Predicting Disposition for Pediatric Asthma Patients

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Collaborators

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- Joseph East, IOE MS & MHSA
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- Mark Grum, IOE MS
- Brooke Szymanski, Nursing
- Stephanie See, BSN



Agenda

- Background
- Data
- Preliminary Results
- Continuing Work
- Implications

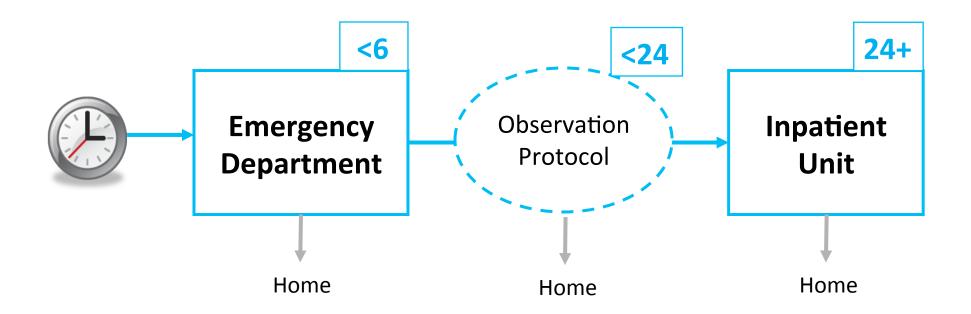


U of M Mott Children's Hospital

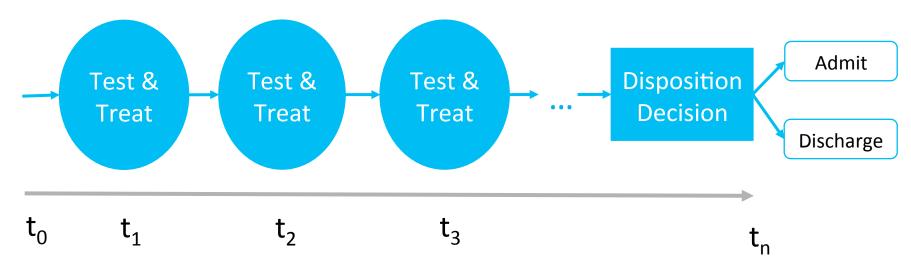
- Part of the University of Michigan Health System
- Brand new facility
- 350 Beds
- 28 Emergency Department beds



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Emergency Department





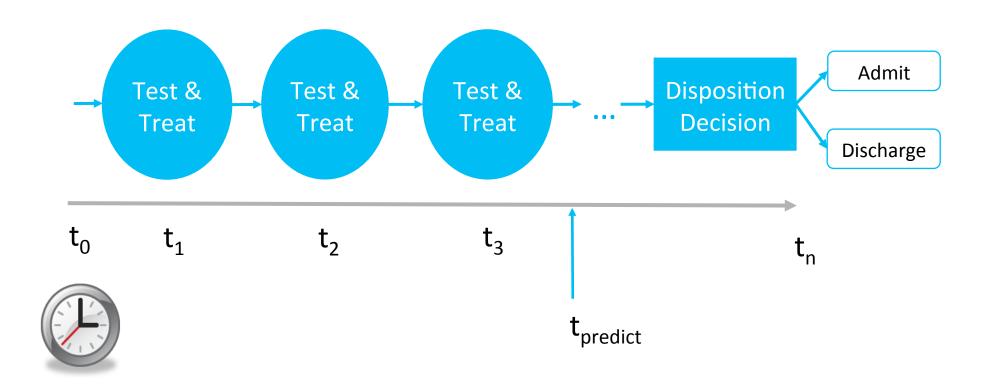


Project Motivation

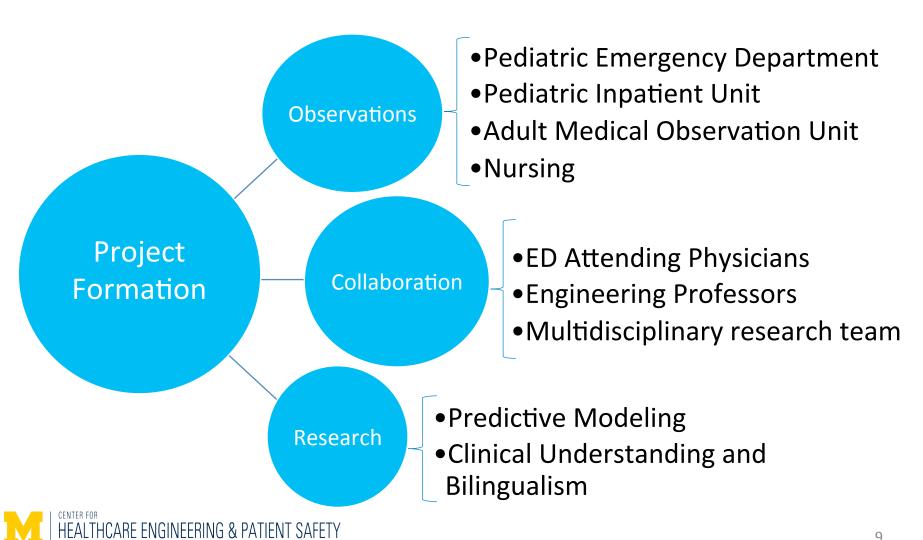
- Difficult to make disposition decisions
- Ramifications of incorrect decisions
 - ED Readmits
 - Inappropriate admissions
- Mobilization of resources
 - Many levels of coordination in the hospital system
 - Long length of stays



