

# Assessing the Utility of ChatGPT Throughout the Entire Clinical Workflow: Development and Usability Study

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# Study design

- ▶ Hypothesis: When provided with clinical vignettes, ChatGPT would be able to recommend a diagnostic workup, decide the clinical management course, and ultimately make the diagnosis
- ▶ Assess accuracy in solving comprehensive clinical vignettes
- ▶ Clinical Vignettes provided by Merck Manual (MSD Manual)

# MSD Manual

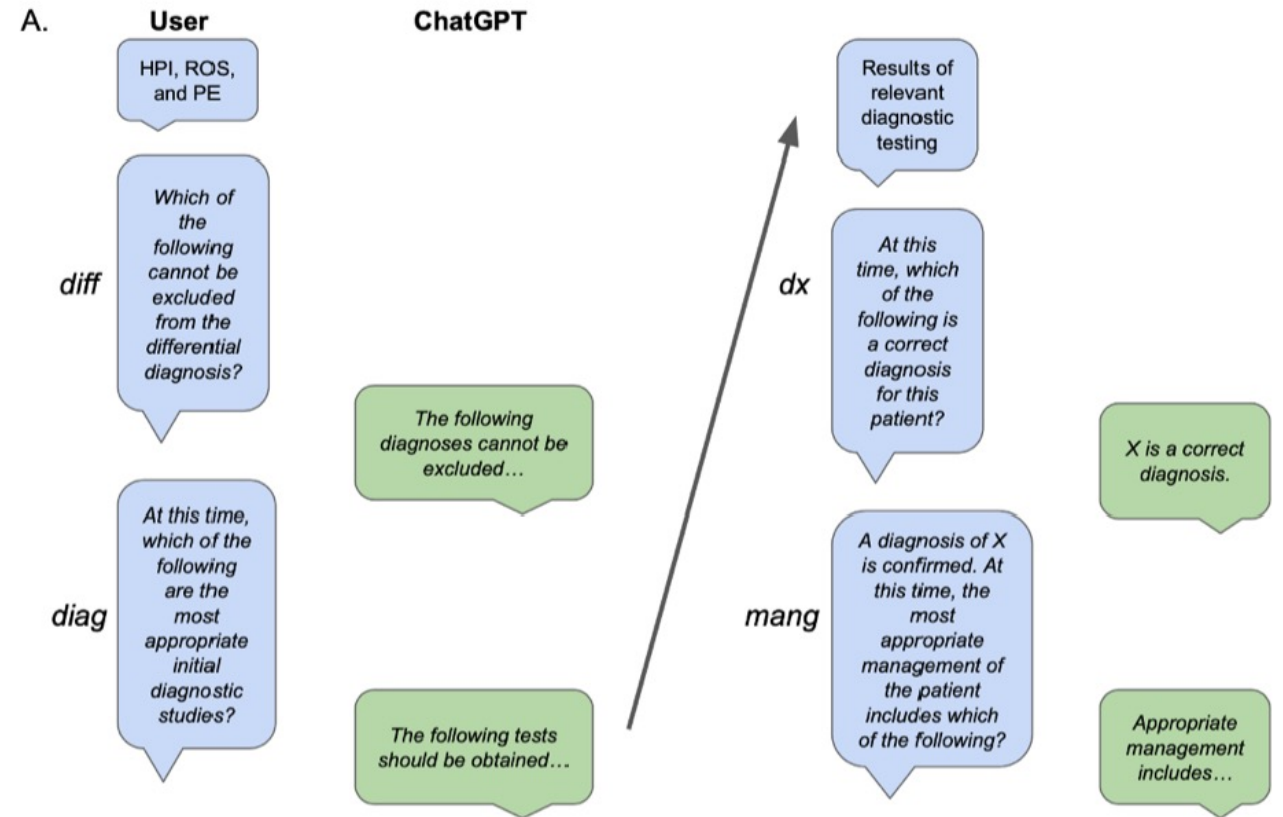
- ▶ Started in 1899 as a small reference book for physicians and pharmacists
- ▶ Started expanding in scope to a more comprehensive medical resource for professionals and consumers
- ▶ [Case studies - MSD Manual Professional Edition \(msdmanuals.com\)](https://www.msdmanuals.com)

The screenshot displays the MSD Manual Professional Version website. The header includes the logo, navigation links (HOME, MEDICAL TOPICS, RESOURCES, NEWS, PROCEDURES, QUIZZES, ABC), a search bar, and a language selector. The main content area is titled "Case Studies (36)" and lists various medical conditions categorized by letter. Each category includes a list of specific case study titles.

