

# AI in Healthcare: Hope vs. Hype

J.D. Whitlock, MPH, MBA  
CIO, Dayton Children's



**himss**  
CENTRAL & SOUTHERN OHIO *Chapter*



“WE ALWAYS OVER ESTIMATE THE CHANGE  
THAT WILL OCCUR OVER THE NEXT 2  
YEARS AND UNDER ESTIMATE THE CHANGE  
THAT WILL OCCUR OVER THE NEXT 10.”

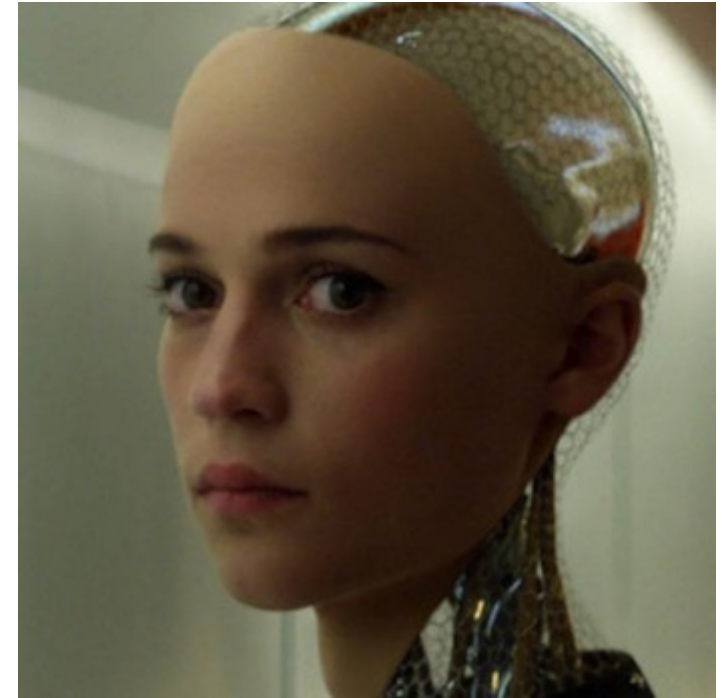
- *BILL GATES*

Atul Grover, MD, PhD [@AtulGroverMD](#)

*30 years from now we may have AI doing a lot of work but I don't foresee Artificial Compassion*

Isaac Kohane [@zakkohane](#) replying to [@AtulGroverMD](#)

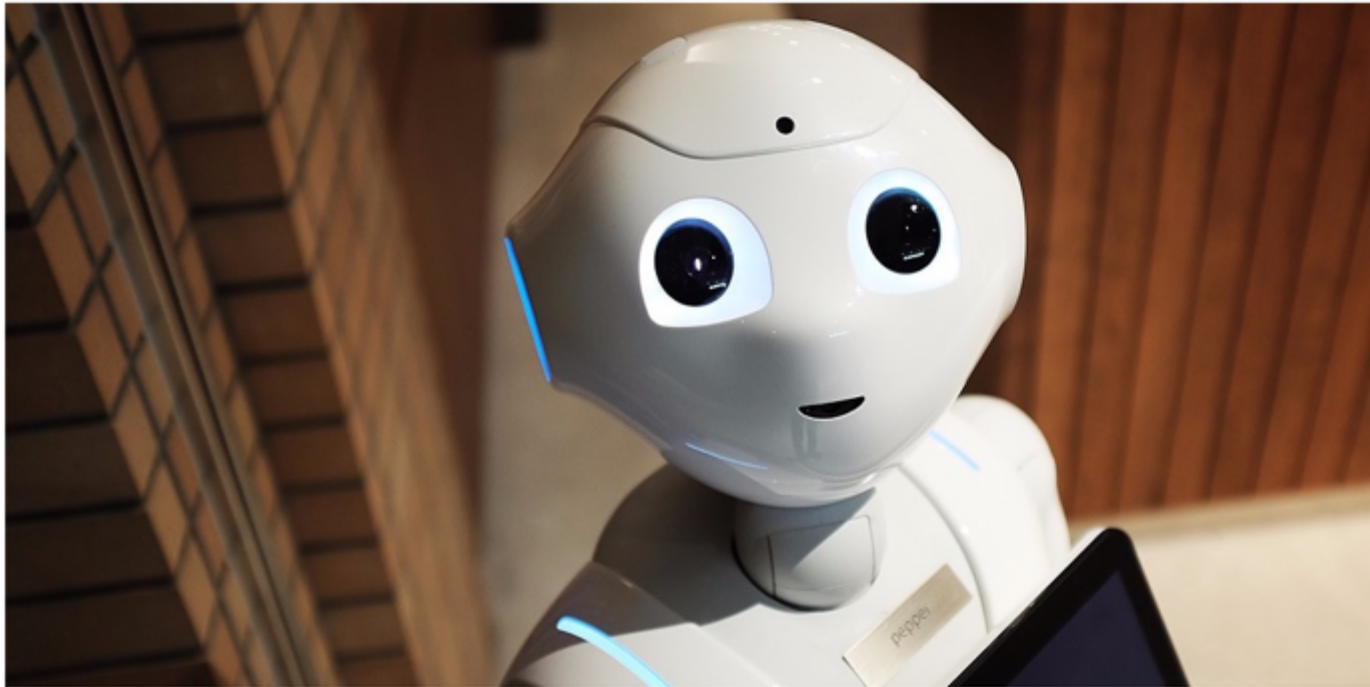
*If 30 years from now, an AI talking to you SEEMS more compassionate than many harried docs today, will the distinction matter?*



# Dr. Alexa Is Ready to See You: Are You Ready for AI Doctors?

September 17th 2019

 TWEET THIS



Artificial Intelligence (AI) has rapidly gone from something we only see in sci-fi movies to a technology we interact with every day. From making product recommendations to finishing your sentences, AI is everywhere.

But will AI replace doctors in a hospital?

<https://hackernoon.com/dr-alexa-is-ready-to-see-you-are-you-ready-for-ai-doctors-4rje3a5w>



## Viewpoint

May 20, 2019

# Artificial Intelligence in Health Care Will the Value Match the Hype?

Ezekiel J. Emanuel, MD, PhD<sup>1,2</sup>; Robert M. Wachter, MD<sup>3</sup>

» Author Affiliations

*JAMA*. 2019;321(23):2281-2282. doi:10.1001/jama.2019.4914

Artificial intelligence (AI) and its many related applications (ie, big data, deep analytics, machine learning) have entered medicine's "magic bullet" phase. Desperate for a solution for the never-ending challenges of cost, quality, equity, and access, a steady stream of books, articles, and corporate pronouncements makes it seem like health care is on the cusp of an "AI revolution," one that will finally result in high-value care.

