PANDAS

Exploratory Data Analysis

Modify or Clean(delete) decisive for classification

Calling necessary Libraries

```
In [2]: 1 import pandas as pd
2 import numpy as np
3 import warnings
In [3]: 1 warnings.filterwarnings('ignore')
```

Dataframe declaration

```
In [4]: 1 df=pd.read_csv('./Titanic.csv')
```

| In [4]: | 1 | df.head() |
|---------|---|-----------|
|---------|---|-----------|

| Out[4]: | Passeng | jerld | Survived | Pclass | Name | Sex | Age | SibSp | Parch | Ticket | Fare | Cabin | Embarked |
|---------|---------|-------|----------|--------|---|--------|------|-------|-------|---------------------|---------|-------|----------|
| _ | 0 | 1 | 0 | 3 | Braund, Mr. Owen Harris | male | 22.0 | 1 | 0 | A/5 21171 | 7.2500 | NaN | S |
| | 1 | 2 | 1 | 1 | Cumings, Mrs. John Bradley (Florence Briggs Th | female | 38.0 | 1 | 0 | PC 17599 | 71.2833 | C85 | С |
| | 2 | 3 | 1 | 3 | Heikkinen, Miss. Laina | female | 26.0 | 0 | 0 | STON/O2. 3101282 | 7.9250 | NaN | S |
| | 3 | 4 | 1 | 1 | Futrelle, Mrs. Jacques Heath (Lily May Peel) | female | 35.0 | 1 | 0 | 113803 | 53.1000 | C123 | S |
| | 4 | 5 | 0 | 3 | Allen, Mr. William Henry | male | 35.0 | 0 | 0 | 373450 | 8.0500 | NaN | S |

^{*.}reset_index() whenever a tabular form(including groupby) also drop=True

Value Counts

| In []:[| 1 | df.sort_values(by='column_name', ascending=False, inplace=True) | | | | | | | | | | | |
|----------|-----|---|----------|--------|---|------|------|-------|-------|-------------|---------|-------|----------|
| In [7]: | 1 | df.nlargest(5,'Age') | | | | | | | | | | | |
| Out[7]: | | Passengerld | Survived | Pclass | Name | Sex | Age | SibSp | Parch | Ticket | Fare | Cabin | Embarked |
| | 630 | 631 | 1 | 1 | Barkworth, Mr. Algernon Henry Wilson | male | 80.0 | 0 | 0 | 27042 | 30.0000 | A23 | S |
| | 851 | 852 | 0 | 3 | Svensson, Mr. Johan | male | 74.0 | 0 | 0 | 347060 | 7.7750 | NaN | S |
| | 96 | 97 | 0 | 1 | Goldschmidt, Mr. George B | male | 71.0 | 0 | 0 | PC 17754 | 34.6542 | A5 | С |
| | 493 | 494 | 0 | 1 | Artagaveytia, Mr. Ramon | male | 71.0 | 0 | 0 | PC 17609 | 49.5042 | NaN | С |
| | 116 | 117 | 0 | 3 | Connors, Mr. Patrick | male | 70.5 | 0 | 0 | 370369 | 7.7500 | NaN | Q |

directly use for plot

♡Cross Tab

```
1 pd.crosstab(df.Sport, df.Event,margins=True) # mixed value counts
In [ ]:
                                                        # Sport inwhich less no of events
         2
         1 ഒരു SINGLE ഐറ്റം എത്ര തവണ repeat ആയി എന്ന് find ചെയ്യാൻ
In [ ]:
         2 രണ്ട് കോളത്തില് ഒരേ ഐറ്റം വന്നാൽ എണ്ണിയെടുക്കാൻ
           Southampton nnu Pclass ലേക്ക് എത്ര പേര് ക്യറി
         5
         1 CT1=pd.crosstab(index=df.Team, columns=df.Year, values=df.Gold, aggfunc='sum')
In [ ]:
         1 CT1.loc['china'] # index ippo countries aayi
In [ ]:
In [ ]:
         1 easy way to crosstab
         2 Countries without female
         3 Gender_Count=pd.crosstab(df.Sex,df.NOC)
           Gender_Count.unstack()
                       # o/p NOC Sex
                          # AFG Fem 5
         7
                                  Male 121
                             AHD Fem 12
         9
                          #
                                  Male 121
                       again unstack
        10
        11 GCUU=Gender_Count.unstack().unstack()
        12 GCUU.[Gender Count.Female==0]
        13
```

Progressive Report of Medals by Contry



```
In [ ]: 1 df.where(df.column

In [ ]: 1 isin ഉണ്ടോ ഇലൂയോ എന്ന് embarked =['S','C']
```

df. # Suggestion

```
In [12]:
           1 df.Age
Out[12]: 0
                22.0
                38.0
                26.0
          2
                35.0
          3
                35.0
         4
                 ...
         886
                27.0
                19.0
         887
         888
                 NaN
         889
                26.0
         890
                32.0
         Name: Age, Length: 891, dtype: float64
```

CREATION OF NEW COLUMN

```
In [13]:
             df['Age'] # when Groupby outside
                        # Spaces between Phrases
                        # New Column Create if no quotes
           3
Out[13]: 0
                22.0
                 38.0
          2
                 26.0
                35.0
          3
                 35.0
                 . . .
         886
                 27.0
         887
                19.0
         888
                 NaN
         889
                 26.0
         890
                 32.0
         Name: Age, Length: 891, dtype: float64
           1 df['recent']=[1 if yr_renovated<=10 else 0 for i in df.yr_renov] # for medal in df.Medal
 In [ ]:
           1 df['House age']=[2021-i for i in df['yr built']]
 In [ ]:
 In [ ]:
             df[['Age', 'Sex']].nunique() # return ie o/p Age=98 Sex -2
                                          # axis to count unique values in either columns or rows
           3
                  unique lists non null value counts
 In [ ]:
           1 df['Rank']=df.Fare.rank()
```

```
1 df.Fare.value_counts()
In [5]:
Out[5]: 8.0500
                   43
        13.0000
                   42
        7.8958
                   38
        7.7500
                    34
        26.0000
                   31
        35.0000
                    1
        28.5000
                    1
        6.2375
                    1
        14.0000
                    1
        10.5167
                    1
        Name: Fare, Length: 248, dtype: int64
```

