

Motivation

Why Consulting Case ChatBots?

TOP CONSULTING FIRMS

McKinsey & Company

Deloitte.

LEK EY Parthenon accenture

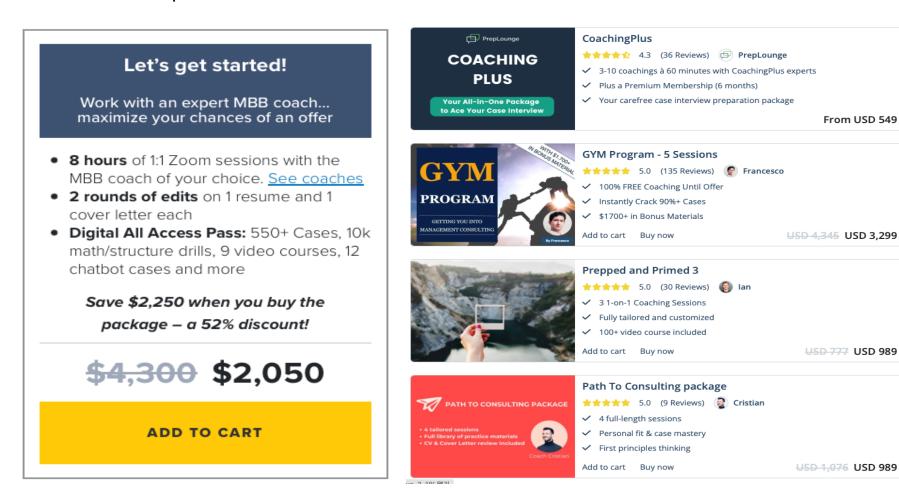
Strategy& Berger KEARNEY OliverWyman

Interviews are always **NERVOUS!**



Gap in the Market

- Current price of mock interviews are overly expensive
- More than \$2000 with a 50% discount!



From USD 549

USD-777 USD 989

USD 1.076 USD 989

Scope of the product

- Specifically, Business consulting
 case interviews
- Which provides interactive interviews of specific case
 studies
- Requires knowledge of the field



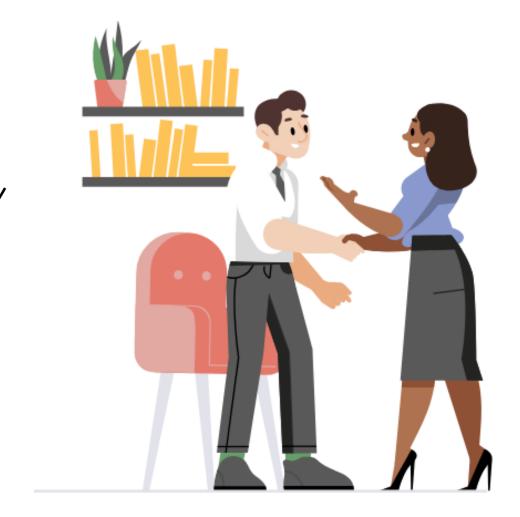
Goal & Target Customers

- Want to build an interactive chatbot that can practice mock interviews and provide evaluations and feedback
- Target Customer: Job candidates
 preparing for business case
 interviews



Cacey the ChatBot: An Interactive Business Consulting Interview Assistant

Team 7. Lindenau Tim / Nielsen Sigurd Frank Thorlund / Jihoon Han / Donghwa Kim / Jaehoon Hahm /



Members



Jihoon Han Product Owner



Tim Lindenau

Architecture

LLMs



Nielsen Sigurd Frank Thorlund

Evaluation



Jaehoon Hahm MLOps ML-Expert



Donghwa Kim MLOps ML-Expert



Live Demo

Live Demo

Sign in

Sign up

Welcome to Cacey

The best way practice cases online.

Advanced by AI



Architecture



Three Factors when Deciding for an Architecture



1. Moving Fast

Similar Technologies in Frontend and Backend so **everyone can participate** everywhere



2. Developer Experience

Full **Typesafety** and automatically generated **Type** hints to prevent Bugs and support Developers

