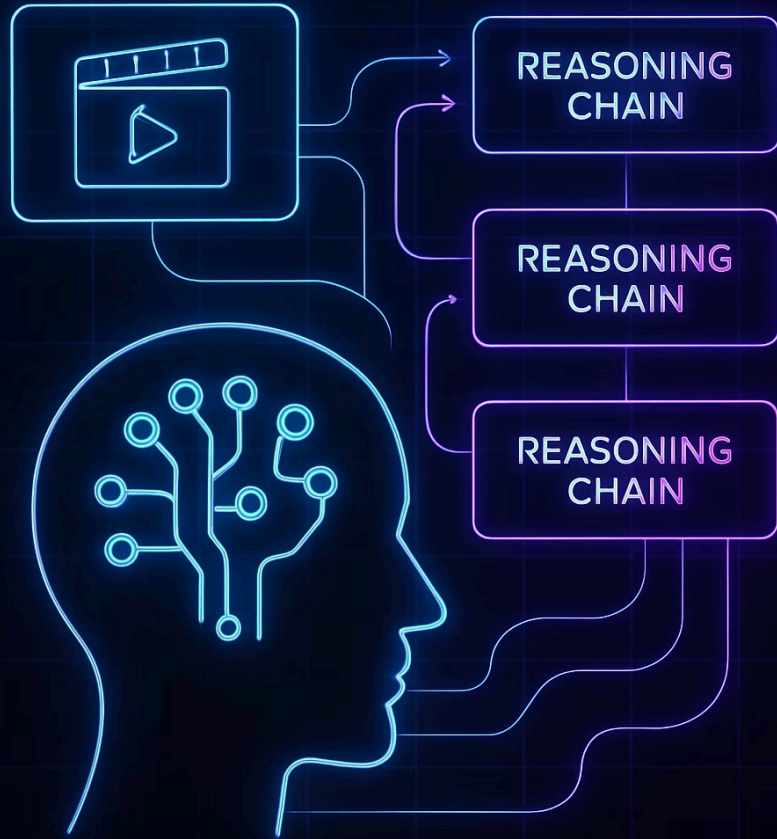


AI ANALYZING VIDEO CONTENT



Towards Advanced Video Understanding: An Agentic Chain-of-Chain-of-Thoughts (CoCoT) Framework

Team SeekDeep introduces CoCoT → Chain-of-Chain-of-Thoughts
Bringing deeper, adaptive reasoning to video analysis.



Dylan Chia

Team Leader, AI Infra and Archi
NUS CEG + AI Researcher



John Henry

AI Archi, Modelling
SUTD DAI + AI Researcher



Hai Le

AI Archi, Modelling, Tuning
SUTD CSD + AI Researcher



Leng Yunze

Video Experimentation
NUS CDE AI PhD Candidate

Leaderboard dominating performance

TikTok for developers

[Home](#) [My Project](#) [Leaderboard](#) 

Singapore AI Student Challenge 2025

Leaderboard

Rank ①	Team	Submit Time	Correctness Performance ①	Robustness Performance ①
1	d*****a@u.nus.edu	2025-04-24 14:53	90.73%	71.6%
2	r*****g@mymail.sutd.edu.sg	2025-04-24 13:04	58.07%	15.3%
3	s*****1@scis.smu.edu.sg	2025-04-25 18:12	55.07%	14.6%
4	x*****1@mymail.sim.edu.sg	2025-04-25 13:18	49.93%	13.4%
5	e*****4@u.nus.edu	2025-04-10 00:28	40.33%	23%
6	e*****0@u.nus.edu	2025-04-24 21:40	37.87%	6.7%
7	e*****7@u.nus.edu	2025-04-25 11:26	37.27%	6.5%
8	e*****2@u.nus.edu	2025-04-03 13:13	36.67%	11.7%
9	b*****1@e.ntu.edu.sg	2025-04-13 23:17	36.13%	8%
10	z*****g@u.nus.edu	2025-04-25 18:11	35.20%	6.9%

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Initial CoCoT
(Heuristics)
Score

