Healthcare_Insurance_Analysis Project (1)

July 30, 2024

```
[]: # Importing libraries.
[]: import numpy as np
     import pandas as pd
     import matplotlib.pyplot as plt
     import seaborn as sns
[]: import warnings
     warnings.filterwarnings('ignore')
[]: # Loading the dataset.
[]: df1 = pd.read csv(r"C:
      →\Users\Admin\Downloads\Healthcare_Insurance_Analysis_Datasets⊔
      ⇔(2)\Hospitalisation details.csv")
     df2 = pd.read_csv(r"C:
      →\Users\Admin\Downloads\Healthcare Insurance Analysis Datasets (2)\Medical_
      ⇔Examinations.csv")
[]: import os
     os.getcwd()
[]: 'C:\\Users\\Admin'
[]: df3 = pd.read_excel(r"C:\Users\Admin\Healthcare_Insurance_Analysis_Datasets_
      \hookrightarrow (2)\Names.xlsx")
[]: # Merging the datasets.
[]: df4 = pd.merge(left=df1,right=df2,on='Customer ID',how='inner')
[]: df4
[]:
          Customer ID year month date children
                                                    charges Hospital tier
               Id2335
                       1992
                              Jul
                                      9
                                                0
                                                     563.84
                                                                 tier - 2
               Id2334 1992
                                                     570.62
                                                                 tier - 2
     1
                              Nov
                                     30
                                                0
     2
               Id2333 1993
                                     30
                                                0
                                                     600.00
                                                                 tier - 2
                              Jun
               Id2332 1992
                              Sep
                                     13
                                                     604.54
                                                                 tier - 3
```

```
4
                Id2331
                        1998
                                Jul
                                       27
                                                   0
                                                        637.26
                                                                     tier - 3
     2330
                   Id5
                        1989
                                Jun
                                       19
                                                   0
                                                      55135.40
                                                                     tier - 1
     2331
                   Id4
                        1991
                                Jun
                                        6
                                                   1
                                                      58571.07
                                                                     tier - 1
     2332
                   Id3
                        1970
                                ?
                                                   3
                                                     60021.40
                                                                     tier - 1
                                       11
     2333
                   Id2
                        1977
                                        8
                                                   0
                                                     62592.87
                                                                     tier - 2
                                Jun
     2334
                   Id1
                        1968
                               Oct
                                       12
                                                   0 63770.43
                                                                     tier - 1
          City tier State ID
                                   BMI
                                        HBA1C Heart Issues Any Transplants
           tier - 3
                        R1013
                                         4.51
                                                         No
                               17.580
     1
           tier - 1
                        R1013
                               17.600
                                         4.39
                                                         No
                                                                          No
     2
           tier - 1
                        R1013
                               16.470
                                         6.35
                                                         No
                                                                          No
     3
           tier - 3
                        R1013
                               17.700
                                         6.28
                                                         No
                                                                          No
     4
           tier - 3
                        R1013
                               22.340
                                         5.57
                                                         No
                                                                          No
           tier - 2
     2330
                        R1012
                               35.530
                                         5.45
                                                         No
                                                                          No
     2331
          tier - 3
                        R1024
                               38.095
                                         6.05
                                                                          No
                                                         No
     2332 tier - 1
                        R1012
                               34.485
                                        11.87
                                                        yes
                                                                          No
     2333 tier - 3
                        R1013
                               30.360
                                         5.77
                                                         No
                                                                          No
     2334 tier - 3
                        R1013 47.410
                                         7.47
                                                         No
                                                                          No
          Cancer history NumberOfMajorSurgeries smoker
     0
                       No
                                                       No
     1
                                                 1
                       No
                                                       No
     2
                      Yes
                                                 1
                                                       No
     3
                       No
                                                 1
                                                       No
     4
                       No
                                                       No
     •••
     2330
                       No
                                 No major surgery
                                                      yes
     2331
                                 No major surgery
                       No
                                                      yes
     2332
                       No
                                                      yes
     2333
                       No
                                 No major surgery
                                                      yes
     2334
                                 No major surgery
                                                      yes
     [2335 rows x 16 columns]
[]: df = pd.merge(left=df3,right=df4,on='Customer ID',how='inner')
[ ]: df
[]:
          Customer ID
                                                        name
                                                              year month
                                                                           date
     0
                   Id1
                                          Hawks, Ms.
                                                       Kelly
                                                              1968
                                                                      Oct
                                                                             12
                   Id2
     1
                                     Lehner, Mr. Matthew D
                                                              1977
                                                                      Jun
                                                                              8
     2
                   Id3
                                              Lu, Mr.
                                                        Phil
                                                              1970
                                                                             11
     3
                   Id4
                                       Osborne, Ms. Kelsey
                                                              1991
                                                                      Jun
                                                                              6
     4
                   Id5
                                       Kadala, Ms. Kristyn 1989
                                                                      Jun
                                                                             19
```

```
2330
                Id2331
                                      Brietzke, Mr.
                                                      Jordan 1998
                                                                       Jul
                                                                              27
     2331
                        Riveros Gonzalez, Mr.
                Id2332
                                                 Juan D. Sr.
                                                               1992
                                                                              13
                                                                       Sep
     2332
                Id2333
                                          Albano, Ms.
                                                        Julie
                                                               1993
                                                                       Jun
                                                                              30
     2333
                Id2334
                                     Rosendahl, Mr.
                                                      Evan P
                                                               1992
                                                                       Nov
                                                                              30
     2334
                Id2335
                                       German, Mr.
                                                     Aaron K 1992
                                                                       Jul
                                                                               9
                                                                             HBA1C
           children
                       charges Hospital tier City tier State ID
                                                                       BMI
                      63770.43
                                     tier - 1 tier - 3
                                                                              7.47
     0
                   0
                                                             R1013
                                                                    47.410
     1
                   0
                      62592.87
                                     tier - 2 tier - 3
                                                             R1013
                                                                    30.360
                                                                              5.77
     2
                   3
                      60021.40
                                     tier - 1 tier - 1
                                                             R1012
                                                                    34.485
                                                                             11.87
     3
                      58571.07
                                     tier - 1 tier - 3
                                                                    38.095
                                                                              6.05
                   1
                                                             R1024
     4
                      55135.40
                                     tier - 1 tier - 2
                                                             R1012
                                                                    35.530
                                                                              5.45
     2330
                   0
                        637.26
                                     tier - 3
                                               tier - 3
                                                             R1013
                                                                    22.340
                                                                              5.57
     2331
                   0
                        604.54
                                     tier - 3
                                               tier - 3
                                                                    17.700
                                                                              6.28
                                                             R1013
     2332
                   0
                        600.00
                                     tier - 2
                                               tier - 1
                                                             R1013
                                                                    16.470
                                                                              6.35
     2333
                        570.62
                                                                              4.39
                   0
                                     tier - 2 tier - 1
                                                             R1013
                                                                    17.600
     2334
                   0
                        563.84
                                     tier - 2 tier - 3
                                                             R1013
                                                                    17.580
                                                                              4.51
          Heart Issues Any Transplants Cancer history NumberOfMajorSurgeries smoker
     0
                     No
                                      No
                                                      No
                                                                No major surgery
                                                                                      yes
     1
                     No
                                      Nο
                                                      No
                                                                No major surgery
                                                                                      yes
     2
                                      No
                                                      No
                    yes
                                                                                      yes
     3
                                      No
                     No
                                                      No
                                                                No major surgery
                                                                                      yes
     4
                     No
                                      No
                                                      No
                                                                No major surgery
                                                                                      yes
     2330
                     No
                                      No
                                                      No
                                                                                1
                                                                                       No
     2331
                                      No
                                                      No
                                                                                1
                                                                                       No
                     No
     2332
                     No
                                      No
                                                     Yes
                                                                                1
                                                                                       No
     2333
                     No
                                      No
                                                      No
                                                                                1
                                                                                       No
     2334
                                                                                1
                     No
                                      No
                                                      No
                                                                                       No
     [2335 rows x 17 columns]
[]: df.head()
       Customer ID
                                               year month
                                                            date
                                                                  children
                                                                              charges
                                        name
                                                                             63770.43
                Id1
                          Hawks, Ms.
                                               1968
                                                                          0
     0
                                       Kelly
                                                      Oct
                                                              12
```

