Analysis of Medicare Provider Data

CAMERON KENNEDY EHSAN YOUSEFZADEH

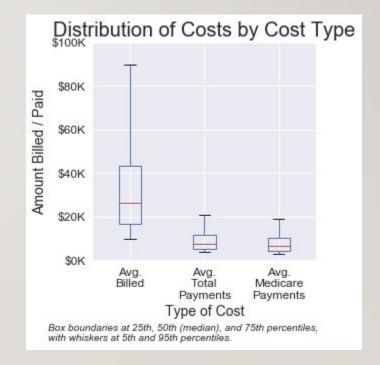
JOSIAH MCDONALD SHARAD VARADARAJAN

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Data Overview

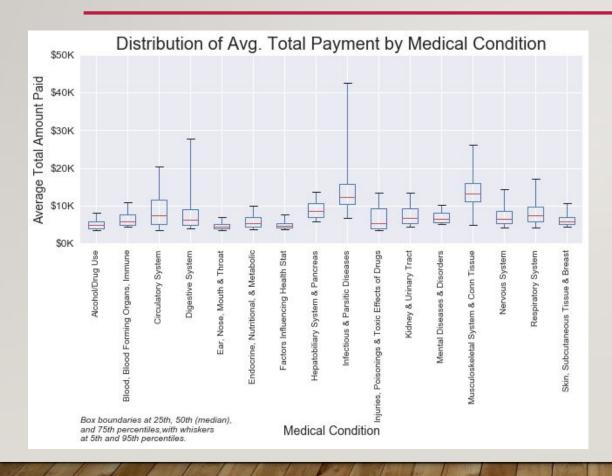
- 2011 Medicare inpatient data
- 163K rows (each row: provider-DRG*)
- 100 DRGs → 16 medical conditions
- Discharge volume (# of patients treated)
- Provider location
- 3 cost types:
 - Billed
 - Total Payments (what the hospital received)
 - Medicare Payments (patients pay the difference)



^{*}Diagnosis-Related Group

COSTS BY MEDICAL CONDITION AND GEOGRAPHY

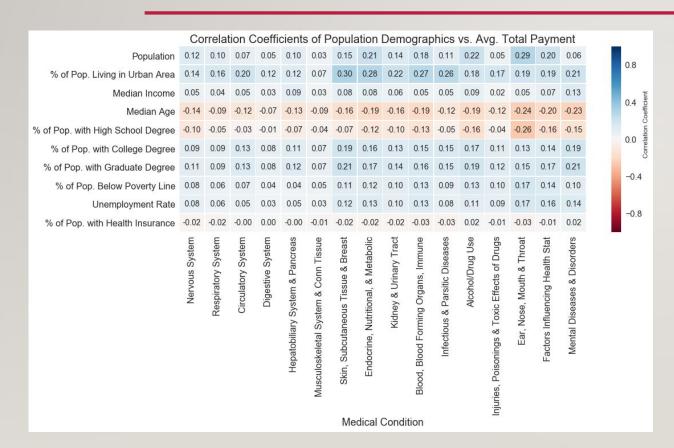
How Do Costs Vary by Medical Condition?



Themes:

- All conditions have a "long tail" of high-cost cases
- Otherwise, most have limited cost variance
- A few have high variance:
 - Circulatory
 - Digestive
 - Infections & Parasitic Diseases
 - Musculoskeletal System Disorders

Do Demographics Impact Cost?



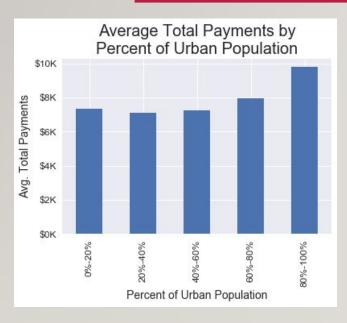
Analysis:

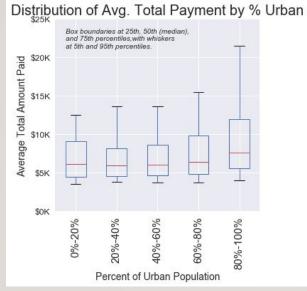
- Demographics by Zip Code
 - Population
 - Urban vs. Rural
 - Income
 - Age
 - Education
 - Poverty
 - Unemployment
 - Health Insurance
- Heatmap of Correlation to Average Total Payment

Conclusions:

- Minimal cost impact (max corr. coefficient: |0.30|)
- Medical condition also matters little

Why are Correlations So Low When Avg. Payments Vary So Much?





