

```
In [3]: import pandas as pd
import numpy as np
```

```
In [4]: df = pd.DataFrame({'A':[1,2,np.nan], 'B':[5,np.nan,np.nan], 'C':[1,2,3]})
df['States'] = "CA NV AZ".split()
df.set_index('States',inplace=True)
df
```

```
Out[4]:
```

	A	B	C
States			
CA	1.0	5.0	1
NV	2.0	NaN	2
AZ	NaN	NaN	3

- We can fill the null values with something else as shown below
- `fillna(value=".....")` is used to fill the null values in the dataframe

```
In [7]: print("\n Filling values with a default value\n", '-'*35, sep='')
print(df.fillna(value="FILL VALUE"))
```

```
 Filling values with a default value
-----
              A              B  C
States
CA              1.0              5.0  1
NV              2.0  FILL VALUE  2
AZ  FILL VALUE  FILL VALUE  3
```

```
In [10]: print("\nFilling the values with computed values\n", '-'*40, sep='')
print(df.fillna(value=df['A'].mean()))
```

```
Filling the values with computed values
-----
              A              B  C
States
CA              1.0              5.0  1
NV              2.0              1.5  2
AZ              1.5              1.5  3
```

```
In [12]: data = {'Company':["GOOG", "GOOG", "MSFT", "MSFT", "FB", "FB"],
                 'Person':["Sam", "Charlie", "Amy", "Vanessa", "Carl", "Sarah"],
                 'Sales': [200, 120, 340, 124, 243, 350]}
df = pd.DataFrame(data)
df
```

```
Out[12]:
```

	Company	Person	Sales
0	GOOG	Sam	200
1	GOOG	Charlie	120
2	MSFT	Amy	340
3	MSFT	Vanessa	124
4	FB	Carl	243
5	FB	Sarah	350

- `groupby('condition')` is nothing but grouping the values based on some condition

```
In [14]: byComp = df.groupby('Company')
print("Gropuping by company name and listing mean sales\n", '-'*55, sep='')
print(byComp.mean())
```

```
Gropuping by company name and listing mean sales
-----
```

	Sales
Company	
FB	296.5
GOOG	160.0
MSFT	232.0

```
In [15]: df.groupby('Company').mean()
```

```
Out[15]:
```

	Sales
Company	
FB	296.5
GOOG	160.0
MSFT	232.0

```
In [17]: print("\nAll in one line of command (Stats for 'FB')\n", '-'*65, sep='')
print(pd.DataFrame(df.groupby('Company').describe().loc['FB']).transpose())
```

```
All in one line of command (Stats for 'FB')
-----
      Sales
count  mean      std   min    25%    50%    75%    max
FB    2.0  296.5  75.660426  243.0  269.75  296.5  323.25  350.0
```

```
In [22]: df1=df.groupby('Company').describe()
df1
```

```
Out[22]:
```

		Sales							
		count	mean	std	min	25%	50%	75%	max
Company									
	FB	2.0	296.5	75.660426	243.0	269.75	296.5	323.25	350.0
	GOOG	2.0	160.0	56.568542	120.0	140.00	160.0	180.00	200.0
	MSFT	2.0	232.0	152.735065	124.0	178.00	232.0	286.00	340.0

```
In [29]: df1.iloc[1:3,1:3]
```

```
Out[29]:
```

		Sales	
		mean	std
Company			
	GOOG	160.0	56.568542
	MSFT	232.0	152.735065

```
In [30]: print(df.groupby('Company').describe().loc[['GOOG', 'MSFT']])
```

		Sales							
		count	mean	std	min	25%	50%	75%	max
Company									
	GOOG	2.0	160.0	56.568542	120.0	140.0	160.0	180.0	200.0
	MSFT	2.0	232.0	152.735065	124.0	178.0	232.0	286.0	340.0

```
In [31]: #Merging two dataframes
#Creating a dataframe
df2 = pd.DataFrame({'A':['A0','A1','A2','A3'],
                    'B':['B0','B1','B2','B3'],
                    'C':['C0','C1','C2','C3'],
                    'D':['D0','D1','D2','D3']
                    },index=[0,1,2,3])
```

```
In [32]: df2
```

