

# Beyond the Hype - Economic Evaluation and Technology Readiness of Artificial Intelligence in Healthcare: Systematic Review and Meta-Analysis

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## Background

- Recent reviews reveal inadequate quantity and quality of health economic evaluations (HEE) on medical AI.
- These studies have also highlighted methodological deficiencies as the main problem.
- An often-overlooked element is the maturity (developmental stage) of the AI under evaluation.

## Aim

- Investigate the link between medical AI maturity and HEE quality.

## Methods

- Search was conducted in 6 databases (EMBASE, MEDLINE, Web of Science, Cochrane Database, NHS EED, and Google Scholar) following PRISMA 2020 guidelines.
- Maturity of the medical AI was assessed using the Technology Readiness Level (TRL) scale (Table 1).
- HEE quality was evaluated using the CHEERS checklist and the rigor of the cost assessments, specifically examining whether AI's implementation and operational costs were accounted for.

## Results

- Of 6503 articles, 69 met the selection criteria (Table 2).
- Most (75%) of the AI technologies were evaluated in the early development stages (TRL 4 and 5, Table 3).
- Notably, most HEE's overlooked the implementation and operational costs when assessing low TRL AI technologies (Table 4 and Figure 1).

Table 1: Technology Readiness Level (TRL).\*

\*Adapted from NASA TRL into a clinically applicable scale by Fleuren et al. (Clinical Machine Learning Readiness Level).

- TRL 9: Model integration
- TRL 8: Clinical outcome evaluation
- TRL 7: Workflow implementation
- TRL 6: Real-time testing
- TRL 5: Model validation
- TRL 3-4: Model prototyping & Model development
- TRL 2: Proposal of model/solution
- TRL 1: Clinical problem identification

Table 2: Overview of the 69 studies.

Variable	% (N)
<b>Medical Field:</b> <sup>a</sup>	
General medicine	14% (10)
Ophthalmology	11% (8)
Radiology	9% (6)
Cardiology	7% (5)
Other	58% (40)
<b>Application type:</b>	
Prevention and screening	37% (26)
Care process management	25% (17)
Clinical diagnostics	25% (17)
Automatic triage	13% (9)
<b>AI model type:</b>	
Neural network	45% (31)
Unknown	26% (18)
Ensemble	9% (6)
Expert system	9% (4)
Other	11% (8)
<b>Year of publication:</b>	
1996-2020	48% (33)
2021-2022	52% (36)

Table 3: Overview of the methodological specifics of the 69 studies.

Variable	% (N)
<b>Type of HEE:</b>	
CEA	55% (37)
CMA	40% (28)
BIA	4% (3)
Total Cost	1% (1)
<b>Perspective:</b>	
Healthcare	61% (42)
Hospital	22% (15)
Societal	10% (7)
Patient	3% (2)
Hospital + Societal	2% (1)
Healthcare+ Societal	2% (1)
<b>Time Horizon:</b>	
< 1 year	28% (19)
1 year	22% (15)
> 1 year	43% (30)
Not Reported	7% (5)
<b>CHEERS (0-100%):</b>	
Mean	61%
CMA mean	47%
CEA mean	71%
<b>TRL (1-9):</b>	
Low (TRL 1 - 5)	75%
High (TRL 6 - 9)	25%

