

Hospital Patient Readmissions

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The Problem:

Readmissions account for extra costs and even penalizations for U.S. hospitals.

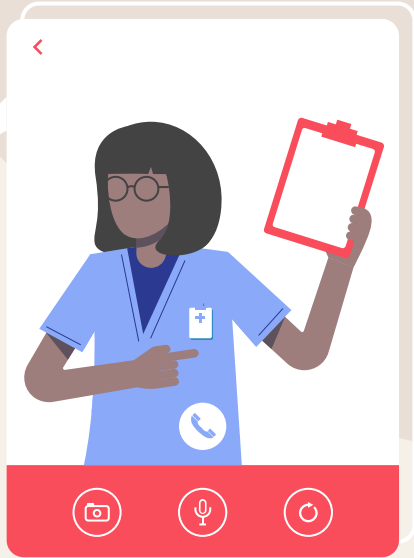
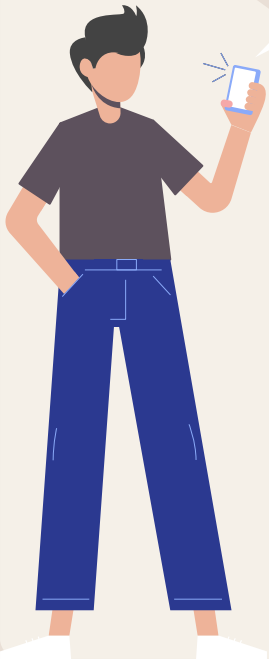
2013 – Affordable Care Act (ACA)

The federal government has created several new programs that penalize hospitals for readmissions.



Future Losses:

Under Medicare's Hospital Readmissions Reduction Program, hospitals now lose up to 3% of their total Medicare payments for high rates of patients readmitted within 30 days of discharge.





\$1.9 Billion

\$528 Million in the year 2017!

01

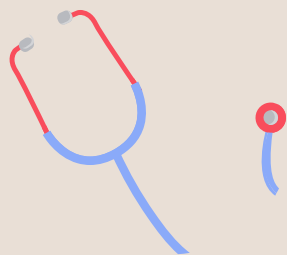
What Can Hospitals Do?

Keep readmissions low by analyzing previous patient encounters.



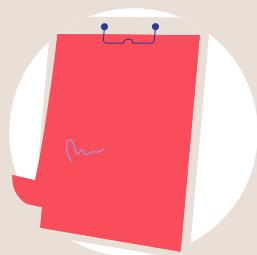
THE DATA:

PATIENT DEMOGRAPHICS



GENDER, RACE
AND AGE

DIAGNOSES



PRIMARY DIAGNOSES
LINKED TO “EXCESS”
READMISSIONS

DISCHARGE DISPOSITIONS



HOME, TRANSFERS TO
NURSING FACILITIES,
HOME HEALTH

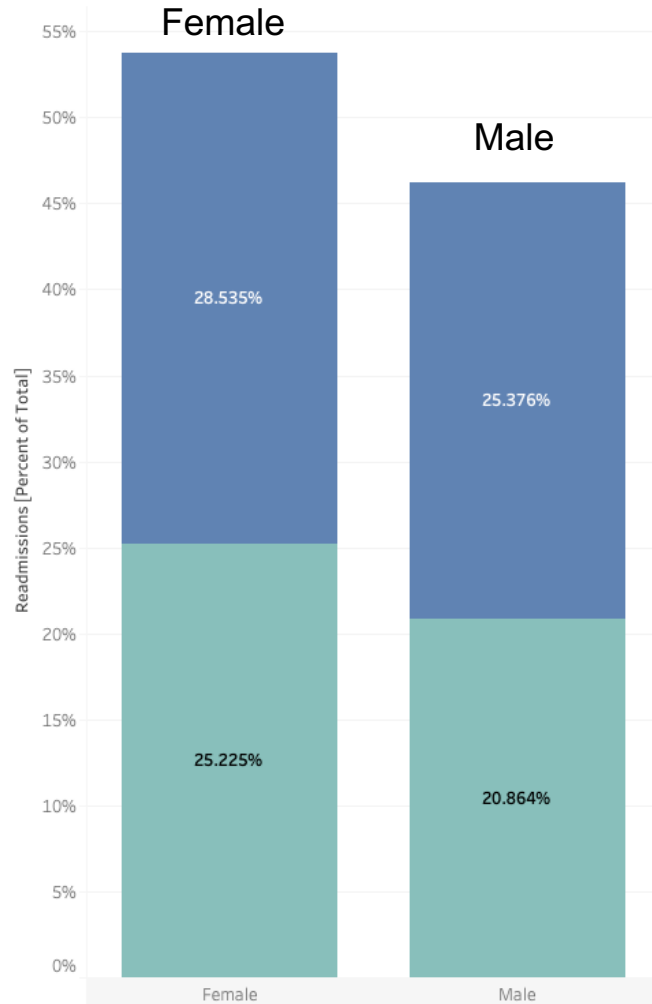
PATIENT DEMOGRAPHICS

Gender and Race

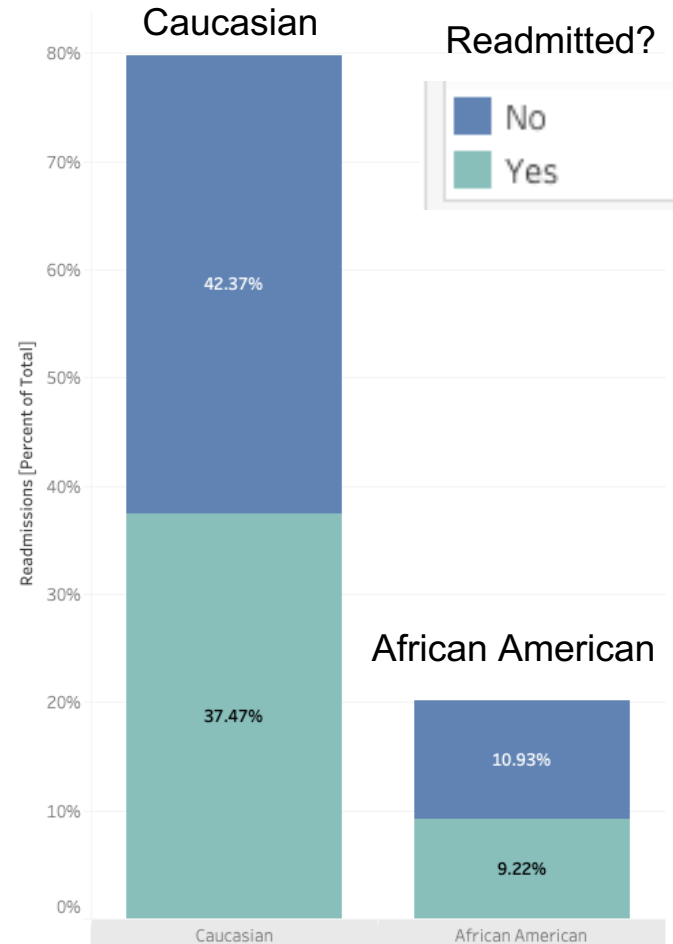
Interactive graph

** implies possible bias

Patient Readmissions by Gender



Patient Readmissions by Race



