
AI is to Medicine Today What the X-ray was to Medicine a Century Ago, and Much More...

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April 29, 2021



Outline

Medical AI is the X-ray of the 21st Century.

Medical AI is real, finally.

Medical AI is easy.

Medical AI is hard.

Medical AI requires deep clinical integration.



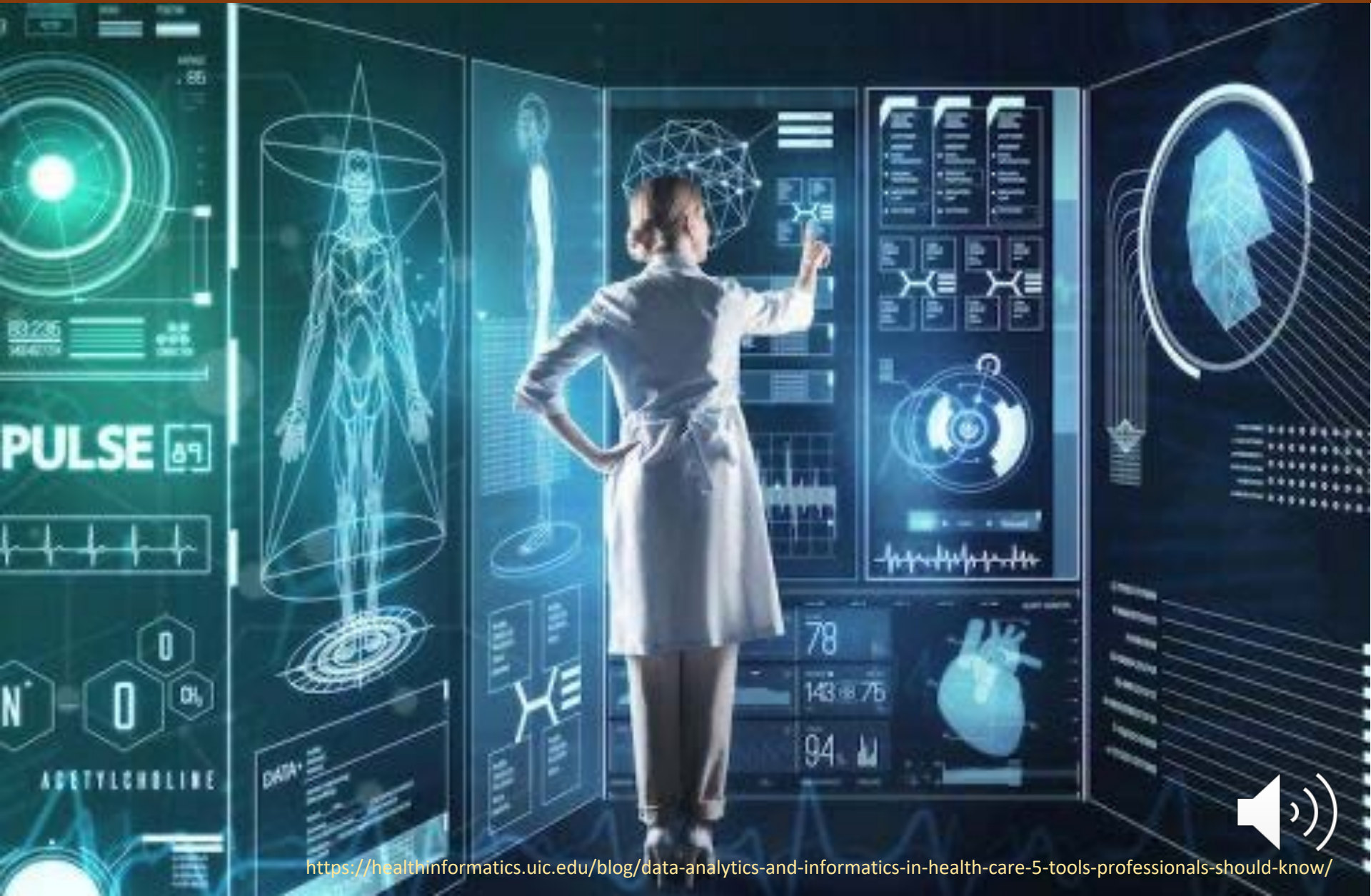
Medical AI is the X-ray of the 21st Century.




A century ago, X-ray enabled doctors to see invisible structures inside the body.



Today, AI is enabling doctors to not only see, but predict, previously unidentified patterns within massive medical and biological data.

