



Association of Medical  
Directors of Information  
Systems

# AI for Impact: Building a Highly Reliable Health System

**Christopher Longhurst, MD, MS**

*Chief Clinical & Innovation Officer, UC San Diego Health*

*Executive Director, Jacobs Center for Health Innovation*

*Professor and Associate Dean, UC San Diego School of Medicine*

# UC San Diego Health: World-Class Care



**~13k**  
Employees



**808**  
Licensed  
Beds



**36k+**  
Annual  
Hospital  
Discharges



**1.3M+**  
Annual  
Outpatient  
Visits



**Patty Maysent, MPH**  
Chief Executive Officer  
UC San Diego Health

## 2023 Honor Roll Listing

Mayo Clinic, Rochester, Minn.
<b>UCLA Medical Center, Los Angeles</b>
NYU Langone Hospitals, New York
<b>Cedars-Sinai Medical Center, Los Angeles</b>
New York-Presbyterian Hospital-Columbia and Cornell
<b>Stanford Health Care-Stanford Hospital, Stanford, Calif.</b>
Cleveland Clinic
Massachusetts General Hospital, Boston
Mount Sinai Hospital, New York
Johns Hopkins Hospital, Baltimore
Hospitals of the University of Pennsylvania-Penn Presbyterian
<b>UCSF Health-UCSF Medical Center, San Francisco, Calif.</b>
Northwestern Medicine-Northwestern Memorial Hospital, Chicago
Houston Methodist Hospital
Brigham and Women's Hospital, Boston
Rush University Medical Center, Chicago
Barnes-Jewish Hospital, Saint Louis
<b>UC San Diego Health-La Jolla and Hillcrest Hospitals, San Diego</b>
Vanderbilt University Medical Center, Nashville, Tenn.
North Shore University Hospital at Northwell Health, Manhasset, N.Y.
University of Michigan Health-Ann Arbor
UT Southwestern Medical Center, Dallas

# Traditional patient safety efforts have not moved the needle



3.7% of inpatients had adverse events with harm

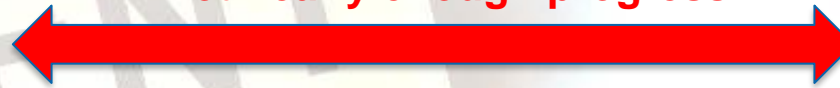


~3% of inpatients had adverse events and ~50% preventable

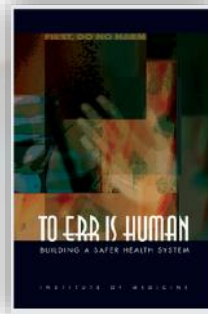


~25% of hospitalizations had adverse events and ~25% preventable

Not nearly enough progress



Harvard Medical Practice Study  
NEJM, 1991

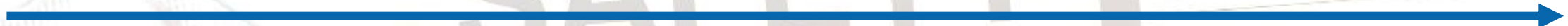


To Err is Human  
IOM  
1999

Traditional patient safety efforts




The Safety of Inpatient Health Care  
NEJM  
2023





## COMMENT **OPEN** Bending the pipeline

David C. Classen <sup>1</sup>✉, Christo

This paper reviews the current state of AI in patient safety. This paper defines patient safety as the prevention of misdiagnosis, adverse events, and the relative adoption of these technologies and the challenges with evaluation in healthcare that includes machine learning. *npj Digital Medicine* (2023)6

**Table 2.** Top use cases for the application of AI to specific clinical problems in patient safety.

1. Actionable real time patient safety electronic clinical quality measures
2. Surgical complication prediction
3. Pressure ulcer prediction
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12. Patient self-managed electronic safety dashboards



## can AI help?

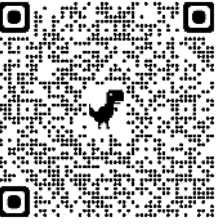
AI techniques to patient safety. AI in patient care, including diagnostic errors, the uses of AI in patient safety and the limitations of these AI systems. Developing a proactive agenda for AI in

# February 2020 – Wuhan Evacuees in San Diego



The collage features several news articles and a medical case report. The top-left article is from 7 San Diego, titled "MCAS Miramar to Quarantine Evacuees From Wuhan, Landing Unknown", published February 2, 2020. The top-middle article is titled "2nd Flight From Wuhan" with a sub-headline "Seven people total – all passengers of the first plane that was removed from quarantine at the base and placed in isolation", published February 7, 2020. The top-right article is titled "Evacuee from China tests positive for coronavirus in San Diego", published February 10, 2020, and includes a photograph of a large white aircraft at an airfield. The bottom section is a medical case report from the Journal of Medical Case Reports, titled "Flight of the COVID-19 patient: experience with a Wuhan evacuee: a case report", published in 2020. The authors listed are Sandeep Segar, Daniel Bouland, Francesca Torriani, Kevin Kwak, Deepak Asudani, Randy Taplitz, and Vineet Gupta. A "Check for updates" button is visible next to the title.

# March 28, 2020 – AI in Diagnostic Radiology



## Artificial Intelligence Enables Rapid COVID-19 Lung Imaging Analysis at UC San Diego Health

With support from Amazon Web Services, health care providers are using AI in a clinical research study aimed at speeding the detection of pneumonia, a condition associated with severe COVID-19

April 07, 2020 | Heather Buschman, PhD

**F**or most patients who have died of COVID-19, the pandemic disease caused by a novel coronavirus, the ultimate cause of death was pneumonia, a condition in which inflammation and fluid buildup make it difficult to breathe. Severe pneumonia often requires lengthy hospital stays in intensive care units and assistance breathing with ventilators — medical devices now in high demand in some cities grappling with a surge of COVID-19 cases.

To quickly detect pneumonia — and therefore better distinguish between COVID-19 patients likely to need more supportive care in the hospital and those who could be followed closely at home — UC San Diego Health radiologists and other physicians are now using artificial intelligence (AI) to augment lung imaging analysis in a clinical research study enabled by Amazon Web Services (AWS).



