Prompt Analysis: ChatGPT

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Research Question

- I. Can we reliably predict whether a developer's issue will be resolved based on the initial conversation with ChatGPT?
- II. If developers were to rerun their prompts with ChatGPT now and/or with different settings, would they obtain the same results?



Motivation

- I. With the rise of ChatGPT, developers are shifting from StackOverflow
- II. ChatGPT provides a real time discussion based experience as opposed to StackOverflow.
- III. It is imperative to know how to manipulate ChatGPT in order to get successful answers.



What we have done so far

I. Extracted the data from the DevGPT compiled developer-centric issues (988 Conversation Threads).

II. Classified the data based on resolved and unresolved categories.

How have we classified the data?

```
"Sources": [
        "Type": "issue".
       "URL": "https://github.com/gakusyutai/gakusyutai.github.io/issues/31",
       "Author": "vuvu31".
       "RepoName": "gakusyutai/gakusyutai.github.io",
        "RepoLanguage": "HTML".
        "Number": 31.
       "Title": "\u30cf\u30f3\u30d0\u30fc\u30ac\u30fc\u30e1\u30cb\u30e5\u30fc\u306e\u5b9f\u88c5",
       "Body": "- https://chat.openai.com/share/8b0f517f-1aaf-4b50-8d79-1138941a383f\r\n- https://chat.openai.com/share/
        7958273c-0081-48d1-8d15-0dd8a5944457\r\nChat GPT \u3092\u4f7f\u3063\u3066\u5b9f\u88c5\u3092\u8a66\u307f\u3066\u3044\u308b",
        "CreatedAt": "2023-07-23T15:38:42Z".
        "ClosedAt": null.
        "UpdatedAt": "2023-07-23T15:38:42Z".
        "State": "OPEN",
        cnatqptSnaring":
               "URL": "https://chat.openai.com/share/7958273c-0081-48d1-8d15-0dd8a5944457",
               "Mention": {
                   "MentionedURL": "https://github.com/gakusyutai/gakusyutai.github.io/issues/31".
                   "MentionedProperty": "body".
                   "MentionedAuthor": "yuyu31",
                   "MentionedText": "- https://chat.openai.com/share/8b0f517f-1aaf-4b50-8d79-1138941a383f\r\n- https://chat.openai.com/
                   share/7958273c-0081-48d1-8d15-0dd8a5944457\r\nChat GPT
                   \u3092\u4f7f\u3063\u3066\u5b9f\u88c5\u3092\u8a66\u307f\u3066\u3044\u308b"
               "Status": 200.
               "DateOfConversation": "July 6, 2023".
               "DateOfAccess": "2023-07-27 13:18:40.616483",
               "Title": "\u30cf\u30f3\u30d0\u30fc\u30ac\u30fc\u30e5\u30e5\u30fc\u8868\u793a\u306e\u4fee\u6b63",
               "NumberOfPrompts": 11,
               "TokensOfPrompts": 2637,
               "TokensOfAnswers": 4712.
               "Model": "Default".
               "Conversations": [
                       "\u3042\u306a\u305f\u306fweb\u30c7\u30b6\u30a4\u30ca\u30fc\u3067\u3059\u3002\u30cf\u30ff\u30fd\u30fc\u30ac\u30fc\u30
                       0e1\u30cb\u30e5\u30fc\u3092\u5b9f\u88c5\u3057\u305f\u3068\u3063\u3001\u521d\u3081\u3081\u3089\u3089\u30e1\u30cb\u30
                       e5\u30fc\u306e\u5185\u5bb9\u304c\u8868\u793a\u3055\u308c\u3066\u3044\u3066\u3001\u8868\u793a\u975e\u8868\u793a\u309
                       2\u5207\u308a\u66ff\u3048\u308e\u308c\u307e\u305b\u3093\u3002\n\u4ee5\u4e0b\u306e\u3088\u3046\u306a\u30b3\u30fc\u30
                       c9\u3092\u7528\u610f\u3057\u3066\u3044\u308b\u3068\u304d\u3001\u3069\u306e\u3088\u3046\u306a\u4fee\u6b63\u304c\u800
```

Design and Evaluation

DESIGN

I. Use of ML Classifier

- Create a Machine learning classifier with a baseline of 50% and train it on a dataset of 395 solved + 395 unsolved queries (80% of dataset) between the developer and ChatGPT.



