

```
In [1]: import pandas as pd
```

```
In [2]: pd.__version__
```

```
Out[2]: '2.3.3'
```

```
In [6]: df = pd.read_excel(r"C:\Users\Ravi\Desktop\PANDAS_Learning\data.xlsx")
```

```
In [7]: df
```

```
Out[7]:
```

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.9	High income
1	Afghanistan	AFG	35.253	5.9	Low income
2	Angola	AGO	45.985	19.1	Upper middle income
3	Albania	ALB	12.877	57.2	Upper middle income
4	United Arab Emirates	ARE	11.044	88.0	High income
...
190	Yemen, Rep.	YEM	32.947	20.0	Lower middle income
191	South Africa	ZAF	20.850	46.5	Upper middle income
192	Congo, Dem. Rep.	COD	42.394	2.2	Low income
193	Zambia	ZMB	40.471	15.4	Lower middle income
194	Zimbabwe	ZWE	35.715	18.5	Low income

195 rows × 5 columns

```
In [8]: df.shape #dimension of dataset / rows & columns
```

```
Out[8]: (195, 5)
```

```
In [9]: len(df)
```

```
Out[9]: 195
```

```
In [10]: df.isnull()
```

Out[10]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	False	False	False	False	False
1	False	False	False	False	False
2	False	False	False	False	False
3	False	False	False	False	False
4	False	False	False	False	False
...
190	False	False	False	False	False
191	False	False	False	False	False
192	False	False	False	False	False
193	False	False	False	False	False
194	False	False	False	False	False

195 rows × 5 columns

In [11]: df.isna

```
Out[11]: <bound method DataFrame.isna of
e InternetUsers \
0          Aruba          ABW      10.244      78.9
1    Afghanistan          AFG      35.253       5.9
2          Angola          AGO      45.985      19.1
3        Albania          ALB      12.877      57.2
4  United Arab Emirates          ARE      11.044      88.0
..          ...          ...          ...
190        Yemen, Rep.          YEM      32.947      20.0
191      South Africa          ZAF      20.850      46.5
192    Congo, Dem. Rep.          COD      42.394       2.2
193          Zambia          ZMB      40.471      15.4
194        Zimbabwe          ZWE      35.715      18.5

IncomeGroup
0      High income
1      Low income
2  Upper middle income
3  Upper middle income
4      High income
..          ...
190  Lower middle income
191  Upper middle income
192      Low income
193  Lower middle income
194      Low income

[195 rows x 5 columns]>
```

In [12]: df.isnull().sum()

```
Out[12]: CountryName      0
        CountryCode      0
        BirthRate        0
        InternetUsers     0
        IncomeGroup       0
        dtype: int64
```

```
In [13]: df.isna().sum()
```

```
Out[13]: CountryName      0
        CountryCode      0
        BirthRate        0
        InternetUsers     0
        IncomeGroup       0
        dtype: int64
```

```
In [14]: id(df)
```

```
Out[14]: 2483583017584
```

```
In [16]: df.columns
```

```
Out[16]: Index(['CountryName', 'CountryCode', 'BirthRate', 'InternetUsers',
               'IncomeGroup'],
              dtype='object')
```

```
In [17]: len(df.columns)
```

```
Out[17]: 5
```

```
In [18]: type(df)
```

```
Out[18]: pandas.core.frame.DataFrame
```

```
In [19]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 195 entries, 0 to 194
Data columns (total 5 columns):
#   Column          Non-Null Count  Dtype
---  ---
0   CountryName     195 non-null   object
1   CountryCode     195 non-null   object
2   BirthRate       195 non-null   float64
3   InternetUsers   195 non-null   float64
4   IncomeGroup     195 non-null   object
dtypes: float64(2), object(3)
memory usage: 7.7+ KB
```

```
In [20]: df
```

Out[20]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.9	High income
1	Afghanistan	AFG	35.253	5.9	Low income
2	Angola	AGO	45.985	19.1	Upper middle income
3	Albania	ALB	12.877	57.2	Upper middle income
4	United Arab Emirates	ARE	11.044	88.0	High income
...
190	Yemen, Rep.	YEM	32.947	20.0	Lower middle income
191	South Africa	ZAF	20.850	46.5	Upper middle income
192	Congo, Dem. Rep.	COD	42.394	2.2	Low income
193	Zambia	ZMB	40.471	15.4	Lower middle income
194	Zimbabwe	ZWE	35.715	18.5	Low income

