Medical Chatbot Development: Utilizing Knowledge Graph & Machine Learning Techniques

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19CCE495: PROJECT PHASE 2

TEAM ID: ECE013

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Problem Statement

To construct a Chatbot that can answer user's queries based on the information available in Knowledge graph and provide sufficient information regarding medical issues.

Motivation

> Patients seek health information online through URLs.

Chatbot simplifies information access, empowering users to learn about diseases.

The project is driven by the key motivations which are Enhanced Information Retrieval, Contextual Understanding, Evidence-Based Decision Making, Empowering Patients.

Objectives

- > To implement web scraping techniques to gather related medical data from various sources & data cleaning.
- ➤ Enhancing and testing the Knowledge graph and building a baseline structure.
- ➤ To develop a question-answering system with the developed knowledge graph in integration with the frontend developed website.
- ➤ To assess the effectiveness of the created chatbot using various metrics.

Novelty

The existing systems has limited interactivity with the chatbot. In our project we would like the user to have maximum understanding of the system using a user friendly website where they can directly chat with an interactive chatbot with easy accessibility and implemented performance metrics.

Literature Survey

Title of the paper	Year	Authors	Publication	Comments	Advantages	Drawbacks
A Novel web scraping approach using the additional information obtained from web pages	2020	Erdinc Uzun	IEEE Access	 How to understand a complicated website. Studies related to different web scraping techniques. Technique used: UzunExt. 	 Improving time efficiency of data extraction. Exceptional speed will increases. Minimal code overhead. 	 Handling of Complex HTML Structures. Vulnerability to HTML Changes. Versatility Across Websites.
COVID-Scraper: An Open- Source Toolset for Automatically Scraping and Processing Global Multi- Scale Spatiotemporal COVID-19 Records	2021	HAI LAN , DEXUAN SHA ANUSHA SRIRENGAN ATH MALARVIZHI , YI LIU	IEEE Access	This paper mainly focuses on how to scrap data from different sources dealing with structured and unstructured data	 Developed a tools for scraping which is very much flexible and scalable. 	The data quality control and validation is not fully automated because accuracy is not guaranteed.

Cont..

Title of the paper	Year	Authors	Publication	Comments	Advantages	Drawbacks
A Survey on Knowledge Graphs: Representation, Acquisition, and Applications	2021	Shaoxiong Ji, Shirui Pan, Pekka Marttinen, and Philip S. Yu	IEEE TRANSACTIONS ON NEURAL NETWORKS AND LEARNING SYSTEMS	• The paper's strength lies in its thorough coverage of recent advancements and emerging trends in knowledge graph research.	 Comprehensive Review of Knowledge Graph Research Structured Categorization and Taxonomies 	 Complexity and Accessibility of Advanced Topics. Potential Lack of Specific Focus.
Research on medical question answering system based on knowledge graph	2021	Zhhixue Jiang, Chengying Chi, And Yunyun Ahan	IEEE Access	 An detailed explanation & experiment based on knowledge graph & also query Q&A system. 	A Detailed Research on Knowledge graph and question answering system was given.	The attribute from the data are very less only drug, symptom and disease names are considered so accuracy low.

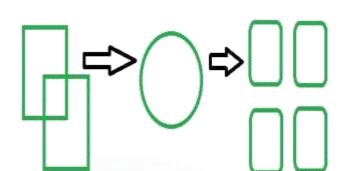
Cont..

Title of the paper	Year	Authors	Publication	Comments	Advantages	Drawbacks
Towards electronic health record-based medical knowledge graph construction, completion, and applications: A literature study.	2023	Lino Murali a,c, G. Gopakumar b, Daleesha M. Viswanathan c, Prema Nedungadi	Elsevier Journal of Bio medical information's	The use of medical knowledge graphs has the potential to improve healthcare outcomes by extracting new links and hidden patterns from health data sources.	Different approaches of creating medical knowledge graph and their applications.	Some EHR being physical & unstructured can be a challenging in collection of data.
Complex Knowledge Base Question Answering: A Survey	2022	Yunshi Lan, Gaole He, Jinhao Jiang, Jing Jiang, Wayne Xin Zhao	IEEE TRANSACTIONS ON KNOWLEDGE AND DATA ENGINEERING	 Overview of recent methods in KBQA with a focus on solving complex questions. Key challenges that arise when answering such complex questions. Technique used: SP and IR 	IR:EfficiencyFlexibilityRobustness	IR: • Lack of Context
Design and Development of We- CDSS Using Flask Framework: Conducing Predictive and Prescriptive Analytics for Coronary Artery Disease	2022	DIVYASHREE N., (Member, IEEE), AND NANDINI PRASAD K. S., (Senior Member, IEEE)	IEEE Access	This paper is mainly taken into consideration to understand the concepts of Flask framework	 Accessibility Security features User - friendly 	Learning curve

Cont..

Title of the paper	Year	Authors	Publication	Comments	Advantages	Drawbacks
Question Answering Over Knowledge Graphs: A Case Study in Tourism	2022	Sereh Aghaei, Elie Raad, And Anna Fesnel	IEEE Access	 Aims to provide answers to natural language questions (NLQs) using KGs. This paper proposes a two-phase approach to QA-KG for small and medium-sized KGs. 	More scalableMore accurateMore flexible	Time-consuming processOver fitting
Knowledge Graph for China's Genealogy	2021	Xindong Wu, Fellow, IEEE, Tingting Jiang Yi Zhu, and Chenyang Bu	IEEE TRANSACTIONS ON KNOWLEDGE AND DATA ENGINEERING	 This paper focuses on the development of a genealogical knowledge graph model called Huapu-Kg and utilize genealogical knowledge graphs. 	 Structured data representation Query and analysis Integration of AI Feasibility validation 	 Data quality integration Scalability Complexity Expertise requirements
Automated clinical knowledge graph generation framework for evidence based medicine	2023	Fakhare Alam a , Hamed Babaei Giglou b , Khalid Mahmood Malik a	Elsevier Journal Expert systems with applications	 Proposes a topic specific, PICO enabled, and fully automated framework to curate information and create KG of different clinical domains. 	Building a knowledge graph according to requirements by using PICO framework are remarkable.	The knowledge graph is built according to the 2 data sets which are considered so they are limited to an extent along with the relations of the KG.

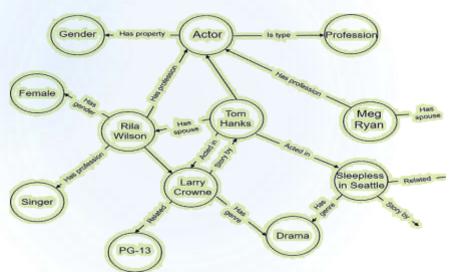
Methodology



Website pages – Unstructured data (https://)

Web Scraping Structur

Structured data



Knowledge graph construction



Storage Format



Chatbot



Data Cleaning



User Interface with chatbot

Data Scraping

- > To gather the relevant data from various sources.
- ➤ It involves extracting the structured and un structured information from trusted medical websites.
 - 1. Identifying data Sources
 - 2. Designing web scraping strategies
 - 3. Implementing data scraping
 - 4. Storing in MongoDB
- Website : https://medlineplus.gov/healthtopics.html

Data Cleaning

- > It is the process of finding and removing errors.
- > It ensures data consistency and quality.
 - 1. Understanding data set
 - 2. Identify redundancies and inconsistences
 - 3. Data cleaning techniques
 - a) Removing irrelevant data
 - b) Remove duplicates
 - c) Remove special symbols
 - d) Remove additional spaces

Knowledge graph Construction

- ➤ It organize data into interconnected nodes representing entities and relationships.
- Nodes: diseases, symptoms, treatments, medications, etc.
- Querying the Knowledge graph
- This allows chatbots to comprehend context and provide more accurate and context-aware responses.
- > Traversal: Breadth First Search

Aho-Corasick Algorithm

- ➤ It is a powerful string searching algorithm that efficiently finds all occurrences of a set of patterns (keywords) within a text.
- > Key points:
 - a. Building the Automation
 - 1. Trie Construction
 - 2. Failure Construction

BERT MODEL

- Bidirectional Encoder Representations from Transformers, is a machine learning (ML) framework for natural language processing.
- > It converts words into numbers and allows you to train machine learning models on your textual data.
- > Key points:
 - a. BERT Tokenizer
 - 1. Word piece algorithm
 - b. BERT for Classification
 - 1. BERT Encoder

FLASK Frame work

> Flask is flexible Python web framework, plays a crucial role in creating chatbots.

> Core Functionalities:

- a. Server-side logic
- b. Communicates with the webpage to take input from user
- c. Communicates with the webpage to display the final results

> Decorators:

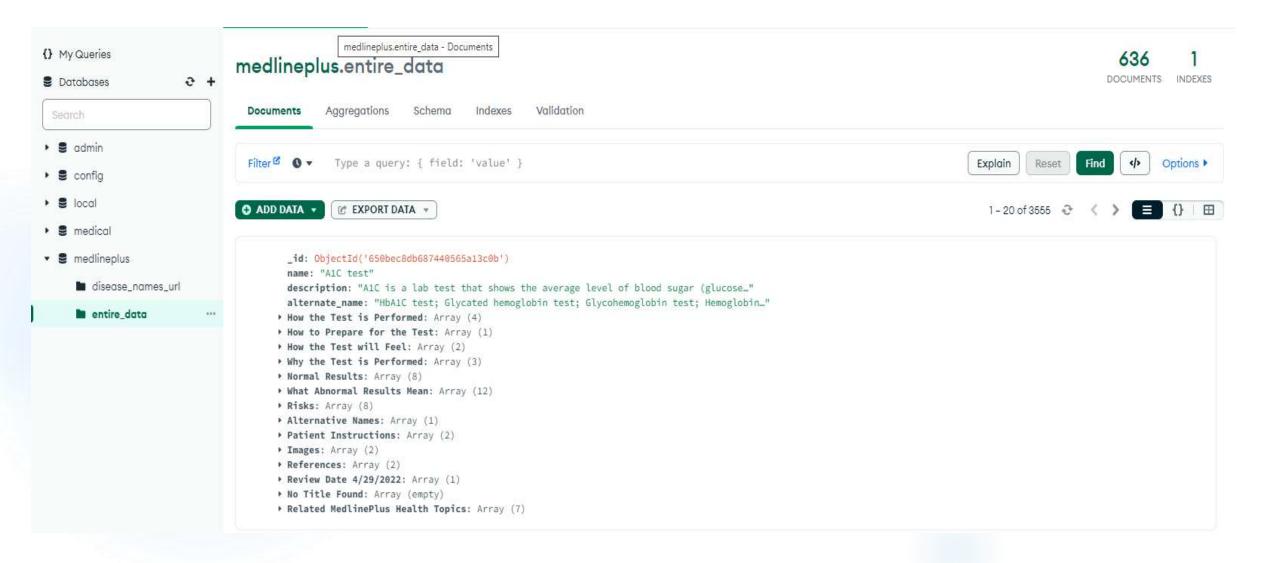
- 1. /
- 2. /grammar
- 3. /api

Work Flow

Front End Backend Designed using html, css, jquery Designed using python, flask framework User types query in input field(body) ------ \rightarrow process query()has users query data. Restful Extracts query data and processed. 1. Grammar Enhancement 2. Named Entity Recognition 3. Answer retrieval (KG) Receives and extracts Converts into Json format appended to the chat log, effectively updating the conversation history This loop continues for every query. displayed to the user.

Results

Scraped data in MongoDB



Cleaned data

```
data > 1) disease cleaned.ison > {} 1 > [ ] symptoms
                                                                                                                                                                  data > {} medlineplus.json > {} 1 > [ ] Support Groups
         1
                                                                                                                                                                         89
         2
                                                                                                                                                                                      " id": {
                                                                                                                                                                         90
                        "id": "650bec8eb687440565a13c0d",
                                                                                                                                                                                         "$oid": "650bec8eb687440565a13c0d"
                                                                                                                                                                         91
                       "name": "Aarskog syndrome",
                                                                                                                                                                         92
                       "description": "Aarskog syndrome is a very rare disease that affects
         5
                                                                                                                                                                                     "name": "Aarskog syndrome",
                                                                                                                                                                         93
                       "alternate names": [
                                                                                                                                                                                     "description": "Aarskog syndrome is a very rare disease that affects a pe
                                                                                                                                                                         94
                          "Aarskog disease",
                                                                                                                                                                                     "alternate name": "Aarskog disease; Aarskog-Scott syndrome; AAS; Faciodi;
                                                                                                                                                                         95
                          "Aarskog-Scott syndrome",
         8
                                                                                                                                                                                     "Causes": [
                                                                                                                                                                         96
         9
                          "AAS",
                                                                                                                                                                        97
                                                                                                                                                                                         "Aarskog syndrome is a genetic disorder that is linked to the X chromos
       10
                          "Faciodigitogenital syndrome",
                                                                                                                                                                         98
       11
                          "Gaciogenital dysplasia",
                                                                                                                                                                                      "Symptoms": [
                                                                                                                                                                        99
       12
                          "Aarskog disease; Aarskog-Scott syndrome; AAS; Faciodigitogenital
                                                                                                                                                                                         "Symptoms of this condition include:",
                                                                                                                                                                       100
       13
                                                                                                                                                                                         "Belly button that sticks outBulge in the groin or scrotumDelayed sexual
                                                                                                                                                CHOMMONEC
                                                                                                                                                                       101
                        "symptoms": [
       14
                                                                                                                                                                       102
                                                                                                                                                                                         "Belly button that sticks out",
                          "Symptoms of this condition include:",
                                                                                                                                                Company of the last of the las
       15
                                                                                                                                                                                         "Bulge in the groin or scrotum",
                                                                                                                                                                       103
                          "Belly button that sticks out Bulge in the groin or scrotum Delaye
       16
                                                                                                                                                                                         "Delayed sexual maturity",
                                                                                                                                                                       104
                          "Belly button that sticks out",
       17
                                                                                                                                                                                         "Delayed teeth",
                                                                                                                                                                       105
                          "Bulge in the groin or scrotum",
       18
                                                                                                                                                                                         "Downwardpalpebral slantto eyes (palpebral slant is the direction of the
                                                                                                                                                                       106
       19
                          "Delayed sexual maturity",
                                                                                                                                                                                         "Hairline with a \"widow's peak\"",
                                                                                                                                                                       107
       20
                          "Delayed teeth",
                                                                                                                                                 SECTION AND LINES
                                                                                                                                                                                         "Mildly sunken chest (pectus excavatum)",
                                                                                                                                                                       108
                          "Downwardpalpebral slantto eyes ( palpebral slant is the direction
       21
                                                                                                                                                                                         "Mild to moderate cognitive problems",
                                                                                                                                                                       109
                          "Hairline with a \"widow's peak\"",
       22
                                                                                                                                                                                         "Mild to moderate short height which may not be obvious until the child
                                                                                                                                                                       110
                          "Mildly sunken chest ( pectus excavatum )",
       23
                                                                                                                                                                                         "Poorly developed middle section of the face",
                                                                                                                                                                       111
                          "Mild to moderate cognitive problems",
       24
                                                                                                                                                                                         "Rounded face",
                                                                                                                                                                       112
                          "Mild to moderate short height which may not be obvious until the c
       25
                                                                                                                                                                                         "Scrotum surrounds the penis (shawl scrotum)",
                                                                                                                                                                       113
                          "Poorly developed middle section of the face",
       26
                                                                                                                                                                                         "Short fingers and toes with mild webbing",
                                                                                                                                                                       114
                          "Rounded face".
       27
                                                                                                                                                                                         "Single crease in the palm of the hand",
                                                                                                                                                                       115
                          "Scrotum surrounds the penis ( shawl scrotum )",
       28
                                                                                                                                                                                         "Small, broad hands and feet with short fingers and curved-in fifth fir
                                                                                                                                                                       116
                          "Short fingers and toes with mild webbing",
       29
                                                                                                                                                                       117
                                                                                                                                                                                         "Small nose with nostrils tipped forward",
       30
                          "Single crease in the palm of the hand",
                                                                                                                                                                                         "Testicles that have not come down (undescended)",
                                                                                                                                                                       118
                          "Small, broad hands and feet with short fingers and curved-in fifth
       31
                                                                                                                                                                                         "Top portion of the ear folded over slightly",
                                                                                                                                                                       119
                          "Small nose with nostrils tipped forward",
       32
                                                                                                                                                                                         "Wide groove above the upper lip, crease below the lower lip",
                                                                                                                                                                       120
                          "Testicles that have not come down ( undescended )",
       33
                                                                                                                                                                                         "Wide-set eyes with droopy eyelids"
                                                                                                                                                                       121
                          "Top portion of the ear folded over slightly",
       34
                                                                                                                                                                       122
                          "Wide groove above the upper lip, crease below the lower lip",
       35
                                                                                                                                                                                     "Exams and Tests": [
                                                                                                                                                                       123
                          "Wide-set eyes with droopy eyelids"
       36
                                                                                                                                                                       124
                                                                                                                                                                                         "These tests may be done:",
       37
                                                                                                                                                                       125
                                                                                                                                                                                         "Genetic testing for mutations in theEGD1geneX-rays".
```

Querying

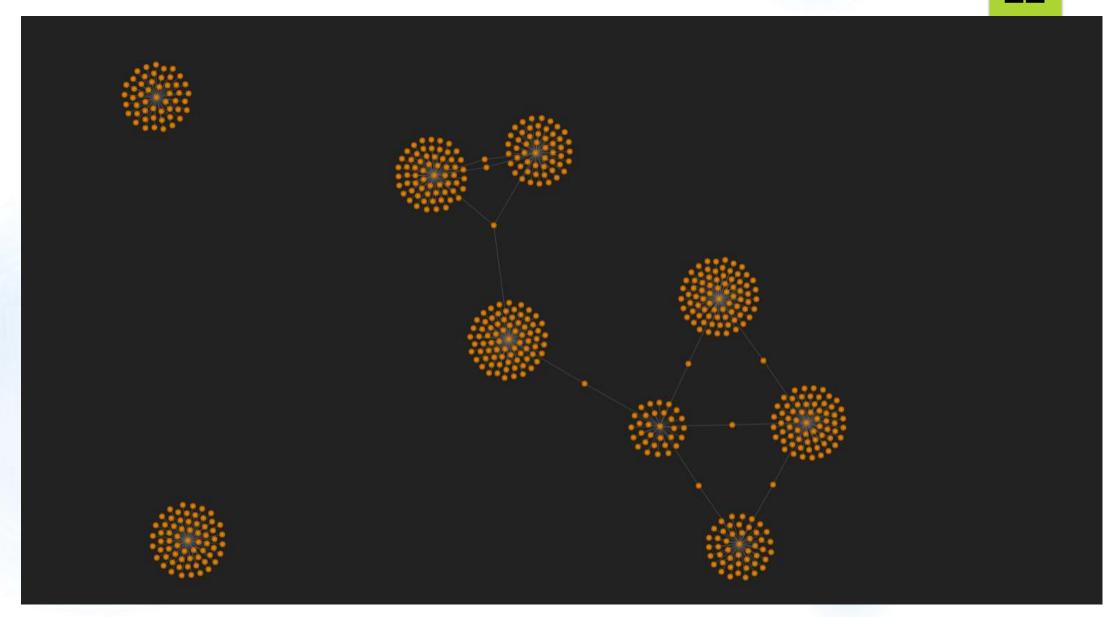
```
PS C:\Users\Sai Tarun\OneDrive - Amrita Vishwa Vidyapeetham\Desktop\knowledge graph> python -u "c:\Users\Sai Tarun\OneDrive - Amrita Vishwa Vi
  dyapeetham\Desktop\knowledge graph\build graph.py"
 What would you like to know about?
 1. id
  name
  description
 4. alternate names
  symptoms
 causes
 7. exams and tests
 8. treatment
 possible complications
  images
 11. related medlineplus health topics
 Enter the number of your choice: 3
 Which disease are you referring to? ABO incompatibility
 Description: A, B, AB, and O are the 4 major blood types. The types are based on small substances ( molecules ) on the surface of the blood c
 ells.
O PS C:\Users\Sai Tarun\OneDrive - Amrita Vishwa Vidyapeetham\Desktop\knowledge_graph>
```

21

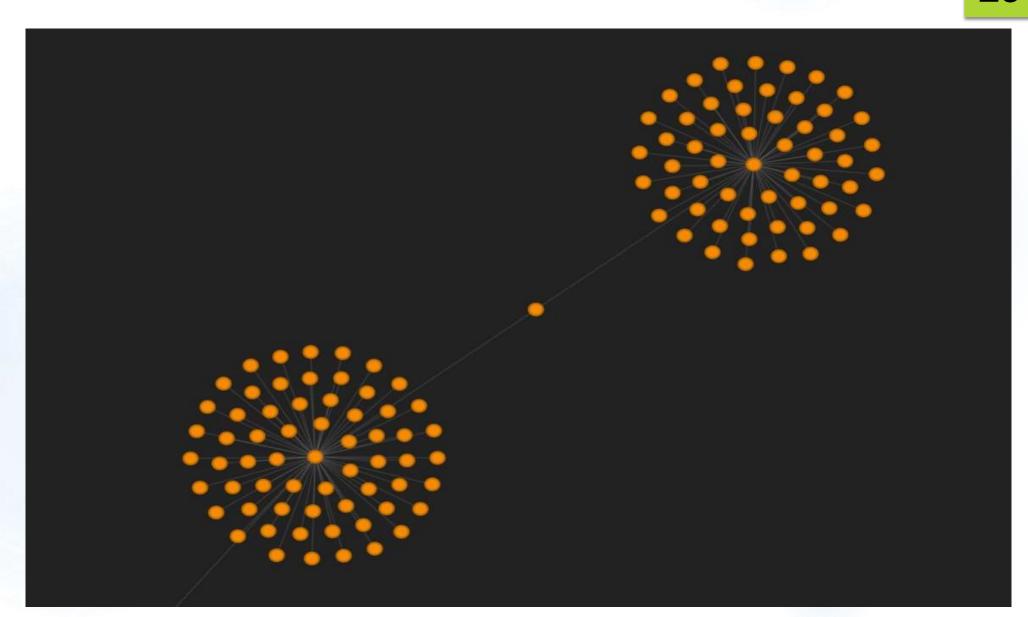
Testing

```
Status: 200 OK Time: 5.18 s Size: 432 B Save as example •••
   Cookies Headers (6) Test Results
Pretty
                Preview
                          Visualize
                                      JSON V =
         "best_matches": [
             "Cancer",
             "Tumor",
             "Breast cancer"
         "intent": "description",
         "output": "Cancer is the uncontrolled growth of abnormal cells in the body. Cancerous cells are also called malignant cells."
 9 }
```

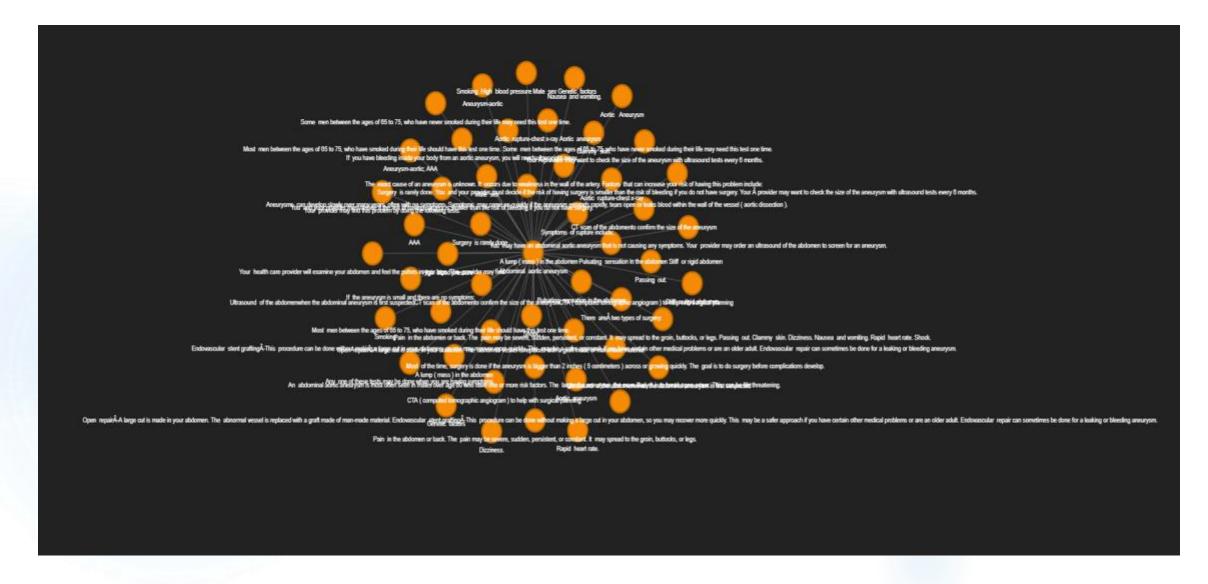
Knowledge graph visualization



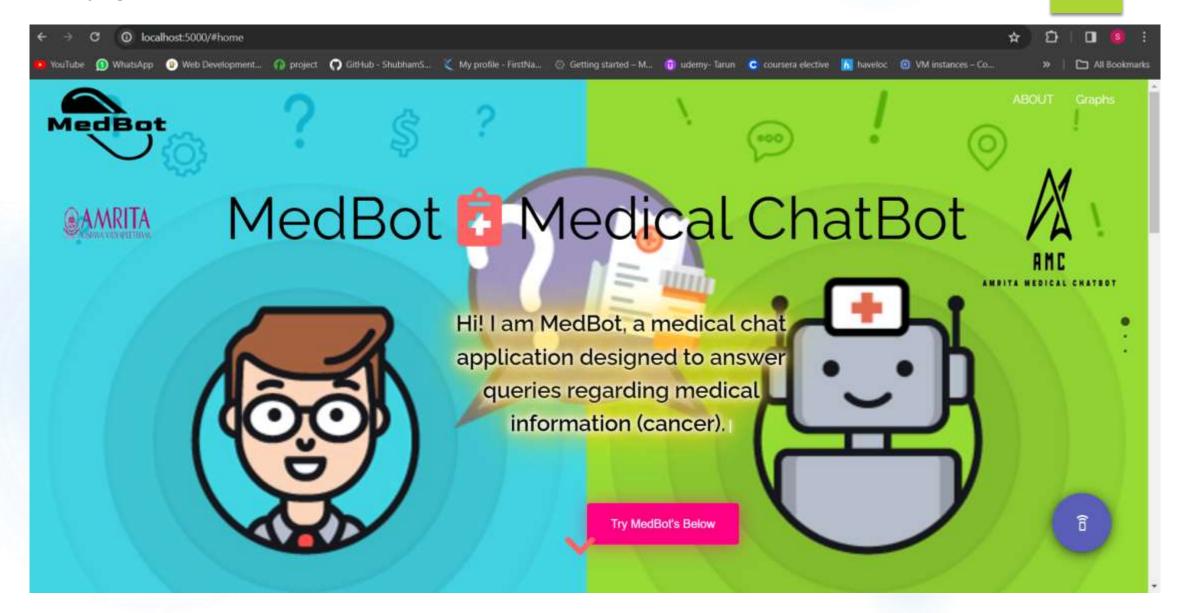
Two disease with common attribute



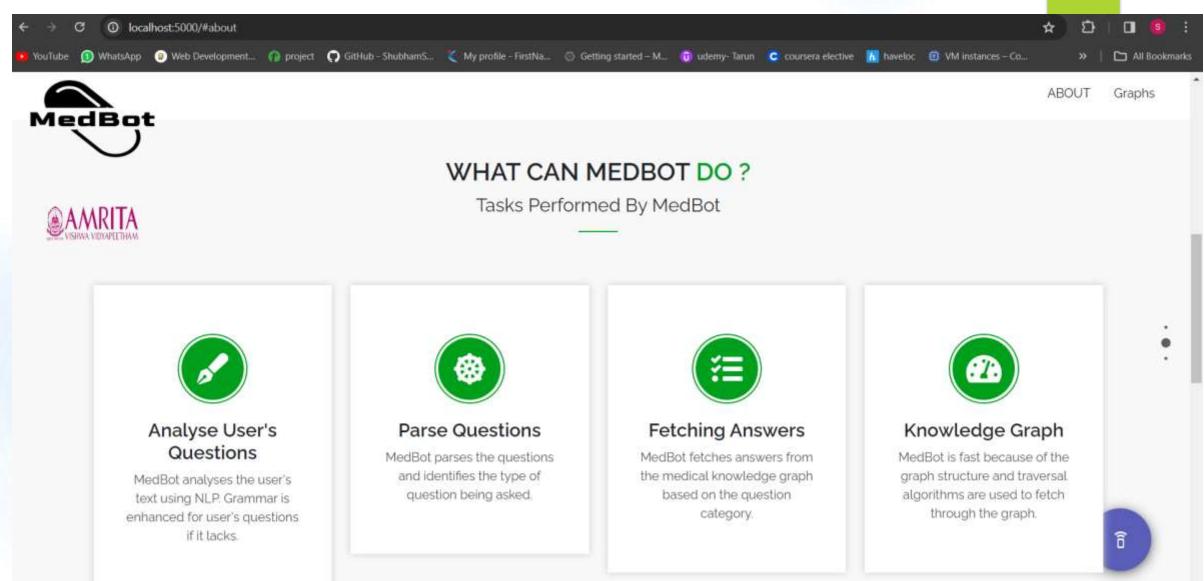
Node and Edges(single node)



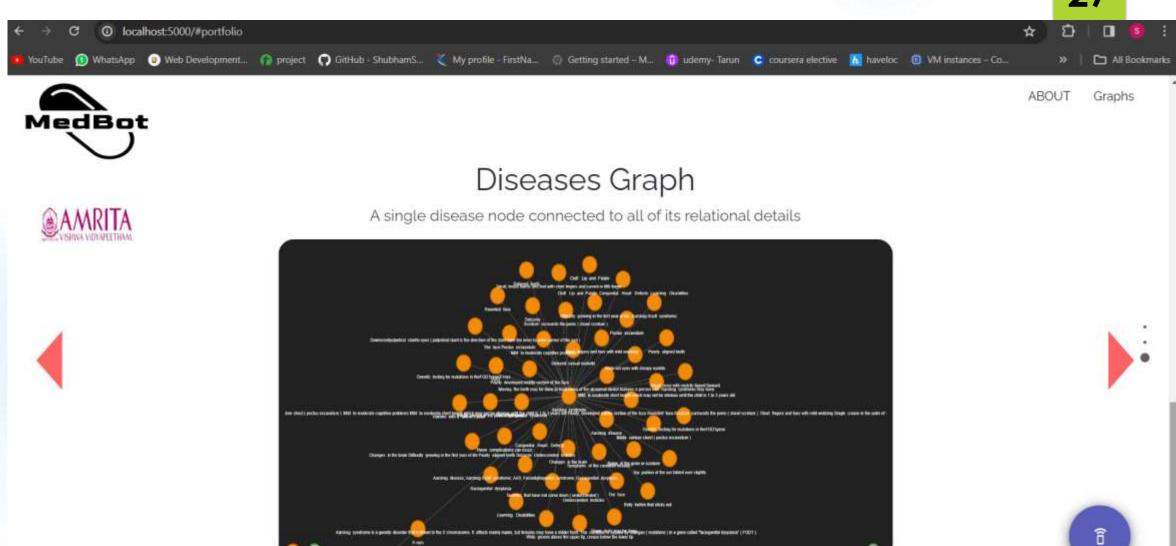
Home page



About page







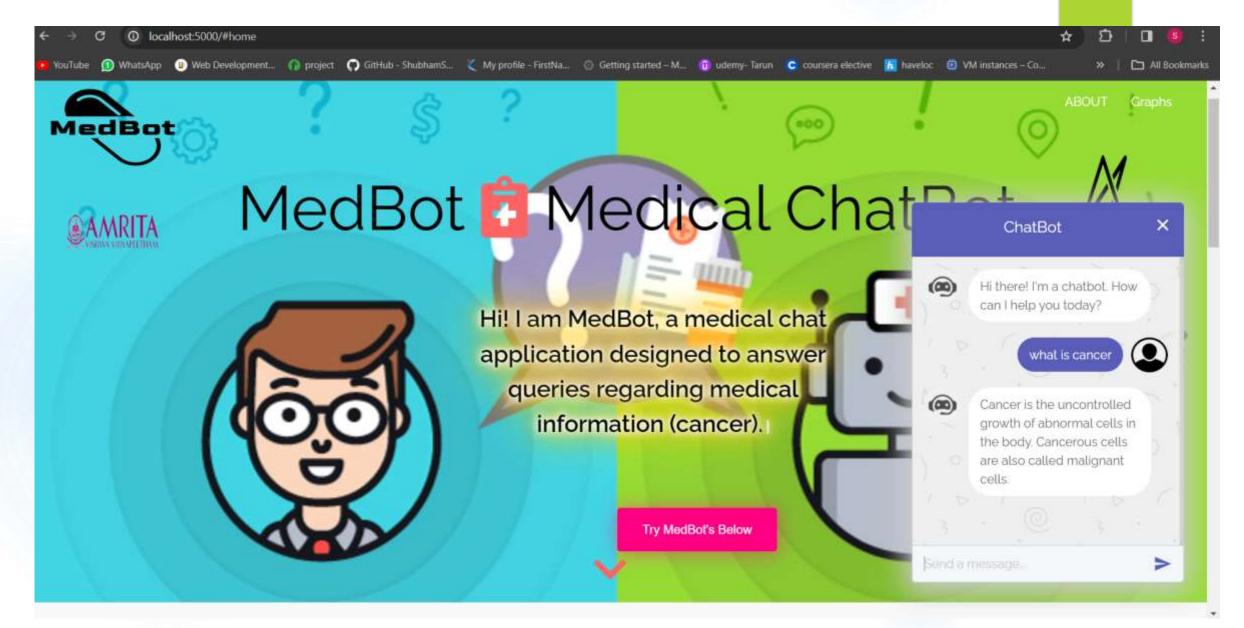
Footer page

HOME FEEDBACK MEDICAL DISCLAIMER FAQS ABOUT

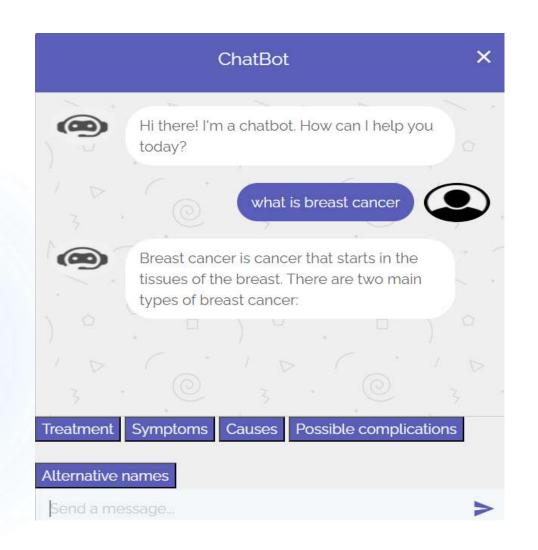
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Integration of UI and Chatbot



Chat bot



What are its symptoms?



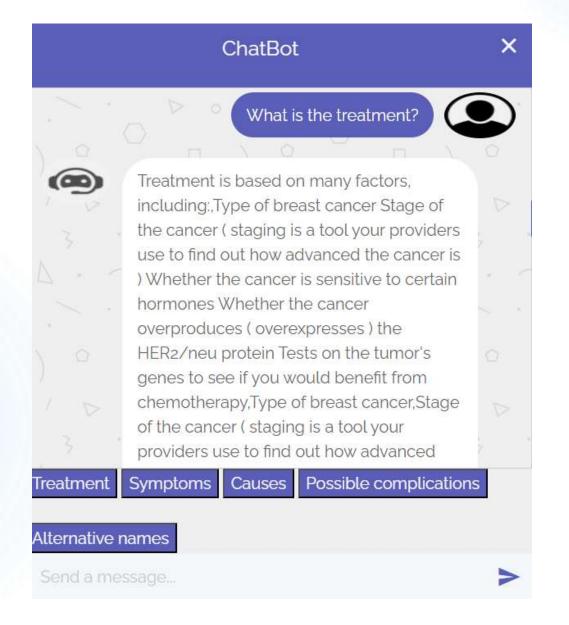


Early breast cancer often does not cause symptoms. This is why regular breast exams and mammograms are important, so cancers that don't have symptoms may be found earlier., As the cancer grows, symptoms may include: Breast lumpor lump in the armpit that is hard, has uneven edges, and usually does not hurt. Change in the size, shape, or feel of the breast or nipple. For example, you may have redness, dimpling, or puckering that looks like the skin of an orange. Fluid from the

Treatment

Symptoms | Causes | Possible complications

Alternative names



Performance Metrics of intention finding

Accuracy	Precision	Recall
0.91	0.90	0.90

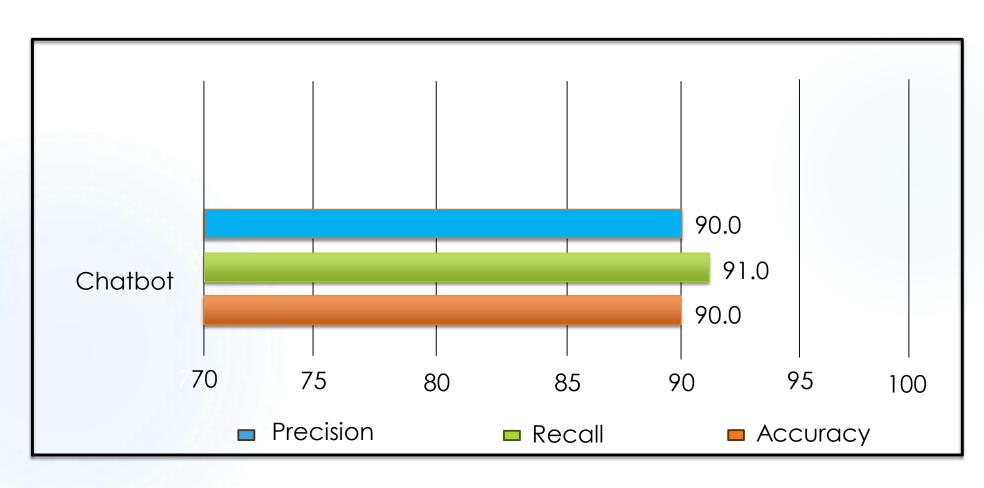
Confusion matrix:

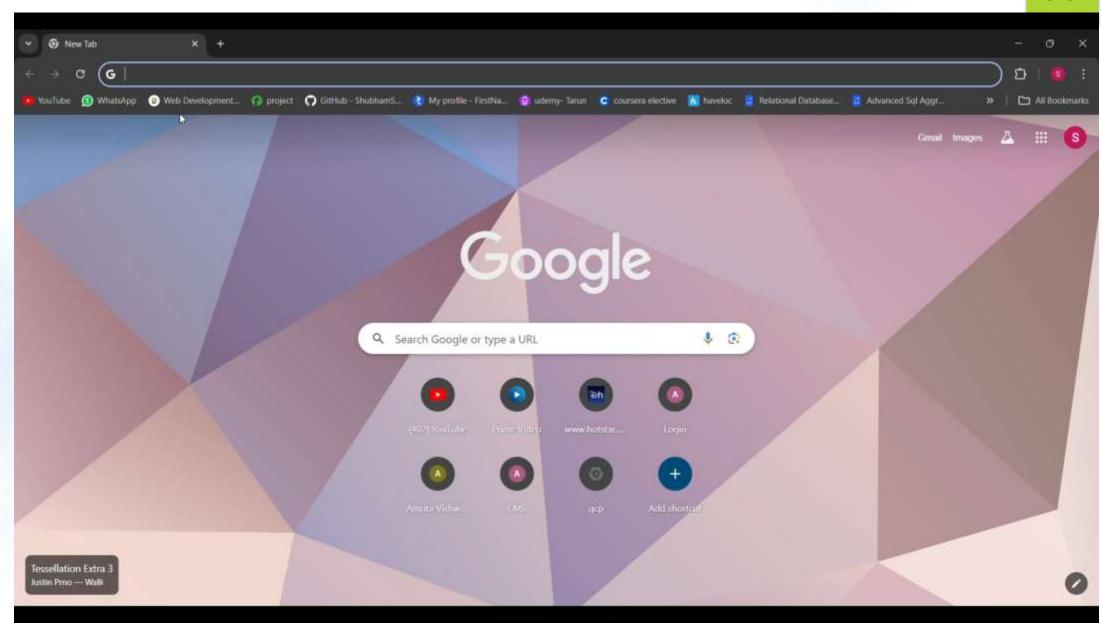
45	5
4	46

Performance of Knowledge graph:

1. Average Time taken for 100 queries: 0.0053sec

Performance Metrics of Amrita Medical Chatbot (AMC)





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THANK YOU