

# The Future is Conversational: *Clinical Use of LLMs*

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## **DISCLOSURES**

AAD Augmented Intelligence Committee: Standards Workgroup, Member

Sanofi/Regeneron: Advisory Board, VisualDx: Consultant

The views presented are my own.

# A.I. Chatbots Defeated Doctors at Diagnosing Illness

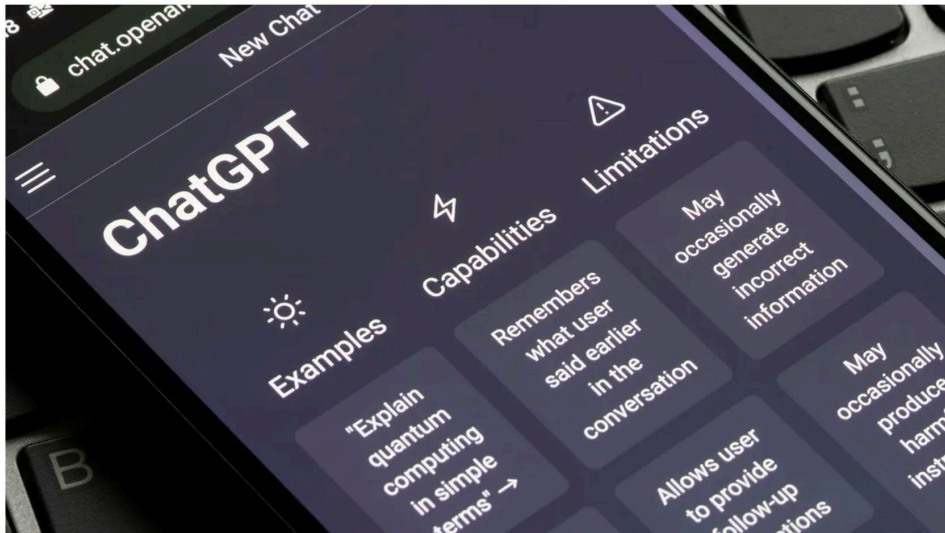
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## AI Passes U.S. Medical Licensing Exam

— Two papers show that large language models, including ChatGPT, can pass the USMLE

by Michael DePeau-Wilson, Enterprise & Investigative Writer, MedPage Today  
January 19, 2023



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## ChatGPT outperformed doctors in diagnostic accuracy, study reveals

By Austin Williams | Updated November 21, 2024 7:44pm EST | Health | FOX TV Digital Team | ➔



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## ChatGPT Out-scores Medical Students on Complex Clinical Care Exam Questions

A new study shows AI's capabilities at analyzing medical text and offering diagnoses — and forces a rethink of medical education.

Jul 17, 2023 | Adam Hadhazy



# Motivation

## Limitations of current evaluation frameworks for clinical LLMs

### Case Vignette:

A 20-year-old woman presents to the clinic with a circular hypopigmented lesion on her right cheek. The patient stated that she used to have a mole in the same location. Over time she noticed a white area around the mole that enlarged to the current size of the lesion. After a few months she noticed the mole in the center of the lesion had disappeared. On further questioning, she denies any personal or family history of skin cancer.

### Choices:

- A. Halo nevus
- B. Melanoma
- C. Vitiligo
- D. Dysplastic nevus

### Concise summary of symptoms:

No evaluation of history-gathering capabilities  
No evaluation of ability to diagnose effectively during conversations

### Medical terminology:

No evaluation of diagnosis from layman language

### Answer choices:

No evaluation of open-ended diagnosis

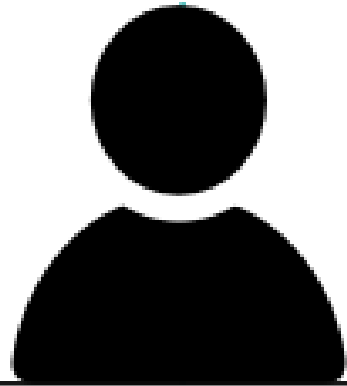
Need A Framework that is - ☒ Realistic ☒ Scalable ☒ Reliable

