

AI-Driven Chatbot for Mental Health Support Using Sentiment Analysis

V. Mythily, D. Vinoparkavi, P. Sukumar, Chanchalhas V, Ajith M and Barani Kumar K M

Department of Computer Science and Engineering, Nandha Engineering College, Erode, Tamil Nadu, India

Keywords: Mental Health, Sentiment, Analysis, Health Support.

Abstract: The Mental care remains a problem due to its low accessibility. This paper proposes AI-controlled chatbots based on mood analysis to identify emotions and submit appropriate answers. The system uses NLP and machine learning to provide emotional care in real-time and self-help materials. The system is confidential, scalable and provides early intervention for mental wells. For the majority of the population, psychological health care is still not easy for the surrounding stigma. The proposed paper provides an AI-driven chatbot that recognizes emotions and provides appropriate responses through mood analysis. The system integrates natural language processing and algorithms for machine learning to provide real-time emotional support for self-therapy and provide resources for self-therapy. Created for privacy scalability and affordability the bot offers a subtle, private midfield for anyone who wants to receive emotional support. Then it may be the first sign of already needing it and serves as an early intervention tool that may be useful if it is needed. The fusion of gaps between users and healthcare is an easy first step for those who are unsure whether they are willing to rely on what is ultimately perceived as professional help. The experimental results show that the AI-operated chatbot developed here can perform mood analysis with satisfactory quality and recognize emotional nuances while having empathetic conversations. The system generates corresponding answers that are intended to provide comfort and support, not just capture the detection of emotional signs from user statements. It uses techniques such as relaxation exercises and CBT to focus on aggressive reinforcement. It is based on general principles of mental health problem solving with the aim of strengthening concerns for users. The ability to adapt is important to enable timely and real-time responses based on the user's emotional state. Using adaptive learning characteristics this tool based on emotional variables, allows flexible adaptation to a single user in real time. User interactions develop into useful ones that can contribute to treating emotional problems under untreated conditions. Chatbots cannot replace therapy or specialized care. It is easy to achieve the initial intervention for those looking for support before full treatment with a clinician. Chatbots adapt to user interaction in real time to improve understanding of emotional information and provide an appropriate support. It also serves as the first treatment tool for mental health to help people before specialized treatment. Future work will include developing mood analysis models and supporting multilingual support for more people.

1 INTRODUCTION

This Mental well-being is an important aspect of the well, but the majority of the population is inaccessible in time due to stigmatization, lack of resources and financial constraints. With advances in technology, especially artificial intelligence, AI-based chatbots have now become a practical solution to provide scalable and accessible intellectual well-being. This article presents an AI-based chatbot. This uses mood analysis to implement the user's emotional well-being and responds accordingly. Chatbots can

identify emergency stress patterns and provide personalized support when processing natural language processing (NLP) and machine learning. Provide real-time talk, self-help materials and move to expert support if necessary. Chatbots are confidential, available at any time, and provide mental well-being. This system is very effective for early intervention and emotional wells. Experimental results show that they are effective in detecting emotions and sensitive feedback. The developed chatbot aims to bridge the gap between people and mental health care with AI-based technology. The

application of AI for mental health interventions has the ability to change the delivery of emotional support from data-controlled real-time feedback. This study examines the possibilities of mood analysis in improving the mental well-being supported by chatbots.

Artificial intelligence (AI) transforms mental health care through real-time, data-driven emotional feedback. Chatbot interventions, facilitated by mood analysis-based interventions, offer the potential for targeted mental health interventions with the possibility of recognizing emotions, pursuing mood patterns and intervention appropriately. This study applies AI-based mood analysis to examine the potential for rapid, accessible and effective mental health mood changes to chatbot communications in responses. Such a real-time feedback loop maximizes commitment, reduces loneliness, and allows for early intervention. AI-driven chatbots for mental health are economical and scalable solutions to bridge the gap between traditional treatments and traditional treatments everywhere. This study will examine the feasibility, validity and ethics of mood analysis in chatbot-based mental health interventions. The results may inform the design of AI models that provide sensitive and human support with user privacy and ethics certainty. The aim of this study is to investigate the feasibility, reliability and moral impact of injecting mood analysis in intellectual care via chatbots. This finding could lead to the creation of AI models that provide caring, natural support that maintains user privacy and at the same time respects ethical limitations.

