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Enhancing customer service and user experience through the use of machine learning powered intelligent chatbots

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Abstract

The implementation of machine learning powered intelligent chatbots have greatly enhanced customer service and user experience in various industries. With the advancements in artificial intelligence and natural language processing, chatbots have become an essential tool for businesses to effectively communicate with their customers. Machine learning algorithms enable chatbots to analyze customer queries and provide accurate responses, mimicking human conversation. This has led to an increase in customer satisfaction as chatbots can handle large volumes of inquiries and resolve them efficiently. Moreover, chatbots are available 24/7, providing round-the-clock service to customers. Implementing chatbots in businesses has also resulted in cost savings as they reduce the need for human customer service representatives. This has allowed companies to allocate their resources to other areas of their business, ultimately leading to increased productivity. In addition to improved customer service, intelligent chatbots also enhance user experience. By continuously learning from user interactions, chatbots can personalize responses and provide relevant information, making the customer experience more seamless and efficient. Furthermore, chatbots can be integrated into various platforms such as websites, social media, and messaging applications, making them easily accessible to users. This has also led to an increase in user engagement and retention rates. The potential challenges and limitations of this technology was also discussed and recommendations provided for future research in this field. Overall, the development and implementation of machine learning powered intelligent chatbots have greatly enhanced customer service and user experience, making it a valuable tool for businesses in today's digital age.

Keywords: Artificial Intelligence; Machine Learning; Chatbot; Natural Language Processing; Customer service

1. Introduction

Every business success depends on the satisfaction of the customers; customer service and experience are crucial aspects of modern businesses and it can make or break the business Ajayi [1]. Poor customer service can lead to customer frustration and dissatisfaction while an excellent customer service can build brand loyalty and drive customer satisfaction.

Customer service plays an essential role in cultivating the relationship between customers and a company, which is traditionally fulfilled by human front-line employees. According to Kiniulis [2], 65% of a company's business comes from existing or retained customers and acquiring new customers can cost up to three times as much as retaining existing customers Hari [3]. So, the goal of any business is to create a seamless and enjoyable experience for users that meets the customers' needs and exceeds their expectations so as to retain existing customers and attract new ones.

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The advent of digital era has transformed the nature of customer service and this plays a massive role in the industry. Due to the continual rise in customer expectations, enhancing customer experience has become a challenging task for a business. As technology advances, one emerging trend that is revolutionizing customer service and user experience in businesses is the integration of Artificial Intelligence (AI). AI has influenced how businesses engage in everyday activities by designing and evaluating advanced applications and devices called intelligent agents which can improve customer service, user experiences and perform other various functions Adamopoulou & Moussiades [4]. An example of intelligent agent is a conversational/dialogue system which is a system or program that can understand natural language and conduct a written or verbal conversation with a customer. More specifically, a conversational system is a software application used to conduct an online chat conversation via text or text-to-speech, instead of providing direct contact with a live human agent Ansari et al. [5].

Chatbots is a type of conversational system. Chatbot systems have come a long way since its inception in the 1960s. Chatbot as indicated by Oxford Dictionaries (2018), is a PC program intended to reproduce discussion with human clients, particularly over the Internet. A chatbot is designed to replace humans to provide user communication through an on-line chat conversation Chow et al. [6]. Chatbot experiences can happen through text or voice interactions, and can be more or less valuable depending on the context.

Both the hardware and software aspects of computer science, natural language processing (NLP) and machine learning (ML) techniques have developed tremendously. Due to the advancement of these emerging technologies, chatbots have evolved from systems that generate machine-like responses (rule based chatbots) to human like agents (AI chatbots) capable of developing long-term relationships with users.

Therefore, the performance of a chatbot is enhanced through NLP and ML techniques, which makes the chatbot more powerful than a conventional website and Google searches, because the machine learns from the user's request and improves its knowledge base with each interaction Chow et al. [6]. Chatbot is situational, providing answers specific to the situations and environment of the query. It has the potential to improve human interaction with machines, and NLP helps them understand human language more clearly and thus create proper and intelligent responses Alazzam et al. [7].

Thus, AI chatbots are software programs designed to simulate conversation with human users by utilizing ML and NLP techniques and applying them to a variety of applications (websites, mobile app or phone) especially over the Internet Lin et al. [8]. It is also a software application, with the help of natural language processing (NLP) and machine learning (ML), that stimulates human conversation in natural language via text, audio or/and video Xufei [9]. In summary, AI chatbot is basically a chatbot with ML and NLP capabilities that has been programmed to talk to customers about a company as if the customers were talking to a human agent.