# **Conversational Reasoning Assessment Framework for Testing in Medicine (CRAFT-MD)**

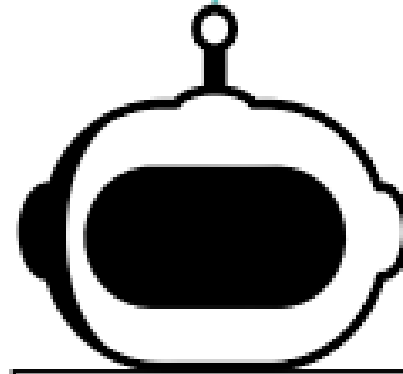
# Components of CRAFT-MD



Clinical  
LLM



Patient-AI  
agent



Grader-AI  
agent



Medical  
expert

# Evaluations

## Case Format

- Vignette
- Multi-turn conversation
- Single-turn conversation
- Summarized conversation

## Diagnosis

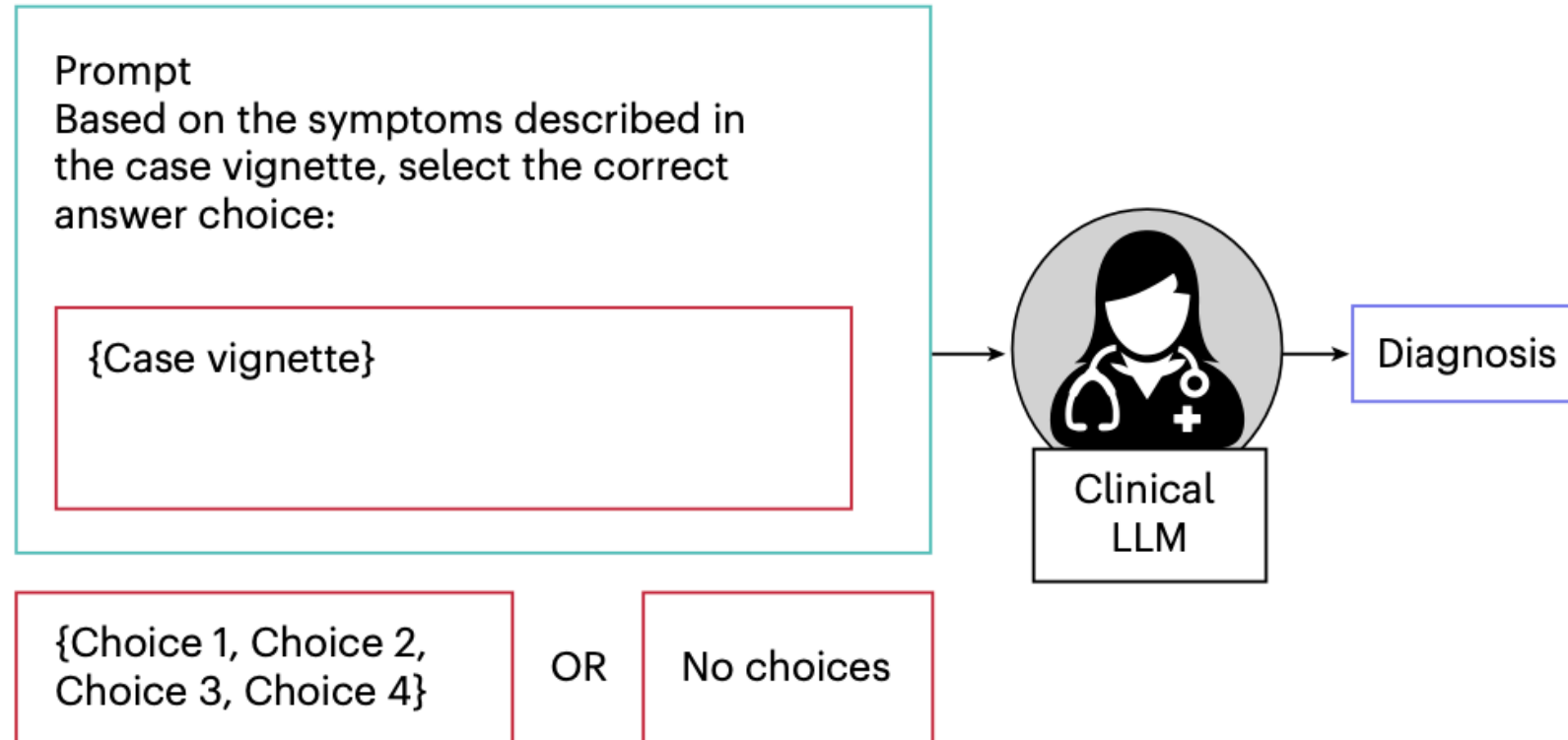
{Choice 1, Choice 2,  
Choice 3, Choice 4}

