

TFG del Grado en Ingeniería Informática

Development of a Chatbot for Tourist Recommendations Technical Documentation



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#### Appendix A

## Software Project Plan

#### A.1 Introduction

In following annex, the organizational aspects of the chatbot development will be examined. More precisely, the software development process is described as well as the tools that were used to manage the process, followed by a detailed examination of the course of the project. The second part of the annex examines the project's viability, including the calculation of involved costs and profit possibilities.

#### A.2 Project Management

#### Scrum

The project's management is inspired by Scrum [5], an agile software development framework which facilitates managing tasks in teams. The Scrum framework is based on the experience that most projects are too complex to be planned completely in the early stages and therefore provides an agile and iterative alternative by structuring the project in smaller iterations.

However, the applied process during this project is only loosely based on the Scrum framework since there are several concepts of the original framework that were not applied. Scrum defines roles which describes the different members of a group (Scrum Master, Project Owner and Development Team) as well as several artefacts organizing the team's interaction. Due to the nature of the project not having a development team in the proper meaning of the word, but only a single person realizing the bachelor thesis, only some artefacts were applied. The most important applied concept is the Sprint, a two-week time slot which is used to structure the project. At the beginning of each sprint, a Sprint Planning is realized between the author and the coordi-

nator of project. The project's coordinator can be seen as a Product Owner in the Scrum framework, prioritizing tasks and guiding the project's direction. In the Sprint Planning, it is decided which tasks are going to be worked at during the two-week sprint. At the end of each sprint, a *Sprint Review* takes place where the development team, meaning the student, presents its results to the Product Owner.

#### Managing the project in GitHub

In order to facilitate the project's management, the online project hosting tool GitHub with ZenHub as an extension was used. ZenHub provides several useful collaboration features such as a board to visualize tasks as well as an overview of the remaining workload and velocity. The tasks are defined in GitHub's Issues where tasks can be named, described and estimated. Story Points are used to estimate the workload of each issue. In this project, one story point is seen as the equivalent of 2 - 3 hours of work. The iterations are planned and defined using Milestones which the different issues are assigned to.

#### A.3 Time Planning

The Kick-Off Meeting took place at 5th December 2016, where the elemental concepts of the project were discussed. Due to the fact that this project was held in the course of the semester parallel to usual classes and exam periods, there were some time breaks between the two week sprints in which the development on the project paused. The project consists of 11 iterations, the last one ending a day before the submission date of the thesis, the 2th July, 2017.

The following section gives an overview of the iterations during this project, finally using Burn-Down-Charts and velocity tracking to visualize the project's progress.

#### Iteration 1 (30/12/2016-17/01/2017): Planning and Research

The first iteration mainly centered on setting up the project's infrastructure, including the establishment of the repository structure and the virtual machine setup. First research steps were taken by getting familiar with the used geo-information system.

#### Iteration 2 (17/01/2017 - 07/02/2017): Further Research

In this iteration, the knowledge of the used geo-information system was deepened by investigating how to extract essential tourist information from the database. On the other hand, a chatbot library was chosen after comparing different possible candidates. Besides, the project's documentation will be extended by describing theoretical concepts, used tools and the project's objectives.

# Iteration 3 (07/02/2017 - 21/02/2017): Recommender System and Design

In this iteration, recommender system libraries were examined to find out which one was the most suitable for this project. Afterwards, the system's basic architecture was designed. On top of that, the project's documentation was extended.

#### Iteration 4 (21/02/2017 - 07/03/2017): Mockups

First mockups were implemented in which the design of certain components of the application were tested. At first, the interaction of the application's chatbot layer with its environment was set up, using the Telegram Bot API and the API.AI HTTP API.

The recommender component was examined in more depth, meaning that a recommender library was finally chosen and then used to mock up a POI recommender mechanism.

# Iteration 5 (10/03/2017 - 24/03/2017): Recommender System Mockup

This iteration centered on the design and first implementation of the application's recommender system. The library Apache Mahout is used to implement a content-based filtering recommendation mechanism. The iteration includes the design of user and item profiles as well as the investigation of how to retrieve the data from OpenStreetMap into the recommender system.

# Iteration 6 (03/04/2017 - 17/04/2017): Collaborative Filtering & Requirements

In this iteration, the collaborative filtering recommender was designed. Additionally, the project's requirements were examined as well as the user-chatbot interaction.

# Iteration 7(18/04/2017 - 02/05/2017) Conversational Interface Design

In this iteration, the chatbot's conversational interface was designed by modeling a conversation flow graph. The resulting knowledge was explained in the Theoretical Concepts chapter of the documentation. On the other hand, user ratings were generated for the collaborative filtering algorithm.

# Iteration 8 (04/05/2017 - 18/05/2017) Conversation Flow Implementation

The previously specified conversation flow was modeled in API.AI and the application's chatbot layer was implemented to handle the conversation. On the other hand, the recommender component was finished and documented.

# Iteration 9 (18/05/2017 - 01/06/2017) Conversation Flow Refinement and Testing

The conversation flow was refined to improve the conversation between user and chatbot. The rating mechanism was implemented. Some performance tests for the recommendation mechanism were implemented and the software was evaluated using metrical code analysis tools.

#### Iteration 10 (03/06/2017 - 17/06/2017) Latex Setup

This iteration dealt with setting up the latex file for the project's documentation. Previously prepared drafts were modified and completed. Several chapters and parts of the annex were introduced into the latex document and the bibliography was formalized.

# Iteration 11 (18/06/2017 - 02/07/2017) Documentation and Final Conversation Flow Adjustments

This iteration concentrated on completing the project's documentation, especially outlining the project's relevant aspects and come to final conclusions. The application's implementation was only adjusted in refining the conversation flow and small refactorings in order to improve the code quality.

#### Burn-Down Chart and Velocity Tracking

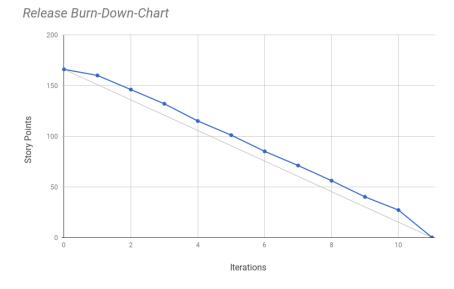


Figure A.1: Release Burn-Down-Chart

The Burn-Down-Chart shows the progression of story points in the development process. The ideal progression is represented in the grey straight line. As we can see, the actual story point progression does not differ largely from the shown ideal line, as the work load was divided equally to the different iterations.