ML and NLP are two branches of AI generating the chatbot. ML enables chatbots to go beyond pre-programmed responses Chan [10]. Instead of merely following a set script, ML allows chatbots to learn from the conversations they have, improving their responses over time. This results in a more natural, engaging interaction for the user, making it feel like one is talking to a human rather than a machine. In essence, ML is the powerhouse behind the growing sophistication of chatbots. It allows them to understand language nuances, recognize user intent, and predict future user behavior, enhancing their functionality and effectiveness. The NLP enables chatbots to comprehend human input and generate relevant, meaningful responses leveraging sophisticated NLP techniques, including sentiment analysis, entity recognition, and contextual understanding, to deliver human-like interactions that impress users McCabe [11]. That is, NLP understand natural human communication and respond to the user using a similar natural language. With ML and NLP, chatbots are set to become more human-like, intelligent, and integrated into our daily lives.

These intelligent chatbots extends beyond mere novelty and offer businesses a powerful tool for improving user experiences, enhancing customer service, improving operational efficiency, and unlocking deep customer insights. From handling routine inquiries to providing personalized recommendations, machine-learning chatbots are revolutionizing how businesses interact with customers. Thus, clients find chatbots as a friend and in some cases ease themselves with it. Chatbot being on a site can advance the client experience and make individuals visit the site consistently. However, building a machine-learning chatbot is not without its challenges. Developers must navigate issues such as data privacy concerns, the need for large volumes of training data, and the complexity of human communication. But these challenges can be successfully addressed with careful planning, ongoing testing, and continuous refinement.

In conclusion, Face-to-face interaction is no longer a requirement. ML powered chatbots have revolutionized customer service by acting as the first line of interaction and providing round-the-clock support. Their ability to handle a large volume of queries simultaneously and personalize responses enhances the customer experience. By leveraging these

chatbots, businesses can streamline their customer service operations and deliver efficient and effective support to their customers.

2. Review of Related Works

Customer service's support staff spend a lot of time in answering customers' questions, which can be cost-effectively answered by machines. The exhaustion felt by support staff, the wasted time in answering questions, and the difficulty in supporting 7x24 services contributed to the aggravation of this problem led to the development of chatbot systems Cui et al. [12]. Chatbots are being embraced by a diverse range of companies, from multinational corporations to nimble startups, spanning various industries. Powered by advanced technology and natural language processing, chatbots adeptly handle an array of customer queries, spanning from basic FAQs to intricate problem-solving scenarios. A number of selected studies that are achieved in the past few years are reviewed and explained below.

Lalwani et al. [13], designed a college chatbot system using a Rule-based system. The college chatbot aims to remove this difficulty by providing a common and user-friendly interface to solve queries of college students and teachers. The chatbot provides fast and efficient search for answers to the queries and gets the relevant links to their question. Its architecture integrates a language model and computational algorithm to emulate communication between a human and a computer using natural language.

Likewise, Dharani et al. [14] developed a rule based Interactive Transport Enquiry chatbot that comes to a user's rescue when the user feels lost in a new place while travelling. The chatbot confirms the current location and the final destination of the user by asking a few questions, examines the user's query and extracts the appropriate entries from the database. Then the user gets all the information about the bus names along with their numbers so that the person can travel safely to the desired location. Alotaibi et al. [15] also designed a rule-based AI Chatbot for Tourism Recommendations for providing tourism recommendations in the city of Jeddah, Saudi Arabia

Erica, an AI-powered virtual assistant launched in 2018 was designed to assist customers with a wide range of banking-related tasks, including balance inquiries, transaction history, and even financial advice. With Erica, Bank of America customers can access information and complete transactions instantly, without having to wait for a human customer service representative. This not only improves the overall customer experience but also allows the company to handle a larger volume of inquiries and transactions in a shorter amount of time Bhanu [16].

Another effective chatbots developed in the past few years is SuperAgent Chatbot, a customer service Chatbot for E-commerce websites Cui et al. [12]. SuperAgent is an add-on extension engine that provides the customers with the best answer among a huge existing data source within a web page. SuperAgent leverages state-of-the-art NLP and machine learning techniques, including fact Quality Assurance (QA), Frequently Asked Question (FAQ) search, opinion-oriented text QA, as well as chat-conversation modeling. Usability analysis shows that SuperAgent has improved the end-to-end user experience in terms of online shopping. It is more convenient for customer's information acquisition especially when a product page contains too much user-generated content.

