Original Article Artificial Intelligence for Customer Complaint Management

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Abstract - The primary goal of the proposed system in this paper is to improve the efficiency of customer complaint handling by automating the process, which analyzes complaints to identify patterns and provides quick and accurate responses by utilizing artificial intelligence techniques for improving products or services. The proposed system utilizes the natural language processing model, trained on a dataset of customer complaints, to understand and classify the complaints. Also, based on the classification, the system will provide appropriate responses to the complaints. The system will also analyze the complaints to identify common issues and patterns and make suggestions for improving products or services to improve customer experience. The proposed system is also evaluated on a dataset of customer complaints, and the results will be compared to traditional complaint-handling methods. The evaluation metrics include measuring the accuracy in classifying complaints, the time taken to respond, and the satisfaction level of the customers with the responses provided. In conclusion, the proposed AI-powered customer complaint handling system aims to improve the efficiency and effectiveness of complaint handling by automating the process and providing quick and accurate responses by analyzing complaints to identify patterns and make suggestions for improving products or services, which will lead to increased customer satisfaction.

Keywords - Artificial intelligence(AI), Natural Language Processing(NLP), Machine Learning(ML).

1. Introduction

Customer complaints are an inevitable part of any business, and effectively handling them is crucial for customer satisfaction and retention. Traditional complainthandling methods can be time-consuming, such as manual processing by customer service teams over phone calls, emails or ticket-handling systems. They may not provide accurate or efficient responses, which further leads to customer dissatisfaction or may result in losing customers. With the developments in AI and NLP, it is possible to develop an AI-powered customer complaint-handling system that can automate the process and provide accurate responses in a very short amount of time [8]. The primary goal of the proposed AI-powered complaint-handling system is to improve the efficiency and effectiveness of complaint handling-by automating the process and providing immediate responses.

Additionally, the system will analyze complaints to identify any patterns and make suggestions for improving products or services, leading to increased customer satisfaction and lower operating costs for the business. This paper presents a similar AI-powered customer complainthandling system's design, evaluation, and results. The system will be trained on a dataset of customer complaints which will use NLP techniques to understand and classify the complaints. Based on the classification, the system will provide appropriate responses or assign the complaint to the right department that can resolve it. The paper aims to provide a comprehensive understanding of the problem of customer complaints and their resolution. Moreover, it will explore the limitations of traditional methods and how an AIpowered complaint-handling system can overcome these limitations.

2. System Design

The proposed system is trained on a dataset of customer complaints collected from various sources such as social media, email, and the company's website, as per Figure 1. The dataset will be preprocessed to remove any irrelevant information, outliers or anomalies and will be annotated with the appropriate categories for the complaints.

The proposed system uses a combination of NLP techniques to understand and classification of customer complaints. These include:

- Language Modeling: The system uses a pre-trained language model to understand the context and meaning of the complaints.
- Sentiment Analysis: The system uses sentiment analysis techniques to determine the emotional tone of the complaints, whether positive, negative, or neutral.
- Text classification: The system uses text classification

techniques to assign the complaints to predefined categories, such as credit card, mortgage or debt collection.

- Natural Language Generation: Based on the classification, the system uses NLP techniques to generate personalized responses to complaints. These responses will be able to address the customer's concerns and provide a solution if one is available.
- Data Mining and Machine Learning: The system uses data mining and ML techniques to analyze complaints and identify recurring issues or patterns. This can be implemented by using classification techniques such as clustering, association rule mining, decision tree

learning and anomaly detection.

• Escalation: If the system is unable to provide a resolution to the complaint, it will escalate it to the right department.

The system architecture is designed to handle a large volume of complaints, classify them accurately, provide appropriate and personalized responses, and give insights to the company to improve its products or services. Overall, the proposed system will be able to improve the efficiency and effectiveness of complaint handling, as well as increase customer satisfaction.



2.1. Natural Language Processing Techniques used for Understanding and Classifying Complaints

In the system design section, the use of several natural language processing (NLP) techniques to understand and classify customer complaints are described [8]. These techniques include:

- Language Modeling: The system will use a pre-trained language model to understand the context and meaning of the complaints. A pre-trained language model is a model that has been trained on a large dataset of text and can be fine-tuned on a smaller dataset of customer complaints. This will allow the system to understand the context and meaning of complaints, even if they are written in colloquial or informal language.
- Sentiment Analysis: Sentiment analysis is the technique of identifying the emotional tone based on text. The system uses sentiment analysis techniques to determine whether a customer complaint is positive, negative, or neutral.
- Text classification: Text classification is the technique of assigning a predefined classification to text. The system will use text classification techniques to assign customer complaints to predefined categories, such as product defects, service issues, or billing concerns. This will help the system understand the complaints' main issues and provide an appropriate response.

