

D214_Capstone_JWillis

September 8, 2022

0.0.1 D214 - Capstone - PA2

0.0.2 Background Info:

- PA 1 is complete.
- PA 2: Prep data for ANOVA analysis and to export to Tableau.

A1 Question: Is communication from a doctor more statistically significant to a patients overall hospital rating than a nurse?

```
[1]: # Standard libraries

import pandas as pd
import numpy as np
import scipy as sc
import matplotlib.pyplot as plt
%matplotlib inline
import seaborn as sns
import statsmodels as stats
from pandas import DataFrame
from scipy.stats import kurtosis, skew
from matplotlib.ticker import StrMethodFormatter

# get ANOVA table
import statsmodels.api as sm
import statsmodels.formula.api as smf
from statsmodels.formula.api import ols

## Handle Warnings
import warnings
warnings.filterwarnings('ignore')
## Warnings filter
from warnings import simplefilter
# ignore all future warnings
simplefilter(action='ignore', category=FutureWarning)
#
## Timer for debugging
#%%time
#%%timeit
```

```
[2]: from platform import python_version
print('The python version used is: %s' % python_version())
```

The python version used is: 3.9.13

** Load Data

```
[3]: # load data file
df = pd.read_csv('HCAHPS-Hospital.csv')
# quick test the data is present and see the shape
df.head(5) # DtypeWarning: Columns (12,14,17,19) have mixed types. Specify
↳ dtype option on import or set low_memory=False.
```

```
[3]: Facility ID          Facility Name          Address \
0      010001  SOUTHEAST HEALTH MEDICAL CENTER  1108 ROSS CLARK CIRCLE
1      010001  SOUTHEAST HEALTH MEDICAL CENTER  1108 ROSS CLARK CIRCLE
2      010001  SOUTHEAST HEALTH MEDICAL CENTER  1108 ROSS CLARK CIRCLE
3      010001  SOUTHEAST HEALTH MEDICAL CENTER  1108 ROSS CLARK CIRCLE
4      010001  SOUTHEAST HEALTH MEDICAL CENTER  1108 ROSS CLARK CIRCLE

      City State  ZIP Code  County Name  Phone Number  HCAHPS Measure ID \
0  DOTHAN      AL    36301    HOUSTON  (334) 793-8701      H_COMP_1_A_P
1  DOTHAN      AL    36301    HOUSTON  (334) 793-8701      H_COMP_1_SN_P
2  DOTHAN      AL    36301    HOUSTON  (334) 793-8701      H_COMP_1_U_P
3  DOTHAN      AL    36301    HOUSTON  (334) 793-8701  H_COMP_1_LINEAR_SCORE
4  DOTHAN      AL    36301    HOUSTON  (334) 793-8701  H_COMP_1_STAR_RATING

      HCAHPS Question ... \
0  Patients who reported that their nurses "Alway... ...
1  Patients who reported that their nurses "Somet... ...
2  Patients who reported that their nurses "Usual... ...
3      Nurse communication - linear mean score ...
4      Nurse communication - star rating ...

      Patient Survey Star Rating Footnote HCAHPS Answer Percent \
0                                     NaN                77
1                                     NaN                7
2                                     NaN               16
3                                     NaN      Not Applicable
4                                     NaN      Not Applicable

      HCAHPS Answer Percent Footnote HCAHPS Linear Mean Value \
0                                     NaN      Not Applicable
1                                     NaN      Not Applicable
2                                     NaN      Not Applicable
3                                     NaN                90
4                                     NaN      Not Applicable
```

	Number of Completed Surveys	Number of Completed Surveys	Footnote	\
0	501		NaN	
1	501		NaN	
2	501		NaN	
3	501		NaN	
4	501		NaN	

	Survey Response Rate Percent	Survey Response Rate Percent	Footnote	\
0	19		NaN	
1	19		NaN	
2	19		NaN	
3	19		NaN	
4	19		NaN	

	Start Date	End Date
0	10/01/2020	09/30/2021
1	10/01/2020	09/30/2021
2	10/01/2020	09/30/2021
3	10/01/2020	09/30/2021
4	10/01/2020	09/30/2021