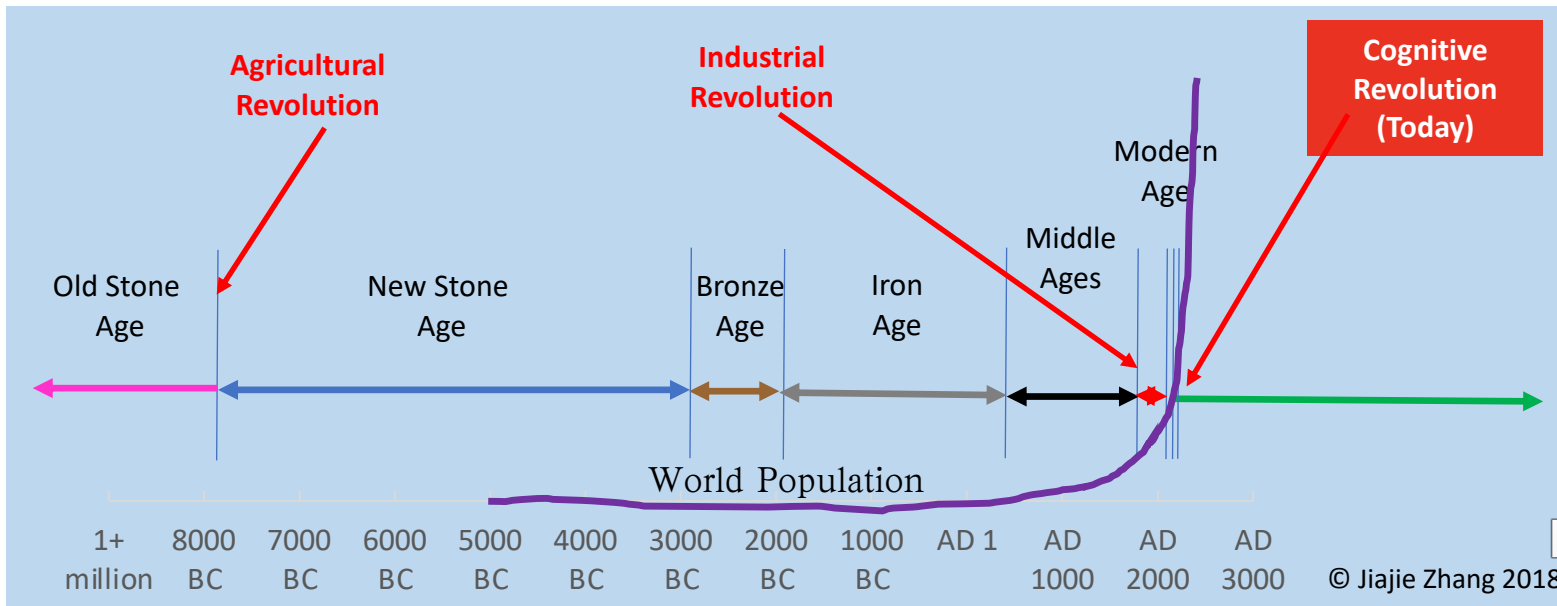
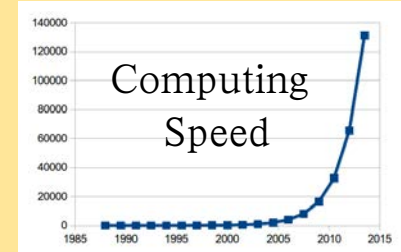
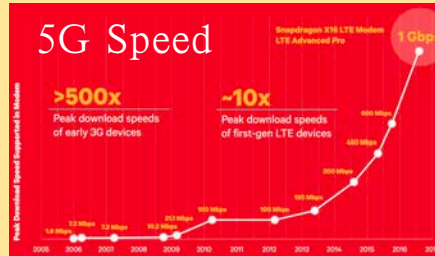
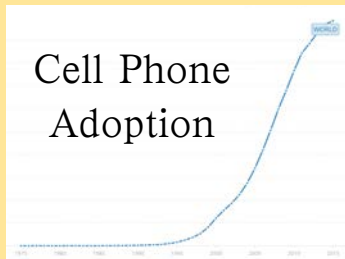
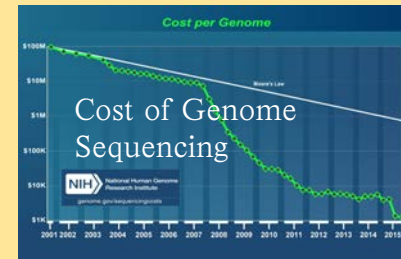
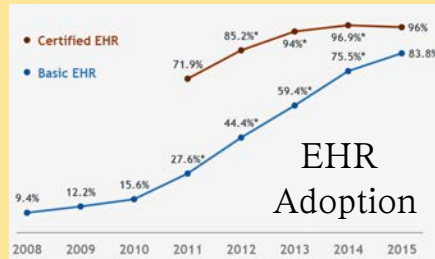
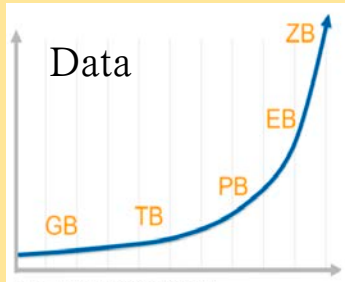




Medical AI is
real, finally.



The Age of Acceleration



The Age of Disruption

“The past 20 or 30 years, and the next 20 or 30 years—really is historically unique. It is arguably the **largest economic disruption in recorded human history.**”
(Ben Sasse, US Senator, WSJ, April 21, 2017)

Industries Disrupted by Technology - Increasing Complexity

Information

- Yahoo
- Google
- Baidu
- Wikipedia
- Digital Pub

Communication

- Email
- Facebook
- Twitter
- iMessage
- Skype
- WeChat

Retail

- Amazon
- Alibaba
- eBay
- JD.com

Entertainment

- iTunes
- NetFlix
- YouTube
- Spotify

Travel

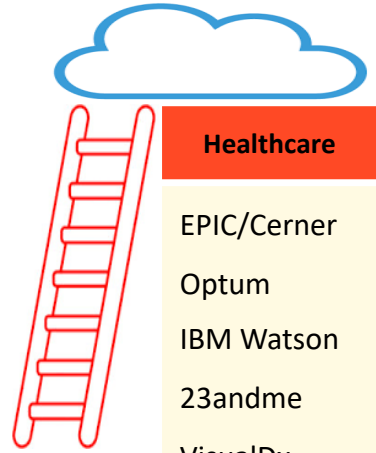
- Expedia
- AirBnB
- Uber

Finance

- PayPal
- ApplePay
- AliPay
- WeChat Pay
- Banking
- Credit
- Investment

Education

- MOOC
- edX
- Coursera
- Hybrid
- Modular



Healthcare

- EPIC/Cerner
- Optum
- IBM Watson
- 23andme
- VisualDx



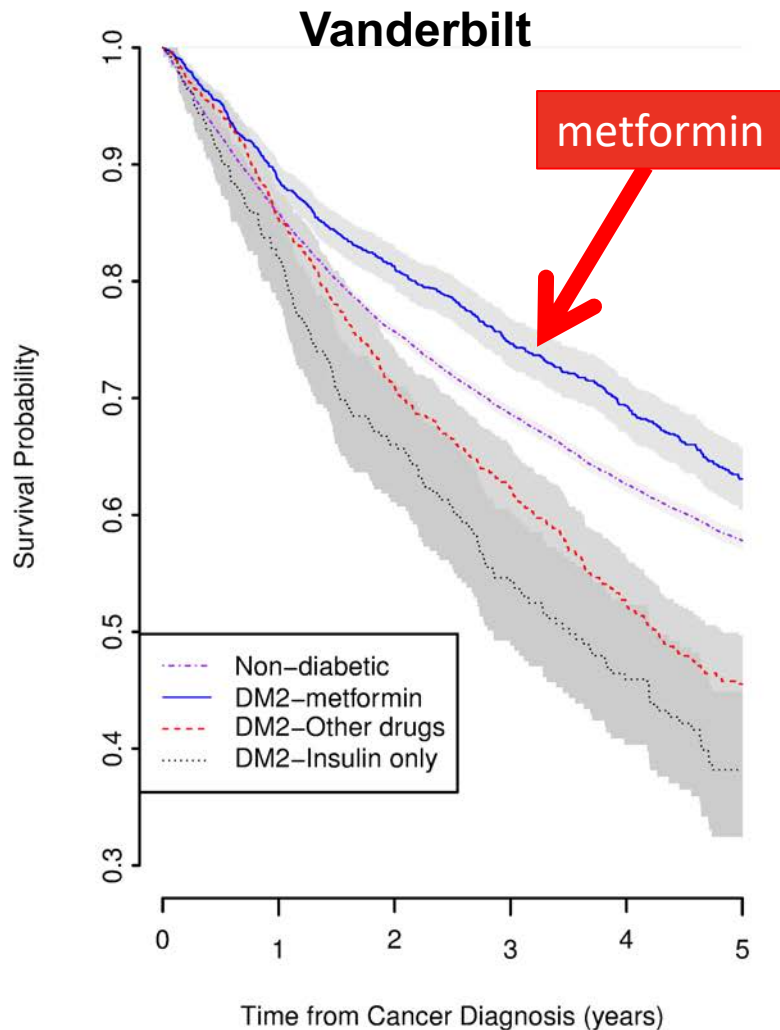
Examples of Medical AI Applications

- Read images (X-Ray, CT, skin, retina, etc.)
- Predict which COVID patients need ventilators
- Predict sepsis onset before detection
- Use Natural Language Processing (NLP) to process notes, reports, etc.
- Make diagnosis for common and rare diseases
- Calculate risks (MI, heart failure, readmission, etc.)
- Predict disease progression (e.g., diabetes to retinopathy to kidney failure)
- Detect Parkinson's from keyboard typing or smartphone touching
- Discover new functions of existing drugs
- Discover genetic mutations of cancers
- Take medical license exams
- Discover and predict insurance claims
- Optimize coding for billing
- More, more, more...