While AI has been responsible for some stunning advances, particularly in the area of visual pattern recognition,<sup>1-</sup>  
<sup>3</sup> a major challenge will be in converting AI-derived predictions or recommendations into effective action.

<https://jamanetwork.com/journals/jama/article-abstract/2734581>

# Speaking of Hype ...

 You Retweeted



**Atul Butte**  @atulbutte · May 6


Sometimes I think there are more meetings & conferences about #AI in biomedicine, than there are actual practitioners of #AI in biomedicine...

 23

 111


 443




**Atul Butte** 

@atulbutte

Physician scientist, entrepreneur. Director, Institute for Computational Health Sciences (@UCSF\_ICHS), Chan Zuckerberg Distinguished Professor, @UCSF

 San Francisco, CA

 [profiles.ucsf.edu/atul.butte](https://profiles.ucsf.edu/atul.butte)

**HIMSS**

CENTRAL & SOUTHERN OHIO Chapter

# ... A Lot of Wasted Private Equity in Healthcare

 You Retweeted



**Farzad Mostashari**  @Farzad\_MD · Apr 21

Headline writers, please never ever again use

"\_\_\_ startup raises \$\_\_M to reimagine healthcare"

**Erik Pupo** @erikpupo

Parsley Health picks up \$10 million to reimagine healthcare | TechCrunch  
[techcrunch.com/2018/04/17/par...](https://techcrunch.com/2018/04/17/par...)

# When Bad Math Kills People

HEALTH NEWS MAY 2, 2018 / 8:17 AM / 2 MONTHS AGO



## Breast cancer screening failure may have shortened 270 lives in England

LONDON (Reuters) - As many as 270 women in England may have died prematurely of breast cancer because of an IT failure that led to 450,000 patients missing out on routine screening appointments.

Health Secretary Jeremy Hunt apologized in parliament for the “serious failure,” which he said was the result of a mistake in a computer system’s algorithm dating back to 2009 but identified only in January this year. He ordered an independent review.





Farzad Mostashari   
@Farzad\_MD



1/ #EpiTwitter tweetstorm coming

Warning: strong opinions

The analysis is naive and the findings are ridiculous; the fact that it was published is a sign that when medical journal editors hear "deep learning AI" their brains stop working.

 **Eric Topol**  @EricTopol · Sep 4

Predicting skin #cancers with deep learning #AI using electronic medical records [jamanetwork.com/journals/jamad...](http://jamanetwork.com/journals/jamad...) importance of medications; non-melanoma AUC 0.89 @JAMADerm

**JAMA Dermatology | Original Investigation**

**Assessment of Deep Learning Using Nonimaging Information and Sequential Medical Records to Develop a Prediction Model for Nonmelanoma Skin Cancer**

From the King MD HealthCare (Dr. Wang, Mr. Fu, Dr. Lee); MD, PhD

**OBJECTIVE** A prediction model for non-melanoma skin cancer could enhance prevention measures, but few patient data-driven models for non-melanoma skin cancer exist.

**DESIGN** To determine feasibility to develop a prediction model for incident nonmelanoma skin cancer based on age, sex, nonimaging, and sequential medical information.

**SETTING** 107,000 patients from the Texas Cancer Research Database (TCRD) from January 1, 1999, to December 31, 2013. A total of 10,000 patients with nonmelanoma skin cancer in the TCRD were included in the analysis. A total of 10,000 patients with nonmelanoma skin cancer were included in the analysis. A total of 10,000 patients with nonmelanoma skin cancer were included in the analysis. A total of 10,000 patients with nonmelanoma skin cancer were included in the analysis.

**RESULTS** A total of 10,000 patients (10,000) with nonmelanoma skin cancer were included in the analysis. The model achieved an AUC of 0.89 (95% CI, 0.87-0.91) for incident nonmelanoma skin cancer. The model achieved an AUC of 0.89 (95% CI, 0.87-0.91) for incident nonmelanoma skin cancer. The model achieved an AUC of 0.89 (95% CI, 0.87-0.91) for incident nonmelanoma skin cancer.

**CONCLUSIONS AND RELEVANCE** The findings of this study suggest that a prediction model may have potential applications for nonmelanoma skin cancer. This model may help build a care program with target high-risk populations for nonmelanoma skin cancer prevention.

JAMA Dermatol. doi:10.1001/jamadermatol.2019.0000  
© 2019 American Medical Association. All rights reserved.

**Table 3. Important Features for Model**

Medication
All features included
Age
Comorbidities
Comorbidities of skin
Dermatologic intensity
Hyperpigmentation
Diabetic history (severity)
Diabetic obstructive pulmonary
Medications
Trastuzumab
Acute
Systemic and topical agents (topical)
Statins
Tricyclic antidepressants
MSA
Tricyclic antidepressants
β-blockers
Neuroleptics
ACE inhibitors and ARBs
Stem cell transplantation
Calcium channel blocker (CCB)

