



@docsunny100

Comprehensive evaluation framework  
for artificial intelligence in healthcare  
and an example of its application

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## Outline

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- Why evaluation of AI in healthcare?
- Current Approaches
- TEHAI and Components
- Application and Findings
- Discussion



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## Do we need evaluation of AI in Healthcare

0                      0                      0  
Yes                      No                      Undecided



Account



Content



Design



## Why Evaluate AI in Healthcare

- > Progress in artificial intelligence (AI) has opened new opportunities
- > However, in limited assessments that have taken place so far, it has been found AI systems have fallen short of their translational goals
- > This is because many AI systems have intrinsic inadequacies that don't get assessed until after deployment





## Context





## Context

- Utilising and integrating AI systems in clinical settings can be potentially expensive and disruptive
- Therefore, a rigorous evaluation that assesses AI systems early and at various stages of their deployment can support or contradict the use of a specific AI tool



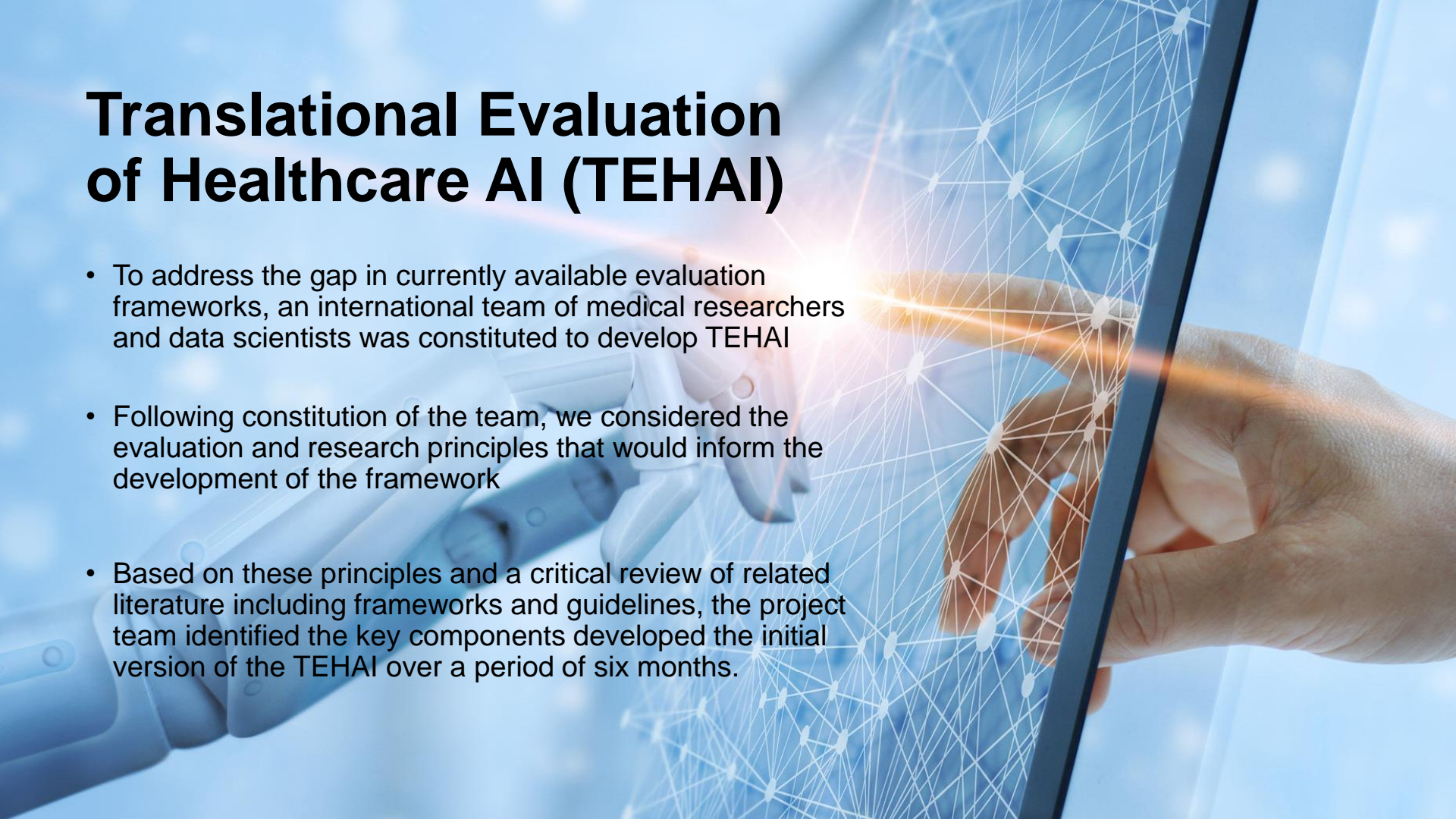
# Current Evaluation Approaches

- Currently available evaluation frameworks generally focus on the reporting and regulatory aspects
- It is evident there is an absence of an evaluation framework that assesses various stages of development, deployment, integration and adoption of AI systems
- Dependence on disparate evaluation frameworks to assess different aspects and phases of AI systems is unrealistic
- Also, currently available evaluation and reporting frameworks fall short in adequately assessing the functional, utility, and ethical aspects of the models



# Translational Evaluation of Healthcare AI (TEHAI)

- To address the gap in currently available evaluation frameworks, an international team of medical researchers and data scientists was constituted to develop TEHAI
- Following constitution of the team, we considered the evaluation and research principles that would inform the development of the framework
- Based on these principles and a critical review of related literature including frameworks and guidelines, the project team identified the key components developed the initial version of the TEHAI over a period of six months.

