

AI Agent

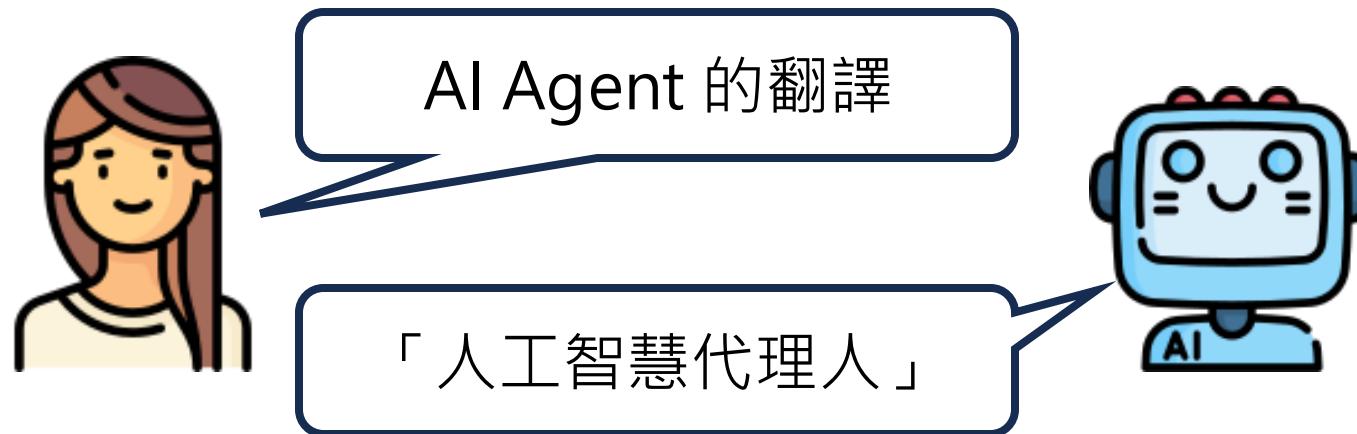
李宏毅

免責聲明：AI Agent 是一個被廣泛使用的詞彙，故本課程中所講的 AI Agent 不一定跟其他地方一樣

今天使用 AI 的方式

人類給予明確指令

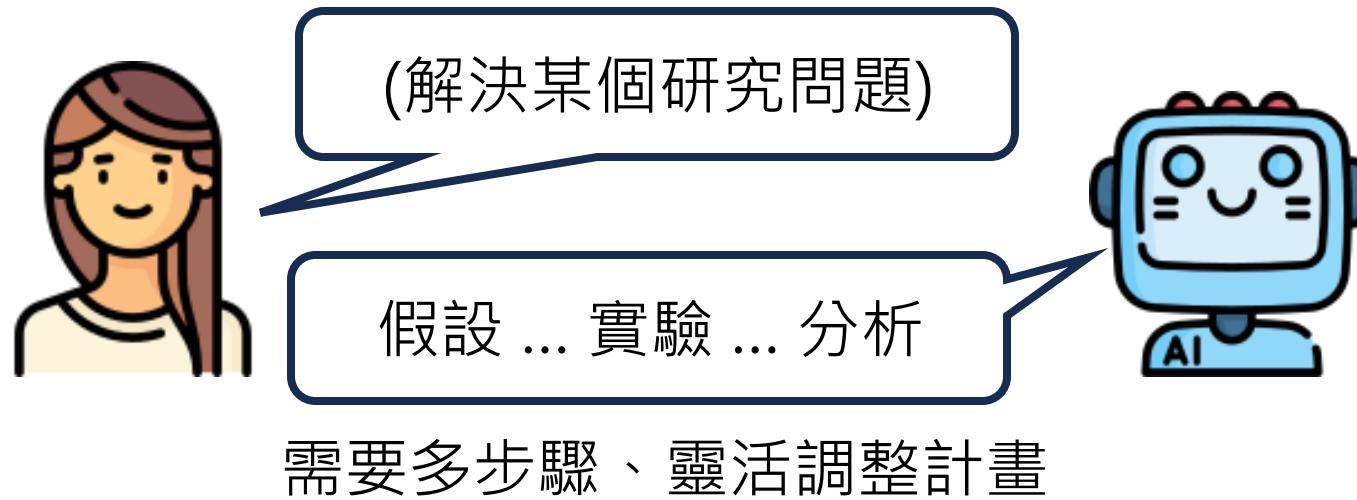
AI 一個口令
一個動作



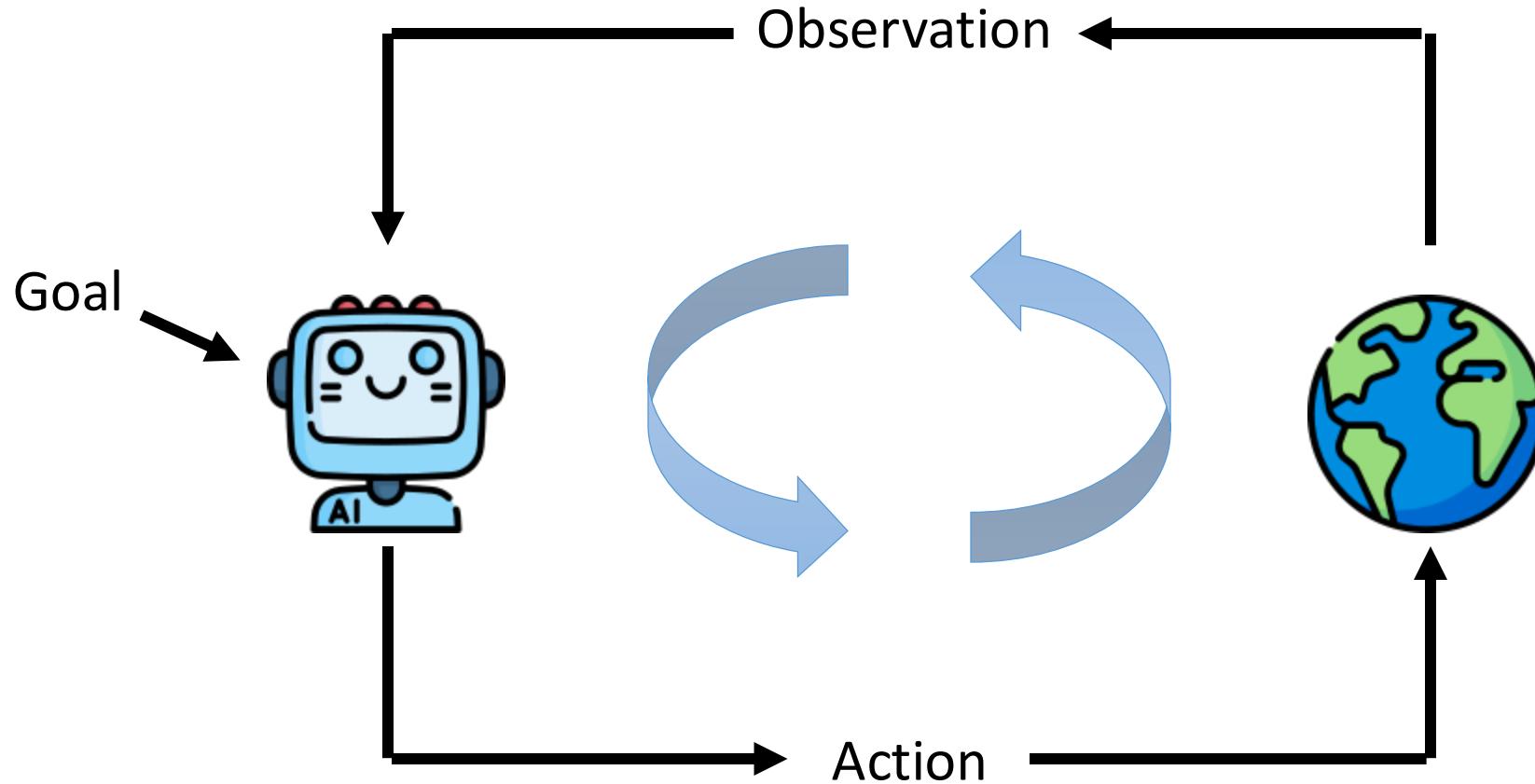
AI Agent

人類給予目標

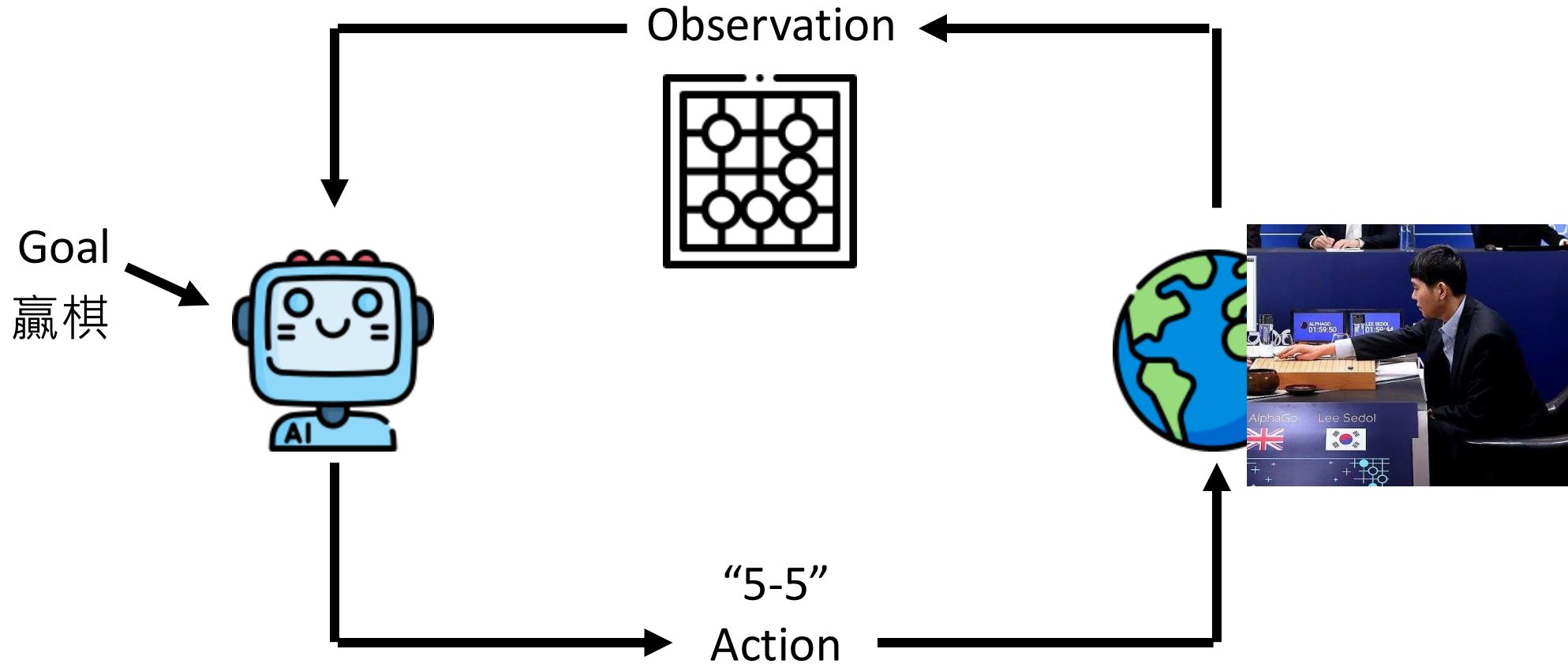
AI 自己想辦法達成



AI Agent

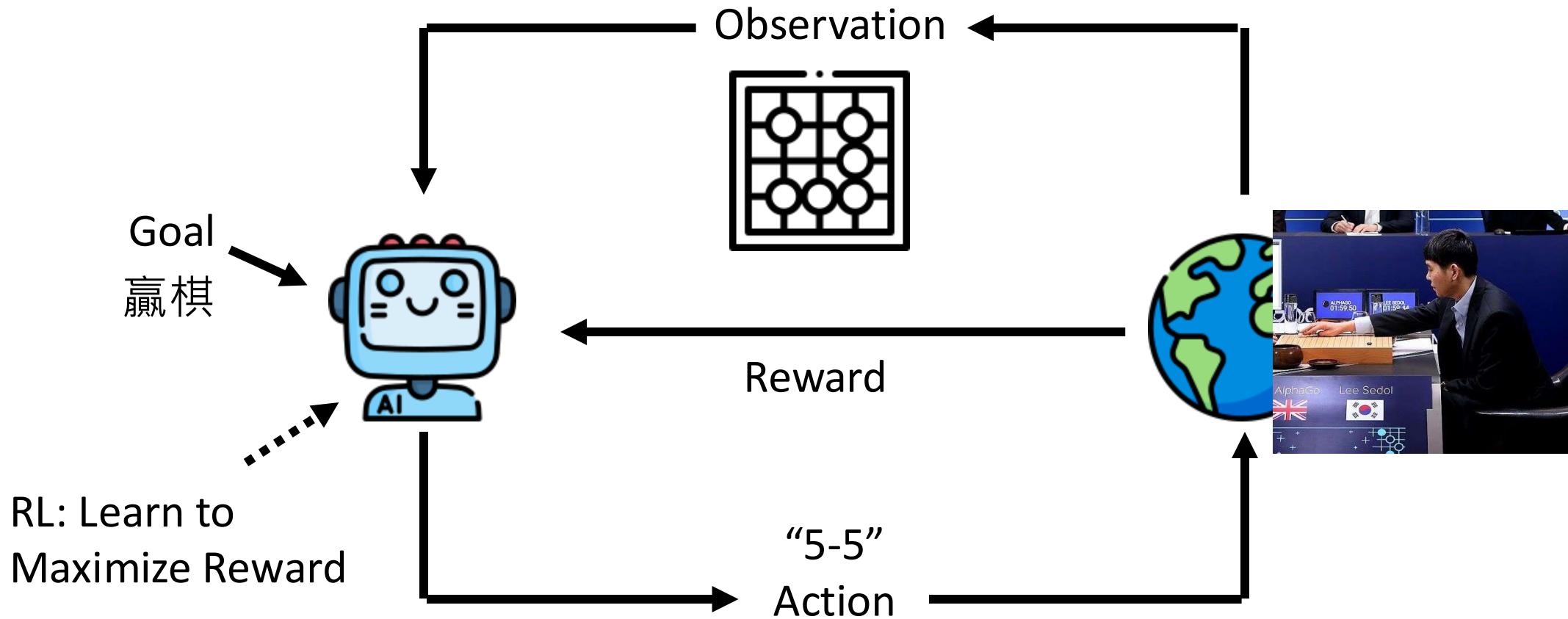


AI Agent (AlphaGo)