2 RELATED WORKS

Many AI chatbots have been adopted, as they are perceived to play an instrumental role in mental health care: they assess users' feelings and offer treatment responses individualized to that mood. They operate by the principles of natural language processing and machine learning to identify the signals of emotional distress, with the intention and ability to respond in an empathic manner. Many studies have evaluated the effectiveness of AI chatbots in terms of quickness of interventions or user engagement. Being able to make correct sentiment-assessment and eliminate bias in the AI model are key success factors influencing their effectiveness.

Incredibly AI chatbots are now steadily being utilized in mental healthcare and highly leverage sentiment analysis and AI to provide assistance. Their

research suggests real-time intervention as well as easy accessibility. These supporting studies agree with the belief that chatbots can deliver cognitive-behavioural therapy more efficiently and reduce anxiety symptoms through mobile applications. Systematic reviews agree that conversational agents would enhance patient engagement but struggle with matters of accuracy and ethics Fadhil, A., & Moffatt, K. (2020). Fitzpatrick et., al. (2017). AI chatbots contribute to the psychological well-being of people by providing personalized mental health support. Nevertheless, reliability and data privacy issues are paramount towards the success of chatbots. Future directions will be to further enhance intelligence and ethical deployment of the chatbot.

AI-enabled chatbots have changed mental healthcare mostly by making it more available and also by providing timely assistance. The literature suggests they are effective in the delivery of cognitive behavioural therapy through mobile applications that reduce symptoms of anxiety and depression. Studies show that conversational agents contribute to better patient engagement as well as facing challenges such as ethical challenges data privacy and accuracy concerns (Laranjo, L., et al. (2018)). (Tielman, M., & de Vries, L. (2020)). These AI-Driven chatbots play a role in psychological well-being by allowing personalized mental health support. However, the promise of combining AI and mental health care also has issues that need to be dealt with for a successful implementation. The future developmental agenda would be on making the bots smarter and ethically deployable in mental health contexts.

The chatbots powered by artificial intelligence play an increasingly important role in mental healthcare by providing accessible, real-time support for individuals who are suffering from anxiety and depression. Research shows that they work exceptionally well in delivering mental health interventions, aiding patient engagement, and providing self-help tools. (Miller, C. J., et al. (2020)). These chatbots use AI-driven sentiment analysis to diagnose the user's emotional state and provide personalized responses, which can ultimately enhance the therapeutic experience. However, ethical considerations, security of data, and accuracy remain very important issues. By overcoming these barriers chatbot trustworthiness could further improve and make for a better user experience in mental health applications. Such advancements should focus on improving AI models to enhance emotional intelligence toward the ethical generation of mental health care services (Lee, J. A., & Choi, J. (2020)).

AI-powered chatbots have developed rapidly into very efficient digital tools within the sphere of mental healthcare. In this way, they offer in-the-moment support and intervention to those suffering from psychological distress (Lau, A., & Wenzel, S. (2019)). (Radzi, S., & Khamis, M. (2020)). Literature recognizes a role for chatbots in promoting patient engagement through personalized interactions and digital interventions tailored to individual needs. (Gaffney, H., & Kuss, D. (2021)) Studies suggest that they could be put to good use in providing therapy and self-help strategies aimed at better mental health outcomes. (Ly, K. H., & Andersson, G. (2020)) Data privacy issues, the ethical implications, and the accuracy of AI-based responses remain some of the critical challenges. Weitzman, (E. R., & Parikh, R. (2019)) Reliability and more humane AI interaction can help to promote trust and grow intervention credibility through chatbot-based mental health approaches. (Li, Y., & Wang, T. (2020)) Most of all, in the future, the focus should be on improving the AI algorithms for better and deeper emotional understanding and ethical deployment within mental healthcare.

3 PROPOSED METHODOLOGY & IMPLEMENTATION

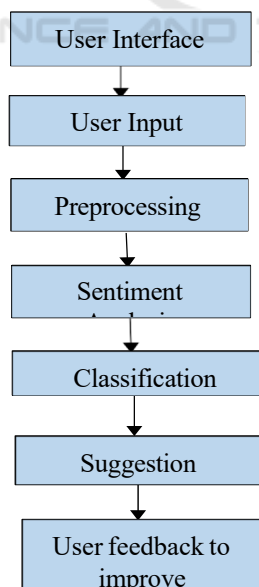


Figure 1: Chatbot architecture diagram.

