#### Certificate

This is to certify that the mini-project entitled <u>Tubetalk: An Intelligent LangChain System for Extracting and Analyzing YouTube Content for User Queries</u> is a bonafide work of Jonathan Gomes(9900), Mark Lopes(9913), Vivian Ludrick(9914) submitted to the University of Mumbai in partial fulfillment of the requirement for the award of the degree of Bachelor of Engineering in Computer Engineering (Semester- VI).

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## Approval Sheet

## Mini Project Report Approval for T.E. (Semester-VI)

This mini-project report entitled <u>Tubetalk: An Intelligent LangChain System for Extracting and Analyzing YouTube Content for User Oueries</u> submitted by Jonathan Gomes(9900), Mark Lopes(9913), Vivian Ludrick(9914) is approved for the degree of Bachelor of Engineering in Computer Engineering (Semester-VI).

Examiner 1.
Examiner 2.
Date:
Place: Mumbai

#### Declaration

We declare that this written submission represents our ideas in our own words and where others' ideas or words have been included, we have adequately cited and referenced the original sources. We also declare that we have adhered to all principles of academic honesty and integrity and have not misrepresented or fabricated or falsified any idea/data/fact/source in our submission. We understand that any violation of the above will be cause for disciplinary action by the Institute and can also evoke penal action from the sources which have thus not been properly cited or from whom proper permission hasnot been taken when needed.

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#### Abstract

This project introduces a web application that brings YouTube videos to life in a new way, making them more interactive and engaging for users. The platform is built for anyone who wants to dive deeper into video content by transforming audio into searchable text and allowing users to ask questions directly about the content. Using AssemblyAI, the app transcribes video audio, creating a text-based format that makes it easier for people to find answers within the video without having to watch it all.

A major strength of this tool is its use of FAISS (Facebook AI Similarity Search), which helps store and retrieve answers efficiently. When users ask questions about a video, the app finds the most relevant parts of the transcript and gives clear, context-driven answers. LangChain, a framework for natural language processing (NLP), powers this capability, making the interaction feel intuitive and natural.

But the experience goes beyond simple Q&A. The app also generates quizzes from the video's content, encouraging users to actively learn and retain what they've watched. This feature can be especially valuable in educational settings, where students and teachers can turn any video into a learning experience. Through quizzes and interactive questions, users can test their understanding and reinforce key points from the video.

To make the platform even more seamless, a Chrome browser extension has been integrated. This extension automatically captures the current YouTube video link, instantly provides a summary, and includes a "Go to Dashboard" button that redirects users to the main platform for deeper interaction. It eliminates the need to manually copy and paste video URLs, allowing users to engage with video content in just one click.

The app was designed with ease of use in mind, from audio extraction and transcription to an intuitive interface and thorough documentation. The goal is to make it as accessible as possible, enabling users of all backgrounds to engage deeply with video content, gain insights, and learn more effectively. Whether for personal enrichment, classroom learning, or professional development, this application aims to make video content more accessible, interactive, and impactful.

#### Keywords:

- YouTube video analysis
- Transcript-based question answering
- AssemblyAI transcription
- Interactive quiz generation
- Natural language processing
- Chrome extension for YouTube summarization

#### Acknowledgments

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#### INTRODUCTION

The rising demand for video accessibility and knowledge extraction has driven innovation in tools for understanding video content. YouTube has a lot of information, but it takes sophisticated processing and interactive features to glean insights from videos.

The goal of this project is to create an online tool that lets people examine and engage with the transcripts of YouTube videos. The system uses natural language processing and vector-based storage to extract audio and provide precise transcriptions, which enable it to deliver insightful answers to user inquiries based on video footage. The platform also creates interactive tests that let users see how well they comprehend the subject matter.

To streamline the user experience, the system includes a Chrome extension that automatically detects the current YouTube video being watched, fetches the video link, and generates a quick summary. The extension also provides a "Go to Dashboard" button, allowing users to jump directly into the full analysis and Q&A interface, eliminating the need for manual URL input.

The project's main objectives are to transcribe audio, store the transcripts in an effective vector format, create an interactive interface for easily accessible visualizations, and construct a question-answering-system.

This project offers a useful tool for researchers, students, and casual viewers by fusing cuttingedge NLP algorithms with user accessibility. This encourages deeper learning and more interesting ways to interact with video information.

