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FINAL DEGREE PROJECT

**Trainer Bot: A Natural Language Processor
Chatbot**

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AGRADECIMIENTOS

Agradecimiento

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Abstract

The lack of expertise that people have on how to perform a good training session has a series of issues. The two issues we encounter are that it leads to inefficiency and bad practices that can lead people to quit or injure themselves. With the cost to have a personal trainer or somebody to manage a person's training session being very high, there is an opportunity to improve the user experience with automated services that provide relevant information and keeps track of the progress that is being made.

This project implements a trainer chat bot that alleviates the cost of having a personal trainer, but maintaining many of the features they would provide. Over the years chat bots have steadily been incorporated into society, the flexibility and cost chat bots have, makes a very lucrative option for monotonous operations such as some provided by a personal trainer.

CHAPTER 1

Introduction

Technology and the impact it is having in our society is changing the way we think and the way we interact with each other. With more and more automation in the workplace many monotonous jobs are disappearing and more creative ones are replacing them. This and the fact that technology has opened the mind and ability for people to start a business as the cost to startup a business thanks to technology has greatly reduced. The objective of this project is to automate the personal training area as it has been relatively untouched. The problem is that many people unknowingly train in a way that in the long term may cause them injury, this is due to the lack of knowledge and guidance to train differently and safely. Gym trainers may provide some guidance but with the amount of people normally in these gyms they can't be always there to help. The idea is to create a chatbot that can aid, track progress and create training sessions that adapt to each user whenever the user needs them.

1.1 Background

Machine Learning (ML) algorithms in recent years have improved greatly thanks to the immense computing power available. This with the amount of data currently accessible, has naturally led the way for the development of bots that can communicate with people, originally with basic phrases and over time in a more complex and natural manner. New technologies have made it more intuitive and easier to work on this area with many Natural Language Processing (NLP) libraries such as Natural Language Tool Kit (NLTK) that help translate human spoken phrases to something easier for the computer to understand. Other libraries like TensorFlow or Scikit-Learn provide functionality to train models based on the processing done in NLTK. Nowadays, even though the libraries mentioned before are still frequently used, it is more common now to see platforms that abstracts the users from the inner workings of the algorithms and instead leaves the user with an intuitive UI for the user to create their own functionality for the chatbot.

Thanks to the access we have now to smartphones and social platforms the integration of chatbots in these platforms is growing steadily as it allows the user to communicate with help centers without waiting a long time to get a response.

1.2 Motivation

The motivation to develop this project comes from the time-consuming activity of preparing a time table with what muscles and exercises to train and the forgetful way of tracking a person's progress when going to the gym, for this reason, with the knowledge acquired over the years and the technology available this project came to life. It is not only a project to finish the degree it is a project that after giving it in will still be worked on over time to add more functionality and make it a truly useful application that can be used by users outside the University environment. This will be more of a proof of concept to verify the viability of further developing and investing the time to add more functionality.

1.3 Development Stages

The project has gone through several makeovers due to the time constraint to develop the chatbot.

1.3.1 Planification

Originally the idea was to use a structure like a project done previously where a virtual machine in Google Cloud was the brains of the bot. In this project as there was access to a raspberry pi, the idea to use a cloud provider was changed to have it be the server. In this stage, the most time was spent on how the architecture of the bot was going to be and what technologies were going to be used throughout the project. This planning has had to be revised several times changing the whole architecture from a proprietary solution using several of the libraries mentioned before in the background to an open source platform called Rasa. Also, due to continuous problems caused by the raspberry pi with the installation of libraries and the lack of computing power the decision was to change the server to Azure, Microsoft's Cloud Service.

1.3.2 Development

In this stage is where all the planning came to life and where most of the time was spent. It was composed of two plans.

Initial plan:

- **Creation of a webhook to manage incoming messages from telegram in the server.**
- **DB creation to manage user info.**
- **User recognition.**
- **Intent Detection using NLTK and Scikit-learn.**
- **Conversation flows (unfinished due to complexity and time constraint).**

Revised plan:

Due to the time to create a context manager for complex conversational flows and the limit imposed by time, half way through the development it was decided to redo everything with Rasa.