Answer

High payment distribution dominates

Concluding Hypothesis

 Variation in patient ailments matter much more than demographics

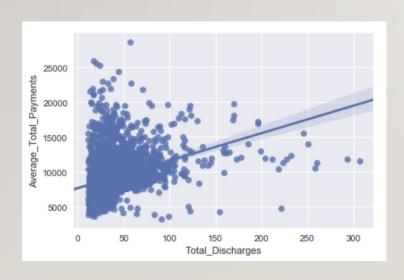
ECONOMIES OF SCALE IN HEALTHCARE

Quick Economics Review

- Economies of scale is when average costs decrease as production increases
- This normally is the result of specialization of labor
 - Each person as one job and learns to do it really well
- Could there be economies of scale in large hospitals?
 - In a small hospital one doctor might have to perform every type of operation
 - In large hospitals, doctors have the ability specialize in one procedure type

Results: More Operations != Lower Costs

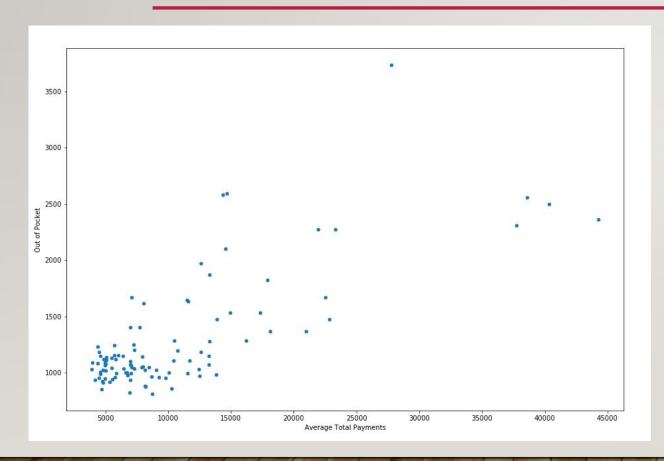
After controlling for income level within a Zip code and MDC, Total Discharges was still
positively correlated with Total Payments and Total Charges Billed



- Our data set doesn't contain any information on outcomes or quality of service.
- It's possible larger/more specialized hospitals charge more for better outcomes, but answer than question is beyond the scope of this analysis

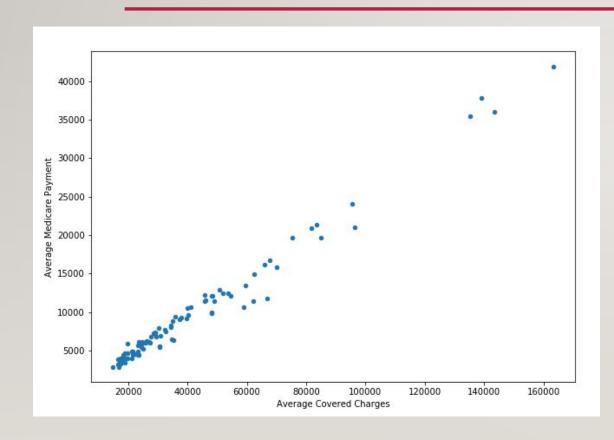
MEDICAL CONDITION AND PROVIDER COST ANALYSIS

What is the difference between Average Medicare Payments and Average Total Payment?



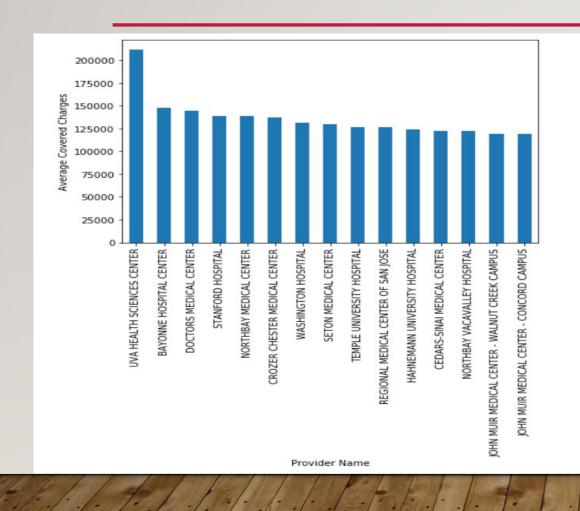
- Difference between Average Medicare Payment and Average Total Payment yields the copayment and deductible expenses (out-of-pocket costs)
- Average out-of-pocket costs is \$1,284.25
- Positive correlation: as Average Total
 Payment increases, out-of-pocket
 expenses also increase. This can be due
 variable out of expenses for certain
 medical conditions.

What is the difference between Average Medicare Payments and Average Covered Charges?



- Relationship between the Average
 Medicare payment and Average Covered
 Charges is tightly correlated
- Percent of medicare payment to covered charges is approximately 23%
- Since Medicare reimbursement is only 23%, Medicare is not considered to be an attractive option for hospital providers

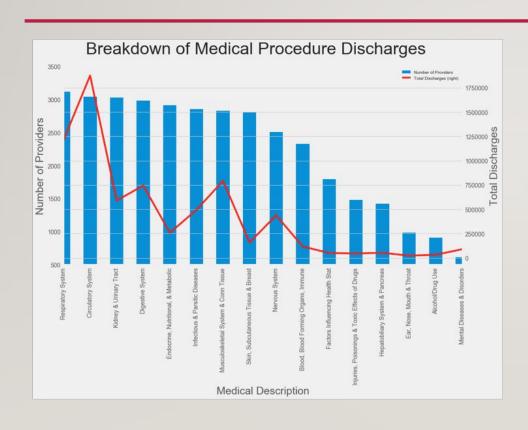
Which providers charge the highest amount of Average Covered Charges?