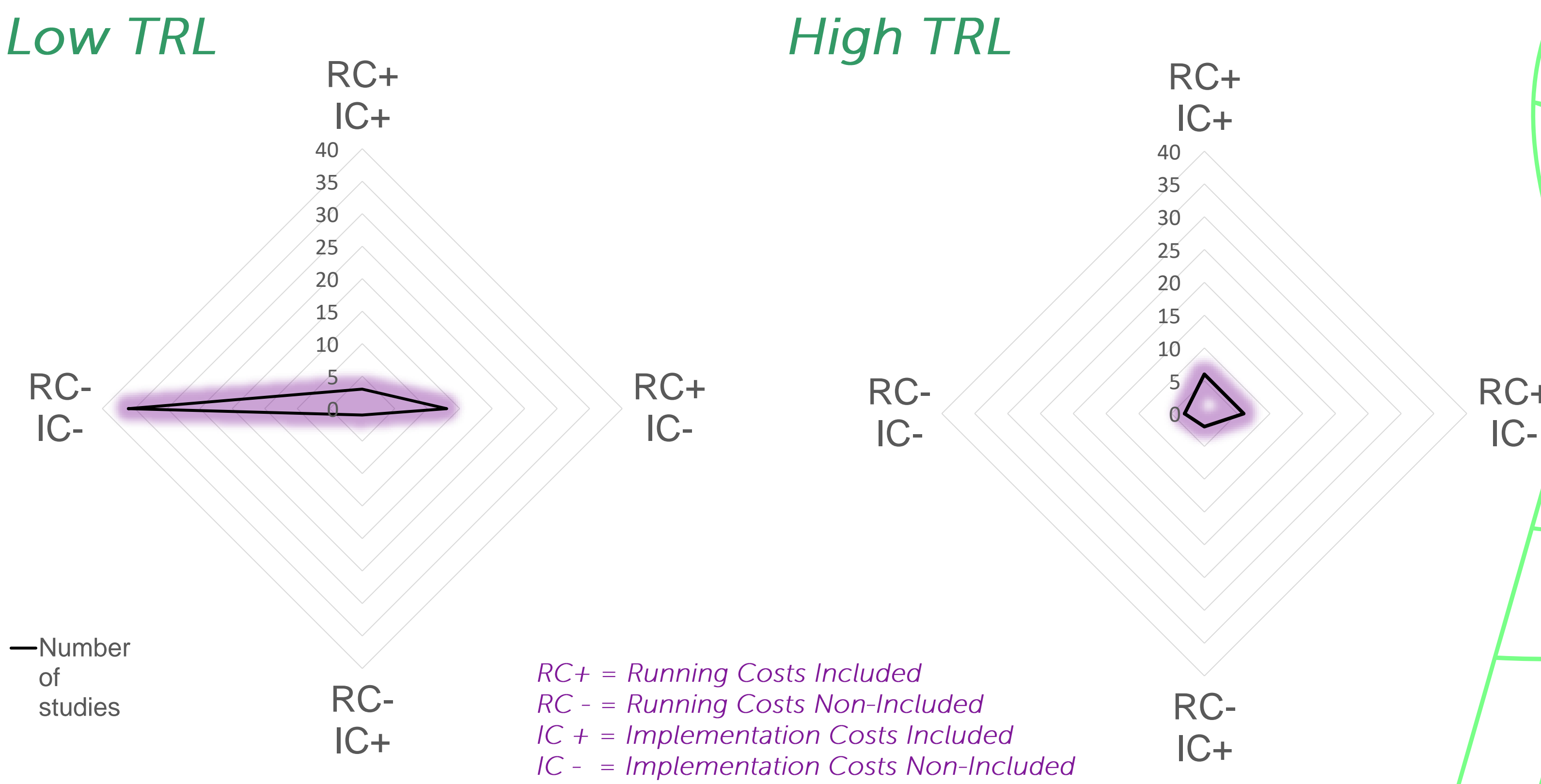
Table 4: Correlation between AI's implementation or operational costs and TRL.

	Low TRL % (N)	High TRL% (N)	OR <sup>a</sup>
<b>Implementation Costs</b>			
Not Included	92% (48/52)	53% (9/17)	10.15***
<b>Operational Costs</b>			
Not Included	69% (36/52)	29% (5/17)	5.26**

**Low TRL (TRL 1-5):** medical AI not tested or implemented in clinical settings  
**High TRL (TRL 6-9):** medical AI already tested or implemented in clinical settings  
**Implementation Costs:** investments in physical infrastructure, education expenditures & training, and outlays for data preparation  
**Operational Costs:** ongoing costs such as software licensing fees, hardware maintenance and associated utility expenses

<sup>a</sup>\*\*\*p<0.001, \*\*p<0.01

Figure 1: Correlation between AI's implementation or operational costs and TRL.



## Key Take-Aways

- TRL of the AI technology under evaluation should always be reported as it describes a technology's maturity at one point in time.
- Health economic evaluations of AI technologies often neglect implementation and operational costs.
- This oversight is especially true for relatively immature (Low TRL) AI technologies.
- Implementation and running costs should be incorporated in health economic evaluations for medical AI technologies.