Correctness:
90.73%

Robustness: 71.6%

Leaderboard dominating performance

TikTok for developers

Home

My Project

Leaderboard



Singapore AI Student Challenge 2025

Leaderboard

Rank ①	Solution	Team	Type	Submit Time	Correctness Performance ①	Robustness Performance ①
1	SeekDeep	d*****a@u.nus.edu	Agent	2025-05-07 18:31	73.60%	55.2%
2	A&T: Augment and Th...	r*****g@mymail.sutd.edu.sg	Agent	2025-04-24 13:04	58.07%	15.3%
3	Two-Stage Self-Cons...	s*****1@scis.smu.edu.sg	Agent	2025-04-25 18:12	55.07%	14.6%
4	fewbugs	x*****1@mymail.sim.edu.sg	Model	2025-04-25 13:18	49.93%	13.4%
5	qwen2.5vl32b	e*****4@u.nus.edu	Model	2025-04-10 00:28	40.33%	23%
6	Aichem1st	e*****0@u.nus.edu	Agent	2025-04-24 21:40	37.87%	6.7%
7	InternVL3 with Promp...	e*****7@u.nus.edu	Agent	2025-04-25 11:26	37.27%	6.5%
8	Arnav	e*****2@u.nus.edu	Agent	2025-04-03 13:13	36.67%	11.7%
9	Pengi	b*****1@e.ntu.edu.sg	Model	2025-04-13 23:17	36.13%	8%
10	Test	z*****g@u.nus.edu	Model	2025-04-25 18:11	35.20%	6.9%

< 1 2 >

Finalised
CoCoT
(Exploratory)
Score

Correctness:
73.6%

Robustness:
55.2%

The Challenge: Complex Reasoning nuance in Short-Form Videos



Information Density

Short videos are packed with content requiring complex reasoning for accurate VQA.