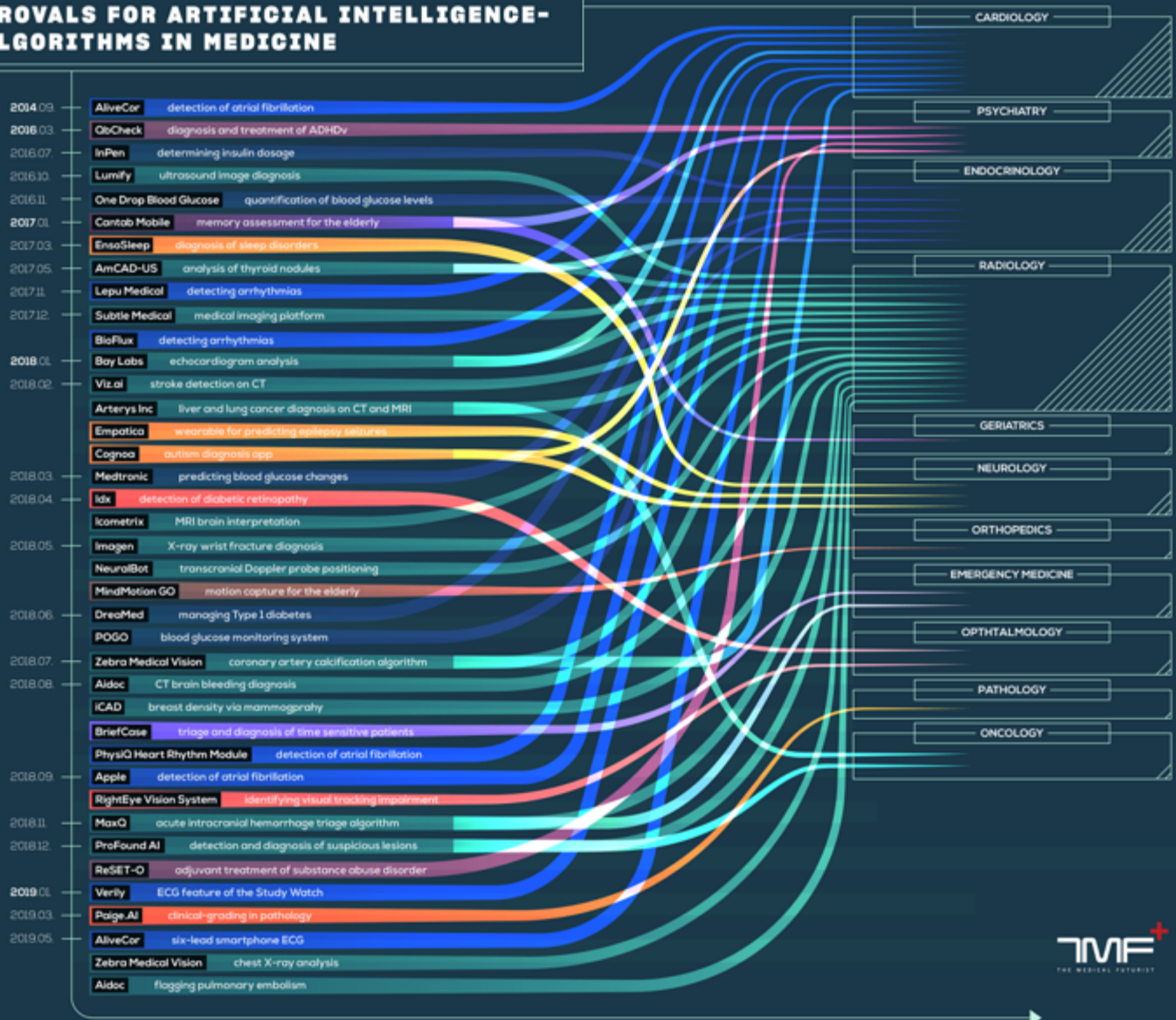
AUC: 0.894 (0.887)

**Time Di**

**D-9 (n = 1092)**

**Drugs (n = 588)**

# FDA APPROVALS FOR ARTIFICIAL INTELLIGENCE-BASED ALGORITHMS IN MEDICINE

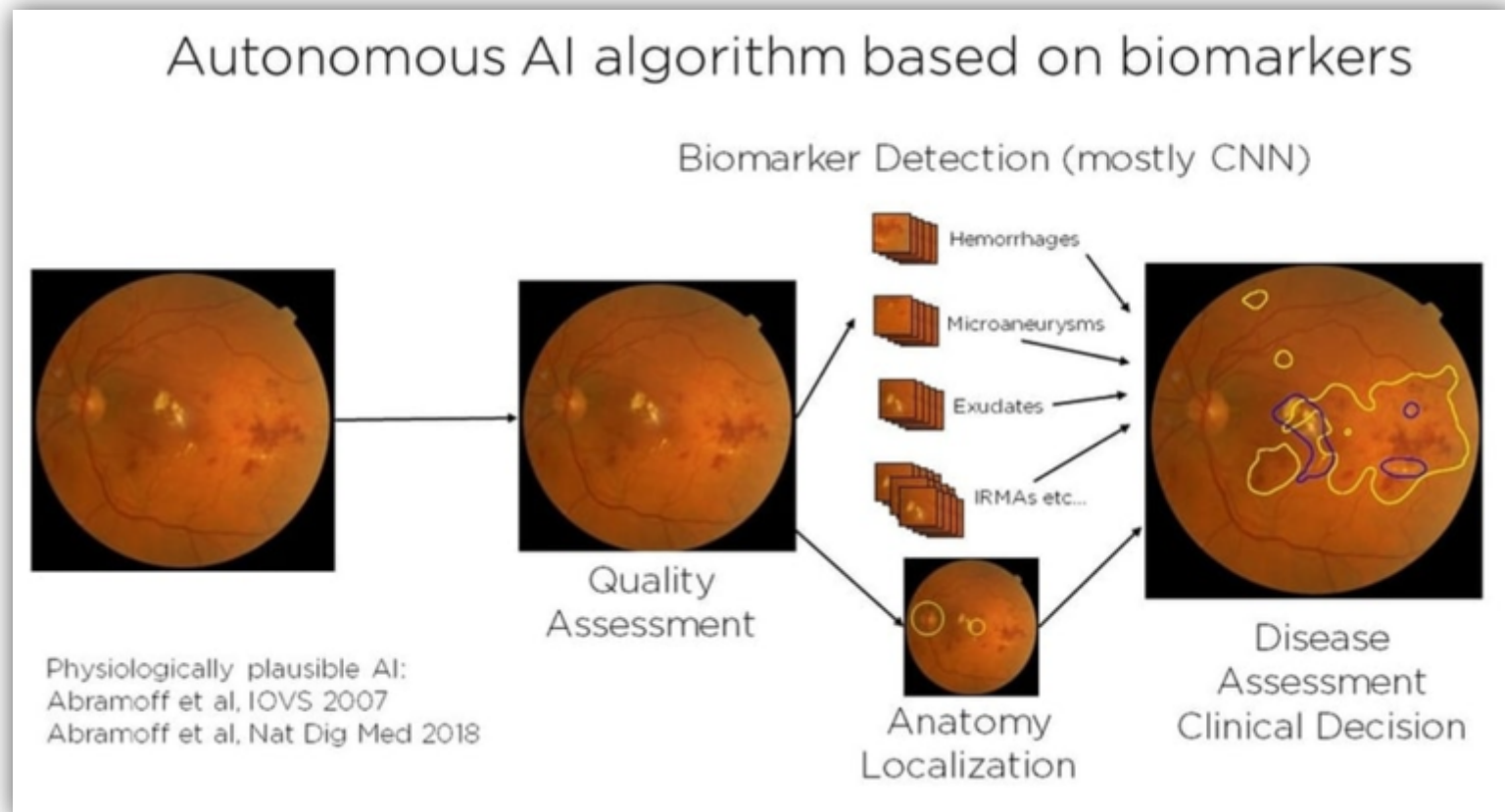




# Diabetic Retinopathy: Problem Statement

- More than 30 million Americans have diabetes
- An estimated 24,000 lose vision each year from diabetic retinopathy, a complication of diabetes
- If caught in its early stages, vision loss and blindness are almost entirely preventable
- Only about half of people with diabetes get regular eye exams

# Diabetic Retinopathy: AI Solution



<https://www.eyediagnosis.net/idx-dr>

## University of Iowa Healthcare rolls out first autonomous AI diagnostic system cleared by the FDA

The artificial intelligence tool detects diabetic retinopathy in medical images, which can help prevent blindness in diabetes patients.