195 rows × 5 columns

In [21]: df.head()

Out[21]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.9	High income
1	Afghanistan	AFG	35.253	5.9	Low income
2	Angola	AGO	45.985	19.1	Upper middle income
3	Albania	ALB	12.877	57.2	Upper middle income
4	United Arab Emirates	ARE	11.044	88.0	High income

In [25]: df.tail()

Out[25]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
190	Yemen, Rep.	YEM	32.947	20.0	Lower middle income
191	South Africa	ZAF	20.850	46.5	Upper middle income
192	Congo, Dem. Rep.	COD	42.394	2.2	Low income
193	Zambia	ZMB	40.471	15.4	Lower middle income
194	Zimbabwe	ZWE	35.715	18.5	Low income

In [26]: `df.head(1)`

Out[26]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.9	High income

In [27]: `df`

Out[27]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.9	High income
1	Afghanistan	AFG	35.253	5.9	Low income
2	Angola	AGO	45.985	19.1	Upper middle income
3	Albania	ALB	12.877	57.2	Upper middle income
4	United Arab Emirates	ARE	11.044	88.0	High income
...
190	Yemen, Rep.	YEM	32.947	20.0	Lower middle income
191	South Africa	ZAF	20.850	46.5	Upper middle income
192	Congo, Dem. Rep.	COD	42.394	2.2	Low income
193	Zambia	ZMB	40.471	15.4	Lower middle income
194	Zimbabwe	ZWE	35.715	18.5	Low income

195 rows × 5 columns

In [28]: `df.columns`

Out[28]: Index(['CountryName', 'CountryCode', 'BirthRate', 'InternetUsers', 'IncomeGroup'], dtype='object')

In [31]: `df['CountryName']`

```
Out[31]: 0          Aruba
1      Afghanistan
2          Angola
3          Albania
4      United Arab Emirates
...
190      Yemen, Rep.
191      South Africa
192      Congo, Dem. Rep.
193          Zambia
194          Zimbabwe
Name: CountryName, Length: 195, dtype: object
```

```
In [32]: df[['CountryName']]
```

```
Out[32]:
```

	CountryName
0	Aruba
1	Afghanistan
2	Angola
3	Albania
4	United Arab Emirates
...	...
190	Yemen, Rep.
191	South Africa
192	Congo, Dem. Rep.
193	Zambia
194	Zimbabwe

195 rows × 1 columns

```
In [33]: df.columns
```

```
Out[33]: Index(['CountryName', 'CountryCode', 'BirthRate', 'InternetUsers',
               'IncomeGroup'],
              dtype='object')
```

```
In [34]: df['CountryName', 'BirthRate']
```

```

-----
KeyError                                Traceback (most recent call last)
File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3812,
in Index.get_loc(self, key)
    3811 try:
-> 3812     return self._engine.get_loc(casted_key)
    3813 except KeyError as err:

File pandas/_libs/index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()

File pandas/_libs/index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()

File pandas/_libs/hashtable_class_helper.pxi:7088, in pandas._libs.hashtable.PyOb
jectHashTable.get_item()

File pandas/_libs/hashtable_class_helper.pxi:7096, in pandas._libs.hashtable.PyOb
jectHashTable.get_item()

KeyError: ('CountryName', 'BirthRate')

The above exception was the direct cause of the following exception:

KeyError                                Traceback (most recent call last)
Cell In[34], line 1
----> 1 df[ , ]

File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\frame.py:4113, in Dat
aFrame.__getitem__(self, key)
    4111 if self.columns.nlevels > 1:
    4112     return self._getitem_multilevel(key)
-> 4113 indexer = self.columns.get_loc(key)
    4114 if is_integer(indexer):
    4115     indexer = [indexer]

File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3819,
in Index.get_loc(self, key)
    3814 if isinstance(casted_key, slice) or (
    3815     isinstance(casted_key, abc.Iterable)
    3816     and any(isinstance(x, slice) for x in casted_key)
    3817 ):
    3818     raise InvalidIndexError(key)
-> 3819     raise KeyError(key) from err
    3820 except TypeError:
    3821     # If we have a listlike key, _check_indexing_error will raise
    3822     # InvalidIndexError. Otherwise we fall through and re-raise
    3823     # the TypeError.
    3824     self._check_indexing_error(key)

KeyError: ('CountryName', 'BirthRate')