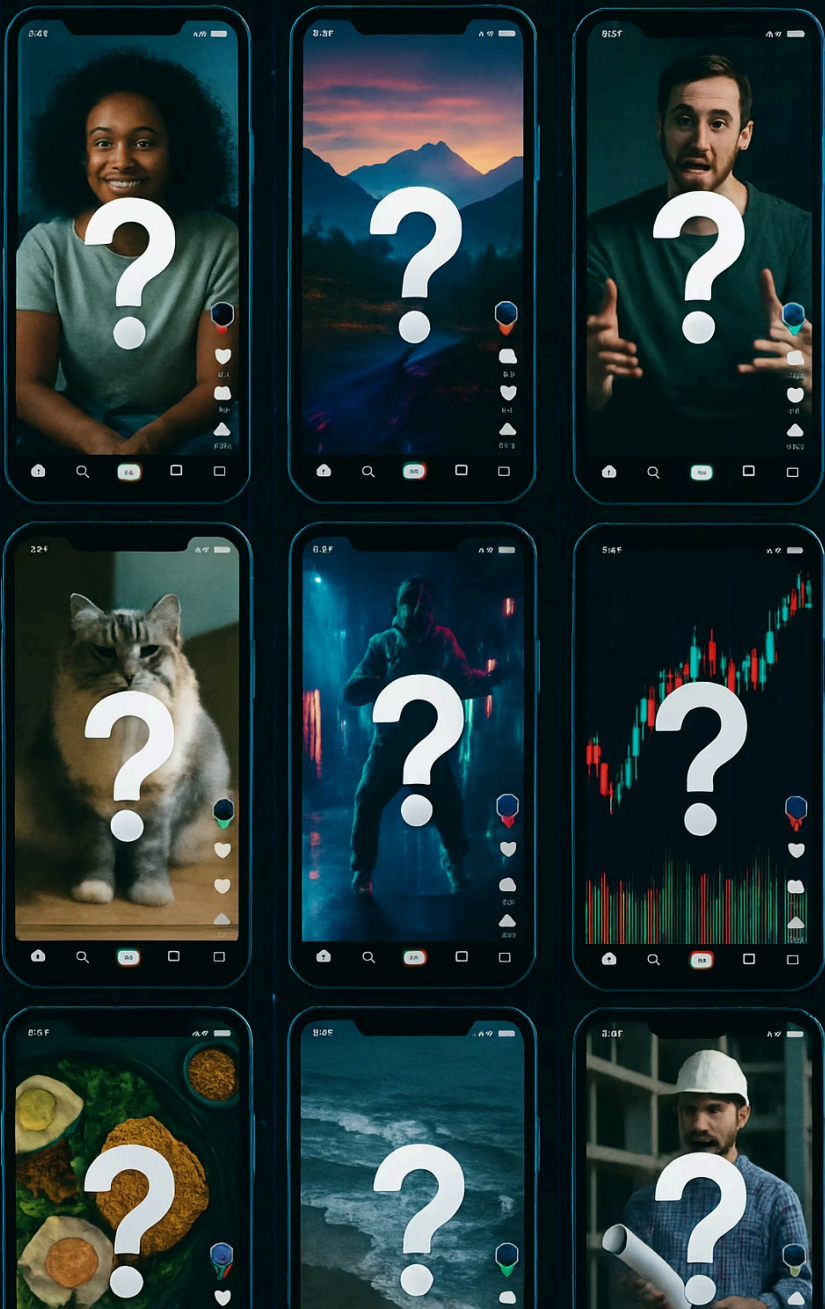
Tricky Questions

Current models struggle with multi-step inference across diverse content.





Scalability Challenges

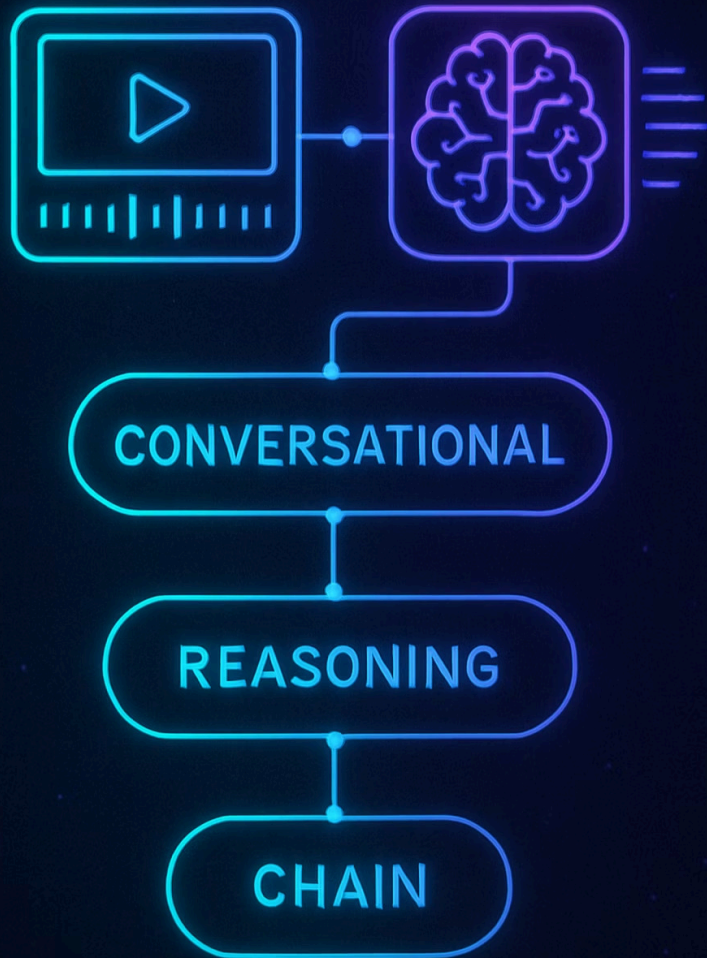
Real-world volumes demand efficient processing solutions.



