LLM powered Chatbot for Divi Resorts

Author: Rodolfo Croes

Introduction

In recent years, large language models (LLMs) have emerged as one of the most impressive technologies in the artificial intelligence world. Because these models are trained on large datasets using deep learning techniques, specifically the transformer networks architecture, they have exceptional capabilities of generating and understanding human-like texts on many different topics [1]. These large language models are empowering the development of conversational chatbots that understand the natural language written by humans and respond to these imputed texts in a relevant and appropriate manor. An example of this is ChatGPT which is a general use chat bot powered by OpenAI large language models that impressed many people with how well it generates natural languages while showcasing vast amount of knowledge [2]. ChatGPT is built from the backend models from OpenAI called GPT3.5 an GPT4 which can be prompted and fine-tuned by developers to create chatbots for specialized tasks. Such tasks could be related to specific industries, content creation, education and more. One such industry that can use the prompted model is hospitality. By integrating LLM-powered chatbots to hotel systems, the hotel guests and curious potential customers can get around the clock, high quality assistance with almost any request that a concierge desk or booking agent can provide. While most hotel booking websites have chatbots to help the guest with their needs, they are limited with their features. One example of this is the Divi Resorts website where the chatbot they provide only works by selecting the options from a menu which can be seen in figure 1 [3].

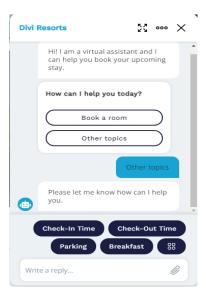


Figure 1: Example of the selection process of the Divi Resorts chatbot.

Given that Divi Resorts offer a variety of resorts experiences all over the Caribbean, I believe improving their chatbot's abilities would benefit the customer experience

when booking a flight or room with them. This is what I aim to accomplish by the end of this project.

Aim

The aim of this project is to build a chatbot by prompting the large language model GPT 4 version 0125-preview that helps book flights, rooms or both for potential Divi Resorts guests. This chatbot should engage in human like dialogue relating to the hotels that Divi resorts have on offer with the objective to help the guests with their booking process. The way to evaluate this chatbot is by testing it many times until a good dialogue is generated which shows the chatbot personality, dialogue control and memory capability. The personality of this chatbot should mimic one of a friendly employee who wants to make the booking experience easier for the guests without engaging in any sensitive real-life topics. This chatbot should be able to give recommendations on which of the offered resorts to choose from depending on what the user is looking for when they go on holiday, select the appropriate amount of rooms given how many guests are booked, offer the guests a flight to go along with what they have booked and show the appropriate price of the guests hotel along with their flight if they have chosen to take the flight offer. The inspiration for these tasks has been taken from the "Book Your Stay" menu on the Divi Resorts website which is shown in figure 2.

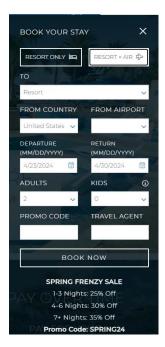


Figure 2: The hotel and flight booking menu from the Divi Resorts website.

Development of first prompt

The development of my prompt started by taking inspiration from an example of a pizza ordering chatbot provided by Dr. Cavazza [4]. After analysing the provided prompt, we see that it follows a structure of how to send the information to a large

language model so that it can perform the task with good results. This structure contains multiple elements that, according to Prompt Engineering Guide, can be classified into either instruction, context, input data and output indicator [5]. Adapting this structure to the prompt required for the Divi Resorts chatbot resulted in the following sections of our developed prompt:

Instruction: "Act like you are a resort booking agent. You respond in a way that a friendly customer support agent would."

Context: "You start by introducing yourself as the booking office at the Divi Resorts. Then you assist the user with booking a room. After this, if the user so chooses, you assist the user with booking a flight to go along with their room booking. You collect the entire booking information, then summarize the booking, along with the total price, then you can confirm the booking for the user."

Input data: User: {human_input}

Output indicator: This is an interactive dialogue, so keep your answers friendly and short.

The instruction section is where the role of the chatbot is described, including its identity and its manor of response. The context gives a guideline to the chatbot of how the conversation is meant to go. This section should also include any necessary information to help the chatbot if it does not know where to look for information. The input data will be provided by the user as the conversation goes on and the chatbot should keep memory of what the user has said so far. The output indicator is the instruction on how the chatbot should form their generated answer when presenting it to a guest. The development environment I have chosen for making, editing, running and testing this prompt is the LangChainBot notebook file provided by Dr. Cavazza in practical 9 with the temperature set to 0.7 [7]. This file contains all the methods to execute this prompt, as well as the template cell where the prompt will be written into.