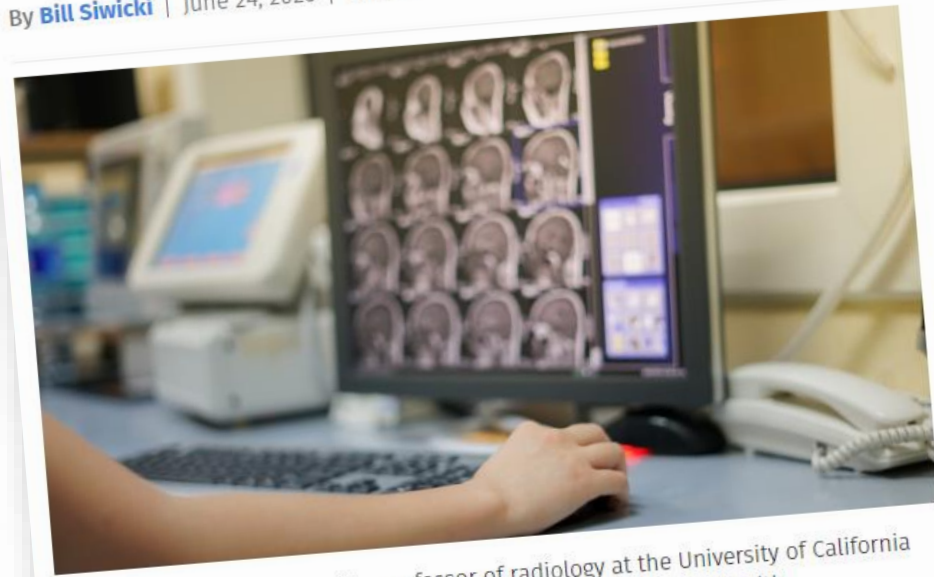
The new AI capability has so far provided UC San Diego Health physicians with unique insights into more than 2,000 images. In one case, a patient in the Emergency Department

## UC San Diego uses AWS cloud to deploy homegrown AI algorithms for COVID-19

The health system's algorithms can detect early pneumonia on medical imaging with the precision of a subspecialist radiologist.



By **Bill Siwicki** | June 24, 2020 | 11:57 AM



Dr. Albert Hsiao is an associate professor of radiology at the University of California San Diego School of Medicine and a radiologist at UC San Diego Health.



BRIEF RESEARCH REPORT

Infectious Disease

# Deployment of artificial intelligence for radiographic diagnosis of COVID-19 pneumonia in the emergency department

Morgan Carlile MD<sup>1</sup> | Brian Hurt MD, MS<sup>2</sup> | Albert Hsiao MD, PhD<sup>2</sup> |



Christian Dameff, MD  
Emergency Medicine

Christian Dameff MD, MS<sup>1,3</sup>

“Of the 5,125 total visits and 1,960 chest radiographs obtained in the ED during the study period, 1,855 were analyzed by the algorithm. Among these, emergency physicians were surveyed for their experiences on 202. Overall, **86% either strongly agreed or somewhat agreed that the intervention was easy to use in their workflow. 20% of respondents reported that the algorithm impacted clinical decision making.**”

Correspondence

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Health Department of Emergency Medicine,  
200 W Arbor Drive MC #8676, San Diego, CA  
92103, USA  
Email: [cdameff@health.ucsd.edu](mailto:cdameff@health.ucsd.edu)



# Public Health Preparedness, March 2023

Disaster Medicine and Public Health Preparedness

[www.cambridge.org/dmp](http://www.cambridge.org/dmp)

## Systematic Review

**Cite this article:** Ahmadi Marzaleh M, Peyravi M, Mousavi S, Sarpourian F, Seyedi M, Shalyari N. Artificial intelligence functionalities during the COVID-19 pandemic. *Disaster Med Public Health Prep.* **17**(e336), 1–8. doi: <https://doi.org/10.1017/dmp.2023.3>.

### Keywords:

artificial intelligence; machine learning; deep learning; neural networks; COVID-19

### Corresponding author:

Naseh Shalyari,  
Email: [naseh.shalyari@gmail.com](mailto:naseh.shalyari@gmail.com).

## Artificial Intelligence Functionalities During the COVID-19 Pandemic

Milad Ahmadi Marzaleh PhD<sup>1</sup>, Mahmoudreza Peyravi PhD<sup>1</sup>, Shahrokh Mousavi MD<sup>2</sup>, Fatemeh Sarpourian PhD<sup>3</sup>, Milad Seyedi BSC<sup>4</sup> and Naseh Shalyari PhD<sup>1</sup>

<sup>1</sup>Department of Health in Disasters and Emergencies, Health Human Resources Research Center, School of Health Management and Information Sciences, Shiraz University of Medical Sciences, Shiraz, Iran; <sup>2</sup>Student Research Committee, School of Medicine, Shiraz University of Medical Sciences, Shiraz, Iran; <sup>3</sup>Student Research Committee, Department of Health Information Technology, School of Health Management and Information Sciences, Shiraz University of Medical Sciences, Shiraz, Iran and <sup>4</sup>Department of Computer Engineering, Sanandaj Branch, Islamic Azad University, Sanandaj, Iran

### Abstract

**Background:** The coronavirus disease 2019 (COVID-19) pandemic has led us to use virtual solutions and emerging technologies such as artificial intelligence (AI). Recent studies have clearly demonstrated the role of AI in health care and medical practice; however, a comprehensive review can identify potential yet not fulfilled functionalities of such technologies in pandemics. Therefore, this scoping review study aims at assessing AI functionalities in the COVID-19 pandemic in 2022.

**Methods:** A systematic search was carried out in PubMed, Cochran Library, Scopus, Science Direct, ProQuest, and Web of Science from 2019 to May 9, 2022. Researchers selected the articles according to the search keywords. Finally, the articles mentioning the functionalities of AI in the COVID-19 pandemic were evaluated. Two investigators performed this process.

**Results:** Initial search resulted in 9123 articles. After reviewing the title, abstract, and full text of these articles, and applying the inclusion and exclusion criteria, 4 articles were selected for the final analysis. All 4 were cross-sectional studies. Two studies (50%) were performed in the United States, 1 (25%) in Israel, and 1 (25%) in Saudi Arabia. They covered the functionalities of AI in the prediction, detection, and diagnosis of COVID-19.