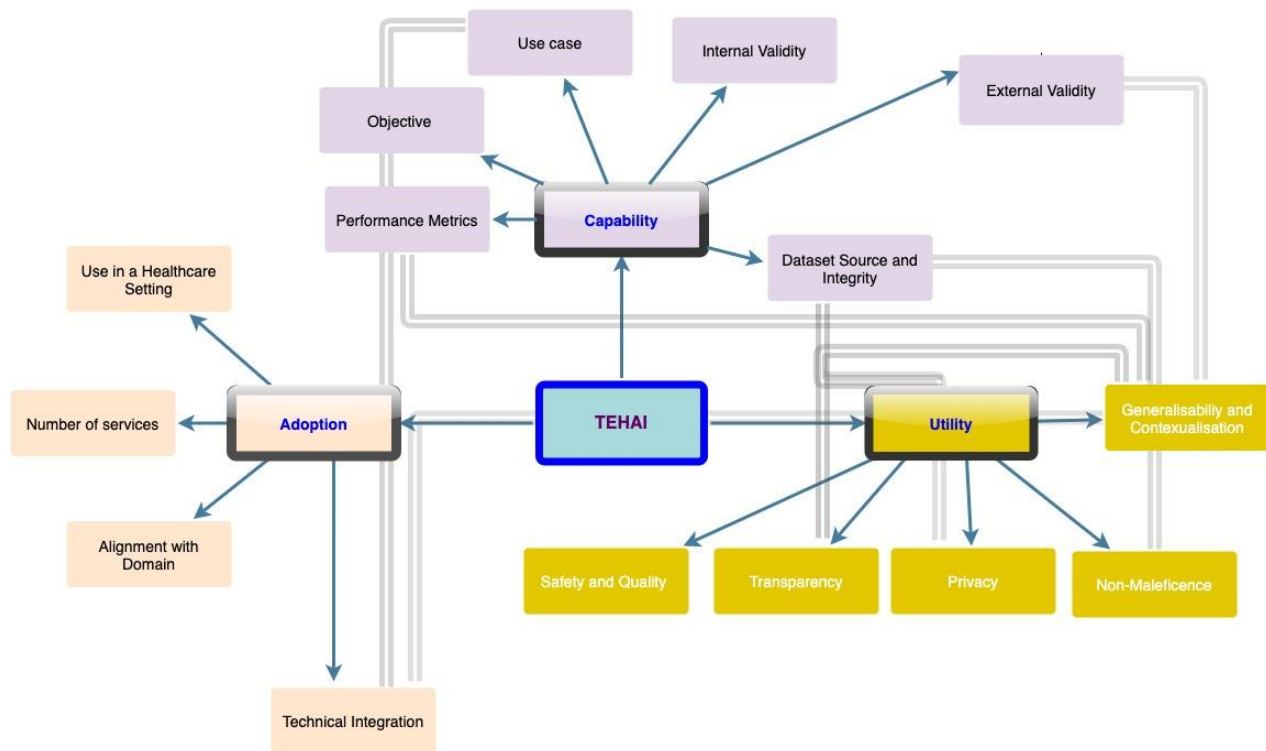




## Translational Evaluation of Healthcare AI (TEHAI)



- To provide a layer of independent review before finalization of TEHAI, the draft consensus framework was then reviewed by an international panel
- The eight-member international panel had expertise in medicine, data science, healthcare policy, biomedical research and healthcare commissioning, and were drawn from the United Kingdom, United States of America and New Zealand
- The panel members were provided the framework and documentation and after, meetings were convened with panel members to receive their feedback.
- Following collation of the feedback from the expert panel, TEHAI was refined to incorporate panel members feedback and was then finalised





## TEHAI

### 1. Capability

- 1.1. Objective
- 1.2. Use Case
- 1.3. Dataset Source and Integrity
- 1.4. Performance Metrics
- 1.5. Internal Validity