## Review of Literature

# 2.1 Comparison table

Paper Title	Algorithm	Database	Results	Summary (Advantage & Disadvantage)
Dense Passage Retrieval (DPR) for Open-Domain Question Answering[1]	Dense Passage Retrieval (DPR)	Open- domain Q&A datasets	Significant improvements in retrieval- based QA tasks	Advantage: Improves retrieval of relevant text segments for Q&A.     Disadvantage: Requires extensive training data and computational resources.
The Faiss Library[2]	FAISS (Facebook AI Similarity Search)	Large-scale datasets	Efficient similarity search in high-dimensional spaces	Advantage: Extremely fast and efficient for similarity search in large datasets.  Disadvantage: Requires high computational power for very large datasets.
Sentence Meaning Similarity Detector Using FAISS[3]	FAISS with Sentence Embeddings	Sentence- level embeddings	Enhanced semantic similarity detection	Advantage: Uses FAISS for semantic search, crucial for efficient transcript search. Disadvantage: Requires accurate embeddings for effectiveness.
YouTube Transcript Synthesis[4]	Deep Learning for Transcript Synthesis	YouTube videos, transcription data	Improved quality of video transcript synthesis	Advantage: Provides high-quality transcript generation. Disadvantage: Computationally expensive and time- consuming for large video datasets.
Video Summarization using Speech	Speech recognition + text summarization	Video and audio content	Improved video summarizatio	Advantage: Combines speech recognition and text

Recognition and	techniques		n	summarization for
Text	teeminques		11	concise summaries.
Summarization[5]				Disadvantage: May
				miss context or
				nuances in longer
				videos.
				Advantage:
				Embedding
F 1 11' 1 1		Facebook	Enhanced	techniques enhance
Embedding-based	Embedding-based	user-	relevance and	search performance.
Retrieval in	retrieval	generated	retrieval	Disadvantage:
Facebook Search[6]		content	accuracy	Performance highly
				depends on the
				quality of embeddings used.
				Advantage: Provides
				foundational
				knowledge for
			Overview of	vectorizing text,
	W/11		word	crucial for transcript
Word Embeddings:	Word embeddings	Tout compone	embedding	analysis.
A Survey[7]	(Word2Vec, GloVe)	Text corpora	techniques	<b>Disadvantage</b> : Word
	Gio ve)		and their	embeddings might
			applications	not capture all
				nuances, especially
				for specialized video
				content.
				Advantage: Improves
Understanding				personalization of
Human Preferences:		Video	Personalizatio	transcript generation
Towards More	Deep learning for	datasets,	n of video	based on user
Personalized Video	personalized video-	user interaction	transcript	preferences.
to Text	to-text generation	data	generation	Disadvantage:
Generation[8]		uata		Requires detailed
				user data for
				customization.
				Advantage:
VX2TEXT: End-to-				Generates high-
End Learning of	End-to-end deep	Video	High-quality	quality transcripts
Video-Based Text	learning model for	datasets with	text .	using multimodal
Generation From	video-based text	multimodal	generation	data. <b>Disadvantage</b> :
Multimodal	generation	inputs	from video	Requires complex
Inputs[9]	8	<b>F</b>	data	model architecture
I[2]				and computational
				resources.
т				Advantage: Allows
Language as the			C1: C'	for text-based
Medium:	Text-based	37:1	Classification	classification without
Multimodal Video	multimodal	Video and	using text-	using video data
Classification	classification	text data	only modalities	directly.
through Text			modanties	<b>Disadvantage</b> : May
Only[10]				not capture the full
				range of video

				information.
An Effective Query System Using LLMs and LangChain[11]	Large Language Models (LLMs) with LangChain	Text-based datasets	Improved query processing and response accuracy	Advantage: Enhances Q&A functionality using LangChain. Disadvantage: Requires high-quality datasets and model fine-tuning.
Automating Customer Service using LangChain[12]	LangChain for customer service automation	Customer service datasets	Automated customer service tasks	Advantage: Automation of service tasks. Disadvantage: May not handle highly complex or nuanced queries effectively.

## 2.2 Problems in existing system

- Reliance on Pre-existing Captions: The applicability of current solutions is limited for videos without captions because they only function with videos that already have captions.
- Absence of Advanced AI Integration: Most existing systems do not have sophisticated AI models for creating dynamic quizzes from video transcripts or answering questions based on context.
- Inaccuracy in Transcription: Tools that depend on captions frequently have flaws, particularly when the captions are manually or automatically generated, making the transcripts unfit for analysis.
- Limited Interactivity: Users of current tools are only given static transcriptions without individualized learning experiences like Q&A or quizzes, and there is no real-time interactivity with video content.