- **Reconfigure webhook to manage incoming messages with rasa.**
- **Conversation stories creation.**
- **Entity extraction.**

1.4 Resources Used

As it was said in the previous point there were two different plans, for the original one the resources used were:

- **Telegram:** This was used as the platform for the user to communicate with the bot as it supports it, there are other platforms that can be used as well as integrating them isn't complicated, but as a proof of concept telegram works well.
- **Raspberry pi:** Used as the server to hold the brains of the chatbot. Limited in computing power.
- **Python:** The programming language by excellence for machine learning as it is intuitive and has a lot of community support. The main libraries used for this original plan were:
 - **NLTK:** For the translation from human language to something the computer understands.
 - **Scikit-learn:** For training and classifying the models for the bot.
 - **Pickle:** To store the bot's trained models.
 - **CSV:** To load the training data from a csv file.

For the revised plan a few things changed:

- The raspberry pi was changed to a cloud solution by Microsoft called Azure, this virtual machine has double the ram of the raspberry pi and a higher computing power making the bot train quicker.
- Even though Python is still used in this revised plan, the libraries are packaged in to the new Natural Language Engine, Rasa which takes care of training the bot.

1.5 Memory Structure

The document is structured in different sections where the different aspects of the project will be explained.

- **Analysis of the problem:** An in-depth analysis off the current state of the gym sector and why the need for a personal assistant is required for improving the overall efficiency when a user is working out. In this section the objectives of what this project is trying to achieve will be explained.
- **State of the art:** An analysis on how the ML and NLP technologies have evolved to the current state and where it is currently heading. What rol are chatbots taking in society.
- **Solution proposed:** How the solution provided in this project can benefit millions of people and how this project has been developed as well as the regulatory framework surrounding virtual assistants and user data manipulation.
- **Planning and budget:** How the original planning was made and how it compares to the real development. Also, this section reviews how much budget this project has taken.
- **Socioeconomic Environment:** An approach on how the current chatbot technology is changing many industries and saving costs for companies and providing a better service for their clients.

CHAPTER 2

Analysis Of The Problem

Exercise is something that constitutes a major aspect of a person's life from cross country running to weight training, and everything in between. The problem is that for many activities even though we now have access to massive amounts of information thanks to having access to the internet in the palm of our hands, it is still a pain to search for how to correctly exercise our bodies and what is best to efficiently do so. This makes something that improves our health to something that may cause injury.

This is reflected every year in gyms, where every New Year there is an influx of people that join and after a few weeks they end up abandoning their New Year's resolution. In America 13 % of all New Year's resolutions are related to losing weight and exercising, making it the most common resolution. With google trends, that shows what users search for, we can corroborate these results with the interest people have of subjects like exercising and weight loss were there are major spikes of interest at the beginning of every year that slowly dies of towards the end of the year.[1]



Figure 2.1: User Trends

Thanks to gym applications gaining popularity the amount of data gathered allows the creation of some interesting conclusions where in the following graph can be seen how many activity logs uploaded to Strava's fitness app, this graph separates the different age groups which helps figure out which groups are more common to abandon and retake the gym after New Year. From the following graph older age groups have a higher tendency to start their resolutions as soon as possible, where younger age groups tend to have a smoother approach when starting their resolutions. What they have in common is that all groups show a decrease in activity logs towards the end of the year.[1]