- Average Covered Charges are the provider's charges based on its own cost structure so it can be subjective
- Top 15 most expensive average providers are predominantly large university research hospitals and/or well branded hospitals.
- A provider's reputation and status can translate to more expensive services!

MEDICAL CONDITION COVERAGE BY PROVIDER AND GEOGRAPHY

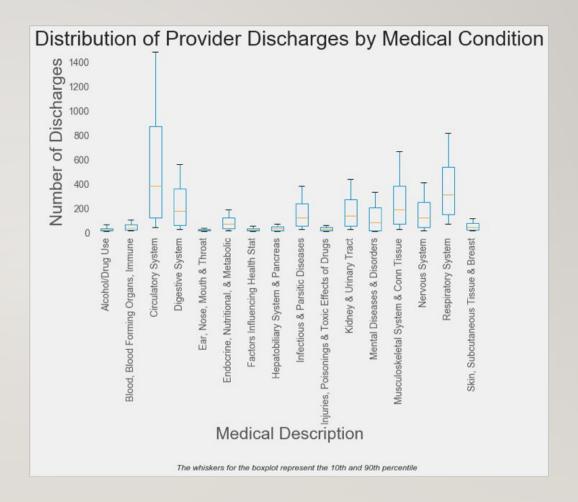
Number of Providers vs. Medical Condition



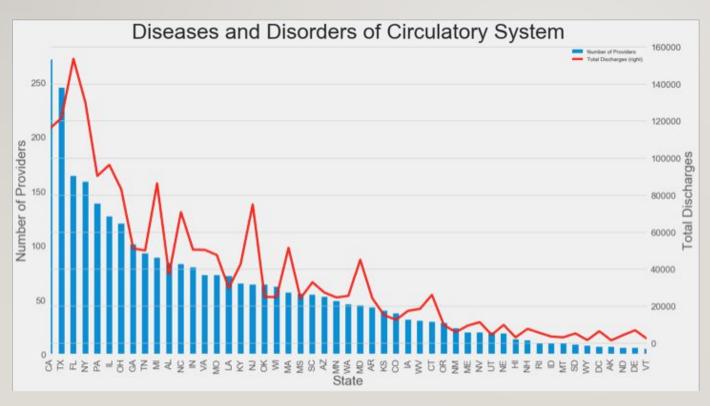
- Positive Correlation between Number of Providers and Total Discharges (0.66)
- Highest number of discharges and providers
 - Respiratory and Circulatory system conditions
- Surprising findings for Nervous system conditions

How do Discharges by Condition Vary Among Providers?

- Wide range of Circulatory System condition discharges across all providers.
 - 75th percentile of discharges exceeds the maximum number of discharges of nearly all other conditions!
- Conclusion:
 - Circulatory System conditions most prevalent across the country

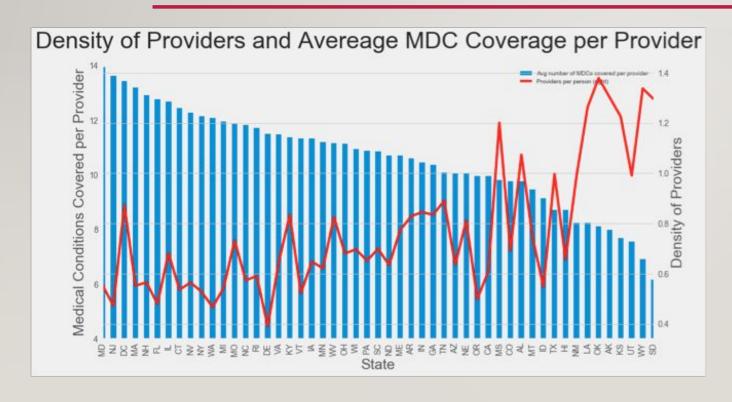


Circulatory System Discharges - By State



- Florida owns the highest number of discharges in the country
 - Makes sense....or does it?
- California is home to 1.6 million more Medicare beneficiaries then Florida
 - What is going on in Florida??
- Speculation for lower numbers in California
 - Lower population density → Less accessibility?
 - Geographical factors?
 - More outpatient discharges for this condition in California?

How Easy is it to Find the Right Provider?



- How does the density of providers compare to the avg. number of conditions covered per provider?
 - Negative correlation
- Required care for Medicare beneficiaries may not always be easy to find
 - Many providers in-state → less conditions covered
 - Many conditions covered in-state → less provider options.

TOOL DEMO