Other recent ML chatbots developed are MobileMonkey chatbot which offers an impressive range of tools that enable businesses to create engaging and conversion-optimized chatbots. Chatfuel is a chatbot used by businesses to automate responses to the most common customer inquiries, freeing up valuable time for support teams. Bold360 chatbot provides real-time insights to agents while simultaneously delivering a seamless customer experience. Drift chatbots engage potential customers, qualify leads, and even schedule meetings, reducing the workload of sales teams. Infact, it is best suited for sales and marketing Silk [17]. Sephora chatbot on kik is a machine learning-powered chatbot on the messaging app Kik. The bot offers a personalized shopping experience by asking users about their makeup preferences and providing tailored product recommendations Chan [10].

Customer service chatbots can be roughly categorized into two types: first-party and third-party Cui et al. [12]. First-party chatbots refer to conversation engines developed by large enterprises for their own business to improve customer service quality and reduce overall customer service budget. This often happens in consumer-driven industries such as banking, telecommunication and e-commerce. One example is the recently launched chatbot Erica from Bank of America, which helps customers with banking-related problems. Another example is the AT&T support chatbot that helps people answer FAQs related to different business questions. Third-party chatbots refer to open-source building blocks that help developers to build their conversation engines, such as Microsoft Bot Framework³, Facebook Messenger⁴, Google Assistant⁵, and Amazon Lex⁶. These chatbot makers, build and connect intelligent conversation engines to interact with customers naturally wherever they are. In addition, they are highly customized in terms of real scenarios with third-party data. SuperAgent can also be seen as a third-party chatbot because it utilizes publicly

available third-party data. Moreover, it improves the overall online shopping experience for various products in an e-commerce website.

3. Conceptual Framework

The key concept in the topic of discussion is Machine Learning (ML) chatbots and its impact in customer service and user experience. It is, however, important to begin the discussion with the clarifications of this concept in order to present a platform for articulation of our views on the subject matter.

3.1. Meaning of Machine Learning

The term machine learning was coined in 1959 by Arthur Samuel, an IBM employee and pioneer in the field of computer gaming and artificial intelligence. He invented a program that calculated the winning chance in checkers for each side Alzubi et al. [18]. Robert Nealey, the self-proclaimed checkers master, played the game on an IBM 7094 computer in 1962, and he lost to the computer.

Therefore, ML is defined as a discipline of artificial intelligence (AI) that provides machines the ability to automatically learn from data and past experiences to identify patterns and make predictions with minimal human intervention Kanade [19]. ML focuses on the development of computer algorithms that improve automatically through experience and by the use of data to imitate the way that humans behave, gradually improving its accuracy. At its core, machine learning is all about creating and implementing algorithms that facilitate these decisions and predictions. These algorithms are designed to improve their performance over time, becoming more accurate and effective as they process more data.

In simpler terms, machine learning enables computers to learn from data and make decisions or predictions without being explicitly programmed to do so Mitra [20]. In traditional programming, a computer follows a set of predefined instructions to perform a task. However, in machine learning, the computer is given a set of data and a task to perform, but it is up to the computer to figure out how to accomplish the task based on the data given as stated by Ayodele [21]. ML encompasses automatic computing procedures based on logical or binary operations that learn a task from a series of data. For instance, if a computer is to recognize images of trees, it is not provided with specific instructions on what a tree looks like, instead the computer is given thousands of images of trees and let the machine learning algorithm figure out the common patterns and features that define a tree. Over time, as the algorithm processes more images, it gets better at recognizing them even when presented with images it has never seen before. This ability to learn from data and improve over time makes machine learning incredibly powerful and versatile.

3.1.1. Types of Machine Learning

Machine learning can be broadly classified into three types based on the nature of the learning system and the data available: supervised learning, unsupervised learning, and reinforcement learning Mitra [20]

Supervised machine learning models are trained with labeled data sets, which allow the models to learn and grow more accurate over time Brown [22]. Thus, any discrepancy in the desired outcome is flagged as an error. This is popular when the inputs and the outcomes are predictable and known Mitra [20]. For example, an algorithm would be trained with pictures of dogs and other things, all labeled by humans, and the machine would learn ways to identify pictures of dogs on its own. Supervised machine learning is the most common type used today.