OR

No choices

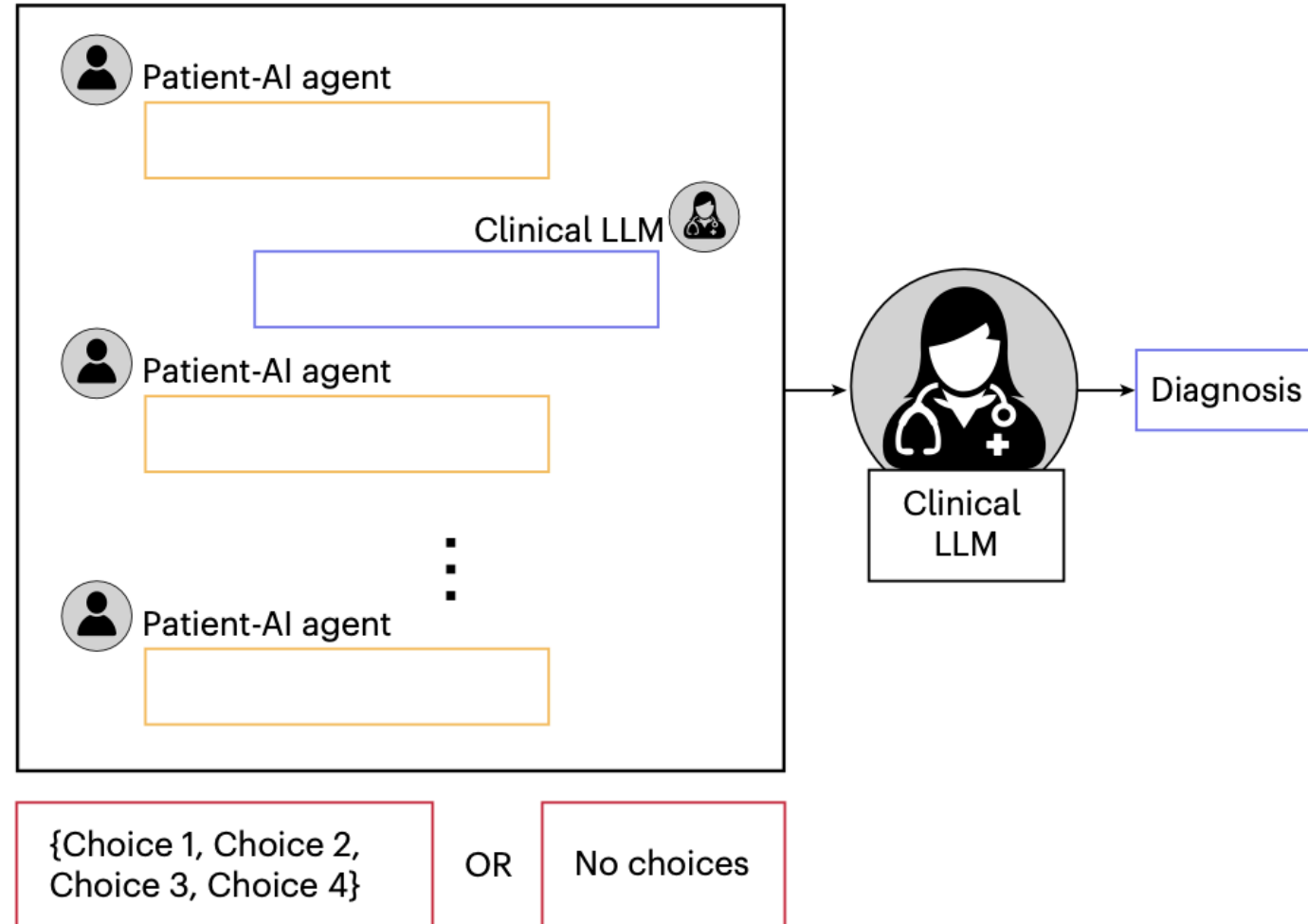
# Evaluations

## ■ Vignette