Out[32]:

	A	B	C	D
0	A0	B0	C0	D0
1	A1	B1	C1	D1
2	A2	B2	C2	D2
3	A3	B3	C3	D3

In [35]:

In [36]: df3

Out[36]:

	A	B	C	D
4	A4	B4	C4	D4
5	A5	B5	C5	D5
6	A6	B6	C6	D6
7	A7	B7	C7	D7

In [37]:

```
df4 = pd.DataFrame({'A':['A8','A9','A10','A11'],
                    'B':['B8','B9','B10','B11'],
                    'C':['C8','C9','C10','C11'],
                    'D':['D8','D9','D10','D11']},
                    index=[8,9,10,11])
```

In [38]: df4

Out[38]:

	A	B	C	D
8	A8	B8	C8	D8
9	A9	B9	C9	D9
10	A10	B10	C10	D10
11	A11	B11	C11	D11

In [40]:

```
#concatenation ----> Vertically
df_cat1= pd.concat([df2,df3,df4],axis=0)
print("\nAfter Concatenation along row\n",'-'*30,sep='')
print(df_cat1)
df_cat1.loc[2]
```

After Concatenation along row

	A	B	C	D
0	A0	B0	C0	D0
1	A1	B1	C1	D1
2	A2	B2	C2	D2
3	A3	B3	C3	D3
4	A4	B4	C4	D4
5	A5	B5	C5	D5
6	A6	B6	C6	D6
7	A7	B7	C7	D7
8	A8	B8	C8	D8
9	A9	B9	C9	D9
10	A10	B10	C10	D10
11	A11	B11	C11	D11

Out[40]:

```
A    A2
B    B2
C    C2
D    D2
Name: 2, dtype: object
```

In [42]:

```
#concatenating row wise

df6 = pd.DataFrame({'A':['A0','A1','A2','A3'],
                    'B':['B0','B1','B2','B3'],
```

```
        'C':['C0','C1','C2','C3'],
        'D':['D0','D1','D2','D3']
    },index=[0,1,2,3])
```

```
In [43]: df7= pd.DataFrame({'A':['A4','A5','A6','A7'],
        'B':['B4','B5','B6','B7'],
        'C':['C4','C5','C6','C7'],
        'D':['D4','D5','D6','D7']},
        index=[0,1,2,3])
```

```
In [44]: df8 = pd.DataFrame({'A':['A8','A9','A10','A11'],
        'B':['B8','B9','B10','B11'],
        'C':['C8','C9','C10','C11'],
        'D':['D8','D9','D10','D11']},
        index=[0,1,2,3])
```

```
In [45]: df_cat2 = pd.concat([df6,df7,df8],axis=1)
```

```
In [46]: df_cat2
```

```
Out[46]:
```

	A	B	C	D	A	B	C	D	A	B	C	D
0	A0	B0	C0	D0	A4	B4	C4	D4	A8	B8	C8	D8
1	A1	B1	C1	D1	A5	B5	C5	D5	A9	B9	C9	D9
2	A2	B2	C2	D2	A6	B6	C6	D6	A10	B10	C10	D10
3	A3	B3	C3	D3	A7	B7	C7	D7	A11	B11	C11	D11

```
In [60]: #merge by a common key
left = pd.DataFrame({'Key':['k0','k1','k2','k3'],
        'A':['A0','A1','A2','A3'],
        'B':['B0','B1','B2','B3']})
right = pd.DataFrame({'Key':['k0','k1','k2','k3'],
        'C':['C0','C1','C2','C3'],
        'D':['D0','D1','D2','D3']})
```

```
In [61]: left
```

```
Out[61]:
```