Data Cleaning

correction => True

```
1 df.isna().sum()
In [6]:
Out[6]: PassengerId
                         0
        Survived
        Pclass
        Name
        Sex
                       177
        Age
        SibSp
        Parch
        Ticket
        Fare
        Cabin
                       687
        Embarked
        dtype: int64
          1 df.Fare.sum()
In [1]:
                                                   Traceback (most recent call last)
        ~\AppData\Local\Temp\ipykernel 5016\3344774125.py in <module>
        ---> 1 df.Fare.sum()
        NameError: name 'df' is not defined
          1 df['Country'].duplicated.sum() # we will get idea abt indvidual value counts as well but in a different w
In [ ]:
In [ ]:
          1 df.fare.pct change() # esp financiall data - Numerical
          1 df['Age', 'Fare'].cumsum() # limited application - additive on daily basis eq Profit
In [ ]:
          1 df.describe()
In [ ]:
          1 df.sample()
In [ ]:
```

df.head loading time

Age column and Cabin column has nullvalue

```
1 df.isna().mean()*100 #20% above then drop
In [7]:
Out[7]:
        PassengerId
                         0.000000
        Survived
                        0.000000
        Pclass
                        0.000000
                        0.000000
        Name
        Sex
                        0.000000
                       19.865320
        Age
        SibSp
                        0.000000
        Parch
                        0.000000
                        0.000000
        Ticket
        Fare
                        0.000000
        Cabin
                       77.104377
        Embarked
                         0.224467
        dtype: float64
```

Age has no less than 20percent null value and cabin has more than twenty percent nullvalue- removing the "Cabin"

df.drop(columns='Cabin', inplace=True) # repetetive

```
In [8]:
          1 | df.Age.value counts() # displays NaN also
Out[8]: 24.00
                30
        22.00
                27
        18.00
                26
        19.00
                25
        28.00
                25
                 . .
        36.50
                 1
        55.50
                 1
        0.92
                 1
        23.50
                 1
        74.00
                 1
        Name: Age, Length: 88, dtype: int64
          1 df.Age.unique()
In [9]:
Out[9]: array([22. , 38. , 26. , 35. , nan, 54. , 2. , 27. , 14. ,
               4. , 58. , 20. , 39. , 55. , 31. , 34. , 15. , 28. ,
               8. , 19. , 40. , 66. , 42. , 21. , 18. , 3. , 7. ,
               49. , 29. , 65. , 28.5 , 5. , 11. , 45. , 17. , 32. ,
               16. , 25. , 0.83, 30. , 33. , 23. , 24. , 46. , 59. ,
               71. , 37. , 47. , 14.5 , 70.5 , 32.5 , 12. , 9. , 36.5 ,
              51. , 55.5 , 40.5 , 44. , 1. , 61. , 56. , 50. , 36. ,
              45.5, 20.5, 62., 41., 52., 63., 23.5, 0.92, 43.,
               60. , 10. , 64. , 13. , 48. , 0.75, 53. , 57. , 80. ,
              70. , 24.5 , 6. , 0.67, 30.5 , 0.42, 34.5 , 74. ])
          1 df.Age.nunique() # how to count values in multiple DataFrame using nunique
In [10]:
Out[10]: 88
```

localhost:8888/notebooks/PythonSB/oPANDAS DATA ANALYSIS.ipynb

```
In [9]: 1 df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 891 entries, 0 to 890
Data columns (total 11 columns):
                  Non-Null Count Dtype
     Column
     PassengerId 891 non-null
 0
                                  int64
                  891 non-null
 1
     Survived
                                  int64
                  891 non-null
 2
     Pclass
                                  int64
 3
                  891 non-null
                                  object
     Name
 4
     Sex
                  891 non-null
                                  object
                                  float64
 5
                  714 non-null
     Age
     SibSp
                  891 non-null
                                  int64
 7
                  891 non-null
                                  int64
     Parch
 8
                  891 non-null
                                  object
     Ticket
 9
     Fare
                  891 non-null
                                  float64
                  889 non-null
                                  object
 10
     Embarked
dtypes: float64(2), int64(5), object(4)
memory usage: 76.7+ KB
```

Removed the Cabin

In [10]: 1 df.drop(columns=['Name','Ticket', 'PassengerId', 'SibSp', 'Parch'])

Out[10]:

| | Survived | Pclass | Sex | Age | Fare | Embarked |
|-----|----------|--------|--------|------|---------|----------|
| 0 | 0 | 3 | male | 22.0 | 7.2500 | S |
| 1 | 1 | 1 | female | 38.0 | 71.2833 | С |
| 2 | 1 | 3 | female | 26.0 | 7.9250 | S |
| 3 | 1 | 1 | female | 35.0 | 53.1000 | S |
| 4 | 0 | 3 | male | 35.0 | 8.0500 | S |
| | | | | | | |
| 886 | 0 | 2 | male | 27.0 | 13.0000 | S |
| 887 | 1 | 1 | female | 19.0 | 30.0000 | S |
| 888 | 0 | 3 | female | NaN | 23.4500 | S |
| 889 | 1 | 1 | male | 26.0 | 30.0000 | С |
| 890 | 0 | 3 | male | 32.0 | 7.7500 | Q |

891 rows × 6 columns

In [11]:

1 df.Age.fillna(df.Age.median(),inplace=True) # replaced with median

```
In [7]:
         1 df.fillna({'Pclass':3,'Embarked':'S'},inplace=True)
                                                  Traceback (most recent call last)
        AttributeError
        ~\AppData\Local\Temp\ipykernel 5924\2103977946.py in <module>
        ---> 1 df.filna({'Temperature'})
        ~\anaconda3\lib\site-packages\pandas\core\generic.py in getattr (self, name)
                        ):
           5900
           5901
                            return self[name]
        -> 5902
                        return object.__getattribute__(self, name)
           5903
                    def setattr (self, name: str, value) -> None:
           5904
        AttributeError: 'DataFrame' object has no attribute 'filna'
```

date temperature windSpeed status

Backward fill (row)

7]: data.fillna(method="bfill")

7]:

| | date | temperature | windSpeed | status |
|---|------------|-------------|-----------|--------|
| 0 | 2020-05-06 | 35.6582 | 10.788378 | sunny |
| 1 | 2020-05-07 | 30.9343 | 6.889682 | rainy |
| 2 | 2020-05-08 | 30.9343 | 6.889682 | rainy |
| 3 | 2020-05-09 | 13.9082 | 6.889682 | cloudy |
| 4 | 2020-05-10 | 13.9082 | 19.012990 | rainy |
| 5 | 2020-05-11 | 23.9382 | NaN | sunnv |

Forward fill (column)

In [8]: data.fillna(method="ffill", axis="columns")

Out[8]:

| | date | temperature | windSpeed | status |
|---|------------|---------------------|---------------------|---------------------|
| 0 | 2020-05-06 | 35.6582 | 10.788378 | sunny |
| 1 | 2020-05-07 | 2020-05-07 00:00:00 | 2020-05-07 00:00:00 | 2020-05-07 00:00:00 |
| 2 | 2020-05-08 | 30.9343 | 30.9343 | rainy |
| 3 | 2020-05-09 | 2020-05-09 00:00:00 | 6.889682 | cloudy |
| 4 | 2020-05-10 | 13.9082 | 19.01299 | rainy |
| 5 | 2020-05-11 | 23.9382 | 23.9382 | sunny |

Backward fill (column)

In [9]: data.fillna(method="bfill", axis="columns")

Out[9]:

| status | windSpeed | temperature | date | |
|--------|-----------|-------------|------------|---|
| sunny | 10.788378 | 35.6582 | 2020-05-06 | 0 |
| NaT | NaT | NaT | 2020-05-07 | 1 |
| rainy | rainy | 30.9343 | 2020-05-08 | 2 |
| cloudy | 6.889682 | 6.889682 | 2020-05-09 | 3 |
| rainy | 19.01299 | 13.9082 | 2020-05-10 | 4 |
| sunny | sunny | 23.9382 | 2020-05-11 | 5 |

Emmining the forward/backward im

We can limit the number of rows or columns getting filled.

0]: data.fillna(method="ffill", limit=1)

0]:

| | date | temperature | windSpeed | status |
|---|------------|-------------|-----------|--------|
| 0 | 2020-05-06 | 35.6582 | 10.788378 | sunny |
| 1 | 2020-05-07 | 35.6582 | 10.788378 | sunny |
| 2 | 2020-05-08 | 30.9343 | NaN | rainy |
| 3 | 2020-05-09 | 30.9343 | 6.889682 | cloudy |
| 4 | 2020-05-10 | 13.9082 | 19.012990 | rainy |
| 5 | 2020-05-11 | 23.9382 | 19.012990 | sunny |

Filling with Pandas objects

There are many Pandas objects like df.sum(), df.max(), etc. we can fill the missing values with these too.

1]: data.fillna(data.mean())

1]:

| | date | temperature | windSpeed | status |
|---|------------|-------------|-----------|--------|
| 0 | 2020-05-06 | 35.658200 | 10.788378 | sunny |
| 1 | 2020-05-07 | 26.109725 | 12.230350 | NaN |
| 2 | 2020-05-08 | 30.934300 | 12.230350 | rainy |
| 3 | 2020-05-09 | 26.109725 | 6.889682 | cloudy |
| 4 | 2020-05-10 | 13.908200 | 19.012990 | rainy |
| 5 | 2020-05-11 | 23.938200 | 12.230350 | sunny |

limiting the fillna

only one NaN (not as a row but in individual column or rows, no consecutive NaN filling)

Interpolate missing value

In short, interpolation is a process of determining the unknown values that lie in between the known data points. We can interpolate missing values based on different methods. This is done by an object in DataFrame as interpolate(). By default, interpolate() does linear interpolation.

Linear interpolate

Linear interpolation involves estimating a new value by connecting two adjacent known values with a straight line.

Time interpolate

time-weighted interpolation only works on Series or DataFrames with a DatetimeIndex

```
data.interpolate(method='time')
```

Other methods

```
In [12]:
           1 df.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 891 entries, 0 to 890
         Data columns (total 11 columns):
                            Non-Null Count Dtype
               Column
                           891 non-null
          0
               PassengerId
                                            int64
                                            int64
          1
               Survived
                            891 non-null
           2
               Pclass
                            891 non-null
                                            int64
                                            object
                            891 non-null
               Name
           4
                            891 non-null
                                            object
               Sex
           5
                            891 non-null
                                            float64
               Age
                            891 non-null
               SibSp
                                            int64
          7
               Parch
                            891 non-null
                                            int64
           8
              Ticket
                            891 non-null
                                            object
          9
               Fare
                            891 non-null
                                            float64
                                            object
           10
              Embarked
                            889 non-null
         dtypes: float64(2), int64(5), object(4)
         memory usage: 76.7+ KB
 In [ ]:
           1
 In [ ]:
           1 New Column Creation or transform
         Value Counts
In [49]:
           1 | df['Survived'].value counts(normalize=True) #parameters YT
Out[49]: 0
               0.616162
              0.383838
         Name: Survived, dtype: float64
In [11]:
           1 df.Age.value counts().max() # Most occurring item in it
                                          # Top number of players
Out[11]: 30
```

```
In []: 1

df.dropduplicates(inplace=True) Check for matching rows

In [6]: 1 df.duplicated().sum()

Out[6]: 0

In [16]: 1 df['Embarked'].duplicated().sum()

Out[16]: 887

In [50]: 1 # Proportion
```

boolean MASK

"groupby"