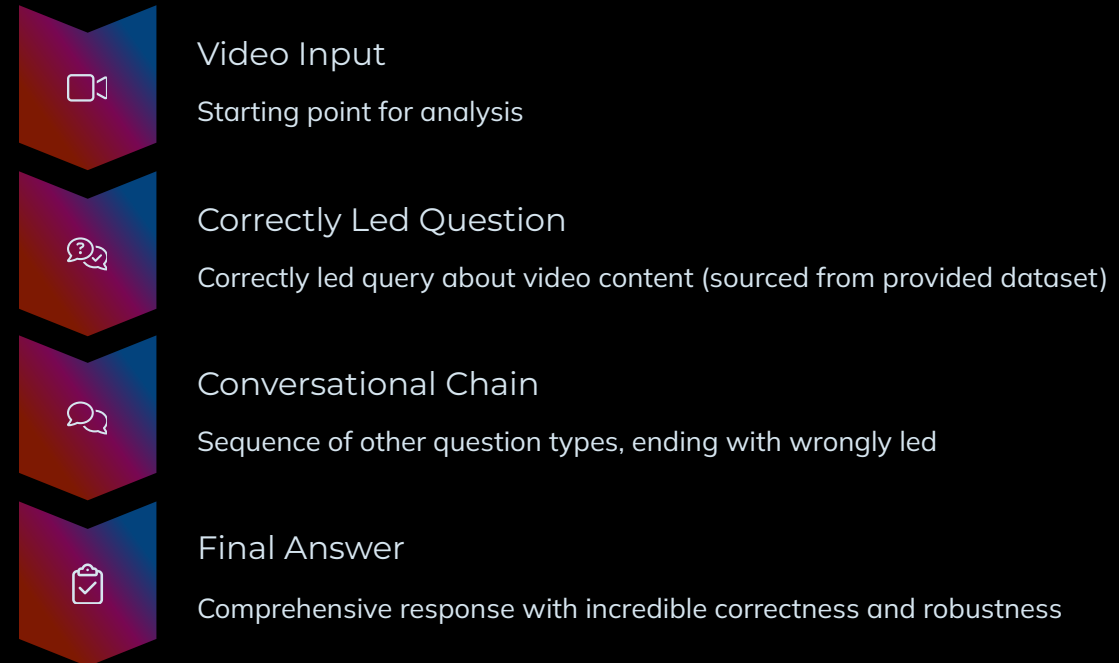
Starting Point: The Power of Prompted Chain-of-Thought (CoT)

Model Approach	Correctness	Robustness	Notes
 Vanilla Gemini 2.5 Pro	~60%	~20%	<i>Robustness = % of question sets fully correct</i>
 Gemini 2.5 Pro + CoT Prompting	67.6% (↑ 7.6%)	51.2% (↑ 31.2%)	Model articulates step-by-step reasoning before the final answer.