In unsupervised machine learning, a program looks for patterns in unlabeled data Brown [22]. It happens when the data is unknown and the machine will have to read data and take action based on the data. Unsupervised machine learning can find patterns or trends that people are not explicitly looking for. For example, an unsupervised machine learning program could look through online sales data and identify different types of clients making purchases. or 'finding a Chinese Restaurant near my home'. A mix of both Supervised and Unsupervised Learning is Semi-Supervised learning. Examples are voice recognition or face recognition.

In Reinforcement machine learning, the algorithm will work out different paths to achieve the result and then decide on the best path to maximize the award. It trains machines through trial and error to take the best action by establishing a reward system Brown [22]. Reinforcement learning can train models to play games or train autonomous vehicles to drive by telling the machine when it made the right decisions, which helps it learn over time what actions it should take.

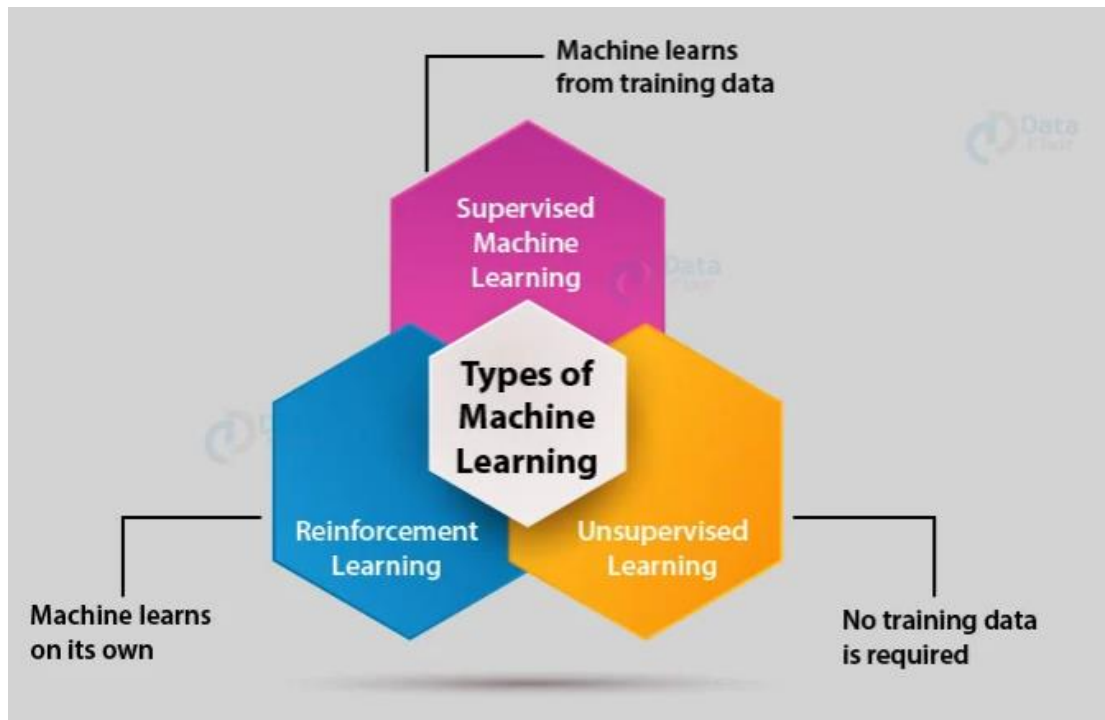


Figure 1 Types of Machine Language (<https://data-flair.training/blogs/machine-learning-tutorial/>)

3.2. Meaning of Chatbot

Chat is a medium of communication in which text and voice messages can be exchanged over computer networks, mobile networks, or the Internet. Chatting can be done between humans with each other, but can also involve an automated program that performs certain tasks according to given inputs, and such a program is called a chatbot Alazzam et al. [7].

The term “chatbot” was coined by Mauldin to describe systems that could mimic human interaction and thereby pass the Turing Test; an experiment crafted by Alan Turing in the 1950s to assess the intelligence of computer programs Jagdish et al. [23].