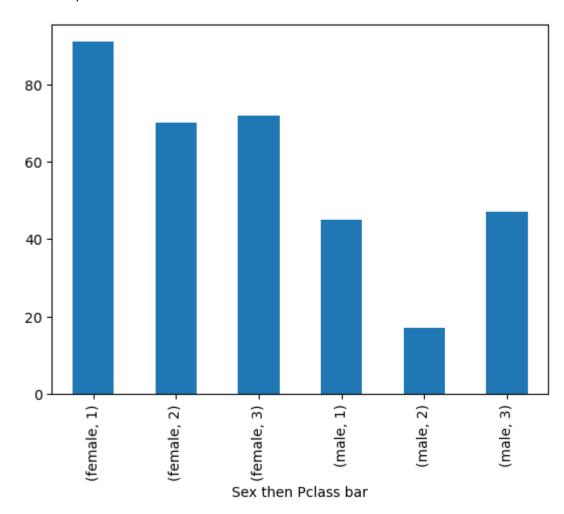
```
In [ ]:
In [13]:
           1 df.groupby(['Pclass'])['Survived'].sum()
Out[13]: Pclass
         1
              136
               87
          2
              119
         Name: Survived, dtype: int64
In [14]:
           1 df.groupby(['Pclass', 'Sex'])['Survived'].sum()
Out[14]: Pclass Sex
                 female
         1
                           91
                 male
                            45
                 female
         2
                           70
                 male
                           17
                 female
                           72
         3
                 male
                            47
         Name: Survived, dtype: int64
In [15]:
           1 df.groupby(['Sex', 'Pclass'])['Survived'].count()
Out[15]: Sex
                 Pclass
         female 1
                            94
                            76
                 2
                 3
                            144
         male
                 1
                            122
                            108
                            347
         Name: Survived, dtype: int64
```

```
1 df.groupby(['Sex', 'Pclass'])['Survived'].sum()
In [16]:
Out[16]: Sex
                  Pclass
         female 1
                           91
                  2
                            70
                  3
                            72
         male
                            45
                  2
                            17
                  3
                            47
         Name: Survived, dtype: int64
                                       1 df.groupby(['Team'])['Gold','Silver','Bronze'].sum()
                           In [13]:
                           Out[13]:
                                                            Gold Silver Bronze
                                                      Team
                                                 30. Februar
                                                                     0
                                      A North American Team
                                                               0
                                                                     0
                                                   Acipactli
                                                   Acturus
                                                                      0
                                                                             0
                                                               0
                                                Afghanistan
                                                                     0
                                                                             2
                                                         •••
                                                    Zambia
                                                               0
                                                                      1
                                                    Zefyros
                                                                     0
                                                                             0
                                                 Zimbabwe
                                                              17
                                                       Zut
                                                               0
                                                                      3
                                                                             0
                                                       rn-2
                                                                     0
                                                                             0
```

1184 rows × 3 columns

```
In []: 1 List_No_Gold=list(No_Gold.index)
In []: 1 lem(List_No_Gold)=942 # That means there are 942 Players without gold
In [17]: 1 df.groupby(['Sex', 'Pclass'])['Survived'].sum().plot.bar(xlabel="Sex then Pclass bar")
```

Out[17]: <AxesSubplot:xlabel='Sex then Pclass bar'>



```
1 df.groupby(['Sex', 'Survived'])['Survived'].count().unstack('Sex')
In [18]:
Out[18]:
              Sex female male
          Survived
                0
                          468
                1
                     233
                          109
         unstacking
In [19]:
           1 Sex_Survived_Sum=df.groupby(['Sex'])['Survived']
In [20]:
           1 Sex Survived Sum
         <pandas.core.groupby.generic.SeriesGroupBy object at 0x000002589E89B250>
In [21]:
           1 # the groupby is an object creation
In [22]:
           1 Sex Survived Sum Avg=Sex Survived Sum.mean()*100
In [23]:
           1 Sex_Survived_Sum_Avg
Out[23]: Sex
         female
                    74,203822
                    18.890815
         male
         Name: Survived, dtype: float64
```

groupby on Multiple Columns and mulltiple fn's on single column

| | Nationalit | degree | salary | age | |
|---|------------|--------|--------|-----|--|
| 0 | India | MBA | 190000 | 33 | |
| 1 | India | PhD | 200000 | 32 | |
| 2 | UK | PhD | 200000 | 38 | |
| 3 | USA | MS | 240000 | 26 | |
| 4 | USA | PhD | 220000 | 25 | |

| | Nationalit | degree | mean sala | min age | max age |
|---|------------|--------|-----------|---------|---------|
| 0 | India | MBA | 110000 | 29 | 33 |
| 1 | India | PhD | 110000 | 19 | 32 |

Operations on Groups

New DataFrame via filter or query or pd.Grp

```
### Permute and combine Groupby@last
### Then only analyse
```