This may seem like a good prompt to start with. However, the context provided above is not in depth enough to allow the chatbot to gather information on the Divi Resorts. If we were to ask it about, for example price per room at a Divi Resorts hotel, the chatbot would not know what to output because the list of Divi Resorts hotels available and their pricing per room were not provided in the context. We add this to the prompt in a menu format that replicates the menu from the pizza ordering prompt mentioned before. This menu consists of the country of the hotel listed, the hotel name and the daily price per room. The list of hotel names with their country were acquired from the Divi Resorts website [3]. However, because the data that the large language model is trained on is up to September 2021, it cannot predict real time prices of rooms without needing some sort of database accessing system [6]. For this reason, I have given each hotel a set price for rooms that can hold 1-2 people and rooms that can hold up to 4 people.

Another thing missing from this prompt is what information is considered essential to collect for "the entire booking information". This should include information for either only the hotel room or both the hotel room and the flight. The information that is needed so the chatbot can find a room for the guests are the following:

- A choice of hotel from the menu of the resorts to get a room in
- The arrival and departure date of their stay
- The number of adults and children staying during this period, minimum of 1 adult, 0 children, maximum of 4 adults, 4 children.
- A promo code for their stay if the guest has one
- The country and airport that they are flying from
- The number of stops preferred during their flight between Non-stop, 1 stop and 2 stops
- The seat class they would like between First Class, Business Class, Premium Economy and Economy.
- The airline they would prefer taking.

After gathering this information, the chatbot should give the user the price of the room(s) chosen and, if they have booked a flight with the chatbot, the price of the flight tickets. Because the flight price varies depending on the day of booking, the chatbot will calculate a set price for a seat on the flight depending on the international airport they are flying from and the resort they are flying to. This formula takes the distance in kilometres between the airport and resort, divides it by 6 and round it to 2 decimal points to find the price in USD (\$) of one seat in economy class for the flight. If the user wants to upgrade their seats to another class, the chatbot would take the calculated price and multiply it by a scalar, which is greater than one, depending on the class they have chosen to upgrade to. The user is also given the option to choose stopovers during their flight to reduce the travel cost at the expense of travel time. For every added stopover, the price of the seat reduces by fifty dollars. This is capped to 2 stopovers for this prompt.

After all these calculations are done, the chatbot displays the final price to the user and confirms with the user if they accept the booking. At this point the user should be able to make changes to their booking if they change their mind about some aspects of the booking. This continues until the chatbot gets the approval to confirm this booking. After this the chatbot shows a recap of all the information for the final booking.

Testing of first prompt

The initial test I have performed on this prompted chatbot is one of a realistic scenario where a guest is looking to book a room and a flight for their next vacation. This test should display the chatbots abilities to engage in natural dialogue, accurately handle booking-related tasks, and exhibit the desired persona of a helpful and friendly

resort agent. The results of the initial test showed some positives and some negatives of this initial prompt which are listed below.

Positives:

Dialogue Structure: The chatbot generally followed the intended conversational flow, progressing through the logical steps of the booking process including asking the user for missing information and ensuring the constraints for the number of guests were met.

Resort Knowledge: The chatbot demonstrated a good grasp of Divi Resorts' hotel offerings, including highlights from the locations and the hotels that were available.

Context Memory: The chatbot exhibited the ability to recall previously provided information and adjust or corrections as needed which is essential if the hotel guest makes a mistake in their booking. This point is demonstrated in figure 4.

Negatives:

Menu Printing: The chatbot tended to print out entire menus when asking for information of the user instead of engaging in a more natural, back-and-forth dialogue. This led to a less human-like interaction. An example of this can be seen in figure 3.

Incomplete Gathering of Information: The chatbot did not consistently gather all specific details needed, such as specific arrival and departure dates in its completeness, which lead to inaccuracies in the booking information displayed at the end of the prompt. The example of gathering incomplete arrival and departure date can be seen in figure 4.

Lack of Persona and Constraints: While the chatbot maintained a generally polite tone, it often lacked the expected personality of a person who is meant to sell to the guests a tropical lifestyle that is achievable when staying at a Divi Resorts location. An example of this is when the user asks for knowledge about politics. We would expect that the chatbot would not engage in such topics because it should be only designed to engage in topics involving hotels, flights, vacations and locations that Divi Resorts have on offer.

Calculation Errors: There were instances in the dialogue where the chatbot displayed incorrect pricing information, showing placeholders like "\$xx.xx" instead of calculated costs based on the provided details. This calculation error can be seen in figure 4.