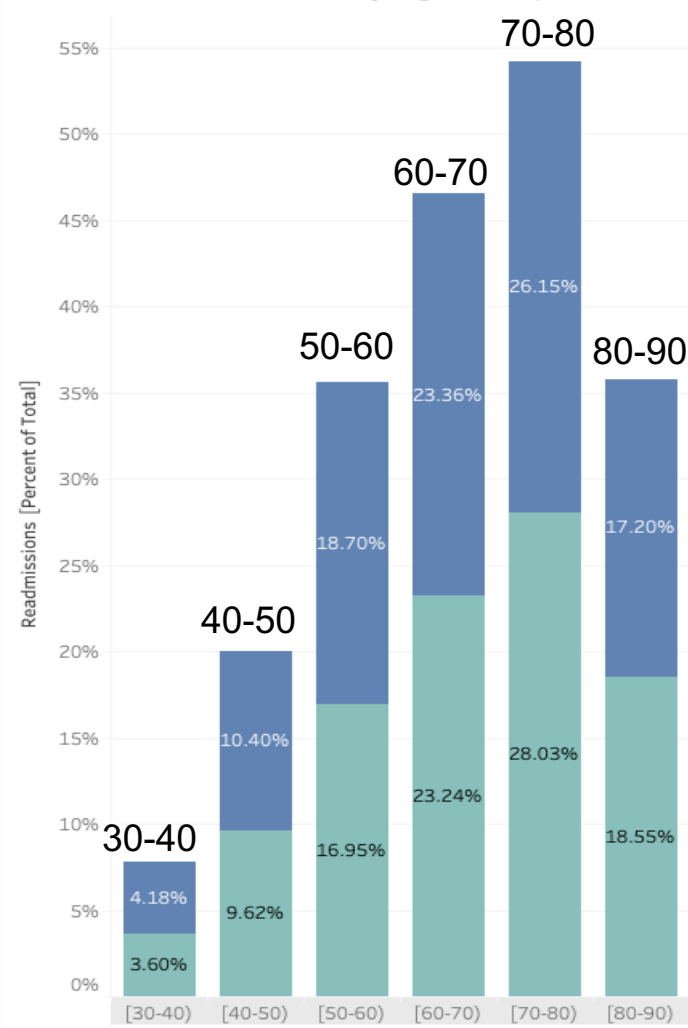
PATIENT
DEMOGRAPHICS

age

Interactive graph

** implies possible bias

Patient Readmissions by Age Group

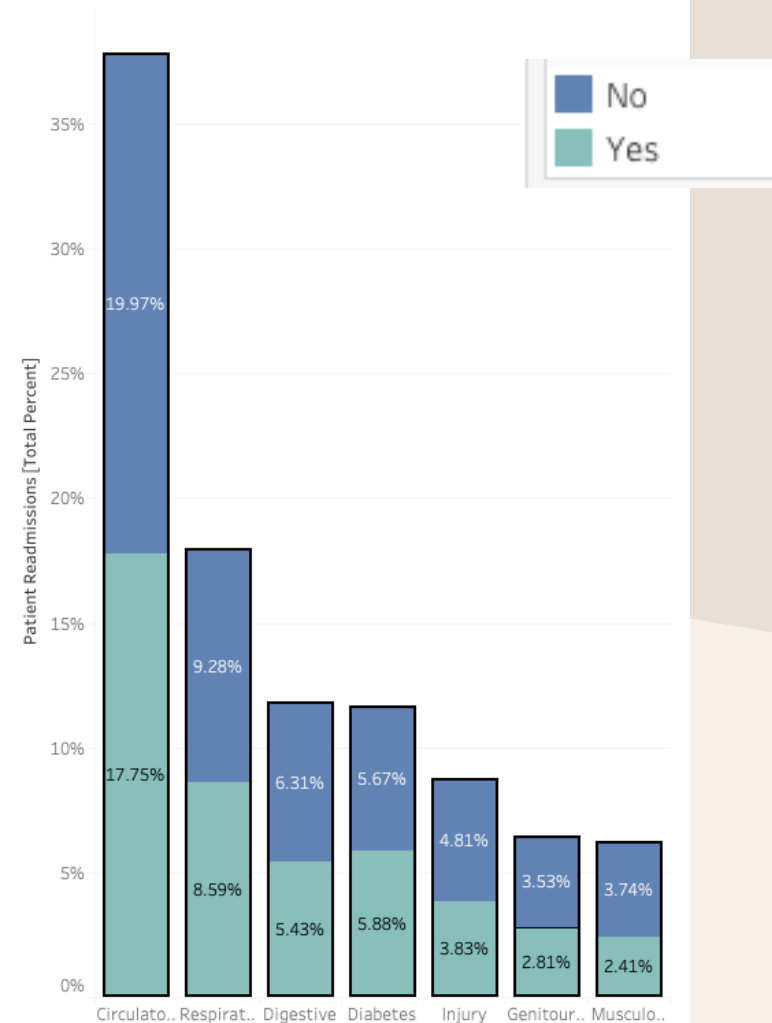


Readmitted?

- No
- Yes

Patients aged 50-90
have the highest rate
of readmissions.





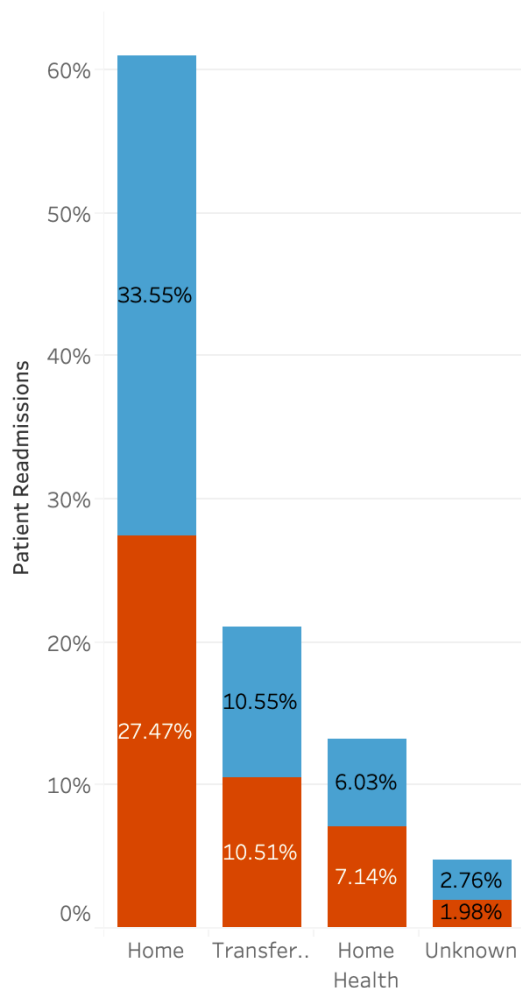
PRIMARY DIAGNOSES

Circulatory / Cardiac Related Diagnoses:

- **38% of all admissions**
- **18 % of readmissions**

- Respiratory Diseases
 - Diabetes
- Digestive Diseases
- Injuries (Traumas)
- Genitourinary Diseases
- Musculoskeletal Diseases

Readmissions by Discharge Disposition



Discharge Dispositions in Relation to Readmissions



Home Discharges

- Home without home health care
- Follow up patient's responsibility



Facility Transfers

- Physical Rehabilitation Centers
- Skilled Nursing
- Other Hospitals

[Interactive graph](#)