AI ANALYZING VIDEO CONTENT

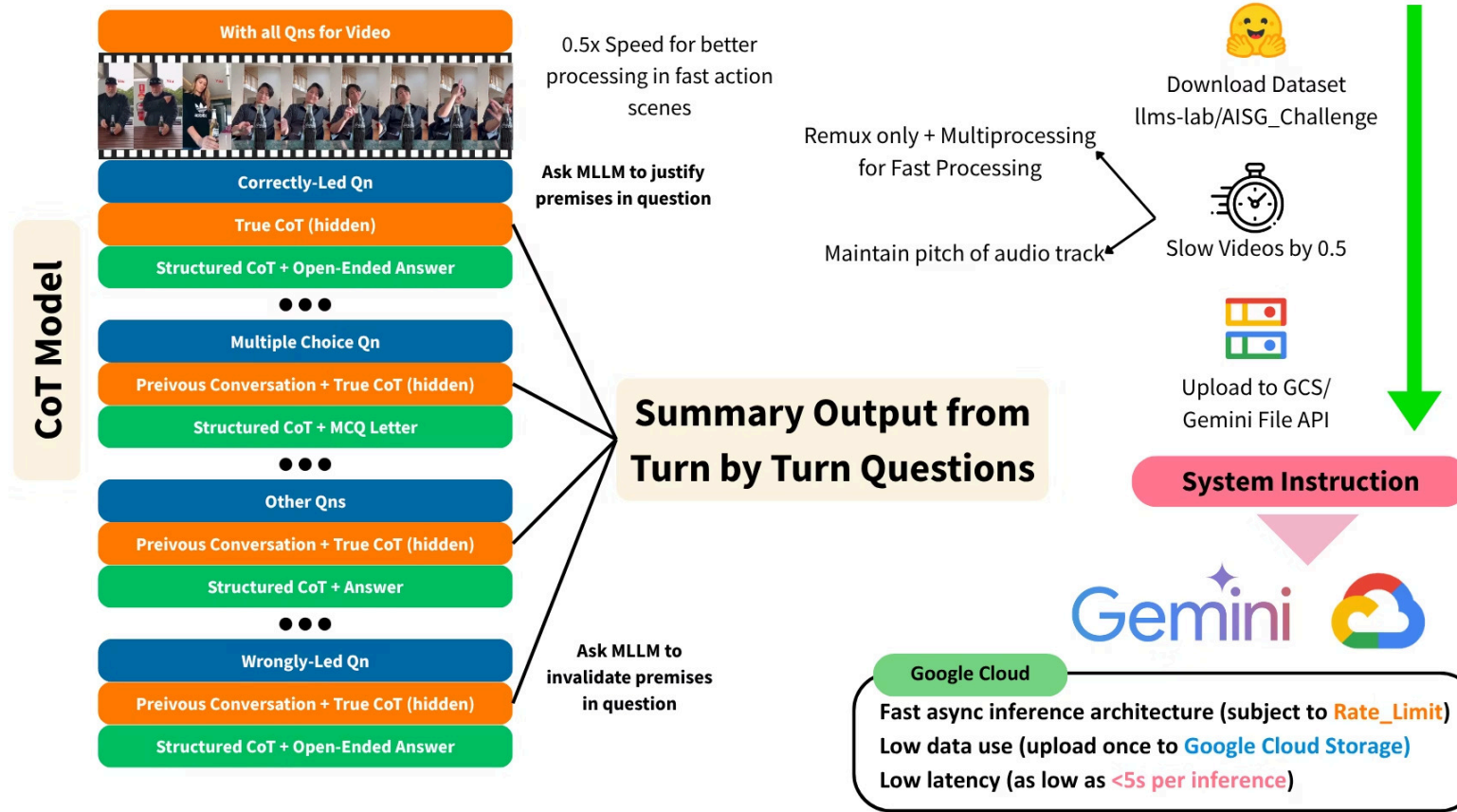


Agentic CoCoT (Heuristic): Unveiling the Framework's Potential



Our Heuristic CoCoT version achieved **90.73% correctness** and **71.6% robustness**, proving the potential of chained conversational reasoning.

Chain of Chain of Thought Heuristics (CoCoT)



Model
Diagram


CoCoT
Heuristics

Agentic CoCoT (Exploratory): Autonomous Reasoning with Generated Questions



Video + Question

Initial input requiring complex analysis



Agent Generates Exploratory Questions (Ex-Qns)

Model formulates exploratory questions for a specific video



Answer Video Q1 (CoT)

Step-by-step reasoning for first VQA Question with Ex-Qns CoCoT



Generate for Next Question

Using previous CoToT from Ex-Qns to guide subsequent VQA questions for the same video

Our core innovation achieves **73.60% correctness and 55.2% robustness**, outperforming standard CoT prompting while adapting to diverse scenarios in real world applications.

Chain of Chain of Thought Exploratory (CoCoT)

For each question:



0.5x Speed for better processing in fast action scenes

+

Exploratory Question Synthesis

Exploratory Question
True CoT (hidden)
Structured CoT + Open-Ended Answer

...