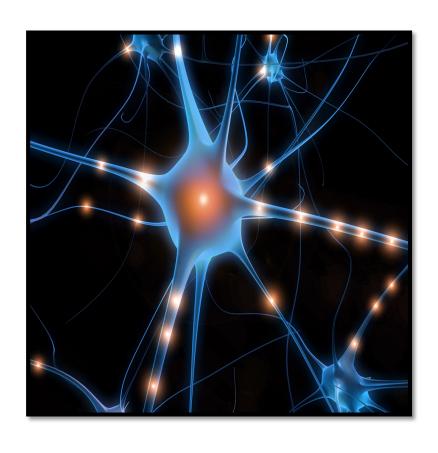
Objective and Approach



Method of Development



Approach: Neural Networks



- Supervised Machine Learning
- Mathematical way to model how our brain learns
 - Neuron
 - Synapses
- Captures and represents complex nonlinear relationships

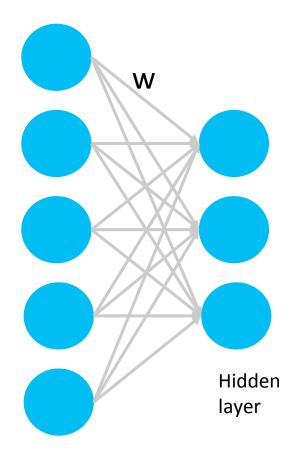
Neural Networks



Input Layer



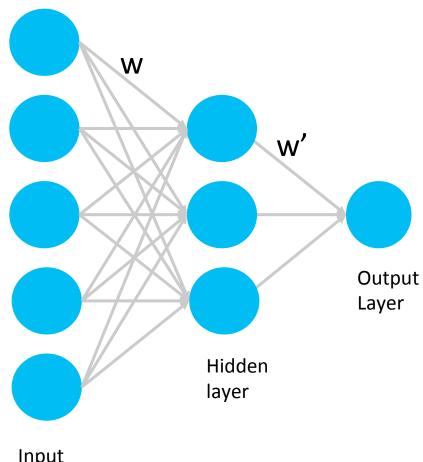
Neural Networks



Input Layer



Neural Networks







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Data Source

- C.S. Mott Children's Hospital ED
- Electronic Medical Record MiChart (EPIC)
- June 2012-March 2013
- 18,000 cases



Data Variables

Demographic Variables

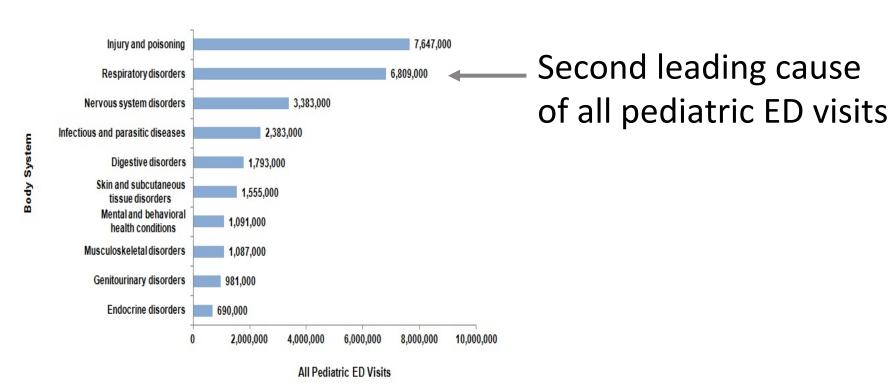
- Age
- Sex
- Gender
- Race
- Payer
- Acuity level
- Time of admission

Clinical Variables

- Medications given
- Medication counts
- Blood pressure
- Weight
- Temperature
- Respiratory rate
- SpO2