| Category | Case Study Titles   |
|----------|---|
| A (2)    | Abdominal Pain in a 26-Yr-Old Pregnant Woman, Anemia in a 42-year-old woman   |
| B (1)    | Back Discomfort in a 12-Year-Old Boy  |
| C (8)    | Chest Pain in 74-Yr-Old Man, Chest Pain in a 49-Yr-Old Woman, Chest Pain in a 62-Yr-Old Man, Chronic Lethargy in a 68-Yr-Old Woman, Confusion in a 74-Yr-Old Woman, Cough in a 2-Yr-Old Boy, Cough in a 54-Yr-Old Man, Cough in 47-Yr-Old Woman |
| D (1)    | Dyspnea and Back Pain in a 24-Yr-Old Man  |
| E (1)    | Exertional Dyspnea in a 76 Yr-Old Man   |
| F (1)    | Fatigue and Palpitations in a 53-Yr-Old Woman   |
| H (3)    | Headache and dizziness in a 54-year-old man, Hyperglycemia in a 56-Year-Old Woman, Hypertension and Ptoisis in a 48-Yr-Old Woman  |
| L (6)    | Left Scrotal Pain in an 18-Yr-Old Man, Left-sided Abdominal Pain in a 45-Yr-Old Man, Leg Pain in a 62-Yr-Old Man, Leg Tingling in 20-Yr-Old Woman, Lethargy in a 65-Yr-Old Man, Loss of Consciousness in a 50-Yr-Old Man                        |


# Figure 1. Experimental workflow for determining ChatGPT accuracy in solving clinical vignettes.

- ▶ Panel A: Schematic of user interface with ChatGPT for this experiment.
- ▶ Blue boxes indicate prompts given to ChatGPT and green boxes indicate ChatGPT responses.
- ▶ Nonitalicized text indicates information given to ChatGPT without a specific question attached



# Interacting with the cases

Which of the following cannot be excluded from the differential diagnosis



At this time, which of the following are the most appropriate initial diagnostic studies



At this time, which of the following is a correct diagnosis for this patient

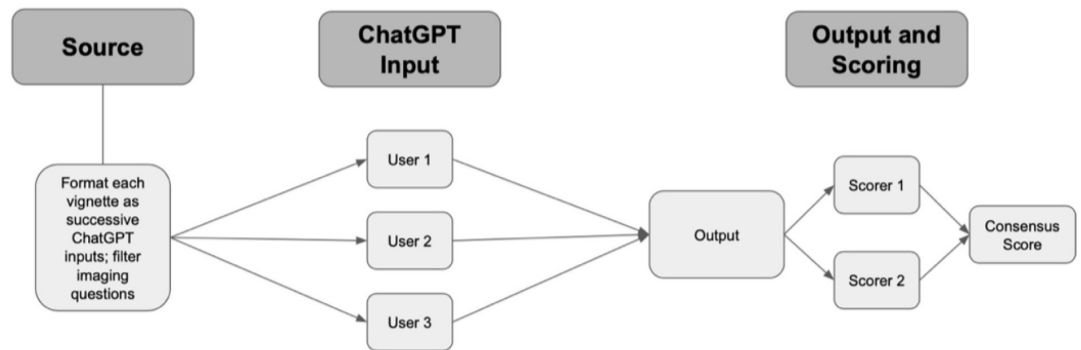


A Diagnosis of X if confirmed. At this time, the most appropriate management of the patient includes which of the following

# Figure 1. Experimental workflow for determining ChatGPT accuracy in solving clinical vignettes.

- ▶ Panel B: Schematic of experimental workflow. Prompts were developed from Merck Sharpe & Dohme (MSD) vignettes and converted to ChatGPT-compatible text input.
- ▶ Questions requiring the interpretation of images were removed. Three independent users tested each prompt. Two independent scorers calculated scores for all outputs; these were compared to generate a consensus score.
- ▶ *diag*: diagnostic questions
- ▶ *diff*: differential diagnoses
- ▶ *dx*: diagnosis questions;
- ▶ HPI: history of present illness
- ▶ *mang*: management questions
- ▶ Misc: Miscellaneous questions
- ▶ PE: physical exam
- ▶ ROS: review of systems.

B.



# Clinical Acuity

- ▶ Cases were scored according to the Emergency Severity Index (ESI)
- ▶ ESI - Ordinal Scaled system 1-5.
- ▶ Scores were generated by ChatGPT and cross-validated with a human generated ESI score for validation

# Supplemental

## ► Table S1: Metadata for MSD Vignettes

► Metadata for MSD vignettes. Age, gender, title, and final diagnosis were all provided within the vignettes themselves. ESI rating was calculated by ChatGPT and human scorers (see Methods). Vignette number was assigned by this research group in the order that the vignettes are published online.