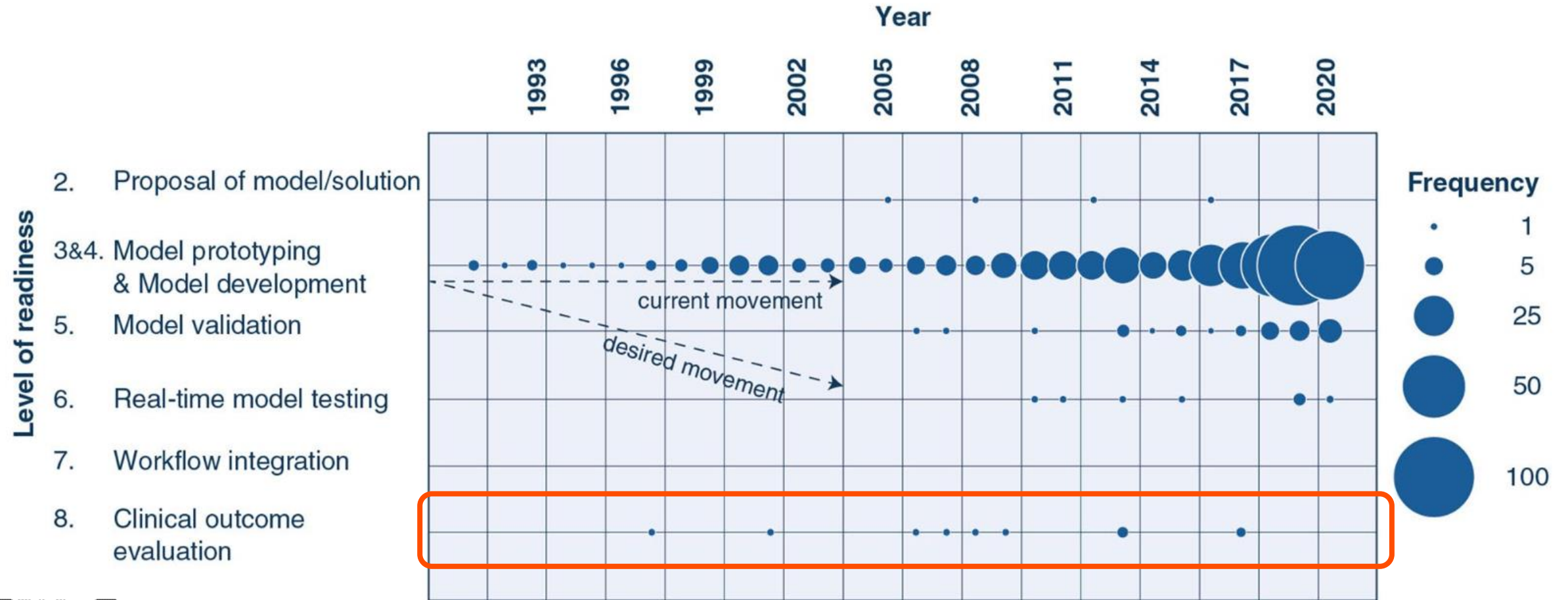
Over **9000** articles...



...just **4** studies w/  
clinical outcomes!!

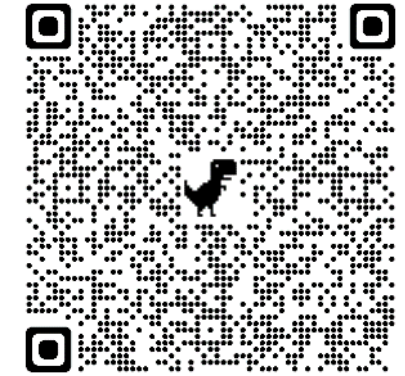


# We need more clinical outcome evaluation for AI



van de Sande D, et al. *Intensive Care Med.* 2021 Jul;47(7):750-760.  
doi: 10.1007/s00134-021-06446-7.





## RESEARCH LETTER

### Analysis of Devices Authorized by the FDA for Clinical Decision Support in Critical Care

The use of predictive clinical decision support (CDS) devices (ie, those that use machine learning [ML] or artificial intelligence [AI]) has the potential to improve outcomes in critical care, but a clear regulatory framework is lacking.<sup>1</sup> Recent guidance

← Editor's Note page 1401

+ Supplemental content

formed by these devices. However, growing concern about the clinical impact of predictive CDS systems has led to questions about whether current device regulatory frameworks developed before advanced statistical learning methods were available, are sufficient to ensure effectiveness.

On September 22, 2021, the FDA released a public database of authorizations for medical devices that use AI or AI. We sought to identify devices that offer CDS in a critical care setting and characterize the evidence cited in their authorization.

**Methods** | We extracted data from the AI and ML database as of December 15, 2022, and augmented those data through the OpenFDA interface.<sup>3,4</sup> The 2 most common FDA pathways for CDS device approval are the 510(k) pathway, which requires demonstration of substantial equivalence to a previously authorized device (hereafter, a predicate) and typically does not require submission of clinical data, and the de novo pathway, which indicates that a novel device has low to moderate risk and


from the U.S. Food and Drug Administration (FDA) suggests most critical illness was caused by the nature of the

**Of 521 authorizations in the FDA AI/ML database...only 3 included citations of published data, 4 mentioned a safety assessment, and none mentioned an evaluation of performance bias. We found no studies examining the clinical impact on care processes or patient outcomes for these device authorizations.”**

identified 10 that might inform care for patients with critical illness (Table 1). Of these, only 3 included citations of published data, 4 mentioned a safety assessment, and none men-



## COMMENT OPEN Bending the p

David C. Classen <sup>1</sup>✉, Christo

This paper reviews the current state of AI in patient safety. This paper defines patient safety as the prevention of harm, including misdiagnosis, adverse events, and the relative adoption of these technologies. It discusses the challenges with evaluating AI in healthcare that includes machine learning. *npj Digital Medicine* (2023)6