# Chapter 3 3.1 PROBLEM DEFINITION

The goal of this project is to provide an interactive online application for YouTube video transcript analysis. YouTube videos' audio will be downloaded by the system, which will then use AssemblyAI to transcribe the content and save the finished transcript for later use. Through a Question & Answer (Q&A) system, viewers will be able to interact with video material and search the transcript for pertinent responses. In order to improve users' learning and engagement with the material, the system will also create interactive multiple-choice tests using the transcript of the video. The objective is to provide a strong and intuitive platform that facilitates knowledge retrieval and educational reinforcement using clever AI-powered tools such as Google Generative AI and LangChain. To further enhance usability, a browser extension has been developed as part of the system. This extension automatically detects the YouTube video currently being watched, captures the video link, and provides users with a quick summary and direct access to the main application dashboard. This allows seamless integration between regular YouTube viewing and the advanced features of the TubeTalk platform.

#### 3.2 OBJECTIVES OF THE PROJECT

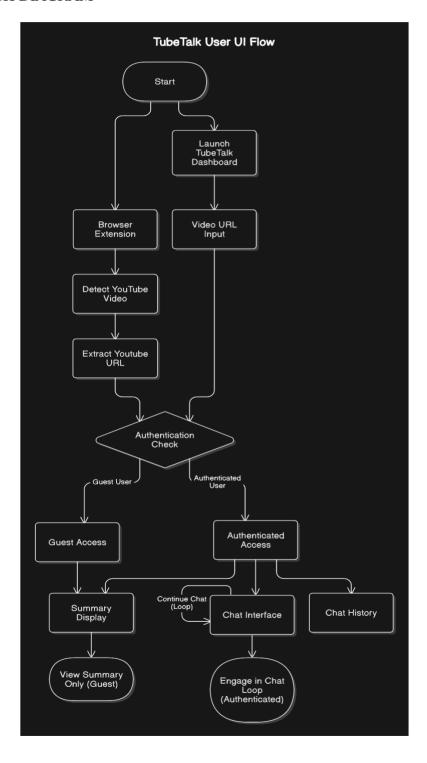
- 1. Create a Transcript Processing System: Put in place a reliable system that records YouTube audio, uses AssemblyAI to transcribe it, and stores the transcript for later study.
- 2. Turn on Interactive Q&A Functionality: Make a vector store of video transcripts that can be searched so that users may pose queries and get pertinent, context-based responses.
- 3. Create Interactive Quizzes: To assist users in solidifying their comprehension of the subject matter, create multiple-choice tests automatically using video transcripts.
- 4. Promote Knowledge Retrieval from Videos: Make it simpler for users to find specific information in lengthy video transcripts by leveraging Google Generative AI and LangChain's capabilities for intelligent information retrieval.
- 5. Integrate a Browser Extension for Seamless Access: Develop a lightweight browser extension that automatically captures the current YouTube video link, displays a summary, and redirects users to the dashboard for interactive exploration.

#### 3.3 SCOPE OF THE PROJECT

- 1. In order to provide accurate and easily accessible transcripts for analysis, this project will construct a system to manage the processing, transcription, and storage of YouTube video audio.
- 2. A robust Q&A interface is developed where users can ask questions and receive targeted answers based on the video's transcript, enhancing learning and content understanding.
- 3. The system will automatically generate quizzes from transcripts, providing users with an engaging way to review key concepts, reinforcing retention through interactive multiple-choice questions.
- 4. By integrating LangChain and Google Generative AI, the project will support advanced information retrieval methods, allowing users to efficiently search for and extract relevant details from lengthy transcripts.
- 5. A Chrome browser extension will be included as part of the project, enabling automatic capture of the currently playing YouTube video link. This extension provides a quick summary of the video and offers direct access to the main dashboard for deeper interaction, making the platform more accessible and user-friendly during normal video browsing.