Population Selection

Comparatively simple testing and treatments





Data Variables



Disposition Decision

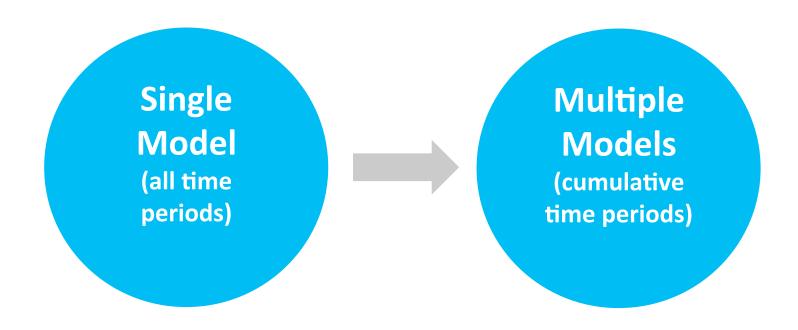
- 0- discharge
- 1- admit

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Preliminary Results

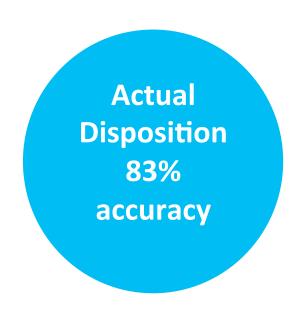


Preliminary Results: Single Model

(All Time Periods)

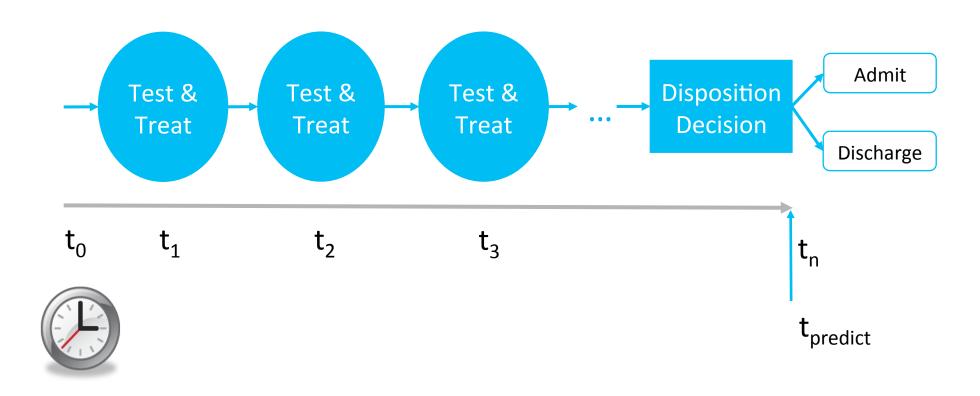
Actual Disposition

NN Disposition discharge 89% 17% 164
admit 21% 61% 77





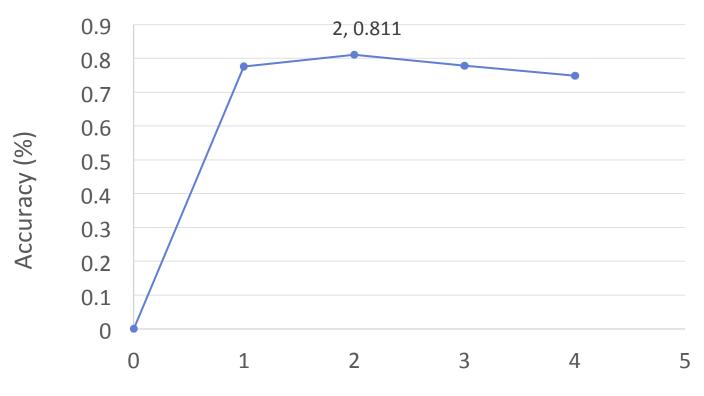
Multiple Model Approach





Preliminary Results: Multiple Models

(Cumulative Time Frames)







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Continuing Work

- Better designed feature space
- More data
- Validate with different methods:
 - SVM
 - Regularized Logistic Regression, significant variables
- Analysis on "Corrected" Disposition
- Predict Length of Stay (LOS) as output:
 - Better aid to disposition decision ~ observation unit candidates
- Expanding to include other patient populations



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Implications

- Earlier disposition prediction = earlier mobilization of resources
 - Patients that should go home will go some sooner and free up beds for other patients in need
 - Very sick patients will get treatment at the appropriate level of care faster
- Accurate prediction of disposition can result in better patient outcomes
 - Fewer readmissions
 - Fewer inappropriate admissions



Acknowledgment

- Center for Healthcare Engineering and Patient Safety (CHEPS)
- C.S Mott Children's Hospital
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- The TDC Foundation



CHEPS and the HEPS Master's Program

- CHEPS: The Center for Healthcare Engineering and Patient Safety
- HEPS: Industrial and Operations Engineering (IOE) Master's Concentration in Healthcare Engineering and Patient Safety offered by CHEPS
- CHEPS and HEPS offer unique multidisciplinary teams from engineering, medicine, public health, nursing, and more collaborating with healthcare professionals to better provide and care for patients
- For more information, contact Amy Cohn at <u>amycohn@umich.edu</u> or visit the CHEPS website at:
 - https://www.cheps.engin.umich.edu









Questions

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