Titanic Dataset- Handling missing values

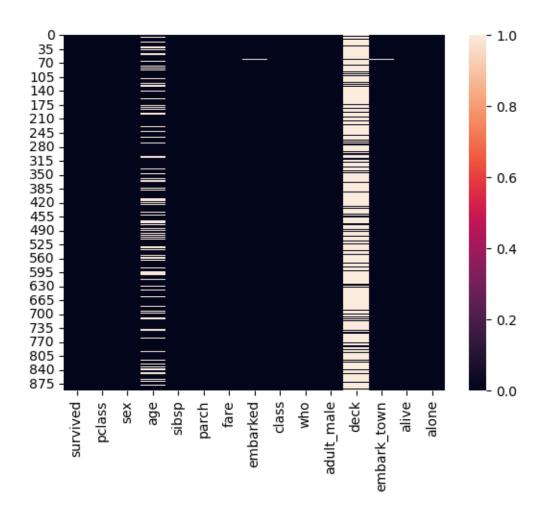
April 13, 2023

```
import pandas as pd
     import numpy as np
     import seaborn as sns
     import nbconvert
    df=sns.load_dataset('titanic')
[3]:
     df.head()
[3]:
                                                                            class
        survived
                  pclass
                              sex
                                     age
                                          sibsp
                                                 parch
                                                            fare embarked
     0
                0
                        3
                             male
                                    22.0
                                              1
                                                          7.2500
                                                                         S
                                                                            Third
     1
               1
                        1
                                    38.0
                                              1
                                                         71.2833
                                                                            First
                           female
                                                                         C
     2
                1
                                              0
                        3
                           female
                                    26.0
                                                      0
                                                          7.9250
                                                                         S
                                                                            Third
     3
                1
                        1
                           female
                                    35.0
                                              1
                                                         53.1000
                                                                         S
                                                                            First
                        3
     4
                             male
                                   35.0
                                              0
                                                          8.0500
                                                                            Third
               adult_male deck
                                  embark_town alive
          who
                                                      alone
                      True
                            NaN
                                 Southampton
     0
          man
                                                      False
                                                 no
     1
        woman
                     False
                              C
                                    Cherbourg
                                                yes
                                                      False
     2
                     False
                            NaN
                                  Southampton
        woman
                                                yes
                                                       True
     3
        woman
                     False
                              C
                                  Southampton
                                                      False
                                                yes
     4
          man
                      True
                            NaN
                                 Southampton
                                                       True
[4]: #Check missing value in dataset
     df.isnull()
[4]:
          survived
                     pclass
                                                   parch
                                                                  embarked
                                                                             class
                                       age
                                            sibsp
                                                            fare
                               sex
     0
             False
                      False
                             False
                                     False
                                            False
                                                   False
                                                           False
                                                                      False
                                                                             False
                      False
                                     False
     1
             False
                             False
                                            False
                                                   False
                                                           False
                                                                      False
                                                                             False
     2
             False
                      False
                             False
                                     False
                                            False
                                                   False
                                                           False
                                                                             False
                                                                      False
     3
             False
                      False
                             False
                                     False
                                            False
                                                   False
                                                           False
                                                                      False
                                                                             False
             False
                      False
                             False
                                     False
                                            False
                                                   False
                                                           False
                                                                      False
                                                                             False
                                                                      False False
     886
             False
                      False
                             False
                                     False False
                                                   False
                                                           False
     887
                                    False False
                                                   False False
                                                                      False False
             False
                      False False
     888
             False
                      False
                             False
                                      True False
                                                   False False
                                                                      False False
     889
             False
                      False
                             False
                                   False False
                                                   False False
                                                                      False False
     890
             False
                      False False
                                    False False
                                                   False False
                                                                      False False
```

```
who adult_male
                             deck embark_town alive alone
    0
         False
                     False
                             True
                                         False
                                                False False
         False
                     False False
                                                False False
    1
                                         False
    2
         False
                     False
                             True
                                         False False False
         False
                     False False
                                         False False False
    3
    4
         False
                     False
                             True
                                         False False False
    886 False
                     False
                                         False False False
                             True
    887 False
                     False False
                                         False False False
    888 False
                     False
                             True
                                         False False False
    889 False
                     False False
                                         False False False
    890 False
                     False
                             True
                                         False False False
    [891 rows x 15 columns]
[5]: df.isnull().sum()
[5]: survived
                     0
    pclass
                     0
    sex
                     0
                   177
    age
    sibsp
                     0
    parch
                     0
    fare
                     0
    embarked
                     2
    class
                     0
    who
                     0
    adult_male
                     0
    deck
                   688
                     2
    embark_town
    alive
                     0
    alone
                     0
    dtype: int64
[6]: # getting error here beacuse of (ValueError: could not convert string to float:
     →'male')
     #sns.heatmap(df)
```

```
[7]: sns.heatmap(df.isnull())
```