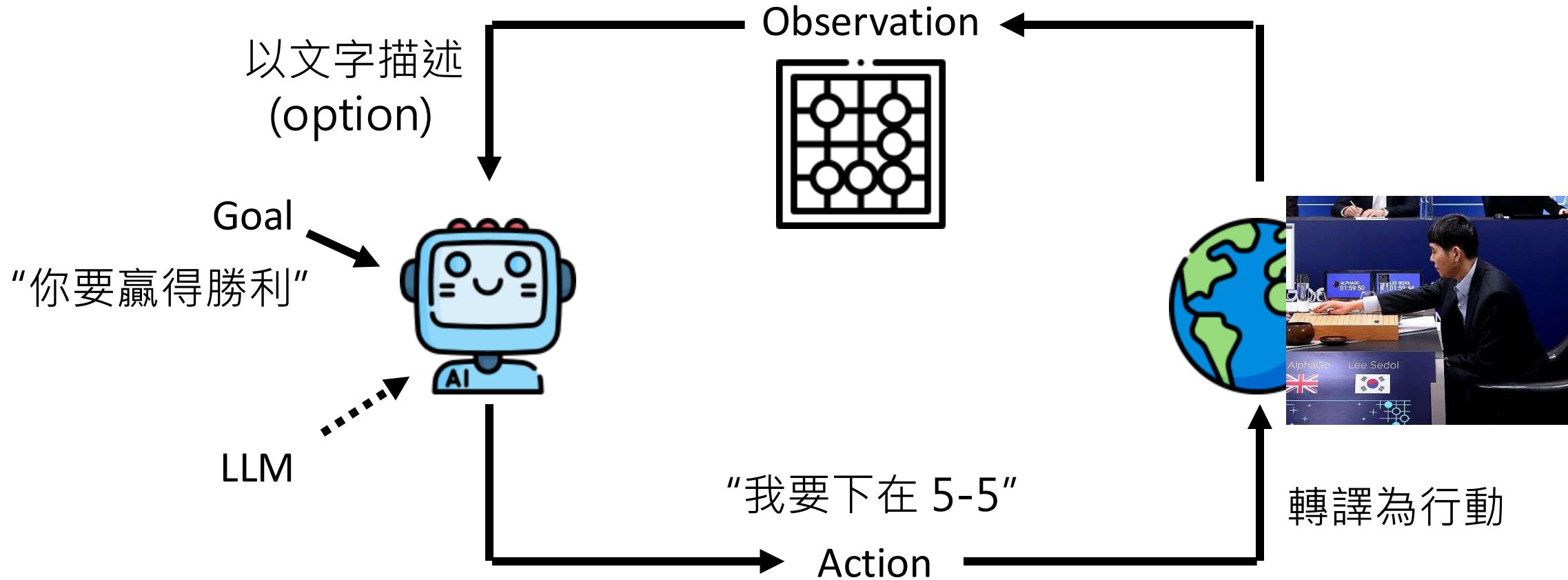
好像在那裡聽過這個段落？這是 Reinforcement Learning (RL) 常見開場

如何打造 AI Agent? RL?



侷限：需要為了每一個任務以 RL 訓練模型

如何打造 AI Agent? 直接用 LLM !

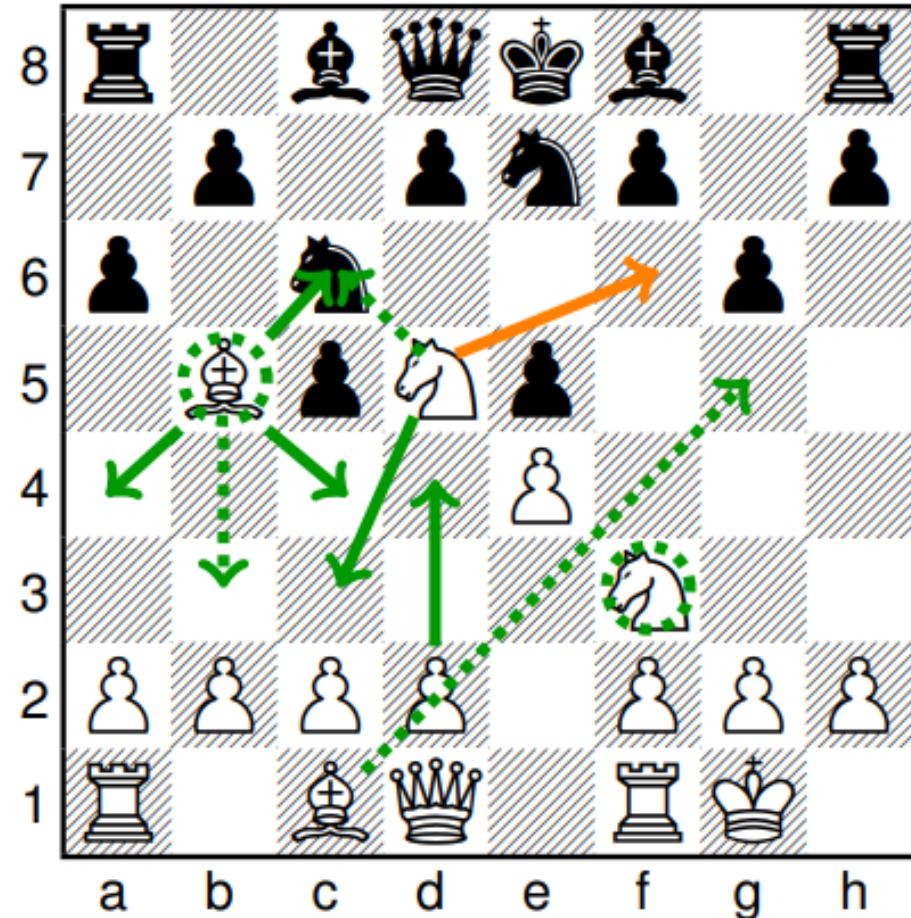


以 LLM 直接實踐人類對於擁有 Agent 的渴望

LLM 能不能下棋？

- BIG-bench

<https://arxiv.org/abs/2206.04615>



In the following chess position, find a checkmate-in-one move.

1. e4 c5 2. Nf3 e5 3. Nc3 Nc6 4. Bb5 Nge7 5. O-O g6 6. Nd5
a6 7.

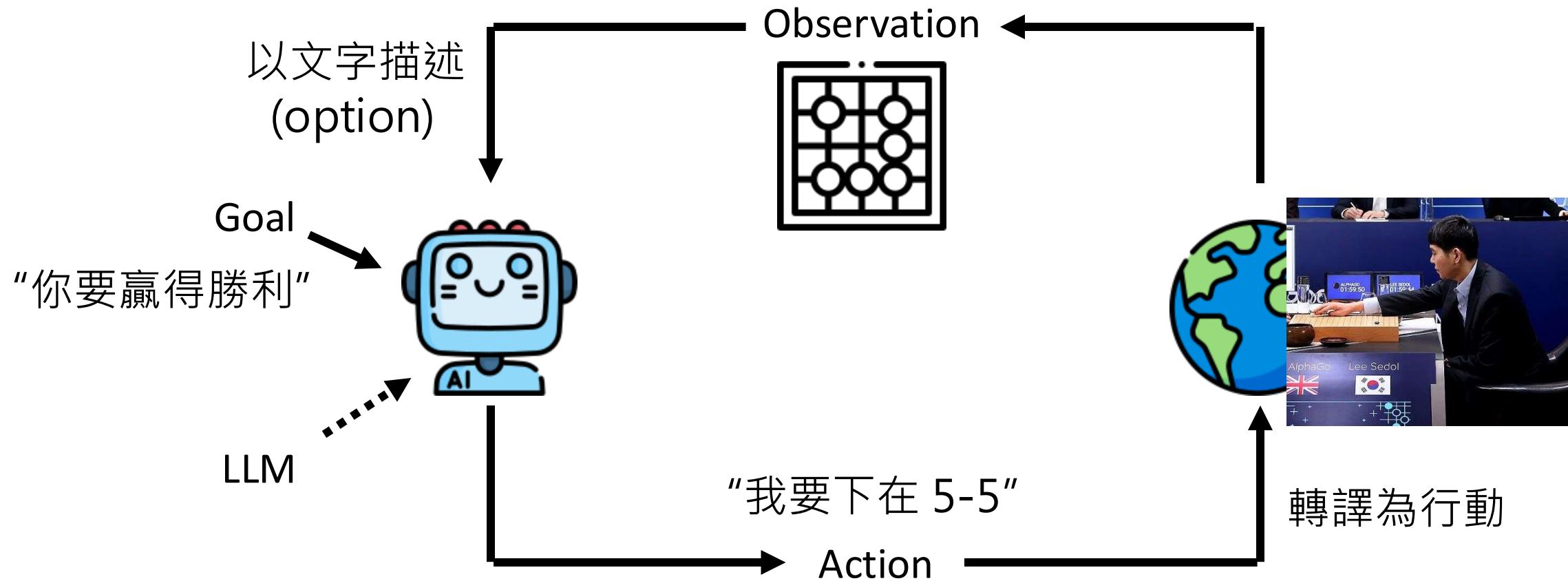
LLM 能不能下棋？

https://youtu.be/JHq4EKMg7fI?si=izKsH-GCVnZkooq_



ChatGPT vs DeepSeek: CRAZY Chess

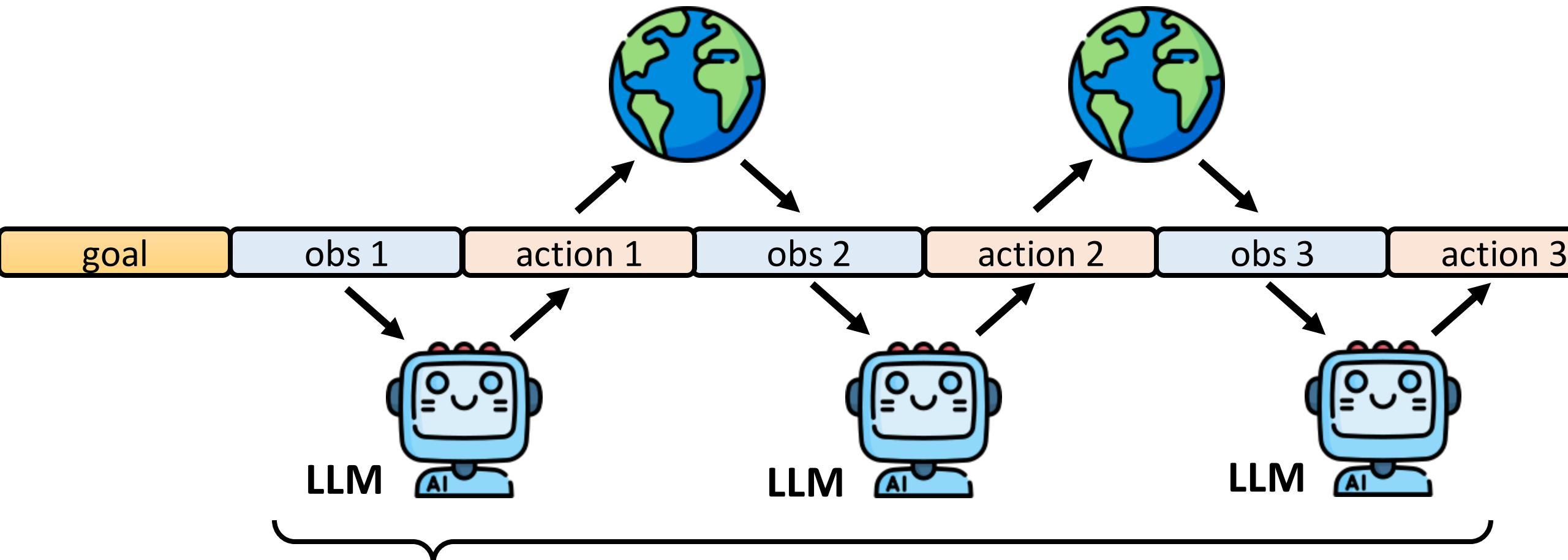
如何打造 AI Agent? 直接用 LLM !



以 LLM 直接實踐人類對於擁有 Agent 的渴望
9 / 96

還有多遠?
還可以多做什麼?