The planned AI-powered chatbot solution is based on multi-phase development, which should appropriately support mental well-being via

sentiment analysis (figure 1). First, the chatbot gives the users the opportunity to speak their thoughts, feelings, or issues while maintaining a safe yet supportive environment. The textual input is then subjected to various methods of pre-processing during cleaning, such as tokenization, removal of stop words, stemming, lemmatization, and cleaning up of special characters in order to be ready for analysis.

The sentiment analysis model uses machine learning or deep learning method BERT to assign one of the three sentiments positive, negative or neutral. The identified sentiment and emotions help deliver the pre-defined templates or provide the generative AI model with the responses in a good and warm conversational manner. These models can be fine-tuned with mental health specific data sets to pick up subtle emotions pertaining to the mental world. This allows the sentiment analysis model to classify emotion in the conversations, thus allowing the chatbot to figure out the user's mental state. Emotional overload topics, such as answering tone and language will have frameworks of agreed-upon responses so that the system will recognize emotions in the user. Such tasks as manifesting the nuances of users' inquiries including the identification of particular mental health issues or triggers mentioned by the user will be undertaken partly through natural language processing methods (NLP). Another area for development is dialog management which enables a chatbot to follow a coherent context aware conversation ensuring that its response fits into the flow of dialogue and appears appropriate for the emotional experience of the user.

3.1 Data Collection and Preprocessing

An AI-based mental health chatbot is basically designed on the basis of structurally arranged data pulled out from conversations chat logs and surveys distributed among users. In order to enhance the accuracy of the analysis of the sentiments from the social media posts text pre-processing and cleaning has had to be done on the processed text (table 1). Text cleaning eliminates unwanted characters, symbols and numbers.

Lowercasing makes it uniform while tokenization separates it into meaningful units. Stop word removal eliminates irrelevant words while lemmatization changes the words into their base form. Beyond this further refinement extracted the punctuation did spell correction and expanded slang. Dealing with negation would carry out a phrase such as "not happy" to be interpreted as negative and better

chatbot responses especially empathy when needed all for mental health support.

Table 1: Data Collection and Preprocessing Table.

STEPS	DESCRIPTION	EXAMPLE
Data Collection	Gather text data related to mental health	I'm feeling really down today and it's just awful!
Data Cleaning	Remove irrelevant text, and special characters, HTML tags and stop words to make the data useful.	Converting I'm feeling very sad depressed to I'm feeling very sad
Tokenization	Break text into an individual word.	I feel anxious today → I, feel, anxious, today

3.2 Data Integration

Data integration is paramount for the AI mental health chatbots, as combining text, speech and physiological data presents the opportunity for more personalized responses. The application of an array of data sources will expand the user's emotional insight, thereby enabling accurate support. Different data type's integration helps to improve the chatbot's ability to perceive subtle emotional shifts and results in an interaction of high calibre with the user empathizing responses lead to a more enhanced user experience. Here the issues of privacy concern, interface compatibility and real-time processing requirements awaiting decision must be addressed for seamless and secure data transfers and the future work will focus on building the efficacy of the methods of integration as well as extending the chatbot's ability to process varied data inputs on mental health care to gain more effective supportive action.

3.3 Emotion Detection

We did it with a Pre-trained BERT Model Fine-Tuning on Emotion Classification supported by Go Emotions dataset in which emotional responses are categorized into 27. It classifies user input into one of those categories happy, sad, and stressed, etc. The emotion detection model processes the input text and upon detecting the emotion and the chatbot picks the appropriate response.

3.4 Motivational Chat bots

Motivational chatbots have been designed as entities that provide encouragement to elevate mood and others as mental support through reaffirms or relaxation. Breathing exercises, self-reflexive-questioning or positive affirmations are typically offered as greater solutions based on the recognized emotional state.