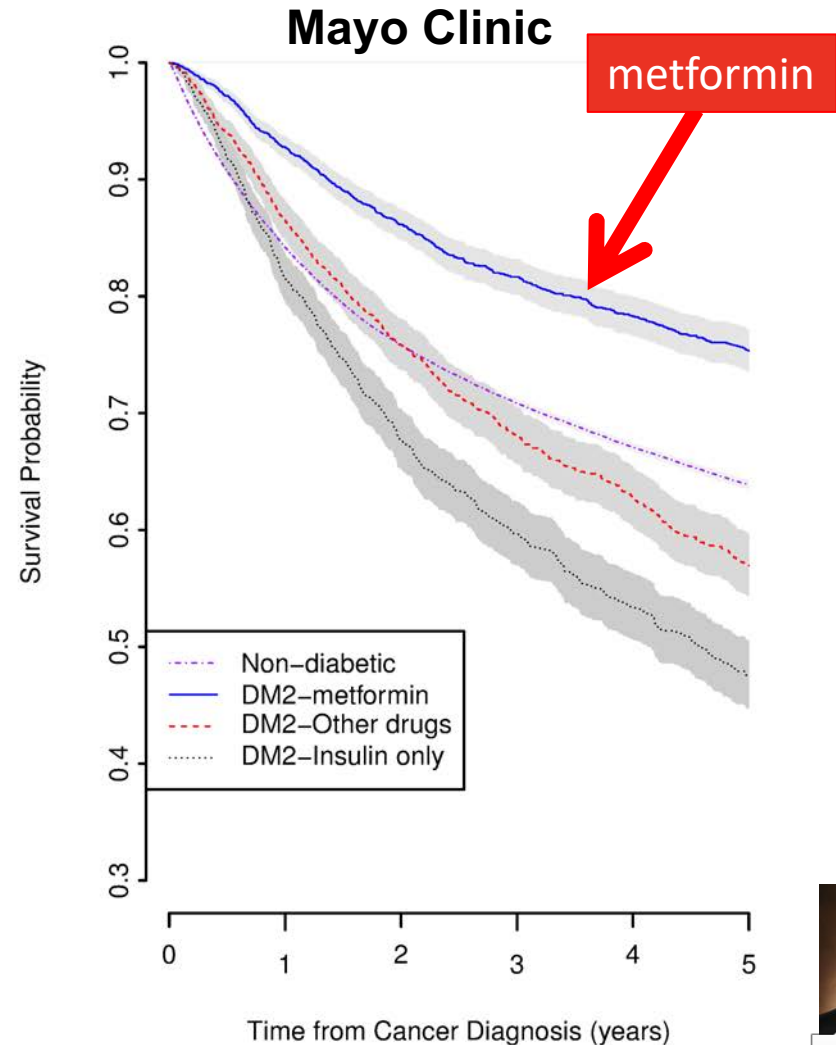


Drug Repurposing: Metformin for Cancer Treatment

K-M Plot for Vanderbilt Overall Cancer N=32415



K-M Plot for Mayo Overall Cancer N=79258



Hua Xu et al. (2015). Validating drug repurposing signals using electronic health records: a case study of metformin associated with reduced cancer mortality. *Journal of American Medical Informatics Association*, 22 (1), 179–191



Hua Xu



A study of Generalizability of Recurrent Neural Network-Based Predictive Models for Heart Failure Onset Risk using a Large and Heterogeneous EHR Data set

J Biomed Inform. 2018 August ; 84: 11–16. doi:10.1016/j.jbi.2018.06.011

Laila R Bekhet¹, Yonghui Wu², Ningtao Wang³, Xin Geng¹, Wenjin Jim Zheng¹, Fei Wang⁴, Hulin Wu³, Hua Xu^{1,*}, and Degui Zhi^{1,*}

Degui Zhi

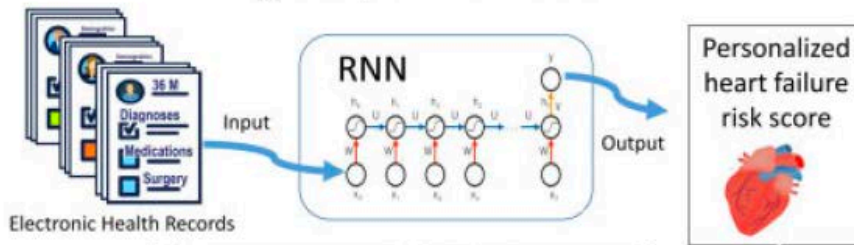
Heart Failure

- the heart can't pump enough blood to meet the body's needs.
- 5 million US patients in 2016
- \$30 billion cost

Cerner Healthfacts Database

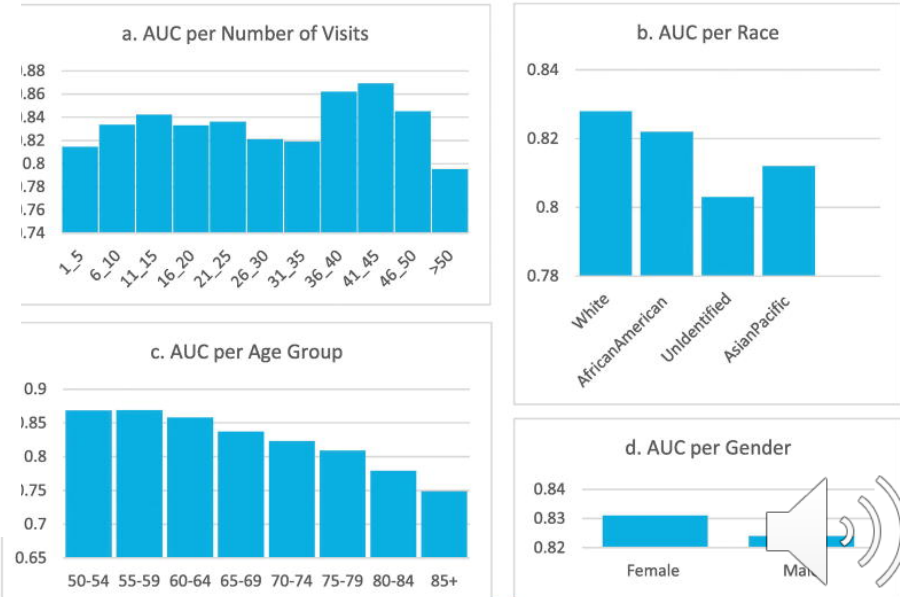
- 600 hospitals/clinics
- 50 million unique patients
- > 10 years of records
- 110 million patient visits