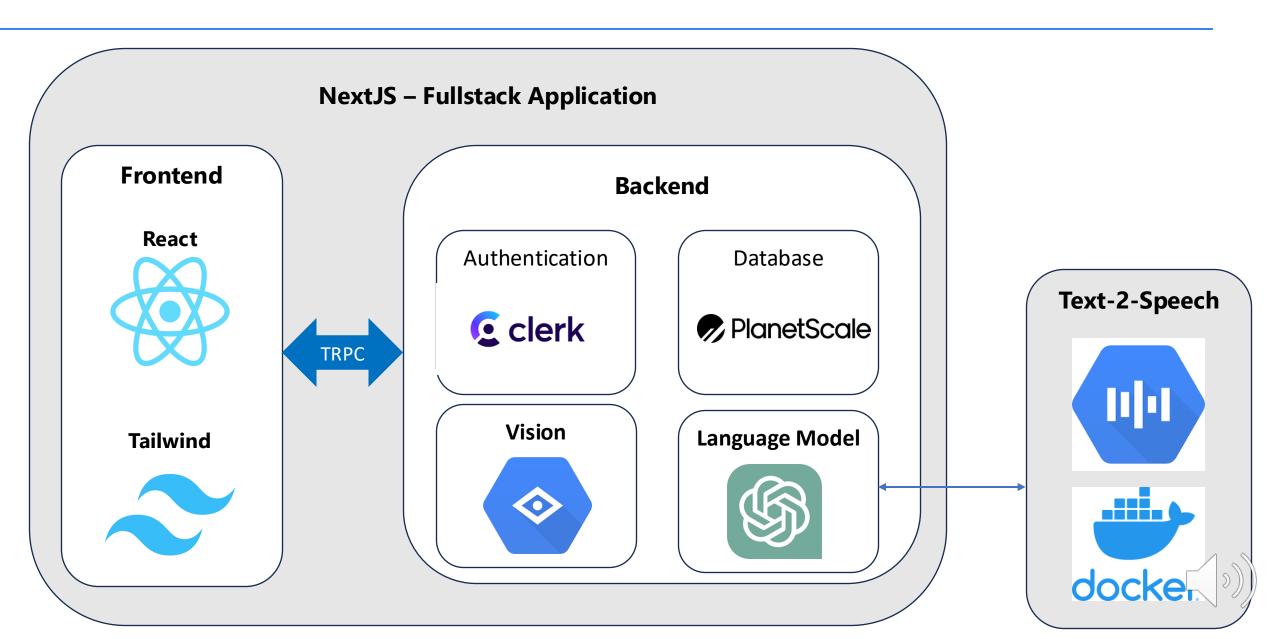


3. Costs

Low Prices and **Generous Free Tiers** to cheaply scale to the
first thousand customers



Architecture Overview





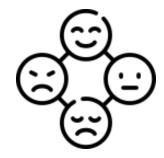
Main Features



4 Key Components For Successful Interview Training



1. Chatbot Interview Partner



3. Image Guided Emotion Analysis



2. Speech To Text



4. Case Evaluation



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Cases are Complex, You Cannot just use ChatGPT for the Whole Interview

Example Prompt Chatbot

"You are to take the role of an interviewer in a Case Interview for a Management Consulting Firm. ...

The case is the following: A Company is trying to enter the market of ,...

One reference solution for the case could be the following:

- 1. Framework
 - 1. Bucket 1: Market Attractiveness
 - 2. ...
- *2*. ..

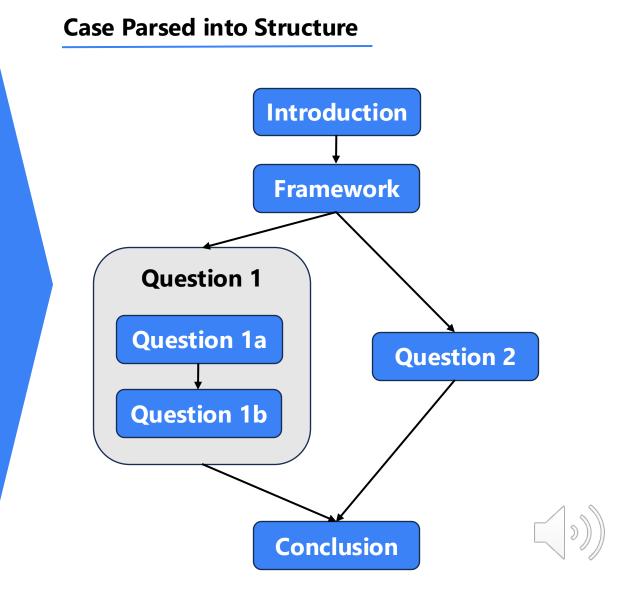
Start the case now:"

- Approach like this does not work well
- ChatGPT struggles with long-term dependencies
- ChatGPT has issues properly guiding to next structure points
- High complexity in prompt tuning and missing control