By **Bill Siwicki** | July 12, 2018 | 01:44 PM



- Enables provider practices who are not normally involved in eye care to test for diabetic retinopathy during routine office visits
- After just a few hours of training, non-clinical staff are able to use the system to perform diabetic retinopathy testing
- Black box autonomous AI diagnosis is OK in this particular case because “positive” result is just referred on to an optometrist
- Transformational technology, no clinical workflow challenges, benefit to patient and provider, FDA approval: Should be selling like hotcakes, right?

<https://www.healthcareitnews.com/news/university-iowa-healthcare-rolls-out-first-autonomous-ai-diagnostic-system-cleared-fda>

# The Last Hurdle ... Billing & Quality Reporting



- In the year since FDA approval, IDx has gained only 15 customers
- Camera is \$20K: makes financial sense at larger scale practices, not small individual provider clinics
- Challenges with quality measure reporting due to variation in coding for billing
- New billing code dedicated to this procedure has been approved, but will not be effective until January 2021
- A lot of potential customers in sales pipeline, but they are waiting to pull the trigger until quality reporting and billing issues are resolved



Following

## Suchi Saria

@suchisaria

John C. Malone Prof@ Hopkins, ex-Stanford SAIL, TR35, Sloan, YGL @wef, DARPA YFA  
Interests: #AI + Augmented Intelligence, Bayes, #ML, Causal Inf, healthcare

Manhattan, NY [suchisaria.jhu.edu](https://suchisaria.jhu.edu) Joined May 2010

410 Following 9,816 Followers

Followed by Stacy Sheldon, Christina Farr, and 5 others you follow

Tweets

Tweets & replies

Media

Likes

Pinned Tweet



**Suchi Saria** @suchisaria · Oct 9, 2018

Seeking a postdoctoral fellow interested in augmented decision-making i.e., exploring principles for building #AI reasoning algorithms that support human experts in decision-making when safety is critical. You will be joining an amazing interdisciplinary team funded by #NSF

3

34

62



CENTRAL & SOUTHERN OHIO Chapter

# Suchi Saria comments on FDA AI approvals:

- *Almost all have sought approval in applications relying on processing a single image like signal (e.g. CT scan). These are device generated and here, drift—changes in practice pattern across hospitals or over time—isn't a big issue.*
- *OTOH, integrating many streams, especially streams generated by human observations (e.g. clinical notes, lab time series), require tackling drift, which is a challenging issue. Many health systems are deploying home grown algorithms without tackling issues like drift or inadequate monitoring, which I think should be a serious concern.*

<https://www.linkedin.com/feed/update/urn:li:activity:6552928045295026177/>



# Success with Diagnostic Imaging AI

- AI is now better at detecting skin cancer than dermatologists
  - AI AUC .86 vs. dermatologists AUC .79 ( $P < 0.01$ )
  - <https://academic.oup.com/annonc/advance-article/doi/10.1093/annonc/mdy166/5004443>
- AI is now better than radiologists at detecting pneumonia
  - <https://arxiv.org/abs/1711.05225>
- AI can vastly accelerate alignment of subsequent MRI images
  - <https://www.healthdatamanagement.com/news/mit-algorithm-speeds-process-of-image-registration>
- AI can save lives by telling a radiologist which study to read first
  - e.g. out of the 10 scans waiting to be read by a radiologist with STAT priority, there appears to be a bleed on #7 so read that one next

# AI can now save your life by suggesting to a physician that they should NOT operate on your pancreas

## An experimental AI system can predict when pancreatic cysts will become cancerous

By CASEY ROSS @caseymross / JULY 17, 2019



A cluster of pancreatic cancer cells.  
ANNE WESTON/FRANCIS CRICK INSTITUTE/WELLCOME

Pancreatic cancer often kills people because they are diagnosed too late, after their tumors have spread. Other patients may die following the removal of harmless cysts that appear threatening amid a fog of imaging data and other clinical information.

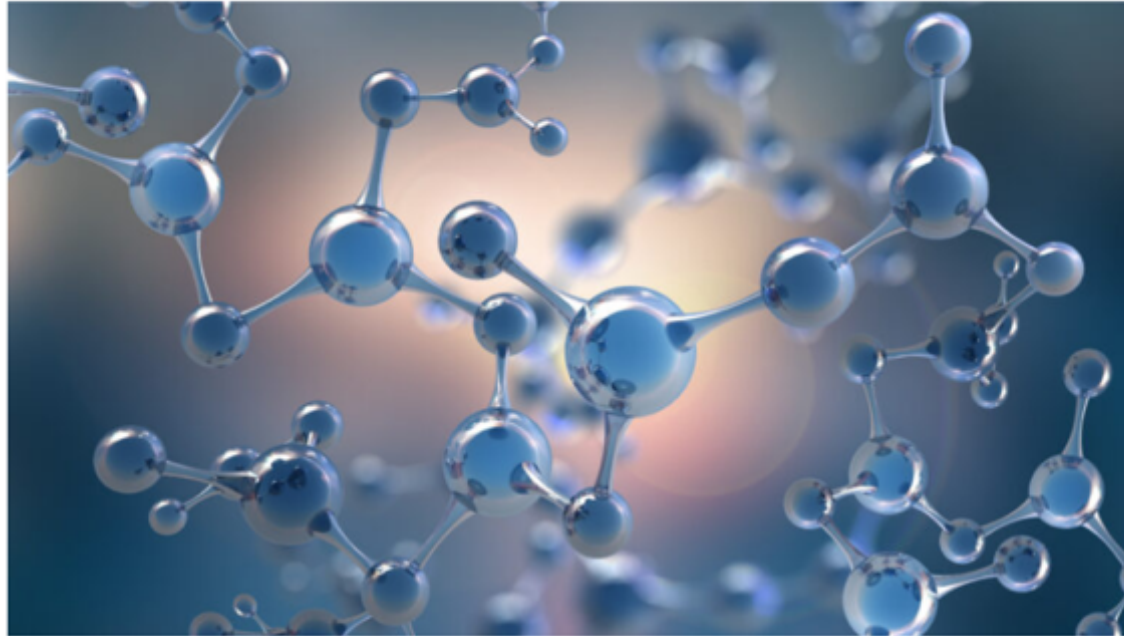
But a new artificial intelligence system unveiled Wednesday by doctors at Johns Hopkins offers to provide a clearer picture for patients: In testing, it displayed a superhuman ability to differentiate harmful lesions from ones that pose no threat at all.

A study published in [Science Translational Medicine](#) detailing the performance of the system, dubbed CompCyst, reported that its use would have reduced 60% of unnecessary surgeries in patients whose tumors were found not to be harmful following their procedures.