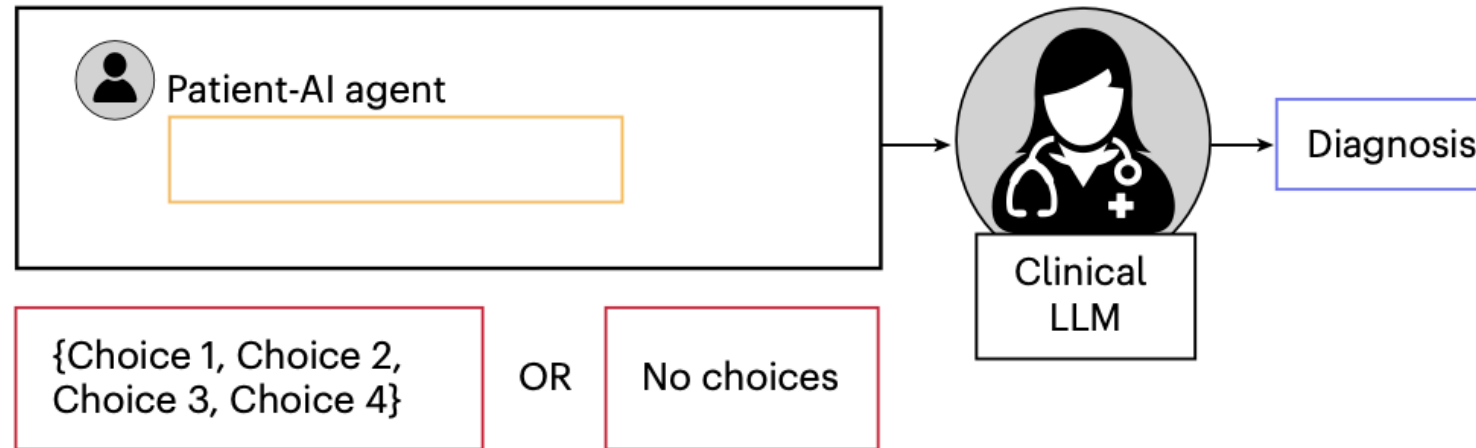
# Evaluations

## ■ Multi-turn conversation