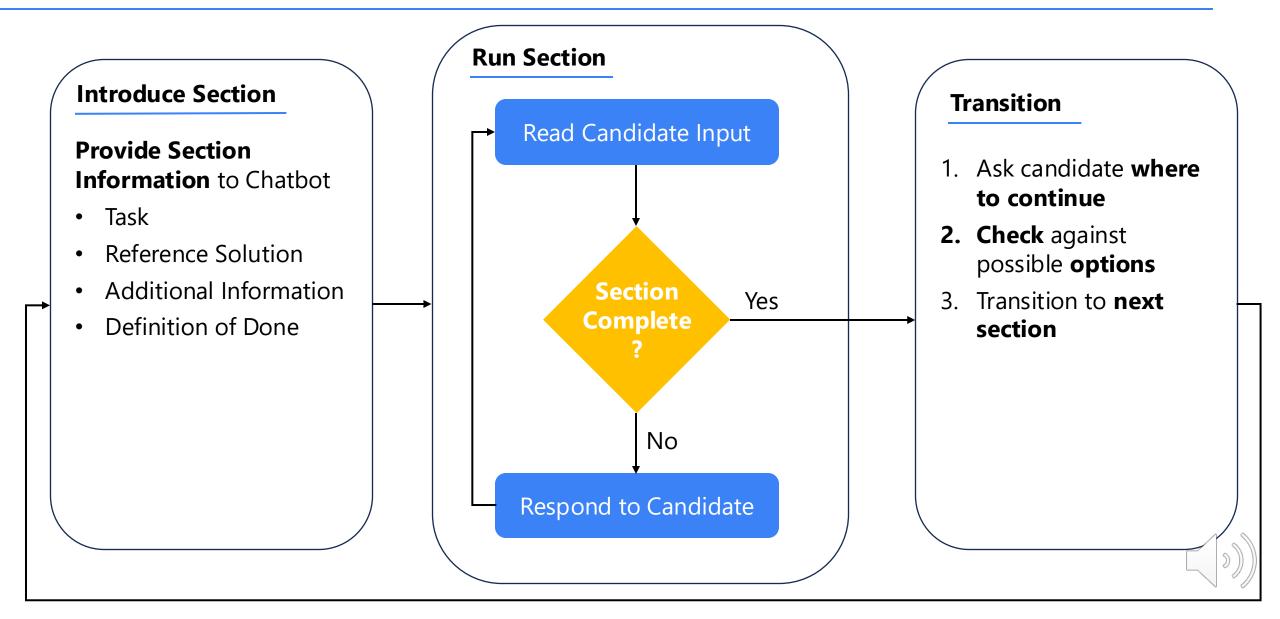


Cases are Complex, You Cannot just use ChatGPT for the Whole Interview

- From solving more than 30 cases we know that each case follows a similar general structure
- Question: Can we create a state-machine to follow this structure
- Introduce special file format to parse arbitrary cases to state-machine
- For each stage we can individually instruct
 ChatGPT
 - Provide additional information
 - Provide reference solution
 - Check whether section finished



A State-Machine Helps to Reinstruct ChatGPT for Specific Sections



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Speech To Text Provides an Additional Modality To More Truthfully Imitate Interview Situation

Motivation why Speech

- Closer to real interview
- Analyze Speed, Clarity, (Sentiment)

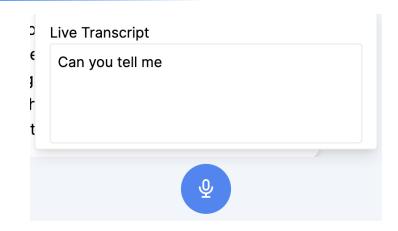
Our Solution:

- Decision for Google Speech due to real-time streaming capabilities
- Live Transcribe Text
- Compute Speed and Clarity Scores

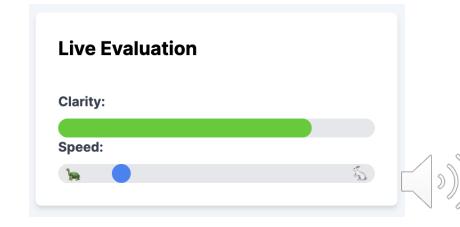
Challenge:

- Google Speech requires File System
- File System **not available** in Browser
- Build additional service to connect Browser and Google Speech