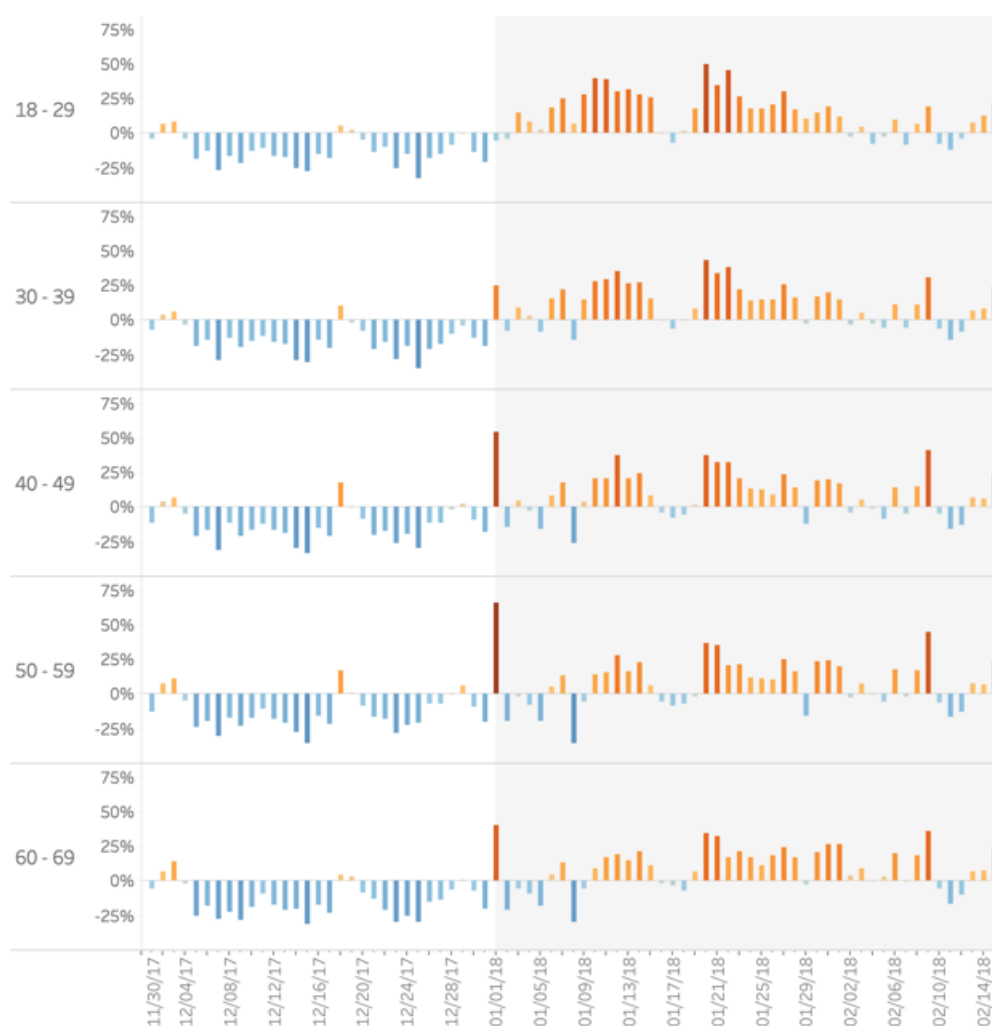


Figure 2.2: User Activity Log Uploads

The conclusion of this analysis is that there is a motivation to get fit, but people have problems in maintaining their routines. One of the reasons are unrealistic expectations where people want to tackle a big objective without being experienced or being disciplined, another of the reasons are boring workouts where people only do the

exercises they have seen in films and don't change their routine because they don't have the knowledge to do so. Because of this and many other reasons the resolution to go to the gym quickly dies of.[2]

2.1 Objectives

The main objective is to have a functional virtual assistant that can provide the same help as normal personal trainers but at a much lower cost. This project will be a proof of concept with some limited functionality to see the viability of the product, the project will be focused on gym training.

The objective of the chatbot is to help users stay active, the way this will be accomplished is by making it easier for them to stay motivated and keep reaching their objectives. Reviewing the most common reasons people quit doing exercise comes down to unreasonable objectives and a lack of knowledge.

The following points reflect the main functionality the bot will have in it's final form to help the user reach their goals:

- **Exercise table creation:** One of the most time-consuming and boring things to do is prepare a routine to follow, there are applications that help out with this, but the idea for this project is to make the interaction more human-like, having the bot automatically generate tables based on what muscles have been trained and what muscles are not proportionate to the rest of the body. As this is a proof of concept and due to the time constraint of this project, the functionality that tracks what the user has exercised and the table creation will be limited.
- **Diets table creation:** Like what the above point talks about, the objective here is to make it easier for the user to know what to eat in order to reach their desired weight or to gain muscle mass. As some users may have different meal preferences, for the final product the chatbot can take food preferences in to account to provide different meals.
- **User tracking:** The objective is to track the user's progress and see how close they are of fulfilling their goals, this will provide data on each user's performance and how to further adapt their routines to make it easier to follow.
- **Motivate user regularly:** By checking how their training sessions are going and how well the users are progressing, motivate them with data on their progress and how close they are of achieving their goals.
- **Training sessions:** This objective would be an addition for future development as it requires a different architecture and it is still not technologically ready. The idea is to have a human-like voice speak while you complete your training sessions. The problem is making the voice human-like and the technology is not there yet. The idea of doing it written distracts the user by making the user use the phone more.