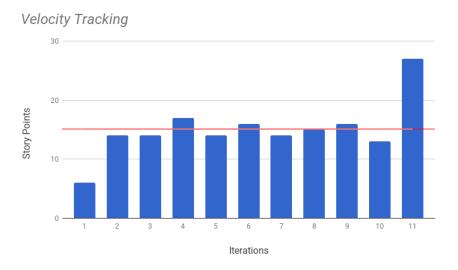


Figure A.2: Velocity Tracking

The workload divided to the different iterations is shown in detail in the velocity tracking diagram. The average work load per iteration is measured with 15 story points, which can be seen in the red trend line. Most iterations do not differ largely from this average measure, except for the first and the last iteration. This observation can be explained as in the first iteration, research was done and a first overview of all the different aspects of the project was made. After this iteration, the necessary tasks to be done became clearer and a first task overview was created.

In contrast, the last iteration is outstandingly bigger than the previous ones. This can be explained by the fact that the student had terminated all of the exams and semester's course work at that time and could completely focus on the preparation of the project.

#### A.4 Viability Study

In this section of the documentation, a viability study is made. It is examined whether the project is economically feasible, comparing the involved costs and potential sources of income. Additionally, the legal viability is checked to ensure that a realization of the application can be done without legal risks.

#### **Economic Viability**

#### Personnel Costs

The application's development was realized by the author of the presented bachelor thesis. As the author is a student of computer sciences without completed university degree, the hourly wage is estimated at  $14 \in /h$ . In order to calculate the total development costs, the time invested in the project is examined. As the realization of the bachelor thesis is evaluated with 12 ECTS points and a workload of 30 hours per ECTS point is assumed, a total amount of 360 hours were dedicated to the project's development. This also coincides with the results of the velocity tracking, where a total number 166 story points was estimated to finish the project, one story point being roughly equivalent to 2-3 hours of working.

All in all, this leads to the following cost calculation:

$$360h * 14\frac{\epsilon}{h} = 5040 \epsilon$$

As the developer is a German citizen, German tax law is applied in the following scenario: Assuming that the produced application is developed in a freelance project on behalf of a customer, the developer only charges the hourly fee. There are no additional social security or tax costs for the customer as freelancers are liable to pay income taxes themselves. However, the charged fees are below the tax allowance for unmarried persons in 2017, which is 8820

€. Therefore no income taxes have to be paid, assuming that the student does not have any other freelance income in the respective year.

#### **Software Costs**

In the following, the costs of the services used in the project are examined.

Software	Costs	Comments
OpenStreetMap	0,00 €	-
API.AI	0,00 €	According to the API.AI terms of use, "services include basic services ("Basic Services") provided free of charge and enhanced services ("Enhanced Services"), which, if available, must be purchased." [1] However, at the time of development, no fees or potential upgrades were evident.
Foursquare	0,00 €	According to Foursquare's developer documentation [3], "the Foursquare API has a default limit of 1000 free requests per 24 hour period" and "500 requests/hour", "whichever occurs first". An enterprise option must be booked if more requests are needed.
Telegram	0,00 €	-
Apache Mahout	0,00 €	-
Apache Maven	0,00 €	-
Java Spark	0,00 €	-
Heroku	0,00 €	A "Free Plan" was used to host the application in Heroku. There are several pricing options, adjusted to the developer's needs. The free plan comes with certain inconveniences, such as "sleep after 30 minutes of inactivity". [4]

Table A.1: Software Costs

As we can see, no software costs were charged in the way the third-party products are used in this project. However, there could be additional costs with an increasing number of users accessing the chatbot, as some services that are used apply a pricing model that is based on the number of user requests.

#### **Hardware Costs**

Two different hardware devices were used during the project duration. For the software's development, a laptop was used, in particular an Asus Zenbook, bought in 2015 for  $899 \in$ . In order to use the application and check the functionality in the productive environment, a mobile device is used, more precisely the Motorola Moto G4 Plus, bought in 2017 for  $199 \in$ . Due to the fact that the mentioned devices were not exclusively purchased for this project, their costs can be amortized as seen in the following calculation. A total amortization period of 3 years for the hardware is assumed:

Total Hardware Cost =  $899 \in +199 \in =1098 \in$ 

Amortization period in hours = 3years \* 8760h/year = 26280h

Development period in hours = 360h

Hardware Cost per hour = 1098€/26280h = 0,04€/h

Hardware Costs during development = 0.04€/h \* 360h = 14,40€

So all in all, total hardware costs of  $14,40 \in \text{can be assumed}$ .

#### Total Costs

The previously calculated partial costs result are summarized in the following table:

Component	Costs
Personnel Costs	5040,00 €
Software Costs	0,00 €
Hardware Costs	14,40 €
Total Costs	5054,40 €

Table A.2: Total Costs

It must be noted that occurring office costs were not included in the calculation as it is assumed that the developer has worked in a home office which can be set off against tax liability.

#### **Income Analysis**

The following section provides an understanding of possible ways to make profit from the developed application.

Due to the fact that the chatbot is publicly accessible in an instantmessenger, it is not very common to profit from the user directly, as there are no easy-to-use payment mechanisms integrated in the messenger.

A more interesting concept is to win tourist agencies, cultural institutions or restaurant owners as investors. The chatbot can be seen as an advertisement platform for those who want to promote their offers to tourists which in fact are a very promising target group as people tend to spend a lot of money on vacation.

Essentially, the idea is to present points of interest that belong to a customer in a more prominent, attractive way to the user. This could happen, for example, when a user asks for a recommendation and is situated in close proximity to a promoted point of interest. The presentation of the promoted point of interest could differ from the usual, non-promoted locations, in a way that more precise descriptions or more photos of the location are provided than usual. Additionally, the points of interests could be highlighted visually, for example by applying different font sizes or colors for the messages.

In return for this service, a monthly payment of the local investors would be conceivable. This way of promoting points of interests is quite interesting for the local tourist industry as the chatbot collects user interests for the recommendation, therefore, the marketers are provided with a direct way to target exactly the user group they are interested in.

However, it must be noted that the commercial use of the application leads to a possible upgrade of pricing plans, for instance using the Foursquare API.

#### Legal Viability

The following legal viability concentrates on the third-party software licenses used in the project and in turn, an analysis of which license can be applied for the developed application. The table A.3 contains an overview of the used services and their licenses.