	Key	A	B
0	k0	A0	B0
1	k1	A1	B1
2	k2	A2	B2
3	k3	A3	B3

```
In [62]: rightmerg2 = pd.merge()
```

```
Out[62]:
```

	Key	C	D
0	k0	C0	D0
1	k1	C1	D1
2	k2	C2	D2
3	k3	C3	D3

```
In [63]: #how is that that tellls how we are merging
merge1 = pd.merge(left,right,how = 'inner', on='Key')
merge1
```

```
Out[63]:
```

	Key	A	B	C	D
0	k0	A0	B0	C0	D0
1	k1	A1	B1	C1	D1
2	k2	A2	B2	C2	D2
3	k3	A3	B3	C3	D3

```
In [69]: merge2 = pd.merge(left,right,how='left',on = 'key')
```

```
In [70]: merge2
```

```
Out[70]:
```

	Key	A	B	C	D
0	k0	A0	B0	C0	D0
1	k1	A1	B1	C1	D1
2	k2	A2	B2	C2	D2
3	k3	A3	B3	C3	D3

```
In [109]: df1 = pd.DataFrame({'key1':['k0','k8','k2','k3'],  
                             'A':['A0','A1','A2','A3'],  
                             'B':['B0','B1','B2','B3']})  
df2 = pd.DataFrame({'key2':['k0','k1','k2','k3'],  
                    'C':['C0','C1','C2','C3'],  
                    'D':['D0','D1','D2','D3']})
```

```
In [110]: pd.merge(df1,df2,how='inner',left_on='key1',right_on='key2')  
#This will match the left table on key1 and right table on key2 and then which ever keys are common will return 1
```

```
Out[110]:
```

	key1	A	B	key2	C	D
0	k0	A0	B0	k0	C0	D0
1	k2	A2	B2	k2	C2	D2
2	k3	A3	B3	k3	C3	D3

```
In [111]: #If you want ot merge on multiple keys then we put on and mention the keys in the list  
# if you want all data from left table then we mention how as left
```

```
In [112]: df3 = pd.DataFrame({'key1':['k0','k8','k2','k3'],  
                             'A':['A0','A1','A2','A3'],  
                             'C':['A0','A1','A2','A3'],  
                             'B':['B0','B1','B2','B3']})  
df4 = pd.DataFrame({'key2':['k0','k1','k2','k3'],  
                    'C':['C0','C1','C2','C3'],  
                    'D':['D0','D1','D2','D3']})
```

```
In [113]: pd.merge(df3,df4,how='inner',left_on='key1',right_on='key2')  
#When we have two columns with same name in different dataframes then when we merge then column on left table is  
#shown as ColumnName_x and column on right table is shown as ColumnName_y
```

```
Out[113]:
```

	key1	A	C_x	B	key2	C_y	D
0	k0	A0	A0	B0	k0	C0	D0
1	k2	A2	A2	B2	k2	C2	D2
2	k3	A3	A3	B3	k3	C3	D3

```
In [116]: #If we try to merge two tables based on left then if the right table doesnt have the key present in left then  
# apart from the key the values of right table is NaN in merging table  
# you can event slect multiple keys for the merge operation  
merge1= pd.merge(df1,df2,how='outer',on= [['key1','key2']])
```

```
-----  
KeyError                                Traceback (most recent call last)  
~/tmp/ipykernel_546029/2237716902.py in <module>  
      2 # apart from the key the values of right table is NaN in merging table  
      3 # you can event slect multiple keys for the merge operation  
>>> 4 merge1= pd.merge(df1,df2,how='inner',on= [['key1','key2']])  
  
~/local/lib/python3.8/site-packages/pandas/core/reshape/merge.py in merge(left, right, how, on, left_on, right_on, left_index, right_index, sort, suffixes, copy, indicator, validate)  
    105     validate: str | None = None,  
    106 ) -> DataFrame:
```

```

--> 107         op = _MergeOperation(
      108             left,
      109             right,

~/local/lib/python3.8/site-packages/pandas/core/reshape/merge.py in __init__(self, left, right, how, on, left_on
, right_on, axis, left_index, right_index, sort, suffixes, copy, indicator, validate)
      698             self.right_join_keys,
      699             self.join_names,
--> 700         ) = self._get_merge_keys()
      701
      702         # validate the merge keys dtypes. We may need to coerce

~/local/lib/python3.8/site-packages/pandas/core/reshape/merge.py in _get_merge_keys(self)
      1090         if not is_rkey(rk):
      1091             if rk is not None:
-> 1092                 right_keys.append(right._get_label_or_level_values(rk))
      1093             else:
      1094                 # work-around for merge_asof(right_index=True)

~/local/lib/python3.8/site-packages/pandas/core/generic.py in _get_label_or_level_values(self, key, axis)
      1777         values = self.axes[axis].get_level_values(key)._values
      1778     else:
-> 1779         raise KeyError(key)
      1780
      1781         # Check for duplicates

KeyError: ['key1', 'key2']