```

```
In [35]: df[['CountryName', 'BirthRate']]
```

Out[35]:

	CountryName	BirthRate
0	Aruba	10.244
1	Afghanistan	35.253
2	Angola	45.985
3	Albania	12.877
4	United Arab Emirates	11.044
...
190	Yemen, Rep.	32.947
191	South Africa	20.850
192	Congo, Dem. Rep.	42.394
193	Zambia	40.471
194	Zimbabwe	35.715

195 rows × 2 columns

In [36]: `df.columns`

Out[36]: Index(['CountryName', 'CountryCode', 'BirthRate', 'InternetUsers', 'IncomeGroup'], dtype='object')

In [37]: `df_cat = df[['CountryName', 'CountryCode', 'IncomeGroup']]`
`df_cat`

Out[37]:

	CountryName	CountryCode	IncomeGroup
0	Aruba	ABW	High income
1	Afghanistan	AFG	Low income
2	Angola	AGO	Upper middle income
3	Albania	ALB	Upper middle income
4	United Arab Emirates	ARE	High income
...
190	Yemen, Rep.	YEM	Lower middle income
191	South Africa	ZAF	Upper middle income
192	Congo, Dem. Rep.	COD	Low income
193	Zambia	ZMB	Lower middle income
194	Zimbabwe	ZWE	Low income

195 rows × 3 columns

In []:


```
In [38]: df_num= df[['BirthRate', 'InternetUsers']]
df_num
```

```
Out[38]:
```

	BirthRate	InternetUsers
0	10.244	78.9
1	35.253	5.9
2	45.985	19.1
3	12.877	57.2
4	11.044	88.0
...
190	32.947	20.0
191	20.850	46.5
192	42.394	2.2
193	40.471	15.4
194	35.715	18.5

195 rows × 2 columns

```
In [39]: print(df.shape)
print(df_num.shape)
print(df_cat.shape)
```

```
(195, 5)
(195, 2)
(195, 3)
```

```
In [40]: print(df.columns)
print('####')
print(df_num.columns)
print('####')
print(df_cat.columns)
```

```
Index(['CountryName', 'CountryCode', 'BirthRate', 'InternetUsers',
      'IncomeGroup'],
      dtype='object')
####
Index(['BirthRate', 'InternetUsers'], dtype='object')
####
Index(['CountryName', 'CountryCode', 'IncomeGroup'], dtype='object')
```

```
In [41]: df.describe()
```

Out[41]:

	BirthRate	InternetUsers
count	195.000000	195.000000
mean	21.469928	42.076471
std	10.605467	29.030788
min	7.900000	0.900000
25%	12.120500	14.520000
50%	19.680000	41.000000
75%	29.759500	66.225000
max	49.661000	96.546800

In [42]: `df_cat.describe()`

Out[42]:

	CountryName	CountryCode	IncomeGroup
count	195	195	195
unique	195	195	4
top	Aruba	ABW	High income
freq	1	1	67

In [43]: `df_num.describe()`

Out[43]:

	BirthRate	InternetUsers
count	195.000000	195.000000
mean	21.469928	42.076471
std	10.605467	29.030788
min	7.900000	0.900000
25%	12.120500	14.520000
50%	19.680000	41.000000
75%	29.759500	66.225000
max	49.661000	96.546800

indexing & slicing in pandas

In [44]: `df`

Out[44]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.9	High income
1	Afghanistan	AFG	35.253	5.9	Low income
2	Angola	AGO	45.985	19.1	Upper middle income
3	Albania	ALB	12.877	57.2	Upper middle income
4	United Arab Emirates	ARE	11.044	88.0	High income
...
190	Yemen, Rep.	YEM	32.947	20.0	Lower middle income
191	South Africa	ZAF	20.850	46.5	Upper middle income
192	Congo, Dem. Rep.	COD	42.394	2.2	Low income
193	Zambia	ZMB	40.471	15.4	Lower middle income
194	Zimbabwe	ZWE	35.715	18.5	Low income