[]: Id2 62592.87 1 Lehner, Mr. Matthew D 1977 Jun 8 0 2 3 Id3 Lu, Mr. Phil 1970 11 60021.40 3 Id4 Osborne, Ms. Kelsey 1991 Jun 6 1 58571.07 Id5 Kadala, Ms. Kristyn 1989 Jun 19 55135.40 Hospital tier City tier State ID BMIHBA1C Heart Issues 0 tier - 1 tier - 3 R1013 47.410 7.47 No 1 tier - 2 tier - 3 R1013 30.360 5.77 No 2 tier - 1 tier - 1 R1012 34.485 11.87 yes

```
3
            tier - 1 tier - 3
                                   R1024
                                          38.095
                                                    6.05
                                                                   No
     4
            tier - 1 tier - 2
                                   R1012
                                          35.530
                                                    5.45
                                                                   No
       Any Transplants Cancer history NumberOfMajorSurgeries smoker
                                    No
     0
                    No
                                             No major surgery
                                                                   yes
     1
                    No
                                    No
                                             No major surgery
                                                                   yes
     2
                    No
                                    No
                                                                   yes
     3
                    No
                                    No
                                             No major surgery
                                                                   yes
     4
                    No
                                             No major surgery
                                    No
                                                                   yes
[]: df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 2335 entries, 0 to 2334
    Data columns (total 17 columns):
     #
         Column
                                  Non-Null Count
                                                   Dtype
         _____
                                  _____
                                                   ____
     0
         Customer ID
                                  2335 non-null
                                                   object
     1
         name
                                  2335 non-null
                                                   object
     2
                                  2335 non-null
                                                   object
         year
     3
         month
                                  2335 non-null
                                                   object
     4
         date
                                  2335 non-null
                                                   int64
     5
         children
                                  2335 non-null
                                                   int64
     6
                                                   float64
         charges
                                  2335 non-null
     7
         Hospital tier
                                  2335 non-null
                                                   object
     8
         City tier
                                  2335 non-null
                                                   object
     9
         State ID
                                                   object
                                  2335 non-null
         BMI
     10
                                  2335 non-null
                                                   float64
     11
         HBA1C
                                  2335 non-null
                                                   float64
         Heart Issues
                                  2335 non-null
                                                   object
         Any Transplants
                                  2335 non-null
                                                   object
     14
         Cancer history
                                  2335 non-null
                                                   object
     15
         NumberOfMajorSurgeries
                                  2335 non-null
                                                   object
         smoker
                                  2335 non-null
                                                   object
     16
    dtypes: float64(3), int64(2), object(12)
    memory usage: 310.2+ KB
[]: # Finding Missing Values.
[]: df.isna().sum()
[]: Customer ID
                                0
                                0
     name
                                0
     year
                                0
     month
```

0

date children

charges

```
Hospital tier
                               0
                               0
     City tier
     State ID
                               0
     BMI
                               0
    HBA1C
                               0
    Heart Issues
                               0
     Any Transplants
                               0
     Cancer history
                               0
     NumberOfMajorSurgeries
                               0
     smoker
                               0
     dtype: int64
[]: # Finding trivial rows and its percentage.
[]: trivial_rows = df[df== "?"].count(axis=1).sum()
[]: trivial_rows
[]: 11
[]: total_rows = df.shape[0]
     total_rows
[]: 2335
[]: percentage = (trivial_rows/total_rows)*100
     percentage
[]: 0.47109207708779444
[]: print("The Percentage of trivial rows: {:.2f}%".format(percentage))
    The Percentage of trivial rows: 0.47%
[]: df = df[df != "?"].dropna()
[]: df.shape
[]: (2325, 17)
[]: df.describe()
[]:
                   date
                            children
                                           charges
                                                            BMI
                                                                        HBA1C
     count
           2325.000000
                         2325.000000
                                       2325.000000 2325.000000
                                                                 2325.000000
    mean
              15.572903
                            1.025376
                                      13521.660254
                                                      30.995630
                                                                     6.576718
    std
               8.720287
                            1.234456
                                      11863.492697
                                                       8.744938
                                                                     2.226892
    min
               1.000000
                            0.000000
                                        563.840000
                                                      15.010000
                                                                     4.000000
     25%
               8.000000
                            0.000000
                                       5116.500000
                                                                     4.900000
                                                      24.605000
     50%
              15.000000
                            0.000000
                                       9634.540000
                                                      30.400000
                                                                     5.810000
```

```
75%
              23.000000
                            2.000000 16903.500000
                                                      36.300000
                                                                    7.950000
              30.000000
                            5.000000 63770.430000
                                                      55.050000
                                                                    12.000000
    max
[]: # Handling nominal and ordinal categories.
[]: from sklearn.preprocessing import LabelEncoder
     le = LabelEncoder()
[]: df['Heart Issues'].value_counts()
[]: Heart Issues
            1405
    No
             920
     yes
     Name: count, dtype: int64
[]: df['Any Transplants'].value_counts()
[]: Any Transplants
    No
            2183
             142
     ves
     Name: count, dtype: int64
[]: df['Cancer history'].value_counts()
[]: Cancer history
     No
            1934
             391
     Yes
     Name: count, dtype: int64
[]: df['Heart Issues'] = le.fit transform(df['Heart Issues'])
     df['Any Transplants'] = le.fit_transform(df['Any Transplants'])
     df['Cancer history'] = le.fit_transform(df['Cancer history'])
     df['smoker'] = le.fit_transform(df['smoker'])
[]: df['Heart Issues'].value_counts()
[]: Heart Issues
          1405
     0
           920
     1
     Name: count, dtype: int64
[]: df['Any Transplants'].value_counts()
[]: Any Transplants
          2183
     0
           142
     1
     Name: count, dtype: int64
```

```
[]: df['Cancer history'].value_counts()
[]: Cancer history
    0
         1934
           391
     1
     Name: count, dtype: int64
[]: df['Hospital tier'].value_counts()
[]: Hospital tier
     tier - 2
                 1334
    tier - 3
                  691
                  300
    tier - 1
    Name: count, dtype: int64
[]: df['smoker'].value_counts()
[]: smoker
          1839
     0
     1
           486
     Name: count, dtype: int64
[]: df['Hospital tier'] = df['Hospital tier'].str.replace('tier -','')
[]: df['Hospital tier'].value_counts()
[]: Hospital tier
    2
          1334
     3
           691
           300
     1
     Name: count, dtype: int64
[]: df['City tier'].value_counts()
[]: City tier
    tier - 2
                 807
    tier - 3
                 789
     tier - 1
                 729
     Name: count, dtype: int64
[]: df['City tier'] = df['City tier'].str.replace('tier -','')
[]: df['City tier'].value_counts()
[]: City tier
     2
          807
     3
          789
     1
          729
```