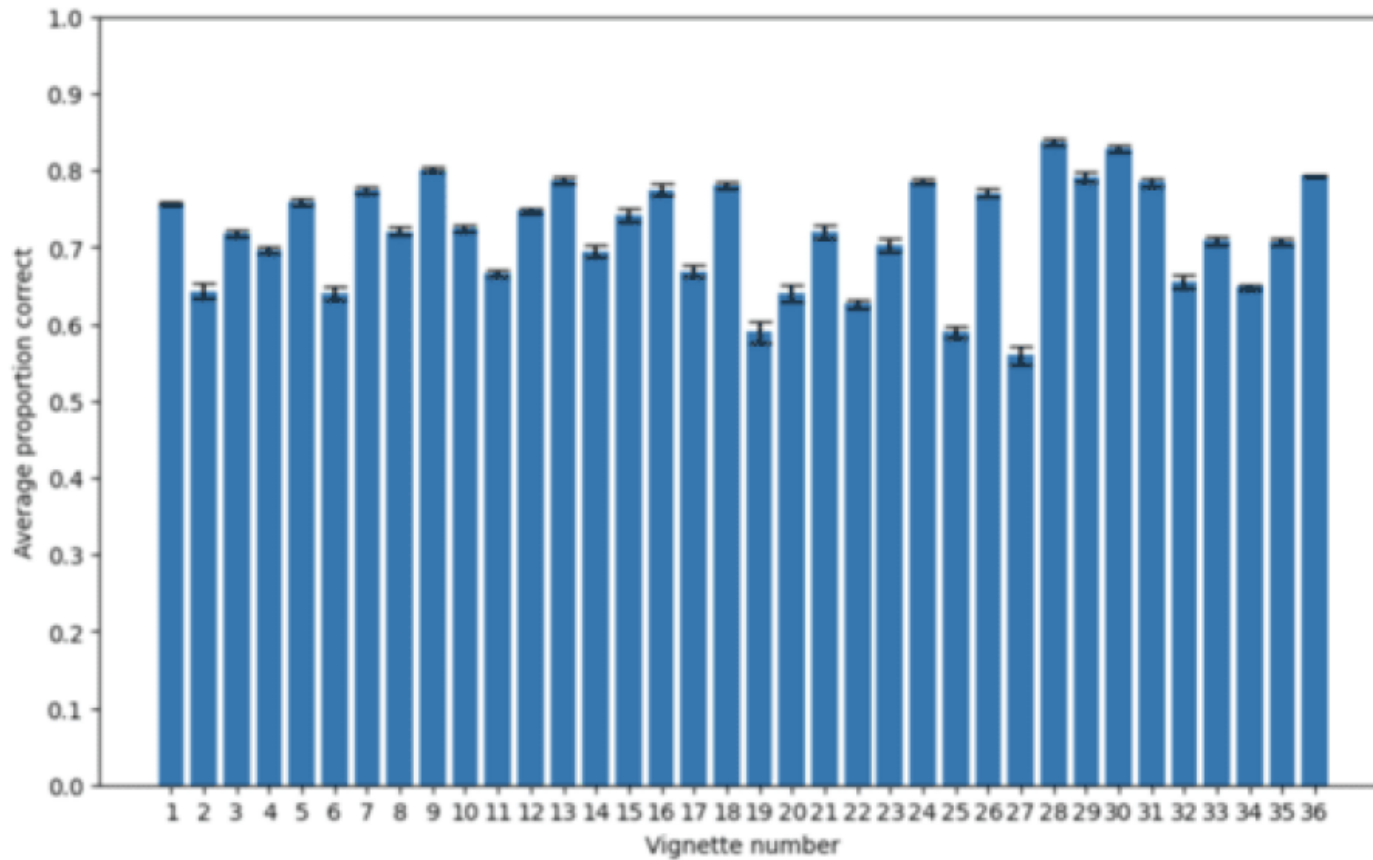
| Vignette Number | Title   | Age | Gender | ESI | Final Diagnosis   |
|-----------------|---|-----|--------|-----|---|
| 1               | Abdominal Pain in a 26-Yr-Old Pregnant Woman  | 26  | F      |     | 3 Sepsis  |
| 2               | Anemia in a 42-year-old woman                 | 42  | F      |     | Transient pure red cell aplasia triggered by 2 parvovirus B19 infection |
| 3               | Back Discomfort in a 12-Year-Old Boy          | 12  | M      |     | 4 Adolescent idiopathic scoliosis                                       |
| 4               | Chest Pain in 74-Yr-Old Man                   | 74  | M      |     | Non-ST-segment elevation myocardial infarction 2 (NSTEMI)               |
| 5               | Chest Pain in a 49-Yr-Old Woman               | 49  | F      |     | 2 Pulmonary embolism (PE)   |
| 6               | Chest Pain in a 62-Yr-Old Man                 | 62  | M      |     | 4 Stable angina   |
| 7               | Chronic Lethargy in a 68-Yr-Old Woman         | 68  | F      |     | 3 Hashimoto thyroiditis   |
| 8               | Confusion in a 74-Yr-Old Woman                | 74  | F      |     | 2 Seizure due to meningioma   |
| 9               | Cough in 47-Yr-Old Woman                      | 47  | F      |     | 2 Asthma  |
| 10              | Cough in a 2-Yr-Old Boy                       | 2   | M      |     | 3 Foreign body aspiration, left lung                                    |
| 11              | Cough in a 54-Yr-Old Man                      | 54  | M      |     | 3 Community-acquired pneumonia  |
| 12              | Dyspnea and Back Pain in a 24-Yr-Old Man      | 24  | M      |     | 3 Primary spontaneous pneumothorax                                      |
| 13              | Exertional Dyspnea in a 76 Yr-Old Man         | 76  | M      |     | 2 Severe aortic stenosis  |
| 14              | Fatigue and Palpitations in a 53-Yr-Old Woman | 53  | F      |     | 3 Atrial fibrillation   |
| 15              | Headache and dizziness in a 54-year-old man   | 54  | M      |     | 4 Acoustic neuroma, right side  |
| 16              | Hyperglycemia in a 56-Year-Old Woman          | 56  | F      |     | 4 Type 2 diabetes   |
| 17              | Hypernasality and Ptosis in a 48-Yr-Old Woman | 48  | F      |     | 2 Myasthenia gravis   |
| 18              | Left Scrotal Pain in an 18-Yr-Old Man         | 18  | M      |     | 3 Testicular torsion  |
| 19              | Left-sided Abdominal Pain in a 45-Yr-Old Man  | 45  | M      |     | 3 Ureteral lithiasis  |
| 20              | Leg Pain in a 62-Yr-Old Man                   | 62  | M      |     | 3 Cellulitis  |