Live Transcription



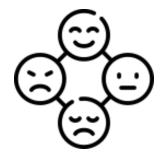
Live Evaluation



4 Key Components For Successful Interview Training



1. Chatbot Interview Partner



3. Video Guided Emotion Analysis



2. Text To Speech



4. Case Evaluation

Emotion Analysis (Video)

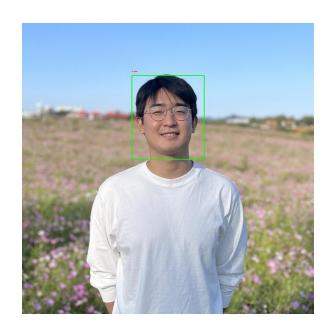
Possible Solutions for Emotion Analysis:

- 1. Pretrained machine learning model for emotion analysis
- 2. Google Cloud Platform: Video Intelligence API (expensive)
- 3. Google Cloud Platform: Vision AI, ImageAnnotator (convenient!) → our chosen solution

Method

- 1. Record frame every 10s for the input video.
- 2. Detect faces, analyze 4 emotions in likelihood scores.
- 3. Save it into emotion likelihood DB for every frame
- 4. Pass the average score to LLM for sentiment analysis

Likelihood	Evaluation Score				
VERY_LIKELY	4				
LIKELY	3				
POSSIBLE	2				
UNLIKELY	1				
VERY_UNLIKELY	0				

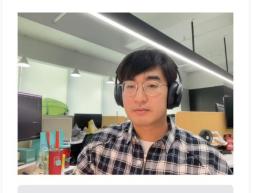






Please wait, gathering enough evaluations...

Your Video



Try to smile more often to appear more friendly.



4 Key Components For Successful Interview Training



1. Chatbot Interview Partner



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2. Text To Speech



4. Case Evaluation

Evaluating Cases Generates Value For Users



Purpose

- Evaluate candidate performance upon completing a case
- Value in feedback and pointers on how to improve



Challenges

- Evaluations are subjective judgements made on expert intuitions
- Each case may be evaluated differently
- No data available



Questions

- How can we introduce expert intuition in case evaluations?
- How do we make the framework general enough to work with all cases?

Prompt Templates Build On Expert Evaluation Criteria Provide General Framework For Feedback



Build prompt templates for each section type for scoring



Prompt templates build on expert evaluation criteria

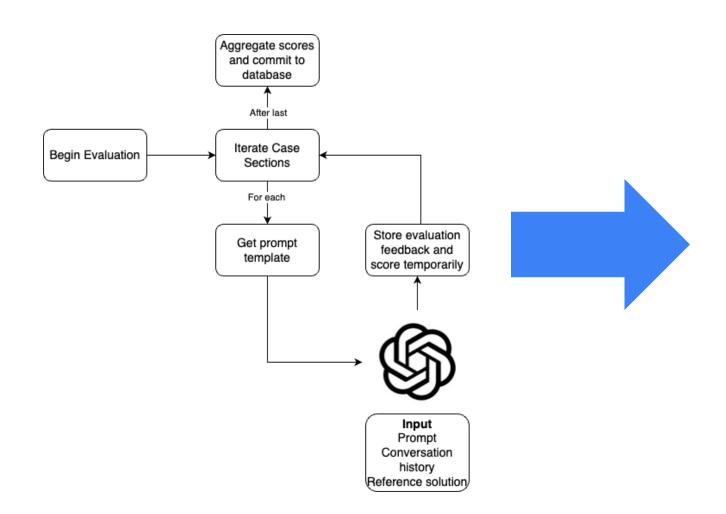


Compare candidate answers to reference solution



Focus on constructive feedback for the candidate. What should they do better next time

Case Evaluation



5/10

Your introduction is off to a good start. You asked a relevant question to clarify your understanding of the case. However, you missed an important step, which is summarizing the case back to the interviewer. This step is crucial to ensure that we are on the same page and that you have a clear understanding of the task at hand. In future interviews, make sure to include a brief summary of the case in your introduction.