Name: count, dtype: int64

[]:	df									
[]:		Customer I	D			name	e year	month	date \	\
	0 Id1				Hawks, Ms	s. Kelly	•	Oct	12	
	1	Id	12	Lehne	r, Mr. N	•		Jun	8	
	3 Id4 4 Id5			Osb	orne, Ms.	Jun	6			
				Kad	Osborne, Ms. Kelsey 1991 Kadala, Ms. Kristyn 1989					
	5	Id6		Baker	, Mr. Ru	ıssell B.	1962	Aug	4	
	 2330	 Id233	31	Brie	tzke, Mr.	 . Jordar	 1998	Jul	27	
	2331	Id233	32 Rivero	s Gonzalez,	Mr. Jua	an D. Sr.	1992	Sep	13	
	2332 Id2333 2333 Id2334 2334 Id2335			A	Albano, Ms. Julie 1993					
				Rosen	dahl, Mr.	. Evan F	1992	Nov	30	
				Ger	man, Mr.	Aaron H	1992	Jul	9	
		children	charges	Hospital t	ier City	tier Sta	ate ID	BMI	HBA1C	\
	0	0	63770.43		1	3	R1013	47.410	7.47	
	1	0	62592.87		2	3	R1013	30.360	5.77	
	3	1	58571.07		1	3	R1024	38.095	6.05	
	4	0	55135.40		1	2	R1012	35.530	5.45	
	5	0	52590.83		1	3	R1011	32.800	6.59	
	 2330	 0	 637.26	•••	 3	3	 R1013	22.340	5.57	
	2331	0	604.54		3		R1013	17.700	6.28	
	2332	0	600.00		2			16.470	6.35	
	2333	0	570.62		2	1	R1013	17.600	4.39	
	2334	0	563.84		2	3	R1013	17.580	4.51	
		Heart Iss	ues Any	Transplants	Cancer	history	Number	OfMajor	Surgerie	es \
	0		0	0		0	I	No majo	r surgei	ſУ
	1		0	0		0	I	No majo	r surgei	ſУ
	3		0	0		0	I	No majo	r surgei	ſУ
	4		0	0		0	I	No majo	r surgei	ſУ
	5		0	0		0	I	No majo	r surgei	су
	 2330	•••	0	0	•••	0		•••		1
	2331		0	0		0				1
	2332		0	0		1				1
	2333		0	0		0				1
	2334		0	0		0				1
		smoker								
	0 1									
	1	1								
	3	1								

```
5
                1
     2330
                0
     2331
                0
     2332
                0
     2333
                0
     2334
                0
     [2325 rows x 17 columns]
[]: # Filtering Based on Required STATE ID.
[]: df['State ID'].value_counts()
[]: State ID
    R1013
              609
     R1011
              574
    R1012
              572
    R1024
              159
    R1026
               84
    R1021
               70
    R1016
               64
    R1025
               40
    R1023
               38
    R1017
               36
    R1019
               26
    R1022
               14
    R1014
               13
    R1015
               11
    R1018
                9
     R1020
                6
     Name: count, dtype: int64
[]: df['state_group'] = np.where((df['State ID'] == 'R1011') | (df['State ID'] ==__

¬'R1012') | (df['State ID'] == 'R1013'), df['State ID'], 'other')
[]: df
[]:
          Customer ID
                                                      name
                                                             year month
                                                                         date
                  Id1
                                         Hawks, Ms. Kelly
                                                                           12
     0
                                                             1968
                                                                    Oct
     1
                  Id2
                                    Lehner, Mr. Matthew D
                                                             1977
                                                                            8
                                                                    Jun
     3
                  Id4
                                      Osborne, Ms. Kelsey
                                                                            6
                                                            1991
                                                                    Jun
                  Id5
     4
                                      Kadala, Ms. Kristyn 1989
                                                                    Jun
                                                                           19
     5
                  Id6
                                    Baker, Mr. Russell B. 1962
                                                                    Aug
                                                                            4
     2330
               Id2331
                                     Brietzke, Mr. Jordan 1998
                                                                    Jul
                                                                           27
```

1

```
2331
           Id2332
                   Riveros Gonzalez, Mr. Juan D. Sr.
                                                           1992
                                                                   Sep
                                                                           13
2332
           Id2333
                                     Albano, Ms.
                                                    Julie 1993
                                                                           30
                                                                   Jun
2333
           Id2334
                                 Rosendahl, Mr. Evan P
                                                           1992
                                                                   Nov
                                                                           30
2334
           Id2335
                                   German, Mr. Aaron K 1992
                                                                            9
                                                                   Jul
                  charges Hospital tier City tier State ID
                                                                         HBA1C
      children
                                                                    BMI
0
              0
                 63770.43
                                         1
                                                    3
                                                         R1013
                                                                 47.410
                                                                          7.47
1
                 62592.87
                                        2
                                                    3
                                                         R1013
                                                                 30.360
                                                                           5.77
              0
3
                 58571.07
              1
                                         1
                                                    3
                                                         R1024
                                                                 38.095
                                                                           6.05
4
              0
                 55135.40
                                         1
                                                    2
                                                         R1012
                                                                 35.530
                                                                           5.45
                                                    3
5
                 52590.83
                                         1
                                                         R1011
                                                                 32.800
                                                                           6.59
2330
              0
                   637.26
                                         3
                                                    3
                                                         R1013
                                                                22.340
                                                                           5.57
                   604.54
                                                                           6.28
2331
              0
                                         3
                                                    3
                                                         R1013
                                                                17.700
2332
              0
                   600.00
                                         2
                                                         R1013
                                                                 16.470
                                                                           6.35
                                                    1
2333
                   570.62
                                         2
                                                                           4.39
              0
                                                    1
                                                         R1013
                                                                17.600
                                         2
2334
              0
                   563.84
                                                    3
                                                         R1013
                                                                17.580
                                                                           4.51
                     Any Transplants
                                        Cancer history NumberOfMajorSurgeries
      Heart Issues
0
                  0
                                                       0
                                                                No major surgery
1
                  0
                                     0
                                                       0
                                                                No major surgery
                                     0
3
                  0
                                                       0
                                                               No major surgery
4
                  0
                                     0
                                                       0
                                                                No major surgery
5
                  0
                                     0
                                                       0
                                                                No major surgery
•••
2330
                  0
                                     0
                                                       0
                                                                                1
2331
                                                       0
                                                                                1
                  0
                                     0
2332
                  0
                                     0
                                                       1
                                                                                1
2333
                                     0
                  0
                                                       0
                                                                                1
                                     0
2334
                  0
                                                       0
                                                                                1
      smoker state_group
0
            1
                    R1013
            1
1
                    R1013
3
            1
                    other
4
            1
                    R1012
5
            1
                    R1011
2330
            0
                    R1013
2331
            0
                    R1013
2332
            0
                    R1013
2333
            0
                    R1013
2334
                    R1013
```