## **SYSTEM DESIGN**

#### 5.1 BLOCK DIAGRAM



#### 5.2 MODULE DESCRIPTION

- 1. User Start: The user initiates the process by accessing the application via a Chrome Extension or Web Application interface.
- 2. Register or Sign In: The user is required to either register a new account or sign in with existing credentials through the Authentication Deck.
- Register: The user creates a new account in the system.
- Sign In: The user logs in using their credentials
- 3. Authentication: The system checks if the login or registration is successful.
- 4. Content Interaction and Querying:
- Upload Video: The user uploads a YouTube video or provides a link, initiating transcript extraction.
- Summary Display: The system presents a summary of the video transcript, generated through backend services.
- Chat Portal: Users can ask questions related to the video transcript via a chat interface, which interacts with the Chat Response Generator to provide relevant responses.
- 5. Transcript Service:
- YouTube Transcription: The system fetches and parses video transcripts via a Transcript Engine.
- Audio Transcription: For videos without transcripts, the system performs audio processing, converting speech to text using ASR (Automatic Speech Recognition) to create a transcript.
- 6. Backend Processing:
- Processors (LLM Service/Gemini API): The system utilizes a Large Language Model to perform tasks such as:
- Chat Response Generation: Generate responses to user queries based on the video transcript.
- Summary Generation: Create concise summaries of the video content.
- 7. Database and Caching (PocketBase Database):
- Collections: Stores various data types, including:
- Transcripts: Parsed and processed video transcripts.
- Video Summaries: Summaries generated from transcripts.
- Chat History: Records of conversations between users on the chat platform.
- 8. Result Display and Feedback:
- Summary Display and Chat Interaction: Users can ask inquiries and examine created summaries using the chat feature
- Major Providers: Details about pertinent video or content suppliers.
- 9. End: The process concludes.

#### 5.2.1 ALGORITHMS

#### 5.2.1.1 THEORETICAL ANALYSIS

- Video Transcription: AssemblyAI is used in this project to transcribe the audio after it has been extracted from a YouTube video using yt\_dlp. Spoken language is transformed into text through the transcription process, which forms the foundation for further research. Users can search for certain material in the video using this text data without having to view it.
- Text Segmentation and Embedding: The RecursiveCharacterTextSplitter is used to break up the transcribed text into digestible pieces, and Google Generative AI's embedding model is used to embed each chunk into a vector representation. This method enables efficient search based on user queries by facilitating efficient storing and retrieval in FAISS (Facebook AI Similarity Search). Long transcriptions can be handled while maintaining contextual coherence thanks to the chunking and embedding procedure.
- Question Answering (Q&A) System: To respond to user inquiries based on the embedded and transcribed video footage, a RetrievalQA Chain is utilized. The system uses Google Generative AI to create an answer after retrieving the most pertinent text passages from FAISS in response to a user's inquiry. Vector similarity is used in both the retrieval and answer generation processes to guarantee that the responses are contextually appropriate for the user's query.
- Quiz Generation: Using prompt-based quiz creation, the code generates multiple-choice questions based on the transcription content. This functionality allows users to test their comprehension of the video material in an interactive way. The quiz generation process generates questions, answer choices, and correct answers automatically, though it depends on the model's interpretation of the transcript content, which may introduce errors.
- User Interface with Streamlit: The code creates multiple-choice questions based on the transcription material using prompt-based quiz design. With the help of this feature, users can interactively assess how well they understand the video content. Although it depends on how the model interprets the content of the transcript, the quiz production process automatically creates questions, answer choices, and right answers.

#### 5.2.1.2 ALGORITHMS USED

Audio Extraction Algorithm: This algorithm uses yt\_dlp to extract audio from a YouTube video URL. It downloads the audio, which is then used for transcription. Steps:

- 1. Input the YouTube video URL.
- 2. Use yt\_dlp to extract the audio in the best available quality.
- 3. Store the audio file in a specified directory for further processing.

Panel Transcription Algorithm: This algorithm leverages the Assembly AI API to transcribe the audio into text.

#### Steps:

- 1. Input the audio file obtained from the YouTube video.
- 2. Send the audio to AssemblyAI's transcription service, which uses machine learning to convert audio to text.
- 3. Receive and store the text transcript in a local directory.

Text Embedding and Retrieval technique: This technique employs the FAISS library for effective similarity search and Google Generative AI for embedding. By embedding text fragments and storing them in a vector database for retrieval, it makes question-answering possible.

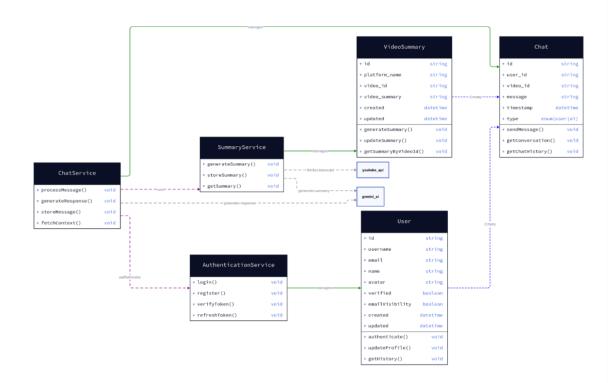
#### Steps:

- 1. To preserve context and maximize retrieval, divide the transcript into smaller text segments using the RecursiveCharacterTextSplitter.
- 2. Make use of Google Generative AI embeddings to transform each chunk into a high-dimensional vector.
- 3. To enable effective similarity search, store the vectors in an FAISS index.
- 4. Using FAISS based on vector similarity, extract the most pertinent pieces from an input query.