從 LLM 的角度來看 Agent 要解的問題



請注意在這堂課中
沒有任何模型被訓練

AI Agent 不是最近才熱門

- 2023 年春天曾經爆紅過一次

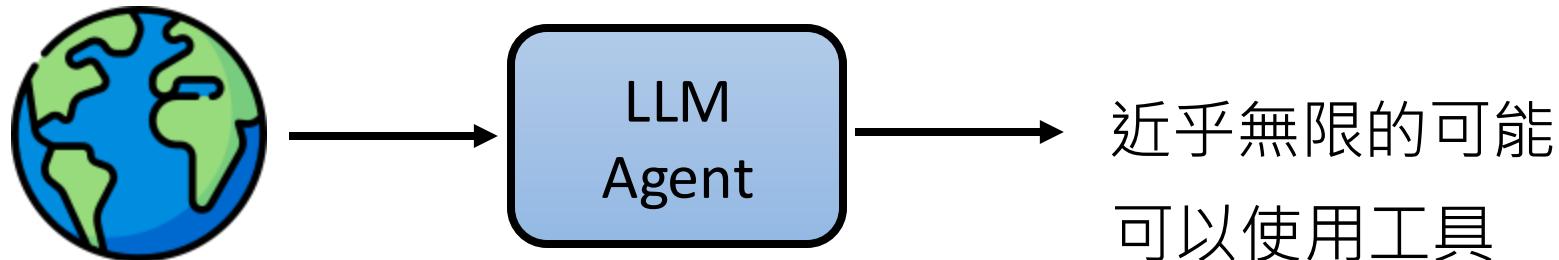
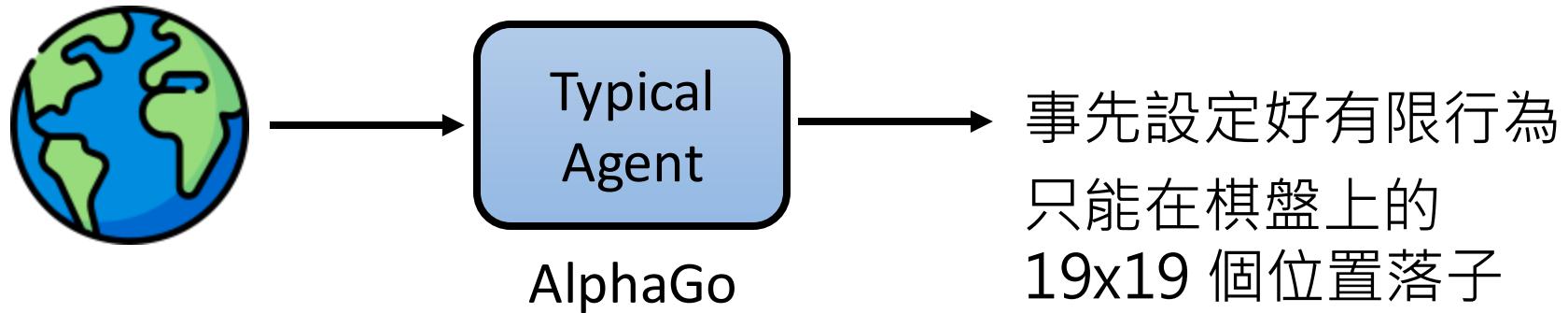
AutoGPT, AgentGPT,
BabyAGI, Godmode ...

<https://youtu.be/eQNADIR0jSs?si=4yGZEJuAUzKK2VD0>



【生成式AI 2023】讓 AI 做計劃然後自己運行自己

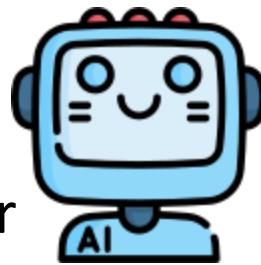
以 LLM 運行 AI Agent 的優勢



以 LLM 運行 AI Agent 的優勢

Typical Agent

AI programmer



Reward = -1

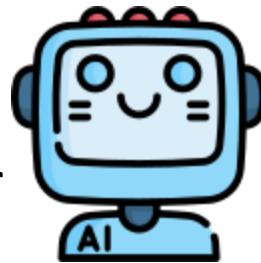
為什麼是 -1???

Compile Error



LLM Agent

AI programmer

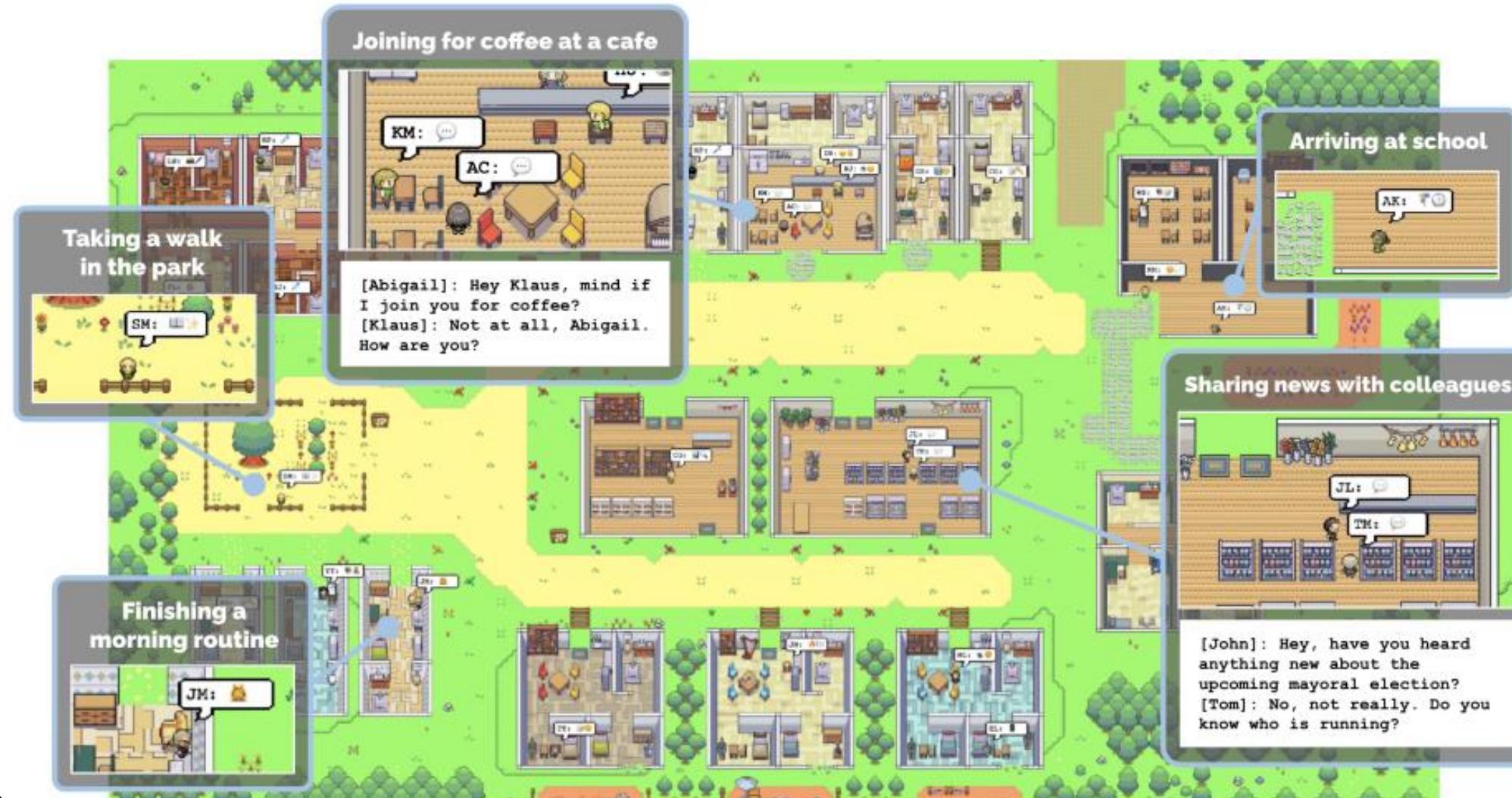


更多資訊

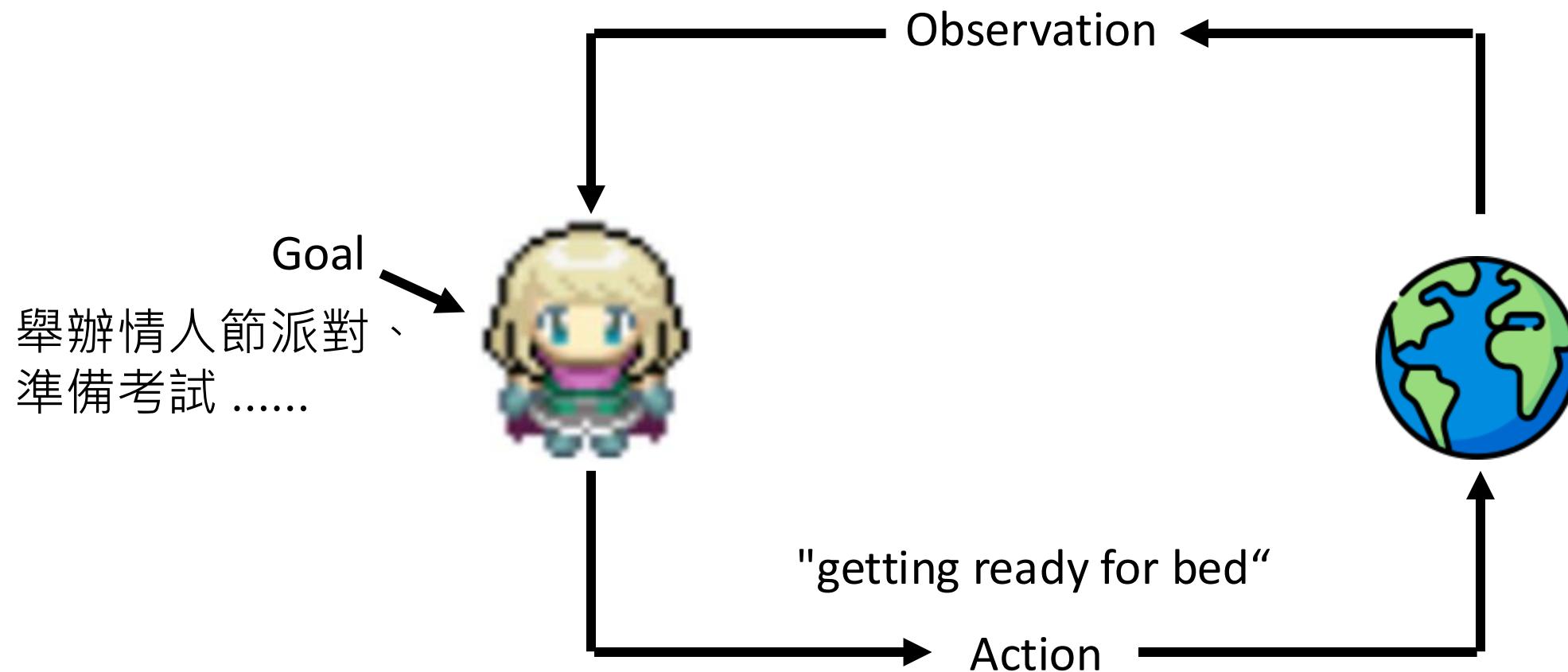
Compile Error



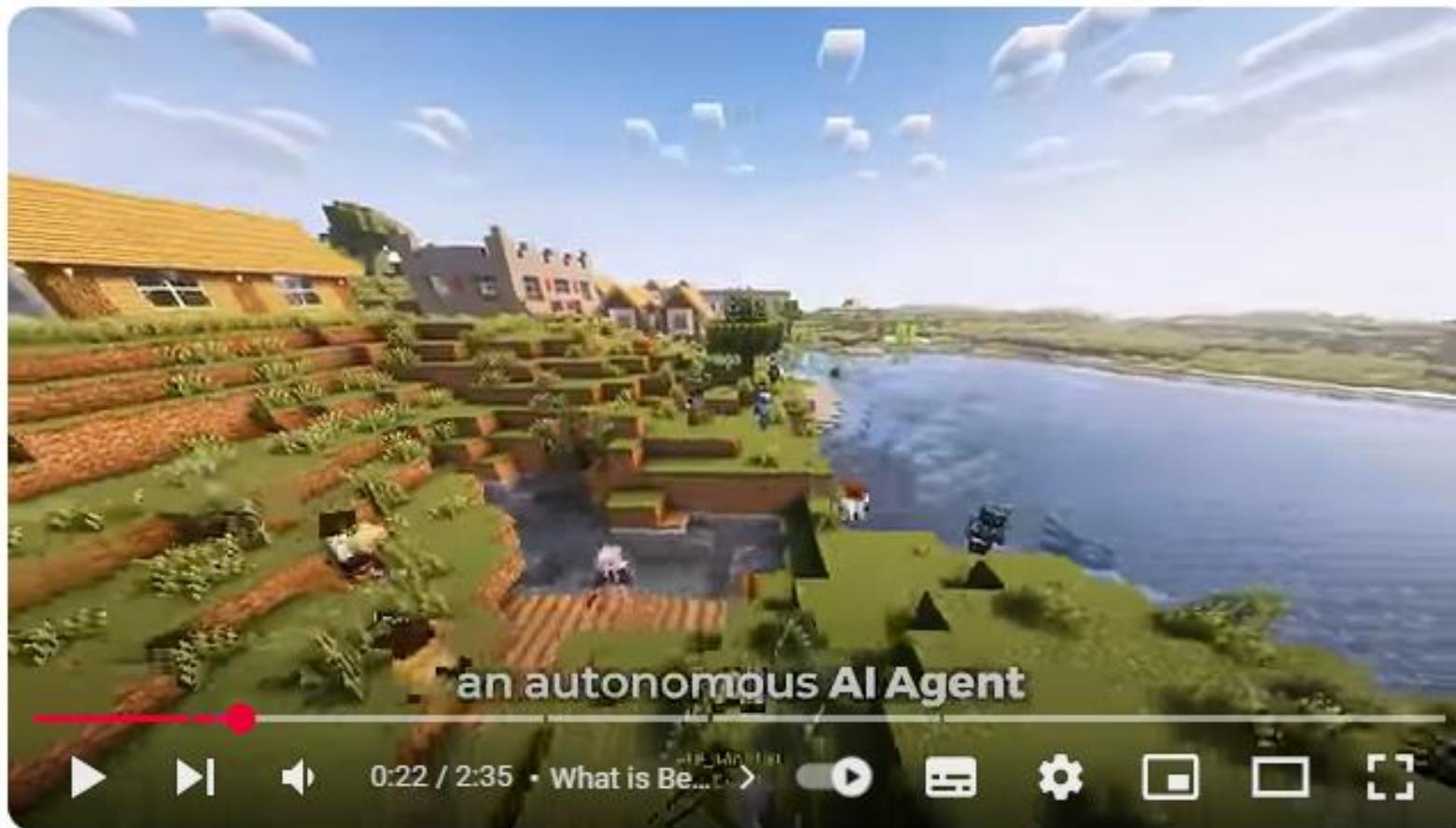
AI Agent 舉例：AI 村民組成的虛擬村莊



```
[node_749] 2023-02-13 15:33:20: Eddy Lin is studying music theory  
[node_748] 2023-02-13 15:33:20: cooking area is idle  
[node_747] 2023-02-13 15:33:20: kitchen sink is idle  
[node_746] 2023-02-13 15:33:20: behind the cafe counter is idle  
[node_745] 2023-02-13 15:32:10: Isabella Rodriguez is gathering decorations
```