Artificial Intelligence predicts disease risk from EHR

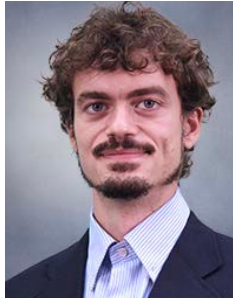


Before	Our Study
3,884 patients	152,790 patients
1 health systems	81 health systems
AUC 87%	AUC 79 – 85% across hospitals

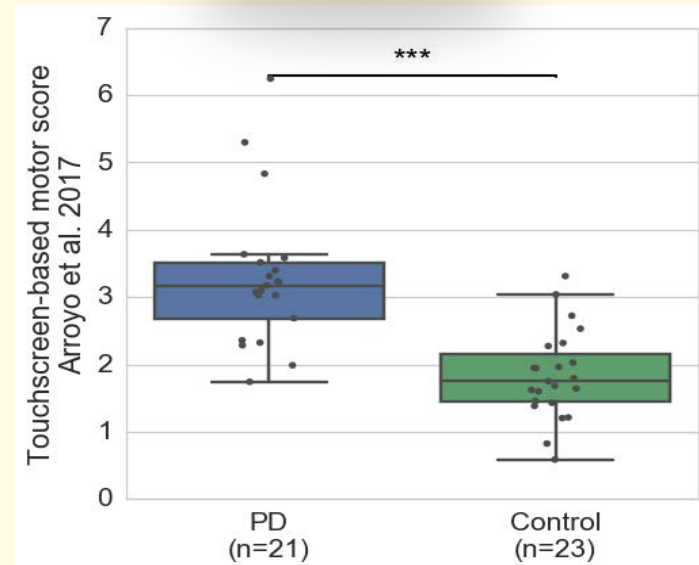
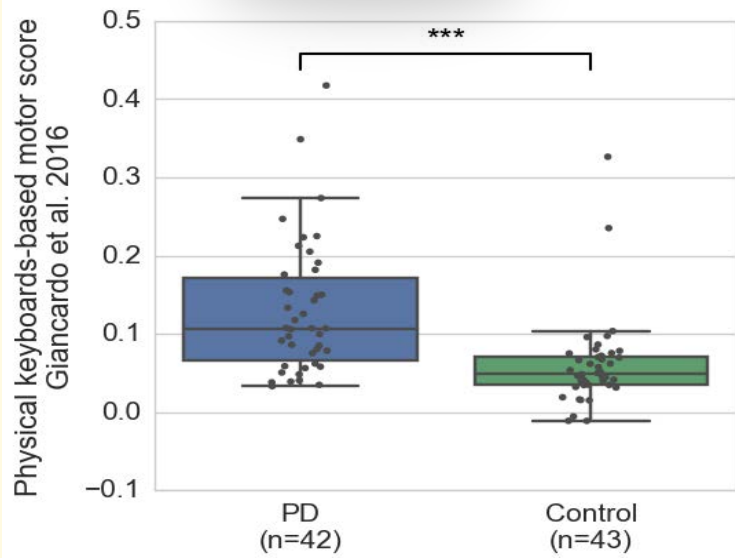
Transfer to other hospitals with only 3.6% reduction of AUC



Detect Parkinson's Disease from Typing or Touching



Luca Giancardo



Giancardo et al., Psychomotor Impairment Detection via Finger Interactions with a Computer Keyboard During Natural Typing. *Nature Scientific Reports*, 2015.



Sepsis Prediction Before Onset

- The leading cause of death in U.S. hospitals. 1 patient dies every 2 minutes in the US—more than breast cancer, prostate cancer and HIV *combined*.

- Mortality increases 8% for every hour that treatment is delayed

- 80% sepsis deaths preventable

UTHealth Project:

4 Hour Prediction
of Severe Sepsis:

Model: Deep LSTM

Performance (AUC)

- AUC = 0.92
- Status Quo 0.85



Bella Patel, MD



Xiaoqian Jiang, PhD



Robert Murphy, MD



The Eyes Are The Windows Of Health



Luca Giancardo, PhD, an expert in machine learning, collaborates with neurologists like Sunil A. Sheth, MD, and other health care professionals to develop artificial intelligence techniques for evaluating patients who suffer a stroke to help them receive timely care regardless of where they live. (Photo by Terry Vine Photography)





Medical AI
is easy.



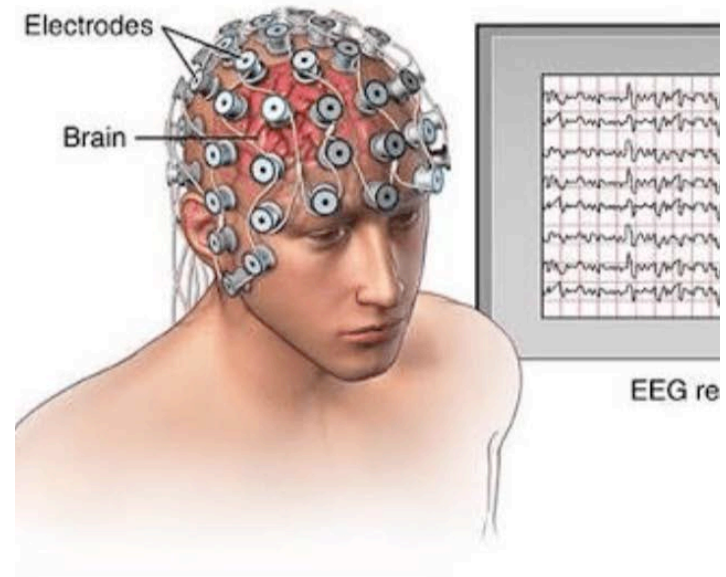


Predict Sudden Unexpected Death in Epilepsy (SUDEP)

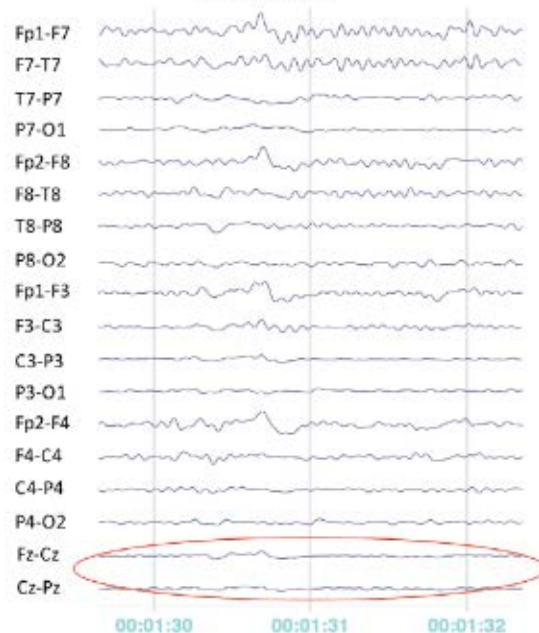
- 35 students from Rice, UTHealth, TAMU, University of Houston, etc.
- Detect the onset of slow activity after seizures based on messy EEG signals
- AUC 0.84 from the best model
- Published 5 papers in a BMC special issue



