```
In [1]: import numpy as np
        import pandas as pd
In [2]: dict1={'Names':['Ramesh','Suresh',np.nan,'Mahesh'],
               'Age':[31,32,33,np.nan],
               'City':[np.nan,'Hyd','Mumbai','Chennai']}
In [4]: data1=pd.DataFrame(dict1)
In [5]: data1.isnull()
Out[5]:
            Names
                    Age
                         City
         0
             False False
                         True
         1
             False False False
         2
              True False False
         3
             False
                   True False
In [6]: data1.isnull().sum()
        # every column has one missing value is there
Out[6]: Names
                  1
        Age
                  1
                  1
        City
        dtype: int64
In [7]: data1.isnull().sum()/len(data1)
Out[7]: Names
                  0.25
                  0.25
        Age
                  0.25
        City
        dtype: float64
In [8]: |data1.isnull().sum()*100/len(data1)
Out[8]: Names
                  25.0
        Age
                  25.0
        City
                  25.0
        dtype: float64
```

```
In [10]: dict2={'Names':['Ramesh','Suresh',None,'Mahesh'],
                 'Age':[31,32,33,None],
                'City':[None, 'Hyd', 'Mumbai', 'Chennai']}
          data2=pd.DataFrame(dict2)
          data2
Out[10]:
                             City
              Names
                     Age
          0 Ramesh
                     31.0
                            None
              Suresh
                     32.0
                             Hyd
           2
               None
                     33.0 Mumbai
           3 Mahesh NaN Chennai
In [11]: data2.isnull()
Out[11]:
             Names
                     Age
                           City
          0
              False False
                          True
           1
              False False False
           2
               True False False
           3
              False
                     True False
In [12]: data2.isnull().sum()
Out[12]: Names
                   1
          Age
                   1
          City
                   1
          dtype: int64
In [13]: dict3={'Names':['Ramesh','Suresh','Null','Mahesh'],
                'Age':[31,32,33,'Null'],
                'City':['Null','Hyd','Mumbai','Chennai']}
          data3=pd.DataFrame(dict3)
          data3
Out[13]:
```

	Names	Age	City
0	Ramesh	31	Null
1	Suresh	32	Hyd
2	Null	33	Mumbai
3	Mahesh	Null	Chennai

Method-1

Fill the missing values with random number

dataframe name= data1

method name:fillna

```
In [14]: data1.fillna(40)
```

Out[14]:

```
        Names
        Age
        City

        0
        Ramesh
        31.0
        40

        1
        Suresh
        32.0
        Hyd

        2
        40
        33.0
        Mumbai

        3
        Mahesh
        40.0
        Chennai
```

Method-2

Fill the missing values with random number on specific column

dataframe name= data1

method name:fillna

```
In [19]: data1['Names'].fillna('Sathish',inplace=True)
  data1
```

Out[19]:

```
NamesAgeCity0Ramesh31.0NaN1Suresh32.0Hyd2Sathish33.0Mumbai3MaheshNaNChennai
```

Method-3

- bfill
- ffill
- pad
- backfill

```
In [21]: data1.fillna(method='backfill')
# Names index 2 has missed value
# it will replace by index 3 value
#Age index 3 has missed value
# we dont have index 4, so the value is NaN
# City index 0 has missed value
# it replace with index 1 value
```

Out[21]:

	Names	Age	City
0	Ramesh	31.0	Hyd
1	Suresh	32.0	Hyd
2	Mahesh	33.0	Mumbai
3	Mahesh	NaN	Chennai

In [22]: data1

Out[22]:

	Names	Age	City
0	Ramesh	31.0	NaN
1	Suresh	32.0	Hyd
2	NaN	33.0	Mumbai
3	Mahesh	NaN	Chennai

- · bfill and backfill both are same
- · pad and ffill both are same

Method-4

- Mean
- Median
- Mode

In [23]: data1

Out[23]:

	Names	Age	City
0	Ramesh	31.0	NaN
1	Suresh	32.0	Hyd
2	NaN	33.0	Mumbai
3	Mahesh	NaN	Chennai

```
In [24]: age_mean=data1['Age'].mean()
age_mean
```

Out[24]: 32.0

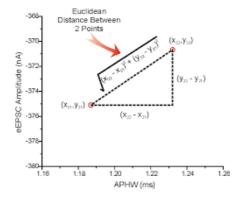
```
In [25]: data1['Age'].fillna(age_mean)
Out[25]: 0
               31.0
         1
               32.0
         2
               33.0
         3
               32.0
         Name: Age, dtype: float64
In [27]:
         # instead of providing a random number
         # we are filling with mean of the data
         age_median=data1['Age'].median()
         age median
         data1['Age'].fillna(age_median)
Out[27]: 0
               31.0
         1
               32.0
         2
               33.0
         3
               32.0
         Name: Age, dtype: float64
 In [ ]: # Level1: Mean median mode
         # Level2: bfill fill
         # Level3:
```

Method-5:KNN imputer

KNN: K nearest neighbours

- in the KNN imputer instead of taking mean of all the values
- · will choose neigbours data
- · will take those mean only

KNN Imputer



```
In [ ]: n_neighbors is parameter can choose by user
   if we dont choose by default it will takes as =5
```

```
In [31]:
         from sklearn.impute import KNNImputer
         knn=KNNImputer(n_neighbors=2)
         knn.fit_transform(data1[['Age']])
Out[31]: array([[31.],
                 [32.],
                 [33.],
                 [32.]])
         data1
```

In [33]:

Out[33]:

	Names	Age	City
0	Ramesh	31.0	NaN
1	Suresh	32.0	Hyd
2	NaN	33.0	Mumbai
3	Mahesh	NaN	Chennai

Method-6

- · Based on other columns
- Some times all above methods will not provide good justification
- at that time we need to check other columns dependancy also
- Most of the time will pick a column which have highest correlation

In	[]:	1
In	[]:	
In	[]:	
In]]:	
In	[]:	