```

Join Operations

- Join is almost similar to merge operation

```

In [85]: left = pd.DataFrame({'A': ['A0', 'A1', 'A2'],
      107         'B': ['B0', 'B1', 'B2']},
      108         index=['k0', 'k1', 'k2'])
      109
      110 right = pd.DataFrame({'C': ['C0', 'C2', 'C3'],
      111         'D': ['D0', 'D2', 'D3']},
      112         index=['k0', 'k2', 'k3'])

```

```

In [86]: left

```

```

Out[86]:
   A  B
k0 A0 B0
k1 A1 B1
k2 A2 B2

```

```

In [87]: right

```

```

Out[87]:
   C  D
k0 C0 D0
k2 C2 D2
k3 C3 D3

```

```

In [97]: left.join(right)

```

```

Out[97]:
   A  B  C  D
k0 A0 B0 C0 D0
k1 A1 B1 NaN NaN
k2 A2 B2 C2 D2

```

Task

In [107...

```
df1 = pd.DataFrame({"k1" : ["A", "B", "C"]})
df2 = pd.DataFrame({"k2" : ["B", "C", "D"]})
df3 = pd.DataFrame({"k3" : ["A", "B", "D"]})

df4 = pd.concat([df1,df2,df3],axis=1)
print(df4)
print("\n")

#df default is axis 0
df5 = pd.concat([df1,df2,df3])
print(df5)
```

	k1	k2	k3
0	A	B	A
1	B	C	B
2	C	D	D

	k1	k2	k3
0	A	NaN	NaN
1	B	NaN	NaN
2	C	NaN	NaN
0	NaN	B	NaN
1	NaN	C	NaN
2	NaN	D	NaN
0	NaN	NaN	A
1	NaN	NaN	B
2	NaN	NaN	D

In [117...

```
df = pd.DataFrame({'col1': [1,2,3,4,5,6,7,8,9,10],
                    'col2' : [444,555,666,444,333,222,666,777,666,555],
                    'col3': 'aaa bb c dd eee fff gg h iii j'.split()})
df
```

Out[117...

	col1	col2	col3
0	1	444	aaa
1	2	555	bb
2	3	666	c
3	4	444	dd
4	5	333	eee
5	6	222	fff
6	7	666	gg
7	8	777	h
8	9	666	iii
9	10	555	j

In [118...

```
# How do we manipulate one single column and store it back
df['col10'] = df['col1']*10
df
```

Out[118...

	col1	col2	col3	col10
0	1	444	aaa	10
1	2	555	bb	20
2	3	666	c	30
3	4	444	dd	40
4	5	333	eee	50
5	6	222	fff	60
6	7	666	gg	70
7	8	777	h	80
8	9	666	iii	90
9	10	555	j	100

In [119...

In [120...

In []:

In [122...

In []:

In []:

In []:

In []:

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