AI Agent 舉例：Minecraft 中的 AI NPC



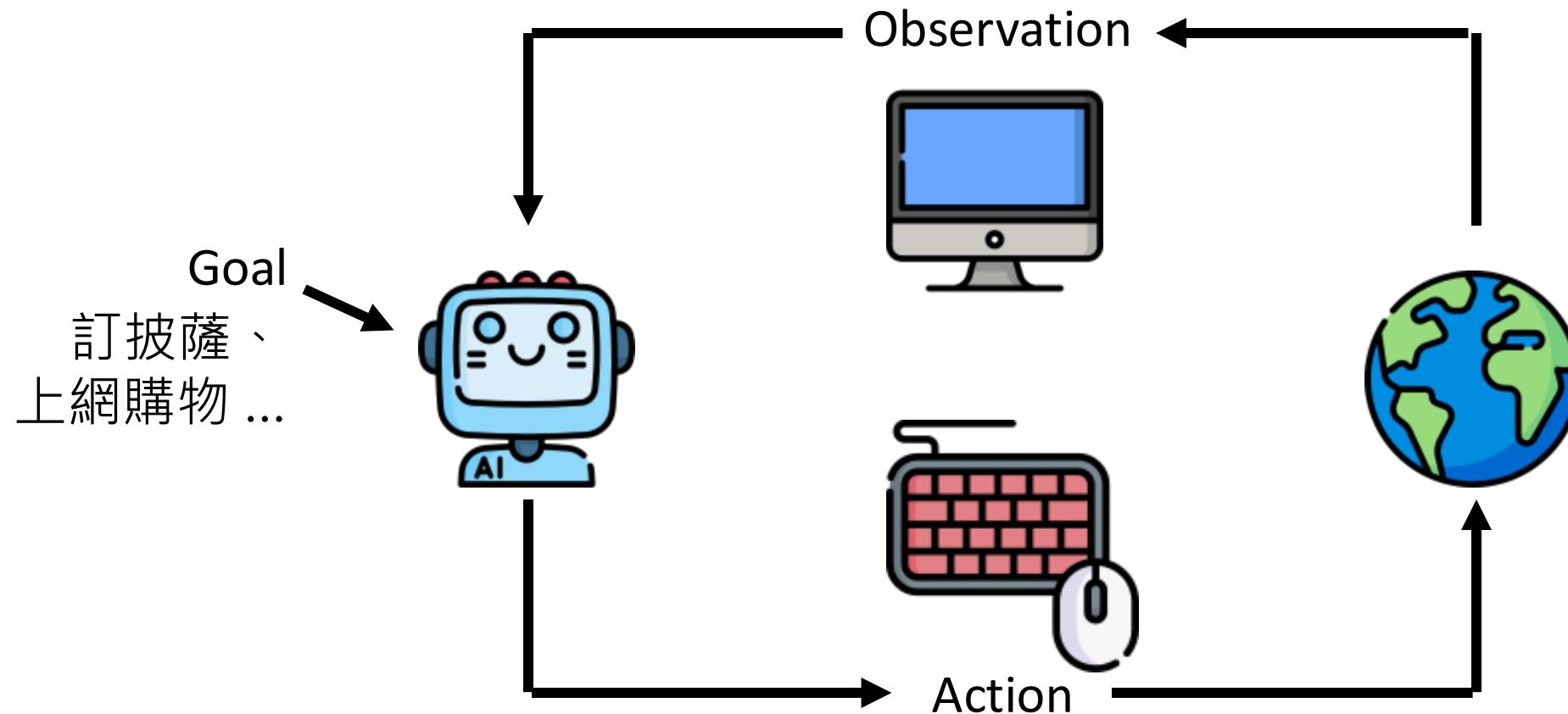
1000 AI NPCs simulate a CIVILIZATION in Minecraft

AI Agent 舉例：讓 AI 使用電腦



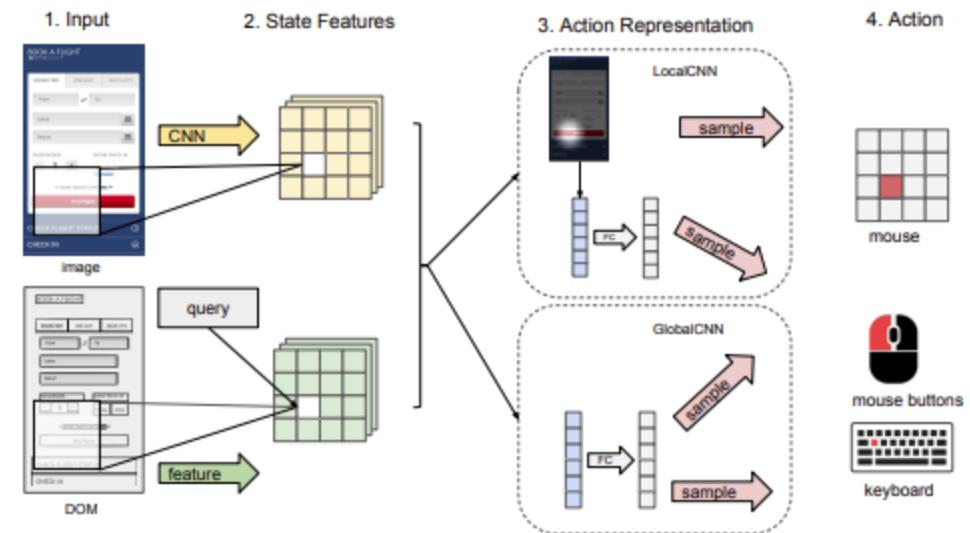
Computer Use,
Operator

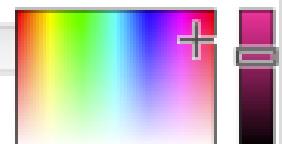
AI Agent 舉例：讓 AI 使用電腦



AI Agent 舉例：讓 AI 使用電腦

- World of Bits: An Open-Domain Platform for Web-Based Agents (ICML, 2017)

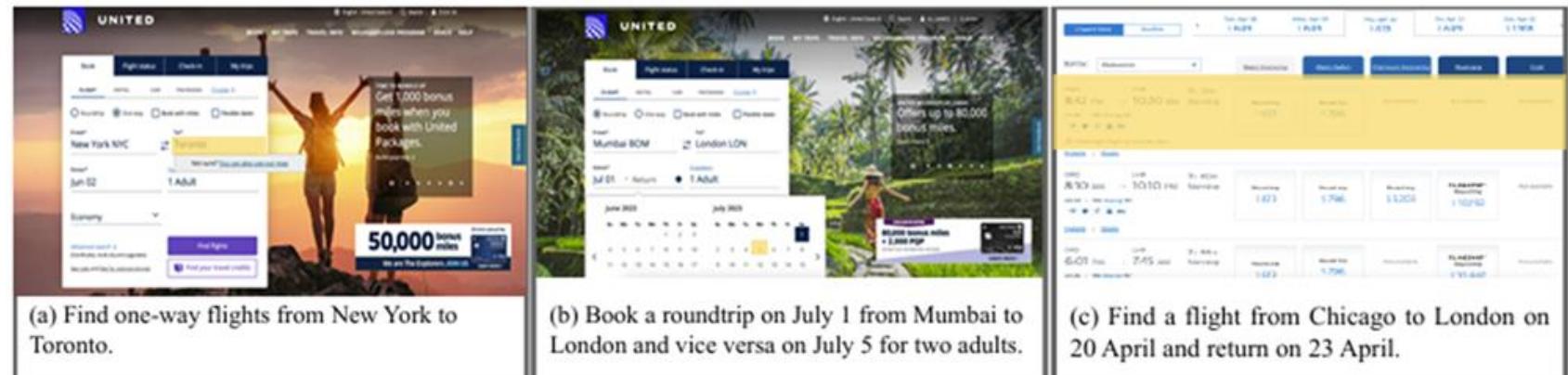


Click on the "Next" button. Ok nunc vitae purus.; Next viverra ac, sed: No purus sit quis	Select Daria>Poly Frederica Martina > Daria > Angie	Select the following color █ with the color picker and hit Submit. Color: AB2567 	Enter the value that corresponds with each label into the form and submit when done. <table border="1"><thead><tr><th>Country</th><th>Costa Rica</th></tr></thead><tbody><tr><td>Color</td><td>gray</td></tr><tr><td>First name</td><td>Lynnette</td></tr><tr><td>Religion</td><td>Judaism</td></tr><tr><td>Language</td><td>Wu</td></tr><tr><td>Language:</td><td></td></tr><tr><td>First name:</td><td></td></tr></tbody></table> Submit	Country	Costa Rica	Color	gray	First name	Lynnette	Religion	Judaism	Language	Wu	Language:		First name:		Use the textbox to enter "Leonic" and press "Search", then find and click the 2nd search result. Leonic Search Chas Aliquam cursus. At. Leonic Ultricies congue gravida. Marcella Pulvinar aliquam adipiscing. 1 2 3 ≥	Find the email by Bobette and click the trash icon to delete it. <table border="1"><thead><tr><th>Primary</th><th>Search</th></tr></thead><tbody><tr><td>Corabelle</td><td>★ ⚡</td></tr><tr><td>Magna tortor.</td><td>★ ⚡</td></tr><tr><td>Iaculis euismod.</td><td>★ ⚡</td></tr><tr><td>Jennimah</td><td>★ ⚡</td></tr><tr><td>Porttitor.</td><td>★ ⚡</td></tr><tr><td>Odio tellus. Li..</td><td>★ ⚡</td></tr><tr><td>Ingaberg</td><td>★ ⚡</td></tr><tr><td>Amet.</td><td>★ ⚡</td></tr><tr><td>Facilisi vel te..</td><td>★ ⚡</td></tr><tr><td>Madellina</td><td>★ ⚡</td></tr></tbody></table>	Primary	Search	Corabelle	★ ⚡	Magna tortor.	★ ⚡	Iaculis euismod.	★ ⚡	Jennimah	★ ⚡	Porttitor.	★ ⚡	Odio tellus. Li..	★ ⚡	Ingaberg	★ ⚡	Amet.	★ ⚡	Facilisi vel te..	★ ⚡	Madellina	★ ⚡	Book the cheapest one-way flight from: NLG to: Brownsville, TX on 12/10/2016. From: To: Departure Date Search
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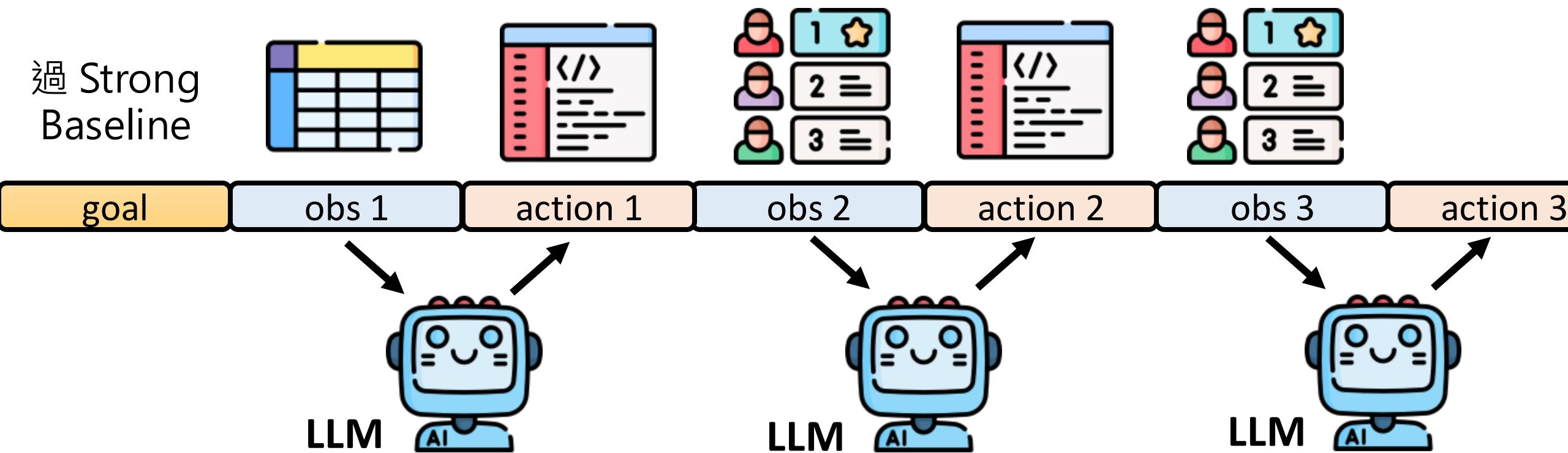
AI Agent 舉例：讓 AI 使用電腦