[2325 rows x 18 columns]

```
[]: df=df[df["State ID"].isin(['R1011','R1012','R1013'])]
     df.shape
     df["State ID"]=le.fit_transform(df["State ID"])
     df["State ID"].unique()
[]: array([2, 1, 0])
[]: df['state_group'].value_counts()
[]: state_group
     R1013
              609
     R1011
              574
     R1012
              572
     Name: count, dtype: int64
[]: df["state_group"].replace('R1011',1,inplace=True)
     df["state_group"].replace('R1012',2,inplace=True)
     df["state_group"].replace('R1013',3,inplace=True)
     df["state_group"].replace('other',0,inplace=True)
[]: df
[]:
          Customer ID
                                                       name
                                                             year month date \
     0
                  Id1
                                         Hawks, Ms.
                                                      Kelly
                                                             1968
                                                                     Oct
                                                                            12
     1
                  Td2
                                    Lehner, Mr. Matthew D
                                                             1977
                                                                     Jun
                                                                             8
                                      Kadala, Ms. Kristyn 1989
     4
                  Id5
                                                                     Jun
                                                                            19
     5
                  Id6
                                    Baker, Mr. Russell B.
                                                             1962
                                                                     Aug
                                                                             4
     6
                  Id7
                                    Macpherson, Mr.
                                                      Scott 1994
                                                                     Oct
                                                                            27
     2330
                                     Brietzke, Mr.
                                                     Jordan 1998
               Id2331
                                                                     Jul
                                                                            27
     2331
               Id2332
                       Riveros Gonzalez, Mr.
                                                Juan D. Sr.
                                                             1992
                                                                            13
                                                                     Sep
     2332
               Id2333
                                        Albano, Ms.
                                                      Julie
                                                             1993
                                                                     Jun
                                                                            30
     2333
               Id2334
                                    Rosendahl, Mr.
                                                     Evan P
                                                             1992
                                                                     Nov
                                                                            30
     2334
               Id2335
                                      German, Mr. Aaron K 1992
                                                                     Jul
                                                                             9
           children
                      charges Hospital tier City tier
                                                         State ID
                                                                     BMI
                                                                           HBA1C
     0
                  0
                     63770.43
                                                                2
                                                                   47.41
                                                                            7.47
                                            1
                                                      3
                                            2
                                                                2
     1
                  0
                     62592.87
                                                      3
                                                                   30.36
                                                                            5.77
                                                      2
     4
                  0
                     55135.40
                                            1
                                                                1
                                                                   35.53
                                                                            5.45
                     52590.83
                                                      3
     5
                                            1
                                                                   32.80
                                                                            6.59
     6
                  1
                     51194.56
                                            1
                                                      3
                                                                   36.40
                                                                            6.07
                      •••
                                           •••
     2330
                  0
                       637.26
                                           3
                                                      3
                                                                2 22.34
                                                                            5.57
                                                                            6.28
     2331
                  0
                       604.54
                                            3
                                                      3
                                                                2 17.70
     2332
                  0
                       600.00
                                           2
                                                                2 16.47
                                                                            6.35
                                                      1
                  0
                       570.62
                                            2
                                                      1
                                                                2 17.60
                                                                            4.39
     2333
                                            2
     2334
                  0
                       563.84
                                                      3
                                                                2 17.58
                                                                            4.51
```

```
Heart Issues
                          Any Transplants
                                            Cancer history NumberOfMajorSurgeries
     0
                                                           0
                                                                    No major surgery
                       0
                                          0
                                                           0
     1
                                                                    No major surgery
     4
                       0
                                          0
                                                           0
                                                                   No major surgery
     5
                       0
                                          0
                                                           0
                                                                   No major surgery
                                          0
                                                           0
                                                                   No major surgery
     6
                       0
                                          0
                                                           0
     2330
                       0
                                                                                    1
     2331
                                          0
                                                           0
                                                                                    1
                       0
     2332
                                          0
                       0
                                                           1
     2333
                       0
                                          0
                                                           0
                                                                                    1
     2334
                       0
                                                           0
                                                                                    1
           smoker
                    state_group
     0
                 1
                               3
                 1
                               3
     1
     4
                 1
                               2
     5
                 1
                               1
     6
                 1
                               1
     2330
                               3
                 0
     2331
                 0
                               3
     2332
                               3
                 0
     2333
                 0
                               3
     2334
                               3
     [1755 rows x 18 columns]
[]: # Handling "Number of Major Surgeries" column.
[]: df['NumberOfMajorSurgeries'].replace('No major surgery','0',inplace = True)
    df.tail(10)
[]:
          Customer ID
                                                                            date
                                                         name
                                                               year month
     2325
                                                                               9
                Id2326
                                     Castro, Mr. Sebastian
                                                               1997
                                                                       Nov
     2326
                Id2327
                                          Howell, Ms.
                                                       Laura
                                                               2002
                                                                       Nov
                                                                              29
     2327
                Id2328
                                          Avery, Ms. Nicole
                                                               1995
                                                                       Jul
                                                                               4
     2328
                Id2329
                                     Bohinski, Ms.
                                                     Susan E
                                                               1993
                                                                       Jun
                                                                               1
     2329
                Id2330
                                            Kohls, Ms. Katy
                                                               2001
                                                                       Nov
                                                                              20
     2330
                                      Brietzke, Mr.
                Id2331
                                                      Jordan
                                                               1998
                                                                              27
                                                                       Jul
     2331
                        Riveros Gonzalez, Mr. Juan D. Sr.
                                                               1992
                Id2332
                                                                              13
                                                                       Sep
                                          Albano, Ms.
     2332
                Id2333
                                                        Julie
                                                               1993
                                                                       Jun
                                                                              30
                                     Rosendahl, Mr. Evan P
                                                               1992
     2333
                Id2334
                                                                       Nov
                                                                              30
     2334
                Id2335
                                        German, Mr. Aaron K 1992
                                                                       Jul
                                                                               9
```

```
charges Hospital tier City tier State ID
           children
                                                                       BMI HBA1C \