Here's an example of how you could have summarized the case

"So, if I understand correctly, our client is a biotech company that has developed a groundbreaking treatment for Alzheimer's disease. This treatment is unique because it slows the progression of the disease rather than just treating its symptoms. However, there is a potential risk to the launch of this treatment due to a rumored shortage of



Business Model

Conducting one Interview Costs Around \$1

Tokens Per Interview:

From Experience we know each Interview has:

- 2500 Output Tokens
- 30 000 Input Tokens

Cost Per Token (GPT-4.5 Turbo):

- Input: \$0.01 / 1K tokens
- Output: \$0.03 / 1K tokens

Cost Per Interview:

$$$0.01*2.5 + $0.03 * 30 = $0.93^{1}$$



Our Business Model – Subscription for Just \$70 / Month Much Cheaper Than Competition

Our Service Available for Just **\$70** a Month Much Cheaper Than The Competition

Key Assumptions:

- 20 Interviews per Month
- 2 month of preparation
- More than 1M people doing consulting interviews each year¹
- 0,1% will use our product

Running the Numbers:

- Number of Users: 10,000
- Costs: \$372,000
- Revenue: \$1,4M

Profit Potential ≈ \$1M



Execution

Two Factors For Effective Team Organization



Factor 1 - Weekly Meetings

- Discuss last week's results
- Decide next week's priorities
- Split parts based on skills and knowledge



Factor 2 - Effective Tooling

- GitHub (Code)
- Shared Figma (Design)
- Draw.IO (Diagrams & Documentation)
- Kakao Talk

Project Timeline

	10/16	10/26	11/02	11/09	11/16	11/20	11/23	11/30	12/6	12/8	
Ideation & Scoping	✓										
Prompt Engineering	✓	✓									
Architecture Design		✓	✓								
Develop Fundamental Components			√	√	√						
Develop UI (Frontend)				√	✓	✓					
Connect All Components Together							√				
Refine & Test											
Final Presentation								Have a Look At Our Timeline in the Appendix			

Three Key Learnings Throughout the Project



Ideation

- ✓ Good thing to spend time on searching topic and competitor solutions
- ✓ Verifying that product idea is sound and can provide value



Proof of Concept

- ✓ Verify functionality in first draft produced in Python with simple CLI application
- ✓ Fail fast and ensure that the solution is feasible



Architecture

- ✓ Choose architecture based on the skills of the team members.
- Choice of coding language is important to allow all members of the team to contribute to code base.
- Learning while doing requires more effort.



Future Work

Three Ideas for Future Improvements



1. Improve Chat Quality

Introduce **second LLM** to **evaluate responses** before showing to Candidate¹



2. Add More Cases

More cases can easily be added to the library. Manual labor of 30 minutes required per case



3. Improve Evaluation

Gather **more datapoints** for evaluation. Examples include **Sentiment, Tone, and Pose**

THANK YOU



Appendix

Filter and Improve Chatbot Responses

The Challenge

- In the state-machine, chatbot required to provide output in well-defined format
- Example: Did The Candidate Finish This Section → Answer: True/False

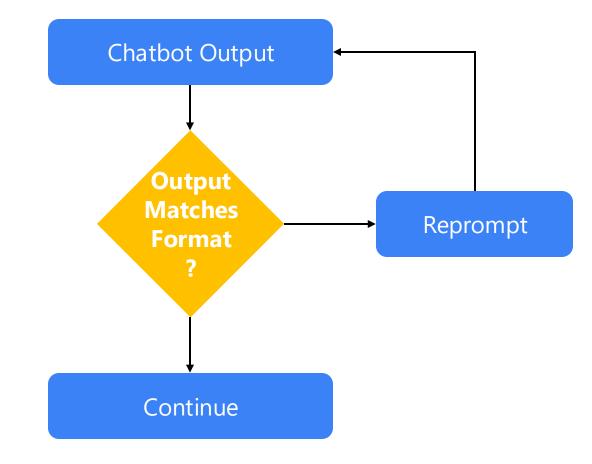
Our Solution:

Custom Safety Filters to match patterns and reprompt the model

Future Work:

- Safety Filter only checks semantics but not content
- Output quality can be improved by having a second model evaluate the output

Safety Filter Architecture



DevOps – Easy Deployment, Automatic Scaling and Separation between Production and Development Environment



1. Vercel

- Deploy Next.Js application on serverless infrastructure
- Master branch automatically published
- Other branches published to private preview builds



2. Google Cloud

- Cloud Run to deploy containerized speech-to-text service
- Vision API
- Vertex Al language models



3. Planetscale

- Automatically scaling database
- Production and development environment separated by environment variables
- Git-like branching feature to testfeatures more easily



4. Clerk

- Service to guarantee stable and secure authentication
- Production and development environment separated
- Secures application and speech-2-text

Project timeline

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Architecture Design		✓	√							
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Develop UI (Frontend)				√	✓	√				
Connect All Components Together							√			
Refine & Test								√	√	
Final Presentation										√