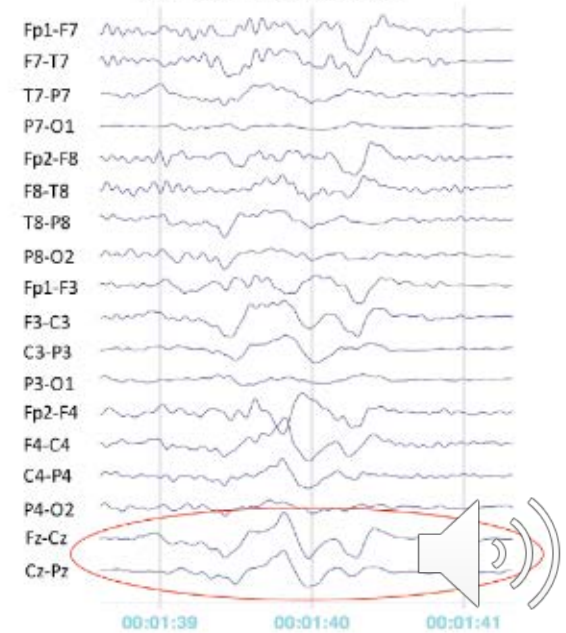
Electroencephalogram (EEG)



PGES EEG Signal

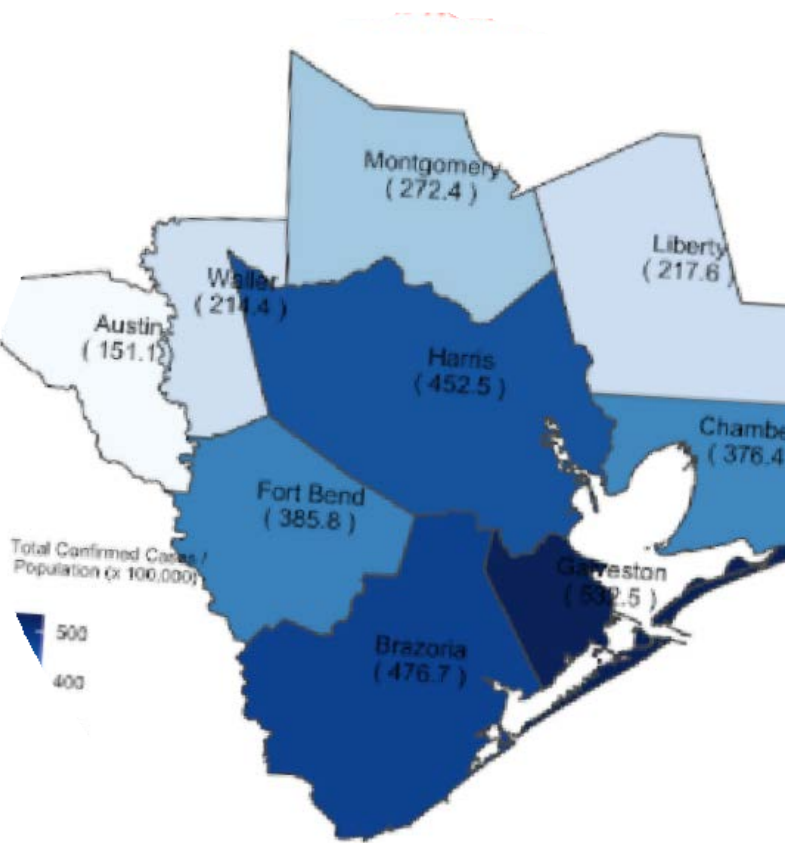


Intermittent Slow EEG Signal



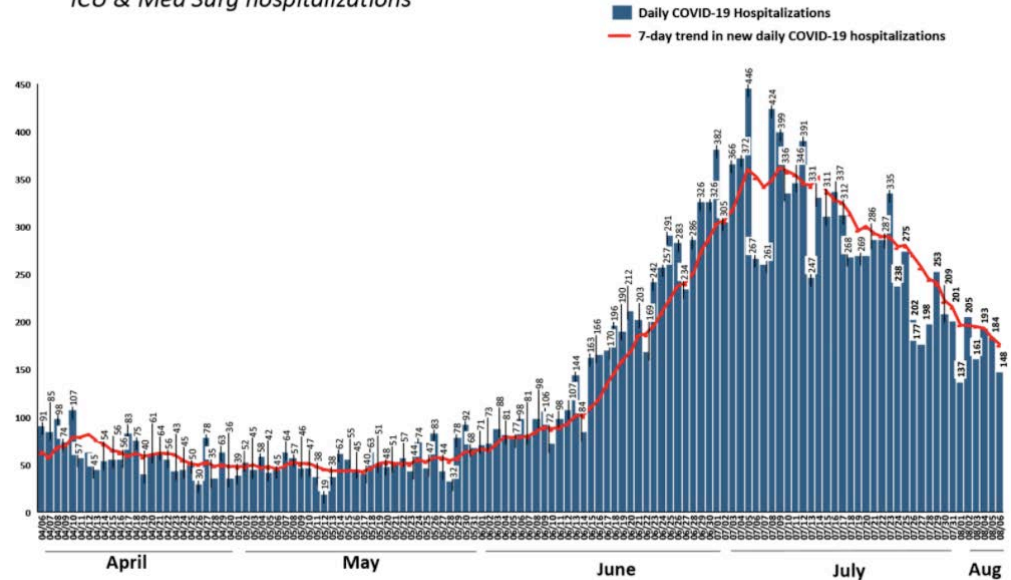
COVID-19 HOUSTON

DATAATHON 2020



TMC DAILY NEW COVID-19 HOSPITALIZATIONS

ICU & Med Surg hospitalizations



Source: TMC institution clinical census
 TMC | TEXAS MEDICAL CENTER
 TMC refers to the group of systems that make up Texas Medical Center