<https://www.statnews.com/2019/07/17/an-experimental-ai-system-can-predict-when-pancreatic-cysts-will-become-cancerous/>

# AI system can create novel drug candidates in just 46 days, study finds

By CASEY ROSS @caseymross / SEPTEMBER 2, 2019



ADOBE

**I**t often takes years and hundreds of millions of dollars to discover a novel drug candidate. It requires the identification of promising molecules that can grab on to the right protein, synthesizing a compound, and then testing it. The process is so complicated that it has defied most computational methods to shorten it.

But a [paper](#) published Monday in Nature Biotechnology describes a new method using artificial intelligence that, within 46 days, generated compounds capable of hitting a specific disease target.

September 25, 2018

## **Effect of Algorithm-Based Therapy vs Usual Care on Clinical Success and Serious Adverse Events in Patients with Staphylococcal Bacteremia**

### **A Randomized Clinical Trial**

Thomas L. Holland, MD<sup>1,2</sup>; Issam Raad, MD<sup>3</sup>; Helen W. Boucher, MD<sup>4</sup>; [et al](#)

» [Author Affiliations](#) | [Article Information](#)

JAMA. 2018;320(12):1249-1258. doi:10.1001/jama.2018.13155

<https://jamanetwork.com/journals/jama/fullarticle/2703352>

<https://jamanetwork.com/journals/jama/fullarticle/2703302>



**Public Health**  
Prevent. Promote. Protect.

- Randomized trial that included 509 adults with staph infections
- Use of an algorithm compared with usual care resulted in a statistically similar success rate for antibiotic therapy
- The patients whose protocols were set by the algorithm were on the drug for an average of 4.4 days, compared to 6.2 days for those in the usual practice group
- Given that vancomycin is the most commonly prescribed antibiotic in U.S. acute care hospitals and one whose use is associated with growing antibiotic resistance, this could have a significant public health effect if it could be deployed widely

# Patient Deterioration Early Warning

## Creating a Better Early Warning System

### Pain Point

- Current industry standard patient deterioration early warning systems are anything but early – they often don't give hospital staff time to intervene and are plagued with false positives

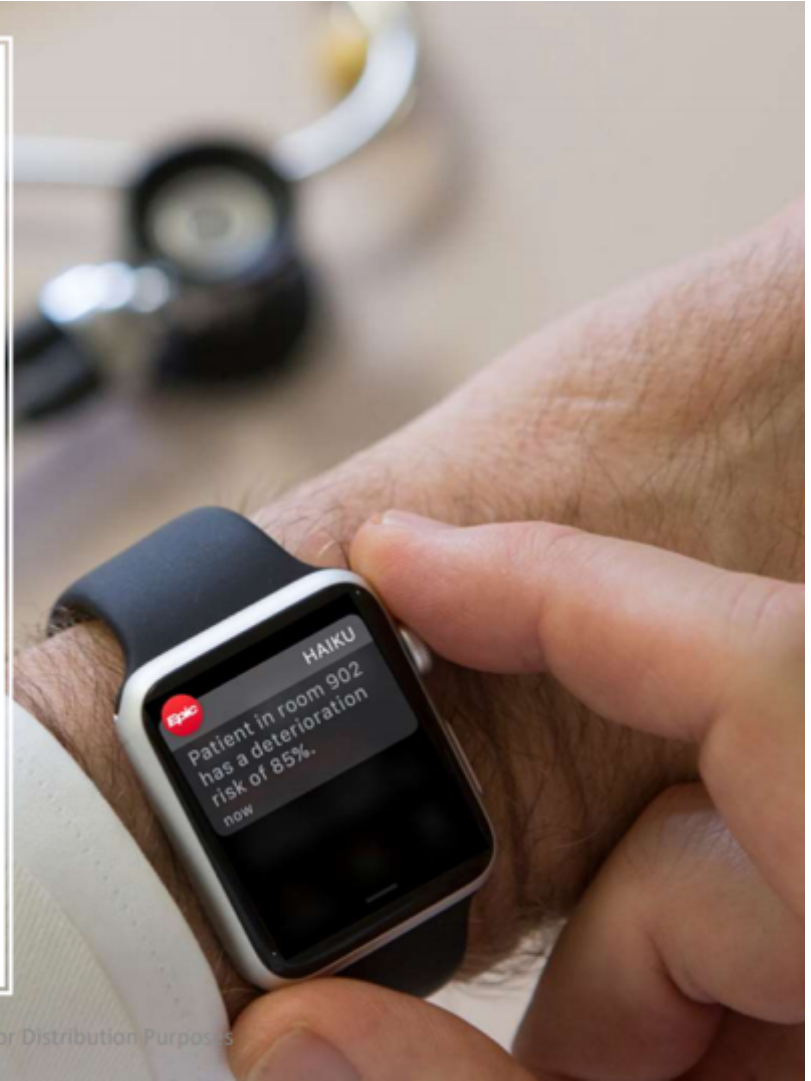
### Challenges

- Labs and Vitals are constantly changing, so early warning systems needs to detect patterns over time
- The early warning system needs to be evaluated in real-time
- Our Rapid Response team needs to be notified via their normal workflows – in the electronic medical record system – so they can quickly jump into the patient's chart



# Ochsner's Patient Deterioration Model

- We used over 1 billion clinical data points, including vitals, lab result values, nursing assessments, and echocardiograms, to create a deep recurrent neural network
- With the results of this model, a newly created Rapid Response team of providers gets real-time notifications when patients exceed a certain risk threshold
- The team can quickly assess the patient and take immediate action



Confidential and Not for Distribution Purposes



# Impressive Results at Ochsner

## Pilot Intervention Results

During our 90-day pilot at Ochsner Medical Center, the team successfully reduced codes outside of the ICU by 44%

Over 40% of alerts resulted in transfer to the ICU

Over 25% of alerts resulted in end of life conversations

<https://news.microsoft.com/transform/ochsner-ai-prevents-cardiac-arrests-predicts-codes/>

## ○ NHRMC Custom Alexa Skills (customer facing)

### **NHRMC Welcome/Orientation Message**

- Room Orientation and personalized greeting from our CNO

### **Informational Voice Skills**

- Patient & Guest NHRMC Dining Options
- TV Channel Guide

### **NHRMC Survey**

- Create voice skill for ad hoc patient satisfaction survey

### **Concerns / Complaints**

- Create a channel for patients / guests to submit a “concern” / “complaint”



## ○ NHRMC Custom Alexa Skills (Clinical Skills)

### Drug Information

- Voice skill to provide information on 15 most common medications.