# Results

- ▶ Case-by-case
- ▶ Question Category-by-Question Category

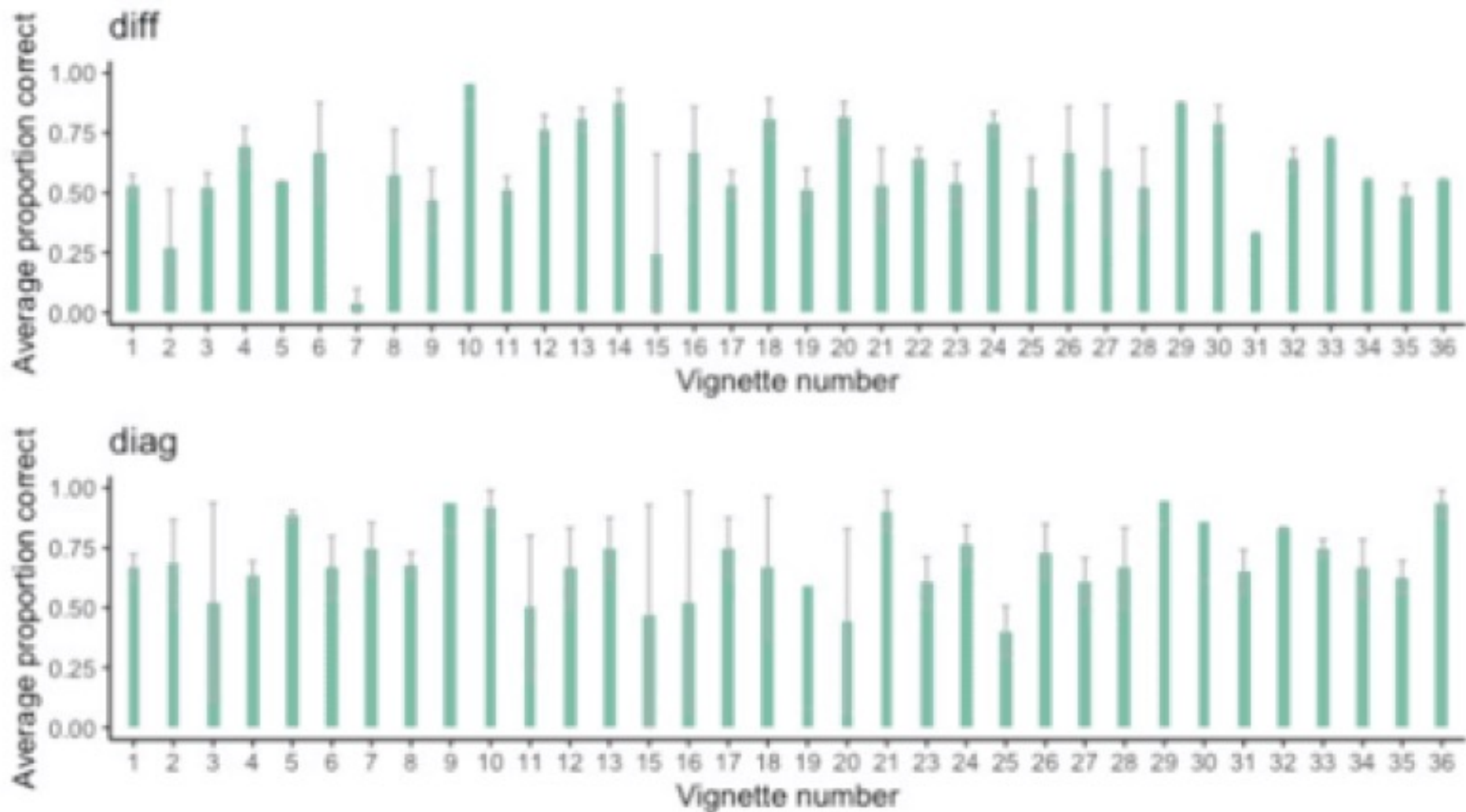
# Results - Figure 2a



ChatGPT overall performance for each of the 36 Merck Sharpe & Dohme (MSD) vignettes; error bars are 1 SE of the mean.