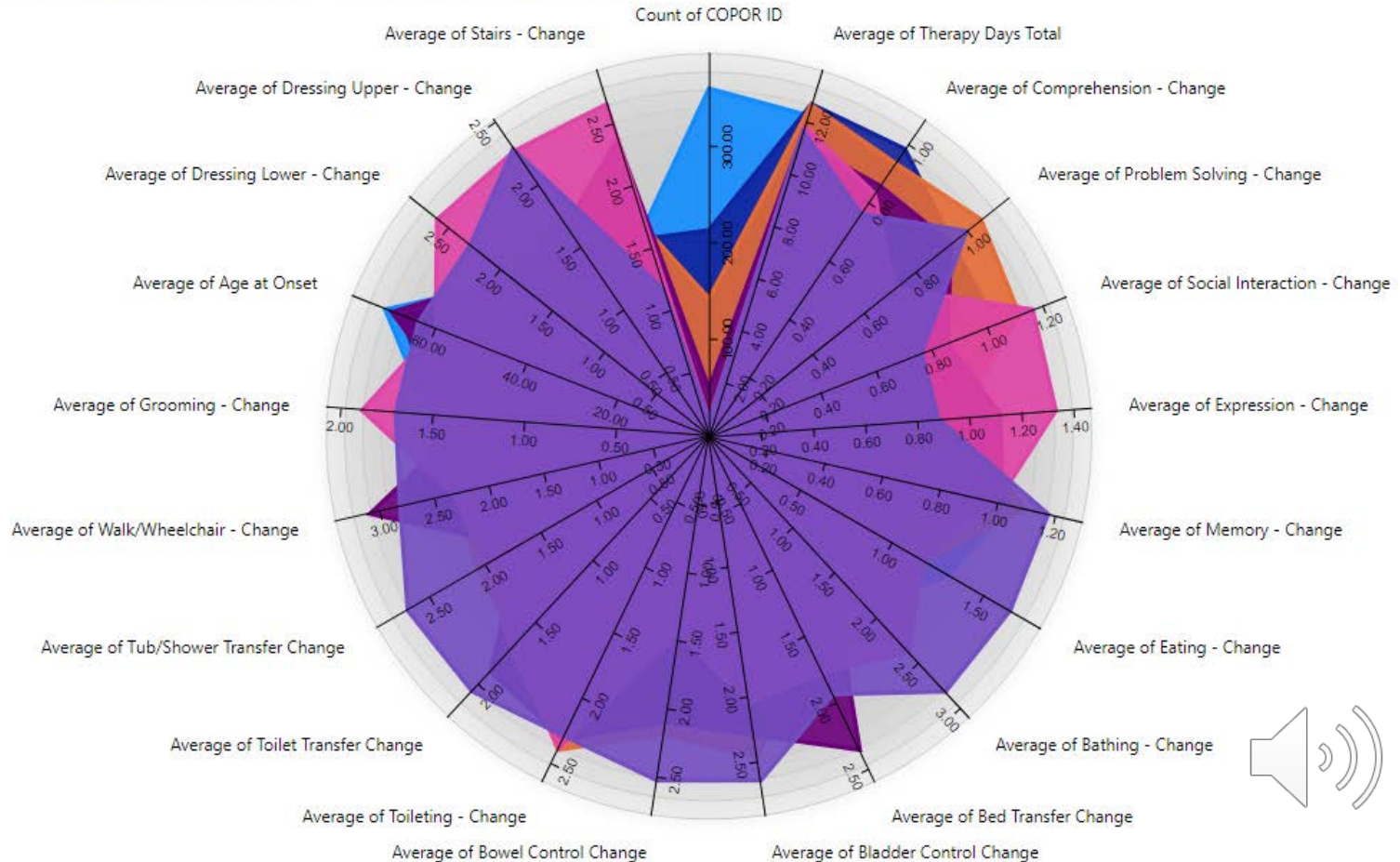
- Predict COVID-19 hospitalization and mortality in Houston Metro Area
- Data available:
 - historical hospitalization and mortality rates;
 - infection, recovery, active, and test cases (9 counties)
 - population mobility, demographics, and mask usage
- 34 students from Rice, UTHealth, U. of Houston, etc.
- Best model performance:
 - Mean Squared Logarithmic Error (MSLE) for 8 counties is 16.5





- In 2017, 7.8 million US adults survived a stroke. Stroke remains a leading cause of morbidity and disability.
- Develop algorithms to predict changes in cognitive and Functional Independence Measure (FIM) scores
- 27 students from Rice, UTHealth, TAMU, University of Houston, etc.
- Best model performance:
 - L1 (Manhattan) distance = 14.36 on 18 FIM scores

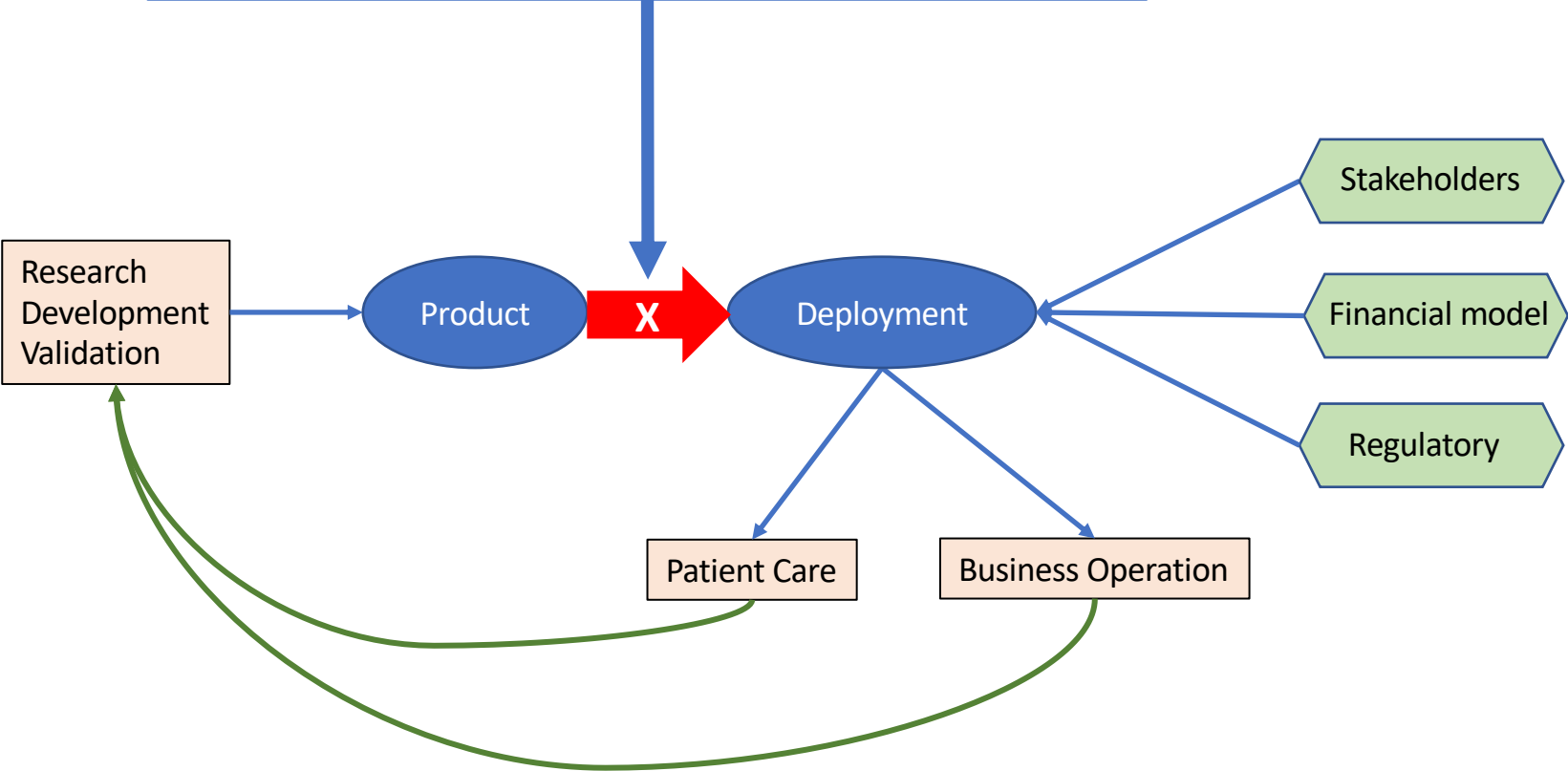
Race ● Caucasian ● Other ● African American ● Unknown ● Asian ● Hispanic