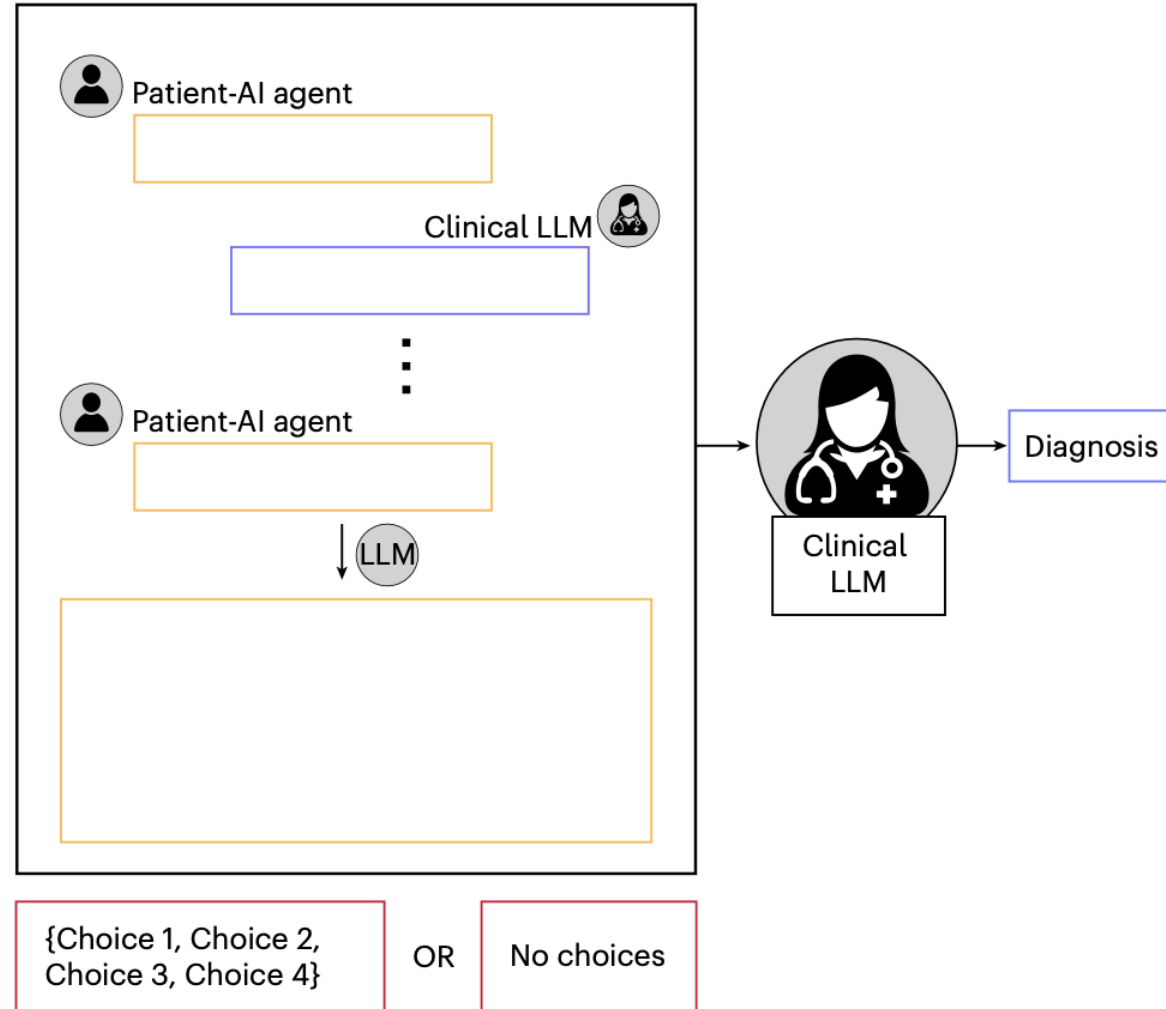
# Evaluations

## ■ Single-turn conversation