These objectives when completed will provide the user with enough tools to feel motivated and keep them using the application, where certain functionality may require

being a premium member. This will fulfil the objective of making the application profitable, another way to increase profitability would be using ads related to health products the user can buy based on the chatbots recommendations, from protein shakes to measurement tools.

CHAPTER 3

State of the Art

For the last 40 years society has been living the third industrial revolution, better known as the digital age. Telecommunications and technological innovations are transforming the way people live and work, one way these innovations have impacted society is by allowing users to connect cheaper and quicker internationally, making it easier to share ideas than ever before. The ever-growing number of bots assisting humans has allowed companies to automate more and more, relieving people from the most boring of jobs, this has resulted in a higher demand for higher educated workers specially in computer science and other engineering areas. As you can see in the graph below, people are becoming more interested in these areas. This helps further develop these technologies as the more people interested, the more ideas are shared and more progress is done.

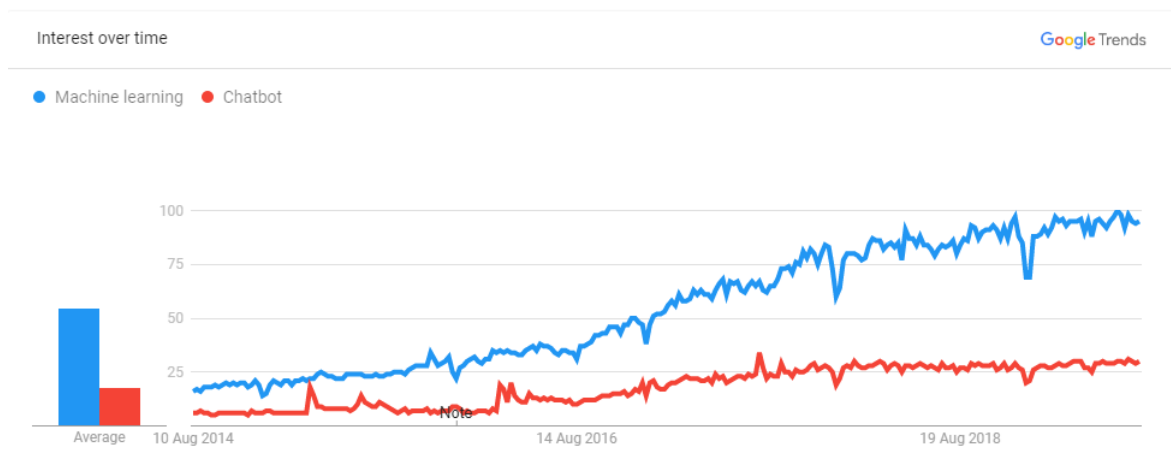


Figure 3.1: Global Trends for Machine Learning and Chatbots

In this chapter the background for the technologies that were used in the project will be explained.

3.1 Artificial Intelligence

As Andrew Ng, a professor from Stanford said, AI is the new electricity, in a certain way the same as electricity changed many industries, AI is set to revolutionize the world. But before explaining further, let's explain what Artificial Intelligence is. Based on Encyclopaedia Britannica's definition, AI is the ability for digital computers of performing tasks commonly associated with intelligent beings. There are two main ways of classifying AI:

- **Type 1:**

- **Strong AI:** This is an AI that thinks just like a human. Currently there are no examples of this happening, but its development has accelerated innovations in AI.
- **Weak AI:** Build machines that do things like humans but without an understanding of how the human brain works. It is where a machine only is able of doing one task.

Companies normally develop a fusion between these two types where machines have a partial understanding of how humans work to do tasks.