195 rows × 5 columns

In [45]: `df[:]`

Out[45]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.9	High income
1	Afghanistan	AFG	35.253	5.9	Low income
2	Angola	AGO	45.985	19.1	Upper middle income
3	Albania	ALB	12.877	57.2	Upper middle income
4	United Arab Emirates	ARE	11.044	88.0	High income
...
190	Yemen, Rep.	YEM	32.947	20.0	Lower middle income
191	South Africa	ZAF	20.850	46.5	Upper middle income
192	Congo, Dem. Rep.	COD	42.394	2.2	Low income
193	Zambia	ZMB	40.471	15.4	Lower middle income
194	Zimbabwe	ZWE	35.715	18.5	Low income

195 rows × 5 columns

In [46]: df[:7]

Out[46]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.9	High income
1	Afghanistan	AFG	35.253	5.9	Low income
2	Angola	AGO	45.985	19.1	Upper middle income
3	Albania	ALB	12.877	57.2	Upper middle income
4	United Arab Emirates	ARE	11.044	88.0	High income
5	Argentina	ARG	17.716	59.9	High income
6	Armenia	ARM	13.308	41.9	Lower middle income

In [47]: df[2:10:2]

Out[47]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
2	Angola	AGO	45.985	19.1	Upper middle income
4	United Arab Emirates	ARE	11.044	88.0	High income
6	Armenia	ARM	13.308	41.9	Lower middle income
8	Australia	AUS	13.200	83.0	High income

In [48]: `df[0:150:10]`

Out[48]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
0	Aruba	ABW	10.244	78.900000	High income
10	Azerbaijan	AZE	18.300	58.700000	Upper middle income
20	Belarus	BLR	12.500	54.170000	Upper middle income
30	Canada	CAN	10.900	85.800000	High income
40	Costa Rica	CRI	15.022	45.960000	Upper middle income
50	Ecuador	ECU	21.070	40.353684	Upper middle income
60	Gabon	GAB	30.555	9.200000	Upper middle income
70	Greenland	GRL	14.500	65.800000	High income
80	India	IND	20.291	15.100000	Lower middle income
90	Kazakhstan	KAZ	22.730	54.000000	Upper middle income
100	Libya	LBY	21.425	16.500000	Upper middle income
110	Moldova	MDA	12.141	45.000000	Lower middle income
120	Mozambique	MOZ	39.705	5.400000	Low income
130	Netherlands	NLD	10.200	93.956400	High income
140	Poland	POL	9.600	62.849200	High income

In [49]: `df[:, :-1]`

Out[49]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
194	Zimbabwe	ZWE	35.715	18.5	Low income
193	Zambia	ZMB	40.471	15.4	Lower middle income
192	Congo, Dem. Rep.	COD	42.394	2.2	Low income
191	South Africa	ZAF	20.850	46.5	Upper middle income
190	Yemen, Rep.	YEM	32.947	20.0	Lower middle income
...
4	United Arab Emirates	ARE	11.044	88.0	High income
3	Albania	ALB	12.877	57.2	Upper middle income
2	Angola	AGO	45.985	19.1	Upper middle income
1	Afghanistan	AFG	35.253	5.9	Low income
0	Aruba	ABW	10.244	78.9	High income

195 rows × 5 columns

In [50]: `df[::10]`

Out[50]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
194	Zimbabwe	ZWE	35.715	18.5000	Low income
184	Venezuela, RB	VEN	19.842	54.9000	High income
174	Trinidad and Tobago	TTO	14.590	63.8000	High income
164	Swaziland	SWZ	30.093	24.7000	Lower middle income
154	Sierra Leone	SLE	36.729	1.7000	Low income
144	French Polynesia	PYF	16.393	56.8000	High income
134	Oman	OMN	20.419	66.4500	High income
124	Malaysia	MYS	16.805	66.9700	Upper middle income
114	Macedonia, FYR	MKD	11.222	65.2400	Upper middle income
104	Lesotho	LSO	28.738	5.0000	Lower middle income
94	Kiribati	KIR	29.044	11.5000	Lower middle income
84	Iceland	ISL	13.400	96.5468	High income
74	Hong Kong SAR, China	HKG	7.900	74.2000	High income
64	Guinea	GIN	37.337	1.6000	Low income
54	Estonia	EST	10.300	79.4000	High income
44	Czech Republic	CZE	10.200	74.1104	High income
34	Cote d'Ivoire	CIV	37.320	8.4000	Lower middle income
24	Brazil	BRA	14.931	51.0400	Upper middle income
14	Burkina Faso	BFA	40.551	9.1000	Low income
4	United Arab Emirates	ARE	11.044	88.0000	High income