As some of the used third-party software is nonsublicenseable, for instance API.AI, it is not possible to apply a permissive free software license such as Apache License 2.0 or GNU General Public License v2.0 to the application. However, if the designed application aims to make profit, publishing the application under a free software license is not an option anyway. Therefore suitable terms of service need to be designed in order to publish the application.

Software	License	Comments
OpenStreetMap	Open Database License (ODbL) 1.0	According to the ODbL license, the rights to use the OpenStreetMap data "explicitly include explicitly include commercial use, and do not exclude any field of endeavour." [2]
API.AI	API.AI End User License Agreement	According to API.AI's license agreement, the "use of the Services within the commercial enterprise for internal purposes is expressly allowed." [1]
Foursquare	Foursquare Labs, INC. API and Data License Agreement	For commercial use, an enterprise license is needed. The fees that are charged are not publicly available and are communicated directly by contacting Foursquare.
Telegram	GNU General Public License v2.0	According to Telegram, the commercial use of the Telegram API is permitted for anyone except for "large corporations, publicly traded companies and other businesses that exist to maximize shareholder value or sell stock." [6]
Heroku	Heroku License Agreement	-
Apache Mahout	Apache License, Version 2.0.	Permissive free software li- cense that allows, among other things, sublicensing, commercial use, modifying and distributing of the soft- ware.
Apache Maven	Apache License, Version 2.0.	See above
Java Spark	Apache License, Version 2.0.	See above

Table A.3: Software Licenses

#### Appendix B

# Software Requirement Specification

#### **B.1** Introduction

The following chapter provides a specification of the software's overall requirements. Showing its functions, limitations and user interaction, the catalogue can be considered as a contract between clients and developers. Aside from giving textual descriptions, use case diagrams help to clarify the requirements and interactions in more detail.

#### **B.2** General Objectives

The following steps and objectives are related to the software's requirements:

- Design of a conversational interface: the conversation flow between user and chatbot is mapped to the natural language processing platform api.ai which then parses the user input into formalized data. The parsed input is interpreted by the chatbot and triggers the desired behaviour, such as recommendation or storage of important user information.
- A recommender system must be implemented to provide personalized tourist recommendations. The recommender is based on data the user has shared with the chatbot and additional data of similar users. To overcome the problem of initially sparse user data, different recommendation methods are combined as well as retrieving existing user data from other sources and/or generating data.

• Extracting tourist data from a spatial information database based on OpenStreetMap: the data is filtered so that only data of touristic importance is evaluated by the recommender and presented to the user.

#### B.3 Software Requirement Catalogue

This section outlines the software requirements. At first, the participating actors are introduced. Then, the requirements are examined, dividing them into functional and non-functional requirements.

#### Participating actors

This software has only one main actor, the user. Using the Telegram messenger, users interact with the chatbot. There are no different user roles, so each user has the same range of features to use.

#### **Functional Requirements**

This section describes the software's full range of features:

- Using the Telegram interface, messages to the chatbot can be introduced which are answered accordingly.
- Using the Telegram interface, a location can be introduced which is used as the basis for the chatbot recommendations.
- The proximity of the recommendations can be specified by the user. If no radius is entered, the default value of 1 km is used as a distance between the user location and examined point of interests.
- The chatbot provides a recommended point of interest within the chosen proximity. The recommendation result contains the name, location, point of interest category as well as an additional picture retrieved from Foursquare (if available).
- Recommended points of interests are rated by the users. The rating is saved and used as a basis for future recommendations.
- The user can access the information the chatbot has collected about him, such as already recommended points of interests or saved interests.
- To refine recommendations, user chat messages are evaluated using natural language processing and saved in the user profile.

#### Non-functional Requirements

This section describes the so-called non-functional requirements which contain technical as well as operational requirements.

- To use the chatbot, the Telegram messenger app has to be installed on a smart device (smartphones or tablets). Although Telegram is also available as a desktop application, these versions do not support sending locations and are therefore not suitable.
- The device must be connected to the internet to use the chatbot.
- The device must be capable of receiving GPS information to calculate its current location.
- The conversational interface should be intuitive, so the user is able to communicate with the chatbot without previously reading an exhaustive tutorial. To facilitate user decisions, mutually exclusive keyboard buttons are used.
- The chatbot should be able to handle user requests adequately. Questions and demands concerning travelling are understood and answered satisfyingly. Other requests are rejected politely.

#### Limitations

There are multiple limitations present due to the fact that the software can be still considered as a prototype. In a future enhancement, most of these limitations should be remedied.

- The used OpenStreetMap data was downloaded once and then used offline. To keep the data up-to-date, an automatic update mechanism should be set up.
- Due to performance reasons and sparse user rating data, the prototype only gives recommendations for the city of *Barcelona*, Spain. In a future enhancement, a bigger OSM region should be covered.

#### **B.4** Requirement Specification

Use Case Diagrams

General Use Case Diagram

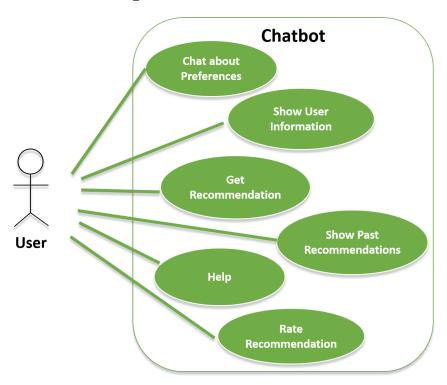


Figure B.1: General Use Cases

The shown use case diagram contains the six main interactions the user performs using the chatbot. The use case "Help" is used to show the user the main features of the chatbot. In "Chat about Preferences" the chatbot collects information about the user by chatting with him. This data is used to complete the user profile for recommendations. On the other hand, "Rate Recommendation" shows how the user rates previously recommended points of interests.

The use cases "Show Past Recommendations" and "Show User Information" both aim to provide the user an understanding of the data the chatbot has already collected of the user.

The use case "Get Recommendation" represents the interactions between user and chatbot that lead to the delivery of user adapted recommendations. Because of its complexity, this use case is shown in more detail in the following section.