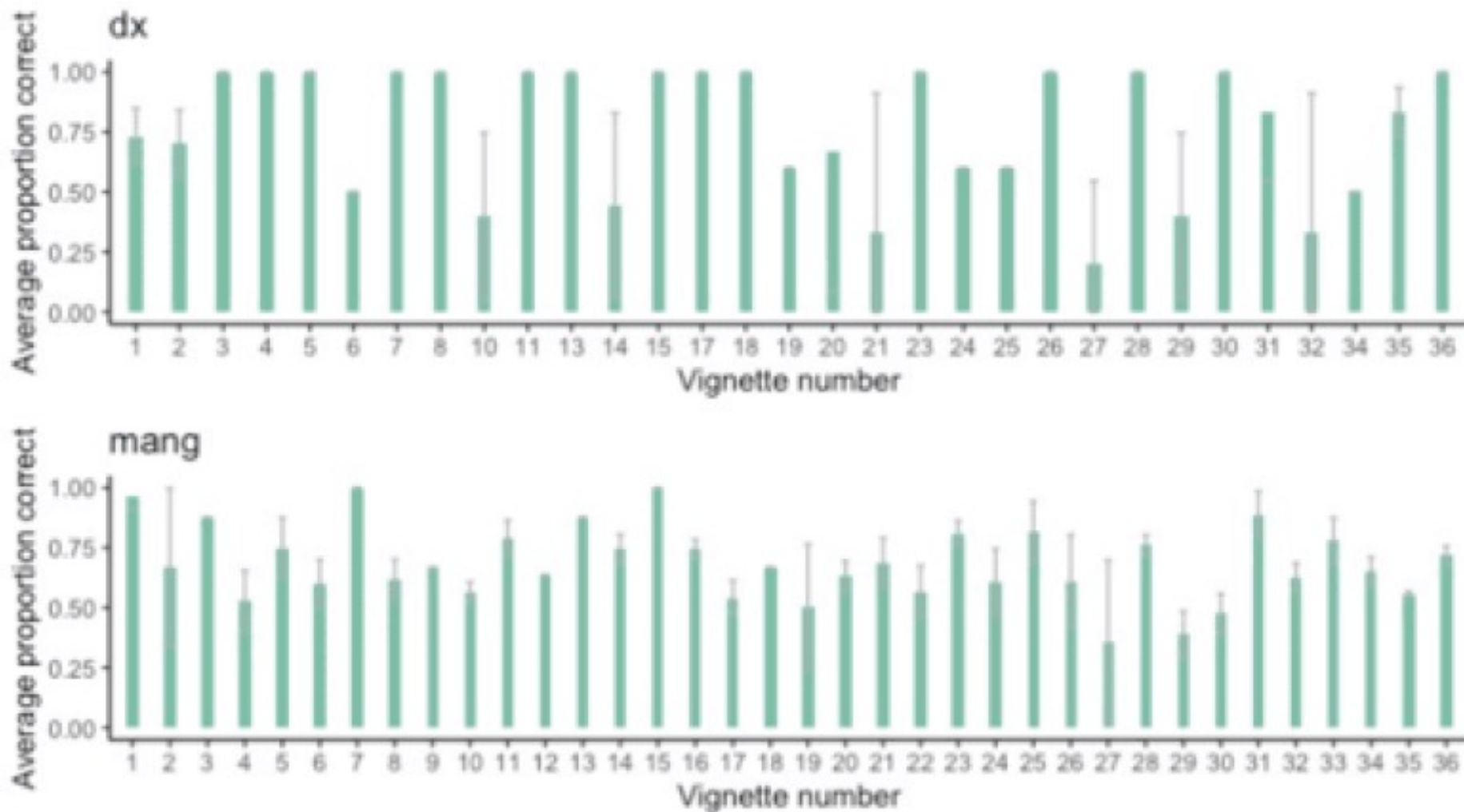
Average performance found to be 71.8%

# Results - Figure 2c



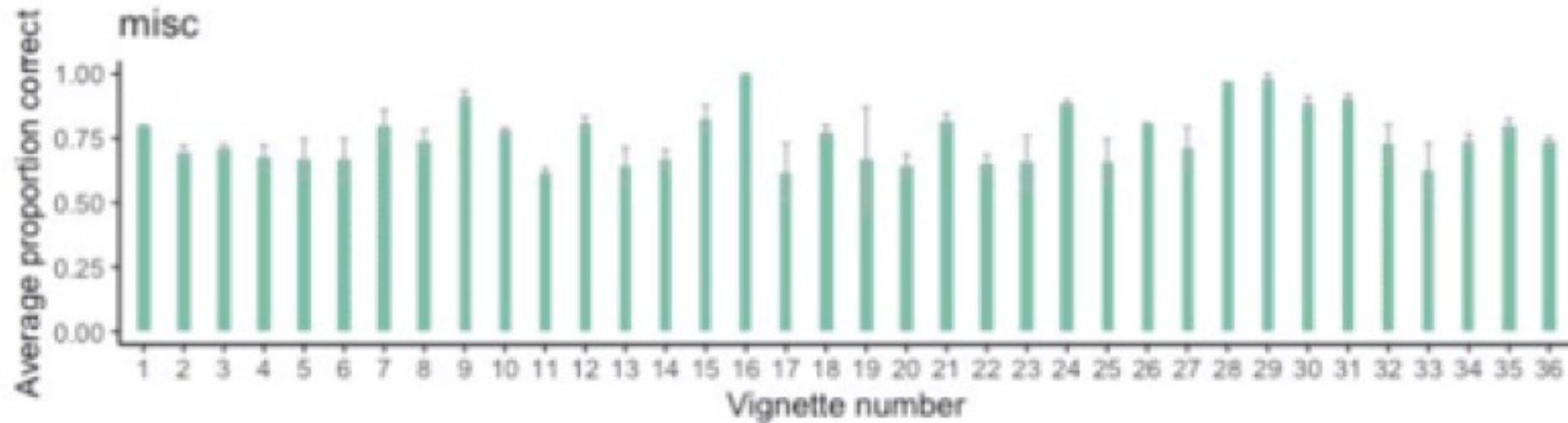
ChatGPT performance by question type for each of the 36 MSD vignettes; error bars are 1 SE of the mean. *diag*: diagnostic questions; *diff*: differential diagnoses; *dx*: diagnosis questions; *mang*: management questions; *misc*: miscellaneous question.

# Results - Figure 2c



ChatGPT performance by question type for each of the 36 MSD vignettes; error