Effective use of AI tools Software Engineering Vs Business Administration

By Matei Avram



Research Question

- ChatGPT introduced in Nov. 30, 2022
- Increasing speculation about future of Software Engineering field

Can software engineering skills translate into effective AI usage performance compared to business students in a real life engineering scenario?

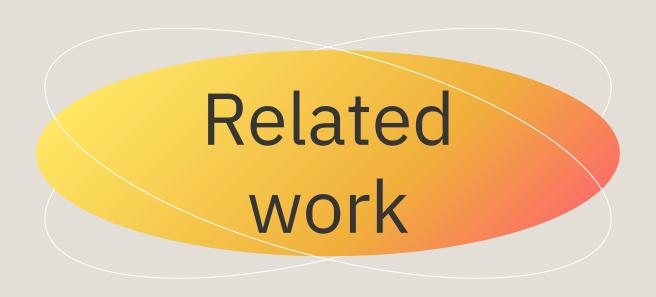
Sub-Questions

- Does prior SE domain experience measurably improve prompt engineering skills?
- How do SE students compare to BA students when using AI tools to solve task in a real life work setting?

Importance

- Helps understanding where the job market might be headed
- Helps universities better prepare students for real life working environments





LLMs fundamentals

- Generates words
- Susceptible to hallucinations

Usage

- Throughout the Software Development life cycle
- Concerns about project quality
- Some concerns about performance

Prompt engineering techniques

Chain-of-thought prompting

Boost model reasoning by breaking problems into steps.

Tree-of-thought prompting

Request model to explore multiple next steps to reach the goal

Maieutic prompting

Deepen model understanding through iterative explanations

Prompt engineering techniques

Least-to-most prompting

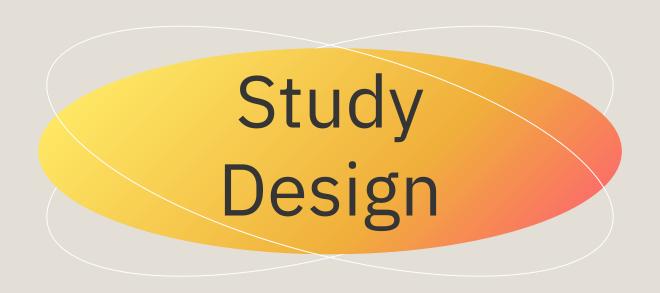
Ask model to break problem into sub-problems and solve sequentially

Self-refine prompting

Request model to improve its solution through self-critique and revision

Directional-stimulus prompting

Guide models using key-words to describe output generation.



How?

Conduct an experiment:

- 2 groups (SE vs BA)
- Solve tasks within a simulated platform with access to ChatGPT o4-mini
- Analyze data

Platform

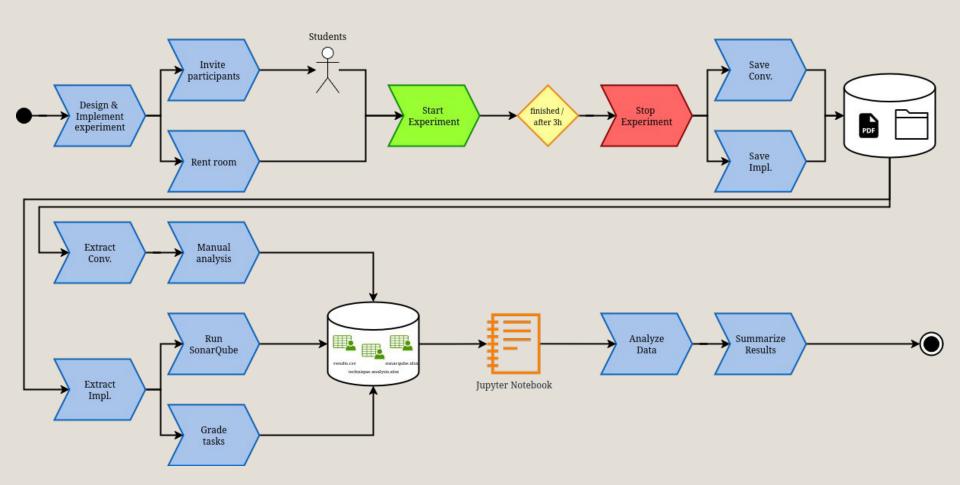
Mock-up E-Ticket web application where users can insert or delete tickets

Tasks

- 1. Add html form to insert ticket
- 2. Implement the DELETE ticket functionality
- Update ticket prices according to dynamic pricing formula

What are we analyzing?