     2325
                   0
                       670.00
                                            3
                                                       3
                                                                 2 20.10
                                                                             5.60
                                            3
                                                       2
                                                                    21.77
     2326
                   0
                       668.00
                                                                 1
                                                                            10.67
     2327
                                            3
                                                       3
                                                                 2 17.82
                                                                             5.26
                   0
                       650.00
     2328
                   0
                       650.00
                                            3
                                                       3
                                                                 2 17.07
                                                                             5.22
     2329
                   0
                       646.14
                                            3
                                                       3
                                                                 1 22.24
                                                                             4.29
     2330
                       637.26
                                                                 2 22.34
                   0
                                            3
                                                       3
                                                                             5.57
     2331
                   0
                       604.54
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                                                       3
                                                                 2 17.70
                                                                             6.28
     2332
                   0
                       600.00
                                            2
                                                       1
                                                                 2 16.47
                                                                             6.35
     2333
                   0
                       570.62
                                            2
                                                       1
                                                                 2 17.60
                                                                             4.39
     2334
                   0
                       563.84
                                                       3
                                                                 2 17.58
                                                                             4.51
                          Any Transplants Cancer history NumberOfMajorSurgeries
           Heart Issues
     2325
                       1
                                          0
                                                           1
     2326
                       0
                                          0
                                                           0
                                                                                    0
                                                           0
     2327
                                          0
                                                                                    1
                       1
     2328
                                          0
                       0
                                                           1
                                                                                    1
     2329
                       1
                                          0
                                                           0
                                                                                    0
     2330
                       0
                                          0
                                                           0
                                                                                    1
     2331
                       0
                                          0
                                                           0
                                                                                    1
     2332
                       0
                                          0
                                                           1
                                                                                    1
     2333
                                          0
                                                           0
                                                                                    1
                       0
     2334
                       0
                                          0
                                                           0
                                                                                    1
           smoker
                    state_group
     2325
                 0
                               3
     2326
                               2
                 0
     2327
                 0
                               3
     2328
                 0
                               3
     2329
                               2
                 0
     2330
                 0
                               3
     2331
                 0
                               3
     2332
                 0
                               3
     2333
                               3
                 0
     2334
                 0
[]: # Calculating Age.
[]: df['year'] = df.year.astype(int)
[]: df.dtypes
[]: Customer ID
                                  object
     name
                                  object
     year
                                   int32
     month
                                  object
     date
                                   int64
```

```
charges
                                float64
     Hospital tier
                                 object
     City tier
                                 object
     State ID
                                  int32
     BMI
                                float64
     HBA1C
                                float64
     Heart Issues
                                  int32
     Any Transplants
                                  int32
     Cancer history
                                  int32
     NumberOfMajorSurgeries
                                 object
     smoker
                                  int32
     state_group
                                  int64
     dtype: object
[]: df['Age'] = 2024 - df['year']
[]: df
[]:
          Customer ID
                                                       name
                                                             year month
                                                                          date
                  Id1
                                          Hawks, Ms.
                                                      Kelly
                                                             1968
                                                                     Oct
                                                                            12
                  Id2
                                                             1977
     1
                                    Lehner, Mr.
                                                  Matthew D
                                                                     Jun
                                                                             8
     4
                  Id5
                                       Kadala, Ms. Kristyn
                                                             1989
                                                                     Jun
                                                                            19
                                    Baker, Mr. Russell B.
     5
                  Id6
                                                              1962
                                                                     Aug
                                                                             4
     6
                  Id7
                                    Macpherson, Mr.
                                                      Scott
                                                             1994
                                                                            27
                                                                     Oct
               Id2331
                                     Brietzke, Mr.
                                                     Jordan 1998
                                                                            27
     2330
                                                                     Jul
     2331
                       Riveros Gonzalez, Mr.
               Id2332
                                                Juan D. Sr.
                                                             1992
                                                                     Sep
                                                                            13
     2332
               Id2333
                                        Albano, Ms. Julie 1993
                                                                     Jun
                                                                            30
     2333
               Id2334
                                    Rosendahl, Mr. Evan P 1992
                                                                            30
                                                                     Nov
     2334
               Id2335
                                       German, Mr. Aaron K 1992
                                                                     Jul
                                                                             9
           children
                       charges Hospital tier City tier
                                                         State ID
                                                                      BMI
                                                                           HBA1C \
     0
                  0
                     63770.43
                                                      3
                                                                 2
                                                                    47.41
                                                                            7.47
                                            1
                     62592.87
                                            2
                                                      3
                                                                    30.36
                                                                            5.77
     1
                  0
                                                      2
     4
                  0
                     55135.40
                                            1
                                                                 1
                                                                    35.53
                                                                            5.45
     5
                     52590.83
                                            1
                                                      3
                                                                    32.80
                                                                            6.59
     6
                     51194.56
                                                      3
                                                                    36.40
                  1
                                            1
                                                                            6.07
                        637.26
                                                                 2 22.34
     2330
                  0
                                            3
                                                      3
                                                                            5.57
                                            3
                                                                            6.28
     2331
                  0
                       604.54
                                                      3
                                                                 2 17.70
                                            2
     2332
                  0
                       600.00
                                                      1
                                                                 2 16.47
                                                                            6.35
                       570.62
                                                                            4.39
     2333
                  0
                                            2
                                                      1
                                                                    17.60
     2334
                  0
                        563.84
                                                      3
                                                                    17.58
                                                                            4.51
           Heart Issues Any Transplants Cancer history NumberOfMajorSurgeries \
     0
                       0
                                        0
                                                         0
```