[7]: <AxesSubplot:>



[8]:	#Handling missing values by deleting rows	
	df.dropna()	

[O].		1			h	h	£	lll	-1	\
[8]:	survived	pclass	sex	age	sibsp	parch	Iare	embarked	class	\
1	1	1	female	38.0	1	0	71.2833	C	First	
3	1	1	female	35.0	1	0	53.1000	S	First	
6	0	1	male	54.0	0	0	51.8625	S	First	
10	1	3	female	4.0	1	1	16.7000	S	Third	
11	1	1	female	58.0	0	0	26.5500	S	First	
	•••	•••		•••						
87	1 1	1	female	47.0	1	1	52.5542	S	First	
87	2 0	1	male	33.0	0	0	5.0000	S	First	
87	9 1	1	female	56.0	0	1	83.1583	C	First	
88	7 1	1	female	19.0	0	0	30.0000	S	First	
88	9 1	1	male	26.0	0	0	30.0000	C	First	

who adult_male deck embark_town alive alone

```
1
                       False
                                 C
                                       Cherbourg
                                                         False
          woman
                                                    yes
     3
                                 С
                       False
                                     Southampton
                                                          False
          woman
                                                    yes
     6
            man
                         True
                                     Southampton
                                                     no
                                                           True
     10
           child
                       False
                                     Southampton
                                                    yes
                                                         False
     11
          woman
                       False
                                     Southampton
                                                           True
                                                    yes
     . .
     871
                                                         False
          woman
                       False
                                 D
                                     Southampton
                                                    yes
     872
            man
                         True
                                 В
                                     Southampton
                                                     no
                                                           True
     879
                       False
                                 C
          woman
                                       Cherbourg
                                                    yes
                                                         False
     887
                       False
                                 В
                                     Southampton
                                                           True
          woman
                                                    yes
     889
                         True
                                 C
                                       Cherbourg
             man
                                                    yes
                                                           True
     [182 rows x 15 columns]
[9]: ##rowwise deletion
     df.dropna().shape
[9]: (182, 15)
     df.shape
```

1 Note-> Above practice is not good by deleting the rows, beacuse here we are missing lot of data

[10]: (891, 15)

```
## Handling missing values by deleting Column Wise
      df.dropna(axis=1)
[11]:
            survived
                       pclass
                                    sex
                                         sibsp
                                                 parch
                                                             fare
                                                                     class
                                                                               who
                                                           7.2500
                    0
                             3
                                   male
                                                      0
                                                                     Third
                                                                               man
      1
                    1
                             1
                                female
                                              1
                                                      0
                                                         71.2833
                                                                     First
                                                                             woman
      2
                    1
                             3
                                female
                                              0
                                                      0
                                                          7.9250
                                                                     Third
                                                                             woman
      3
                    1
                                female
                                                      0
                                                         53.1000
                             1
                                              1
                                                                     First
                                                                             woman
      4
                    0
                             3
                                   male
                                              0
                                                      0
                                                          8.0500
                                                                     Third
                                                                               man
      . .
                                   male
                                              0
                                                         13.0000
      886
                    0
                             2
                                                      0
                                                                    Second
                                                                               man
      887
                                female
                    1
                             1
                                              0
                                                      0
                                                         30.0000
                                                                     First
                                                                             woman
      888
                    0
                             3
                                female
                                              1
                                                      2
                                                         23.4500
                                                                     Third
                                                                             woman
      889
                    1
                             1
                                   male
                                              0
                                                      0
                                                         30.0000
                                                                     First
                                                                               man
      890
                    0
                             3
                                              0
                                                          7.7500
                                   male
                                                                     Third
                                                                               man
            adult_male alive
                                alone
      0
                   True
                                False
                            no
      1
                  False
                           yes
                                False
      2
                  False
                                  True
                           yes
```