- 1.6. External Validity

### 2. Utility

- 2.1. Generalisability and Contextualisation
- 2.2. Safety and Quality
- 2.3. Transparency
- 2.4. Privacy
- 2.5. Non-Maleficence

### 3. Adoption

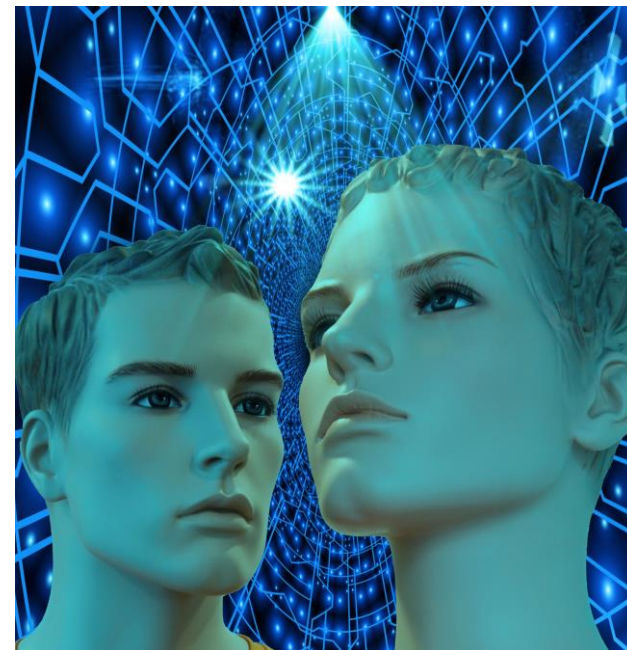
- 3.1. Use in a Healthcare Setting
- 3.2. Number of Services
- 3.3. Alignment with Domain
- 3.4. Technical Integration



**Capability:** This component assesses the intrinsic technical capability of the AI system to perform its expected purpose, by reviewing key aspects as to how the AI system was developed

**Utility:** This component evaluates the usability of the AI system across different dimensions including the contextual relevance, and safety and ethical considerations. It also assesses the efficiency of the system

**Adoption:** This component appraises translational value by evaluating key elements that demonstrate the adoption of the model in real life settings