Mind2Web

<https://arxiv.org/abs/2306.06070>



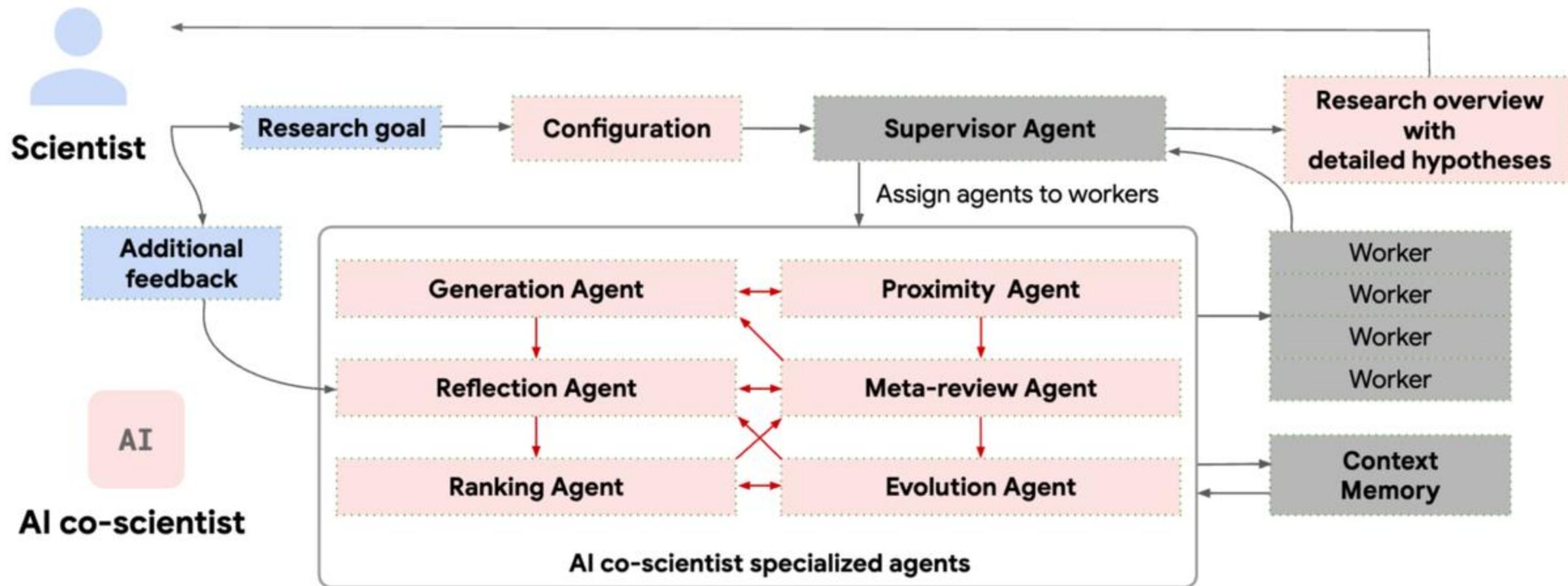
AI Agent 舉例：用 AI 訓練模型



AIDE: The Machine Learning Engineer Agent <https://arxiv.org/abs/2502.13138>

AutoKaggle: A Multi-Agent Framework for Autonomous Data Science Competitions

AI Agent 舉例：用 AI 做研究

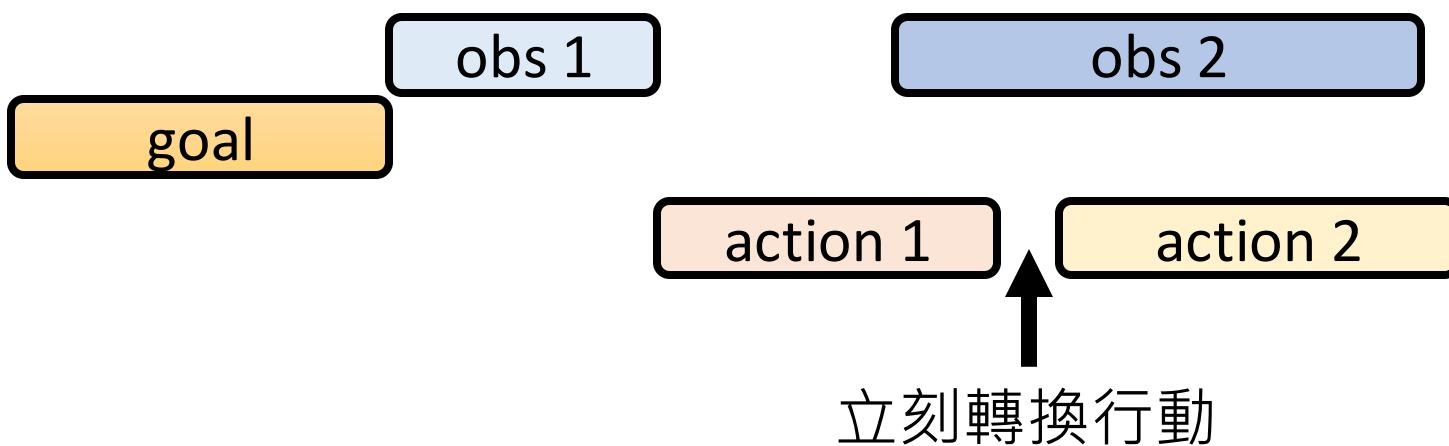


邁向更加真實的互動情境

回合制互動

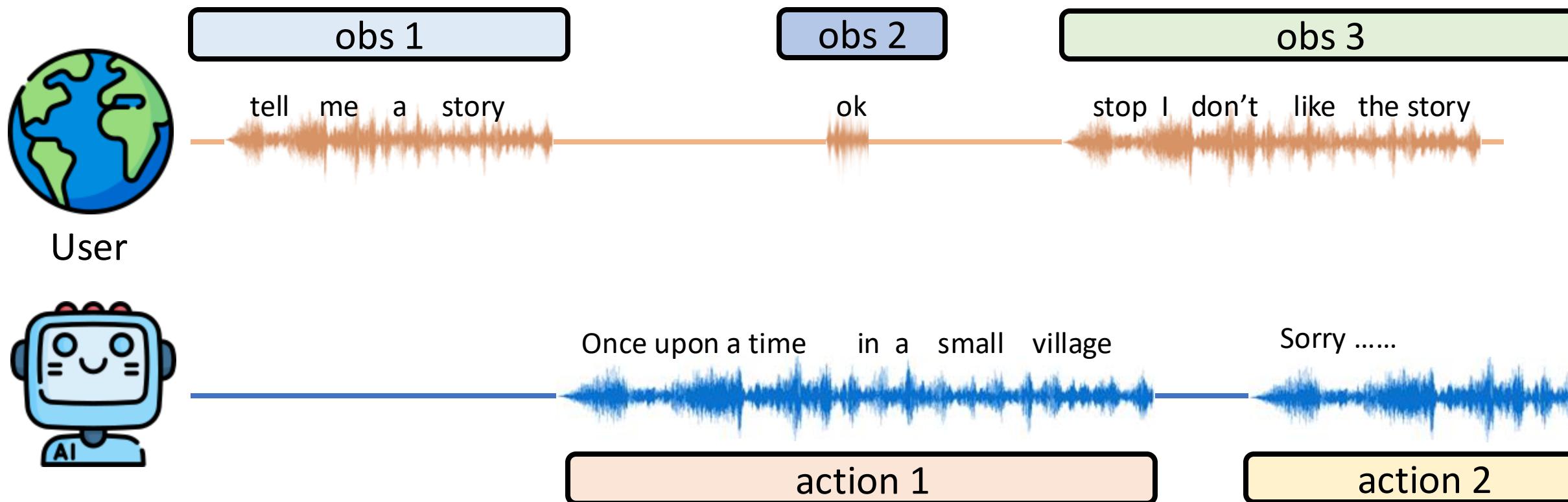


即時互動



例如：語音對話

邁向更加真實的互動情境



邁向更加真實的互動情境

Guan-Ting Lin

(with collaborators from
Berkeley, UW, and MIT)



Model	Date	E2E	#ch	Interrupt	BC	S2S Release
<i>Transparent Models</i>						
dGSLM (Nguyen et al., 2023)	2022/3	✓	2	✓	✓	✓
FSM (Wang et al., 2024b)	2024/5	✗	1	-	-	✗
MiniCPM-Duplex (Zhang et al., 2024b)	2024/6	✗	1	-	-	✗
VITA (Fu et al., 2024)	2024/8	✗	1	✓	-	✗
SyncLLM (Veluri et al., 2024)	2024/9	✓	2	✓	✓	✗
Parrot (Wang et al., 2025)	2024/9	✓	2	✓	-	✗
MiniCPM-Duo (Xu et al., 2024)	2024/9	✗	1	-	-	✗
Moshi (Défossez et al., 2024)	2024/10	✓	2	✓	✓	✓
SALMONN-omni (Yu et al., 2024)	2024/11	✓	1	✓	-	✗
MinMo (Chen et al., 2025)	2025/1	✓	1	✓	✓	✗
OmniFlatten (Zhang et al., 2024a)	2025/1	✓	2	✓	-	✗
RTTL-DG (Mai and Carson-Berndsen, 2025)	2025/1	✓	2	✓	✓	✗
Freeze-Omni (Wang et al., 2024c)	2024/11	✗	1	✓	-	✓
<i>Closed-source Commercial Models</i>						
GPT-4o Voice Mode	2024/5	-	-	✓	-	✗
Gemini Live Voice Chat	2024/8	-	-	✓	-	✗
DouBao	2025/1	-	-	✓	-	✗