Exploratory Question
Previous Conversation + True CoT (hidden)
Structured CoT + Open-Ended Answer

↓

Main Question (Only 1 per video)
Previous Conversation + True CoT (hidden)
Structured CoT + Open-Ended Answer

CoT Model

Turn by Turn
CoCoT Cached

Summary
Output

Remux only + Multiprocessing
for Fast Processing

Maintain pitch of
audio track



Download Dataset
llms-lab/AISG_Challenge



Slow Videos by 0.5



Upload to GCS/
Gemini File API

System Instruction



Google Cloud

Fast async inference architecture (subject to **Rate_Limit**)
Low data use (upload once to **Google Cloud Storage**)
Low latency (as low as **<5s per inference**)

Model
Diagram

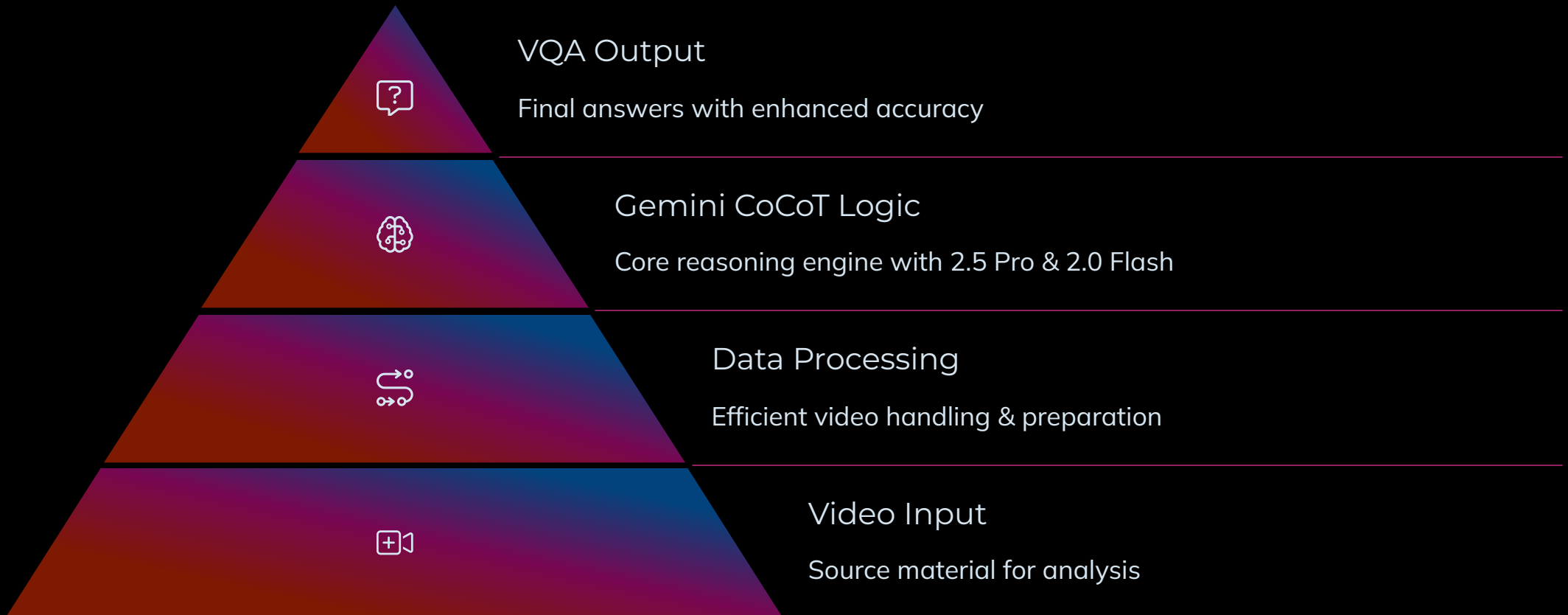
CoCoT
Exploratory