Discharge Dispositions and Average Hospital Stay

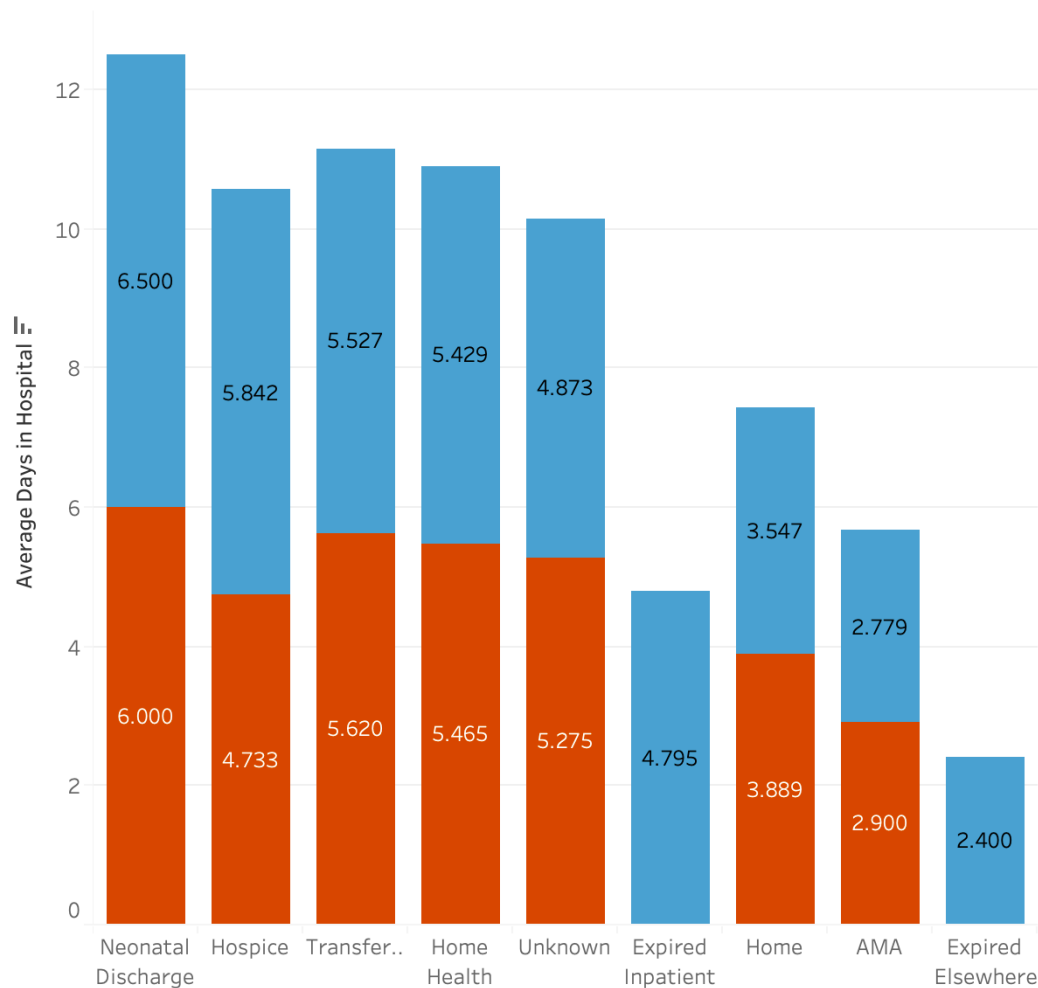


Noteworthy insight:

- Facility transfers
 - Home health
 - Pregnancies
 - Unknown
 - Hospice
 - Home
- Against Medical Advice



Time Spent in Hospital by Discharge Disposition



02

Predicting Patient Readmissions

Keep readmissions low by predicting high risk patient encounters.



Factors for Predicting Patient Readmissions:

01

Patient Demographics

03

Primary Diagnoses

Discharge Disposition

02

Time Spent in Hospital

04

Evaluating the Prediction Model:+

True Positive (TP):

- Reality: A wolf threatened.
- Shepherd said: "Wolf."
- Outcome: Shepherd is a hero.

False Positive (FP):

- Reality: No wolf threatened.
- Shepherd said: "Wolf."
- Outcome: Villagers are angry at shepherd for waking them up.

False Negative (FN):

- Reality: A wolf threatened.
- Shepherd said: "No wolf."
- Outcome: The wolf ate all the sheep.

True Negative (TN):

- Reality: No wolf threatened.
- Shepherd said: "No wolf."
- Outcome: Everyone is fine.