# Chatbot Set Recommendation Radius Get Recommendation Rate First Impression

#### Use Case Diagram - "Get Recommendation"

Figure B.2: Use Case - "Get Recommendation"

This use case shows the involved components in providing the user with recommendations. In order to get recommendations, the user is able to specify a recommendation radius to set the maximal distance between himself and the point of interest. This step is optional. After showing the user the recommended point of interest, he is asked to give a first impression of the point of interest in order to refine future recommendations.

#### Use Case Templates

The previously defined use cases are explained in the following templates, showing the circumstances in which a use case is handled. Additionally to the given description, the flow of events will be shown in detail in the Design Specification, illustrated by sequence diagrams.

Use Case ID	UC-01		
Use Case Name	Chat About Preferences		
Description	The user chats with the chatbot about his		
Description	preferences.		
	User conn	ects to the chatbot for the first time	
Trigger	or shows	proactively the intention to chat	
	about his	preferences.	
	The chath	oot is in a state in which the user	
Precondition	is allowed	to type messages independently,	
Precondition	meaning t	hat the user does not conduct an-	
	other pred	lefined conversation.	
	Step	Action	
		Chatbot: "So, tell me, what are you	
	1	interested in when you visit a new	
		place?"	
Flow of Events	2	User answers and interest is filtered	
Flow of Events		The interest is saved and the user is	
	3	told to repeat the process whenever	
		he likes.	
Alternate Flow	Step	Action	
Alternate Flow	3a	User response is not understood, so	
		the user is asked to rephrase his an-	
		swer.	
	The chatb	oot is in a state in which the user is	
	allowed to	type messages independently.	
Postcondition			
	The user profile is updated with user inter-		
	ests.		
Exceptions	Step	Action	
LACEPHOLIS	2	User answers "No", so the use case	
		is aborted.	
Frequency of Use	Medium		
Importance	High		

Table B.1: UC-01 - Chat About Preferences

Use Case ID	UC-02		
Use Case Name	Get Recommendation		
	The user asks for a recommended point of		
<b>D</b>	interest. Based on the user information, the		
Description	recommender returns points of interests close		
	to the user.		
		types in a message that is inter-	
Trigger		a "recommendation" intent by the	
1118801	language processing platform.		
		oot is in a state in which the user	
		to type messages independently,	
Precondition		hat the user does not conduct an-	
		lefined conversation.	
	Step	Action	
	Біер	Chatbot asks for the user's current	
	1	location.	
	2	User enters his location	
	3		
	3	Chatbot presents user a recom-	
	4	mended point of interest.	
El f E t	4	Use Case $\rightarrow$ Rate First Impression	
Flow of Events	-	(see B.5)	
	5	Chatbot: "Do you want to see an-	
		other recommendation?"	
	6	User enters No.	
	Step	Action	
	1a	User starts recommendation pro-	
A1. T21		cess by entering its current location	
Alternate Flow		which is followed by step 3.	
	6a	User enters Yes, so steps 3-5 are re-	
	(F)	peated.	
		ot is in a state in which the user is	
	allowed to type messages independently.		
Postcondition			
	Recommended points of interests the user		
liked are saved and marked as unrated.			
Exceptions	Step	Action	
	3	Chatbot does not find any (more)	
		points of interests for the user and	
	cancels recommendation process.		
Frequency of Use	High		
Importance	High		

Table B.2: UC-02 - Get Recommendation

Use Case ID	UC-03			
Use Case Name	Rate Recommendation			
Decemention	The user rates a points of interest that was			
Description	previously	previously recommended to him.		
	The user	greets the chatbot or wants to see		
Trigger	past recor	nmendations and has unrated rec-		
	ommendations.			
Precondition	The user v	was given a recommendation before		
Precondition	that he ha	as not rated yet.		
	Step	Action		
		Chatbot asks how the user liked the		
	1	first unrated recommended point of		
		interest.		
	2	User chooses from mutually exclu-		
Flow of Events		sive rating buttons (e.g. 1 stars to 5		
r low of Events		stars rating)		
	3	Chatbot: "Thanks for the rating!"		
	Step	Action		
Alternate Flow	-	-		
	The chatb	ot is in a state in which the user is		
	allowed to	type messages independently.		
Postcondition				
	The maxing	nal radius for that user is saved and		
	used for the	he next recommendations.		
Exceptions	Step	Action		
Exceptions	2	The user states he does not want to		
		rate the point of interest, so the use		
		case is aborted.		
Frequency of Use	Medium			
Importance	High			

Table B.3: UC-03 - Rate Recommendation

Use Case ID	UC-04			
Use Case Name	Specify Recommendation Radius			
Description	The user sets the radius in which he wants the			
Description recommended points		ded points of interests to be in.		
	User enter	rs messages which is identified as a		
Trigger	distance in	distance intent by the natural language pro-		
Trigger	cessing platform (e.g. "I don't want to walk			
	that far",	"Let me set the distance")		
	The chath	oot is in a state in which the user		
Precondition	is allowed	to type messages independently,		
1 recondition	meaning t	that the user does not conduct an-		
	other prec	lefined conversation.		
	Step	Action		
		Chatbot asks the user about his pre-		
	1	ferred maximal recommendation ra-		
		dius.		
	2	User answers with a positive nu-		
Flow of Events		meric value.		
	3	Chatbot repeats: "Fine, I set the		
		maximal radius to (repeat value)".		
	Step	Action		
Alternate Flow	-	-		
		oot is in a state in which the user is		
	allowed to	type messages independently.		
Postcondition				
	The rating is saved in the ratings file and the			
	corresponding recommendation is marked as			
	rated.			
Exceptions	Step	Action		
	1	User doesn't answer with a positive		
		numeric value, so the chatbot asks		
		again or aborts the use case.		
Frequency of Use	Low			
Importance	Medium			

Table B.4: UC-04 - Specify Recommendation Radius

Use Case ID	UC-05		
Use Case Name	Rate First	Rate First Impression	
	When the user is given a recommended point		
Description	of interest	, he is immediately asked of his first	
	impression	impression to refine future recommendations.	
Trigger	-		
Precondition	The user has just received a recommended		
1 recondition	point of interest (see B.2)		
	Step	Action	
		Chatbot asks the user about his	
	1	first impression of the recommended	
		point of interest.	
Flow of Events		User chooses from mutually exclu-	
	3	sive buttons (e.g. "Sounds good!"	
		or "Don't like it").	
	Step	Action	
Alternate Flow	-	-	
	The chatbot is in a state in which the user is allowed to type messages independently.		
Postcondition			
	The rating is saved in the ratings file and the corresponding recommendation is marked as		
	rated.		
Exceptions	Step	Action	
	1	User does not answer accordingly, so	
		the point of interest is discarded and	
		no rating is saved.	
Frequency of Use	High		
Importance	Medium		