### Rounding Assistant

- Voice skill to simplify EMR entry of repetitive hourly rounding actions

### Sample Utterances:

- **Echo**, tell **Margaret** chart Pain Assessment 6
- **Echo**, tell **Margaret** chart POSS 2
- **Echo**, tell **Margaret** chart Urinary Output 200 Milliliters
- **Echo**, tell **Margaret** chart Pulse 60
- **Echo**, tell **Margaret** chart Respiration 36
- **Echo**, tell **Margaret** chart Meals Breakfast 75%
- **Echo**, tell **Margaret** chart Activity Ambulate in hallway 15 feet
- **Echo**, tell **Margaret** chart rounding 3P's



# AI Applied to Clinician Performance

**Surgical Innovation**

ONLINE FIRST

June 20, 2018

## **Automated Performance Metrics and Machine Learning Algorithms to Measure Surgeon Performance and Anticipate Clinical Outcomes in Robotic Surgery**

Andrew J. Hung, MD<sup>1</sup>; Jian Chen, MD<sup>1</sup>; Inderbir S. Gill, MD<sup>1</sup>

» [Author Affiliations](#) | [Article Information](#)

*JAMA Surg.* Published online June 20, 2018. doi:10.1001/jamasurg.2018.1512

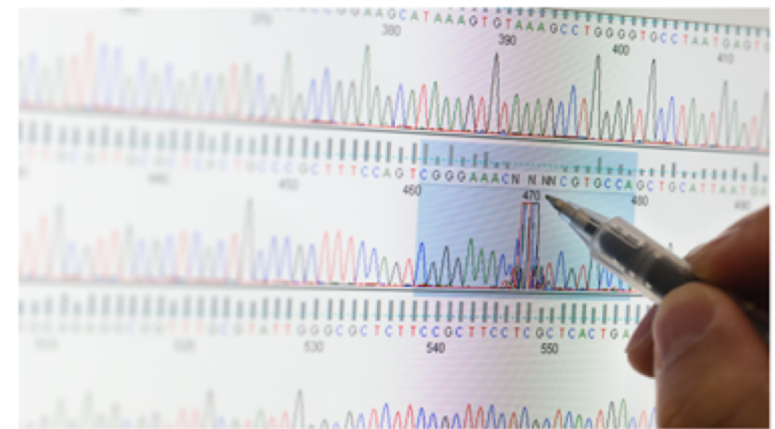
<https://jamanetwork.com/journals/jamasurgery/fullarticle/2685266>

**Pharmacogenomics  
testing + family  
history  
questionnaires +  
clinical decision  
support in EHR  
workflow =  
beginnings of  
practical precision  
medicine**

## How NorthShore tweaked its Epic EHR to put precision medicine into routine clinical workflows

The hospital tapped FHIR-based alerts to deliver recommendations about genomics and genetic testing without bogging down doctors with too many extra clicks.

By [Mike Miliard](#) | December 18, 2017 | 10:22 AM



<http://www.healthcareitnews.com/news/how-northshore-tweaked-its-epic-ehr-put-precision-medicine-routine-clinical-workflows>

# Eric Schmidt Keynote at HIMSS18: “Run to the Cloud”





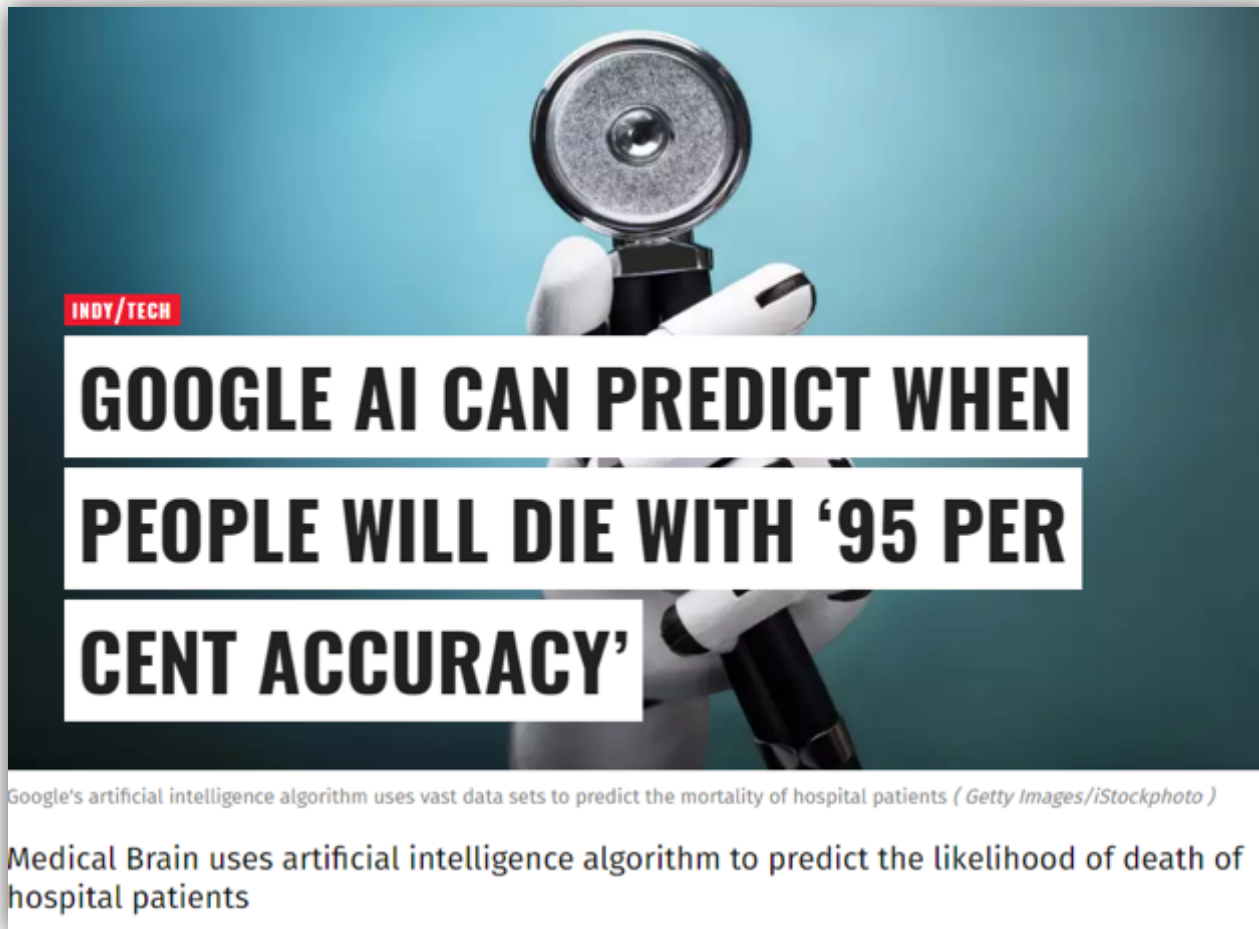


Wes Rishel @wrishel · Jul 10

The road to health IT inconsequentiality is paved with the hubris of ginormous tech companies that expected to revolutionize healthcare