bars are 1 SE of the mean. *diag*: diagnostic questions; *diff*: differential diagnoses; *dx*: diagnosis questions; *mang*: management questions; *misc*: miscellaneous question.

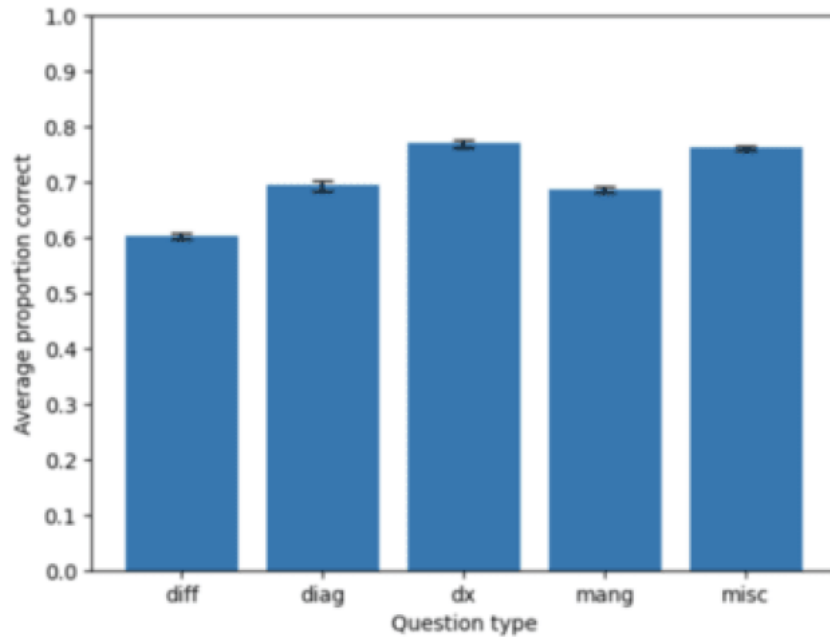
# Results - Figure 2c



ChatGPT performance by question type for each of the 36 MSD vignettes; error bars are 1 SE of the mean. *diag*: diagnostic questions; *diff*: differential diagnoses; *dx*: diagnosis questions; *mang*: management questions; *misc*: miscellaneous question.