Filter ie Equation Form

```
In [ ]: 1 df1=df[0:100]
In [ ]: 1 df[df.Price!=0]
In [ ]: 1 Summer=df[df["Season"=="Summer"]] # Len(summer)
In [ ]: 1 df[df.Price==0]
In [ ]: 1 df_nonzero=df[df.yr_renov!=0] # table corresponding to non zero column values of that table
In [ ]: 1 df[df.yr_renov!=0][yr_renov].min()
```

```
1 df_nonzero=df[df.yr_renov>10]
In [ ]:
          1 df nonzero.['yr renov'].min()
In [ ]:
In [5]:
          1 df1=df[['Age','Pclass']] # CREATE NEW DF
In [ ]:
            Country with most medals and less number of players
             TMC['Total']=TMC['Bronze']+TMC['Silver']+TMC[''] #Len(TMC)
In [ ]:
          1 Team and Medal count=pd.crosstab(df.Team,df.Medal) #<df.Team,df.Medal>
          1 df1
In [6]:
Out[6]:
              Age Pclass
           0 22.0
                      3
           1 38.0
                      1
           2 26.0
                      3
           3 35.0
                      1
           4 35.0
                      3
         886 27.0
                      2
         887 19.0
         888 NaN
                      3
         889 26.0
                      1
         890 32.0
                      3
        891 rows × 2 columns
```

localhost:8888/notebooks/PythonSB/oPANDAS DATA ANALYSIS.ipynb

```
1 | df2=df[df.Fare!=0] # Non Zero Values in column
In [17]:
                df['Gold']=[1 if medal=='Gold'][1 if medal =='Gold' else 0 ]
 In [
                 df[df.yr renovated!=0][yr renovated].min()
 In [
 In [
             1
                 df2
In [18]:
             1
Out[18]:
                  Passengerld Survived Pclass
                                                                                    Age SibSp Parch
                                                                     Name
                                                                               Sex
                                                                                                                Ticket
                                                                                                                          Fare
                                                                                                                                Cabin Embarked
              0
                            1
                                      0
                                              3
                                                     Braund, Mr. Owen Harris
                                                                              male
                                                                                    22.0
                                                                                                     0
                                                                                                             A/5 21171
                                                                                                                        7.2500
                                                                                                                                  NaN
                                                                                                                                                S
                                                  Cumings, Mrs. John Bradley
                            2
                                                                            female
                                                                                                                                               С
               1
                                                                                    38.0
                                                                                              1
                                                                                                      0
                                                                                                             PC 17599 71.2833
                                                                                                                                  C85
                                                        (Florence Briggs Th...
                                                                                                            STON/O2.
               2
                            3
                                              3
                                                                                                                        7.9250
                                                                                                                                                S
                                      1
                                                       Heikkinen, Miss. Laina female 26.0
                                                                                              0
                                                                                                     0
                                                                                                                                  NaN
                                                                                                              3101282
                                                  Futrelle, Mrs. Jacques Heath
                                                                                                                                                S
               3
                            4
                                      1
                                                                             female
                                                                                    35.0
                                                                                              1
                                                                                                      0
                                                                                                               113803
                                                                                                                       53.1000
                                                                                                                                 C123
                                                              (Lily May Peel)
                            5
                                      0
                                              3
                                                      Allen, Mr. William Henry
                                                                                              0
                                                                                                     0
                                                                                                               373450
                                                                                                                        8.0500
                                                                                                                                                S
               4
                                                                                    35.0
                                                                                                                                  NaN
                                                                              male
                                                                                                                                               ...
                                              2
                                                                                                                                                S
            886
                          887
                                      0
                                                        Montvila, Rev. Juozas
                                                                                                               211536
                                                                                                                       13.0000
                                                                              male
                                                                                    27.0
                                                                                              0
                                                                                                     0
                                                                                                                                  NaN
                                                      Graham, Miss. Margaret
            887
                          888
                                              1
                                                                                    19.0
                                                                                              0
                                                                                                     0
                                                                                                               112053
                                                                                                                       30.0000
                                                                                                                                               S
                                      1
                                                                            female
                                                                                                                                  B42
                                                                      Edith
                                                    Johnston, Miss. Catherine
                                              3
                                                                                                                                                S
            888
                          889
                                      0
                                                                             female
                                                                                   NaN
                                                                                              1
                                                                                                      2
                                                                                                            W./C. 6607 23.4500
                                                                                                                                  NaN
                                                              Helen "Carrie"
            889
                          890
                                                                                                                       30.0000
                                                                                                                                               С
                                              1
                                                         Behr, Mr. Karl Howell
                                                                              male
                                                                                    26.0
                                                                                                      0
                                                                                                               111369
                                                                                                                                 C148
            890
                          891
                                      0
                                              3
                                                           Dooley, Mr. Patrick
                                                                              male
                                                                                    32.0
                                                                                              0
                                                                                                      0
                                                                                                               370376
                                                                                                                        7.7500
                                                                                                                                  NaN
                                                                                                                                               Q
```

876 rows × 12 columns

☼Is the renovation recent or not

df['was renovated']=[1 if yr renovated!= 0 else 0 for yr_renovated in df.yr_renovated] # housing data

what all after FOR is treated as a block

Query

can't find sum

```
In [14]: 1 Sex_Age_20 = df.query("Sex=='male' & Age == 20.0")
```

#query - display the row in full so that we get other rdb column value

```
In [ ]: 1 Board_Surv=df.query("Boarded=='S' & Age=22 & survived ==1.0")
```

In []: 1 Gold Medalist in 1992 basketball event =df.query("Year==1992 & Sport =='Basketball' & Medal=='Gold' & Se