# Google Medical Brain! Robot Hands!



<https://www.independent.co.uk/life-style/gadgets-and-tech/news/google-ai-predict-when-die-death-date-medical-brain-deepmind-a8405826.html>

# Reality Check on Google Medical Brain

- Data lab exercise, nothing is operational
- Neural network (*“throw in the kitchen sink”*) approach to data assumes you have access to the whole kitchen sink, which is a bad assumption in this case
- *“For now, the company says it’s too early to settle on a business model”*
- Getting operationalizable, commercializable, clinical data at large scale is very difficult

<https://www.healthdatamanagement.com/articles/google-continues-work-to-use-machines-for-health-analytics>



- You want what? All EHR data and all paid claims data for hundreds of thousands of patients with a specific chronic disease?
- Most patients have clinical data in multiple EHRs, from multiple vendors, which presents a massive data acquisition and semantic normalization challenge
- Even in a single enterprise EHR, there are many data holes between patients with the same condition
- Paid claims data come in different formats from each payer and are difficult to normalize
- And those are just the technical challenges

# Mayo Clinic, Google partner to use AI, patient data to catapult research

By Joseph Goedert

September 11, 2019, 1:52 a.m. EDT



Google Cloud and Mayo Clinic are working together to improve patient outcomes, transform clinician experiences, support clinical research and revolutionize healthcare delivery.

Google brings its cloud platform and artificial intelligence capabilities, while Mayo brings its clinical expertise and a strategy to advance the diagnosis and treatment of disease.





# Epic Cosmos



## Epic unveils patient data research initiative, new software

Jackie Drees - Thursday, August 29th, 2019 [Print](#) | [Email](#)



SHARE

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 Share 5

At Epic's User Group annual meeting Aug. 27, CEO Judy Faulkner and other executives revealed several initiatives and products the EHR vendor is focusing on to support evidence-based patient care research and enhanced clinical workflows, *Wisconsin State Journal* reports.

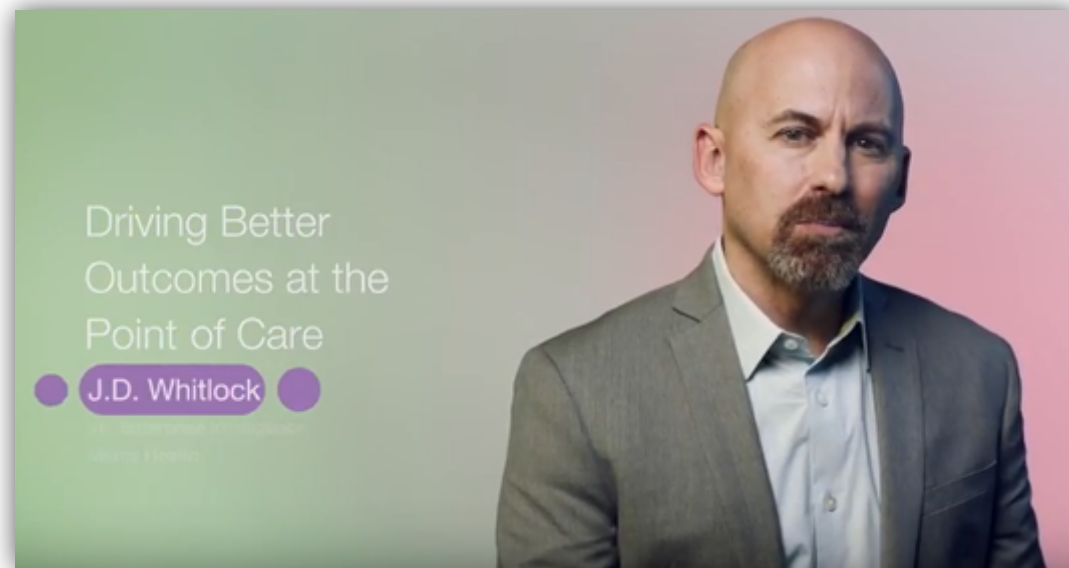
Ms. Faulkner highlighted Cosmos, a new Epic program that is designed to mine data from millions of patient medical records at various health systems to help research the effectiveness of treatments.

"This will revolutionize healthcare, when the [physician] has evidence-based medicine from 230 million people," said Ms. Faulkner, according to the report. "It will be a cosmic ... leap forward."



# IBM Watson Health

- \$15B acquisition strategy that built complementary strengths (Explorys, Truven, Phytel)
- Data on 50M patients
- Small army of data scientists with skills to combine clinical and paid claims data, generate hundreds of quality measures, build new predictive risk scores with machine learning
- Technical ability to connect to many different EHRs



# Clinical Decision Support with Mortality Risk

- Inclusion Criteria: Patients with a One-Year Mortality Risk > 50%
- Exclusion Criteria: Hospice or Palliative Care Dx, Hospice Admission, Hospice/Palliative Care Departments, Hospice/Palliative Care Specialties, active Hospice or Palliative Care consult

**This patient has an estimated 1-year mortality of over 50% and may be a candidate for Hospice or Palliative Care. If advanced directives are not on file, consider engaging patient to complete.**

Estimated 1-year Risk Mortality Score: 60.44%

This is a prognostic risk (%) to predict the 1-year mortality among patients in a population aged 65 years and older based on 37 unique conditions plus age and sex as independent variables. The conditions are: MI, CHF, PVD, CVD, RA, HTN, dementia, chronic pulmonary disease, collagen vascular disease, ulcer, liver disease, diabetes, hemiplegia, renal failure, tumor, leukemia, lymphoma, metastatic cancer, HIV/AIDS, arrhythmia, valvular disease, pulmonary circulation disease, paralysis, hypothyroidism, coagulopathy, obesity, weight loss, fluid/electrolyte disorder, blood loss anemia, deficiency anemia, drug/alcohol abuse, psychosis, depression, neurodegenerative disease.

# The Bigger They Are, The Harder They Fall

BUSINESS

STAT+

## IBM's problems with Watson Health run deeper than recent layoffs, former employees say

By CASEY ROSS @caseymross and IKE SWETLITZ @ikeswetlitz / JUNE 11, 2018

**I**t was an expensive gamble. IBM spent billions acquiring a trio of companies with vast stores of patient health data, in the hope that its vaunted [Watson supercomputer](#) could mine that information for business and clinical insights to sell to U.S. hospitals. But it hasn't worked out that way.