AI Agent 關鍵能力剖析

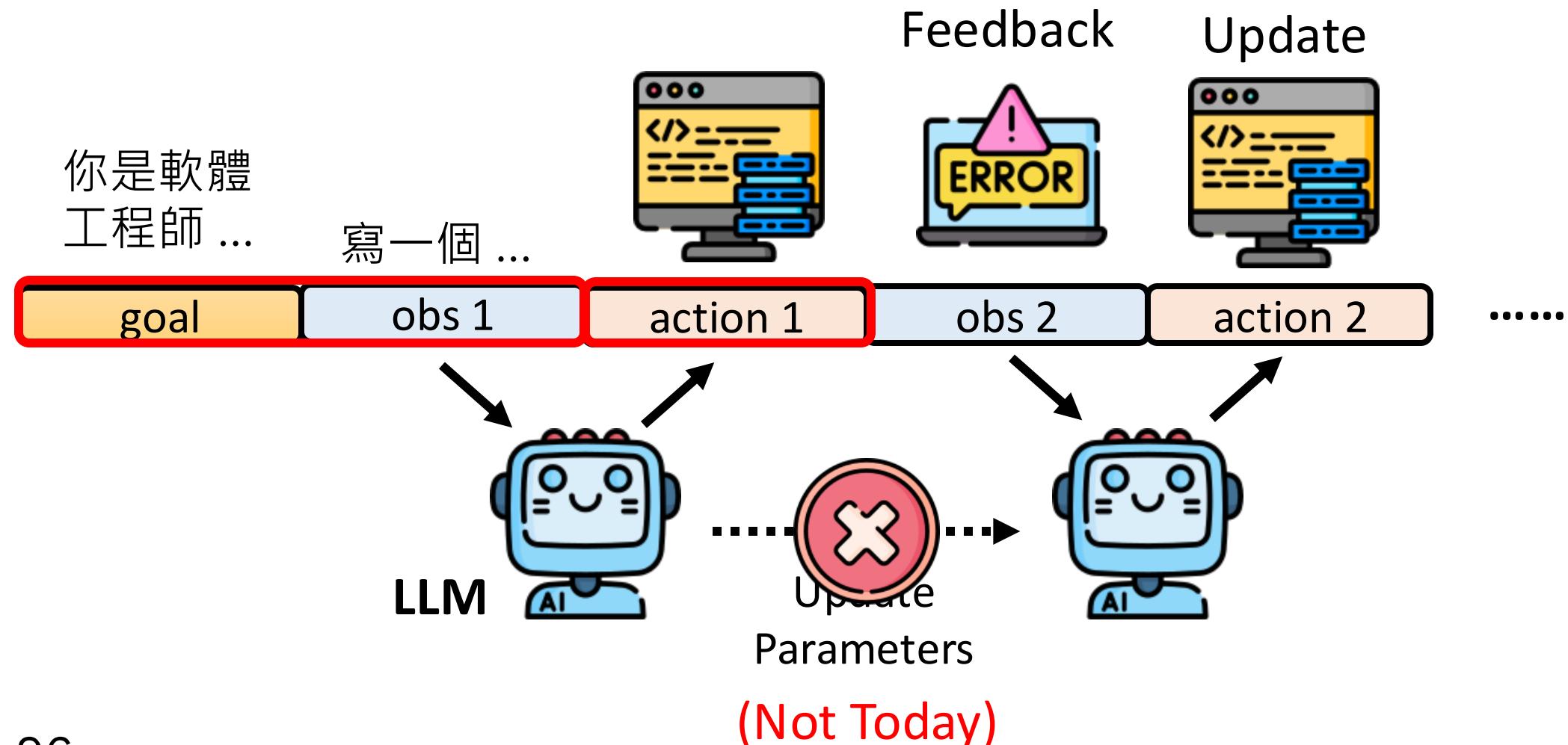
AI 如何根據經驗調整行為

AI 如何使用工具

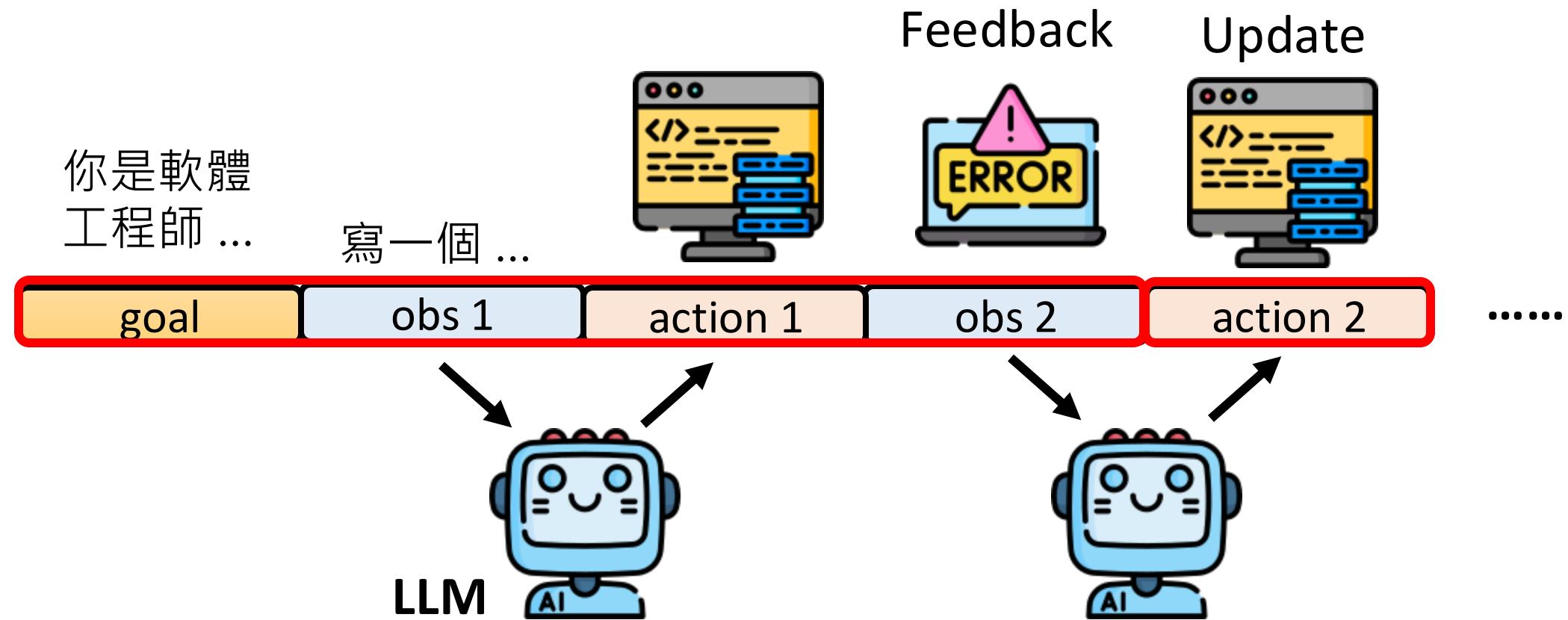
AI 能不能做計劃

根據經驗調整行為

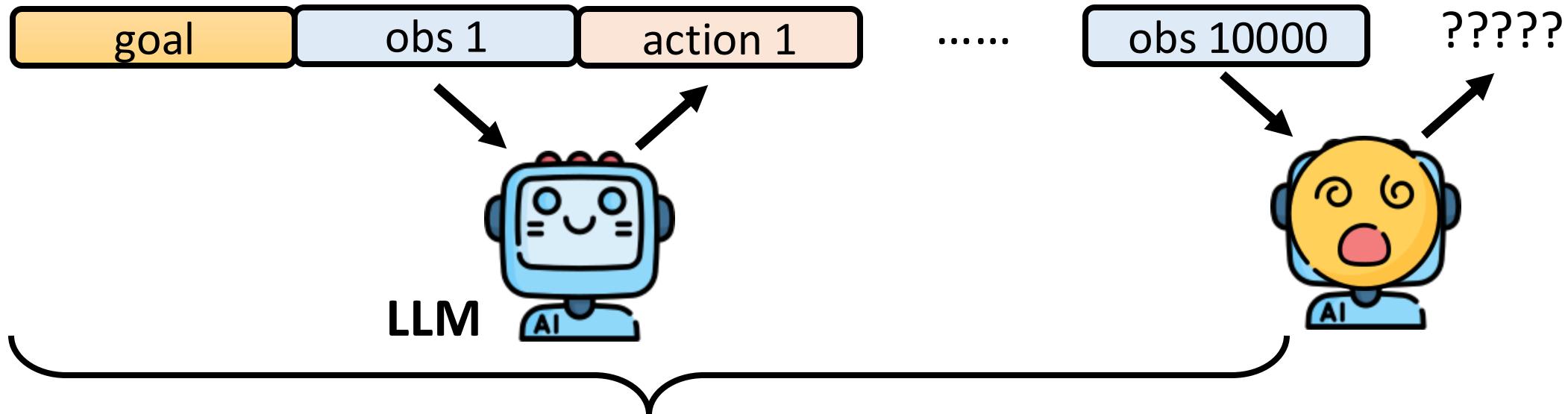
根據經驗調整行為



根據經驗調整行為



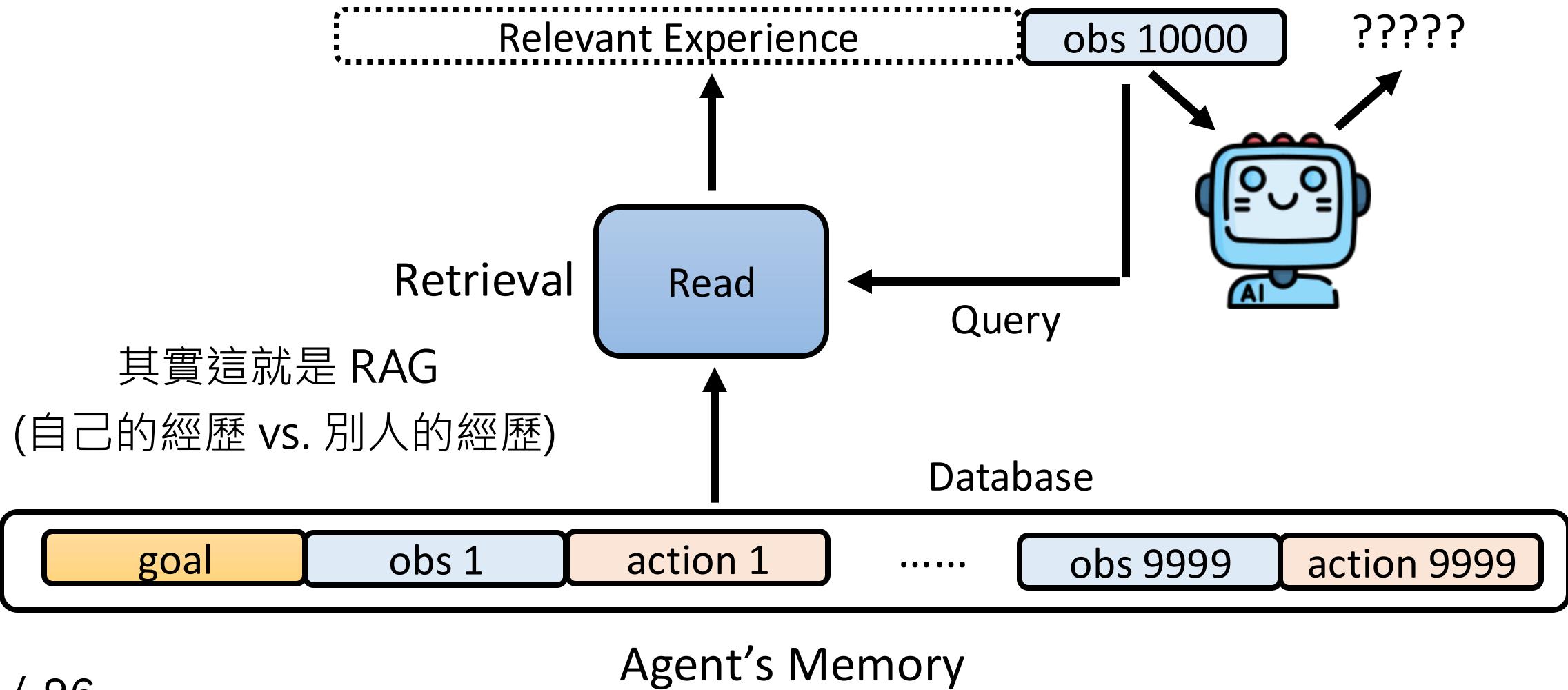
根據經驗調整行為



不斷回憶整個 Agent 一生的經歷 ... 😢

超常自傳式記憶 (Highly Superior Autobiographical Memory, HSAM)
超憶症 (Hyperthymesia)

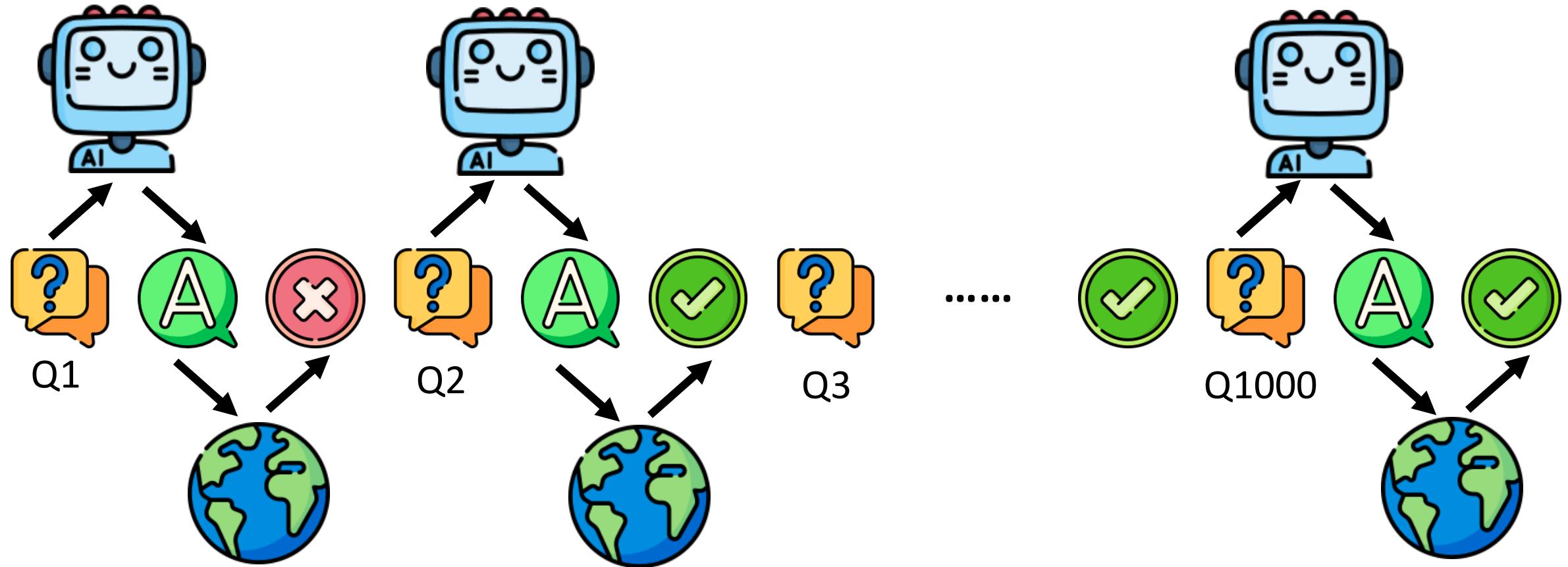
根據經驗調整行為



StreamBench

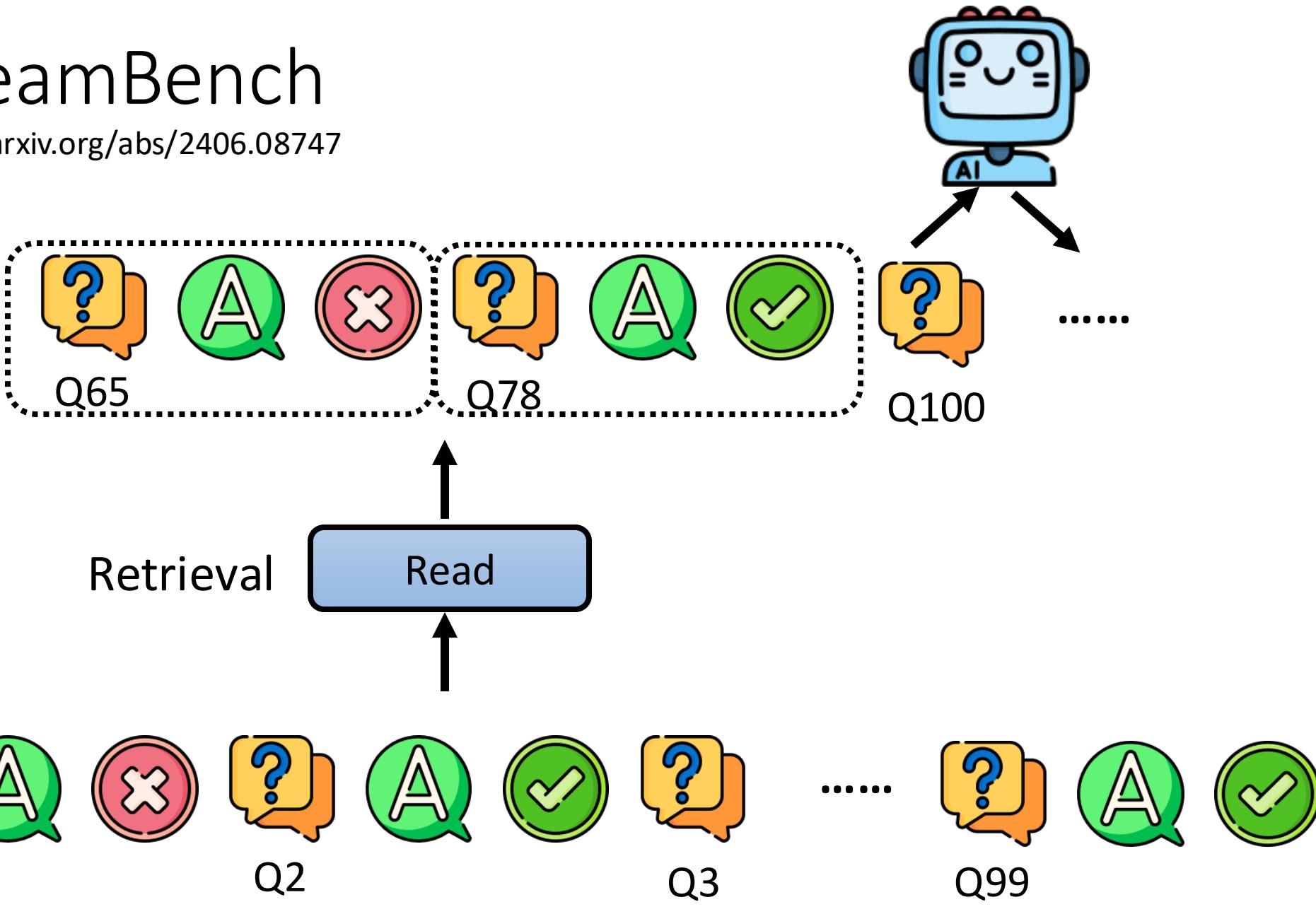
<https://arxiv.org/abs/2406.08747>

<https://stream-bench.github.io/>
(done by Appier Researchers)