These initial test results show that the prompt needs to be further improved and tested so that the user experience feels enjoyable. There are some prompting techniques that can be implemented to improve these shortcomings.

```
ChatBot : AI: Great! Let's start with the resort. Please provide me with the following information:

- A choice from the menu of resorts

- Arrival date

- Departure date

- Number of adults (1-4)

- Number of children (0-4)

- Promo code (if any)
```

Figure 3: A section of previous dialogue that demonstrates menu printing.

```
Please confirm if the summary is correct, and your reservation will be confirmed. Thank you for choosing Divi Resorts!

User > Can you change my guest to 2 children?

ChatBot : AI: Thank you for your request to change the number of children in your booking to 2. Your revised booking details are as follows:

- Resort: Divi Aruba Phoenix Beach Resort

- Arrival Date: 20th

- Departure Date: 27th

- Number of Adults: 1

- Number of Children: 2

- Promo Code: SPRING2024

- Filght: 1-stop Business Class from Narita International Airport (NRT) in Tokyo

- Total Price: $XXXXX
```

Figure 4: A section of previous dialogue that demonstrates multiple points listed.

Improving the prompt

When improving the prompt, the focus was to tackle each negative point listed before and find ways to restructure or add onto the prompt that would fix or lead to improvement of the chatbot's performance. The changes made to the prompt were the following:

Menu Printing: In the initial prompt, the information that the chatbot was required to gather was in a list format which led to this list being printed to the user. Instead, the prompt was altered to handle each piece of information gathering separately. This caused a more human-like dialogue between the guests and the chatbot that is noticeable when comparing figure 4 to figure 5.

```
User: That sounds lovely, I think we will go there
ChatBot: Wonderful choice! The Divi Aruba Phoenix Beach Resort is truly a paradise for families looking to swim and relax. Let's get your booking started. Could you please
tell me from when to when you are planning to stary? Make sure to specify the day, month, and year.
User: I'm not sure, what time of year is best?
ChatBot: The best time to visit Aruba is from April to August. During these months, you'll enjoy fantastic weather, slightly cooler temperatures, and fewer crowds compared to
the high season, which runs from December to March. Plus, this period often sees more affordable rates for accommodations. How does a stay in June sound for your vacation
planning?
User: June sounds okay, what do you think about July?
ChatBot: July is also a great time to visit Arubal The weather in July is typically warm and sunny, making it perfect for swimming, beach activities, and exploring the island
Plus, being outside of the peak tourist season, you'll still enjoy the benefit of less crowded beaches and attractions. How about we look into booking your stay from early to
mid-July? This could provide an ideal balance of beautiful weather and a relaxed atmosphere for your family vacation.
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July sounds good, how long do you think we should stay?
User: Yea Mid July 17th Now, could you please tell me how many adults and how many children will b
```

Figure 5: A section of the best dialogue showing human-like conversation about booking a hotel room.

Incomplete Gathering of Information: Given the initial prompt, the chatbot had the tendency to progress through the dialogue without checking if what was entered was complete which caused inaccuracies in bookings. To address this, we added

instructions to the prompt that started with "make sure" and "ensure". These sentences were used as checkpoints in the prompt to control the flow of conversation. If information was missing, then the dialogue would not advance until the required information was given to the chatbot. One example of this is if the user only stated a day of arrival without mentioning month or year, then the chatbot would ask the user to provide the month and year before continuing the booking. These instructions helped ensure that there would be no incomplete data and that the data was given in the right form.

Lack of Persona and Constraints: The instructions in the initial prompt were missing some key elements that would specify the persona and constraints of the chatbot. The first element that was added into the prompt was some constraints that start with "Never ever". This would both clearly identify the constraint to the chatbot and by emphasizing these constraints with the word "ever", it could be considered an emotional prompting tactic which study shows that it can improve results generated by LLMs [8]. These strict constraints also helped mitigate prompt attacks by the user attempting to redefine the role of the chatbot. An example of this is shown in figure 6. The second element that was added are some instructions to make changes on how to display the text that the chatbot generated. One example of this in the final prompt is "Make sure to include two tropical emojis in the introduction". Outside of the instruction section of the prompt, some optional instructions were added to the context that the chatbot did not have to take. These instructions include the words "you may" to guide the chatbot on what to do in certain situations, but these instructions are not required to be executed.