[5 rows x 22 columns]

```
[4]: df.columns
```

```
[4]: Index(['Facility ID', 'Facility Name', 'Address', 'City', 'State', 'ZIP Code',
        'County Name', 'Phone Number', 'HCAHPS Measure ID', 'HCAHPS Question',
        'HCAHPS Answer Description', 'Patient Survey Star Rating',
        'Patient Survey Star Rating Footnote', 'HCAHPS Answer Percent',
        'HCAHPS Answer Percent Footnote', 'HCAHPS Linear Mean Value',
        'Number of Completed Surveys', 'Number of Completed Surveys Footnote',
        'Survey Response Rate Percent', 'Survey Response Rate Percent Footnote',
        'Start Date', 'End Date'],
        dtype='object')
```

```
[5]: # Remove Unnecessary Data Series
df_clean = df[['HCAHPS Answer Description', 'Patient Survey Star Rating']]

# Rename Columns
df_clean = df_clean.rename(columns={'HCAHPS Answer Description': 'Questions',
                                   'Patient Survey Star Rating': 'Ratings'})
```

```
[6]: # DtypeWarning: Columns (12,14,17,19) have mixed types. Specify dtype option on
      ↪ import or set low_memory=False.

df_clean = df_clean.drop(df_clean[df_clean['Ratings'].isin(['Not Applicable',
      ↪ 'Not Available'])].index) # Index --> of row
```

```
df_clean['Ratings'] = df_clean['Ratings'].astype(int)

df_clean.sample(20)
```

```
[6]:
```

	Questions	Ratings
60224	Discharge information - star rating	5
16793	Discharge information - star rating	4
72249	Quietness - star rating	2
281461	Communication about medicines - star rating	3
367289	Staff responsiveness - star rating	3
197055	Quietness - star rating	5
95078	Staff responsiveness - star rating	1
87473	Discharge information - star rating	4
295924	Recommend hospital - star rating	4
220956	Quietness - star rating	3
158455	Cleanliness - star rating	3
425958	Doctor communication - star rating	3
254584	Communication about medicines - star rating	3
267	Quietness - star rating	3
186649	Recommend hospital - star rating	4
218642	Summary star rating	3
83218	Cleanliness - star rating	2
178186	Recommend hospital - star rating	4
340619	Discharge information - star rating	5
148367	Staff responsiveness - star rating	2

```
[7]: # Verify Ratins Series is of type integer
df_clean.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 36520 entries, 4 to 449747
Data columns (total 2 columns):
#   Column      Non-Null Count  Dtype
---  -
0   Questions    36520 non-null  object
1   Ratings      36520 non-null  int64
dtypes: int64(1), object(1)
memory usage: 855.9+ KB
```

```
[8]: print("*****"*5)
print("* DataFrame Shape: ", df_clean.shape)
print("*****"*5)
df_clean.describe(include='all')
```

```
*****
* DataFrame Shape: (36520, 2)
*****
```

```
[8]:
```

	Questions	Ratings
count	36520	36520.000000
unique	11	NaN
top	Nurse communication - star rating	NaN
freq	3320	NaN
mean	NaN	3.158050
std	NaN	1.008707
min	NaN	1.000000
25%	NaN	2.000000
50%	NaN	3.000000
75%	NaN	4.000000
max	NaN	5.000000

```
[9]: df_clean.head(-5)
```

```
[9]:
```

	Questions	Ratings
4	Nurse communication - star rating	3
18	Doctor communication - star rating	3
32	Staff responsiveness - star rating	2
43	Communication about medicines - star rating	3
53	Discharge information - star rating	4
...
449673	Doctor communication - star rating	4
449687	Staff responsiveness - star rating	3
449698	Communication about medicines - star rating	3
449708	Discharge information - star rating	4
449717	Care transition - star rating	4

```
[36515 rows x 2 columns]
```

```
[10]: pd.unique(df_clean['Questions'])
```

```
[10]: array(['Nurse communication - star rating',
        'Doctor communication - star rating',
        'Staff responsiveness - star rating',
        'Communication about medicines - star rating',
        'Discharge information - star rating',
        'Care transition - star rating', 'Cleanliness - star rating',
        'Quietness - star rating', 'Overall hospital rating - star rating',
        'Recommend hospital - star rating', 'Summary star rating'],
        dtype=object)
```