# Table S2: ChatGPT Accuracy by Vignette

| Vignette Number | Average Proportion Correct | Standard Error of the Mean |
|-----------------|----------------------------|----------------------------|
| 1               | 75.634921%                 | 0.235725%                  |
| 2               | 64.326599%                 | 1.073817%                  |
| 3               | 71.883267%                 | 0.458918%                  |
| 4               | 69.57294%                  | 0.446449%                  |
| 5               | 75.984848%                 | 0.426538%                  |
| 6               | 64.074074%                 | 0.878604%                  |
| 7               | 77.407407%                 | 0.494539%                  |
| 8               | 72.117304%                 | 0.479085%                  |
| 9               | 80.092593%                 | 0.353047%                  |
| 10              | 72.460317%                 | 0.459257%                  |
| 11              | 66.684704%                 | 0.419683%                  |
| 12              | 74.772727%                 | 0.3634%                    |
| 13              | 78.703704%                 | 0.358782%                  |
| 14              | 69.478438%                 | 0.701748%                  |
| 15              | 74.177489%                 | 0.964328%                  |
| 16              | 77.492151%                 | 0.722724%                  |
| 17              | 66.887755%                 | 0.703032%                  |
| 18              | 77.993197%                 | 0.442806%                  |
| 19              | 58.979107%                 | 1.423041%                  |
| 20              | 64.087302%                 | 1.071508%                  |
| 21              | 72.09127%                  | 0.871775%                  |
| 22              | 62.61992%                  | 0.503332%                  |
| 23              | 70.305217%                 | 0.780044%                  |
| 24              | 78.562031%                 | 0.347551%                  |
| 25              | 58.941799%                 | 0.740824%                  |
| 26              | 77.089947%                 | 0.493125%                  |
| 27              | 55.929705%                 | 1.23026%                   |
| 28              | 83.767952%                 | 0.440924%                  |
| 29              | 79.166667%                 | 0.552734%                  |
| 30              | 82.738095%                 | 0.437194%                  |
| 31              | 78.439153%                 | 0.555443%                  |
| 32              | 65.509259%                 | 0.879226%                  |
| 33              | 70.833333%                 | 0.491073%                  |
| 34              | 64.839958%                 | 0.351188%                  |
| 35              | 70.652054%                 | 0.408724%                  |
| 36              | 79.298777%                 | 0.163206%                  |



| Question Type | Average Proportion Correct | Standard Error of the Mean |
|---------------|----------------------------|----------------------------|
| Differential  | 60.354963%                 | 0.577072%                  |
| Diagnostic    | 69.336524%                 | 0.969417%                  |
| Diagnosis     | 76.975309%                 | 0.697913%                  |
| Management    | 68.579747%                 | 0.548833%                  |
| misc          | 76.129811%                 | 0.465247%                  |

## Results - Figure 2b

ChatGPT performance by question type; error bars are 1 SE of the mean

**Table 1.** Multivariable linear regression examining the relationship between ChatGPT accuracy and patient age, gender, and Emergency Severity Index (ESI), as well as question type.

| Variable               | B Coefficient (% 95% CI) | P value |
|------------------------|--------------------------|---------|
| Age                    | -0.05 (-0.17 to 0.60)    | .35     |
| Male Gender            | 1.28 (-3.36 to 5.92)     | .59     |
| ESI                    | -0.98 (-4.15 to 2.96)    | .55     |
| Diagnostic Question    | -6.62 (-13.42 to 0.18)   | .06     |
| Differential Questions | -15.80 (-22.90 to -8.70) | <.001   |
| Diagnosis              | -0.89 (-6.42 to 8.21)    | .81     |
| Management             | -7.44 (-13.93 to -0.9)   | .02     |



# Authors' Discussion

- ▶ The authors claimed to show that ChatGPT achieves an accuracy of 60.3% intervening differential diagnosis based on HPI, physical exam, and review of systems alone
- ▶ ChatGPT achieves an accuracy of 76.9 in narrowing towards a final diagnosis
- ▶ Report an average performance average performance of 71.8% across all vignettes and question types
- ▶ When comparing the performance of diagnosis accuracy and miscellaneous accuracy, the performance of ChatGPT approximates its accuracy in providing General Medical facts
- ▶ The authors note that the overall accuracy was lower in diagnostic questions and management questions because ChatGPT recommended extra or unnecessary diagnostic testing or clinical intervention respectively
- ▶ For several differential diagnosis questions and diagnosis questions, ChatGPT refused to provide a diagnosis altogether suggesting that ChatGPT is not always able to properly navigate clinical scenarios with a well established standard of care
- ▶ The authors highlighted that small errors in clinical judgment can result in adverse outcomes evidenced by the recommendation of feudal care or refusing to provide a final diagnosis