True Positives:



Our model correctly predicts that a patient is at high risk for readmission.
AND they are actually high risk

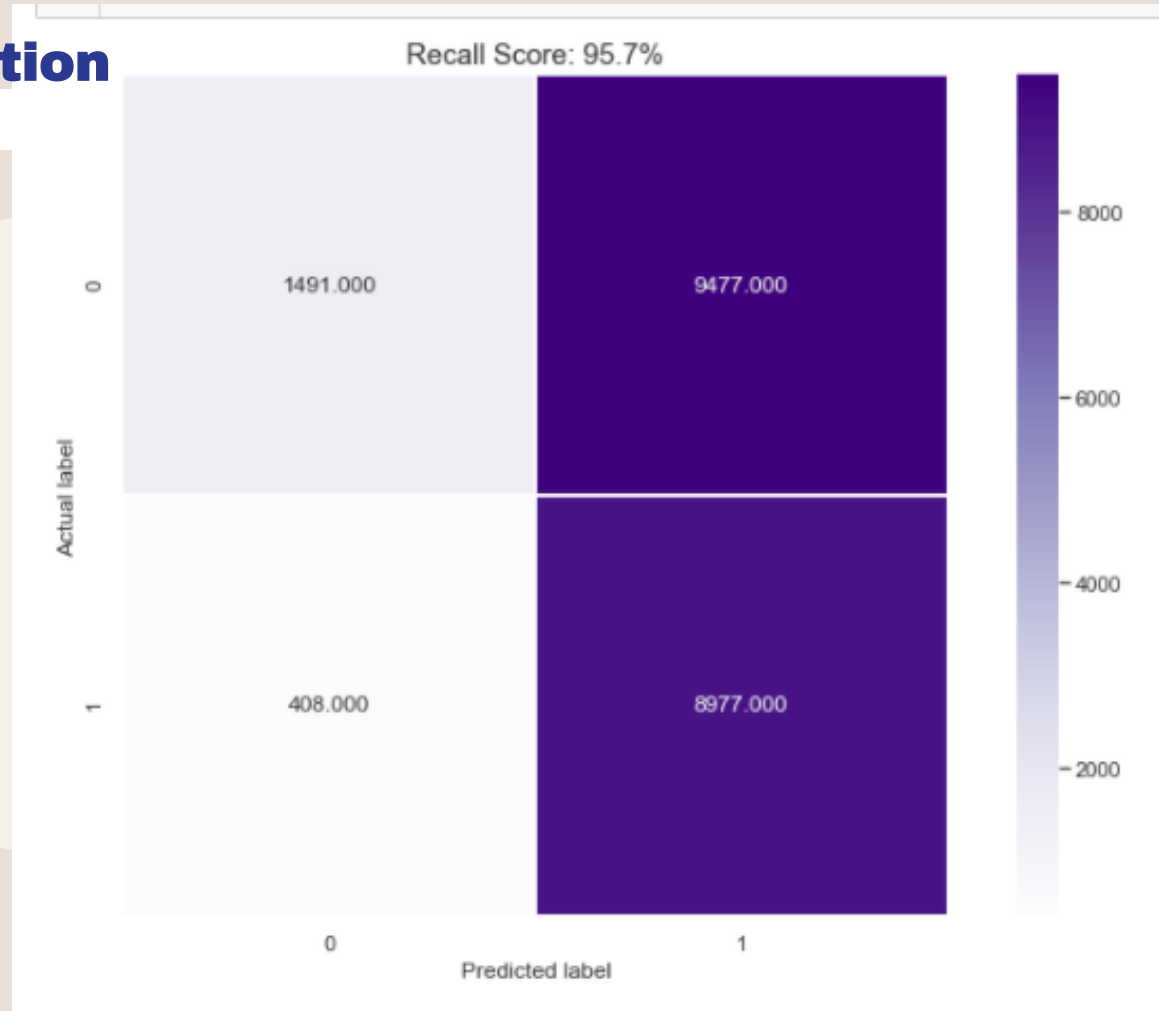
False Negatives:



Our model incorrectly predicts that a patient is not at high risk for readmission. BUT they actually are high risk.