0.0.3 Check for Missing or Null Values

```
[11]: # Mapping to view missing data...none present.  
fig, ax = plt.subplots(figsize=(6,4))          # Sample figsize in inches  
sns.heatmap(df_clean.isnull(), yticklabels=False, cbar=False, cmap='viridis');
```



```
[12]: # Drop any null columns  
df_clean = df_clean.dropna()  
  
print("*****"*5)  
print("* Any Rows Missing: ",df_clean.isnull().all(axis=1).any())  
print("*****"*5)  
print("Any Null Values:\n", df_clean.isnull().any())
```

```
*****  
* Any Rows Missing:  False  
*****  
Any Null Values:  
  Questions      False  
  Ratings       False  
dtype: bool
```

Explore Data

```
[13]: # Sample DataFrame Fields  
df_clean.head()
```

```
[13]:
```

	Questions	Ratings
4	Nurse communication - star rating	3
18	Doctor communication - star rating	3
32	Staff responsiveness - star rating	2
43	Communication about medicines - star rating	3
53	Discharge information - star rating	4

```
[14]: # Understand Columns, Shape and Types
```

```
print("*****"*5)
print("* DF Columns: ",df_clean.columns)
print("*****"*5)
df_clean.info()
```

```
*****
* DF Columns:  Index(['Questions', 'Ratings'], dtype='object')
*****
<class 'pandas.core.frame.DataFrame'>
Int64Index: 36520 entries, 4 to 449747
Data columns (total 2 columns):
#   Column      Non-Null Count  Dtype
---  -
0   Questions   36520 non-null  object
1   Ratings     36520 non-null  int64
dtypes: int64(1), object(1)
memory usage: 855.9+ KB
```

```
[15]: # Export Cleaned data
```

```
pd.DataFrame(df_clean).to_csv('df_clean.csv')
```

```
[16]: # Using lambda
```

```
df_clean = df_clean[df_clean["Questions"].isin(['Nurse communication - star_
↪rating',
                                                'Doctor communication - star_
↪rating',
                                                'Overall hospital rating - star_
↪rating'])]
df_clean.dropna()
df_clean.sample(20)
```

```
[16]:
```

	Questions	Ratings
113267	Overall hospital rating - star rating	3
312019	Nurse communication - star rating	3
41750	Overall hospital rating - star rating	2
192224	Overall hospital rating - star rating	4
365	Overall hospital rating - star rating	4
190296	Doctor communication - star rating	3
164056	Nurse communication - star rating	4

207766	Nurse communication - star rating	4
444930	Doctor communication - star rating	4
281529	Doctor communication - star rating	3
336027	Doctor communication - star rating	3
376017	Doctor communication - star rating	4
334539	Doctor communication - star rating	2
147144	Doctor communication - star rating	4
286258	Nurse communication - star rating	2
55525	Nurse communication - star rating	5
330075	Doctor communication - star rating	4
146121	Doctor communication - star rating	4
147770	Overall hospital rating - star rating	3
116894	Overall hospital rating - star rating	3

```
[17]: print('*****'*5)
print('*** Describe Data ***')
print('*****'*5)
print('* Median: ',df_clean.median())
print('*****'*5)

print('Mode: ' + str(df_clean['Questions'].value_counts(ascending=True).
↳loc[lamba x : x>1].to_frame()) +
      '\n\n' + str(df_clean['Ratings'].value_counts(ascending=True).loc[lamba_
↳x : x>1].to_frame()))
```

```
*****
*** Describe Data ***
*****
* Median: Ratings      3.0
dtype: float64
*****
Mode:                               Questions
Nurse communication - star rating      3320
Doctor communication - star rating      3320
Overall hospital rating - star rating    3320

Ratings
1      374
5      995
2     1903
4     3189
3     3499
```

```
[18]: df_grouped = df_clean.groupby(['Questions'],as_index=False).mean()
print(df_grouped)
```

Questions	Ratings
-----------	---------


```

0    Doctor communication - star rating  3.238253
1    Nurse communication - star rating  3.259940
2    Overall hospital rating - star rating 3.263253

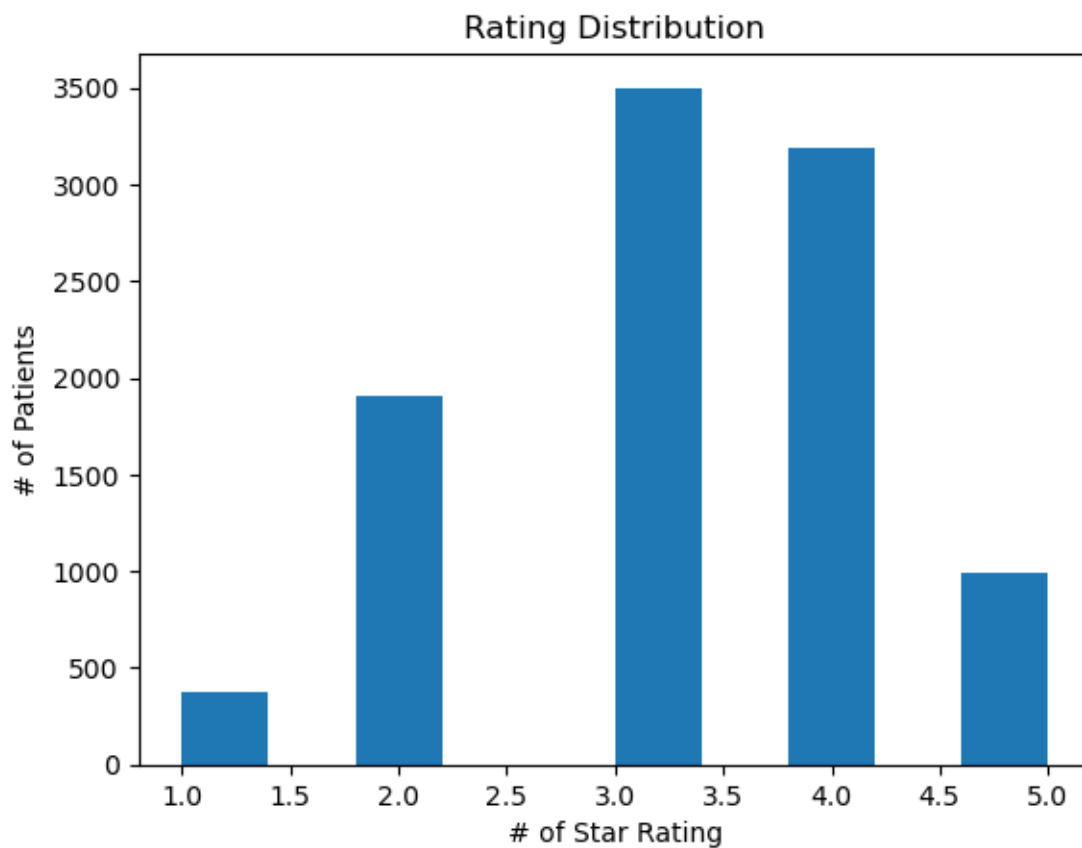
```

```

[19]: # Ratings Distribution
df_clean['Ratings'].plot.hist();

plt.xlabel('# of Star Rating')
plt.ylabel('# of Patients')
plt.title('Rating Distribution');