These NLP techniques will be used together to analyze customer complaints, understand the context and emotional tone and assign them to the appropriate category. This will allow the system to respond appropriately to customer complaints.

2.2. Data Mining and Machine Learning Techniques used for Identifying Patterns and Making Suggestions for Improving Products or Services

In the system design section, I mentioned that the proposed AI-powered complaint-handling system uses data mining and ML techniques to analyze customer complaints and identify common issues and patterns. These techniques include:

- Clustering: Clustering is a technique used to group similar data points together. The system will use clustering techniques to group similar complaints together based on their content. This will help the system identify common complaints and patterns, such as recurring product defects or service issues.
- Association rule mining: Association rule mining is a technique used to identify relationships between variables in a dataset. The system will use association rule mining techniques to identify relationships between different complaints and the products or services they pertain to. This will help the system to identify which

products or services are causing the most complaints and make suggestions for improving them.

- Decision Tree Learning: Decision tree learning is a technique used to create a model of decisions and their possible consequences. The system will use decision tree learning techniques to create a model of how different complaints are related to specific products or services and how different products or services are related to specific issues or patterns. This will help the system to identify which products or services are causing the most complaints and make suggestions for improving them.
- Anomaly Detection: Anomaly detection is a technique to identify outliers in the dataset which deviate significantly from the expected behavior. The system will use anomaly detection techniques to identify complaints which deviate from the normal patterns and provide suggestions for improving the products or services.

These data mining and machine learning techniques will be used to analyze customer complaints, identify common issues and patterns, and make suggestions for improving products or services. This will help the company to prevent similar complaints from occurring in the future and improve customer satisfaction.

3. Literature Review

Artificial intelligence (AI) has recently been increasingly used in customer service and complaint handling. A literature review of AI-powered customer complaint-handling systems shows that these systems can potentially improve efficiency and customer satisfaction. The conventional state of customer complaint handling systems consists of methods used to handle customer complaints, such as call centers, email, and social media. It faces some challenges and limitations of these systems, such as high costs, long wait times, and poor customer satisfaction [10][11].

One study proposed an AI-powered customer complaint handling system which uses a combination of NLP and ML techniques to classify customer complaints and provide appropriate responses was validated on another dataset of customer complaints and achieved an accuracy of 89.4% [5].

Another study proposed an AI-powered customer complaint-handling system that uses NLP and deep learning techniques to understand and classify customer complaints. The system was also able to provide appropriate responses to the complaints. The authors of the study reported that the system was able to handle complaints more efficiently and effectively than traditional methods [3]. A third study proposed an AI-powered customer complaint-handling system that uses NLP and sentiment analysis techniques to understand and classify customer complaints. The system was also able to provide appropriate responses to complaints and make suggestions for improving products or services. The authors of the study reported that the system was able to handle complaints more efficiently and effectively than traditional methods [4]. Other papers also proposed similar AI-powered customer complaint-handling systems. They used different techniques, such as: proposing a customer complaint-handling system that combines NLP, deep learning, and sentiment analysis to classify complaints and provide appropriate responses [1]. Another study proposed an AI-powered customer complaint-handling system that uses NLP and sentiment analysis to classify complaints and provide appropriate responses [7]. Another study proposed an AI-powered customer complaint-handling system that uses NLP, machine learning and deep learning to classify complaints and provide appropriate responses [2].

Overall, the literature suggests that AI-powered customer complaint-handling systems can potentially improve efficiency and customer satisfaction. These systems use NLP and machine learning techniques to understand and classify customer complaints and provide appropriate responses. Additionally, the systems can analyze complaints to identify patterns and make suggestions for improving products or services. The potential future developments in AI-powered customer complaint handling systems, such as the use of virtual agents and chatbots. It would also consider the potential implications of these systems on the overall customer experience and the businesses and organizations that implement them [12][13]. This would include both successes and failures and would provide insight into the challenges and considerations involved in implementing such systems [14][15].

4. Evaluation

4.1. Methodology

To evaluate the proposed AI-powered complainthandling system, a dataset of customer complaints will be used. The system will be trained and tested on this dataset. The system's performance will be measured using metrics such as accuracy of classification, response time, and customer satisfaction level Figure 2. The system will also be compared to traditional methods of complaint handling using the same dataset [16].

4.1.1. Metrics

- Accuracy of classification: The system's ability to correctly classify complaints into predefined categories will be measured as the percentage of complaints correctly classified by the system.
- Response time: The time taken by the system to analyze and provide a response to the complaint will be measured as the time elapsed between the complaint being submitted and the response being provided.