Evaluation Summary: The Journey to Enhanced Understanding



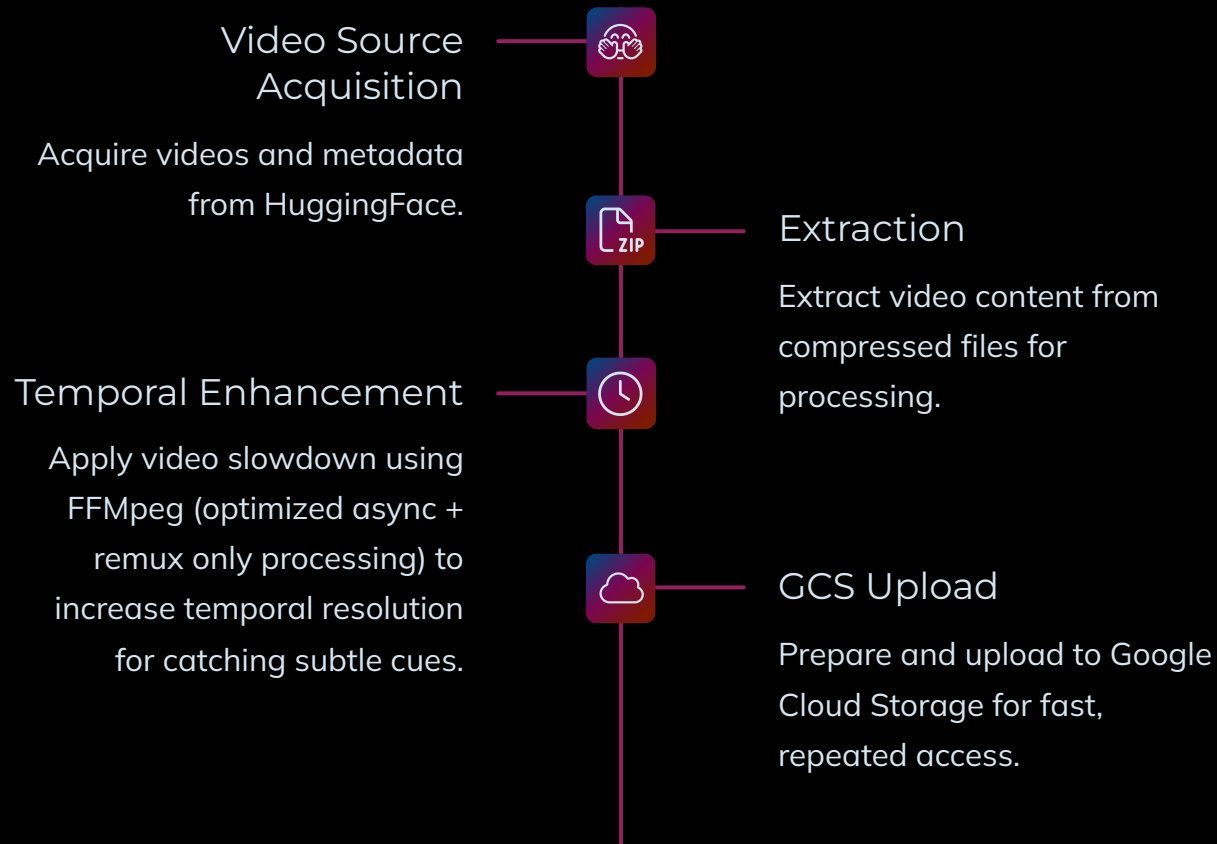
Method	Correctness (%)	Robustness (%)	Key Characteristic
Gemini 2.5 Pro (Vanilla)	60.0	20.0	Baseline (Video slowdown + normal optimized prompt Only)
CoT Prompting in Reasoning Models	67.6	51.2	Single-step explicit CoT prompting in reasoning models
CoCoT (Heuristic)	90.73	71.6	Agentic Multi-step, correctly led-guided, limited to competition dataset
Agentic CoCoT (Exploratory)	73.60	55.2	Agentic Multi-step, agent-generated ex-qns, applicable to Real World Applications

System Architecture: Enabling CoCoT



Our modular design supports Vertex AI & Gemini APIs, optimized for speed, extensibility, and benchmark performance.