- **Type 2:**

- **Reactive Machines:** One of the more basic types of Artificial Intelligence. It can't use past information to do future actions. It focuses more on rules than actual knowledge.
- **Limited Memory:** In this case the AI can use past information to do future actions. This design for AI has been integrated in autonomous vehicles, where the car stores information of what occurs in its surroundings. This functionality is used also in chatbots to maintain a contextual idea of the conversation as the machine stores relevant information to make it more human-like.
- **Theory of Mind:** This is where a machine can understand and interpret human emotions, beliefs, thoughts, etc. By understanding what makes us human it can be able to socially interact with them. This would be the next level for chatbots, now the machine can extract a person's emotion by the words and tone spoken with and respond differently based on that, but still has a way to go to understanding humans.
- **Self-awareness:** Still in the science fiction stage where a machine is conscious, intelligent and aware, basically a human being. If human kind reaches this point in AI, it would be a huge milestone for the field but will also raise many questions.

Many people confuse Artificial Intelligence with machine learning, but this is wrong, machine learning is a part of AI, many other areas encompass the whole of AI. To visualize this easier the image before shows you how this areas are divided.[3]

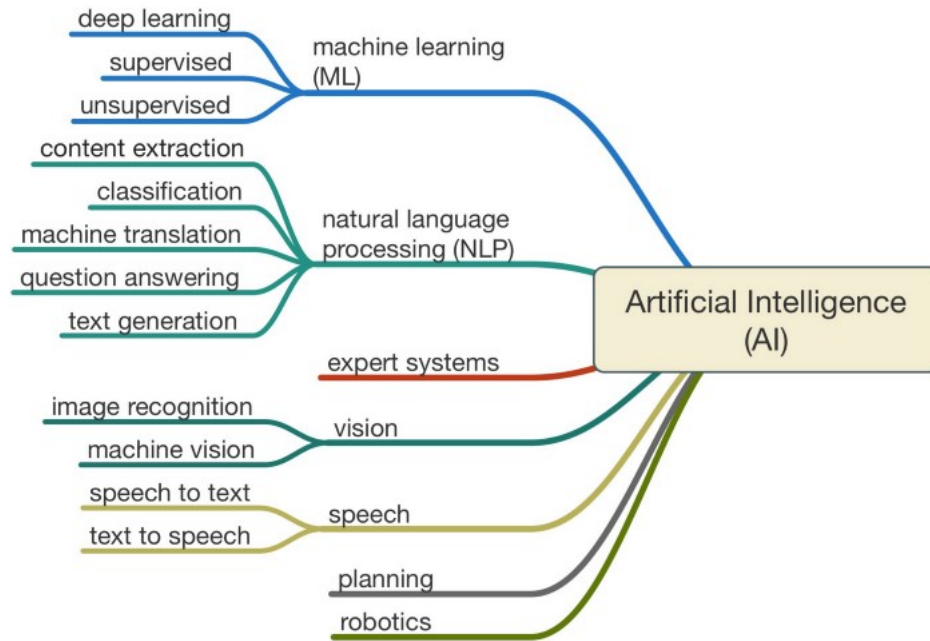


Figure 3.2: Areas in Artificial Intelligence

For this project the main areas that were used from AI are Machine Learning and Natural Language Processing. For a final product, speech would be an upgrade to the project to make it able to interact through voice with the user.

- **Machine Learning:** For this project we use supervised training where the bot has conversations with a trainer that tells what the bot should do based on what the user says.
- **Natural Language Processing:** Even though many of the tools provided are integrated in Rasa, several tools were used for the bot to work in the initial iteration of the chatbot and still requires tweaking with Rasa.
 - **Content Extraction:** This is where valuable information is extracted from what the user says, this can be what can of training they are seeking, at what time they want to be reminded to take their measurements or when the user was born. This is done by using regular expressions or by using lists with synonyms, depending of what type of info is extracted.
 - **Classification:** Depending on what the user says, the bot must understand what his intentions are, this is done by training the bot with training phrases that reflect what does the user want and associating it with an intention, after training a model, the bot is able to distinguish between different intentions. Before training the bot, human phrases must be translated to something the machine can understand.