Medical AI
is hard.



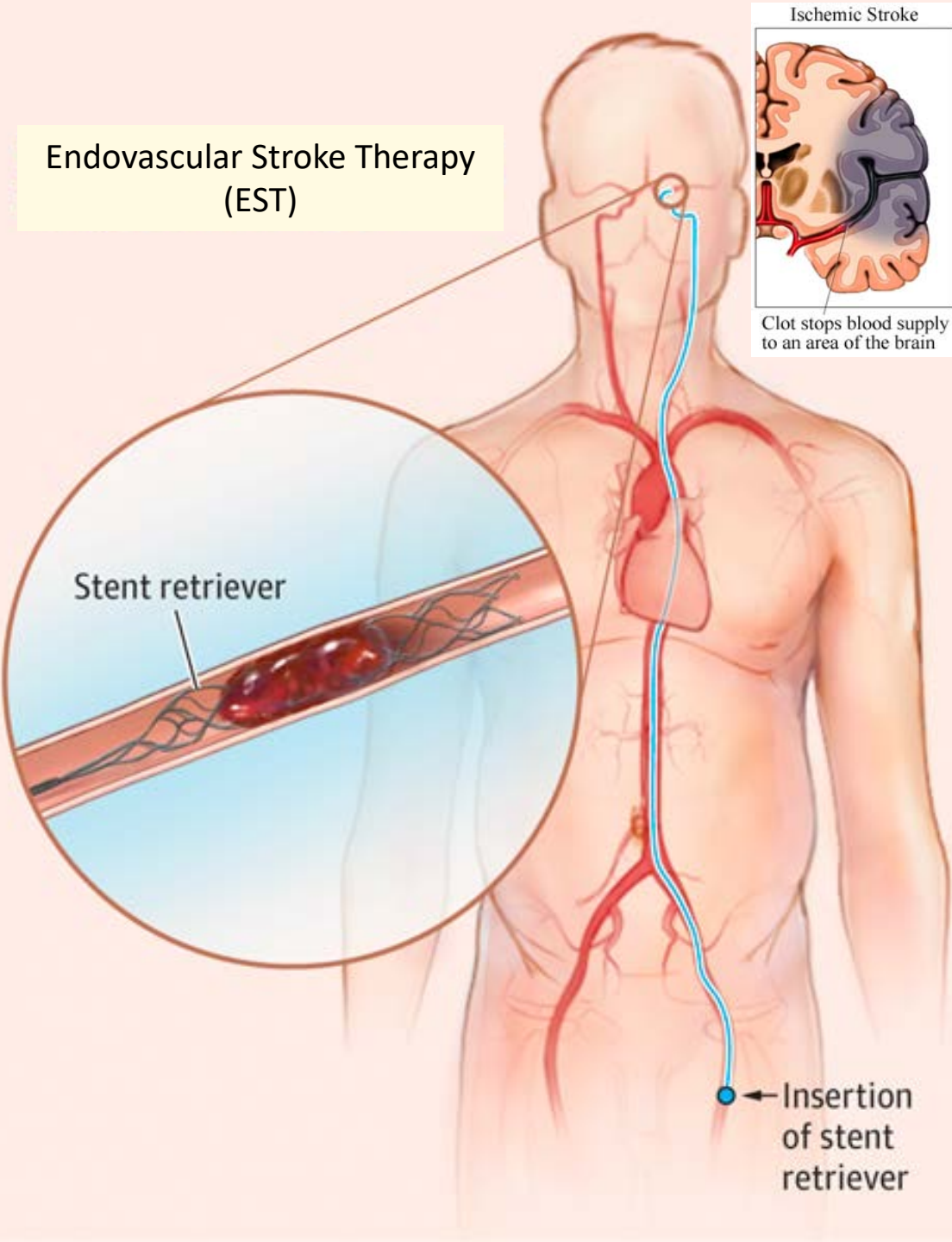
Most academic (and industrial) medical AI products never get deployed



A Case Study: CT Imaging for Stroke

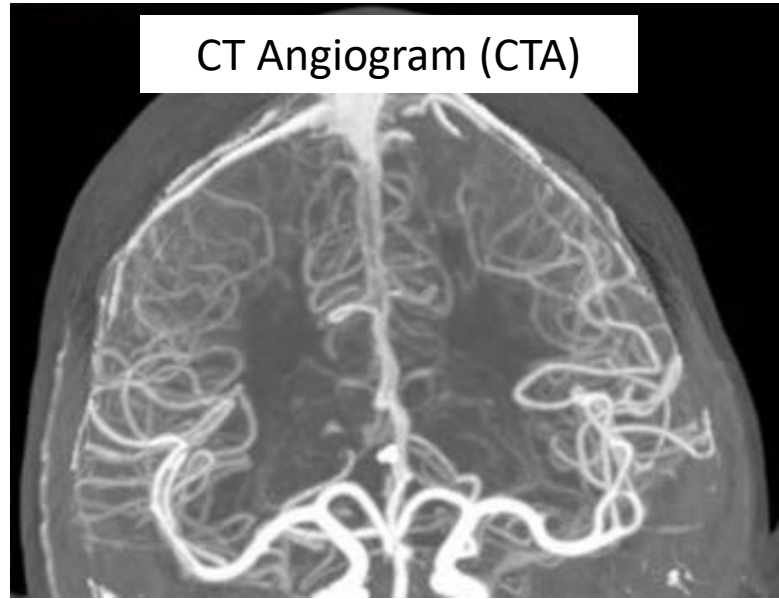


Endovascular Stroke Therapy (EST)



- Ischemic Stroke: 87% of all strokes
- Endovascular Stroke Therapy (EST) significantly improves stroke outcomes
- CT Perfusion (CTP) is not widely available
- CT Angiogram (CTA) can help determine eligibility