Table B.5: UC-05 - Rate First Impression

Use Case ID	UC-06		
Use Case Name	Show Past Recommendations		
	The chatbot provides the user with informa-		
Description	tion about the points of interests that were		
	recommended to him previously.		
	The user types in a message that is inter-		
Trigger	preted as a "past recommendations" intent		
	by the language processing platform.		
	The chatbot is in a state in which the user		
Precondition	is allowed to type messages independently,		
	meaning that the user does not conduct an-		
	other predefined conversation.		
	Step	Action	
Flow of Events		The chatbot lists the past recom-	
Flow of Evelles	1	mendations the user was interested	
		in.	
Alternate Flow	Step	Action	
Aiternate Flow	2	When there are unrated items left,	
		the user is asked to rate a previously	
		recommended point of interest (see	
		B.3)	
Postcondition	The chatbot is in a state in which the user is		
1 OSTCOHUITIOH	allowed to type messages independently.		
Exceptions	Step	Action	
Exceptions	1	There are no past recommendations	
		so far, so the user is told to ask for	
		a recommendation first in order to	
		use this feature.	
Frequency of Use	Medium		
Importance	Medium		

Table B.6: UC-06 - Show Past Recommendations

Use Case ID	UC-07		
Use Case Name	Help		
Description	The user asks for help and gets an overview		
	of the chatbot features.		
	The user types in a message that is inter-		
Trigger	preted as a "help" intent by the language		
	processing platform.		
Precondition	The chatbot is in a state in which the user		
	is allowed to type messages independently,		
	meaning that the user does not conduct an-		
	other predefined conversation.		
Flow of Events	Step	Action	
	1	The chatbot gives an overview of the	
		chatbot features (rating, chatting,	
		recommendations).	
Alternate Flow	Step	Action	
	-	-	
Postcondition	The chatbot is in a state in which the user is		
	allowed to type messages independently.		
Exceptions	Step	Action	
	-	-	
Frequency of Use	Low		
Importance	Low		

Table B.7: UC-07 - Help

Use Case ID	UC-08		
Use Case Name	Show User Information		
Description	The user is provided with the personal infor-		
Description	mation the chatbot has collected so far.		
	The user types in a message that is inter-		
Trigger	preted as a "show user information" intent		
	by the language processing platform.		
Precondition	The chatbot is in a state in which the user		
	is allowed to type messages independently,		
	meaning that the user does not conduct an-		
	other predefined conversation.		
	Step	Action	
Flow of Events		The chatbot shows the user his	
riow of Events	1	stored interests and the current	
		specified recommendation radius.	
Alternate Flow	Step	Action	
	-	-	
Postcondition	The chatbot is in a state in which the user is		
	allowed to type messages independently.		
Exceptions	Step	Action	
	-	-	
Frequency of Use	Low		
Importance	Low		

Table B.8: UC-07 - Show User Information

### Appendix ${\cal C}$

# Especificación de diseño

- C.1 Introducción
- C.2 Diseño de datos
- C.3 Diseño procedimental
- C.4 Diseño arquitectónico

#### Appendix D

# Technical Programming Documentation

#### D.1 Introduction

This section contains the technical programming documentation, describing the directory structure of the presented CD, an installation guide as well as a documentation of the realized tests to measure the code quality.

#### D.2 Directory Structure

This report is handed in along with a CD containing the essential data to examine the application in more depth. The presented CD contains the following directories:

**Documentation** Contains the project's documentation, saved as both .pdf and .doc format.

**Software** Contains the executables of the tools needed to run the virtual machine.

**Application** Contains all essential data of the developed software, subdivided in the following directories:

Virtual Machine The virtual machine image containing the infrastructure that was set up in the course of the project

Source Code The source code of the application

**Javadoc** The source code's documentation in Javadoc format.

Agent Contains the exported api.ai agent as .zip

Data Contains the raw geographic data and dumps of the initial database

#### D.3Developer Manual

This section serves as an installation guide describing which steps to take to set up the application.

#### Database Setup

The geographic database is used by the chatbot application to retrieve and manage geographical data. In this project, the database runs on a Virtual Machine using Ubuntu 16.0.4 LTS. Therefore, Ubuntu's terminal is used to install most of the software. In order to make sure Ubuntu has access to the current package index, it is advised to execute an update command before installing the software:

```
sudo apt-get update
```

#### Set up PostgreSQL and PostGis

The first step is to install the data management system, PostgreSQL. To install the version used in this project, the following command is used:

```
sudo apt-get install -y postgresql=9.5+173
   postgresql-contrib=9.5+173
```

Then, the database "touristdb" is created as well as the managing user, which is called "touristuser". The createuser command will prompt for a password which can be chosen by the developers.

```
sudo -u postgres createuser -P touristuser
sudo -u postgres createdb -owner touristuser touristDB
```

Now we have set up the database, the PostGIS extension is installed and added to prepare the database for geospatial data.

```
sudo apt-get install -y postgis
   postgresql-9.5-postgis-2.2
sudo -u postgres psql -c "CREATE_EXTENSION_postgis; _
  CREATE_EXTENSION_postgis_topology; "touristDB
```

The next step is optional, but seems convenient if the developers want to manage their database with the help of a user interface. The managing tool pgadmin facilates running and editing SQL queries and viewing the stored data.

sudo apt-get install pgadmin3

To access the database in pgadmin3, a connection to the server must be added, which can be realized by clicking the plug button in the upper toolbar and then entering the following values.

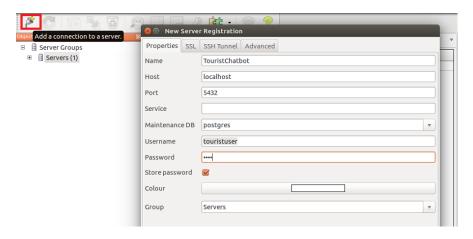


Figure D.1: pgadmin3: A server connection is added

In the object browser, the database schemas can be viewed accessing TouristChatbot -; databases -; touristDB.