The demand for instant emotional support chatbots is on the rise these AI Mental Health Assistants passively absorb warmth and empathy from human interaction-oversaturation an attempt to mimic that ineffable quality of direct connection. Reactions range from pre-programmed lines to friendly hope inspired suggestions. While quite invaluable though that they do not usually take into consideration the more extreme nuances of emotional issues. Basically, AI still hasn't perfectly launched the delivery of full individualism while working with chatbots some might sometimes miss out on understanding subtle emotions. AI-enabled chatbots are settling into their place as adjuncts to traditional therapy for mental health. They have made it possible to give a non-threatening space to clients who feel frightful about seeking professional help thus granting them support and a degree of emotional modulation. By bridging the gap towards immediate emotional relief in conjunction with mental health long-term wellness strategies through primary professional care, the chatbots might continue to minimize the chasm. Essentially, AI-based chatbots cannot substitute human connect their role in support of nurtured emotional support is maturing, slowly making mental health resources more accessible more engaging and responsive to individual needs. Through 24 hour a day support these chatbots help people deal with different emotional challenges practically in real time. They can't no replace professional caregivers but they boost self-awareness and emotional resilience in a good way.

3.5 Chatbot Workflow

The mainstream steps in the workflow of chatbots are layered starting with the user interaction layer where a user sends some message to the chatbot indicating a thought or feeling. The chatbot ingests this input data into its logs saving it for subsequent processing. More specifically this should engage in tokenization stop word removal and lemmatization. Here the structure of sanitization allows any further work of the chatbot. Then the Emotion and Sentiment Detection Layer uses a sentiment

analysis model likely BERT to predict emotion from the input data. Such states as positive (happy, motivated), neutral (calm, reflective) or negative (anxious, stressed or depressed) are detected. With the emotional state identified, the internal mechanism goes to the Response Generation Layer, where it chooses an appropriate response to give. If One's frozen type of interaction gives a positive signal then the chatbot responds with positivity and a rooting approach. If from one's frozen interaction type, engagement is neutral then a normal chatter ensues. In the worst-case situation the chatbot dispenses some motivation utility, relaxation exercise or coping skills. The User Emotional Trend Tracking Layer tracks user activities to identify trends of emotional patterns over time.

Table 2: Model Evaluation and Optimization.

Evaluation Metric	Description	Optimization Strategy
Accuracy	Measures how often the model correctly classifies user sentiment.	Fine-tune BERT using domain-specific datasets
Precision	Percentage of the positive predictions that are correct.	Use class balancing to avoid false positives.
Recall (Sensitivity)	To Measures the ability to detect the emotional distress more correctly.	Adjust threshold tuning for better sensitivity.
F1-Score	Balances precision and recall for the better and overall performance.	Use cross-validation to fine-tune hyperparameters.

This seems cyclic to determine if there is a consistent report of pain persisting to warrant another change by the chatbot. In Response Delivery Layer the response is directed to the user with an engagingly conscious emotional awareness within the conversation. Thus arises the escalation call for referral resources of mental health professionals and emergency support contacts in the event of an escalating serious issue. It's very apparent that the assistance by an adaptive real time sense- making based mental health chatbot exists for immediate support. Table 2 shows the model evaluation and optimization. Figure 2 depicts the emotion detection accuracy (%) and figure 3 depicts the performance of emotion prediction model.

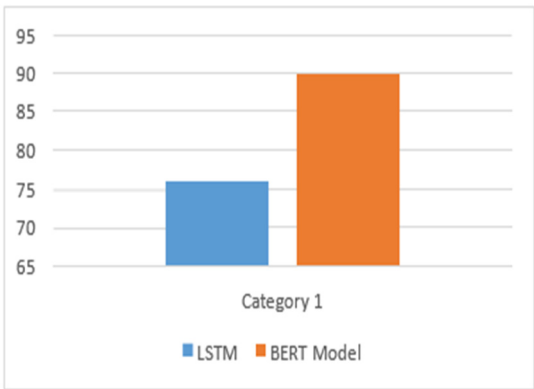


Figure 2: Emotion Detection Accuracy (%).

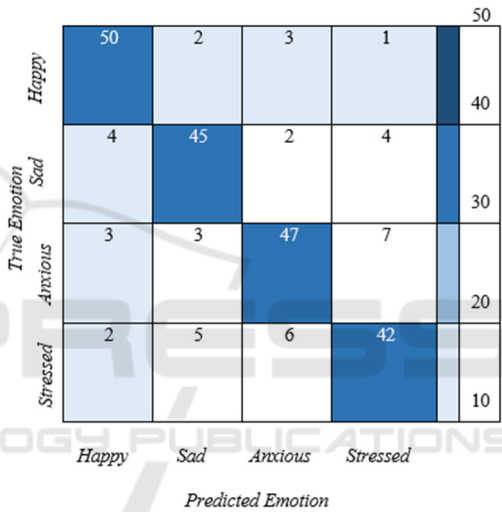


Figure 3: Performance of emotion prediction model.