Component	Sub-component	Initial Score	Weight	Subcomponent Score= Initial Score x Weight							
Capability	Objective of Study	0-3	10	Weight 5	<table><tr><td>0-9</td><td><div></div></td></tr><tr><td>10-14</td><td><div></div></td></tr><tr><td>15 and above</td><td><div></div></td></tr></table>	0-9	<div></div>	10-14	<div></div>	15 and above	<div></div>
	0-9		<div></div>								
	10-14		<div></div>								
	15 and above		<div></div>								
	Dataset Source and Integrity		10								
	Internal Validity		10								
External Validity	10										
Performance Metrics	10										
Use Case	5										
Utility	Generalizability and Contextualisation	0-3	10	Weight 10	<table><tr><td>0-19</td><td><div></div></td></tr><tr><td>20-29</td><td><div></div></td></tr><tr><td>30 and above</td><td><div></div></td></tr></table>	0-19	<div></div>	20-29	<div></div>	30 and above	<div></div>
	0-19		<div></div>								
	20-29		<div></div>								
	30 and above		<div></div>								
	Safety and Quality		10								
Transparency	10										
Privacy	10										
Non-Maleficence	10										
Adoption	Use in a Healthcare Setting	0-3	10								
	Technical Integration		10								
	Number of Services		5								
	Alignment with Domain		5								





## TEHAI usability

### Development Check

Pre-Development Phase	Objective	Dataset Source and Integrity
Pre-Development Phase	Use Case	Transparency
Development Phase	Performance Metrics	Internal Validity



### Deployment Check

Pre-Deployment Phase	Generalizability and Contextualization	External Validity
Deployment Phase	Technical Integration	Privacy
Post-Deployment Phase	Safety and Quality	



### Discernment Check

Short Term Phase	Non-Maleficence	
Mid Term Phase	Use in a Healthcare Setting	
Long Term Phase	Number of Services	Alignment with Domain



## Most Read Articles

### REVIEW:

Evaluation framework to guide implementation of AI systems into healthcare settings 12 October, 2021

### ORIGINAL RESEARCH:

Reliability of COVID-19 symptom checkers as national triage tools: an international case comparison study 18 October, 2021

### COMMUNICATION:

A step-by-step guide to peer review: a template for patients and novice reviewers 19 August, 2021

### RESEARCH ARTICLE:

Using the Internet as a source of information and support: a discussion paper on the risks and benefits for children and young people with long-term conditions 1 January, 2015

### ORIGINAL RESEARCH:

User testing of a diagnostic decision support system with machine-assisted chart review to facilitate clinical genomic diagnosis 7 May, 2021

Reddy, S et al. (2021). Evaluation framework to guide implementation of AI systems into healthcare settings. *BMJ Health & Care Informatics* 2021;**28**:e100444.



## Application

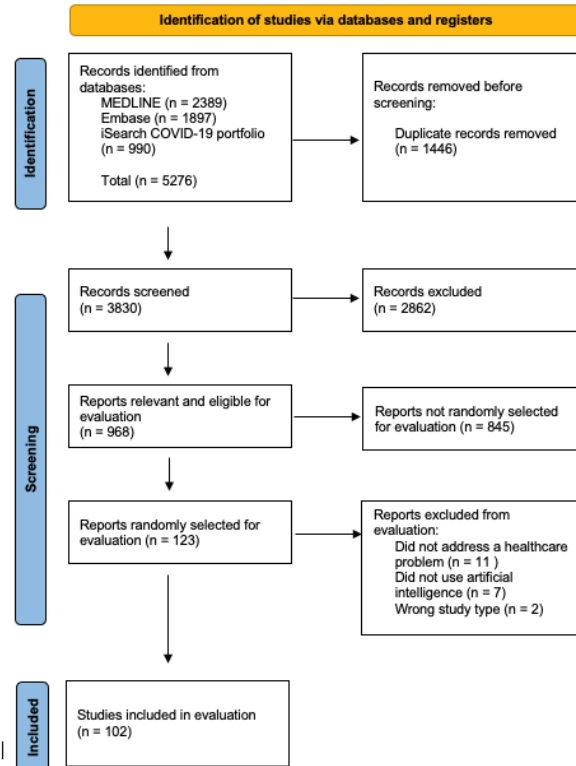
# Application of a Comprehensive Evaluation Framework to COVID-19 Studies: Systematic Review of Translational Aspects of Artificial Intelligence in Health Care