3.2 Chatbots

A chatbot is a software based on AI that simulates a human conversation with a user. This is done through messaging applications such as Telegram, Facebook, websites or company's messaging software.

Chatbots have been slowly but steadily been incorporated into people's lives, from basic robo-calls to natural speaking bots used in customer service. Virtual assistants such as Google or Alexa, that are constantly getting feature updates making bigger the number of things they can do, such as ordering pizza or getting a booking for a restaurant. These improvements have to do with many of the technologies involved, that have improved greatly. We will explain below the different components in a chatbot and how its architecture has evolved.

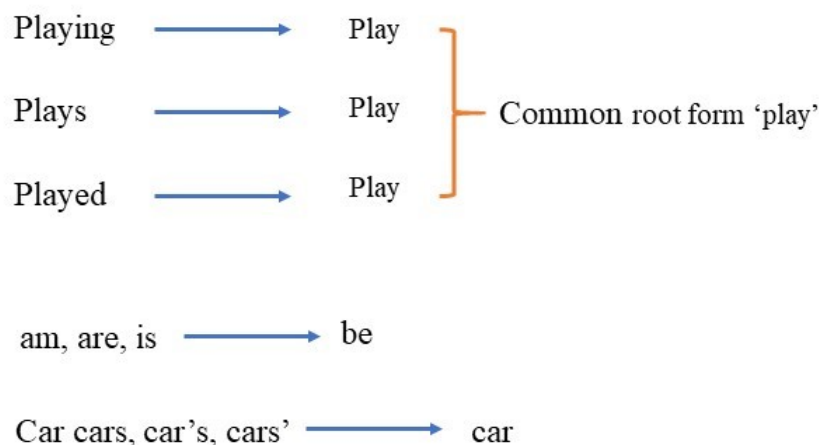
3.2.1 Messaging Platform

The messaging app is where the user interacts with the chatbot. As mentioned previously there are several ways of communicating with the chat bot, it can be written or spoken. Depending on how the user talks with the chat bot there will be additional processing, because if the user uses spoken language it must be transcribed for the machine to understand.

3.2.2 Natural Language Processor

The Natural Language Processor is the step where the bot does most of the work. When the message is received it goes through a series of conversions.

- **Speech to Text:** This is needed only when the message sent from the user is in voice format, such as the virtual assistants solutions provided by Google or Amazon, although this can also be included in applications where voice messages functionality is available.
- **Language Detection:** This is a way of building a multilingual chatbot without the need of building different models for every language. The issue is how to get the translation, there is a well-known API from google that provides this functionality for a price. A way to reduce costs can be to have a cache store the most frequent translations.
- **Tokenizing:** In this step what the bot does is separate the phrases in independent words, it is also important for the bot to understand what each word is, if it is a noun, verb, adjective or an adverb. Also, it must discard all redundant words that don't provide any additional information.
- **Stemming:** This consists in simplifying the words in the phrase in order to have a much simpler vocabulary for the bot to understand, this is done by eliminating verb conjugations or keeping the stem of the word. In the image below there is a more in detail example of what stemming is.[4]



Using above mapping a sentence could be normalized as follows:

the boy's cars are different colors → the boy car be differ color



Figure 3.3: Stemming Examples

- **Word to number:** The bot in at this point translates the tokenized and stemmed words into numbers the bot can understand, this is done in two steps.
 - **Word Identifier:** In this step what the bot does is convert each word with a numerical identifier. In this way, for example all the hello's will be number 1. This helps the bot in the next step.
 - **Term Frequency:** Here what the bot does is check the frequency of certain words in the training data. This will be used to help classify as some words are more frequent in some intents more than in others.
- **Intent detection:** Based on the frequency words show up on the user's message the bot can predict what the user's intention is.
- **Entity Extraction:** Once the intent is predicted the next step is extracting the information that is relevant to that intent, in case of setting a reminder for example it is important for the bot to understand at what time does the user wants to be reminded.

This can be done in several ways:

- Regular expressions to extract information that comes in certain formats.
 - Lists for finite proper names, like cities or countries.
 - By adding many examples of the data that you want the bot to extract.
 - Filling the missing information with user relevant info extracted in previous occasions.
 - Asking the user for the missing information.
- **Response:** After extracting all the relevant information from the user's message create a response that answers the user's request and perform whichever action needs to be performed.