int64

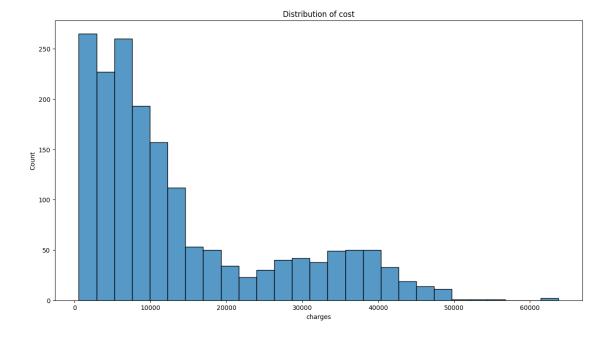
children

```
4
                       0
                                          0
                                                           0
                                                                                    0
     5
                                                                                    0
                                          0
                                                           0
     6
                                                                                    0
                       0
                                          0
                                                           0
     2330
                                          0
                                                           0
                       0
                                                                                    1
     2331
                       0
                                          0
                                                           0
                                                                                    1
     2332
                       0
                                          0
                                                           1
                                                                                    1
     2333
                                          0
                                                           0
                       0
                                                                                    1
     2334
                       0
                                          0
                                                           0
                                                                                    1
           smoker
                    state_group
                                  Age
     0
                 1
                                   56
                 1
                                   47
     1
                               3
     4
                 1
                               2
                                   35
     5
                 1
                               1
                                   62
     6
                                   30
                 1
                               1
                               3
                                   26
     2330
                 0
                               3
                                   32
     2331
                 0
     2332
                 0
                               3
                                   31
                               3
     2333
                 0
                                   32
     2334
                 0
                                   32
     [1755 rows x 19 columns]
[]: # Calculating Gender From the Given "Name".
[]: gender = ['0' if 'Mr.' in name else '1' for name in df['name']]
     df["Gender"] = gender
[]: df.head()
[]:
       Customer ID
                                         name
                                               year month
                                                            date
                                                                  children
                                                                               charges \
                Id1
                                                                             63770.43
                          Hawks, Ms.
                                       Kelly
                                               1968
                                                       Oct
                                                              12
     1
                Id2
                     Lehner, Mr.
                                   Matthew D
                                               1977
                                                       Jun
                                                               8
                                                                          0
                                                                             62592.87
                       Kadala, Ms. Kristyn
     4
                Id5
                                               1989
                                                       Jun
                                                              19
                                                                          0
                                                                             55135.40
                     Baker, Mr. Russell B.
                                                                             52590.83
     5
                Id6
                                               1962
                                                       Aug
                                                               4
                     Macpherson, Mr. Scott
                Id7
                                               1994
                                                       Oct
                                                              27
                                                                             51194.56
       Hospital tier City tier State ID
                                               BMI
                                                    HBA1C
                                                            Heart Issues \
                                          2
                                            47.41
                                                      7.47
     0
                    1
                               3
                                                                        0
                    2
                                          2 30.36
                                                      5.77
     1
                               3
                                                                        0
                    1
                               2
                                             35.53
                                                      5.45
                                                                        0
     4
     5
                    1
                               3
                                             32.80
                                                      6.59
                                                                        0
                               3
                                          0 36.40
                                                      6.07
```

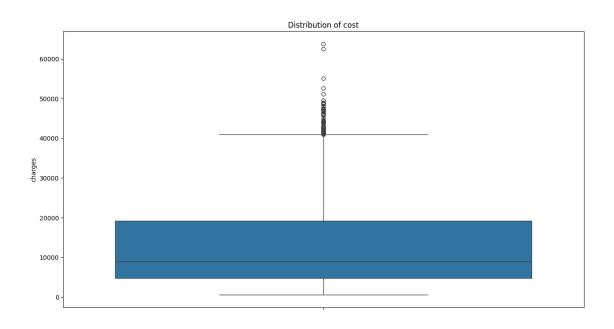
```
Any Transplants
                      Cancer history NumberOfMajorSurgeries
                                                                   smoker
0
                                                                         1
                                     0
                                                                0
                   0
1
                                                                         1
                                     0
                                                                0
4
                   0
                                                                         1
5
                   0
                                     0
                                                                0
                                                                         1
6
                   0
                                     0
                                                                0
                                                                         1
                  Age Gender
   state_group
0
                   56
1
              3
                   47
                            0
              2
                   35
4
                            1
5
              1
                   62
                            0
                            0
                   30
```

```
[]: # Distribution of costs using a histogram, box and whisker plot, and swarm \rightarrow plot.
```

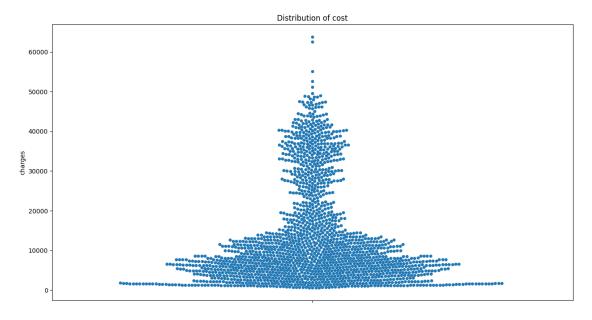
```
[]: plt.figure(figsize=(15,8))
    sns.histplot(df['charges'])
    plt.title('Distribution of cost')
    plt.show()
```



```
[]: plt.figure(figsize=(15,8))
    sns.boxplot(df['charges'])
    plt.title('Distribution of cost')
    plt.show()
```

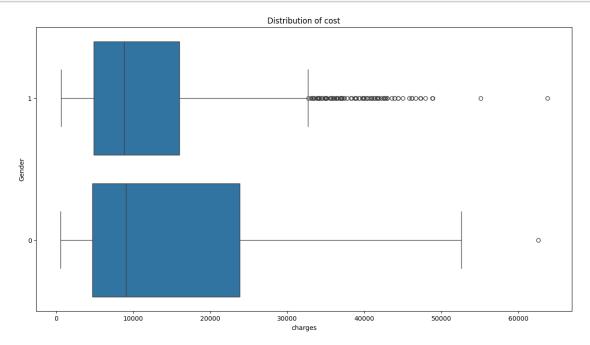


```
[]: plt.figure(figsize=(15,8))
sns.swarmplot(df['charges'])
plt.title('Distribution of cost')
plt.show()
```



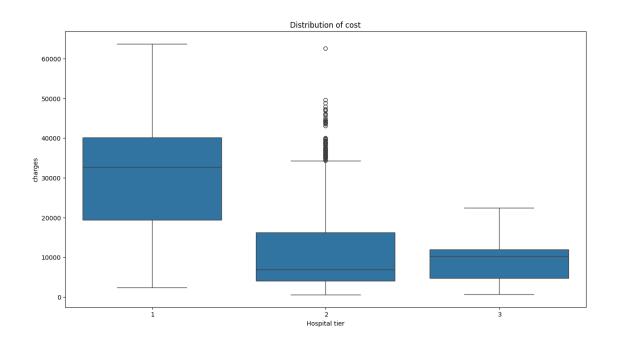
[]: # Distribution of charges across gender.

```
[]: plt.figure(figsize=(15,8))
    sns.boxplot(x = 'charges', y = 'Gender',data = df)
    plt.title('Distribution of cost')
    plt.show()
```



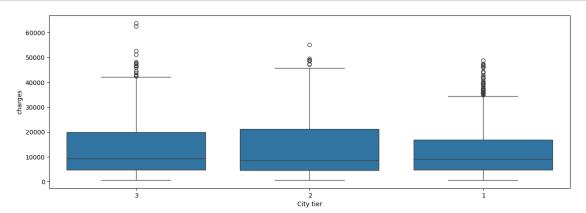
```
[]: #Distribution of charges across Hospital tier.
```

```
[]: plt.figure(figsize=(15,8))
sns.boxplot(x = 'Hospital tier', y = 'charges',data = df)
plt.title('Distribution of cost')
plt.show()
```