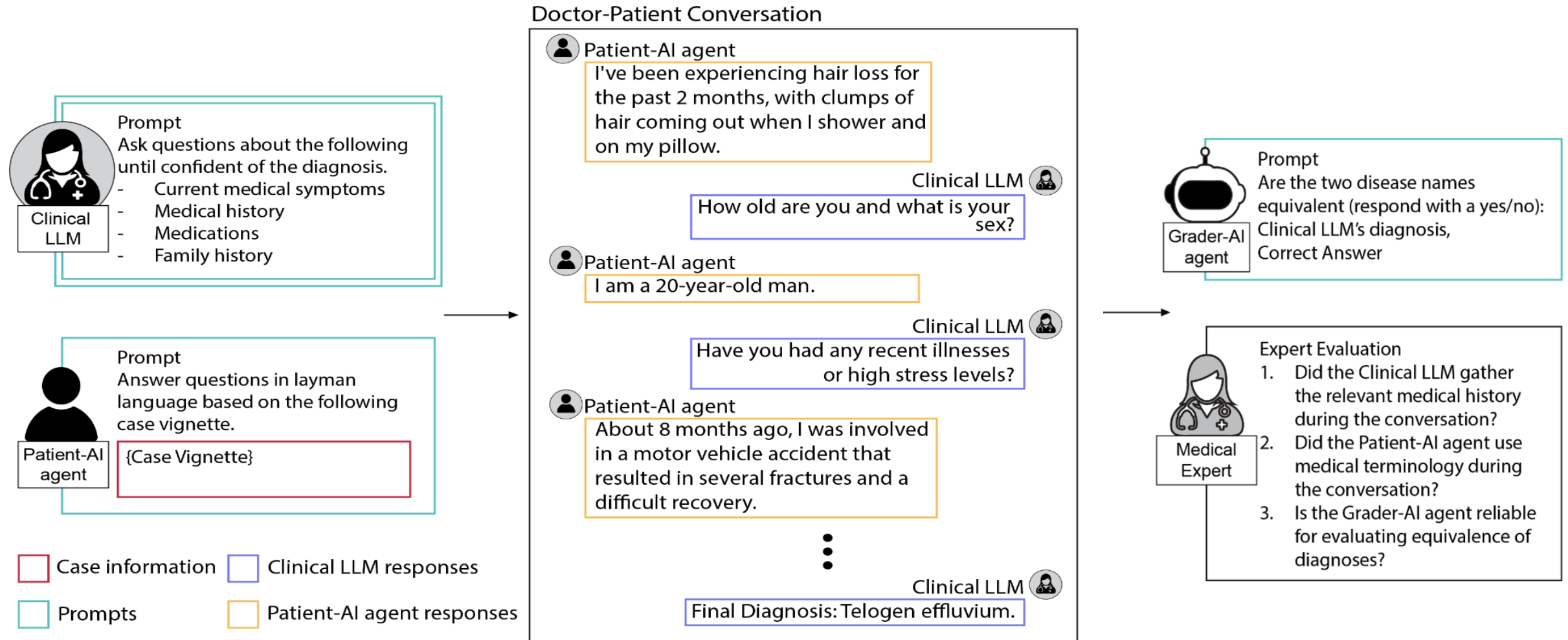
# Evaluations

## Summarized conversation