3.2.3 Profiler

The profiler is an extension of the chatbot that allows it to become much more intuitive and natural with the conversations. What the profiler does is gather information from the user through their previous conversations, then uses that info to give context to the user's requests or fills out missing information based on the user's preferences.

For example, in this project when the user asks to be reminded to take his measurements at 8 am, the bot will extract that information for future occasions. If after that interaction the user asks to be reminded the next day the bot will automatically use the hour extracted from the previously without asking the user for that information.

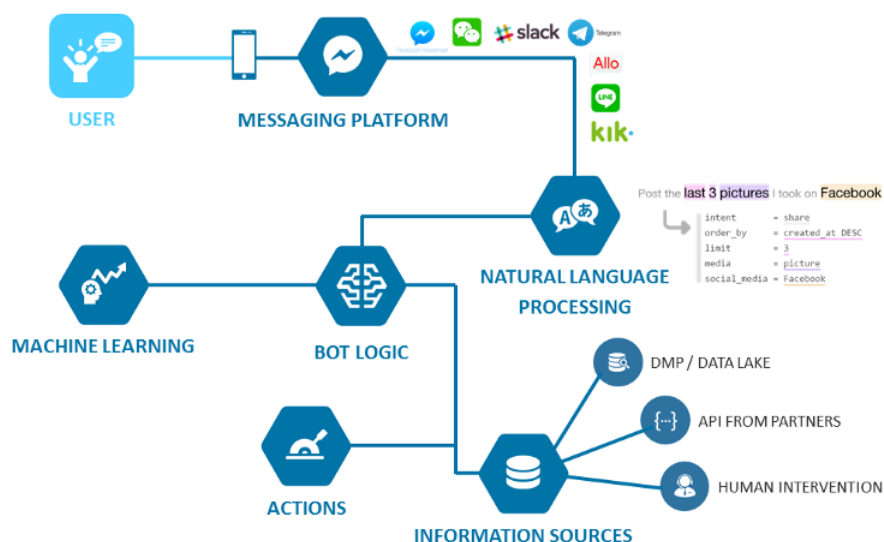


Figure 3.4: Chatbot Architecture

3.3 Platforms

There are many platforms to build chatbots, with their own features. Below there is a table of the difference between several solutions. In this section we will talk about some of them and what differences each have.

Bot Name	Features	Technical Details	License	Channel
IBM Watson Conversation Service	Has three main components: Intents, Entities, Dialog Analysis, to detect what messages confuse the bot	Built on a neural network (one billion Wikipedia words).	Free, priced per message, Contact required for enterprise	Voice Image Text
Wit.ai	Home automation Wearables Hardware	Allows to use: Entities Intents Context Actions	Free	Voice Text
Rasa	Interactive Learning Stories	Modular Pipeline to design what best fits for you	Open Source	Text
Dialogflow	Intuitive Platform Pretrained packages from Google Chit Chat built in	Neural Network Black box	Free Enterprise	Voice Text
Microsoft Language Understanding Intelligent Service (LUIS)	All LUIS applications are centered around a domain-specific topic or content related. Active learning. You can use pre-existing, world-class, pre-built models from Bing and Cortana.	LUIS offers a set of programmatic REST APIs that can be used by developers to automate the application creation process.	Free [10.000 Transactions] Paid [1,50\$1.000 transactions] [4,50\$ 1.000transactions]	Voice Text
Pandorabots	AIML (Artificial Intelligence Markup Language) Includes A.L.I.C.E.	The Pandorabots API allows you to integrate our bot hosting service and natural language processing engine into your own application.	Free Developer [19\$/month] Pro [199\$/month] Enterprise [Sales]	Text

Table 3.1: Differences between different chatbot solutions

3.3.1 DialogFlow

3.3.2 Rasa

[5]



Figure 3.5: Rasa Logo

CHAPTER 4

Solution Proposed

4.1 Implementation

4.2 Regulatory Framework

4.2.1 Hardware

CHAPTER 5

Planning and Budget

CHAPTER 6

Socioeconomic Environment

CHAPTER 7

Conclusions

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