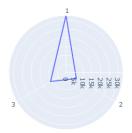
[]: #Distribution of charges across city tier.

```
[]: plt.figure(figsize = (15,5))
sns.boxplot(x = "City tier",y = "charges", data = df)
plt.show()
```

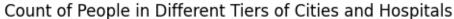


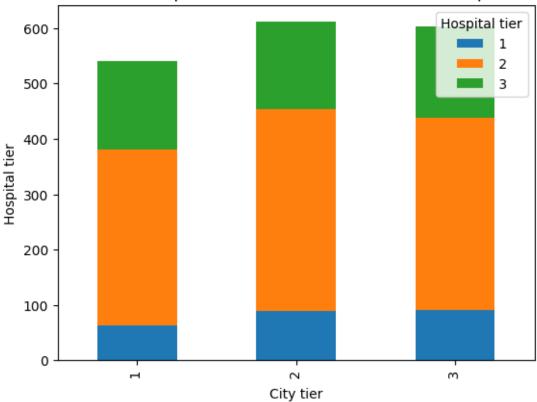
```
[]: # Radar Chart.
[]: median = df.groupby('Hospital tier')[['charges']].median().reset_index()
[]: import plotly.express as px
    fig = px.line_polar(median, r='charges', theta='Hospital tier', line_close=True)
```

```
fig.show()
```



```
[]: # Frequency Table.
[]: table = pd.crosstab(df['City tier'], df['Hospital tier'])
     print(table)
    Hospital tier
                    1
                         2
                              3
    City tier
                       317
                            160
    1
                   64
    2
                   89
                       365
                            157
    3
                   91
                       348
                           164
[]: # Stacked Bar Chart.
[]: table.plot(kind='bar', stacked=True)
     plt.xlabel('City tier')
     plt.ylabel('Hospital tier')
     plt.title('Count of People in Different Tiers of Cities and Hospitals')
     plt.show()
```





```
[]: | # Testing Null Hypothesis
```

[]: # Average hospitalization costs for the three types of hospitals are not $_$ $_$ significantly different.

Null Hypothesis => Average hospitalization costs for the three types of hospitals are not significantly different.

P-value : nan

```
[]: \# Average hospitalization costs for the three types of cities are not \sqcup
      ⇔significantly different.
[]: print('Null Hypothesis => Average hospitalization costs for the three types of ⊔
     ⇔cities are not significantly different.')
     f_val, p_val = stats.f_oneway(df[df['City tier'] == 'tier,1']['charges'],
                                   df[df['City tier'] == 'tier,2']['charges'],
                                   df[df['City tier'] == 'tier,3']['charges'])
     print('P-value :',p_val)
     if p_val < 0.05:</pre>
         print("Reject null hypothesis")
     else:
         print("Accept null hypothesis")
    Null Hypothesis => Average hospitalization costs for the three types of cities
    are not significantly different.
    P-value : nan
    Accept null hypothesis
[]: # Average hospitalization costs for smokers is not significantly different from
      → the average cost for nonsmokers.
[]: print('Null Hypothesis => Average hospitalization costs for smokers is not⊔
      ⇒significantly different from the average cost for nonsmokers.')
     t val, p val = stats.ttest ind(df[df['smoker'] == 'yes']['charges'],
                                   df[df['smoker'] == 'no']['charges'])
     print('P-value :',p_val)
     if p val < 0.05:
         print("Reject null hypothesis")
     else:
         print("Accept null hypothesis")
    Null Hypothesis => Average hospitalization costs for smokers is not
    significantly different from the average cost for nonsmokers.
    P-value : nan
    Accept null hypothesis
[]: # Smoking and heart issues are independent.
[]: from scipy.stats import chi2_contingency
     contingency_table = pd.crosstab(df['smoker'], df['Heart Issues'])
     chi2, p, dof, expected = chi2_contingency(contingency_table)
     print(f'P-value = {p}')
     if p < 0.05:
```

P-value = 0.9107065371179246

2332

Accept null hypothesis, Smoking and heart issues are independent.

```
[]: df.drop(["Customer ID", 'name'], inplace=True, axis=1) df
```

[]:		year m	onth	date	children	. ch	arges	Hospita	ıl tier	City	tier	State	ID	\
	0	1968	Oct	12	0	637	70.43	-	1	•	3		2	
	1	1977	Jun	8	0	625	92.87		2		3		2	
	4	1989	Jun	19	0	551	35.40		1		2		1	
	5	1962	Aug	4	0	525	90.83		1		3		0	
	6	1994	Oct	27	1	511	94.56		1		3		0	
			•••		•••			••		•••				
	2330	1998	Jul	27	0	6	37.26		3		3		2	
	2331	1992	Sep	13	0	6	04.54		3		3		2	
	2332	1993	Jun	30	0	6	00.00		2		1		2	
	2333	1992	Nov	30	0		70.62		2		1		2	
	2334	1992	Jul	9	0	5	63.84		2		3		2	
		BMI	HBA1C	' Uoor	t Taanoa	Anss	Tron	anlanta	Canca	r hia	+ 0 2717	\		
	0	47.41	7.47		t Issues 0	-	Iralli	splants 0	Cance	r mis	0	\		
	1	30.36	5.77		0			0			0			
	4	35.53	5.45		0			0			0			
	5	32.80	6.59		0			0			0			
	6	36.40	6.07		0			0			0			
					ŭ		•••	v			Ů			
		5.57		0			0			0				
	2331	17.70	6.28		0			0			0			
	2332	16.47	6.35	j	0			0			1			
	2333	17.60	4.39		0			0			0			
	2334	17.58	4.51		0			0			0			
	NumberOfMajorSurgeries smol								A C					
	0	Numberu	ıımajor	Surger	o smo	ker 1	state.	_group 3	age Ge	naer 1				
	1				0	1		3	47	0				
	4				0	1		2	35	1				
	5				0	1		1	62	0				
	5 6				0	1		1	62 30	0				
	U				U	1			30	U				
	 2330			•••	 1	0	•••	 3	26	0				
	2331				1	0		3	32	0				
	2001				±	0		0	02	4				

3 31

1

0

1

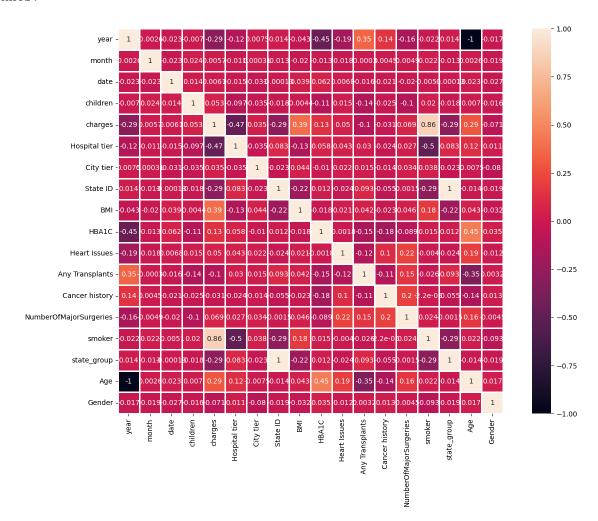
```
2333 1 0 3 32 0
2334 1 0 3 32 0
```

[1755 rows x 18 columns]