- Customer satisfaction level: The level of customer satisfaction with the responses provided by the system will be measured through a survey, where customers will rate their satisfaction with the system's responses on a scale.
- Comparison: The performance of the proposed system will be compared to traditional methods of complaint handling using the same dataset. Traditional methods include manual processing by customer service teams

and rule-based systems. The comparison will be based on the same metrics used to evaluate the proposed system.

The evaluation will provide an understanding of the proposed system's performance, limitations, and ability to overcome traditional methods' limitations. This will help to identify areas where the system can be improved.



Fig. 2 Process Flowchart

5. Results and Discussion

There are several benefits to integrating AI into Customer service, including:

- Improved efficiency and scalability: AI-powered customer service can handle a large volume of inquiries and requests in a shorter time, allowing companies to save on labor costs and improve customer response times. AI-powered customer service can handle an unlimited number of interactions, allowing companies to handle a larger customer base without the need for additional human agents using chatbots and text bots. Companies can invest in more complaint solvers than complaint takes and increase their revenue. This will also save millions of dollars for companies which they spend on solving customer complaints via calls.
- Better accuracy: AI-powered customer service can provide more accurate and consistent answers to customers' questions, leading to increased customer satisfaction. Along with that, there is more customer retention rate which can help companies to raise their profit.
- Personalization and better experience for customers: AIpowered customer service can provide a more personalized experience for customers by analyzing their past interactions and providing tailored responses. An average American spends more time texting than calling.
- Predictive analytics: AI-powered customer service can use data from customer interactions to identify patterns and predict future customer needs, allowing companies to proactively address potential issues [16].

6. Conclusion

The proposed AI-powered complaint-handling system is designed to improve the efficiency and effectiveness of complaint handling-by automating the process and providing quick and accurate responses. The system utilizes a combination of NLP, data mining, and ML techniques to analyze customer complaints, understand the context and emotional tone and classify them into the appropriate category. Based on the classification, the system generates personalized responses to the complaints, which addresses the customer's concerns and provides a solution.

Additionally, the system also analyzes complaints to identify common issues and patterns and make suggestions for improving products or services to the company. This will help the company to prevent similar complaints from occurring in the future and improve customer satisfaction. The system is trained on a dataset of customer complaints collected from various sources such as social media, email and the company's website. If the system is unable to provide a resolution to the complaint, it will escalate the complaint to the right department. Overall, there are many opportunities for future research in the field of AI and customer service, which can help businesses to improve their sales and lead generation efforts and gain a deeper understanding of their customers.

The proposed AI-powered complaint-handling system benefit companies and customers potentially can significantly. For companies, the system can help to improve the efficiency and effectiveness of complaint handling, leading to cost savings and increased productivity. The system's ability to analyze complaints and identify patterns and common issues can also provide valuable insights for companies to improve their products or services, leading to increased customer satisfaction and retention. For customers, the proposed system can provide quick and accurate responses to their complaints, leading to increased satisfaction and a sense of being heard and understood. The system's ability to personalize responses can also help to build customer trust and loyalty.

Additionally, the system's ability to identify and address common issues can lead to improved products and services, which benefits all customers. Overall, the proposed system has the potential to enhance the customer experience, increase customer satisfaction, and improve the efficiency and effectiveness of complaint handling for companies. Additionally, the insights and suggestions provided by the system can help companies to improve their products or services and prevent similar complaints from occurring in the future.

Overall, the proposed AI-powered complaint-handling system has the potential to revolutionize the way companies handle customer complaints. By automating the process and providing quick and accurate responses, the system can improve the efficiency and effectiveness of complaint handling, leading to cost savings and increased productivity for companies. Additionally, the system's ability to analyze complaints and identify patterns and common issues can provide valuable insights for companies to improve their products or services, leading to increased customer satisfaction and retention. The proposed system also has the potential to enhance the customer experience by providing quick and accurate responses to their complaints, leading to increased satisfaction and a sense of being heard and understood. The system's ability to personalize responses and identify and address common issues can also help build customer trust and loyalty. However, there are also some limitations to the proposed system, and further research could be conducted to improve its performance. For instance, the system could be further fine-tuned to improve its accuracy in classifying complaints and generating personalized responses. Additionally, the research could be conducted to evaluate the system's performance in different industries and with different types of complaints.

In conclusion, the proposed AI-powered complainthandling system has the potential to revolutionize the way companies handle customer complaints and improve customer satisfaction. Further research and development could be conducted to improve the system's performance and adapt it to different industries and types of complaints.

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