Chatbots has simple textual interfaces which allow users to retrieve information, make use of services, or provide service. It presents a new way for individuals to interact with computer systems. Traditionally, to get a question answered by a software program involved using a search engine, or filling out a form but a chatbot allows a user to simply ask questions in the same manner that they would address a human. In fact, the main idea behind the chatbots is that the computer is conducting a natural language conversation with human being Nahur [24].

Several scientists provide a simple definition of the Chatbot Chakraborty et al. [25]. They explained that it is a computer program developed to successfully perform conversations between human users and computer programs using the internet. Chatbots are designed to simulate conversations (or a chat) with users in a natural language via messaging applications, websites, mobile apps, or phone Irsath [26]. Although chatbot is an artificial conversation entity, AI enables it to respond like an intelligent entity through text, voice/ video and understand one or more human languages.

3.2.1. Types of Chatbots

There are two approaches that can be used to develop a chatbot depending on the algorithms and techniques adopted: rule-based approach and machine learning approach Xufei [9].

Rule-based Chatbot

A rule-based chatbot processes information and provides responses based on a set of predefined rules with the use of pattern matching/recognition algorithms. The pattern recognition occurs when chatbots identify certain words, phrases or even actions that trigger an entire set of responses Jagdish et al. [23]. The pattern and response matching algorithms are handcrafted. Pattern matching is adopted by many chatbots and is especially popular among the early

chatbots like ELIZA, PARRY, and ALICE Xufei [9]. The benefit of rule based chatbot is that they are precise, its response time is very fast as it does not require any deep analysis of the input text and allow developers to create and remove rules to handle new situations and address bugs with certainty. However, the responses are repeated and lack flexibility and originality as the knowledge is set by the developer in advance. A simple example is to chain IF-THEN-ELSE statements with predefined answers as seen below:

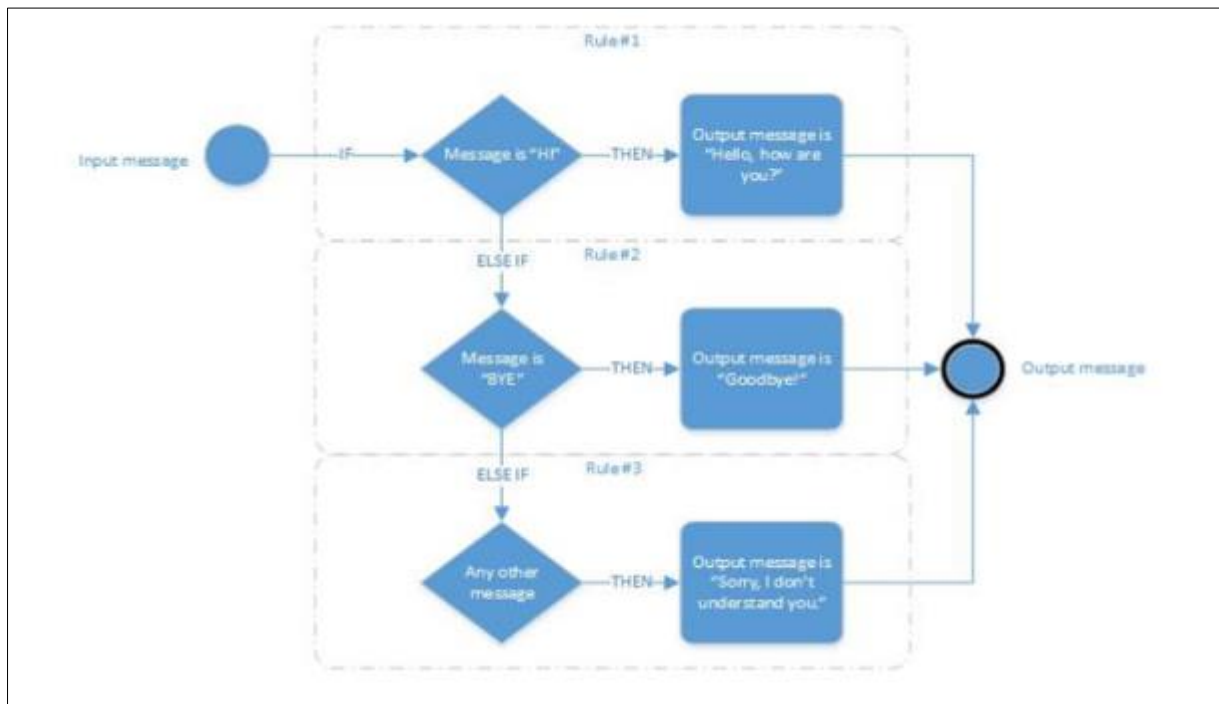


Figure 2: Structure of a Rule based chatbot (Horizonte [27])