Prediction Model Evaluation

- Recall (Sensitivity) Score of about 96 %
- High True Positives
- Low False Negatives



Data Analysis Findings:

A patient's age , main diagnoses and home discharges are leading predictors of high rates of “excess” readmissions.

- Educational programs aligned with primary care facilities
- Patient incentives for preventative care



Recommendations:

Incentives

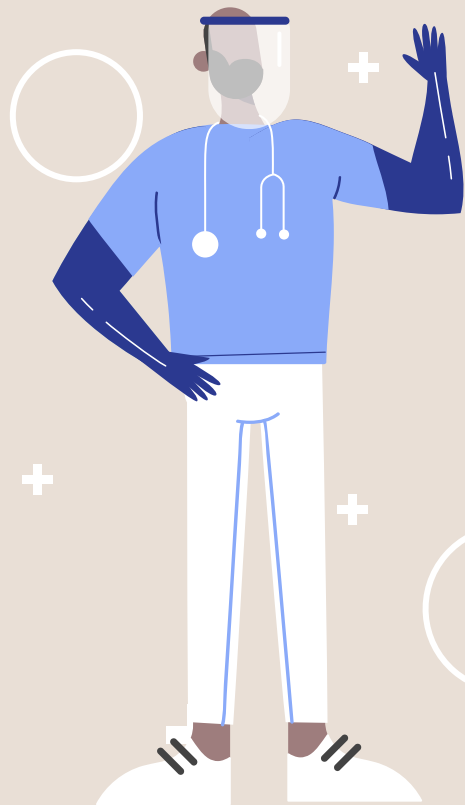
Patient and primary care physician incentives for preventative care and regular physical exams.

Education

Provide more substantial education and resource support to patients with high risk diagnoses.



Recommendations:



Discharge Planning

Case management and discharge planners have systems in place to ensure safe discharge and provide follow-up care plan.



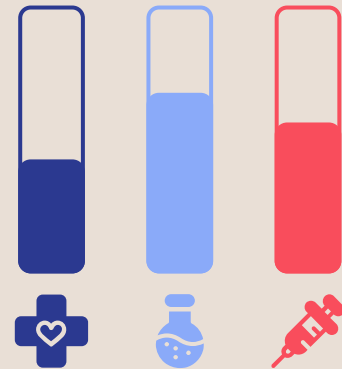
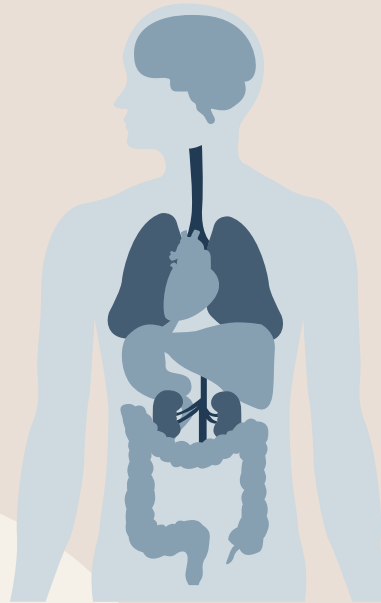
03

NEXT STEPS

Limitations, future work
wishes and goals...

+ Limitations and Biases

- **Not all patient demographics are represented.**
- **Race and gender biases.**
- **Missing features that could assist with predictions.**



Push the Biases

What other features could be collected for readmissions analysis?