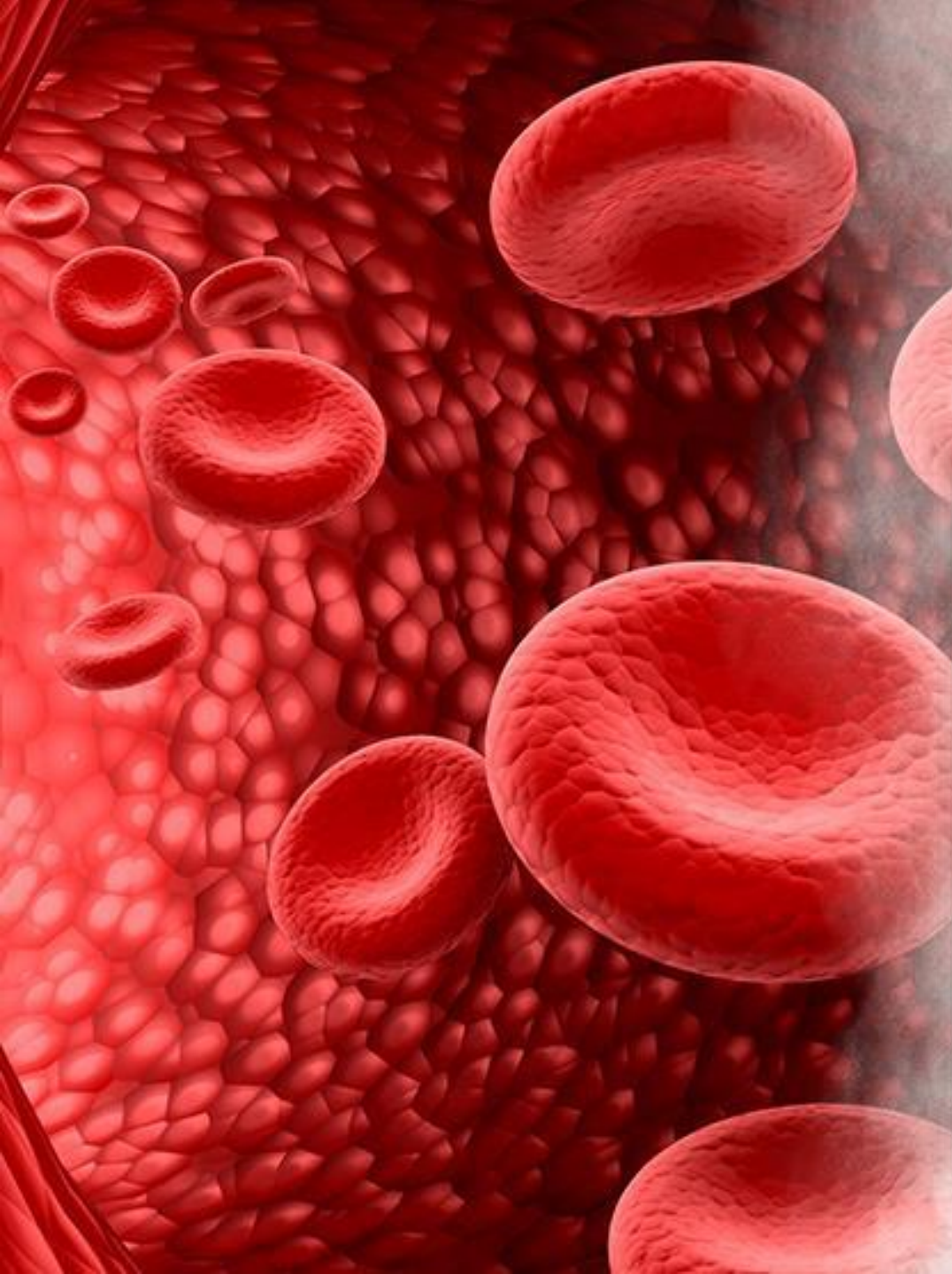
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## can AI help?

AI techniques to patient safety. This includes diagnostic errors, the use of AI in patient safety and the limitations of these AI systems. We propose a proactive agenda for AI in



**EACH YEAR, ABOUT  
1.7 MILLION ADULTS IN  
AMERICA DEVELOP SEPSIS.  
AT LEAST 350,000  
DIE DURING THEIR  
HOSPITALIZATION OR ARE  
DISCHARGED TO HOSPICE.**

**GET AHEAD  
OF SEPSIS**

KNOW THE RISKS. SPOT THE SIGNS. ACT FAST.








Learn more at [cdc.gov/sepsis](https://cdc.gov/sepsis)





ORIGINAL ARTICLE

# Evaluation of Sepsis Prediction Models before Onset of Treatment

**Authors:** Fahad Kamran, Ph.D. , Donna Tjandra, M.S. , Andrew Heiler, M.B.A. , Jessica Virzi, M.S.N. , Karandeep Singh, M.D. , Jessie E. King, M.D., Ph.D. , Thomas S. Valley, M.D., M.Sc. , and Jenna Wiens, Ph.D.

  [Author Info & Affiliations](#)

“Designers need to consider that model features could inadvertently encode clinical suspicion, thus suggesting strong performance in retrospective studies but failing to identify new cases that a clinician has not yet recognized.”

2 | VOL. 1 NO. 3



# Nature Digital Medicine (2023 and 2024)



## Impact of a deep learning sepsis prediction model on quality of care and survival

Aaron Boussina<sup>1,4</sup>, Supreeth P. Shashikumar<sup>1,2</sup>, Christopher A. Longhurst<sup>1,2</sup>, Kimberly Gabriel Wardi<sup>1,3,5</sup>

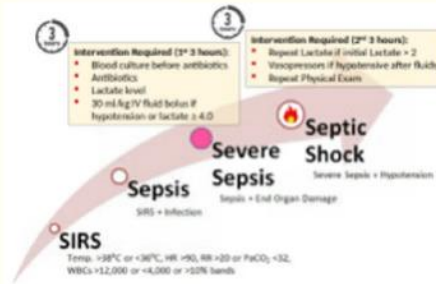
ARTICLE  
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“I do not  
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Sepsis remains a major cause of mortality, but relatively few studies have assessed the impact of a deep-learning model on quality of care and survival. We included 6217 adult septic patients from a Sepsis Advisory (BPA) triggered by COMPOSE assessment (SOFA) score following sepsis intervention period (705 days) and the Bayesian structural time-series approach.

### Emergency (1)

#### Could it be Sepsis?



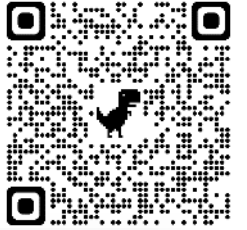
This patient has a Sepsis Risk Score: 90% chance of developing severe sepsis in the next 4 hours.

Consider discussing risk of sepsis with the primary physician or activating Code Sepsis

Top reasons in the past 6 hours  
Sepsis Top Causes: Temperature, Heart Rate

The deployment of COMPOSER was significantly associated with a 17% relative decrease in in-hospital sepsis mortality (95% CI, 0.3%–3.5%) and a 10% relative increase in sepsis bundle compliance





## Integrating artificial intelligence into a healthcare system using a deep learning algorithm

Boussina et al. recently evaluated a deep learning sepsis prediction model (COMPOSER) in a prospective before-and-after quasi-experimental study within two emergency departments at UC San Diego Health, tracking outcomes before and after deployment. Over the five-month implementation period, they reported a 17% relative reduction in in-hospital sepsis mortality and a 10% relative increase in sepsis bundle compliance.