Machine Learning Chatbot

The recent advancement in machine learning has made it possible to develop more intelligent chatbots. Chatbots that adopt machine learning approaches use machine learning algorithms to extract information and generate responses and are able to improve through previous conversations. That is, it is the method of data analysis which automates analytical model building by learning from data, patterns and make the decision appropriately without human intervention but learns how to respond to the user by analyzing the previously given responses Nahur [24].

An extensive training set is required for machine-learning-based chatbots. Two types of models can be used, retrieval or generative. Retrieval-based models involve choosing the optimal response from a set of responses, and generative models, on the other hand, use deep learning techniques to generate the response Xufei [9].

Therefore, design of chatbots went from a rule-based pattern matching and simple “Q&A” style to a more human-like way of carrying out and continuing conversations. This showed that advanced chatbots are expected to not only answer questions but also learn and improve themselves with each conversation, and eventually be able to respond appropriately in various contexts Prissadang et al. [28].

3.2.2. How ML Chatbot works

According to Nahur [24], Message can be sent to the chatbot through the presentation layer. The presentation layer for chatbot can be web, Facebook messenger, Slack, WeChat, Skype etc. Using the Natural Language Processing, chatbot system convert text into codified command for itself. Then these commands are sent to Decision Engine to find out the appropriate answer to user’s query. The array of responses goes back to Messaging Backend and it is presented to the user in the form of questions. All these questions and answers are stored in the Custom Data Source for training the data to make Chatbot more robust and accurate.

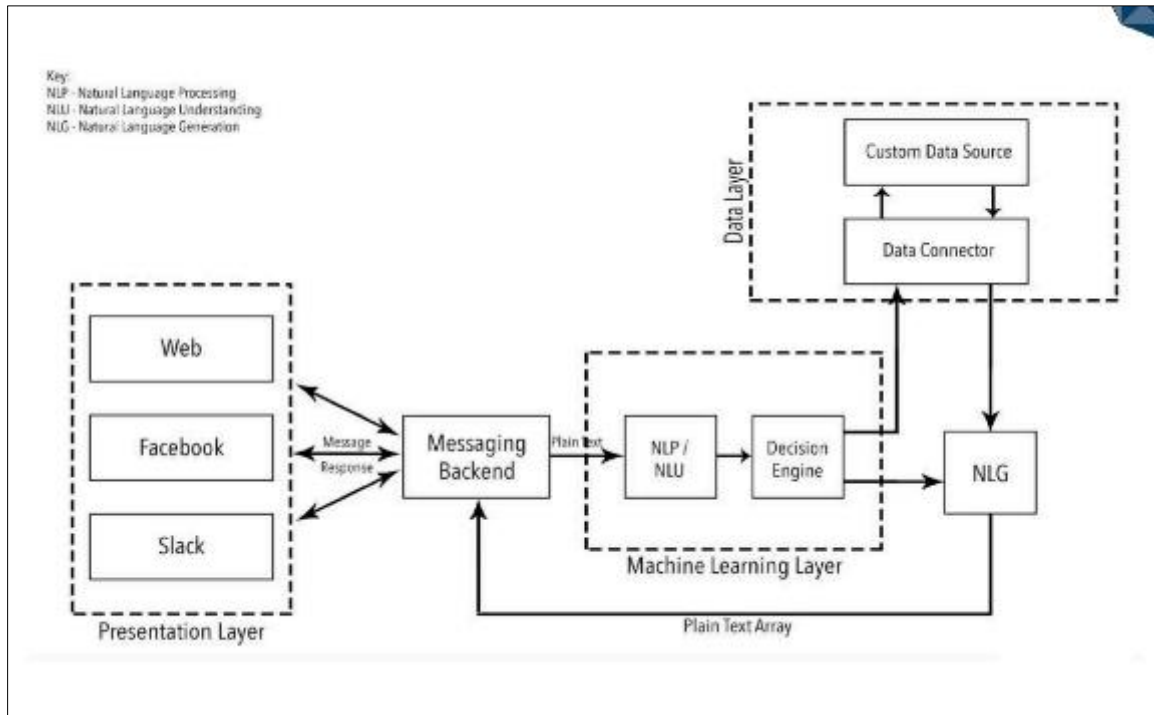


Figure 3 Architecture Overview of ML Chatbot System (Nahur [24])