# Limitations - Author suggested

- ▶ The adverse effects are hard to predict given that ChatGPT lacks reasoning capacity
- ▶ The authors feel that these cases could have been in the training set but felt that this fact was immaterial given that they were attempting to study the applications of current tools in clinical decision making

# Impressions

## Open Discussion

- ▶ Interesting study that works through standardized vignettes
- ▶ Different medical societies view standardized exams differently

# Case Vingette 12 - Dyspnea and back pain in a 24yo Male

|          |  |  |  |
|----------|--|--|--|
| M12_DIFF | <p>Based on the history and physical examination, the following differential diagnoses cannot be excluded:</p> <ul style="list-style-type: none"> <li>Pneumonia</li> <li>Pulmonary embolism</li> <li>Spontaneous pneumothorax</li> <li>Tension pneumothorax</li> <li>Thoracic aortic dissection</li> </ul>   | <p>Asthma exacerbation, lung cancer, pneumonia, pulmonary embolism, spontaneous pneumothorax, and tension pneumothorax cannot be excluded based on the patient's history and physical examination.</p> | <p>Based on the history and physical examination, the following differential diagnoses cannot be excluded:</p> <ul style="list-style-type: none"> <li>Asthma exacerbation</li> <li>Lung cancer</li> <li>Musculoskeletal back pain</li> <li>Pneumonia</li> <li>Pulmonary embolism</li> <li>Spontaneous pneumothorax</li> <li>Tension pneumothorax</li> <li>Thoracic aortic dissection</li> </ul>  |
| M12_DIAG | <p>Given the patient's current history and examination findings, the following steps are most appropriate to do at this time:</p> <ul style="list-style-type: none"> <li>Chest x-ray</li> <li>ECG</li> <li>D-dimer testing</li> <li>Oxygen 6 L by nasal cannula</li> </ul> <p>It is also likely that a CT angiography (CTA) of the chest or thoracic spine x-rays may be performed later in the evaluation, if indicated by the results of the initial tests.</p>  | <p>Chest x-ray, oxygen 6 L by nasal cannula, and ECG are the most appropriate steps to do at this time based on the patient's history and examination findings.</p>                                    | <p>Based on the patient's history and examination findings, the following steps are most appropriate to do at this time:</p> <ul style="list-style-type: none"> <li>Chest x-ray</li> <li>ECG</li> <li>Oxygen 6 L by nasal cannula</li> <li>D-dimer testing</li> </ul> <p>A CT angiography (CTA) of the chest or thoracic spine x-rays may be considered if the patient's condition worsens or if the results of initial tests are not conclusive.</p>  |
| M12_MANG | <p>Given the patient's current history and examination findings, the following steps are essential to do immediately:</p> <ul style="list-style-type: none"> <li>Continue oxygen 6 L by nasal cannula</li> <li>Admit the patient to the hospital</li> </ul> <p>Other steps such as a CT scan of the chest with or without IV contrast, increasing supplemental oxygen, or chest tube placement may be necessary later in the evaluation and management, but these decisions should be made based on the results of initial tests and the patient's response to treatment. Discharging the patient, administering azithromycin, or scheduling follow-up chest x-ray in 1 day are not appropriate based on the limited information provided. Needle decompression, video-assisted thoracoscopic surgery, and chemical pleurodesis are more advanced management options that may be considered later in the evaluation, but are not essential at this time.</p> | <p>Continue oxygen 6 L by nasal cannula, and admit the patient to the hospital are essential steps to do immediately based on the patient's history and examination findings.</p>                      | <p>Based on the patient's history and examination findings, the following steps are essential to do immediately:</p> <ul style="list-style-type: none"> <li>Continue oxygen 6 L by nasal cannula</li> <li>Increase supplemental oxygen to 100% via nonbreathing face mask</li> <li>Admit the patient to the hospital</li> <li>CT scan of the chest with IV contrast</li> </ul> <p>The other options listed (administering azithromycin, discharging the patient, needle decompression, chest tube placement, and scheduling video-assisted thoracoscopic surgery and chemical pleurodesis) may be considered based on the results of the patient's imaging studies and the progression of their condition.</p> |

# Case Vingette 12 - Dyspnea and back pain in a 24yo Male

|        |  |                                    |  |
|--------|--|------------------------------------|--|
| M12_Q1 | Approximately 20% of pneumothorax patients have primary spontaneous pneumothorax.            | 20%                                | Approximately 20% of pneumothorax cases are classified as primary spontaneous pneumothorax.              |
| M12_Q2 | 20s  | 20s                                | The peak age of patients who develop primary spontaneous pneumothorax is in the late teens to early 30s. |
| M12_Q3 | Male sex, smoking, and family history are risk factors for primary spontaneous pneumothorax. | Male sex, Smoking, Family history. | Male sex and smoking are risk factors for primary spontaneous pneumothorax.                              |