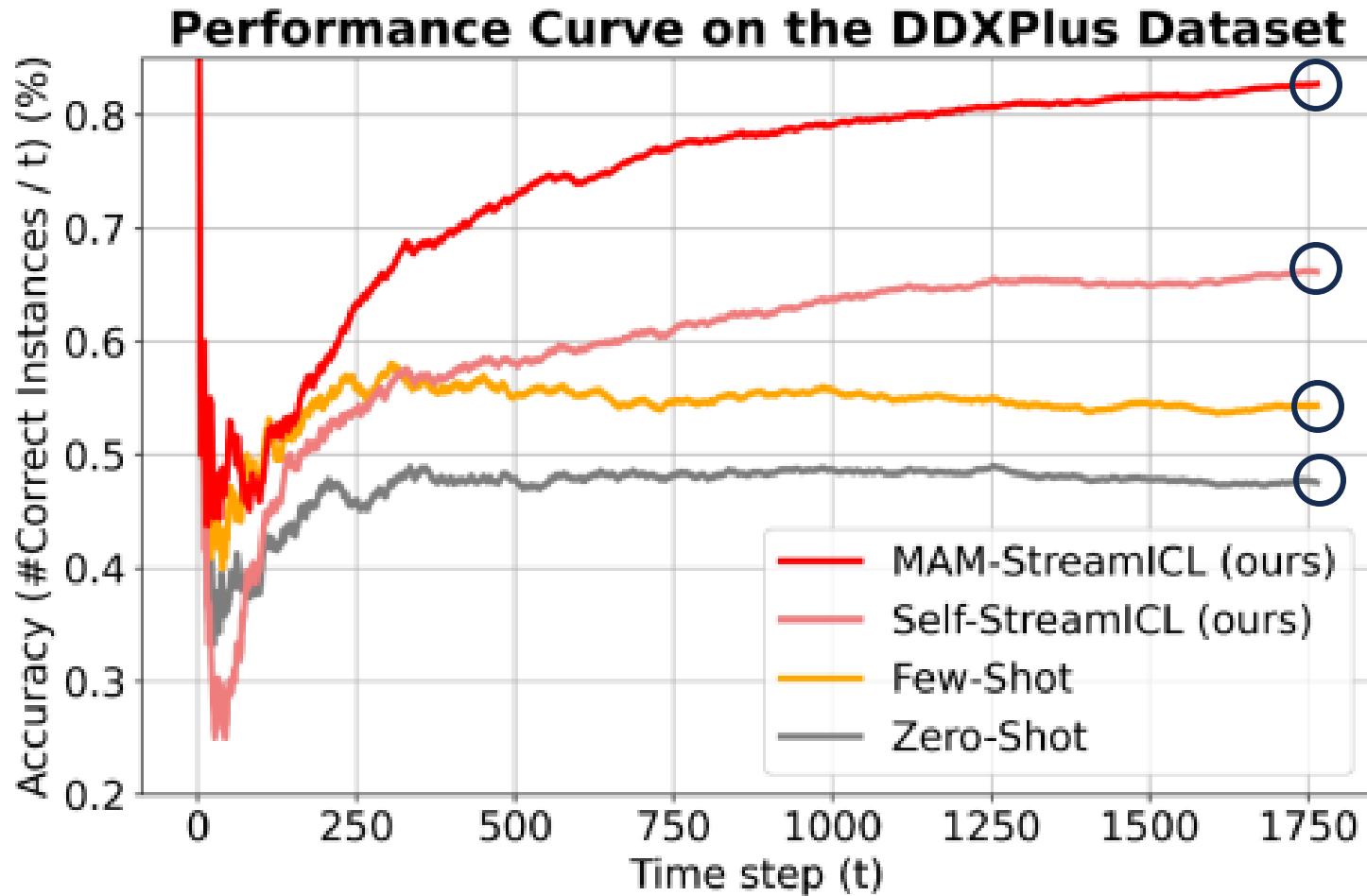
StreamBench

<https://arxiv.org/abs/2406.08747>



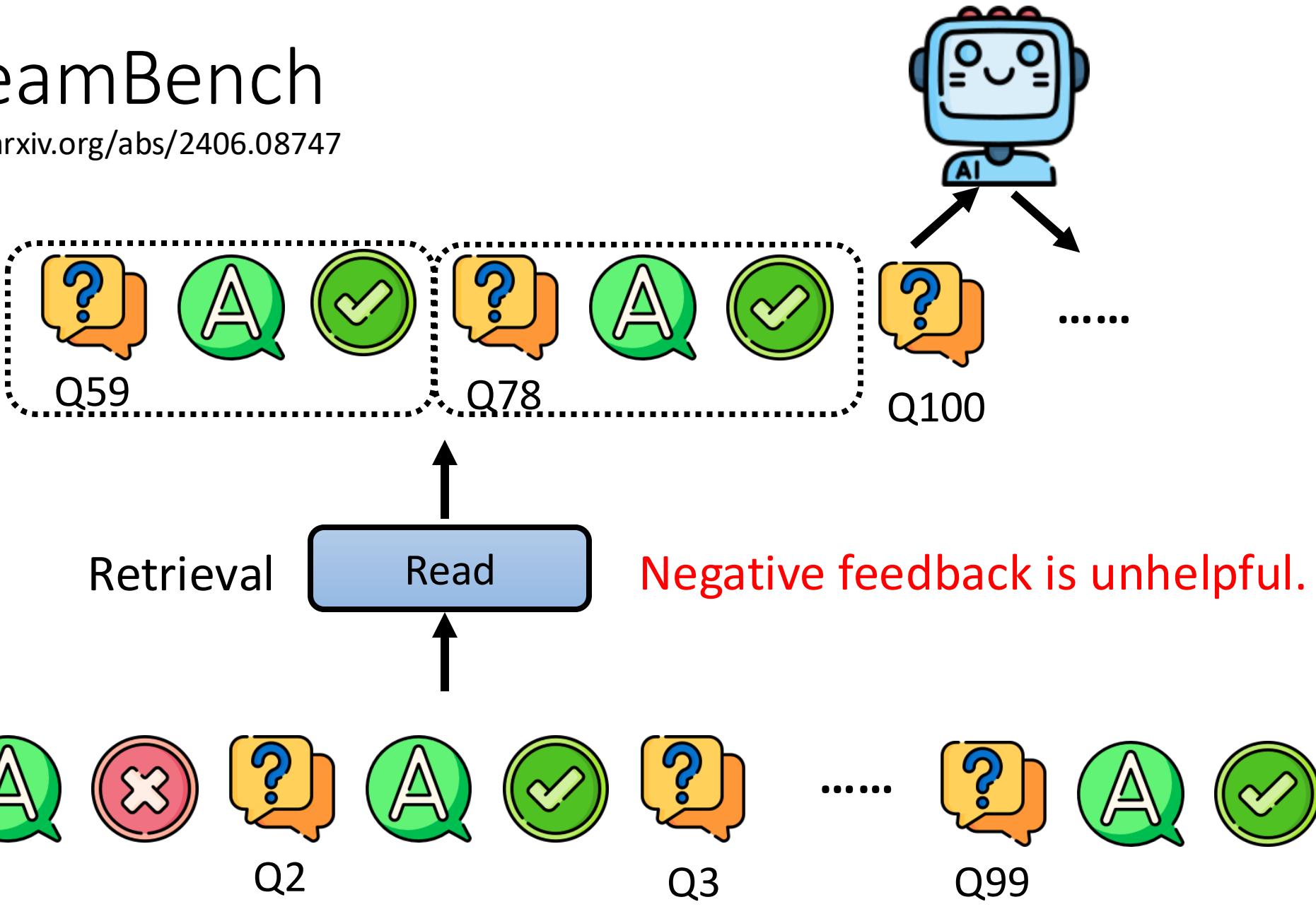
StreamBench

<https://arxiv.org/abs/2406.08747>



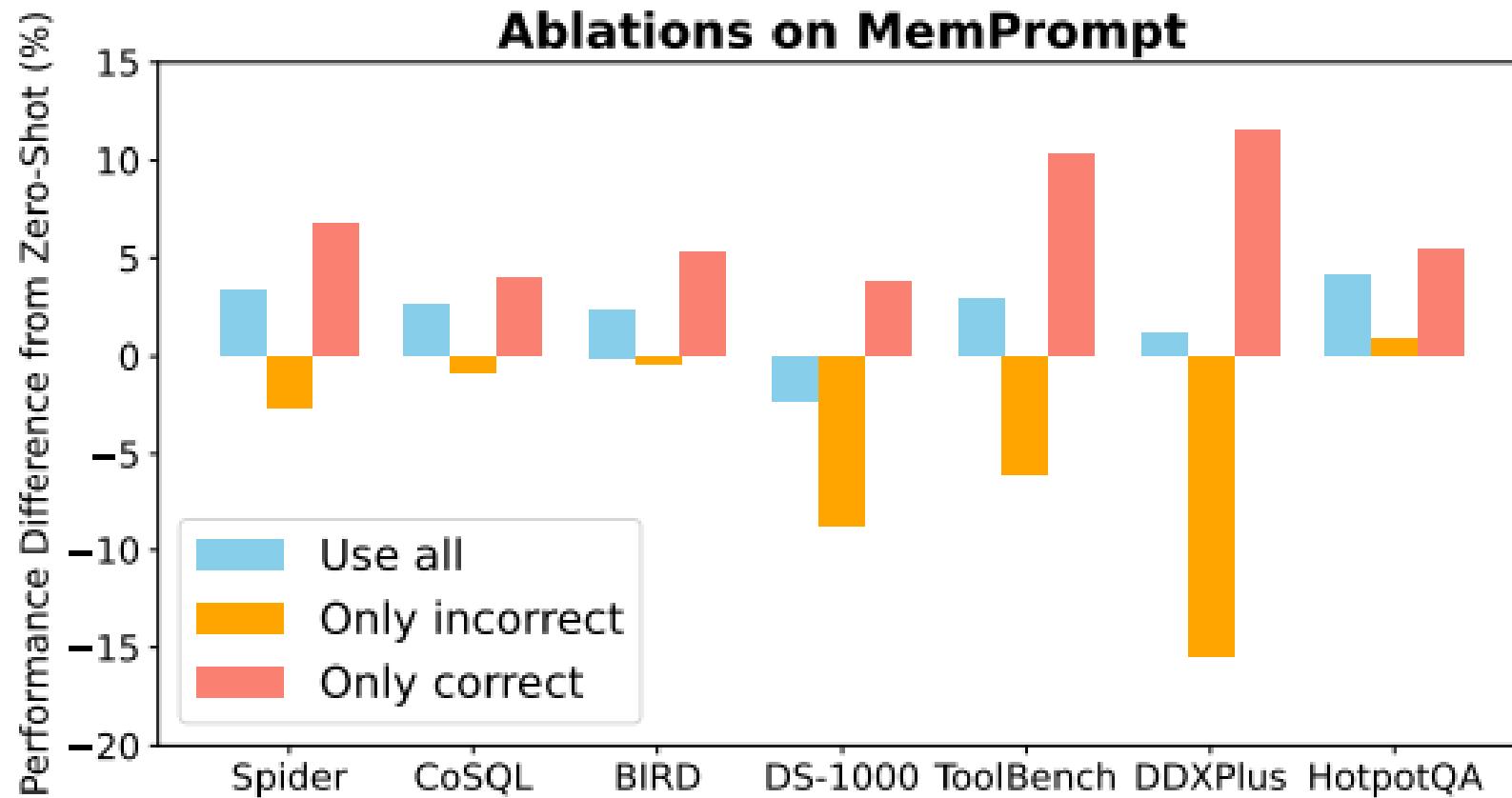
StreamBench

<https://arxiv.org/abs/2406.08747>

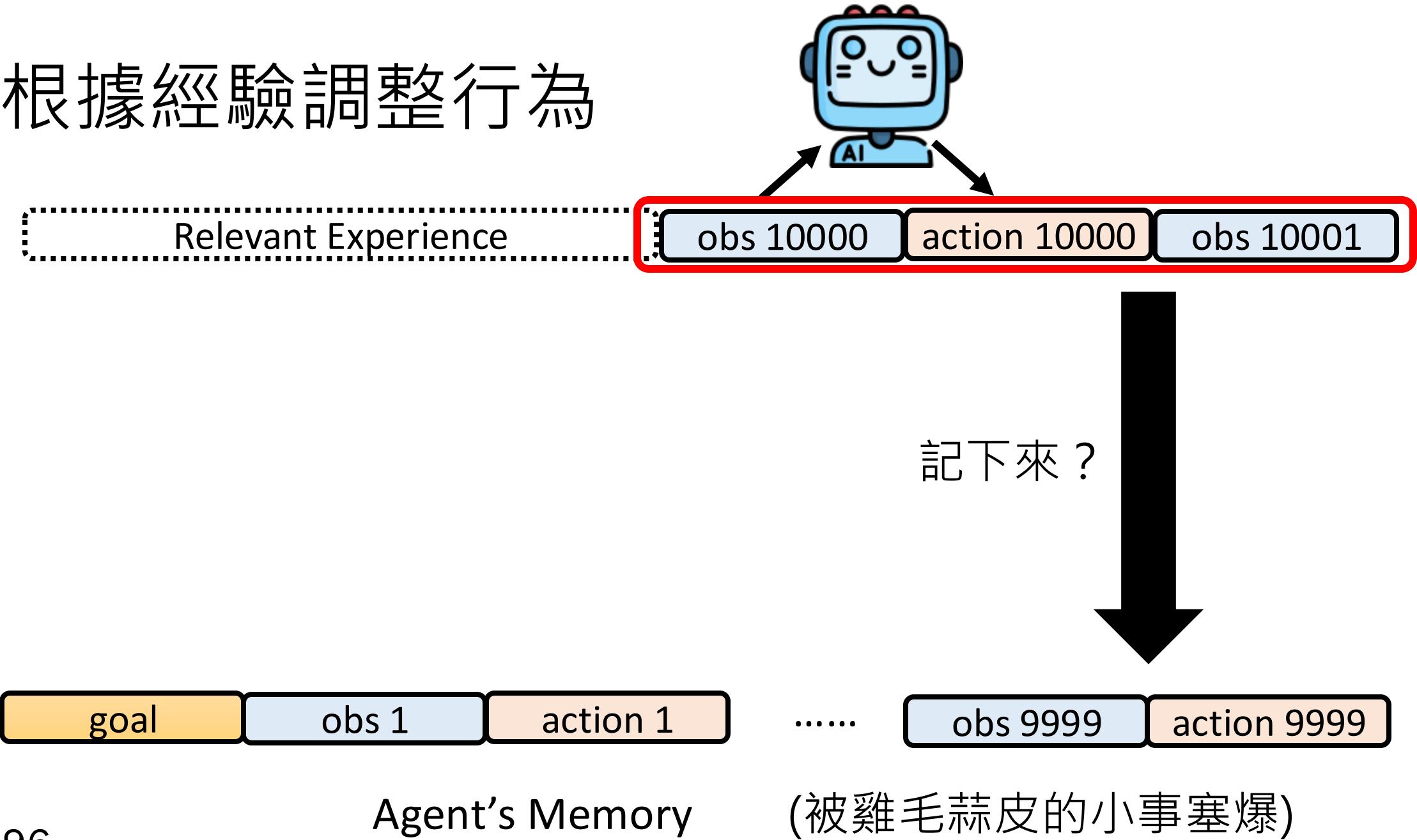


StreamBench

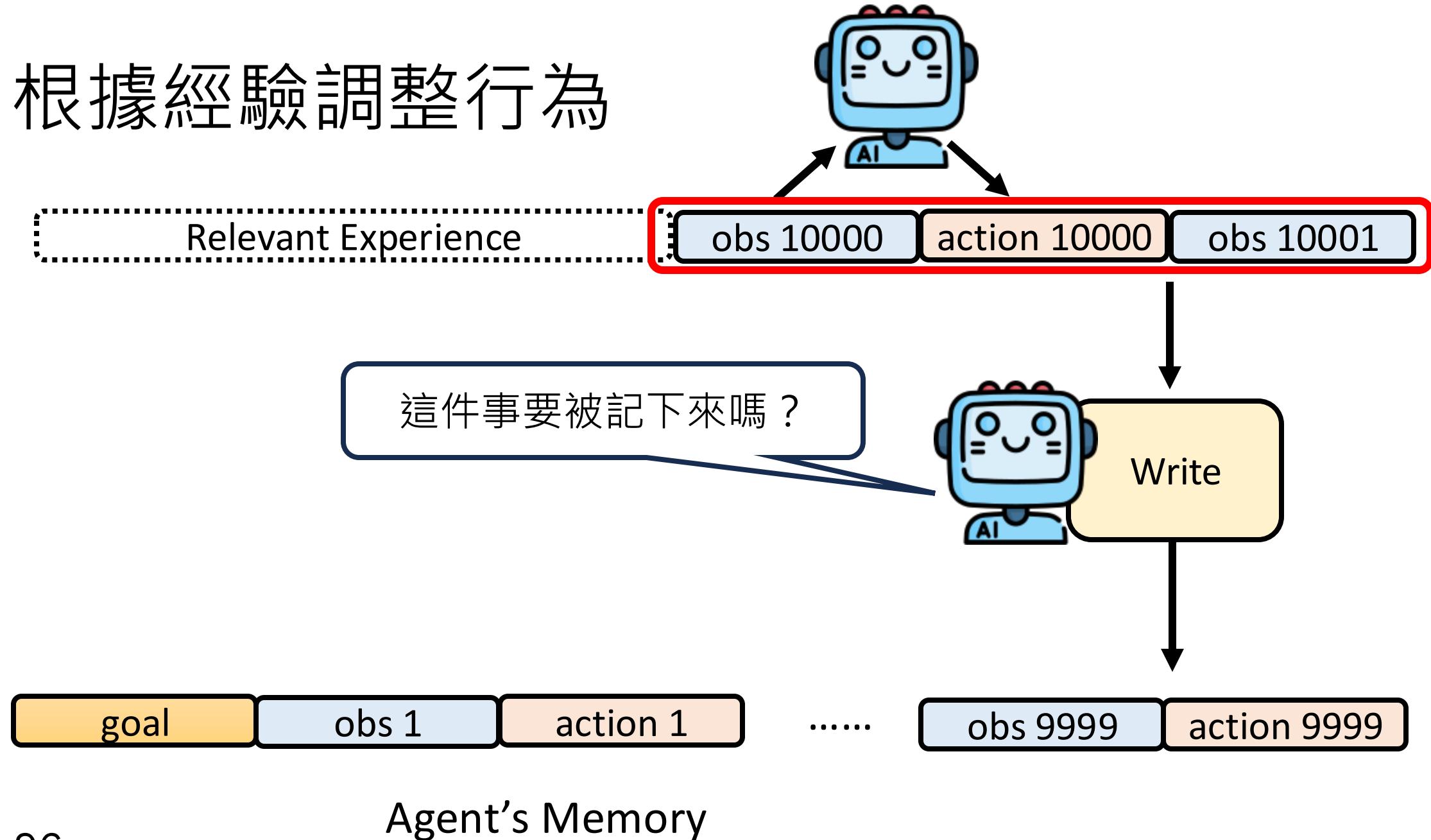
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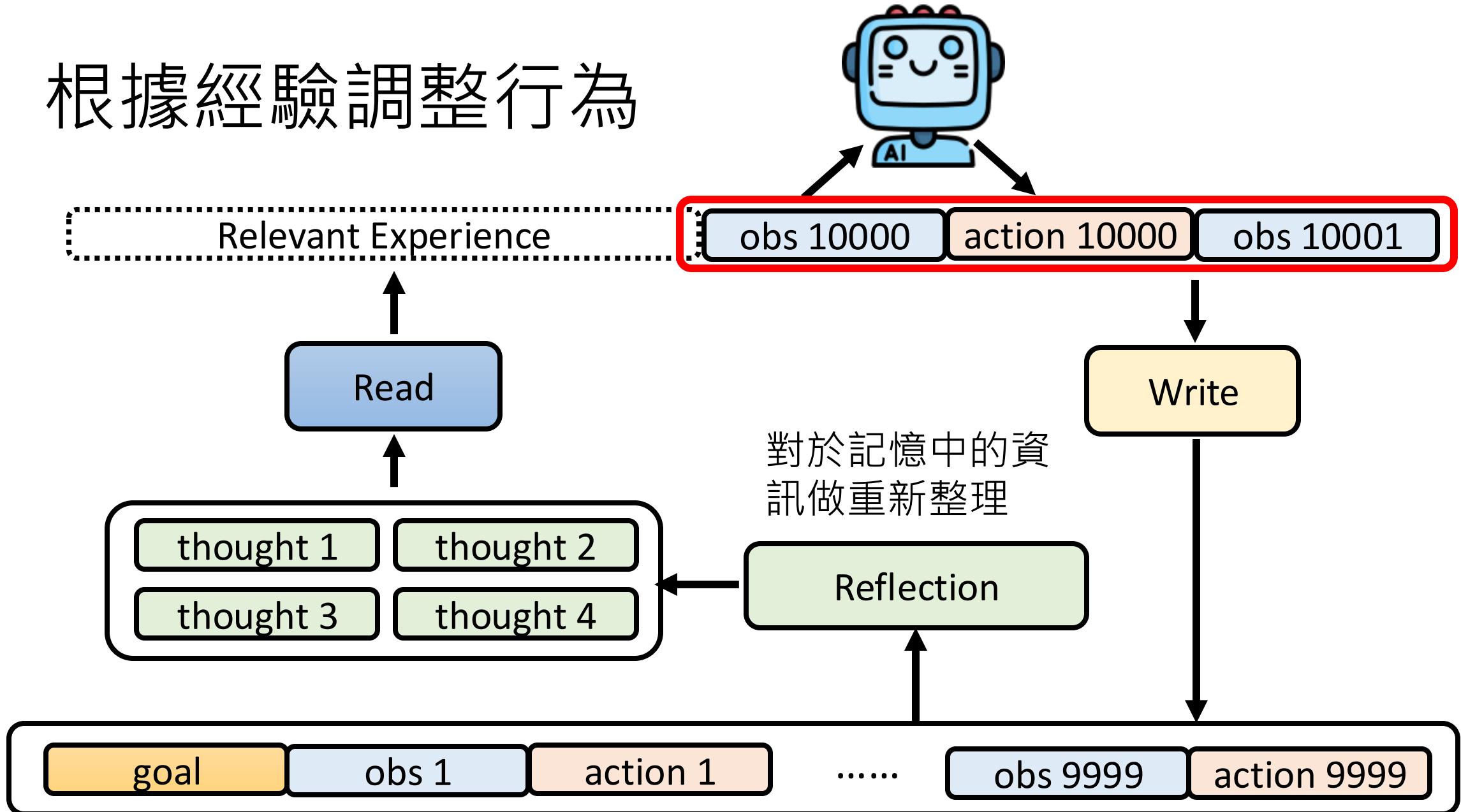