3.2.3. Ways in which ML is Used in Chatbots

- Machine learning is a game-changer in chatbots, enabling them to learn from past interactions and improve their responses over time. According to Chan [10], Machine learning is used in chatbot through the following ways:
- **Natural Language Processing:** Machine learning algorithms help chatbots understand and process human language as it is spoken or written. This includes understanding syntax, semantics, and even slang or misspellings, allowing the chatbot to comprehend the context and intent behind user queries.
- **Learning from Interactions:** Every user interaction with a chatbot is a learning opportunity for the bot. Machine learning enables the chatbot to analyze these interactions, identify patterns, and use these patterns to enhance future responses.
- **Predictive Capabilities:** Machine learning also empowers chatbots with predictive abilities. A chatbot can predict likely user queries or actions by analyzing historical data and proactively providing relevant information or suggestions.

3.2.4. Benefits of Using Machine Learning in Chatbot Development

- Incorporating machine learning into chatbot development comes with a host of benefits. Chan [10] went on to mention the following benefits of using machine language in chatbot development as follows:
- **Improved User Experience:** Machine learning enables chatbots to provide more accurate, personalized responses, leading to an improved user experience.
- **Efficiency:** With their ability to learn and improve, machine learning-powered chatbots can handle a large volume of queries simultaneously, delivering instant responses and thus increasing efficiency.
- **Cost Savings:** By automating tasks traditionally handled by human agents, machine-learning chatbots can lead to significant cost savings.
- **Scalability:** As a business grows, a machine-learning chatbot can easily scale to handle increased traffic, ensuring consistent customer service.

3.3. The Evolution of Customer Service

To truly grasp the significance of ML in customer service, it is imperative to trace the evolution of customer support itself. From the early days of face-to-face interactions to the advent of call centers and the subsequent shift to digital communication channels, customer service has undergone profound changes over the years. The emergence of e-commerce and online platforms has further accelerated the transformation of customer support practices.

According to Wasif & Noman [29], AI technologies particularly chatbots and virtual assistants, have gained prominence in customer service due to their ability to provide instant responses, automate routine tasks, and deliver personalized interactions. These technologies leverage Natural Language Processing (NLP), machine learning algorithms, and speech recognition to understand and respond to customer inquiries effectively.

3.3.1. Benefits of ML powered Chatbots in Customer Service

ML chatbots offer numerous benefits in enhancing the customer service experience. In today's fast changing digital world, businesses are constantly looking for ways to improve customer engagement and streamline their operations. According to Wasif & Noman [29], ML powered chatbots offer various benefits in customer service, including cost savings and 24/7 availability. Other benefits include:

Enhancing Customer Engagement

ML chatbots provide a personalized and interactive experience to customers, enabling businesses to engage with them effectively. These intelligent bots are equipped with advanced algorithms that can analyze customer data and understand their preferences and behavior. By leveraging this information, chatbots can offer tailored recommendations and suggestions, increasing customer engagement and driving sales. For example, if a customer is looking for a specific product, the chatbot can provide personalized recommendations based on their previous purchases or browsing history. This level of personalization enhances the overall customer experience and fosters long-term customer relationships.

Furthermore, ML chatbots are designed to mimic human conversation, making the interaction more natural and engaging. They can understand and respond to customer queries in a conversational manner, providing a seamless and enjoyable experience. This not only enhances customer engagement but also creates a positive brand image, as customers perceive the business as responsive and customer-centric.

Reducing Response Time

One of the key advantages of ML chatbots is their ability to provide instant responses to customer queries, significantly reducing response time. In traditional customer service setups, customers often have to wait in long queues or on hold for extended periods before getting assistance. This can be frustrating and lead to a poor customer experience.

With ML chatbots, however, customers can receive immediate assistance without any delays. These chatbots are programmed to understand and analyze customer queries, providing accurate and relevant responses in real-time. By automating the initial stages of customer interaction, chatbots minimize delays and ensure that customers receive timely assistance. This not only improves customer satisfaction but also allows businesses to handle a larger volume of customer queries efficiently.

Streamlining Customer Service Operations

AI chatbots play a crucial role in streamlining customer service operations. By handling routine and repetitive tasks, these bots free up human agents to focus on more complex issues. This leads to greater operational efficiency and productivity.