Time between
admissions



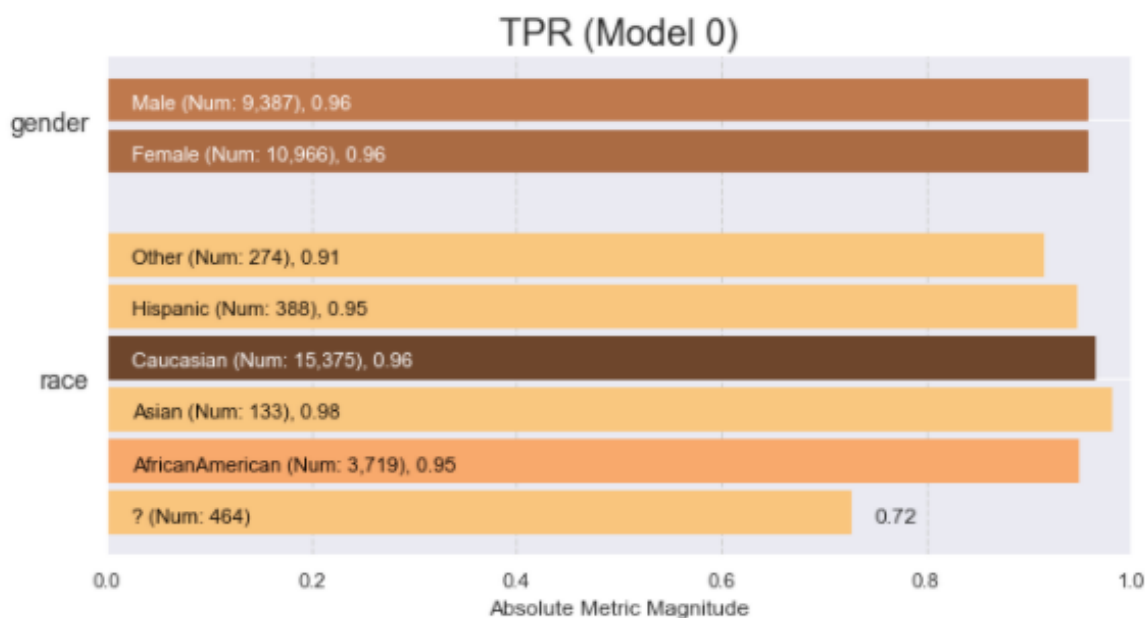
Demos across regions



Cardiac subset
diagnoses



Aequitas Biases Check:

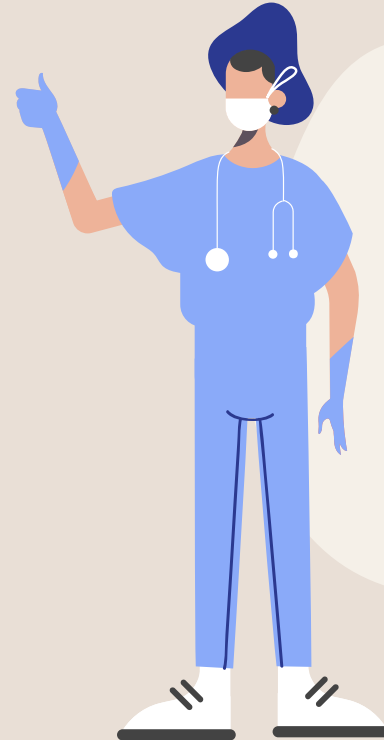


Gender and Race

No significant bias in the model across gender and race when looking at model's True Positive Rate.

Resources and Further Reading

- *The Hidden Financial Incentives Behind Your Shorter Hospital Stay* – The New York Times
- American Hospital Association – *Readmissions Reduction Fact Sheet*
- *Average hospital expenses per inpatient day across 50 states* – Becker's Hospital Review
- *Length of stay has minimal impact on the cost of hospital admissions* – Journal of the American College of Surgeons
- *Explanation of data* – BioMed Research International



Our Team Thanks You!



Leighanna Hooper

Patient Health and
Wellness Advocate



John Doe

Imaginary affirmation
giver and cheerleader