This editorial discusses the importance of shifting the focus towards evaluating clinically relevant outcomes, such as mortality reduction or quality-of-life

This real-world study evaluating the implementation of a sepsis prediction model in two emergency departments (ED), inpatient ward, and intensive care unit (ICU) at UC San Diego Health. The study found that the implementation of the COMPOSER model resulted in a 17% relative reduction in in-hospital sepsis mortality and a 10% relative increase in sepsis bundle compliance. The authors discuss the importance of evaluating clinically relevant outcomes, such as mortality reduction or quality-of-life, in addition to accuracy metrics.

Table 1 | Considerations for implementing AI algorithms into healthcare systems

Theme	Key considerations	How each issue was addressed by Boussina et al. <sup>7</sup>
Data	Are the data needed for the algorithm readily available and in an extractable format?	COMPOSER routinely collected clinical information, including laboratory and vital signs. Data elements were extracted via FHIR standards.
Infrastructure	Can relevant data be extracted in real time?	Data were extracted at hourly intervals to ensure availability for prediction.
	Are there adequate infrastructure and computing resources available to host a cloud-based analytics and storage platform?	The platform was hosted via Amazon Web Services.
Interface	How will the clinical team be made aware of these predictions (i.e., is a custom dashboard integrated into the electronic health record required)?	Predictions were integrated into an Epic flowsheet via an HL7v2 outbound message. A Best Practice Advisory was triggered for patients at high risk of developing sepsis.
	How can the clinical team understand how the algorithm made this prediction (i.e., model explainability)?	A relevance score was generated for each feature, which measured the gradient of the risk score with respect to all input features multiplied by the input features. The features with the highest positive relevance scores were displayed in the flowsheet.
End-users	Which clinical team member(s) are most appropriate to receive the risk prediction?	Nurses were chosen to receive the alert as they cared for a specific roster of patients and frequently opened their patients' charts.
	What is their level of trust in the AI algorithm?	A multidisciplinary team was created to guide implementation. Nurses were surveyed to identify their needs. Regular feedback and educational sessions on COMPOSER were provided to nurses during the implementation phase.
	What happens if the compliance of clinical end-users degrades over time?	Although not specified, the authors acknowledged the importance of continuous education to optimize human-AI collaboration.

AI researchers should shift the focus from measuring just algorithm performance metrics such as accuracy to meaningful outcomes. As a healthcare and AI community, we have a responsibility to deliver on these clinically relevant metrics, and funding agencies and journals alike should be encouraged to prioritize such studies.”

Examples of how these issues were addressed by Boussina et al. are provided in the text. The authors also discuss the importance of evaluating clinically relevant outcomes, such as mortality reduction or quality-of-life, in addition to accuracy metrics.

# Prenosis Announces Marketing Automation ImmunoScore™ Intelligence Diagnostic For Early Sepsis

APRIL 3, 2024 | IN PRESS RELEASE

*The Sepsis ImmunoScore™ is the first-ever AI Sepsis*



**Shamim Nemati** @ShamimNemati · 20h  
2/5 Conditions for use: There needs to exist a clinical suspicion for sepsis (ordering of blood culture), and three plasma proteins (procalcitonin, interleukin-6, and C-reactive protein) and routinely measured EHR parameters to calculate the ImmunoScore for sepsis.

1   1   1   54

**Shamim Nemati** @ShamimNemati · 20h  
3/5 The three biomarkers are not routinely ordered/available in the EHR. Therefore, once sepsis is suspected by the provider and a blood culture is ordered, additional orders of the three biomarkers are required.

1   1   1   47

**Shamim Nemati** @ShamimNemati · 20h  
4/5 In an ER setting, ordering of blood culture is often followed by administration of antibiotics, therefore it's not clear if providers will wait for a AI risk score to initiate treatments for sepsis. Moreover, all cases without a clinical suspicion of sepsis will be missed!

1   2   1   163

**Shamim Nemati** @ShamimNemati · 20h  
5/5 I'm not aware of any patient-centered outcome data to demonstrate clinical utility of this AI system (would love to hear more!). This JAMA view point argues for a regulatory refocus on patient outcomes:



VIEWPOINT

AI IN MEDICINE

## Regulate Artificial Intelligence in Health Care by Prioritizing Patient Outcomes

**John W. Ayers, PhD, MA**  
Qualcomm Institute, University of California San Diego, La Jolla; and Altman Clinical Translational Research Institute, University of California San Diego, La Jolla.

**Nimit De**  
Qualcomm Institute, University of California San Diego, La Jolla; and Division of Infectious Diseases and Global Public Health, University of California San Diego, La Jolla.

**Davey M. Smith, MD, MAS**  
Altman Clinical Translational Research Institute, University of California San Diego, La Jolla; and Division of Infectious Diseases and Global Public Health, University of California San Diego, La Jolla.

**Artificial intelligence (AI)** holds great promise to enhance the quality of health care.<sup>1</sup> Despite the aim of health care regulations to ensure high-quality care, there are few regulations governing the use of AI in health care. This dearth will soon change because a White House ex-

instance, it calls for AI-powered algorithms with more than 10 billion parameters to potentially register their codebase with federal agencies, perform a battery of to-be-determined regulator-selected tests, and report codebase modifications for review. Concurrently,

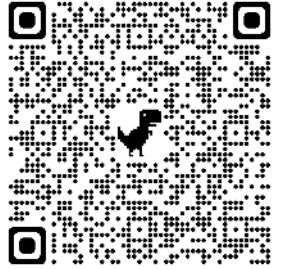
“We propose a regulatory strategy for AI that is outcome-centric by requiring companies to demonstrate that AI tools produce clinically important differences in patient outcomes before being brought to market.”

and treat problems as “teachable moments” to make rules that mitigate the likelihood of similar problems happening again. These regulations typically mandate compliance with specific procedures. We refer to these as “process-centric” regulations because they manipulate

effective, but despite a growing marketplace, these systems have not been required to produce such evidence. A third-party evaluation of the most widely adopted system, the Epic Sepsis Model, found that among 2552 hospitalized patients who developed sepsis, only 7% who did not already receive early treatment were identified by the



# I think...AI Governance Should be a Shared Responsibility



## Epic plans to launch AI validation software for healthcare organizations to test, monitor models

By Heather Landi · Apr 3, 2024 8:00am



- "The only way to achieve outcomes is going to be with local workflows and local optimization. It's a shared responsibility between both vendors and local health systems"
- "Dr. Longhurst believes the federal government should go a step further and incorporate responsible AI use into conditions of participation in Medicare. In the same way that hospitals and health systems are audited for quality and safety, organizations also should be required to meet compliance requirements around AI governance, he said."