For instance, ML chatbots can handle tasks such as answering frequently asked questions, providing product information, or assisting with order tracking. By automating these tasks, businesses can reduce the workload on their customer service teams, allowing them to allocate their time and resources more effectively. This not only improves the overall efficiency of customer service operations but also ensures that customers receive prompt and accurate assistance.

In addition to streamlining operations, ML chatbots can also assist in collecting and analyzing customer data. These bots can gather information about customer preferences, buying patterns, and feedback. By analyzing this data, businesses can gain valuable insights into customer behavior and preferences, enabling them to make informed decisions and improve their products and services accordingly. This data-driven approach not only enhances the customer experience but also helps businesses stay competitive in the market.

In conclusion, ML chatbots offer a range of benefits in customer service. From enhancing customer engagement to reducing response time and streamlining operations, these intelligent bots have revolutionized the way businesses interact with their customers. As technology continues to advance, ML chatbots will only become more sophisticated, enabling businesses to deliver exceptional customer service and drive growth.

3.4. Challenges of ML Chatbots in Customer Service and their Solutions

Despite the benefits of AI chatbots, there are also some challenges and risks. Challenges such as technical limitations, user acceptance, and ethical or regulatory concerns related to data privacy and bias must be addressed for successful implementation Wasif & Noman [29].

3.4.1. Technical Challenges

Although ML has immense potential in customer service, it is not without its technical challenges. ML chatbot systems may experience some technical issues, such as bugs, glitches, or downtime, that can disrupt the service and frustrate the customer. ML powered chatbots may struggle with understanding complex queries, handling ambiguous language, and providing accurate responses in all scenarios. That is, they may lack the human touch and empathy to understand the customer's emotions, tone, or intent, and may not be able to respond appropriately or empathetically. Chatbots may also be unable to handle complex or sensitive complaints, disputes, or emergencies, and may need to escalate the issue to a human agent, which can affect customer trust, satisfaction, and loyalty. To overcome this challenge, problem solving tools and techniques such as design thinking, root cause analysis and Strength, Weaknesses, Opportunities and Threats (SWOT) analysis should be employed.

3.4.2. User Acceptance

The success of ML chatbots in customer service depends on user acceptance and trust. Many customers may resist it or be skeptical of it. Therefore, strategies for gaining user acceptance and building trust must be examined, including user education and interface design.

4. Regulatory Compliance

The use of ML chatbots in customer service must adhere to various regulatory frameworks, including data protection and consumer rights laws. ML chatbots may raise some ethical and legal questions, such as how to protect the customer's privacy and data, how to ensure the chatbots transparency and accountability, and how to comply with the relevant regulations and standards. These issues must be carefully considered and managed to avoid potential lawsuits, fines, or penalties. Therefore, businesses must meet the compliance requirements and their implications for the adoption of ML powered chatbot in customer service

5. Conclusion

ML plays a vital role in the evolution of chatbots, transforming them from simple rule-based systems to intelligent virtual assistants capable of understanding and responding to complex user queries. ML algorithms enable chatbots to learn from past interactions, continually improve their performance, and deliver highly personalized experiences. By utilizing advanced algorithms such as Natural Language Processing (NLP) algorithms, these chatbots can analyze customer inquiries and provide personalized and timely responses, which can lead to increased customer satisfaction and retention. Additionally, chatbots can handle a large volume of inquiries simultaneously, making the customer service process more efficient and effective. Through continuous learning and improvement, these chatbots can adapt to changing customer needs and preferences, further enhancing the overall user experience. By incorporating machine learning technology into customer service, businesses can stay ahead of the curve and provide superior service to their customers. From handling routine inquiries to providing personalized recommendations, ML chatbots are revolutionizing how businesses interact with customers. Therefore, businesses should embrace the potential of ML chatbots and integrate it into business operations.

Recommendations

Based on the findings, it is recommended that stakeholders collaboratively establish the deployment of ML-powered chatbots, particularly in sensitive domains like retail, healthcare, banking and finance, education etc. More research should be made in the future trends of Chatbots like chatbots with enhanced emotional intelligence, Integration with IoT Devices, advancements in Deep Learning and Neural Networks etc.

Compliance with ethical standards

Disclosure of conflict of interest

No conflict of interest to be disclosed.

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