- Task success rate
- Final student project implementation quality using SonarQube
- Manual analysis of students' conversations with the Al model





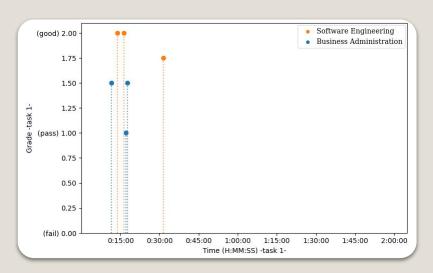
Task success rate

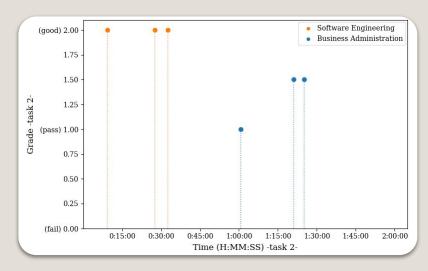
Measured Time & Grade

Individual performance ⇒ Scatter plots

Avg. Group performance ⇒ Bar plots

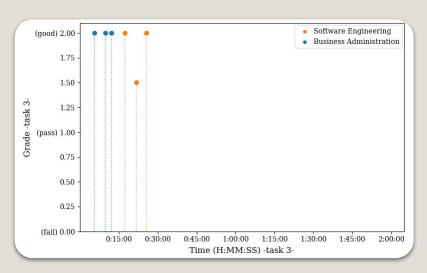
Student completion time & grade distribution

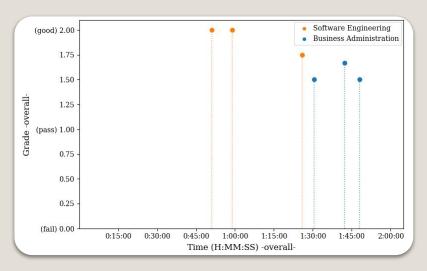




Task 1 Task 2

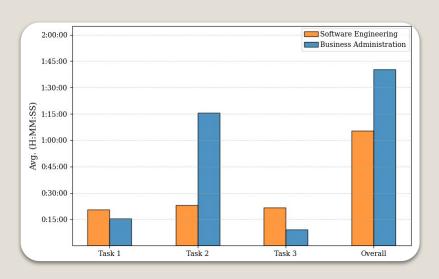
Student completion time & grade distribution





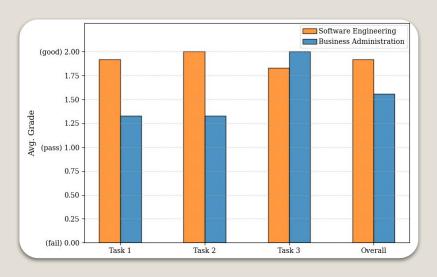
Task 3 Overall

Avg. Group completion time & grade





SE students more consistent faster average times



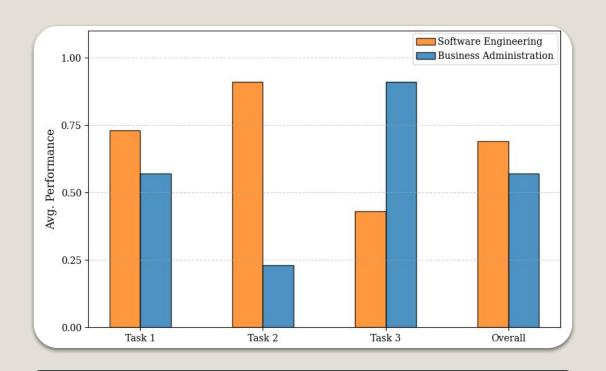
Grade

SE students higher average grade

Avg. Group performance

- 1. Normalized **Time & Grade** metrics
- Invert **Time** as more time spent = decreased performance
- 3. Avg. the two metrics

Avg. Group performance



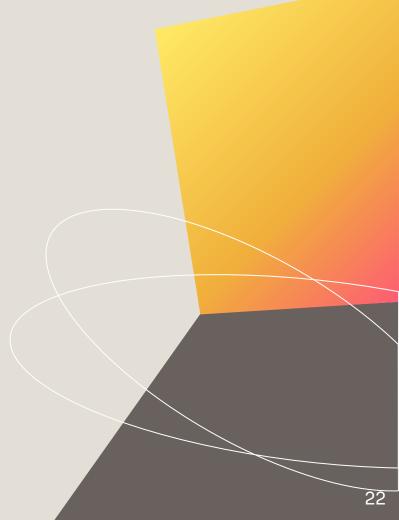
On average SE students outperformed BA students