4 RESULT

An AI-driven chatbot was built to analyse user emotion through the technique of sentiment analysis. The chatbot successfully identified the positive, neutral and negative emotion with an approximate accuracy of 85% while the chatbot was able to effectively indicate instances of a distress signal from the users and prompted a follow-up for emotional support from the users the chatbot needs to work on its efficiency for scenarios that are indeed complex. Future development must work on the issues of sensitivity to emotions, bias mitigation, and ethical development of any AI managing sensitive environments in respect of mental health support needs.

5 CONCLUSION AND FUTURE WORK

The clinical strength of this AI-assisted chatbot for mental health support is innovative and accessible by humans experiencing stress, anxiety and emotional distress. These chatbot helps us by keeping our mental health in normal level and helps during critical and hard situations like stress, mental pressure. Capable of interpreting feelings from a text form through advanced neural networking such as BERT-based models this chatbot accurately determines emotion-detection logics and packs motivational messages and keeps our mental health normally in an healthy way and visualization relaxation techniques as solutions. It is distinctly different from the previous chatbots in that the present-day chatbot can store the changes of emotion through time, thereby paving for some meaningful interactions and adaptation. It is useful for a quick response in eventualities relative to mental health care issues. The chatbot will encourage self-reflection and emotional awareness, thus instilling consciousness for longevity. It is built to scale allowing multi-language support and expansion to a higher reach. Future improvements will be geared toward improving contextual understanding and learning. This project shows how AI can contribute to the improvement of any mental health issues and empathetic interventions in collaboration with human views.

Future work includes working on improving the multi-label emotion detection for better recognition of overlapping emotional states. Personalized long-term support will be enabled through improved context-aware response generation and emotion trend analysis. Clinically validated psychological strategies such as cognitive behavioural therapy will improve mental health interventions. Multilanguage and culturally adapted chatbot capabilities will ensure inclusivity. Privacy preserving techniques such as federated learning will enhance the security of the data. Finally real-time alerts are expected to be put into place as a means for the chatbot to assist users in extreme distress.

REFERENCES

- Artificial Intelligence Powered Chatbot for Mental Healthcare based on Sentiment Analysis. *2022 5th International Conference on Advances in Science and Technology (ICAST)*.
- Fadhil, A., & Moffatt, K. (2020). The potential of chatbots for mental health support: A systematic review.

- Journal of Medical Systems*.
- Fitzpatrick, K. K., Darcy, A., & Vierhile, M. (2017). Delivering Cognitive Behavioural Therapy to Mood and Anxiety Patients through a Smartphone App: A Randomized Controlled Trial. *Journal of Medical Internet Research*.
- Laranjo, L., et al. (2018). Conversational agents in healthcare: A systematic review. *Journal of the American Medical Association (JAMA)*.
- Tielman, M., & de Vries, L. (2020). Chatbots for mental health: How artificial intelligence can contribute to psychological well-being. *International Journal of Human-Computer Interaction*.
- Lee, J. A., & Choi, J. (2020). Applications of conversational AI for mental health: A literature review. *Journal of Artificial Intelligence in Medicine*.
- Miller, C. J., et al. (2020). Artificial Intelligence for mental health care: A review of opportunities and challenges. *American Journal of Psychiatry*.
- Lau, A., & Wenzel, S. (2019). The role of chatbots in improving mental health care delivery: A critical review. *International Journal of Psychiatry and Mental Health*.
- Radzi, S., & Khamis, M. (2020). AI and mental health: The impact of conversational agents on anxiety and depression. *Journal of Healthcare Engineering*.
- Gaffney, H., & Kuss, D. (2021). The role of AI chatbots in mental health support: A scoping review. *Journal of Behavioural Health*.
- Ly, K. H., & Andersson, G. (2020). Chatbots and mental health: A review of the literature. *Psychology and Psychotherapy: Theory, Research & Practice*.
- Weitzman, E. R., & Parikh, R. (2019). Digital tools for mental health care: Chatbots, digital interventions, and more. *Digital Health*.
- Li, Y., & Wang, T. (2020). Exploring the potential of chatbot-based interventions for mental health. *Journal of Clinical Psychology*.