DESIGN

II. Model Selection

- Random Forest classifier



DESIGN

III. Feature Engineering

- Use TF-IDF vectorization for text features. It gives a score to each keyword on the number of times it appears in the text.



DESIGN

IV. ChatGPT API

- Test the prompts from the issues dataset using ChatGPT API under various different settings like varying temperature, max tokens.



EVALUATION

I. Metrics Evaluation

- Check for accuracy of prediction, precision, True Positive Rate. (First research question)

II. Statistical Analysis

- Conducting Paired T-Test, i.e., Assess the significance of differences between responses by comparing the mean scores of paired samples calculated by cosine similarity. (Second research question)

Development Phase

TIMELINE

timeanddate	Feb	March 2004 S. M. T. W. T. F. S. S. M. T. W. T. F. S.				
Sun 28	Mon 29	Tue 30	Wed 31	Thu 1	Fri 2	Sat 3
4	5	6	7	8	9	10
11	12	13	14 Valentine's Day	15	16	17
18	19 • Presidents' Day	20	21	22	23	24
25	26	27	28	29	1	2
Federal Holidays Loc	al Holidays •• Multiple Event					

Develop ML Model

Select the appropriate ML Model (Random Forest Classifier) and train it on a dataset of 395 solved + 395 unsolved issues conversation threads.

Evaluation Phase

TIMELINE

timeanddate	Feb	February 2024 (United States)					
Sun 28	Mon 29	Tue 30	Wed 31	Thu 1	Fri 2	Sat 3	
4	5	6	7	8	9	10	
11	12	13	14 Valentine's Day	15	16	17	
18	19 • Presidents' Day	20	21	22	23	24	
25	26	27	28	29	1	2	
Federal Holidays Local Holidays Multiple Events							

Testing the Trained ML Model

 Run the trained ML Model on the complete dataset and predict the accuracy.

ChatGPT API

 Test ChatGPT API on different settings and initiate statistical analysis (Paired t-Test) on the old vs new answers.

Testing Phase

TIMELINE

timeanddate	М	March 2024 (United States)					
Sun 25	Mon 26	Tue 27	Wed 28	Thu 29	Fri 1	Sat 2	
3	4	5	6	7	8	9	
10	11	12	13	14	15	16	
17 St. Patrick's Day	18	19	20	21	22	23	
24	25	26	27	28	29	30	
31 Easter Sunday	1 Easter Monday	2	3	4	5	6	
Formal Hallagys Local Hallagys Managin Courses							

Report

 Compile findings into a comprehensive report and discuss and refine conclusions.

Conclusion

TIMELINE

timeanddate	М	March 2024 (United States)					
Sun 25	Mon 26	Tue 27	Wed 28	Thu 29	Fri 1	sat 2	
3	4	5	6	7	8	9	
10	11	12	13	14	15	16	
17 St. Patrick's Day	18	19	20	21	22	23	
24	25	26	27	28	29	30	
31 Easter Sunday	1 Easter Monday	2	3	4	5	6	
Frederick Holidays Austral Holidays No. Holidays Holidays Holidays							

Presentation Preparation

- Prepare slides for the Final Project and rehearse.

Responsibilities

Shahzeb - Lead Developer RQ2 | Presentation Lead

Wonjong - Support RQ2 | Report Lead.

Tianyun - Lead Statistical Analyst | Support Role : Report and Presentation.

Abhijeet - Data Miner | Support Developer RQ1 | Project Manager

Yunpeng - Lead Developer ML Model | Support Role : Report.

THANK YOU