# AI Principles at UC San Diego Health

## Artificial Intelligence

### Our Statement

1. We believe that AI can enhance human health and well-being, and we are committed to developing and deploying AI solutions that are ethical, responsible, and beneficial for patients and society.
2. We respect the dignity, autonomy, and privacy of each patient, and we design and evaluate our AI systems with their needs, preferences, and feedback in mind.
3. We uphold the highest standards of scientific rigor, transparency, and accountability in our AI research and practice, and we adhere to the ethical codes and regulations of our profession and institution.
4. We foster a culture of collaboration, excellence, and innovation among our AI researchers, practitioners, partners, and stakeholders, and we seek to share our knowledge and expertise with the broader community.
5. We embrace the diversity of our patients, staff, and collaborators, and we strive to create an inclusive and supportive environment that values different perspectives, backgrounds, and experiences.



### Effectiveness, Responsibility, and Accountability

AI products should be successful for their intended use, beneficial, valid, accurate, and reliable and those who develop and apply tools with responsibility and accountability



### Ethics and Inclusiveness

AI products should strive to achieve health equity and fairness by design and operation



### Human Factors

AI product design, development, and implementation should involve and prioritize the needs of the diverse population it serves



### Promoting Human Well-Being, Safety, Privacy, and Common Good

AI products should protect human well-being, privacy, sustainability, and the environment

DECEMBER 14, 2023

## Delivering on the Promise of AI to Improve Health Outcomes



[BRIEFING ROOM](#)

[BLOG](#)

*Lael Brainard, National Economic Advisor*

*Neera Tanden, Domestic Policy Advisor*

*Arati Prabhakar, Director of the Office of Science and Technology Policy*

As President Biden has said, artificial intelligence (AI) holds tremendous

promise far greater than healthcare. The landmark Executive Order on AI states that the federal government is committed to accelerating the development and use of AI to improve health outcomes for Americans

In its blueprint for an AI Bill of Rights, the Biden administration outlined that AI “testing conditions should mirror as closely as possible the conditions in which the AI will be deployed.” The administration has also recommended that AI should be monitored for adverse outcomes on an ongoing basis rather than a single, off-site evaluation.





JAMA Internal Medicine | Original Investigation

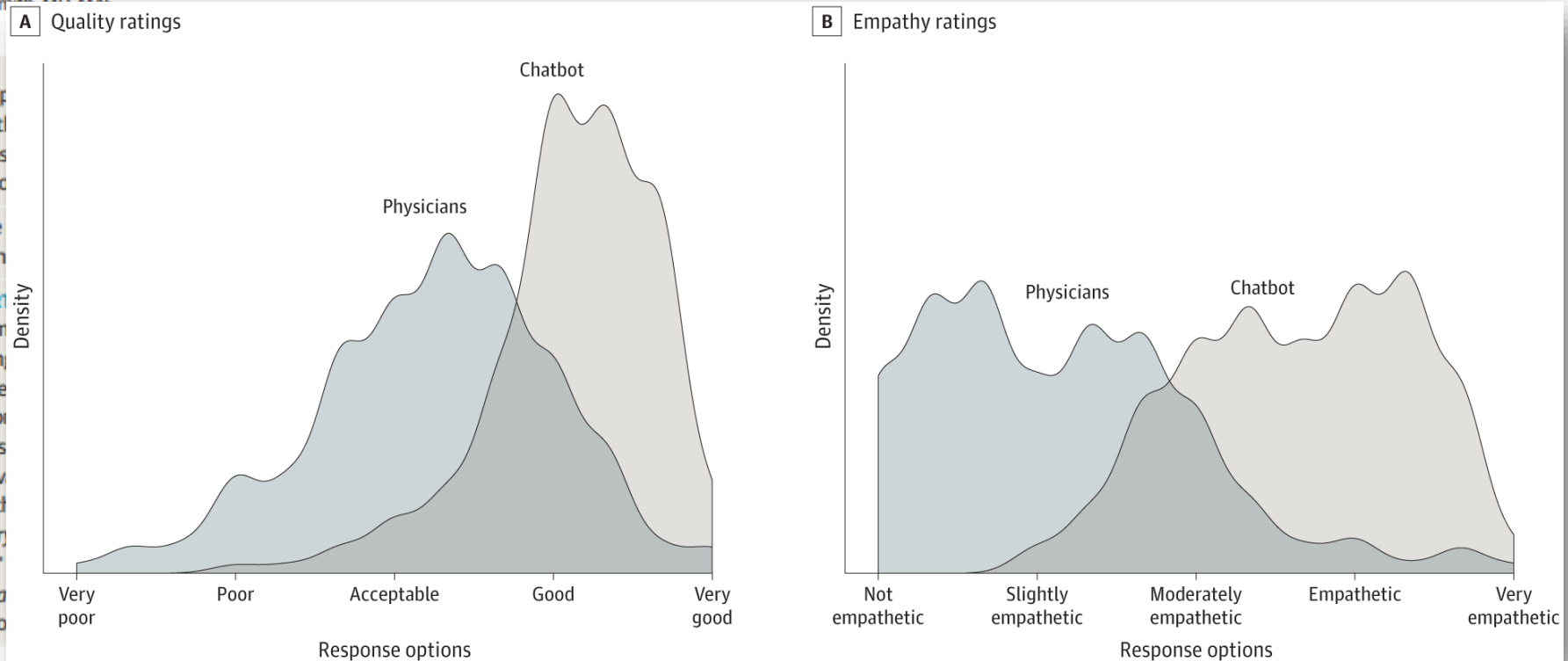
## Comparing Physician and Artificial Intelligence Chatbot Responses to Patient Questions Posted to a Public Social Media Forum

John W. Ayers, PhD, MA; Adam Poliak, PhD; Mark Dredze, PhD; Eric C. Leas, PhD, MPH; Zechariah Zhu, BS; Jessica B. Kelley, MSN; Dennis J. Faix, MD; Aaron M. Goodman, MD; Christopher A. Longhurst, MD, MS; Michael Hogarth, MD; Davey M. Smith, MD, MACE

**IMPORTANCE** The rapid expansion of artificial intelligence (AI) as a tool for answering patient questions by drafting responses to patient questions posted to a public social media forum.

**OBJECTIVE** To evaluate the quality and empathy of responses to patient questions posted to a public social media forum in 2022, to provide quality and empathy ratings.

