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Sentiment-Driven Medication Guidance

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Abstract: Healthcare is a critical component of the medical industry in the modern digital era, as consumers look for pertinent health information online. Although the internet is a great resource, consumers may find it difficult to get useful information due to the large amount of scattered clinical data across multiple websites. Sentiment analysis, machine learning, and natural language processing (NLP) are used by an advanced drug recommendation system to examine user opinions in drug-related content. After processing this data, machine learning algorithms customize recommendations based on user profiles and adjust to changing sentiments over time. In order to accurately evaluate sentiment in user evaluations, natural language processing (NLP) is essential for comprehending and contextualizing linguistic nuances. The amalgamation of quantitative and qualitative data yields highly customized and context-sensitive recommendations, thereby augmenting the user experience in its entirety. In this paper, a drug recommender system based on user-generated drug reviews sentiment analysis is presented. With an emphasis on filling the knowledge vacuum in sentiment analysis research related to healthcare, the system seeks to assist patients in choosing medications with knowledge.

Key words: Sentiment Analysis, Natural Language Processing(NLP), Machine learning

I. INTRODUCTION

The surge in coronavirus cases has led to a scarcity of doctors, particularly in rural areas where specialists are limited compared to urban regions. Considering that it takes a doctor six to twelve years to obtain the appropriate qualifications, the rapid growth of the physician workforce presents difficulties. Therefore, in light of this issue, it is essential to improve the telemedicine framework. The current research is an innovative attempt to transform the drug recommendation paradigm in the rapidly changing field of healthcare technology. This program seeks to provide a complex, context-aware system by combining the strengths of sentiment analysis[7], machine learning[2], and natural language processing (NLP) in a way that goes beyond traditional approaches. The fundamental idea is to comprehend and utilize the rich tapestry of user attitudes that are woven into drug-related content and are taken from a variety of sources, including social media, forums, and reviews[8]. Sentiment analysis interprets the complex range of user experiences and preferences, acting as the project's compass[]. Machine learning assumes control by using algorithms to dynamically process this sentimentrich data and modify and improve medication suggestions depending on the profiles of specific users[5]. The system adapts to changing user feelings by means of a continual learning mechanism, which guarantees a personalized and responsive healthcare experience. In addition, natural language processing (NLP) plays a critical role in deciphering the nuances of language in user reviews, guaranteeing a complex interpretation of sentiments that transcends simple quantitative measurements[3]. As the project develops, the combination of these technologies pushes the medication recommendation system into new domains, enabling it to comprehend user feedback both qualitatively and quantitatively[1]. By providing users with context-aware and tailored medication recommendations that go beyond the constraints of conventional recommendation systems, this all-encompassing method has the potential to provide a revolutionary healthcare solution[9]. The initiative aims to redefine user involvement through this novel confluence of technology and healthcare, ultimately improving the entire experience in the dynamic domain of pharmaceutical recommendations.

II. LITERATURE SURVEY

In 2023[1], it presents an intelligent disease prediction and drug recommendation prototype using machine learning algorithms. The model uses Multinomial Naive Bayes, Extra Tree Classifier, Decision Tree Classifier, and Support Vector Machine models, with an accuracy of 89.93%. Another approach In 2023[2], it explores the application of machine learning for sentiment analysis in drug reviews, a critical task for extracting insights from online data. Evaluating various algorithms and feature engineering techniques on a public dataset, the study demonstrates their effectiveness in accurately capturing sentiment, with high accuracy and F1-score. The findings have practical implications for healthcare professionals, providing valuable insights into patient opinions on drugs and aiding in drug development and regulatory processes.