[]: # correlation between predictors to identify highly correlated predictors using $_$ $_$ +Heatmap.

```
[]: plt.figure(figsize=(15,10))
sns.heatmap(df.corr(),square=True,annot=True,linewidths=1)
```

[]: <Axes: >



```
[ ]: # MACHINE LEARNING :
[]: # Regression Model.
[]: from sklearn.model selection import train test split
[]: x = df.drop(["charges"], axis=1)
     y = df['charges']
     x_train, x_test, y_train, y_test = train_test_split(x,y, test_size=.
      \rightarrow20, random state=10)
     from sklearn.preprocessing import StandardScaler
     sc = StandardScaler()
     x_train = sc.fit_transform(x_train)
     x_test = sc.fit_transform(x_test)
     from sklearn.linear_model import SGDRegressor
[]: from sklearn.model_selection import GridSearchCV
     params = { 'alpha': [0.0001, 0.001, 0.01, 0.05, 0.1, 0.2,0.3,0.4,0.5,
     0.6, 0.7, 0.8, 0.9, 1.0, 2.0, 3.0, 4.0, 5.0, 6.0, 7.0, 8.0,
     9.0,10.0,20,50,100,500,1000],
     'penalty': ['12', '11', 'elasticnet']}
     sgd = SGDRegressor()
     # Cross Validation
     folds = 5
     model_cv = GridSearchCV(estimator = sgd,
     param_grid = params,
     scoring = 'neg_mean_absolute_error',
     cv = folds,
     return_train_score = True,
     verbose = 1)
     model cv.fit(x train,y train)
    Fitting 5 folds for each of 84 candidates, totalling 420 fits
[]: GridSearchCV(cv=5, estimator=SGDRegressor(),
                  param_grid={'alpha': [0.0001, 0.001, 0.01, 0.05, 0.1, 0.2, 0.3,
                                        0.4, 0.5, 0.6, 0.7, 0.8, 0.9, 1.0, 2.0, 3.0,
                                         4.0, 5.0, 6.0, 7.0, 8.0, 9.0, 10.0, 20, 50,
                                         100, 500, 1000],
                               'penalty': ['12', '11', 'elasticnet']},
                  return_train_score=True, scoring='neg_mean_absolute_error',
                  verbose=1)
[]: model_cv.best_params_
[]: {'alpha': 100, 'penalty': 'l1'}
[]: sgd = SGDRegressor(alpha= 100, penalty= 'l1')
```

```
[]: sgd.fit(x_train, y_train)
[]: SGDRegressor(alpha=100, penalty='11')
[]: sgd.score(x_test, y_test)
[]: 0.8834193279397483
[]: y_pred = sgd.predict(x_test)
[]: from sklearn.metrics import mean squared error, mean absolute error
     sgd_mae = mean_absolute_error(y_test, y_pred)
     sgd_mse = mean_squared_error(y_test, y_pred)
     sgd_rmse = sgd_mse*(1/2.0)
[]: print("MAE:", sgd_mae)
     print("MSE:", sgd_mse)
     print("RMSE:", sgd_rmse)
    MAE: 2803.6752966121044
    MSE: 18823121.259697914
    RMSE: 9411560.629848957
[]: importance = sgd.coef_
     pd.DataFrame(importance, index = x.columns, columns=['Feature imp'])
[]:
                             Feature_imp
    year
                            -1781.166092
    month
                              -80.385998
                              -45.058187
     date
     children
                              353.246285
    Hospital tier
                            -1217.079141
                                0.000000
     City tier
     State ID
                              -55.376234
    BMI
                             2734.018350
    HBA1C
                              156.008362
    Heart Issues
                                0.000000
    Any Transplants
                               52.446010
     Cancer history
                                0.000000
     NumberOfMajorSurgeries
                               23.963606
     smoker
                             9561.231409
     state_group
                              -55.376234
     Age
                             1781.166092
     Gender
                                0.000000
[]: from sklearn.ensemble import RandomForestRegressor
     rf = RandomForestRegressor(n_estimators = 1000, random_state = 42)
     rf.fit(x_train, y_train)
```

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RandomForestRegressor(n_estimators=1000, random_state=42)
     score = rf.score(x_test,y_test)
     score
[]: 0.9254277982049066
[ ]: y_pred = rf.predict(x_test)
     rf_mae = mean_absolute_error(y_test, y_pred)
     rf_mae
[]: 2000.671016894581
[]: from sklearn.ensemble import GradientBoostingRegressor
     gbr = GradientBoostingRegressor(n_estimators = 1000, random_state = 42)
     gbr.fit(x_train, y_train)
[]: GradientBoostingRegressor(n_estimators=1000, random_state=42)
[]: score = gbr.score(x_test,y_test)
     score
[]: 0.9041039008686199
[]: y_pred = gbr.predict(x_test)
     gbr_mae = mean_absolute_error(y_test, y_pred)
     gbr_mae
[]: 2567.9912072119014
[]: df.columns
[]: Index(['year', 'month', 'date', 'children', 'charges', 'Hospital tier',
            'City tier', 'State ID', 'BMI', 'HBA1C', 'Heart Issues',
            'Any Transplants', 'Cancer history', 'NumberOfMajorSurgeries', 'smoker',
            'state_group', 'Age', 'Gender'],
           dtype='object')
[]: # Given Case Scenario.
[]: df1= pd.DataFrame({ 'year' : [1998], 'month' : [12] ,'date': [28],
                           'city_tier' : [1], 'children' : [2],
                            'HbA1c' : [5.8],
                            'smoker_yes' : [1],
                            'heart_issues_yes' : [0],
                            'any transplants yes' : [0],
                            'numberofmajorsurgeries' :[ 0],
                            'cancer_history_yes' : [1],
                            'hospital_tier' : [1],
```

```
'bmi' : [85/(1.70 **2)], 'age' : [25], 'Gender' : [
     'state_id_R1011' : [1]
                         })
[]: # Predicting Hospital cost.
[]: Hospital_cost = []
[]: Cost1 = sgd.predict(df1)
    Hospital_cost.append(Cost1)
    Cost2 = rf.predict(df1)
    Hospital_cost.append(Cost2)
    Cost3 = gbr.predict(df1)
    Hospital_cost.append(Cost3)
    avg_cost = np.mean(Hospital_cost)
    avg_cost
[]: -1076629.4613465841
[]:
```