The Question-Answering Algorithm pulls pertinent text passages from the vector store and feeds them into a language model to produce answers to user questions. Steps:

- 1. Input the user's question.
- 2. Retrieve the most relevant transcript chunks from the FAISS index using similarity search
- 3. Use Google Generative AI to generate an answer based on the retrieved context.

#### 5.2.2 UML DIAGRAM(S)



#### 5.2.3 UI DESIGN

Several static HTML, CSS, and JavaScript web pages make up the user interface (UI), which aims to provide a simple and interesting user experience.

#### 1. Home Page

- This is the primary application hub that informs users of the system's functionality and goal.
- Draws attention to features including user engagement tools, chat-based communication, and video summary.
- Makes registration and login choices easily accessible..
- Provides links to explore particular features, such as "Chat with the AI" and "Summarize a Video."

#### 2. Video Summary Page

- Allows users to input a YouTube video link and retrieve a summary.
- Displays essential metadata such as video title, upload date, and platform name.
- Shows the generated summary along with options to refresh or edit.
- Users can also browse a history of previous summaries, allowing quick access to past content.

#### 3. Chat Page

- Facilitates a conversational interface where users can interact with the AI.
- Chat interface displays user messages and AI responses, providing context-based conversations.
- Features a "Fetch Context" button to retrieve relevant past messages or summaries for continuity.
- Users can view their conversation history and switch between different conversations if needed.

#### 4. Register / Login Page

- Provides a registration and login interface for user authentication.
- New users can create an account, while existing users can sign in.
- Includes password reset and token verification options for secure access.

#### 5. Service Explanation Page

- Provides an overview of the system's capabilities, such as video summarization, chat functionality, and user profile management.
- Explains the purpose and potential applications of the system to give users a clear understanding of its benefits.
- Contains a "Learn More" section to dive deeper into the technology behind video summarization and AI chat interactions.

#### 6. About Us Page

- Shares information about the team behind the project, the mission, and the vision for the YouTube content analysis system.
- Builds trust and credibility, inviting users to understand the project's background and goals.

#### 7. Contact Us Form

- Provides a form for users to submit inquiries, feedback, or requests for support.
- Includes fields for name, email, subject, and message, ensuring clear communication.

#### IMPLEMENTATION AND RESULTS

#### 5.1 Implementation

The implementation begins by accepting a YouTube URL input from the user. The URL is processed to download the video's audio using the yt-dlp library. The extracted audio is then sent to the AssemblyAI API, which transcribes the speech into text.

The RecursiveCharacterTextSplitter is used to split the text into digestible portions and preserve the transcript locally. For quick similarity-based search, each chunk is saved in an FAISS index and embedded using GoogleGenerativeAIEmbeddings.

Users can enter particular queries once the transcript has been processed and saved. The system uses GoogleGenerativeAI to obtain answers after searching the vector storage for pertinent areas. A quiz with multiple-choice questions based on the transcript is also generated by the system to assess the user's comprehension.

To enhance accessibility, a Chrome browser extension is also integrated. This extension automatically captures the URL of the currently viewed YouTube video and offers a brief summary with a direct "Go to Dashboard" button. This allows users to seamlessly transition from YouTube to the main application for deeper content interaction.