In [51]: df[4]

```

-----
KeyError                                Traceback (most recent call last)
File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3812,
in Index.get_loc(self, key)
    3811 try:
-> 3812     return self._engine.get_loc(casted_key)
    3813 except KeyError as err:

File pandas\_libs\index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()

File pandas\_libs\index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()

File pandas\_libs\hashtable_class_helper.pxi:7088, in pandas._libs.hashtable.PyOb
jectHashTable.get_item()

File pandas\_libs\hashtable_class_helper.pxi:7096, in pandas._libs.hashtable.PyOb
jectHashTable.get_item()

KeyError: 4

The above exception was the direct cause of the following exception:

KeyError                                Traceback (most recent call last)
Cell In[51], line 1
----> 1 df[4]

File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\frame.py:4113, in Dat
aFrame.__getitem__(self, key)
    4111 if self.columns.nlevels > 1:
    4112     return self._getitem_multilevel(key)
-> 4113 indexer = self.columns.get_loc(key)
    4114 if is_integer(indexer):
    4115     indexer = [indexer]

File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3819,
in Index.get_loc(self, key)
    3814 if isinstance(casted_key, slice) or (
    3815     isinstance(casted_key, abc.Iterable)
    3816     and any(isinstance(x, slice) for x in casted_key)
    3817 ):
    3818     raise InvalidIndexError(key)
-> 3819     raise KeyError(key) from err
    3820 except TypeError:
    3821     # If we have a listlike key, _check_indexing_error will raise
    3822     # InvalidIndexError. Otherwise we fall through and re-raise
    3823     # the TypeError.
    3824     self._check_indexing_error(key)

KeyError: 4

```

```
In [53]: df[4:10]
```


Out[53]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
4	United Arab Emirates	ARE	11.044	88.0000	High income
5	Argentina	ARG	17.716	59.9000	High income
6	Armenia	ARM	13.308	41.9000	Lower middle income
7	Antigua and Barbuda	ATG	16.447	63.4000	High income
8	Australia	AUS	13.200	83.0000	High income
9	Austria	AUT	9.400	80.6188	High income

In [54]:

df[4,2]

```

-----
KeyError                                Traceback (most recent call last)
File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3812,
in Index.get_loc(self, key)
    3811 try:
-> 3812     return self._engine.get_loc(casted_key)
    3813 except KeyError as err:

File pandas/_libs/index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()

File pandas/_libs/index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()

File pandas/_libs/hashtable_class_helper.pxi:7088, in pandas._libs.hashtable.PyOb
jectHashTable.get_item()

File pandas/_libs/hashtable_class_helper.pxi:7096, in pandas._libs.hashtable.PyOb
jectHashTable.get_item()

KeyError: (4, 2)

The above exception was the direct cause of the following exception:

KeyError                                Traceback (most recent call last)
Cell In[54], line 1
----> 1 df[4,2]

File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\frame.py:4113, in Dat
aFrame.__getitem__(self, key)
    4111 if self.columns.nlevels > 1:
    4112     return self._getitem_multilevel(key)
-> 4113 indexer = self.columns.get_loc(key)
    4114 if is_integer(indexer):
    4115     indexer = [indexer]

File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3819,
in Index.get_loc(self, key)
    3814 if isinstance(casted_key, slice) or (
    3815     isinstance(casted_key, abc.Iterable)
    3816     and any(isinstance(x, slice) for x in casted_key)
    3817 ):
    3818     raise InvalidIndexError(key)
-> 3819     raise KeyError(key) from err
    3820 except TypeError:
    3821     # If we have a listlike key, _check_indexing_error will raise
    3822     # InvalidIndexError. Otherwise we fall through and re-raise
    3823     # the TypeError.
    3824     self._check_indexing_error(key)

KeyError: (4, 2)

```

```
In [55]: df[4:8]
```

Out[55]:

	CountryName	CountryCode	BirthRate	InternetUsers	IncomeGroup
4	United Arab Emirates	ARE	11.044	88.0	High income
5	Argentina	ARG	17.716	59.9	High income
6	Armenia	ARM	13.308	41.9	Lower middle income
7	Antigua and Barbuda	ATG	16.447	63.4	High income

In []:

In []:

In []:

In []:

In []:

In []:

In []:

In []: