Healthcare Dataset Challenge

Overview of the approach taken by Chua Ding Yuan

Overall Approach

- 1. Using .describe() and .head() to understand data to be dealt with
- 2. Rearranging datasets to find basic statistical inferences of dataset
- 3. Finding further insights about the drivers of cost of care.

Age weight height vs cost Medical condition vs cost Resident status vs cost

Age medical condition vs cost (how to compare this) Medical history symptom vs cost

Overall Approach

Problem Statement "You are required to join the data given in different tables, and find insights about the drivers of cost of care."

Understanding the data using .head() and .describe()

Massaging data, calculations and reorganising data to draw insights

Visualisation of key drivers contributing to cost of care

Breakdown of given data sets

Given Data

Bill Amount

- 13600 rows
- Shows amount for each bill id
- Total of 13600 bills

Bill ID

- 13600 rows
- Shows patient id and date of admission
- Comparing with clinical data, there
 were 4 bills per admission

Demographics

- 3000 rows
- Shows demographics of each patient
- Total of 3000 patients in record

Clinical Data

- 3400 rows
 - Shows clinical data for each admission
- Patients, on average, were admitted 1 time.
- But some were admitted more, up to 4 times

Self-added Data

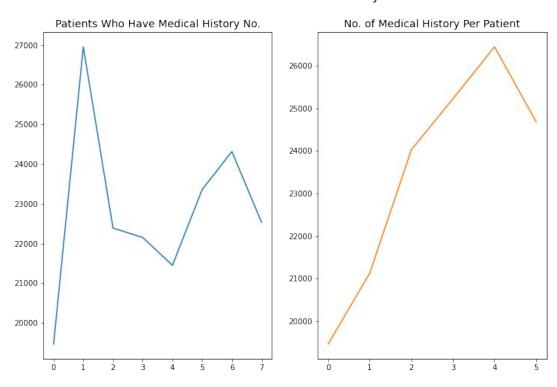
Extra columns of data were calculated in order to try and draw more insights

- 1. Age of patients
- 2. Length of Stay
- 3. Number of admissions
- Average cost of care of each admission for each patient

The main working dataframe is a combination of all 4 datasets showcasing the 3400 admissions of the 3000 patients as well as the extra columns added for further analysis.

Medical History has slight impact on cost of care

Amount Billed vs Medical History Data



The Process

Find out if having a certain type of **medical history** affects bill amount

Find out if number of medical history affects bill amount

The Outcome

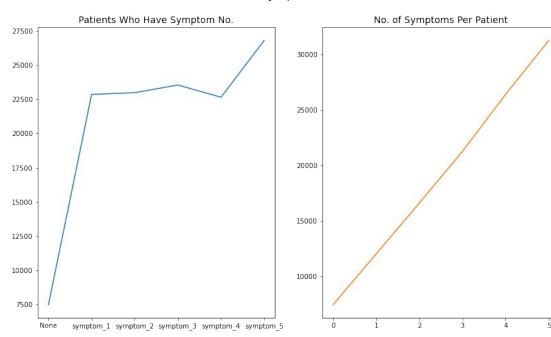
Patients that have **medical histories 1** and 6 experience slightly higher than the rest with medical history

Every patient with medical history incur ~20% higher cost of care than those without

Lastly, as expected, higher number of medical history increases cost of care

Number of symptoms seen in a patient have a positive linear relation to cost of care

Amount Billed vs Symptoms Per Patient Data



The Process

Find out if having a certain type of **symptoms** affects bill amount

Find out if number of symptoms affects bill amount

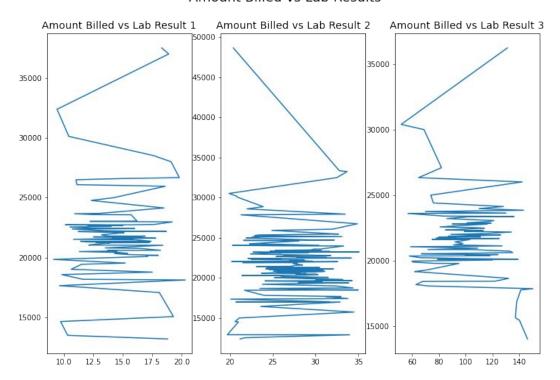
The Outcome

There is a **positive linear relationship** between number of symptoms and amount billed.

Having **ANY Symptom**, increases cost of care **by 220%**

Lab results have no impact in determining cost of care

Amount Billed vs Lab Results



The Process

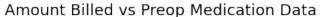
To determine a relationship between **lab results** and the amount billed (i.e cost of care).

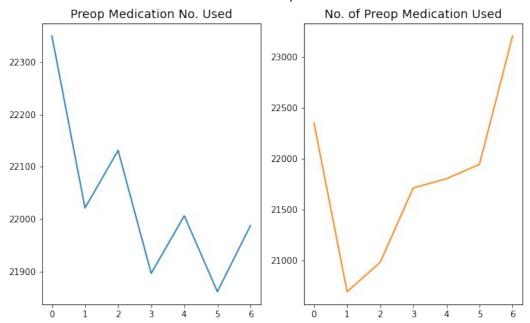
The Outcome

There does not seem to be any relationship between lab results and the amount billed.

Each result for lab result 1, 2 and 3 have a wide range of amount billed.

Pre op medication usage decreases cost of care





The Process

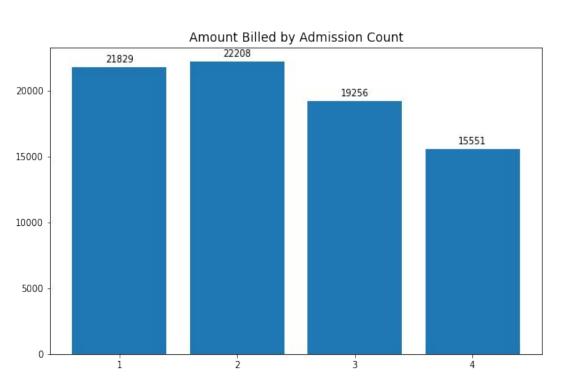
To determine a relationship between **Pre op Medication used** and the amount billed (i.e cost of care).

The Outcome

As expected, cost of care increases linearly when **1 or more** pre op medication is used. (orange chart)

However, the average cost of care when **no pre op medication** is used turned out to be **~2% higher** than if any one were used. (blue chart)

Having more admissions decreases average amount billed per admission



The Process

Taking the total amount billed per patient and dividing it by number of admissions to get the average amount billed per admission

The Outcome

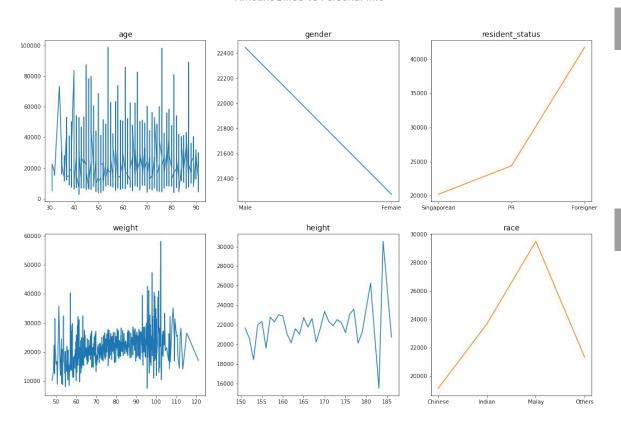
Patients admitted once or twice generally had to pay more per visit.

Generally ~40% more than a patient with 4 visits.

This is expected because subsequent visits could be check ups that are not as costly.

Resident Status and Race is the largest driver of cost of care





The Process

Filter each variable under personal info (i.e. demographics)

Take the mean amount billed for each patient visit for each parameter

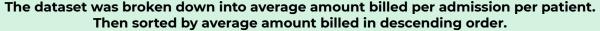
Plot the figures on the left

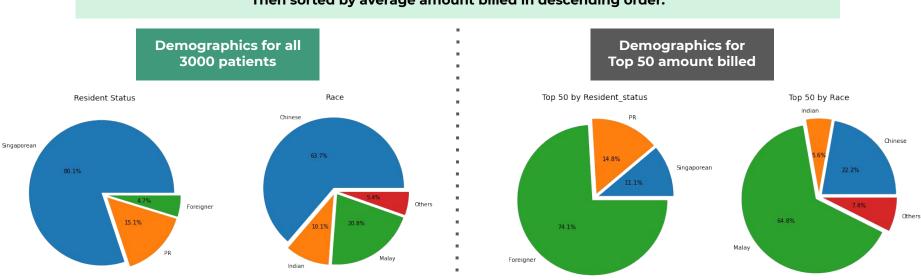
The Outcome

2 conclusions can be drawn

- Foreigners, on average, pay
 *87% more than Singapore
 Citizens and PR
- 2. **Malays**, on average, pay **~40%** more than other races

Diving further into demographic drivers of cost of care for the Top 50 average amount billed





Malays and Foreigners make up a 20.8% and 4.7% respectively of their original demographics. However, that increased to **64.8% Malays** and **74.1% Foreigners** in the Top 50 average amount billed.

Key Drivers of cost of care

Having any symptoms **Largest driver for** High Impact increase cost of care by **Symptoms Shown** cost of care ~220% Malay & Foreigners have Race and ~40% and ~87% higher costs **Resident Status** of care respectively Having medical history **Med-High** increases cost of care by 3 **Medical History** Impact ~20%. Even more so for medical history 1 & 6. Patients with 2 or less Low admissions are seeing ~40% 4 **Number of admissions Impact** higher average bills Usage of any pre op Low medication decreases cost 5 **Pre Op Medication Usage Impact** of care by ~2%

Thank You