#### 5.2 RESULTS

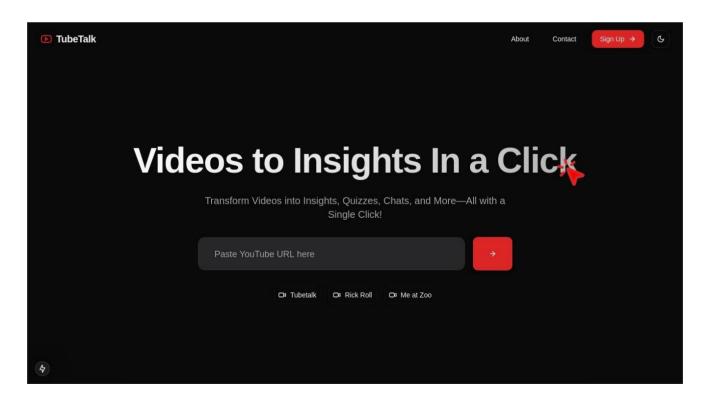


Fig 1: Home Page

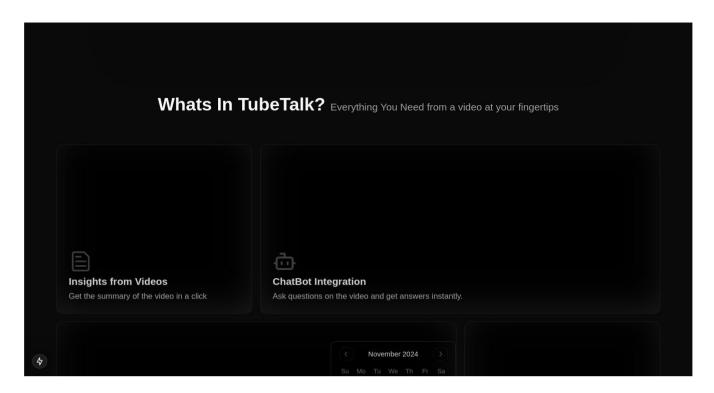


Fig 2: Features page

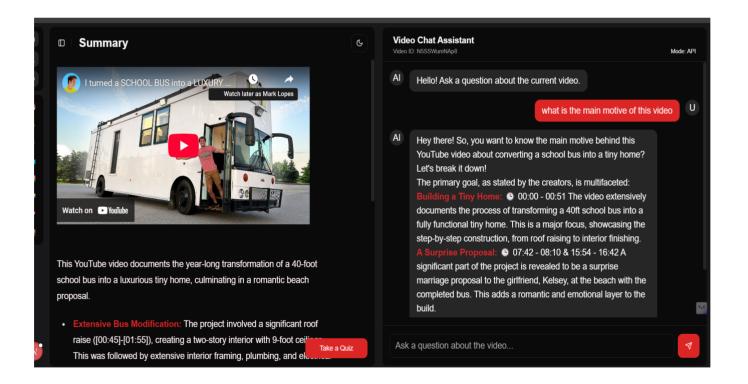


Fig 3: Chatbot and summary page

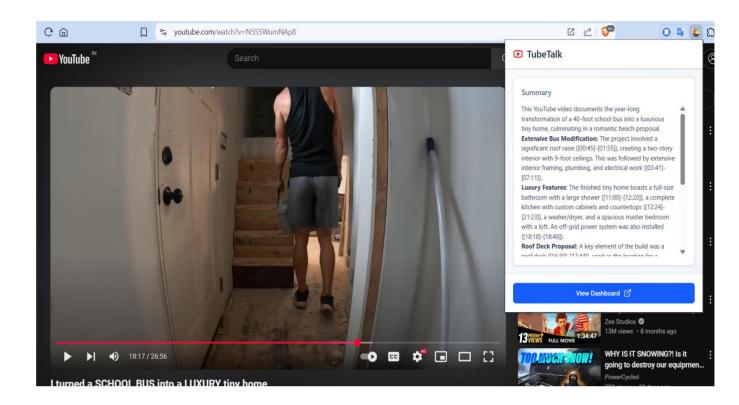


Fig 4: Extension page

#### Conclusion and Future Work

#### 6.1 Conclusion

To sum up, the YouTube Video Analyzer app offers a sophisticated, approachable platform for downloading, examining, and engaging with YouTube video material. The solution gives users an effective approach to find pertinent information and test their knowledge of video footage by utilizing cutting-edge transcription services like AssemblyAI and strong vector search capabilities with FAISS and Google Generative AI. By automating transcription, information extraction, and quiz creation, this project streamlines video analysis and enables users to learn from videos without the need for technical know-how. The application encourages deeper learning and a more interesting method to engage with video-based knowledge thanks to its interactive design.

#### 6.2 Future Work

Google Form Quiz Generation: Integrate automated generation of quizzes into Google Forms based on the video transcript. This facilitates easy distribution, especially in academic and training environments.

Live Stream Transcription in Real Time: Create the ability to transcribe YouTube videos that are being streamed live so that analysis and Q&A can take place in real time.

Viewing History and Progress Tracking: Maintain a viewing history for each user, allowing them to revisit previously analyzed videos, monitor their learning journey, and resume interactions seamlessly.

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## GITHUB LINK:

https://github.com/MarkLopes11/Third\_year\_mini\_project