#### Import Data into Database

Now that we have set up the database, it needs to be filled with geospatial data. In this project, the recommendations are based on test data of Barcelona. The required data is downloaded as a .pbf file from the website https://download.bbbike.org/osm/bbbike/Barcelona/. After that, the tool Osmosis is used to import the OSM data which can be installed using the following command:

sudo apt-get install osmosis

The next commands prepares the database for the osmosis import. It sets the hstore extension and the pgsnapshot database schema which causes that all relevant tag data are stored in a hstore column.

```
sudo -u postgres psql -c "CREATE_EXTENSION_hstore;"
   touristDB
psql -U touristuser -d touristDB -f
   /usr/share/doc/osmosis/examples/pgsnapshot_schema_0.6.sql
```

After that, the import itself is realized. Remember to execute this command in the folder where the downloaded .pbf file is situated and to add the corresponding password (which is set by the developer in the previous step of this manual).

```
osmosis --read-pbf file="Barcelona.osm.pbf"
   --write-pgsql host="localhost" database="touristDB"
   user="touristuser" password=password
```

In order to see if the import was successful, pgadmin3 can be used to take a look at the now imported data. Again, this step is optional. In the object browser on the left hand side of the user interface, the database tables can be viewed accessing  $TouristChatbot \rightarrow databases \rightarrow touristDB \rightarrow Schemas \rightarrow$  $public \rightarrow Tables.$ 

#### **Store User Information**

In order to store information of the users or of the ratings they made, the existing users table must be modified. To do so, the following POSTGRESQL queries are executed so that new columns are added to our table. These modifcations can either be made using the psql command via bash or pgamin3's query tool.

```
alter table users add column recommendations bigint[];
alter table users add column unrated bigint[];
alter table users add column radius integer;
alter table users add column name;
```

The ratings are stored in a newly created table:

```
create table ratings (
userId bigint,
pointId bigint,
ratings integer,
PRIMARY KEY(userId, pointId))
```

#### Access to External Services

In the following, it is described how to set up and access the external services used in this project: To access the conversational interface, the messenger Telegram as well as our natural language parsing platform api.ai are used. Additionally, the FourSquare API is used to retrieve images for recommended Points of Interests.

#### Telegram Bot

The messenger Telegram is used to provide an interface to our tourist bot. After installing Telegram on a mobile device and setting up an account, the bot can be created using Telegram's BotFather. The Botfather can be accessed using the messenger's search function. After that, the creation of the bot is triggered by entering /newbot in the input field.

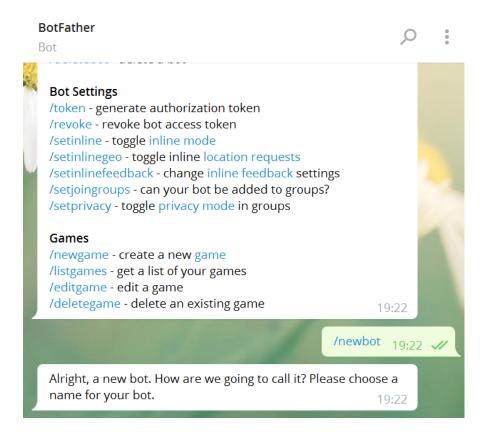


Figure D.2: The *Botfather* is used to create the Telegram Bot

After choosing a name and a username, the BotFather provides you with the authorization token for your bot. This authorization token is needed to access the Telegram bot from our web service. To do so, the token is saved as an environment variable (see System Environment Variables). After saving the token, the web service is able to receive updates from and send messages to the Telegram bot via a webhook.

#### api.ai agent

In order to use the NLU platform api.ai, we need to set up an account. After doing so, the api.ai agent modeling interface can be accessed. First, we need to create a new agent and enter an agent name.



Figure D.3: api.ai agent creation interface

If the creation is successful, the entered agent name will appear on the left sidebar. In order to access the agent from our web service, api.ai's HTTP API is used. Therefore, the agent's API key is needed which can be accessed by clicking on the gear icon right to the agent name. The client access token is be copied and, again, introduced into the system environment variables (see System Environment Variables).

To restore the agent created in the course of this project, a zip file containing the modeled agent can be found in the project's documents (Application/Agent). By clicking on the already mentioned gear icon right to the agent name, a subtab called "Export and Import" provides the possibility to import the agent from zip.

#### **Foursquare**

To retrieve images using the Foursquare API, a Foursquare account has to be created first. After that, the application has to be registered. If the registration is successful, the API access token can be found in the application overview. Again, these tokens are saved in the System Environment Variables).

#### Web Service Setup

#### Prerequisites

This project runs on Java 8 which is a requirement for the web service framework Java Spark as well as the used cloud service Heroku. The JDK can be downloaded from Oracle. Git is used to manage the project's source code as well as to deploy the code to the Platform as a Service application. In order to manage a Git repository, you have to sign up on GitHub and install Git using the following command.

```
sudo apt-get install git-all
```

On top of it, all libraries used during this project are included using the buildmanagement tool Apache Maven. This program is installed by executing the following command in Ubuntu's command line. Maven is also needed for deploying a Java application to Heroku.

```
sudo apt-get install maven
```

#### Deployment to Heroku

The web service is deployed using Heroku, a cloud Platform as a Service (PaaS). In order to use the application, an account has to be created previously, following https://signup.heroku.com. At first, the Heroku command line interface has to be installed. Using Ubuntu, this is achieved executing the following commands:

```
sudo add-apt-repository "deb_
   https://cli-assets.heroku.com/branches/stable/apt_./"
curl -L https://cli-assets.heroku.com/apt/release.key |
   sudo apt-key add -
sudo apt-get update
sudo apt-get install heroku
```

After installing the command line, execute the following command and enter the Heroku credentials when asked.

```
heroku login
```

In Ubuntu's file system, change into the project directory touristbot and execute the following command in order to create a Heroku app.

heroku create

As we can see, a random application name is assigned, in this case e.g. https://arcane-fjord-43759.herokuapp.com/. This name has to be copied and inserted as our HEROKU \_ URL to the System Environment Variables). In doing so, the Telegram bot is hooked to the Heroku app later.

```
reating app... done, ● arcane-fjord-43759
ttps://arcane-fjord-43759.herokuapp.com/ | https://git.heroku.com/arcane-fjord
ouristchatbot@touristchatbot--virtualbox:~/tourist-chatbot$
```

Figure D.4: Heroku Web App Creation

The source code can be now deployed using the command:

```
git push heroku master
```