| n [25]: | 1 | Sex_Age_20 | | | | | | | | | | |
|---------|-----|---------------|-----------|---------|-----------------------------------|--------|------|--------|----------|-----------------------|---------|----------|
| t[25]: | | Passengerld | Survived | Pclass | Name | Sex | Age | SibSp | Parch | Ticket | Fare | Embarked |
| | 12 | 13 | 0 | 3 | Saundercock, Mr. William Henry | male | 20.0 | 0 | 0 | A/5. 2151 | 8.0500 | S |
| | 91 | 92 | 0 | 3 | Andreasson, Mr. Paul Edvin | male | 20.0 | 0 | 0 | 347466 | 7.8542 | S |
| | 131 | 132 | 0 | 3 | Coelho, Mr. Domingos Fernandeo | male | 20.0 | 0 | 0 | SOTON/O.Q. 3101307 | 7.0500 | S |
| | 378 | 379 | 0 | 3 | Betros, Mr. Tannous | male | 20.0 | 0 | 0 | 2648 | 4.0125 | С |
| | 441 | 442 | 0 | 3 | Hampe, Mr. Leon | male | 20.0 | 0 | 0 | 345769 | 9.5000 | S |
| | 622 | 623 | 1 | 3 | Nakid, Mr. Sahid | male | 20.0 | 1 | 1 | 2653 | 15.7417 | С |
| | 640 | 641 | 0 | 3 | Jensen, Mr. Hans Peder | male | 20.0 | 0 | 0 | 350050 | 7.8542 | S |
| | 664 | 665 | 1 | 3 | Lindqvist, Mr. Eino William | male | 20.0 | 1 | 0 | STON/O 2. 3101285 | 7.9250 | S |
| | 682 | 683 | 0 | 3 | Olsvigen, Mr. Thor Anderson | male | 20.0 | 0 | 0 | 6563 | 9.2250 | S |
| | 725 | 726 | 0 | 3 | Oreskovic, Mr. Luka | male | 20.0 | 0 | 0 | 315094 | 8.6625 | S |
| | 762 | 763 | 1 | 3 | Barah, Mr. Hanna Assi | male | 20.0 | 0 | 0 | 2663 | 7.2292 | С |
| | 840 | 841 | 0 | 3 | Alhomaki, Mr. Ilmari Rudolf | male | 20.0 | 0 | 0 | SOTON/O2 3101287 | 7.9250 | S |
| | 876 | 877 | 0 | 3 | Gustafsson, Mr. Alfred Ossian | male | 20.0 | 0 | 0 | 7534 | 9.8458 | S |
| 26]: | 1 | Sex_Age_20_ | _SibSp_1= | df.quer | ry("Sex=='male' & Age==22 | 2.0 & | SibS | p == 1 | ") | | | |
| 27]: | 1 | Sex_Age_20_ | _SibSp_1 | | | | | | | | | |
| 27]: | F | Passengerld S | urvived P | class | Name Sex Aç | ge Sil | Sp F | Parch | Ticket | Fare Embarked | | |
| | 0 | 1 | 0 | 3 B | raund, Mr. Owen Harris male 22 | .0 | 1 | 0 A | √5 21171 | 7.25 S | | |

PIVOT TABLE

In [28]: 1 pivot01=df.pivot_table(values='Fare',index='Sex',columns='Pclass',aggfunc='sum')

```
1 pivot01
In [29]:
Out[29]:
           Pclass
                         1
                                   2
                                            3
             Sex
           female 9975.8250 1669.7292 2321.1086
            male 8201.5875 2132.1125 4393.5865
In [30]:
            1 pivot02=df.pivot_table(values='Fare',index='Embarked',columns='Pclass',aggfunc='sum')
In [31]:
            1 pivot02
Out[31]:
              Pclass
                                               3
           Embarked
                  C 8901.0750
                                         740.1295
                               431.0917
                      180.0000
                                37.0500
                                         805.2043
                  S 8936.3375 3333.7000 5169.3613
```

Insert

this will insert a new column in the desired place. For this purpose let's create a new column first using np.random

```
In [32]: 1 column = np.random.randint(0,100, size=len(df))
```

column was created with random numbers 0 -100 length of column as the length of df

df.info()

```
In [35]: 1 df.insert(4,'column',column)
```

In [36]: 1 df.head()

| _ | | |
|-----|----------------------------|---|
| O + | $\Gamma \supset C \supset$ | |
| () | เรทเ | |
| Out | 1 20 1 | • |

| | Passengerld | Survived | Pclass | Name | column | Sex | Age | SibSp | Parch | Ticket | Fare | Embarked |
|---|-------------|----------|--------|---|--------|--------|------|-------|-------|---------------------|---------|----------|
| 0 | 1 | 0 | 3 | Braund, Mr. Owen Harris | 95 | male | 22.0 | 1 | 0 | A/5 21171 | 7.2500 | S |
| 1 | 2 | 1 | 1 | Cumings, Mrs. John Bradley (Florence Briggs Th | 38 | female | 38.0 | 1 | 0 | PC 17599 | 71.2833 | С |
| 2 | 3 | 1 | 3 | Heikkinen, Miss. Laina | 86 | female | 26.0 | 0 | 0 | STON/O2. 3101282 | 7.9250 | S |
| 3 | 4 | 1 | 1 | Futrelle, Mrs. Jacques Heath (Lily May Peel) | 92 | female | 35.0 | 1 | 0 | 113803 | 53.1000 | S |
| 4 | 5 | 0 | 3 | Allen, Mr. William Henry | 23 | male | 35.0 | 0 | 0 | 373450 | 8.0500 | S |

In [37]:

1 df[['Fare','Age']].cumsum()

Out[37]:

| | Fare | Age |
|-----|------------|----------|
| 0 | 7.2500 | 22.00 |
| 1 | 78.5333 | 60.00 |
| 2 | 86.4583 | 86.00 |
| 3 | 139.5583 | 121.00 |
| 4 | 147.6083 | 156.00 |
| | | |
| 886 | 28602.7493 | 26056.17 |
| 887 | 28632.7493 | 26075.17 |
| 888 | 28656.1993 | 26103.17 |
| 889 | 28686.1993 | 26129.17 |
| 890 | 28693.9493 | 26161.17 |
| | | |