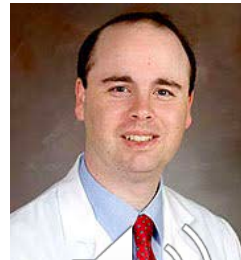
CT Angiogram (CTA)



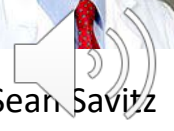
Luca Giancardo
PhD



Sunil Sheth
MD

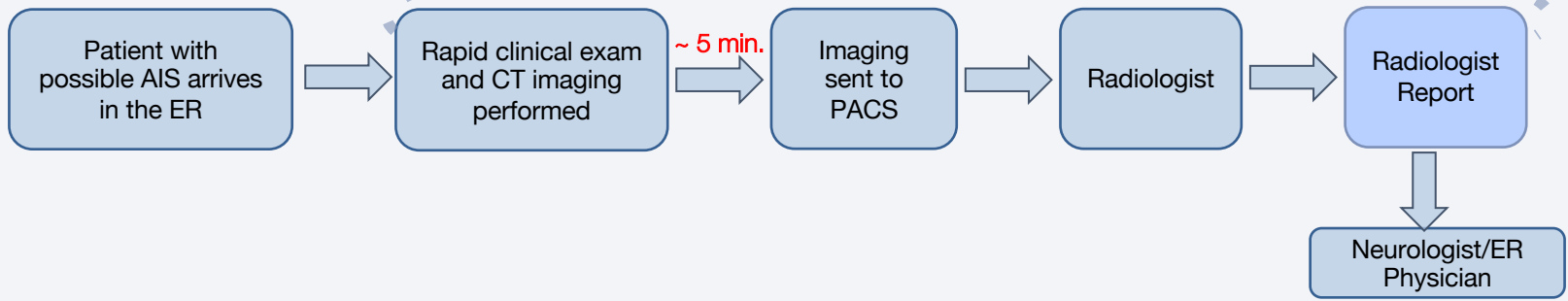


Sean Savitz
MD



Current Stroke Care

65 minutes (median)



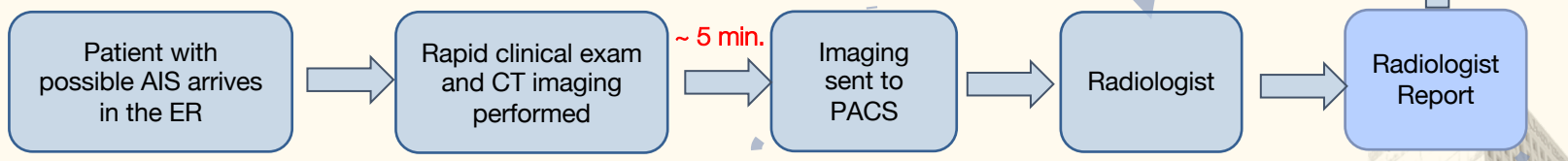
DeepSymNet Care

Brain images automatically analyzed by DeepSymNet, a machine learning based algorithm

Alerts indicating the most likely stroke type

Treatment Decision

1 minute



DeepSymNet reduces the time to treatment decision



Current Status

- The algorithm works well as stroke alert generation
- 1,985 unique subjects from 1/15/2020 to 1/10/2021.
- Pipeline running time < 1 min
- Pipeline integrated in 4 hospitals at Memorial Hermann System

New LHC Relevant Study. LVO likely.



lhc-stroke@googlegroups.com <lhc-stroke@googlegroups.com>
on behalf of LHC server <deepsymnet@gmail.com>
To: lhc-stroke@googlegroups.com



[Download All](#) [Preview All](#)

**** EXTERNAL EMAIL ****

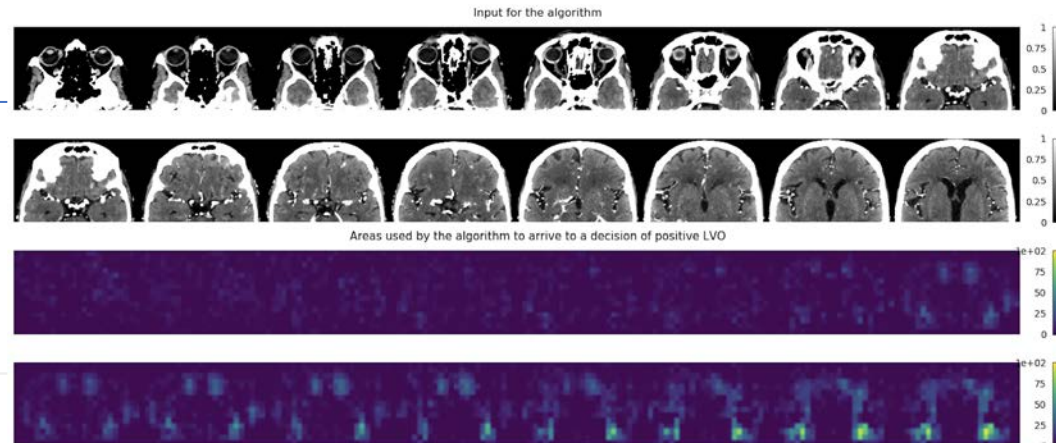
New Study

InstitutionName: 'Memorial Hermann MC'
StationName: 'MCSIECTER1'
StudyDescription: 'BRAIN/NECK STROKE CTA'
SeriesDescription: 'Scout', 'Patient Protocol', 'CTA', 'Angio 0.6', 'Cor-MIP', 'Sag- MIP', 'Sagittal', 'Coronal', '1mm Sag- MIP', '1mm Cor-MIP'
Acquisition date and time: Wed Jul 15 12:40:41 2020 - Wed Jul 15 12:40:56 2020

====ML analysis

LVO score from CTA: 0.54
CTA Series Used: Angio 0.6

IQR for non-LVO subjects 0.03 - 0.13
IQR for LVO subjects 0.13 - 0.93
(estimated on validation set n=441, AUC=0.85)
model ver. exp34-newnet-p2



- Record FAST time of “bench-to bedside”. It took a year to go from idea to implementation in the hospital
- First “in-house” multisite live imaging / machine learning pipeline in the UTHealth-Memorial Hermann
- This framework can be expanded to many other projects





Medical AI requires deep clinical integration.



PROCESSES

ENTITIES

10110
00110
10110
11010



Acquisition

Storage

10110
001
101
11010



Processing

Communication



Integration



Analysis



Mining



Presentation



Interpretation



Retrieval

DATA

UNINTERPRETED

Meaningless Symbols

INFORMATION

DESCRIPTIVE

Interpreted Data

KNOWLEDGE

PREDICTIVE

Validated Information

INTELLIGENCE

PRESCRIPTIVE

Actionable Knowledge

DOMAINS

Biomedical
Discovery

Healthcare
Delivery

Disease
Prevention

Biomedical
Informatics

Health Data
Science

Medical AI





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Health Science Center at Houston

**School of Biomedical
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