**DESIGN, SETTING, AND PARTICIPANTS** A cross-sectional study of a public social media forum database of questions from 2022. We randomly draw 195 exchange questions and 195 chatbot responses to a public question. Chatbot responses were generated in a fresh session (without prior knowledge of the question) on February 23, 2022. The original questions and chatbot responses were evaluated by 10 medical professionals. Evaluators rated the quality of information provided (very poor, poor, acceptable, good, very good) and bedside manner provided (very not empathetic, not empathetic, slightly empathetic, moderately empathetic, empathetic, very empathetic) compared between chatbot and physician responses.



# AI Principles in Action – April 2023

HEALTH TECH

## HIMSS23: Epic taps Microsoft to integrate generative AI into EHRs with Stanford, UC San Diego as early adopters

By Heather Landi • Apr 17, 2023 11:00am

Microsoft Epic generative AI electronic health records (EHRs)



**Generated Draft Reply** Pioneering Feature

Hello Barbara,

Your CBC with Auto Diff result from 3/7/2023 is within the normal range and does not indicate any cause for concern. Your provider will contact you if any further action is needed. Your results are available for viewing in MyChart, under the "Test Results" tab.

If you have any further questions or concerns, please do not hesitate to contact us.

Best regards,

[Learn more](#)

Did you find the draft reply helpful?

This was helpful This was not helpful

Dear [REDACTED]

Thank you for your message and for taking an active role in your health. It's great to hear that you're considering the Hepatitis A vaccine. Twinrix is indeed a combination vaccine that covers both Hepatitis A and B. However, since you've already had the Hepatitis B vaccine, you may not need the combination.

I see you have an upcoming appointment and I recommend reviewing at that appointment. It is a 2 shot series so you can do the 1st shot at the appt if you would like. |

Take care,  
Marlene May Millen, MD

*Part of this message was generated automatically and was reviewed and edited by Marlene May Millen, MD.*

## AI-Generated Draft Replies Integrated Into Health Records and Physicians' Electronic Communication



Ming Tai-Seale, PhD, MPH; Sally L. Baxter, MD, MSc; Florin Vaida, PhD; Amanda Walker, MS; Amy M. Sitapati, MD; Chad Osborne, MD; Joseph Diaz, MD; Nimit Desai, BS; Sophie Webb, MS; Gregory Polston, MD; Teresa Helsten, MD; Erin Gross, MD; Jessica Thackaberry, MD; Ammar Mandvi, MD; Dustin Lillie, MD; Steve Li, MD; Geneen Gin, DO; Suraj Achar, MD; Heather Hofflich, DO; Christopher Sharp, MD; Marlene Millen, MD; Christopher A. Longhurst, MD, MS

### Abstract

**IMPORTANCE** Timely tests are warranted to assess the association between generative artificial intelligence (GenAI) use and physicians' work efforts.

**OBJECTIVE** To investigate the association between GenAI-drafted replies for patient messages and physician time spent on answering messages and the length of replies.

**DESIGN, SETTING, AND PARTICIPANTS** Randomized waiting list quality improvement (QI) study from June to August 2023 in an academic health system. Primary care physicians were randomized to an immediate activation group and a delayed activation group. Data were analyzed from August to November 2023.

**EXPOSURE** Access to GenAI-drafted replies for patient messages.

**MAIN OUTCOMES AND MEASURES** Time spent (1) reading messages, (2) replying to messages, (3) length of replies, and (4) physician likelihood to recommend GenAI drafts. The a priori hypothesis was that GenAI drafts would be associated with less physician time spent reading and replying to messages. A mixed-effects model was used.

**RESULTS** Fifty-two physicians participated in this QI study, with 25 randomized to the immediate activation group and 27 randomized to the delayed activation group. A contemporary control group included 70 physicians. There were 18 female participants (72.0%) in the immediate group and 17 female participants (63.0%) in the delayed group; the median age range was 35-44 years in the

### Key Points

**Question** Would access to generative artificial intelligence-drafted replies correlate with decreased physician time on reading and replying to patient messages, alongside an increase in reply length?

**Findings** In this quality improvement study including 122 physicians, generative AI-drafted replies correlated with increased message read time, no change in reply time, and significantly longer replies. Physicians valued AI-generated drafts as a compassionate starting point for their replies and also noted areas for improvement.

**Meaning** These findings suggest generative AI was not associated with reduced time on writing a reply but was associated with longer read time, longer replies, and perceived value in making a more compassionate reply.

Figure 2. Reply Time per Message (in Seconds) for Each Group and Study Period

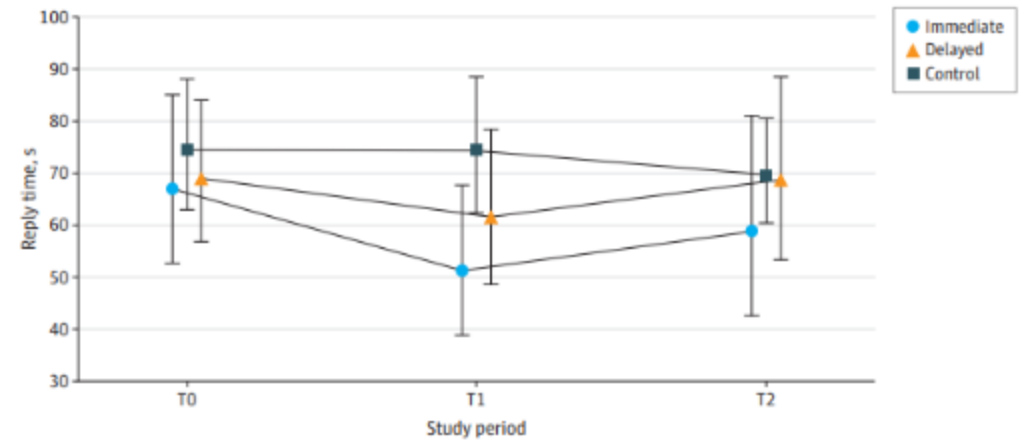
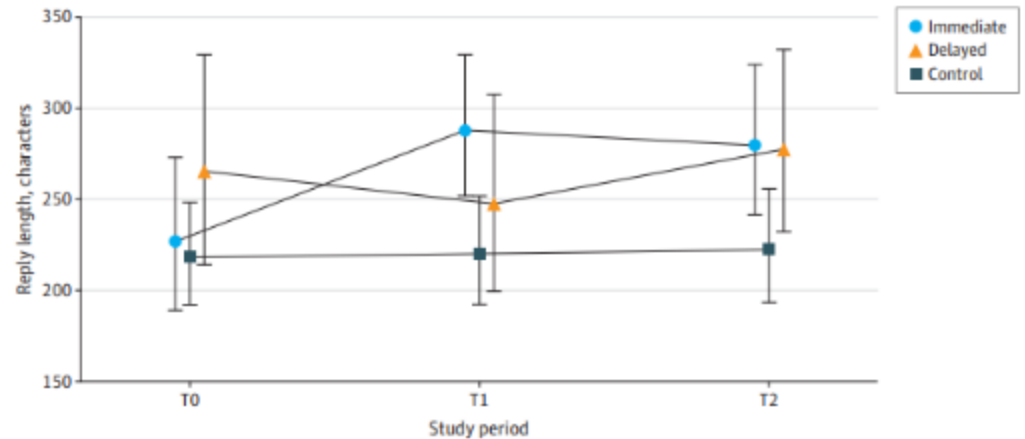