891 rows × 2 columns

In [38]: 1 df.where(df.column>50)

| _ | | | |
|----------|-----|-------|-------------|
| α | | - D C | |
| 1111 | | ~~ | SI : |
| - | ٠-١ | | |

| Passengerld | Survived | Pclass | Name | column | Sex | Age | SibSp | Parch | Ticket | Fare | Embarked |
|-------------|--|---|---|--|--|---|--|---|---|--|--|
| 1.0 | 0.0 | 3.0 | Braund, Mr. Owen Harris | 95.0 | male | 22.0 | 1.0 | 0.0 | A/5 21171 | 7.250 | S |
| NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| 3.0 | 1.0 | 3.0 | Heikkinen, Miss. Laina | 86.0 | female | 26.0 | 0.0 | 0.0 | STON/O2. 3101282 | 7.925 | S |
| 4.0 | 1.0 | 1.0 | Futrelle, Mrs. Jacques Heath (Lily May Peel) | 92.0 | female | 35.0 | 1.0 | 0.0 | 113803 | 53.100 | S |
| NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| | | | | | | | | | | | |
| NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| 888.0 | 1.0 | 1.0 | Graham, Miss. Margaret Edith | 89.0 | female | 19.0 | 0.0 | 0.0 | 112053 | 30.000 | S |
| NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN | NaN |
| | 1.0 NaN 3.0 4.0 NaN NaN 888.0 NaN | 1.0 0.0 NaN NaN 3.0 1.0 4.0 1.0 NaN NaN NaN NaN 888.0 1.0 NaN NaN NaN NaN NaN NaN | 1.0 0.0 3.0 NaN NaN NaN 3.0 1.0 3.0 4.0 1.0 1.0 NaN NaN NaN NaN NaN NaN 888.0 1.0 1.0 NaN NaN NaN NaN NaN NaN NaN NaN NaN | 1.0 0.0 3.0 Braund, Mr. Owen Harris NaN NaN NaN 3.0 1.0 3.0 Heikkinen, Miss. Laina 4.0 1.0 1.0 Futrelle, Mrs. Jacques Heath (Lily May Peel) NaN NaN NaN NaN NaN NaN NaN NaN 888.0 1.0 1.0 Graham, Miss. Margaret Edith NaN NaN NaN NaN NaN NaN NaN | 1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 NaN NaN NaN NaN NaN 3.0 1.0 3.0 Heikkinen, Miss. Laina 86.0 4.0 1.0 1.0 Futrelle, Mrs. Jacques Heath (Lily May Peel) 92.0 NaN NaN NaN NaN NaN NaN NaN NaN NaN NaN | 1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male NaN NaN NaN NaN NaN NaN 3.0 1.0 3.0 Heikkinen, Miss. Laina 86.0 female 4.0 1.0 1.0 Futrelle, Mrs. Jacques Heath (Lily May Peel) 92.0 female NaN NaN NaN NaN NaN NaN NaN NaN NaN NaN NaN NaN NaN NaN | 1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male 22.0 NaN NaN NaN NaN NaN NaN NaN 3.0 1.0 3.0 Heikkinen, Miss. Laina 86.0 female 26.0 4.0 1.0 1.0 Futrelle, Mrs. Jacques Heath (Lily May Peel) 92.0 female 35.0 NaN NaN NaN NaN NaN NaN NaN NaN NaN | 1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male 22.0 1.0 NaN NaN <th>1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male 22.0 1.0 0.0 NaN NaN NaN NaN NaN NaN NaN NaN NaN Na</th> <th>1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male 22.0 1.0 0.0 A/5 21171 NaN NaN NaN NaN NaN NaN NaN NaN NaN Na</th> <th>1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male 22.0 1.0 0.0 A/5 21171 7.250 NaN NaN NaN NaN NaN NaN NaN NaN NaN Na</th> | 1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male 22.0 1.0 0.0 NaN NaN NaN NaN NaN NaN NaN NaN NaN Na | 1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male 22.0 1.0 0.0 A/5 21171 NaN NaN NaN NaN NaN NaN NaN NaN NaN Na | 1.0 0.0 3.0 Braund, Mr. Owen Harris 95.0 male 22.0 1.0 0.0 A/5 21171 7.250 NaN NaN NaN NaN NaN NaN NaN NaN NaN Na |

891 rows × 12 columns

```
In [39]: 1 df.Pclass.unique()
```

Out[39]: array([3, 1, 2], dtype=int64)

pd.cut

```
In [41]: 1 cutoff = [0,18,50,85]
2 LABELS=["Child","Adult","Old"]
3 df['AGE_TYPE']=pd.cut(df.Age, bins=cutoff, labels=LABELS)
```

In [42]:

1 df

Out[42]:

| | Passengerld | Survived | Pclass | Name | column | Sex | Age | SibSp | Parch | Ticket | Fare | Embarked | AGE_TYPE |
|-----|-------------|----------|--------|---|--------|--------|------|-------|-------|---------------------|---------|----------|----------|
| 0 | 1 | 0 | 3 | Braund, Mr. Owen Harris | 95 | male | 22.0 | 1 | 0 | A/5 21171 | 7.2500 | S | Adult |
| 1 | 2 | 1 | 1 | Cumings, Mrs. John Bradley (Florence Briggs Th | 38 | female | 38.0 | 1 | 0 | PC 17599 | 71.2833 | С | Adult |
| 2 | 3 | 1 | 3 | Heikkinen, Miss. Laina | 86 | female | 26.0 | 0 | 0 | STON/O2. 3101282 | 7.9250 | S | Adult |
| 3 | 4 | 1 | 1 | Futrelle, Mrs. Jacques Heath (Lily May Peel) | 92 | female | 35.0 | 1 | 0 | 113803 | 53.1000 | S | Adult |
| 4 | 5 | 0 | 3 | Allen, Mr. William Henry | 23 | male | 35.0 | 0 | 0 | 373450 | 8.0500 | S | Adult |
| | | | | | | | | | | | | | |
| 886 | 887 | 0 | 2 | Montvila, Rev. Juozas | 7 | male | 27.0 | 0 | 0 | 211536 | 13.0000 | S | Adult |
| 887 | 888 | 1 | 1 | Graham, Miss. Margaret Edith | 89 | female | 19.0 | 0 | 0 | 112053 | 30.0000 | S | Adult |
| 888 | 889 | 0 | 3 | Johnston, Miss. Catherine Helen "Carrie" | 37 | female | 28.0 | 1 | 2 | W./C. 6607 | 23.4500 | S | Adult |
| 889 | 890 | 1 | 1 | Behr, Mr. Karl Howell | 1 | male | 26.0 | 0 | 0 | 111369 | 30.0000 | С | Adult |
| 890 | 891 | 0 | 3 | Dooley, Mr. Patrick | 44 | male | 32.0 | 0 | 0 | 370376 | 7.7500 | Q | Adult |