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Also, In 2023[3], The paper uses natural language processing and machine learning techniques to analyze a large database of medication reviews, achieving high accuracy rates of 85.12% and 89.3%, providing valuable insights into consumer sentiments. In 2023[4], this study is to elevate categorization scores through the application of NLP and ML algorithms. Random Forest trained on CV, outperforming previous outcomes, attains an accuracy of 96.65% and an F1 score of 96.42%. These results offer significant insights into the healthcare domain. Also, in 2023[5], Online recommender systems, driven by Machine Learning, are increasingly vital in healthcare, aiding hospitals and patients with precise drug recommendations. As patients often seek online advice before consulting doctors, these systems offer accurate clinical predictions efficiently. During emergencies, they provide reliable information on medications, dosage, and side effects based on individual parameters. Decision trees, particularly effective, enhance the integrity and privacy of patient data, ensuring safe medication recommendations in urgent situations. Also, In 2023[6], The paper introduces novel approaches using patient reviews to predict sentiment and employs TF-IDF for feature extraction. Experimental results demonstrate that the Random Forest Classifier outperforms other models in terms of Precision, Recall, F1-Score, and achieves a notable accuracy of 93%. And In 2022[1], This paper proposes a medication recommendation system based on patient reviews, utilizing sentiment analysis for optimal disease-specific recommendations. Leveraging technical algorithms like LDA and PCA can enhance topic modelling, aiding in the investigation of medical history and preventing errors. In 2022[2], it introduces a novel sentiment analysis model based on Machine Learning algorithms. Stop words are used for data preprocessing, and count vectorization transforms text data into vectors for feature extraction. The sentiment (positive, negative, or neutral) is determined using the Random Forest (RF) classifier, offering accurate sentiment classification for users or industries requiring sentiment analysis. In 2021 [1], it explains about the surge in electronic data in healthcare has made accurate symptom research challenging. Machine Learning offers an efficient solution with Disease Prediction, a system that predicts diseases based on user-provided symptoms using algorithms and dataset comparisons. In 2021[2] It is an exploring explainable recommendation systems, this paper introduces a deep learning architecture employing LSTM and GRU methods for sentiment analysis in recommendation explanations. Evaluation on an Amazon dataset reveals superior performance compared to a state-of-the-art method.

III. DATASET

	A	В	С	D	E	F	G	н
1	uniqueID	drugName	condition	review	rating	date	usefulCour	ıt
2	206461	Valsartan	Left Ventricular Dysfunction	"It has no side effect, I take it in combination of Bystolic 5 Mg and Fish Oil"	9	*****	27	
3	95260	Guanfacine	ADHD	"My son is halfway through his fourth week of Intuniv. We became concerned when	8	*****	192	
4	92703	Lybrel	Birth Control	"I used to take another oral contraceptive, which had 21 pill cycle, and was very happy-	5	*****	17	
5	138000	Ortho Evra	Birth Control	"This is my first time using any form of birth control. I'm glad I went with the pate	8	*****	10	
6	35696	Buprenorphine / naloxone	Opiate Dependence	"Suboxone has completely turned my life around. I feel healthier, 1'm excelling	9	*****	37	
7	155963	Cialis	Benign Prostatic Hyperplasia	"2nd day on 5mg started to work with rock hard erections however experianced headad	2	*****	43	
8	165907	Levonorgestrel	Emergency Contraception	"He pulled out, but he cummed a bit in me. I took the Plan B 26 hours later, and took a p	1	*****	5	
9	102654	Aripiprazole	Bipolar Disorde	"Abilify changed my life. There is hope. I was on Zoloft and Clonidine when I first starte	10	*****	32	
10	74811	Keppra	Epilepsy	" I Ve had nothing but problems with the Keppera : constant shaking in my arms & amp	1	*****	11	
11	48928	Ethinyl estradiol / levonorgestrel	Birth Control	"I had been on the pill for many years. When my doctor changed my RX to chateal, it was	8	*****	1	
12	29607	piramate Migraine Prevention "I have been on this medication almost two weeks, started out on 25mg and working m		9	01-Jan-15	19		
13	75612	L-methylfolate	Depression	"I have taken anti-depressants for years, with some improvement but mostly	10	*****	54	
14	191290	Pentasa	Crohn's Disease	"I had Crohn's with a resection 30 years ago and have been mostly in remission si	4	06-Jul-13	8	
15	221320	Dextromethorphan	Cough	"Have a little bit of a lingering cough from a cold. Not giving me much trouble except ke	4	*****	1	
16	98494	Nexplanon	Birth Control	"Started Nexplanon 2 months ago because I have a minimal amount of	3	*****	10	
17	81890	Liraglutide	Obesity	"I have been taking Saxenda since July 2016. I had severe nausea for about a month on	9	19-Jan-17	20	
18	48188	Trimethoprim	Urinary Tract Infection	"This drug worked very well for me and cleared up my UTI in a matter of 48hrs, although	9	*****	0	
19	219869	Amitriptyline	ibromyalgia	"I've been taking amitriptyline since January 2013 after being diagnosed with fib	9	*****	39	
20	212077	Lamotrigine	Bipolar Disorder	"I've been on every medicine under the sun (it seems) to manage the hypomania	10	*****	18	
21	119705	Nilotinib	Chronic Myelogenous Leukemia	"I have been on Tasigna for just over 3 years now (300mg x 2 times a day) Tasigna worke	10	*****	11	
22	12372	Atripla	HIV Infection	"Spring of 2008 I was hospitalized with pnuemonia and diagnosed with Lyme diease and	8	09-Jul-10	11	
23	231466	Trazodone	Insomnia	"I have insomnia, it's horrible. My story begins with my PCP prescribing me Proza	10	*****	43	

We are extracting datasets from UCI ML Drug Review dataset, the dataset is of 7 attributes consisting of unique id, drug name, condition, review, rating, date , useful count . The datasets are downloaded using a https://www.kaggle.com/datasets/jessicali9530/kuc-hackathon-winter-2018. This dataset contains Patient reviews on specific drugs along with related conditions and a 10 star patient rating reflecting overall patient satisfaction.

IV. METHODOLOGY

In this technique, which includes a comprehensive approach from data collection to deployment, aims to change healthcare services. We collect various spoken inputs, tag them with sentiment labels, then use cutting-edge NLP methods to extract important data. By combining sentiment analysis and natural language processing, we create a system that can comprehend textual content and its emotional context.

This provides input for a machine learning model that makes tailored drug recommendations, improving patient care effectiveness and guaranteeing ongoing development via testing and practical application. The methodology involves several steps:



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1: Data Collection

Firstly, a comprehensive dataset of drug reviews and textual input is meticulously collected from reliable sources such as medical forums, social media, and healthcare databases

2: Preprocessing and Integration

Preprocess the collected data to handle missing values, outliers, and standardize formats. Integrate sentiment data with clinical and patient information to create a unified dataset for analysis.

3: Sentiment Analysis Model Selection

Choose a suitable sentiment analysis model based on the nature of the data and the sentiments to be analyzed. Common techniques include natural language processing (NLP), machine learning (ML) models (e.g., sentiment classifiers)

4: Training the Sentiment Analysis Model

Train the selected sentiment analysis model using the labeled sentiment data. Fine-tune the model to recognize sentiments relevant to drug experiences, including positive, negative, and neutral sentiments.

5: Integration with Drug Recommendation System

Integrate the trained sentiment analysis model with the drug recommendation system. Design a mechanism to incorporate sentiment analysis results into the recommendation algorithm, considering factors such as patient preferences, satisfaction, and concerns.

6: Validation and Evaluation

Validate the integrated system using separate datasets or through a controlled pilot study. Evaluate the performance of the drug recommendation system by assessing its ability to provide accurate, relevant, and personalized drug recommendations.

7: Recommendations of drugs and Monitoring

Deploy the drug recommendation system in a healthcare setting, monitoring its performance and user satisfaction. Implement mechanisms for ongoing monitoring, maintenance, and updates.

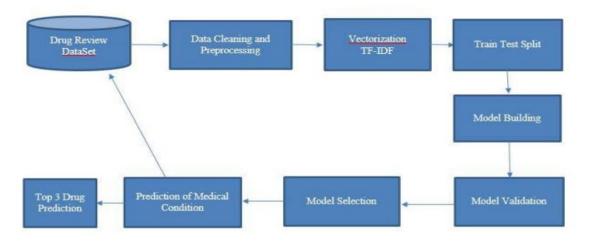


Fig1. Methodology diagram

V. RESULTS	
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Models	Accuracy
Naïve Bayes	0.970
Passive Aggressive Classifier	0.978
TFIDF	0.981
TFIDF: Bigrams	0.987
TFIDF: Trigrams	0.986

Fig2: Accuracy of the above five models

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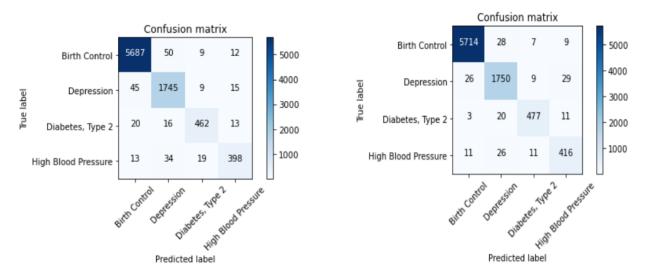
Naïve Bayes: Achieves 97.0% accuracy using a simple probabilistic classification algorithm based on Bayes' theorem with strong independence assumptions.

Passive Aggressive Classifier: Demonstrates high accuracy of 97.8% by incrementally updating the model based on correct and incorrect classifications, suitable for online learning scenarios.

TFIDF: Provides an accuracy of 98.1%, utilizing the Term Frequency-Inverse Document Frequency method to reflect the importance of a word in a document relative to a collection of documents.

TFIDF with Bigrams: Improves accuracy to 98.7% by considering pairs of consecutive words in addition to individual words, capturing more context.

TFIDF with Trigrams: Maintains high accuracy at 98.6% by extending analysis to sequences of three consecutive words, providing even more context for classification.



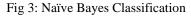


Fig 4: Passive Aggressive Classifier

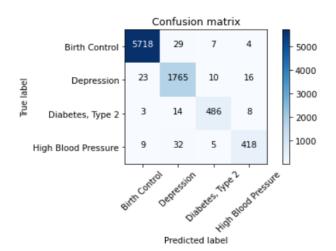


Fig 5: TFIDF Classification

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International Advanced Research Journal in Science, Engineering and Technology Impact Factor 8.066 ∺ Peer-reviewed & Refereed journal ∺ Vol. 11, Issue 5, May 2024 DOI: 10.17148/IARJSET.2024.11523 VI. SNAPSHOTS

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1. Login Page



Fig 1: Login Page for the user to our Medical Condition Predictor and Drug Recommender to sign in with user email and password to access personalized recommendations.

Home	Log out
Enter Medical issue for Getting Drug Recommendation :	
A	
SPEAK	
SPEAK	
PREDICT	

2. Home Page

Fig 2: Home page to provide personalized healthcare solutions with our Medical Condition Predictor and Drug Recommender. Predict, speak, or text your symptoms for tailored recommendations.

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3.Enter Medical Issues for Drug Recommendation

Home	
Enter Medical issue for Getting Drug Recommendation :	
"March 2014 I started breaking out so bad I cried. I <u>didit</u> : know why I was breaking out because I was clear for <u>fives</u> years on ortho tri <u>cyclen</u> . All of sudden I had huge painful acne all of my chin and above my lip. I tried everything and nothing worked. December 2014 I finally tried yaz. At first my acne got worse and I started losing hope. But I imediallty noticed that I had fewer cystic	
SPEAK	
PREDICT	

Fig 3: Enter Medical issues for drug Recommendation and symptoms to receive precise predictions and tailored drug recommendations. Our advanced algorithms analyze your input to provide insightful guidance for the health journey.

4. Drug Prediction

ey	SPEAK PREDICT	4
DISCLAIMER: This app is designed to provide general replace professional medical advice, diagnosis, or tree diagnosis and personalized treatment recommendati	atment. Users should always consult with	
Original Content	Predicted Condition	Drugs (Recommendation)
"March 2014 I started breaking out so bad I cried. I didnt; know why I was breaking out because I was clear for fives years on ortho tri cyclen. All of sudden I had huge painful acne all	Acne Locate Doctors	Desoxyn Duragesic Doryx

Fig 4: Drug Prediction tailored to your specific medical needs. Our sophisticated algorithms analyze your symptoms and medical history to recommend the most suitable medications



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5. Nearby Location of Drug Recommenders

	Bangalore Bangalor		Q. Acne				tup of endless wait? ok for clinic with Prime 🥏
	Gender 🗸 🗸	Patient Stories $~~$	Experience	 ✓ All Filters 	✓ Reset Filters	Sort By Relevance	v
5 Best Doc	tors for Acne Treatme	nt in Bangalore					Safety of your data
Book appointment	ts with minimum wait-time & verifier Dr. Nithya Raghunath Dermatologist	l doctor details					Top doctor specialities in Bangalore Alternative Medicine in Bangalore Orthopedist in Bangalore Unani in Bangalore Andrologit in Bangalore Occupational Therapist in Bangalore
•practo• Skin& Hair	15 years experience overall Kalyan Nagar,Bangalore - Contura (₹800 Consultation fee at clinic	linic			Во	able on Tue, 07 May ok Clinic Visit to Booting Fee	Spine Surgeon in Bangalore Gynecologist/obstetrician in Bangalore Psychotherapist in Bangalore Psychologist in Bangalore Emergency & Critical Care in Bangalore
					L.	Contact Clinic	Top Services at Practo Care Surgeries in Bangalore Doctors For Laser Hair Removal Face in Bangalore Doctor For Skin Treatment in Bangalore
2r	Dr. Parthasarathi Dutta R Dermatologist 21 years experience overall MG Road,Bangalore + Dr. Partha Sar		spitals + 3 more		Во	Available Today ok Clinic Visit	Doctors For Pcod Poos Treatment in Bangalore Doctors For Abdominal Pain Treatment in Bangalore Doctors For Acne Pimples Treatment in Bangalore Doctors For Onychocryptosis in Bangalore Doctors For Chestaran Section C Section in Bangalore Doctor For Scherderma Treatment in Bangalore Doctor For Cyclas in Bangalore
PIT.	₹700 Consultation fee at clinic					40 Booking Fee < Video Consult	Uoctors For Cysts in bangaiore Doctors For Fertilization in Bangalore Top speciality clinics for related treatments in Bangalore General Practitioner Clinics in Bangalore
	Dr. Sankeerth Vijayakuma Dermatologist 14 years experience overall	r			ta /	Available Today	General an Factoria Contra in adaptato e Clinical Psychology Clinics in Bangalore Gynecology Clinics in Bangalore Urology Clinics in Bangalore Radiation Oncology Clinics in Bangalore Surgiatio Oncology Clinics in Bangalore

Fig 5: Nearby Location of Drug Recommenders Locates nearby drug recommenders for personalized health consultations. Our platform connects you with trusted professionals in your area, ensuring convenient access to expert advice

VII. CONCLUSION

The cutting-edge drug recommendation system, which makes use of NLP, machine learning, and sentiment analysis, is a revolutionary step forward for customized healthcare. This combination of technologies ensures a responsive and context-aware user experience by dynamically adapting recommendations and decoding user attitudes.

The algorithm provides ideas that are rich in qualitative information, beyond quantitative measurements by comprehending the subtleties of language used in reviews. As the project develops, it aims to completely transform the field of pharmaceutical recommendations by providing users with a customized, flexible, and all-encompassing approach to their healthcare experience. In the future, technology will be seamlessly integrated with user feedback, bringing healthcare advice to previously unheard-of levels of personalization and comprehension.

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