3	False	yes	False
4	True	no	True
	•••		
886	True	no	True
887	False	yes	True
888	False	no	False
889	True	yes	True
890	True	no	True

[891 rows x 11 columns]

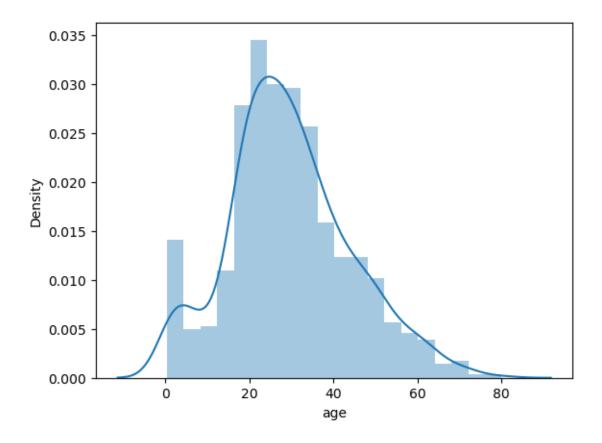
```
[12]: ## Imputation Technique
### 1-Mean value Imputation
```

```
[13]: sns.distplot(df['age'])
```

C:\ProgramData\Anaconda3\lib\site-packages\seaborn\distributions.py:2619: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

warnings.warn(msg, FutureWarning)

[13]: <AxesSubplot:xlabel='age', ylabel='Density'>



```
[14]: df.age.isnull().sum()
[14]: 177
[15]: df['Age_mean']=df['age'].fillna(df['age'].mean())
[16]: df[['Age_mean', 'age']]
[16]:
            Age_mean
                       age
           22.000000
                      22.0
      0
      1
           38.000000
                      38.0
      2
           26.000000
                      26.0
      3
           35.000000
                      35.0
      4
           35.000000 35.0
      . .
          27.000000
                      27.0
      886
      887
           19.000000
                      19.0
      888 29.699118
                       NaN
      889
          26.000000
                      26.0
      890 32.000000 32.0
      [891 rows x 2 columns]
[17]: ## Above techniques works when our data is normally distrubted.
```

2 Meadian Value Imputation-When data is skewed or- when we have outliers we used this technique

```
[18]: df['Age_median']=df['age'].fillna(df['age'].median())
[19]: df[['Age_mean','age','Age_median']]
[19]:
            Age_mean
                       age Age_median
      0
           22.000000
                      22.0
                                  22.0
           38.000000
                      38.0
                                  38.0
      1
      2
           26.000000
                      26.0
                                  26.0
      3
           35.000000
                      35.0
                                  35.0
      4
                                  35.0
           35.000000
                      35.0
      . .
      886 27.000000 27.0
                                  27.0
                                  19.0
      887
           19.000000
                      19.0
      888
          29.699118
                       NaN
                                  28.0
                                  26.0
      889
           26.000000
                      26.0
      890 32.000000 32.0
                                  32.0
```