Figure 3. Reply Length for Each Group and Study Period





# Overall Efficiency

Practical AI Can Drive Significant **Time Savings** For Physicians

	Hrs / Wk Today	% Time AI Could Save	Est. AI Hours Saved / Wk
Insurer Appeals	1.8	53%	1.0
Patient Letters Education	3.1	58%	1.8
Faxed Letters Forms	1.7	35%	0.6
EHR Docs Notes	11.5	52%	5.9
Clinical Reference	3.9	51%	2.0
Colleague / Hospital Emails	3.6	35%	1.3
PD: Licensure MOC	2.2	38%	0.8

**12.7**  
Hours of Work /  
Week Potentially  
Saved by AI

Source: Dignity user research

# Ambient AI Documentation



Catalyst | Innovations in Care Delivery

COMMENTARY

## Ambient Artificial Intelligence Scribes to Alleviate the Burden of Clinical Documentation

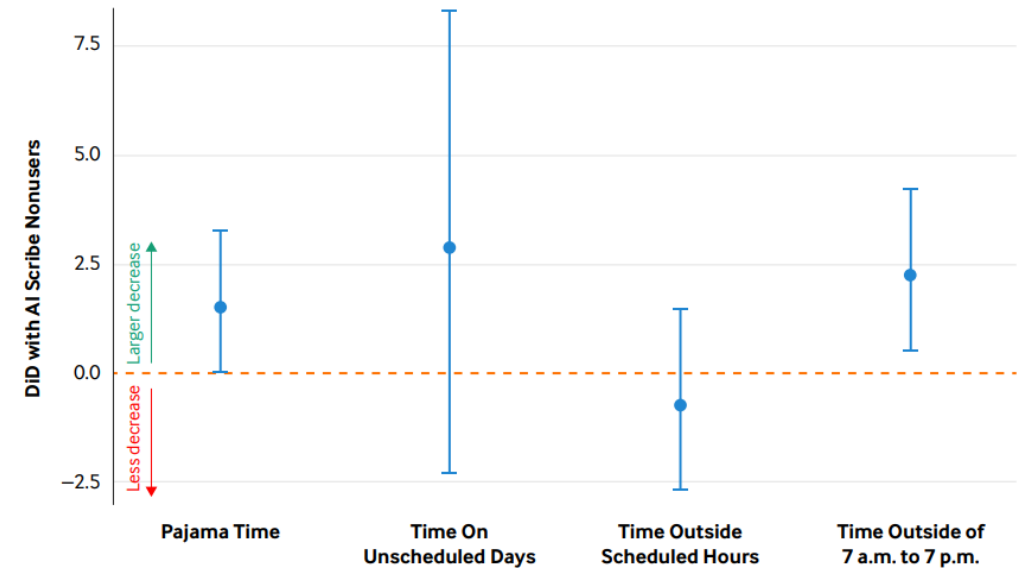
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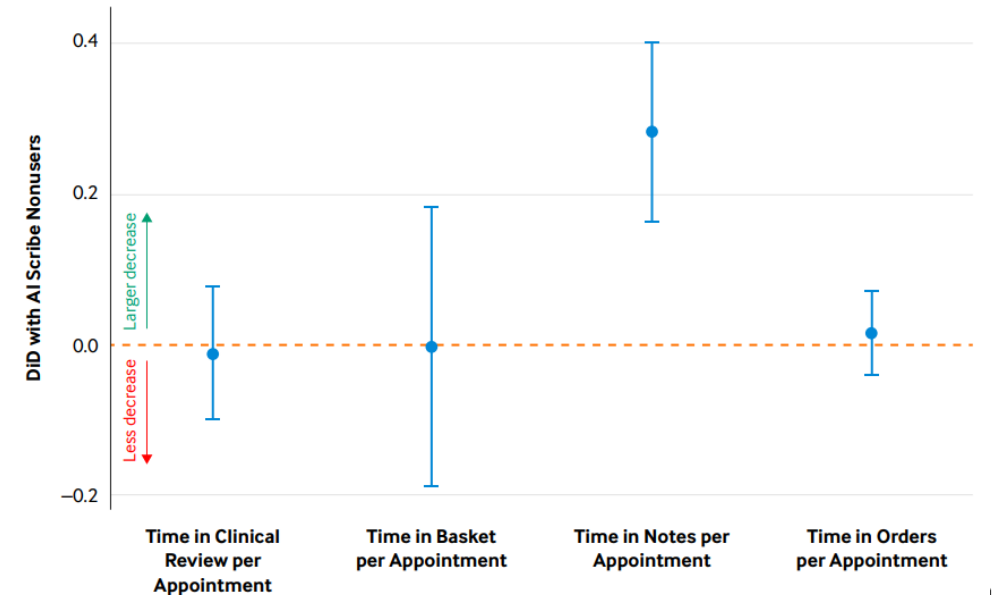
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Clinical documentation in the electronic health record (EHR) has become increasingly burdensome for physicians and is a major driver of clinician burnout and dissatisfaction. Time dedicated to clerical activities and data entry during patient encounters also negatively affects the patient-physician relationship by hampering effective and empathetic communication and care. Ambient artificial intelligence (AI) scribes, which

Panel A. Primary Care Physician Time Spent in the EHR-Related Activities



Panel B. Primary Care Physician Time Spent in Appointment-Related Activities





# Key Points

- The health AI paradox is that **implemented algorithms are rarely researched and researched algorithms are rarely implemented**
- The Jacobs Center for Health Innovation at UC San Diego is focused on developing **AI algorithms *and* workflows that impact patient care outcomes**
- All AI efforts are reviewed by our governance to ensure each algorithm is fair, appropriate, valid, effective, and safe (FAVES)





# Thank you!

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PHOTOGRAPHY

