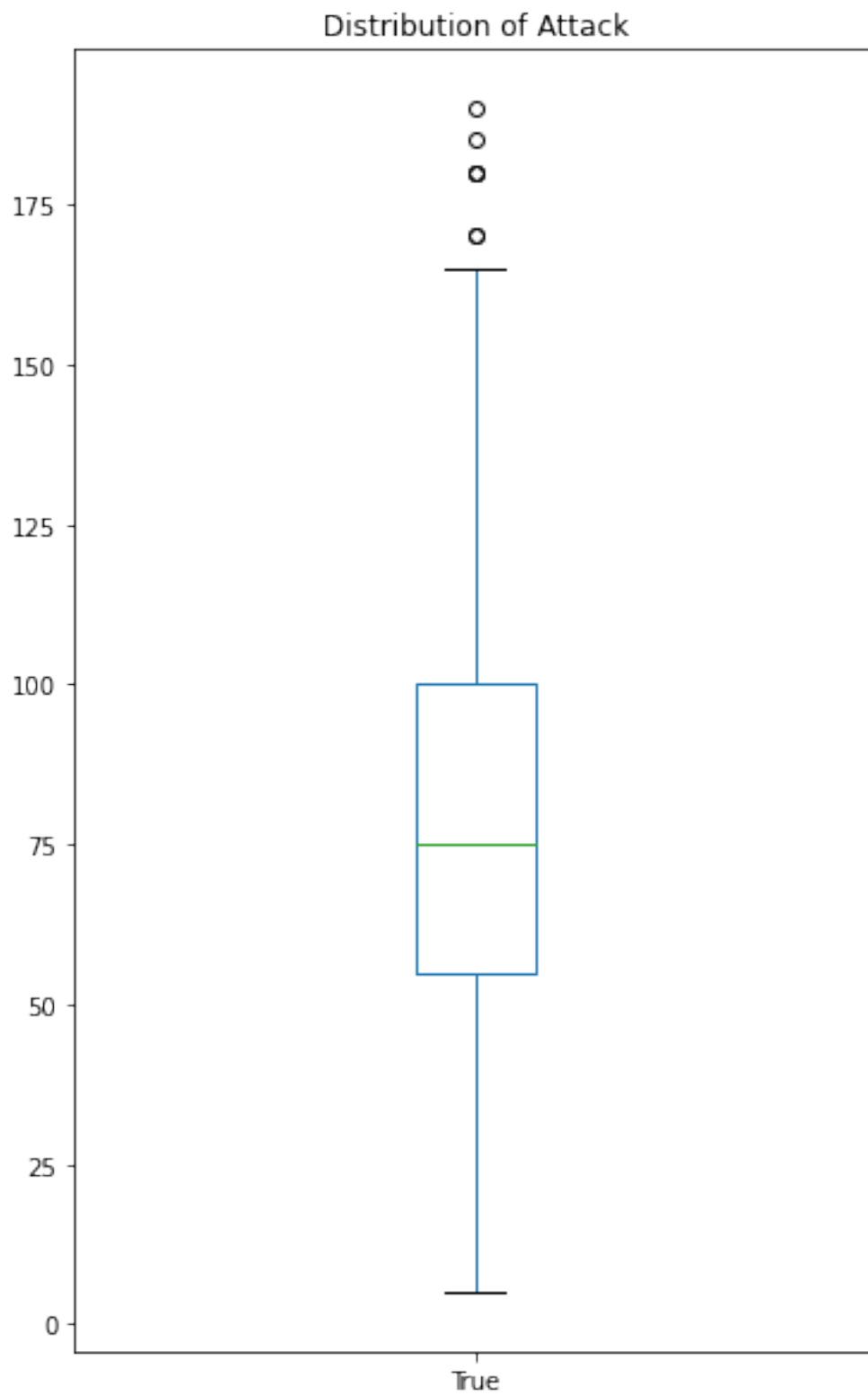
```
[34]: # Area
Stats = df[['HP', 'Attack', 'Defense']]
Stats.plot(
    kind = 'area'
    ,figsize = (10,6)
);
```



```
[35]: # Box

Attack = df.Attack

Attack.plot(
    kind = 'box'
    ,figsize = (6,10)
    ,label = True
    ,title = 'Distribution of Attack'
);
```



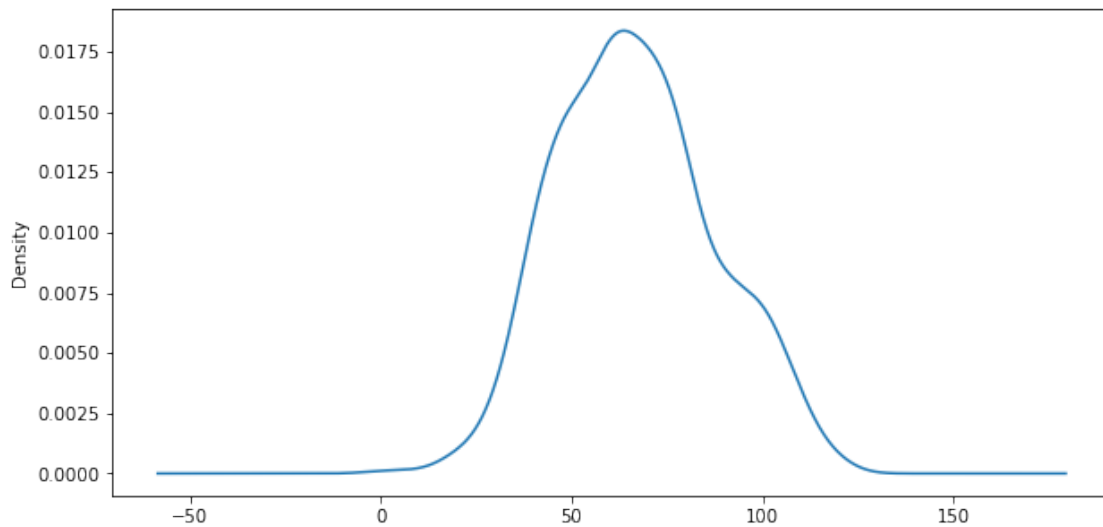
```
[36]: # KDE

HP_buckets = df[df['HP'].between(0,120)]['HP']

HP_buckets.plot(
    kind = 'kde'
    ,figsize = (10,5)
);
```

/Users/sandeep/opt/anaconda3/lib/python3.8/site-packages/scipy/\_\_init\_\_.py:138:  
UserWarning: A NumPy version >=1.16.5 and <1.23.0 is required for this version  
of SciPy (detected version 1.24.3)

warnings.warn(f"A NumPy version >={np\_minversion} and <{np\_maxversion} is  
required for this version of "



## 10 Practice Questions

1. What's the most common type 1 of Legendary Pokémons?
2. How do the base stats of Generation 1 Pokémon compare to those of Generation 2 Pokémon?
3. Which type combination is the most common among non-Legendary Pokémon?
4. Highest HP pokemon for each Type 1?
5. What are the top 10 Pokémon with the highest Special Attack stats, and what types are they associated with?