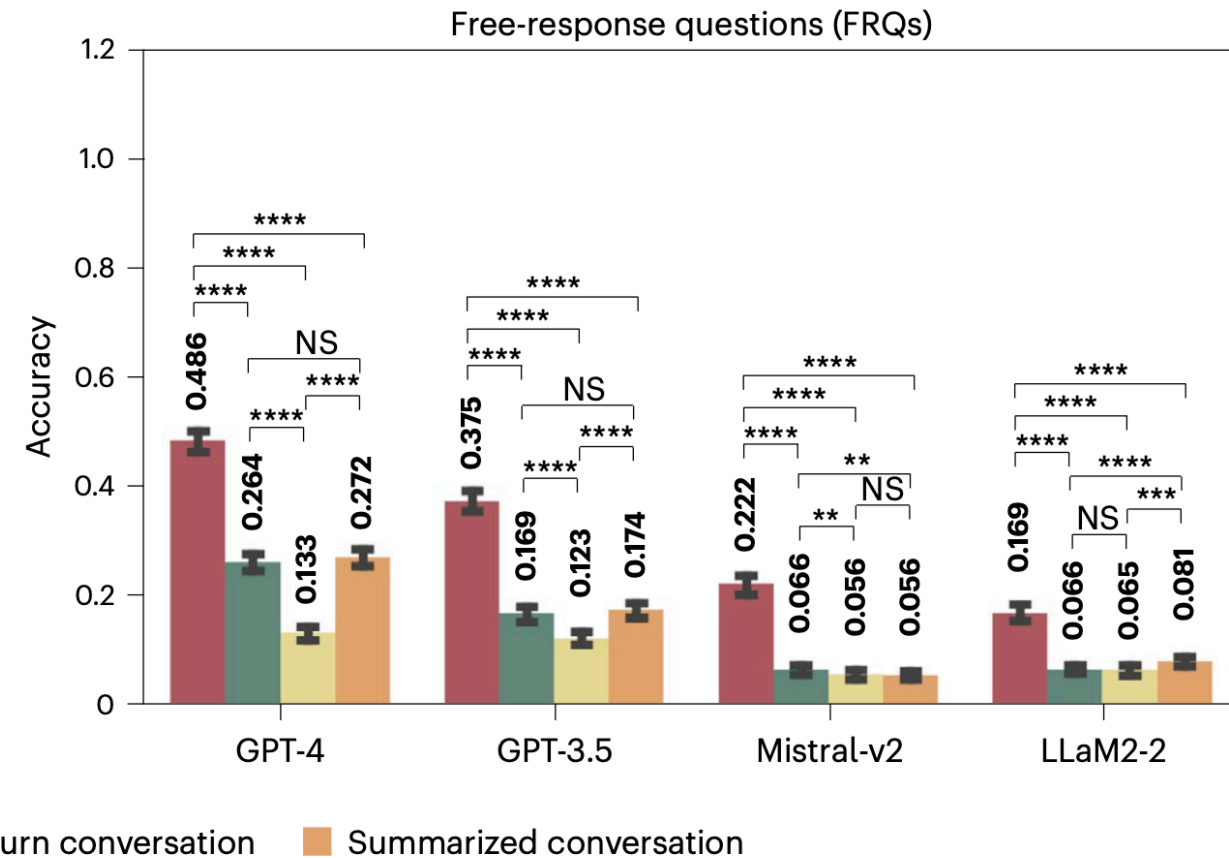
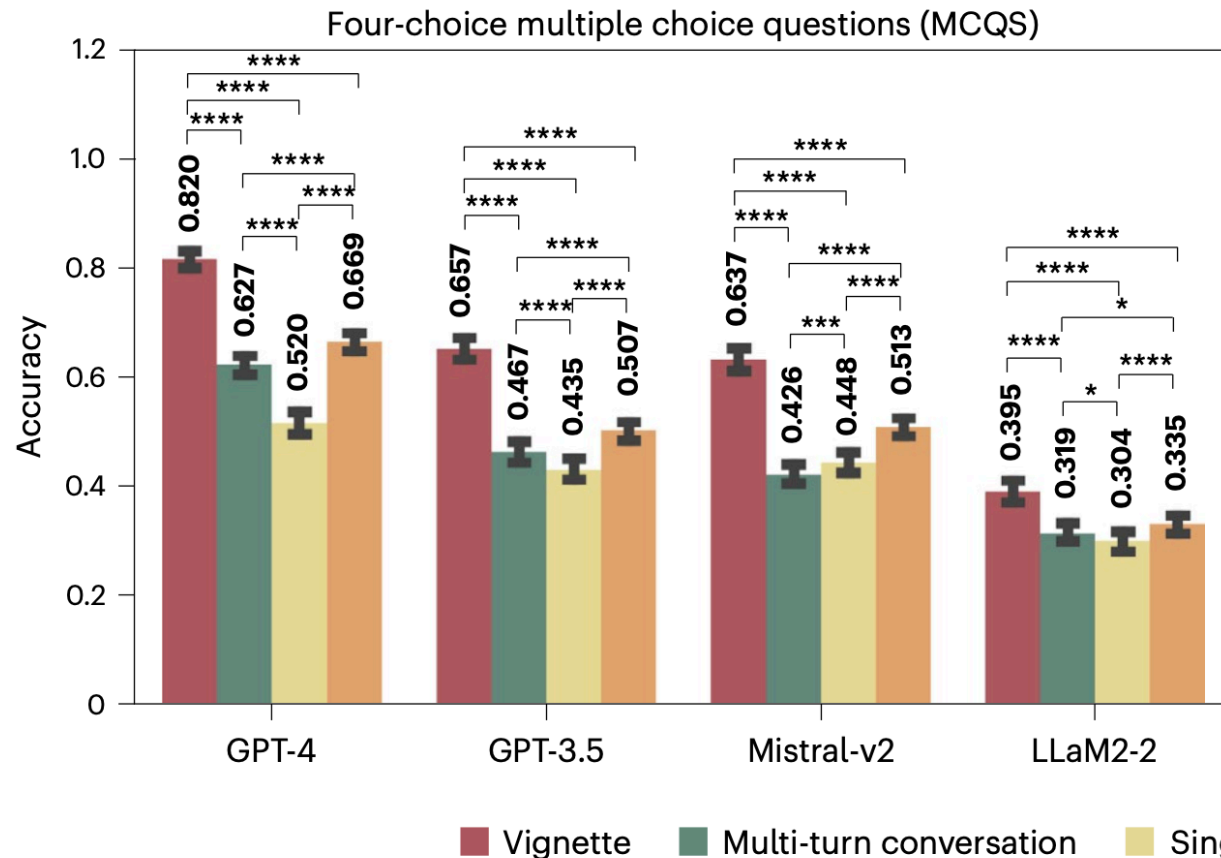
# Approach: CRAFT-MD