<https://www.statnews.com/2018/06/11/ibm-watson-health-problems-layoffs/>

# Cancer Care is Ripe for AI

- Good news: A lot of new clinical trials with a lot of new treatments targeted at cancer mutations (personalized medicine)
- Bad news: Too many new clinical trials for Oncologists to realistically track, and the medical science is changing too fast to keep up
- Oncologists can get 100+ page EHR reports along with a newly referred patient
- Good targets for AI:
  - Matching patients to clinical trials based on their clinical data including both discrete data and NLP of physician notes
  - Summarizing key points of long EHR reports
  - Summarizing new medical knowledge in helpful ways

# Watson for Oncology

A STAT INVESTIGATION

**IBM pitched its Watson supercomputer as a revolution in cancer care. It's nowhere close**

By CASEY ROSS @caseymross and IKE SWETLITZ @ikeswetlitz / SEPTEMBER 5, 2017

FEB 19, 2017 @ 03:48 PM 207,821  EDITOR'S PICK

2 Free Issues of Forbes

**MD Anderson Benches IBM Watson In Setback For Artificial Intelligence In Medicine**

**MIT  
Technology  
Review**

**A Reality Check for  
IBM's AI Ambitions**

# Challenge: Social & Liability Issues of AI in Healthcare

*“Healthcare organizations must build and train their AIs to provide clear explanations for the actions the AI systems decide to take, in a format that people understand.”*

Accenture

DIGITAL HEALTH TECH VISION 2018



**73%** of health executives are planning to develop internal ethical standards related to the use of AI to ensure their AI systems are designed to act responsibly.



**81%** of health executives agree that organizations are not prepared to face the societal and liability issues that will require them to explain their AI-based actions and decisions, should issues arise.

[https://www.accenture.com/t20180518T100409Z\\_w\\_us-en/acnmedia/PDF-78/Accenture-digital-health-tech-vision-2018.pdf](https://www.accenture.com/t20180518T100409Z_w_us-en/acnmedia/PDF-78/Accenture-digital-health-tech-vision-2018.pdf)



# Challenge: Incomplete Clinical Data

- Example: Predicting the progression of Chronic Kidney Disease (CKD)
  - CKD is an excellent target for predictive modeling
  - CKD model worked well ... for the 10% of patients that had the right combo of lab data in their medical record
- Some current research focuses on building models that are adaptive to missing data in EHR, and designing new statistical machine learning techniques that can address these computational challenges

May 29, 2018

# Big Data and Predictive Analytics Recalibrating Expectations

Nilay D. Shah, PhD<sup>1</sup>; Ewout W. Steyerberg, PhD<sup>2</sup>; David M. Kent, MD, MS<sup>3</sup>

» [Author Affiliations](#) | [Article Information](#)

JAMA. Published online May 29, 2018. doi:10.1001/jama.2018.5602

*“More than 1,000 cardiovascular clinical prediction models have been developed and cataloged, yet only a small number of these are routinely used to support decision making in clinical care. It seems unlikely that incremental improvements in discriminative performance of the kind typically demonstrated in machine learning research will ultimately drive a major shift in clinical care.”*

<https://jamanetwork.com/journals/jama/fullarticle/2683125>

# AI @ dayton children's

- In production today
  - DarkTrace cybersecurity app
  - Epic EHR predictive model for risk of admission or ED visit in next 6 months
- Within the next year
  - Epic EHR predictive model for pediatric sepsis
  - Epic EHR predictive model for pediatric deterioration
  - Epic EHR predictive model for patient no-shows to clinic appointments
  - Chatbot on our public website
  - Factoring AI capabilities into our next generation enterprise imaging architecture purchase
- In consideration
  - AI assisted surgical & anesthesiology coding (billing)
  - AI powered apps on Epic's "App Orchard" app store

# DarkTrace: Practical AI in Cybersecurity

Real-time threat  
visualization,  
notification &  
remediation,  
leveraging AI to  
identify anomalous  
network traffic



# Pediatric Risk of Admission or ED Visit

**Schedule**

Schedule Admin | Open Slots | Scans | Orders | Show Ord

May 28, 2019 | Today

DAYTON CHILD PEDS TCHP D

May 2019						
Su	Mo	Tu	We	Th	Fr	Sa
28	29	30	1	2	3	4
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30	31	1
2	3	4	5	6	7	8

Dept: DAYTON CHILD...

My Schedule

- GROFF, KIM
- DAYTON CHILD PEDS TCHP

Status	My S	Time
Scheduled	📅	9:20
Scheduled	📅	9:20
Scheduled	📅	9:40
Scheduled	📅	10:00
Scheduled	📅	10:00
Scheduled	📅	10:20

**Pediatric Risk of Admission or ED Visit**

**81%** This score indicates a pediatric patient's 6-month risk, as a percentage, of a hospital admission or ED visit. The only diagnoses displayed are those that contribute to the model output.

Age 8

- Is African American or Hispanic No
- Has Medicaid Yes
- Smoking Tobacco Use Status Never Smoker
- ED visits 13
- Hospital Admissions 3
- Prescribed Anticoagulant Yes
- Prescribed Antidepressant No
- Prescribed antidiuretic No
- Prescribed Non-Opioid Analgesic Yes
- Prescribed NSAIDs No
- Has Diabetes or Hypertension Yes
- Has Other Nervous System Disorder Yes
- Has Other Upper Respiratory Infection Yes
- Has Asthma Yes
- Has Disorder of Teeth or Jaw Yes
- Has Other Gastrointestinal Disorder Yes
- Has Other Non-Traumatic Joint Disorder Yes
- Has Other Bone Disease or Musculoskeletal Disorder Yes
- Had Trauma or Wounding Yes

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Review | Change Prov | SmartSets

total: 36 Auto-refreshed: 10:42 Preview

Visit Type	Ped Admsn/ED Risk (%)
Dcp New Patient	8
Dcp Well Child	17
Dcp Well Child	3
Dcp Well Child	80
Dcp Well Child	82
Dcp Well Child	7

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# AI as Timesaver for Physicians

*The AI applications that I see being adopted near-term really have to do with being able to discern patterns in data, patterns in past histories that a human doctor could, if given enough time, discern on their own.*

Colt Courtright

Director, Corporate Data & Analytics

Premera Blue Cross

<https://www.geekwire.com/2019/doctor-bot-artificial-intelligence-already-changing-healthcare-whats-coming-next/>



*Artificial intelligence (in healthcare) has promise but like other fads before it, today the hype is far, far greater than the value delivered and largely remains in the confines of grant-funded pilot projects – little at scale.*

John Moore  
CEO, Chilmark Research



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**HIMSS**  
CENTRAL & SOUTHERN OHIO *Chapter*