Step 1: Data Processing Pipeline



Step 2: Fast & Efficient Inference

Async Scalability

Maximizing API rate limits through async parallel uploads & inference, saturating rate limit

Minimizing bandwidth with GCS: upload once, infer many times

Intelligent Caching

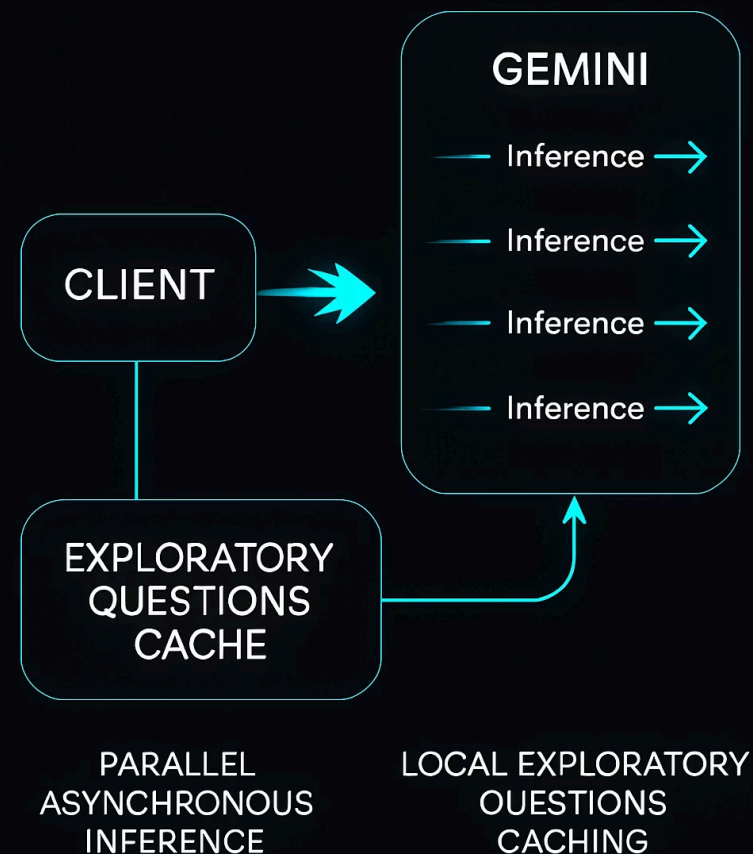
Ex-Qns CoCoT reasoning chain cached per video

Pre-warmed for VQA; real-time: first inference populates video exploratory questions cache

Optimized Latency

Exploratory Qns Inference (Gemini Flash 2.0): < 3 seconds

VQA CoCoT Reasoning (Gemini 2.5 Pro): ~15 seconds





Conclusion & Next Steps



Leaderboard topping benchmark performance

Significant improvements in correctness and robustness over SOTA and other teams.



Innovative and Novel advanced Framework

Agentic CoCoT advances deep multimodal understanding for videos.

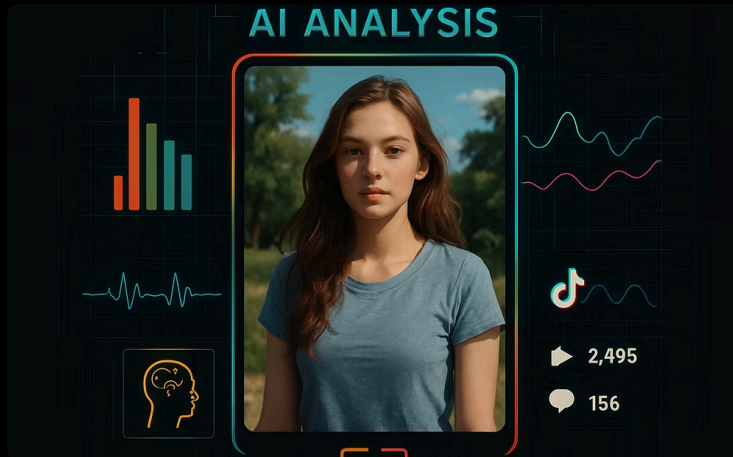


Optimized High Performance and Efficient Scalable System

Fast, scalable solution leveraging GCS (reducing bandwidth) and parallel async processing, and also caching for exploratory questions.

Our system is ready for complex video analysis and Q&A, demonstrating the future of intelligent video understanding.

CoCoT in Action: Demo



Sample Video

TikTok-style content/ Youtube short video requiring complex understanding



Generated Questions

Agentic CoCoT autonomously creates exploratory sub-questions