## *Clinical Reasoning Assessment Framework for Testing in Medicine*



**Do LLMs maintain accuracy when making diagnoses through conversations?**

# Effects of Replacing Case Vignettes with Simulated Doctor-Patient Conversations



# Key Findings

- Conversational interactions reduce diagnostic accuracy

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- Conversational summarization improves the limited reasoning of LLMs across multiple dialogues

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- Conversational summarization improves the limited reasoning of LLMs across multiple dialogues
- Trends persist in open-ended diagnoses and across specialties

# Evaluation of Image Comprehension

## Vignette with image

Prompt  
Based on the symptoms described in the case vignette and the provided image, select the correct answer:

{Case vignette}

Image



Clinical LLM

Diagnosis

{Choice 1, Choice 2,  
Choice 3, Choice 4}

OR

No choices

## Multi-turn conversation with image



Patient-AI agent

Clinical LLM



Patient-AI agent

⋮



Patient-AI agent

Image



Clinical LLM

Diagnosis

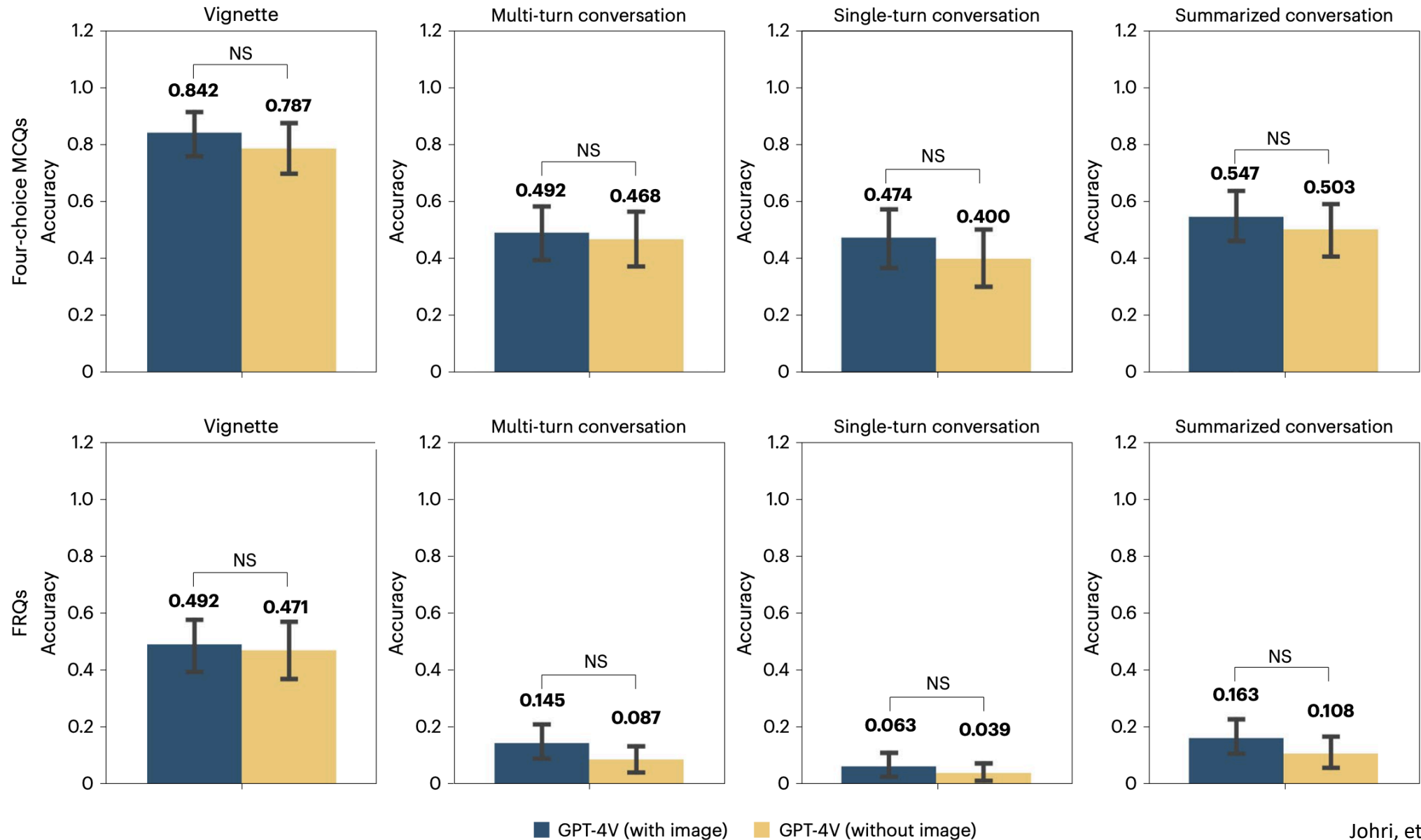
{Choice 1, Choice 2,  
Choice 3, Choice 4}

OR

No choices

  Case information     Prompts     Clinical LLM responses     Patient-AI agent responses

# Multimodal Models are Limited in Image Comprehension



# Recommendations for Evaluation of Clinical LLMs

- Evaluate diagnostic accuracy through realistic doctor–patient **conversations**
- Employ **open-ended questions** for evaluating diagnostic reasoning
- Assess comprehensive **history taking** skills
- Evaluate LLMs on the **synthesis** of information from conversations

# Thank You!

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nature medicine



Article

## An evaluation framework for clinical use of large language models in patient interaction tasks

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