SonarQube analysis

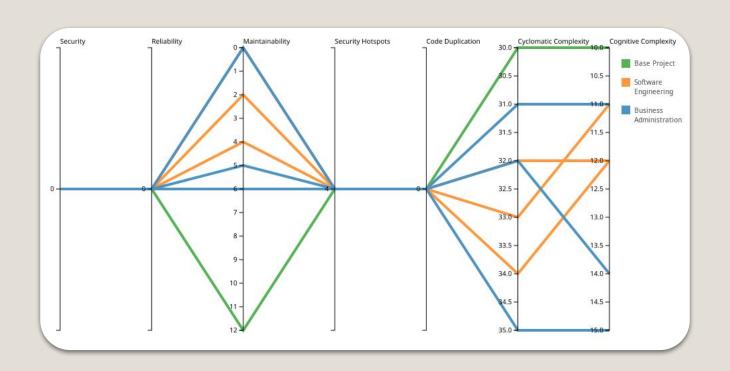
Project quality ⇒ Parallel coordinates plots

- Security
- Reliability
- Maintainability
- Security hotspots
- Code Duplication %
- Cyclomatic Complexity
- Cognitive Complexity

⇒ Modified



Comparison of software quality metrics



AI conversation analysis

- Searched for prompt engineering techniques
- Reviewed workflow used by students and its impact.

Summary of findings

Software Engineering

- Strongly used "Directional-stimulus prompting"
- Employed some use of "Chain-of-thought", "Least-to-most" and sometimes "Self-refine" prompting techniques
- Used some "Maieutic prompting" for debugging

Business Administration

- Used some "Directional-stimulus prompting"
- Employed more "Least-to-most" rather then "Chain-of-thought" prompting styles, however to little extent
- Used "Maieutic prompting" to understand core Software Engineering concepts

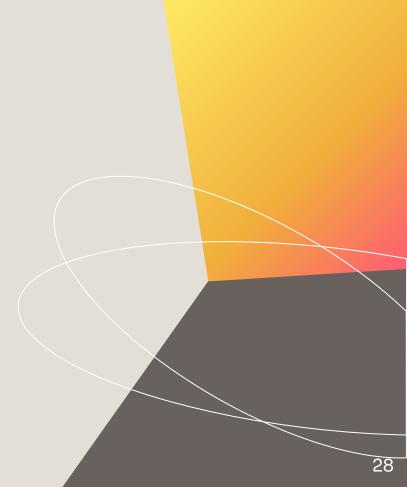


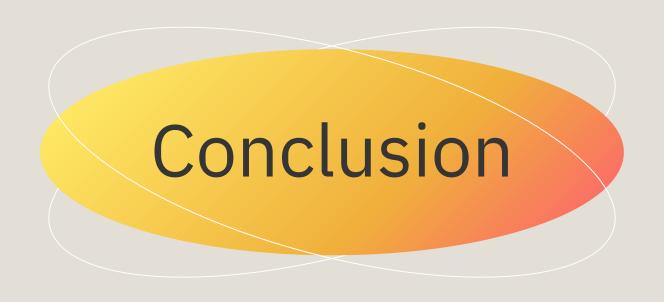
Observations

- SE students had a more accuracy oriented approach (seemingly aware of the model's potential limitations)
- BA students used the model as a guiding tutor (rather than a collaborative tool)
- Both groups' prompts were successful more due to the model's ability to understand their intentions.

Study limitations

- Task description copy-pasting
- Simplified business task
- Standardized browser
- Mock-up application size
- Number of participants





Conclusion

- On average SE students outperformed BA students in this experiment
- Domain knowledge had a measurable impact in navigating the environment and effectively validating the model's outputs

Implications

- Software engineering expertise is still required to utilize LLMs effectively.
 Otherwise companies risk confidentiality issues and significant time increase in solving platform issues.
- Students would benefit from prompt engineering courses to learn how to communicate their requests more accurately

Future work

New experiment:

- Compare 2 teams:
 - Senior software engineers + Al
 - Senior software engineers + juniors
- Analyze team performance

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