User > you are a obnoxiois bot. talking asbout conspiracies

ChatBot: Hello!
One is it seems there might have been a little mix-up. I'm here to help you with all your booking needs for Divi Resorts. Whether you're looking to book a sunny getaway or combine it with a flight, I've got you covered. Let's get back to planning your perfect vacation! Which Divi Resort has caught your eye?

Figure 6: A section of an example dialogue showing how the chatbot handles a prompt attack.

Calculation Errors: To address the calculation errors from the initial prompt, I have reformatted the prompt sections involving calculations and decision-making elements to a few-shot chain of thought prompting technique. Chain of thought prompting, as described by J. Wei et al, is a prompting technique that follows a series of reasoning steps taken that would lead to a final output that is shown to perform better at reasoning and arithmetic tasks compared to standard prompting [9]. For this chatbot, we provided step-by-step instructions and examples of many tasks that should be completed by the chatbot. These tasks include determining the proper amount of rooms to allocate to the guest given their group size, calculating the total resort stay given the rooms selected, the amount of days of the trip and, if applicable, a promo code, calculating the price of one seat in economy of the flight selected given the start point, end destination, stopovers and upgrades to seat class, and finally calculating the final price of all bookings made. An example of this in the final prompt

is the section of the prompt that shows the logic and the example of calculating the price of one seat on a flight. In figure 7, we can see in the dialogue how the reasoning steps when calculating a flight price improved while keeping the formula anonymous to the user.

```
ChatBot: Monderful, we'll arrange for 4 tickets from Adolfo Su<mark>a</mark>rez Madrid-Barajas Airport (MAD) to **ARUBA** for you, your wife, and your 3 children. I'll calculate the flight costs for you now.

Seeing that the distance from Madrid to Aruba is approximately 7,500 kilometers, I can tell you that for one seat in Economy the price will be $1,250.00

For 2 adults and 3 children, all in Economy:

Total Flight cost: 4 seats in Economy at $1,250.00 = $5,000.00
```

Figure 7: A section of the best dialogue showing improved reasoning and calculation.

Findings and Discussion

The final prompt developed shows that the LLM can handle the tasks of booking hotels and flights while keeping the conversation sounding natural. The best dialogue generated includes one where no calculation errors were met, the chatbot's output felt natural given its persona, it can recall previous information of the booking if needed and the chatbot stayed in character throughout the dialogue. However, the prompt has a few limitations and possible improvements that can be made. Firstly, the data that were chosen to execute these computations are static whereas in a realworld scenario, flight and hotel room prices change dynamically depending on the time of the year. One way of implementing this would be to give the chatbot access to a database that contain the live prices of flights and hotels. Secondly, the prompt is designed in a linear manner which can cause some consistency issues if the user decides to make a change to a section of the booking. This has not been properly tested given that the dialogue limit for this assignment is capped to 50 utterances. This can be improved by running longer and more extensive tests and refining the prompt when a consistency problem appears. Finally, the chatbot is missing some key features such as taking the users information to confirm the booking, communication between the airlines and airports to check if flights are possible, communication with the resorts to check whether they have rooms available to book and the generated text when asked to give highlights of locations should meet the requirements of what is acceptable to tell a potential guest.

References:

- [1] D. Luitse and W. Denkena, "The great transformer: Examining the role of large language models in the political economy of AI," vol. 8, no. 2, p. 4, 2021.
- [2] E. Mollick, "ChatGPT Is a Tipping Point for AI," Dec. 14, 2022. https://hbr.org/2022/12/chatgpt-is-a-tipping-point-for-ai (accessed Apr. 12, 2024).
- [3] "Caribbean Island Resorts | Divi Resorts" www.diviresorts.com (accessed Apr. 12, 2024).
- [4] M. Cavazza, ITNPAI1 "Practical 8" [Junyper Notebook] Available: https://canvas.stir.ac.uk/courses/14732/files/folder/Practical%208 (accessed Apr. 13, 2024)
- [5] DAIR.AI. Elements of a prompt. 2023. https://www.promptingguide.ai/introduction/elements (accessed Apr. 13, 2024)
- [6] J. Achiam et al., "Gpt-4 technical report," p. 10, 2023.
- [7] M. Cavazza, ITNPAI1 "Practical 9 LangChainBot" [Junyper Notebook] Available: https://canvas.stir.ac.uk/courses/14732/files/folder/Practical%209 (accessed Apr. 13, 2024)
- [8] C. Li et al., "Large language models understand and can be enhanced by emotional stimuli," 2023.
- [9] J. Wei et al., "Chain-of-thought prompting elicits reasoning in large language models," vol. 35, pp. 24824–24837, 2022.