3 3- Mode Value Imputation- Used for Categorial data

```
[20]: df[df['embarked'].isnull()]
[20]:
            survived pclass
                                              sibsp
                                                                              class \
                                  sex
                                         age
                                                      parch fare embarked
      61
                               female
                                        38.0
                                                   0
                                                           0
                                                              80.0
                                                                         NaN
                                                                              First
      829
                   1
                               female
                                        62.0
                                                   0
                                                           0
                                                              80.0
                                                                              First
                                                                         NaN
                   adult_male deck embark_town alive
                                                         alone Age mean
                                                                      38.0
      61
                         False
                                             NaN
                                                                                   38.0
            woman
                                                    yes
                                                           True
      829
                         False
                                  В
                                                                      62.0
                                                                                   62.0
            woman
                                             NaN
                                                    yes
                                                           True
[21]: df['embarked'].unique()
[21]: array(['S', 'C', 'Q', nan], dtype=object)
[22]: df['age'].notna()
[22]: 0
               True
      1
               True
      2
               True
      3
               True
      4
               True
      886
               True
      887
               True
      888
              False
      889
               True
      890
               True
      Name: age, Length: 891, dtype: bool
[23]: df[df['age'].notna()]
[23]:
            survived
                      pclass
                                  sex
                                              sibsp
                                                      parch
                                                                 fare embarked
                                                                                   class
                                         age
      0
                   0
                            3
                                 male
                                        22.0
                                                   1
                                                               7.2500
                                                                              S
                                                                                   Third
      1
                   1
                               female
                                        38.0
                                                              71.2833
                                                                              С
                                                                                   First
                            1
                                                   1
                                                           0
      2
                   1
                            3
                               female
                                        26.0
                                                   0
                                                           0
                                                               7.9250
                                                                              S
                                                                                   Third
      3
                   1
                               female
                                        35.0
                                                   1
                                                              53.1000
                                                                              S
                                                                                   First
                   0
                            3
                                 male
                                        35.0
                                                               8.0500
                                                                              S
                                                                                   Third
      4
                   0
                                                           5 29.1250
                                                                              Q
                                                                                   Third
      885
                            3
                               female
                                        39.0
                                                   0
                                                                                 Second
      886
                   0
                            2
                                 male
                                        27.0
                                                   0
                                                           0 13.0000
                                                                              S
                                        19.0
                                                              30.0000
                                                                              S
                                                                                   First
      887
                   1
                            1
                               female
                                                   0
                                        26.0
                                                           0 30.0000
      889
                   1
                            1
                                 male
                                                   0
                                                                                   First
```

```
890
                   0
                            3
                                 male 32.0
                                                              7.7500
                                                   0
                                                          0
                                                                                  Third
              who
                   adult_male deck
                                      embark_town alive
                                                          alone
                                                                  Age_mean
                                                                             Age_median
                                      Southampton
      0
             man
                          True
                                NaN
                                                      no
                                                          False
                                                                      22.0
                                                                                   22.0
      1
                        False
                                  C
                                        Cherbourg
                                                          False
                                                                      38.0
                                                                                   38.0
           woman
                                                     yes
      2
                                                                      26.0
                                                                                   26.0
                        False
                                {\tt NaN}
                                     Southampton
                                                           True
           woman
                                                     yes
      3
                        False
                                  С
                                      Southampton
                                                          False
                                                                      35.0
                                                                                   35.0
           woman
                                                     yes
      4
             man
                         True
                                {\tt NaN}
                                      Southampton
                                                      no
                                                           True
                                                                      35.0
                                                                                   35.0
      885
                        False
                                NaN
                                       Queenstown
                                                          False
                                                                      39.0
                                                                                   39.0
           woman
                                                      no
                                                                                   27.0
      886
                                      Southampton
                                                           True
                                                                      27.0
              man
                         True
                                {\tt NaN}
                                                      no
      887
           woman
                        False
                                  В
                                      Southampton
                                                           True
                                                                      19.0
                                                                                   19.0
                                                     yes
      889
             man
                         True
                                  C
                                        Cherbourg
                                                     yes
                                                           True
                                                                      26.0
                                                                                   26.0
      890
             man
                          True NaN
                                       Queenstown
                                                      no
                                                           True
                                                                      32.0
                                                                                   32.0
      [714 rows x 17 columns]
[24]: df[df['age'].notna()]['embarked'].mode()
[24]: 0
      Name: embarked, dtype: object
[25]: df[df['age'].notna()]['embarked'].mode()[0]
[25]: 'S'
[26]: mode= df[df['age'].notna()]['embarked'].mode()[0]
[27]:
     mode
[27]: 'S'
[28]: df['embarked_mode']=df['embarked'].fillna(mode)
[29]: df[['embarked_mode','embarked']]
[29]:
          embarked_mode embarked
      0
                       S
                                 S
                       С
                                 С
      1
      2
                       S
                                 S
      3
                       S
                                 S
                       S
      4
                                 S
      . .
      886
                       S
                                 S
      887
                       S
                                 S
                       S
                                 S
      888
                       С
                                 С
      889
      890
                       Q
                                 Q
```

[891 rows x 2 columns]

```
[30]: df['embarked_mode'].isnull().sum()
[30]: 0
```