891 rows × 13 columns

```
In [43]:
           1
           2 df.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 891 entries, 0 to 890
         Data columns (total 13 columns):
           #
               Column
                            Non-Null Count Dtype
           0
               PassengerId 891 non-null
                                             int64
               Survived
                            891 non-null
                                             int64
           1
           2
               Pclass
                            891 non-null
                                             int64
           3
                            891 non-null
                                             object
               Name
           4
               column
                            891 non-null
                                             int32
           5
                                             object
               Sex
                            891 non-null
           6
                            891 non-null
                                             float64
               Age
           7
               SibSp
                            891 non-null
                                             int64
           8
                            891 non-null
                                             int64
               Parch
                                             object
           9
               Ticket
                            891 non-null
           10
               Fare
                            891 non-null
                                             float64
                                             object
           11 Embarked
                            889 non-null
          12 AGE TYPE
                                             category
                            891 non-null
         dtypes: category(1), float64(2), int32(1), int64(5), object(4)
         memory usage: 81.2+ KB
           1 df.AGE TYPE
In [44]:
Out[44]: 0
                 Adult
                 Adult
         1
          2
                 Adult
          3
                 Adult
                 Adult
          4
                 . . .
         886
                 Adult
         887
                 Adult
         888
                 Adult
         889
                 Adult
                 Adult
         890
         Name: AGE TYPE, Length: 891, dtype: category
         Categories (3, object): ['Child' < 'Adult' < 'Old']</pre>
```

87 female 0.75

27 female 0.75

male 0.83

2

2

0

2666 19.2583

2666 19.2583

2 248738 29.0000

С

С

S

Child

Child

Child

nlargest & nsmallest : count also

| In [46]: | df.nlargest(5,'Age') # five athletes with highest age | | | | | | | | | | | | | |
|----------|---|-------------|----------|--------|--|--------|------|------|-------|-------|-------------|---------|----------|----------|
| Out[46]: | | Passengerld | Survived | Pclass | Name | column | Sex | Age | SibSp | Parch | Ticket | Fare | Embarked | AGE_TYPE |
| | 630 | 631 | 1 | 1 | Barkworth, Mr. Algernon Henry Wilson | 1 | male | 80.0 | 0 | 0 | 27042 | 30.0000 | S | Old |
| | 851 | 852 | 0 | 3 | Svensson, Mr. Johan | 44 | male | 74.0 | 0 | 0 | 347060 | 7.7750 | S | Old |
| | 96 | 97 | 0 | 1 | Goldschmidt, Mr. George B | 86 | male | 71.0 | 0 | 0 | PC 17754 | 34.6542 | С | Old |
| | 493 | 494 | 0 | 1 | Artagaveytia, Mr. Ramon | 91 | male | 71.0 | 0 | 0 | PC 17609 | 49.5042 | С | Old |
| | 116 | 117 | 0 | 3 | Connors, Mr. Patrick | 28 | male | 70.5 | 0 | 0 | 370369 | 7.7500 | Q | Old |
| In [47]: | 1 | df.nsmalles | t(5,'Age | e') | | | | | | | | | | |
| Out[47]: | | Passengerld | Survived | Pclass | Name | column | Sex | Age | SibSp | Parch | Ticket | Fare | Embarked | AGE_TYPE |
| | 803 | 804 | 1 | 3 | Thomas, Master. Assad Alexander | 95 | male | 0.42 | 0 | 1 | 2625 | 8.5167 | С | Child |
| | 755 | 756 | 1 | 2 | Hamalainen, Master. Viljo | 12 | male | 0.67 | 1 | 1 | 250649 | 14.5000 | S | Child |

Baclini, Miss. Helene

Barbara

Eugenie

Baclini, Miss.

Alden Gates

Caldwell, Master.

3

3

2

1

470

645

79

469

644

78

- In [51]: 1 """We often want to break down the rows by more than one category. Remember that the Titanic passengers a
 2 This is the role of the Pandas crosstab function. It is a Pandas function because it is function inside t
 4 The first argument to pd.crosstab is the category we want to see in the rows; the second argument is the
 6 Here is a cross-tabulation of gender (in the rows) by survived (in the columns):"""
- Out[51]: 'We often want to break down the rows by more than one category. Remember that the Titanic passengers and cr ew tended to give preference to women and children, when loading the lifeboats. So, we may want to see the c ounts of passengers who survived, broken down by gender.\n\nThis is the role of the Pandas crosstab function. It is a Pandas function because it is function inside the Pandas module; we can get this function with p d.crosstab (assuming we have done the usual import pandas as pd).\n\nThe first argument to pd.crosstab is the category we want to see in the rows; the second argument is the category we want to see in the columns.\n\nHere is a cross-tabulation of gender (in the rows) by survived (in the columns):'

Out[53]: Survived 0 1

Sex

female 81 233

male 468 109

- Out[54]: 'We will often want to see these values as proportions rather than counts. For example, we may be interested in the proportion of women and men that survived. As for value_counts above, we use the normalize keyword to ask for proportions. This time we have to specify the direction that Pandas should use for the proportion. We could be interested in the proportion across the column (proportions of male and female passengers within the yes "survived" category, likewise for the no category). More likely, in this case, we will be interested in proportions across the row (proportion who survived within male category, proportion who survived within female category). We give Pandas this information with the value for the normalize keyword argument. Pandas uses the term index to refer to the rows. Remember, Pandas also uses the term index for the row labels'

In []: 1
In []: 1 RESET IND grp graph