```



```

[20]: # Create Boxplot
df_clean.boxplot('Ratings', by='Questions', figsize=(10, 6))

control = df_clean['Ratings'][df_clean['Questions'] == 'Overall hospital rating -
↪ star rating']

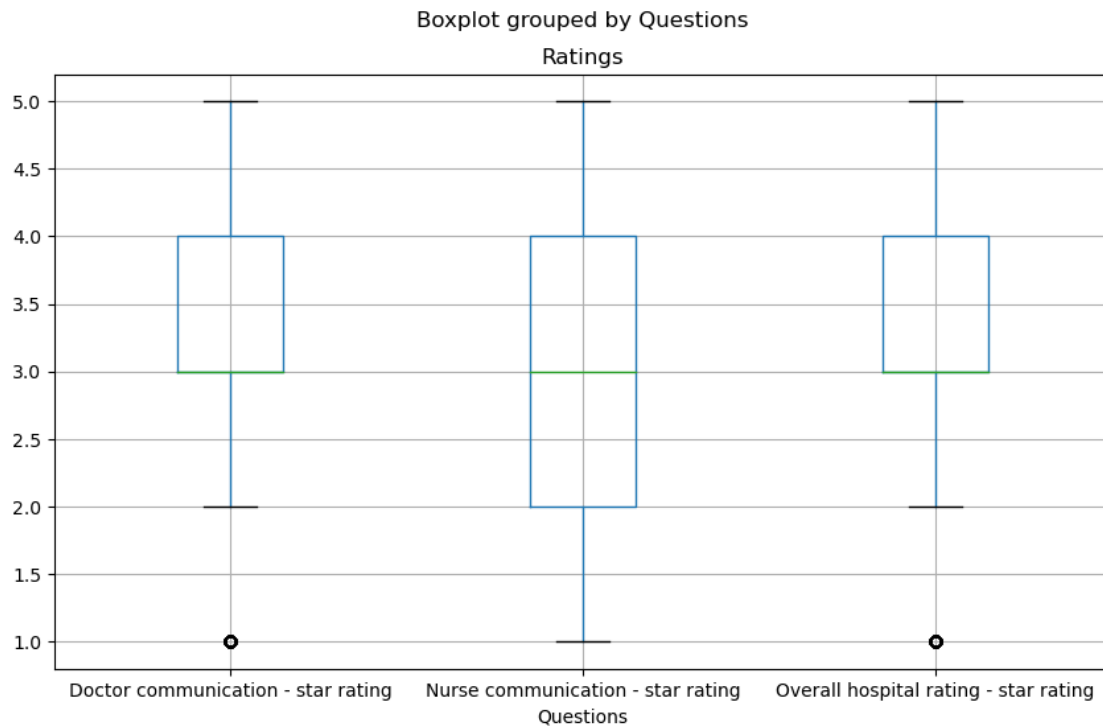
grps = pd.unique(df_clean['Questions'].values)
d_data = {grp:df_clean['Ratings'][df_clean['Questions'] == grp] for grp in grps}

```

```

k = len(pd.unique(df_clean['Questions'])) # number of conditions
N = len(df_clean.values) # conditions times participants
n = df_clean.groupby('Questions').size()[0] #Participants in each condition

```



```

[21]: # Set up ANOVA Model
mod = ols('Ratings ~ C(Questions)', # Note the Catigorical Data C()
          data=df_clean).fit()

# Carry out the ANOVA
aov_table = sm.stats.anova_lm(mod)
print(aov_table)

```

	df	sum_sq	mean_sq	F	PR(>F)
C(Questions)	2.0	1.224297	0.612149	0.614114	0.541141
Residual	9957.0	9925.130723	0.996799	NaN	NaN

```

[22]: print(mod.summary()) # Print More Details

```

OLS Regression Results

```

=====
Dep. Variable:          Ratings    R-squared:                0.000
Model:                  OLS        Adj. R-squared:           -0.000
Method:                 Least Squares    F-statistic:            0.6141
Date:                  Thu, 08 Sep 2022    Prob (F-statistic):      0.541

```

```

Time:                                09:57:52   Log-Likelihood:            -14115.
No. Observations:                    9960     AIC:                        2.824e+04
Df Residuals:                        9957     BIC:                        2.826e+04
Df Model:                            2
Covariance Type:                    nonrobust

```

```

=====
=====

```

				coef	std err
t	P> t	[0.025	0.975]		

Intercept				3.2383	0.017
186.886	0.000	3.204	3.272		
C(Questions)[T.Nurse communication - star rating]				0.0217	0.025
0.885	0.376	-0.026	0.070		
C(Questions)[T.Overall hospital rating - star rating]				0.0250	0.025
1.020	0.308	-0.023	0.073		
=====					
Omnibus:		241.290		Durbin-Watson:	0.859
Prob(Omnibus):		0.000		Jarque-Bera (JB):	147.053
Skew:		-0.151		Prob(JB):	1.17e-32
Kurtosis:		2.487		Cond. No.	3.73

```

=====

```

Notes:

[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

0.1 End