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Aaron Edward Casey<sup>1,2</sup>, PhD; Saba Ansari<sup>3</sup>, GCHE (Teaching and Learning), MSc; Bahareh Nakisa<sup>4</sup>, BSE, MCS, PhD; Blair Kelly<sup>5</sup>, Grad Dip (InfoLibStds), BCom; Pieta Brown<sup>6</sup>, MPS; Paul Cooper<sup>3</sup>, PhD; Imran Muhammad<sup>3</sup>, MIS, MSc, PhD; Steven Livingstone<sup>6</sup>, BSc, GradDipSci, MDataSci; Sandeep Reddy<sup>3</sup>, MBBS, MSc, PhD; Ville-Petteri Makinen<sup>1,2,7,8</sup>, DSc

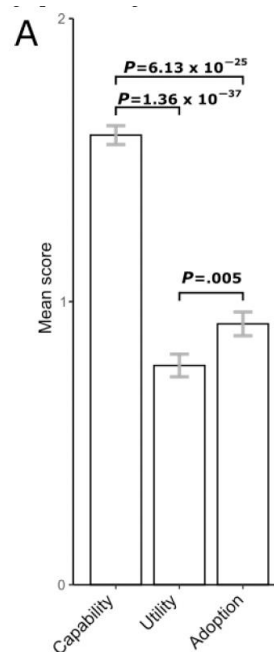


## Application

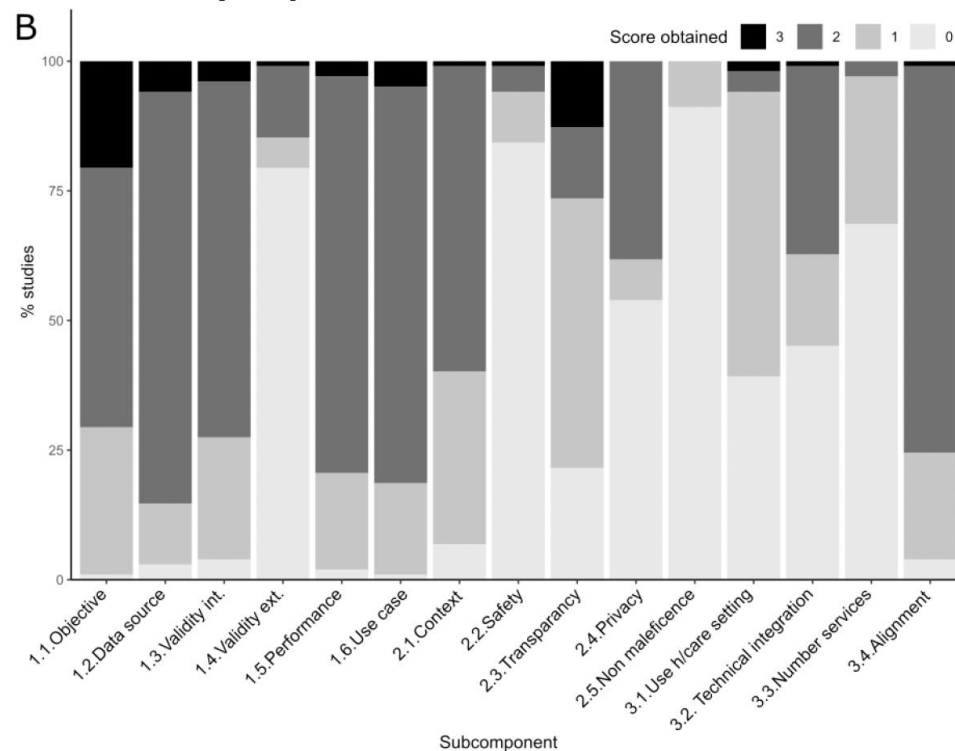




## Application



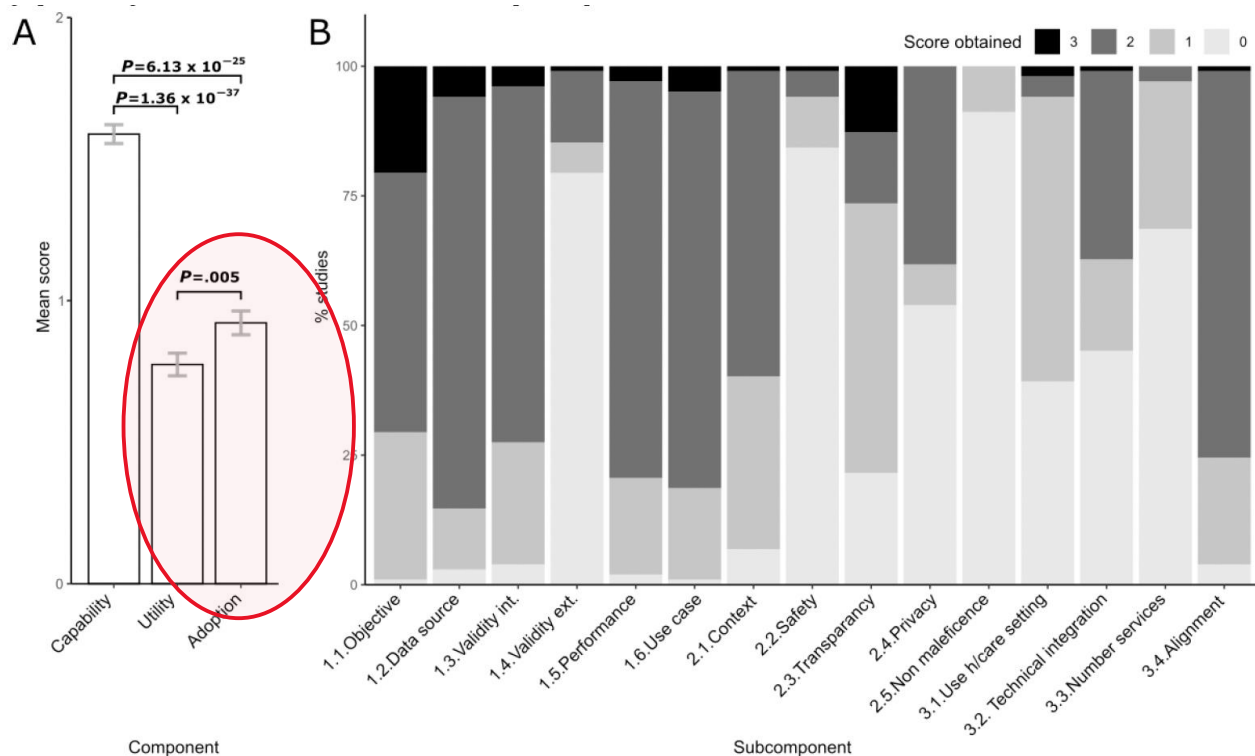
Component





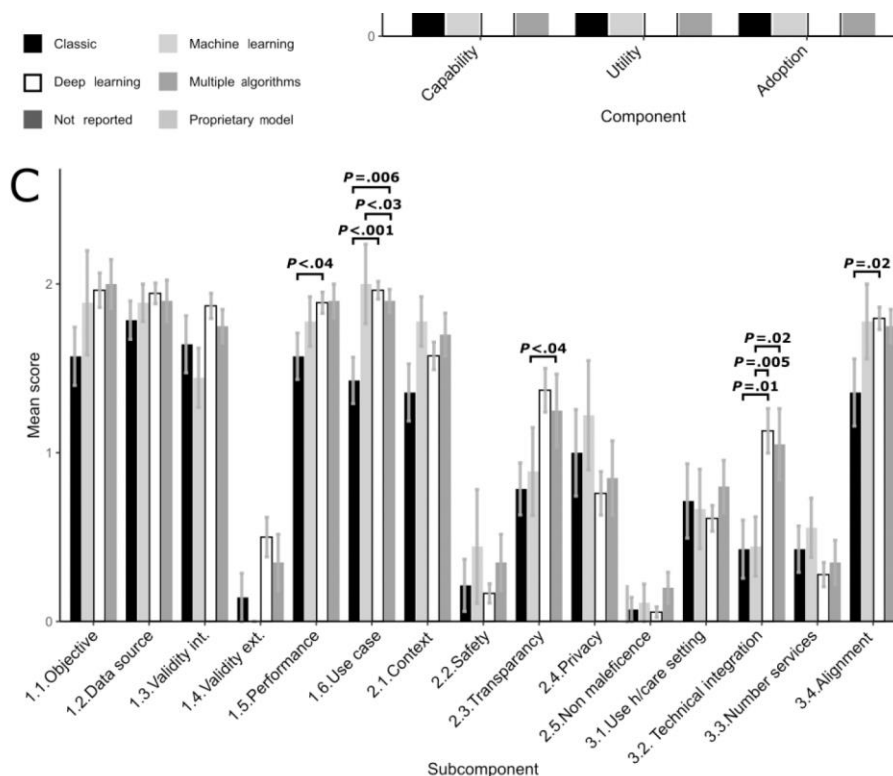