#### Heroku Postgres Setup

In order to access our geospatial database online, Heroku Postgres is used to set up a productive PostgreSQL database. The following commands are executed from the Heroku repository:

```
heroku addons:create heroku-postgresql:hobby-dev
```

After that, the psql command is used in Heroku to enable sending POST-GRESQL queries:

```
PGUSER=postgres heroku pg:psql
```

The following queries are executed to enable the PostGis support in the PostgreSQL database.

```
CREATE EXTENSION postgis;
CREATE EXTENSION hstore;
CREATE EXTENSION postgis_topology;
```

The touristdb that was set up in the Database Setup is then pushed to the just created database:

PGUSER=postgres heroku pg:push touristdb DATABASE\_URL

#### System Environment Variables

In order to manage the access tokens of our external components and not push them publically into a repository, system environment variables are used. These are set differently according to whether tests are run locally on the virtual machine or the application runs productively in Heroku. To set the system environment variables locally, the file /etc/environment is modified to contain the following variables:

HEROKU\_URL=INSERT HEROKU URL

DATABASE\_URL="postgres://touristuser:password@localhost:5432/touristdb" TELEGRAM\_TOKEN=INSERT\_TELEGRAM\_TOKEN API\_AI\_ACCESS\_TOKEN=INSERT API.AI CLIENT ACCESS TOKEN F\_CLIENT\_ID=INSERT FOURSQUARE CLIENT ID F\_CLIENT\_SECRET=INSERT FOURSQUARE CLIENT SECRET

The placeholders are replaced with the respective tokens from the external services. Concerning the variable DATABASE \_ URL, the POSTGRESQL password has to be entered that was set in the Database Setup). For the productive runtime environment, the bash is used to set the environment variables on Heroku, entering the following command:

heroku config:set TOKENPARAMETER=VALUE

This command's execution is repeated for all of the above mentioned tokens with the exception of the variable DATABASE \_ URL as it is an already predefined environment variable.

#### Integrated Development Environment

The project is developed using Eclipse Neon as an IDE. The 64-bit installer can be downloaded from Eclipse's website. After installing Mayen and Eclipse, start Eclipse in order to import the source code. This can be easily done by importing a Maven project, executing  $File \rightarrow Import \rightarrow Existing Maven$ *Projects* and then choosing the project's source folder.

The project's source code can now be accessed and modified using Eclipse. Additionally, Eclipse is used to run the Junit tests for this project.

#### D.4 Program Compilation, Installation and Execution

The presented application was designed for online usage and is deployed to the Platform as a Service Heroku. Therefore, no further compilation, installation or execution steps are needed as this is managed by the PaaS. Changes to the previous source code are published by using the Git workflow, meaning to commit the changes and then push them to Heroku using the command:

git push heroku master

#### D.5Tests

Tests were made during this project to ensure the project's quality. For this reason, several measures were taken to concentrate on different aspects of quality assurance.

#### Automation Testing using JUnit

Java's unit testing framework JUnit is used to design automated tests. Using JUnit, the test-driven development paradigm was applied in this project to ensure the code's correctness constantly during development. The tests can be found in the project folder tree navigating to src/test/java. The folder is subdivided into the packages bot, dataAccess, poiRecommendation which match the main components in the project. In this project, two different kinds of tests were designed:

Unit tests that concentrate on ensuring the proper functioning of the code on a class level.

**Integration tests** covering the essential use cases of the chatbot (including all of the system's relevant components and therefore demonstrating the proper interaction of the components). These integration tests can be found in the JUnit test class src/test/java/bot/TouristChatbotTest

The code coverage tool EclEmma is used to show how much of the source code is actually tested by the JUnit tests. EclEmma is integrated into the IDE Eclipse. The following results are obtained by executing all of the project's JUnit tests:

java (Jun 9, 2017 5:06:57 PM)						
Element	Coverage	Covered Instructions	Missed Instructions			
<b>▼</b>	80.0 %	5,220	1,304			
▼ <b>怹</b> src/main/java	80.0 %	5,220	1,304			
+ # chatbot	76.5 %	1,796	553			
• # model	77.4 %	1,496	437			
+ # dataAccess	85.7 %	1,408	235			
# recommender	86.8 %	520	79			

Figure D.5: Code Coverage Analysis Result

As we can see, 80 % of the productive source code is tested. The test coverage mainly centers on the proper functioning of the service classes of the chatbot, meaning the classes that provide important functionalities and are error prune due to their complex structure. On the other hand, model classes are not as extensively tested as most of them follow a simple design, providing only getter, setter and field-based equals implementations. Furthermore, classes using code from external libraries are not a focus of the tests as it is assumed that their proper functioning is ensured by the developers of the respective libraries (e.g. hooking the application to the Telegram bot by using a third party Telegram library).

#### Recommender Evaluation

To ensure that the computed recommendations of the chatbot are actually adjusted the users' preferences, an evaluation is made using the Mahout framework. The evaluation is limited to the user-based part of the recommender which is based on user ratings. The reason for this is that the content-based mechanism is used as a fallback that provides recommendation when the user data is too sparse for the user-based recommender to perform properly. In fact, the content-based mechanism is not really a recommender but rather a similarity measure. The proper functioning of this mechanism is tested using unit tests (see the JUnit test class RecommenderTest).

The actual recommender evaluation can be found in src/test/java/poiRecommendation/Recommender Evaluation. Mahout's Recommender IRS tats Evaluator is used which splits the available user data automatically into training and test sets. To evaluate the recommender performance, information retrieval metrics are computed. More precisely, the metrics precision and recall are examined as well as the F-Measure which is a harmonic mean of the other mentioned metrics [7].

$$Precision = \frac{|\text{relevant items retrieved}|}{|\text{items retrieved}|}$$
(D.1)

$$Recall = \frac{|\text{relevant items retrieved}|}{|\text{relevant items in collection}|}$$
 (D.2)

$$F - Measure = 2 * \frac{\text{precision} * \text{recall}}{\text{precision} + \text{recall}}$$
 (D.3)

During the recommender development, Mahout provides a variety of similarity and neighborhood functions to choose from. Depending on the applied functions, the recommender computes the similarity between two items differently and considers different items to be suitable for a similarity measure. Using the evaluation results, the combinations of the following similarity and neighborhood functions can be tested to determine which one of them performs best on the given data. The following table shows the f-measures of the 16 investigated combinations:

	Threshold User	Nearest 2 User	Nearest 5 User	Nearest 10 User
Euclidean Distance	0.5	0.4	0.5	0.5
Pearson Correlation	NaN	NaN	NaN	NaN
Loglikelihood	0.55	0.29	0.73	0.5
Spearman Correlation	NaN	NaN	NaN	NaN

Table D.1: F-Measures of the recommenders using different similarity and neighborhood functions

It quickly becomes clear that the Pearson Correlation Similarity and Spearman Correlation Similarity are not suitable for this recommender as they do not output valid performance results at all. A reason for this is that the applied user data is too sparse to achieve significant results using these similarity functions. The best f-measure is achieved by a recommender using Loglike-lihood Similarity and Nearest-5-User as neighborhood function. Examining this recommender's performance in detail, we see that it achieves a precision value of 0.8 and a recall of 0.67. As we can see, the precision value is higher than the recall value. The precision tells us the fraction of retrieved items that are relevant whereas the recall tells us the fraction of relevant items that are retrieved. In this project, the precision value is considered as more important than the recall value as the user has to be provided with recommendations that fit his interests. Yet, the fact that the user-based recommender may not find all possible recommendations for the user, is rather negligible as the

content-based mechanism is used as a fallback in this case. Also it is assumed that the overall performance of the recommender will rise with increasing data as more users use the chatbot (cold start problem of a recommender).

## Appendix E

## **User Manual**

#### E.1 Introduction

This user manual serves as a guide to show the user how to use the presented chatbot via the instant messenger Telegram. In the following, it is explained how the user accesses the chatbot as well as presenting the main features of the chatbot exemplary.

### E.2 User Requirements

In order to use the chatbot, the user needs to have a smartphone which is capable of connecting to the Internet. The messenger Telegram has to be downloaded and installed on the device, the app can be found using the respective App Store of the phone. In order to create a Telegram account, a real mobile phone number has to be introduced which links the Telegram messenger to the smartphone's sim card.

#### E.3 Installation

The chatbot is accessed via Telegram. In order to contact the chatbot, its Telegram user name (**touristrecommenderbot**) is introduced in the Telegram search function. Pressing *Start* activates the user-chatbot conversation. After pressing the button, the conversation should look as follows:

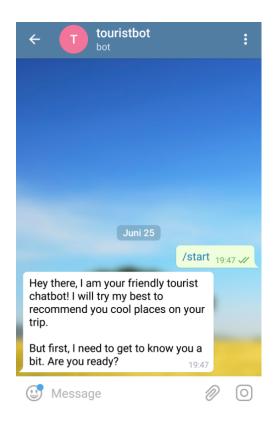


Figure E.1: Starting the chatbot

#### E.4 User Manual

The chatbot can be accessed by sending messages using the Telegram keyboard. Users are free to send the chatbot any message they like – however, the chatbot may reject a request if the user's intention is not tourism-related. The following section shows the chatbot's main features and examples of how to trigger them.

#### Help

The user shows interest in the chatbot's functioning, so a guide is returned in which the main features are outlined.



Figure E.2: The user asks for help.

#### Chat About Preferences

The user shows the intention to talk and the chatbot asks the user about his tourist preferences. If the chatbot is told by the user that the interests were not filtered correctly, the chatbot asks the user to rephrase his interests.



Figure E.3: The user tells the chatbout about his preferences.

#### Recommendation

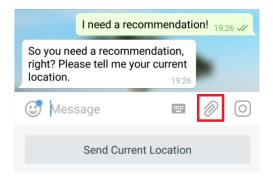


Figure E.4: The user triggers the recommendation.

The user triggers the recommendation and is asked to send his location. The shown button helps sending the user's current location. However, due to the fact that the presented chatbot only recommends points of interest for Barcelona, the recommender will not be able to recommend a point of interest when the user is not situated in that city. Therefore Telegram's manual location attachment function can be used, accessed by the highlighted paper clip button. The location can be changed using drag and drop.

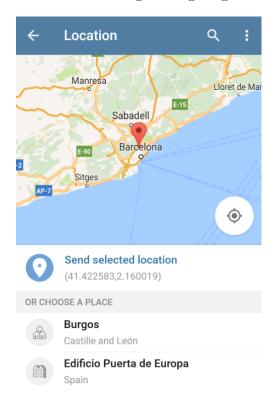


Figure E.5: A location in Barcelona is chosen.

After selecting a location, a point of interest that matches the user's interest the most is presented, alongside with a photo of the point of interest (if available). The user is asked to send his first impression of the point of interest, using one of the mutually exclusive buttons or typing a message on his own.

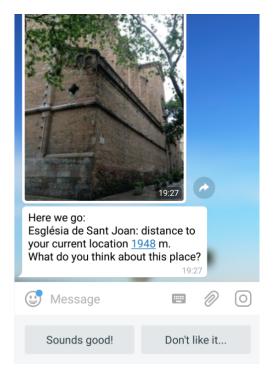


Figure E.6: A point of interest is recommended.

The chatbot provides other points of interest that match the user's interest and are situated in the given radius. The user can choose to see one of them by entering the point's index or decline.



Figure E.7: Other points of interest the user might like are shown.

After all points of interests were shown or the user declined to see more, the recommendation process is completed.

#### Category-based Recommendation

If the user mentions his interest for a specific tourist category, only points of interest that match the stated categories are recommended. Such a category-based recommendation can be triggered as follows:



Figure E.8: Category-based recommendation

#### Show Past Recommendations

The user asks to see his past recommendations and is presented with a list of the recommendations he has seen before and were interested in (by showing a positive first impression during recommendation). If there is a recommendation the user has not rated yet, he is asked of his final impression by rating the point with stars from 1 to 5.



Figure E.9: The user's past recommendations

#### Specify Recommendation Radius

The recommendation radius can be specified by entering the preferred maximal distance to the points of interest.



Figure E.10: The recommendation radius is specified

#### **Show Personal Information**

The user is provided with the personal information the chatbot has saved during the course of the conversation.



Figure E.11: The collected user information is shown by the chatbot.

#### Error Handling and Reset

There is certainly no such thing as bug free software, despite extensive testing. In the rare case of the chatbot not responding appropriately or not responding at all, the chatbot conversation should be restarted by the user. In order to do so, the user has to enter the command  $\$  in the Telegram messenger which restarts the user interaction with the Bot and leads to the state previously seen in screenshot E.1.

This command can also be used if the user wants to reset the conversation, for example in order to make the chatbot delete the previous collected user data.

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