## Application



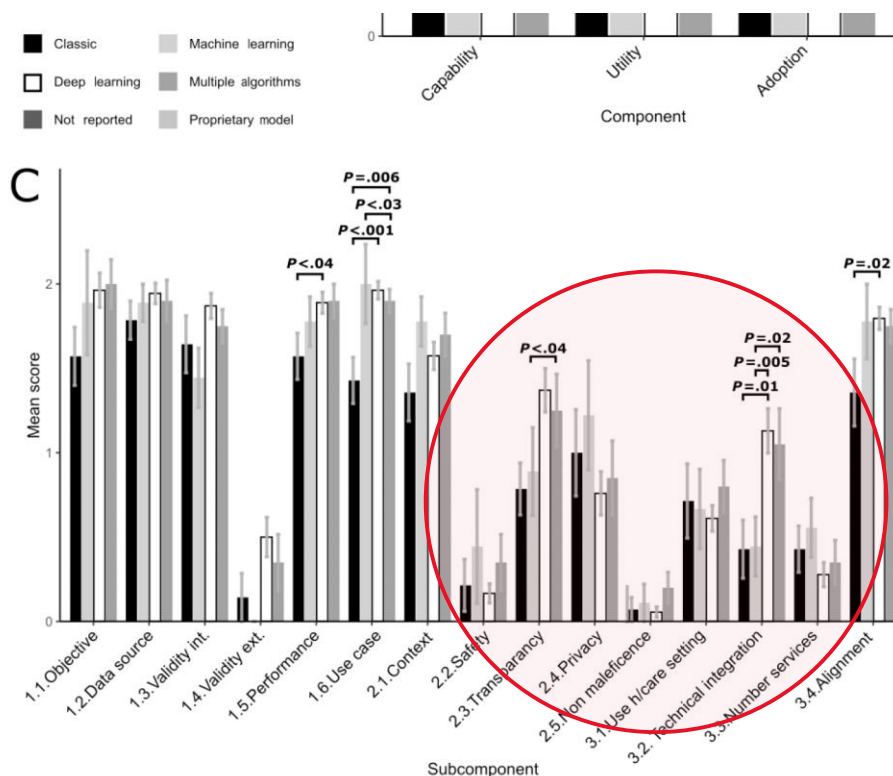


## Application





## Application





- The 'utility' component assesses how safely can the AI model be used in healthcare
- Very few studies scored well across the criteria and scored poorly especially with the safety and quality and non-maleficence subcomponents
- One of the distinguishing aspects of TEHAI framework compared to other evaluation framework is its assessment of how well the AI model is adopted
- This is assessed through the actual use of the AI model in health services or healthcare delivery.
- Considering many of the COVID-AI models were experimental and the time frames we assessed were short, very few included studies did well in the component
- The top-ranking study in this component was an online COVID-19 mortality prediction model that was deployed as an open-source tool making it highly accessible and adoptable.





## In conclusion

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- TEHAI- A comprehensive evaluation framework
- Three main components (Capability, Utility and Adoption) and 15 subcomponents
- Can be used in development, deployment and discernment stages
- Applied to COVID-19 AI studies
- Very few studies have a translational component i.e., did poorly in utility and adoption components
- Therefore, evaluation has to in-built in product/application development cycle





## Discussion/Questions