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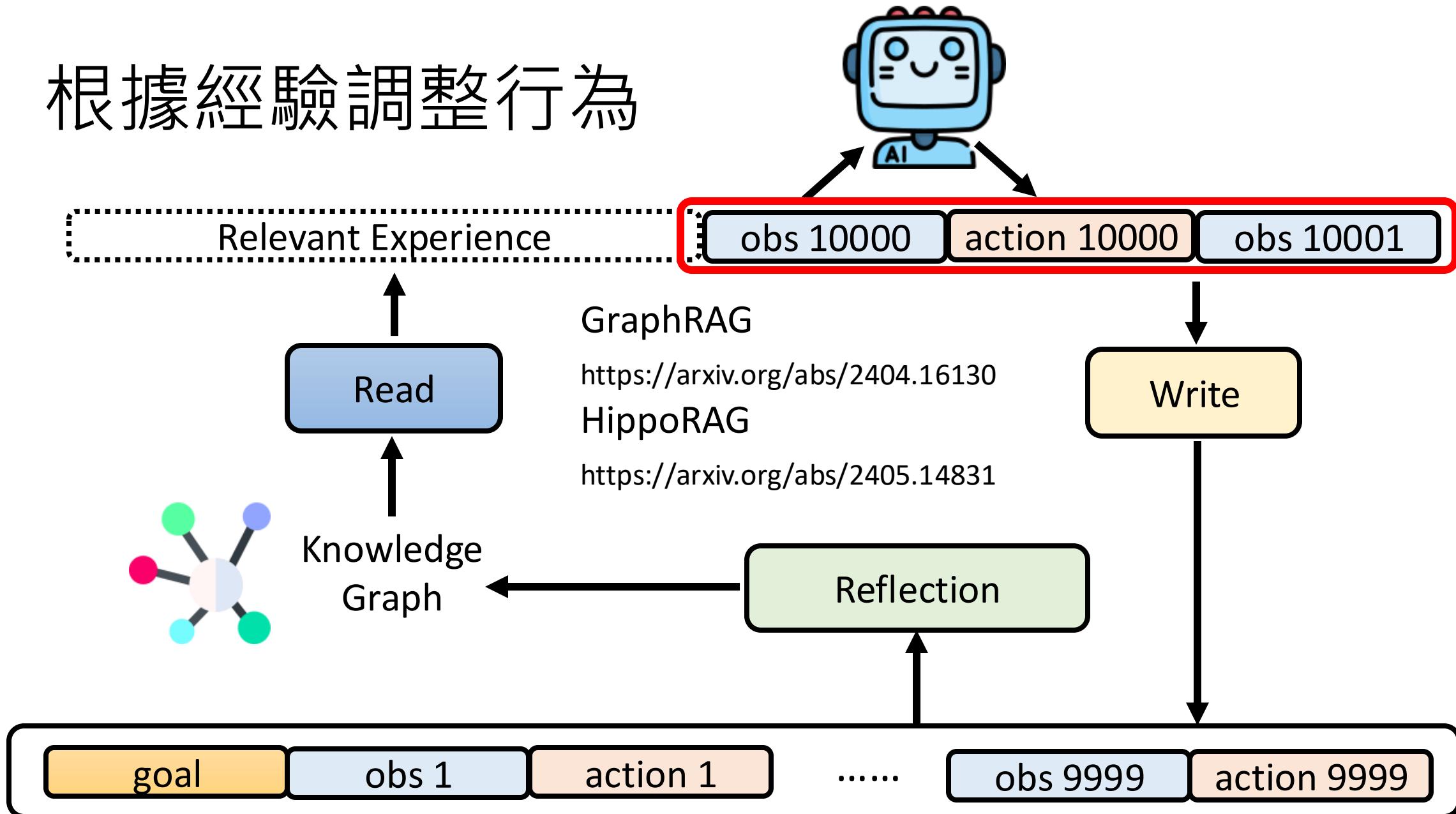
根據經驗調整行為



根據經驗調整行為



根據經驗調整行為



有記憶的 ChatGPT

我週五下午要上機器學習這門課

了解！你週五下午要上機器學習這門課，有需要我協助你先預習某個主題、整理課程內容，還是有什麼特別需要準備或想要複習的嗎？

有記憶的 ChatGPT

The screenshot shows the settings menu of the ChatGPT application. On the left, there's a sidebar with various options like '分享' (Share), 'PRO' status, email ('tlkagkb93901106@gmail.com'), 'speechlab', '個人帳戶' (Personal Account) with a 'PRO' badge, '任務' (Tasks) [BETA], '我的 GPT', '自訂 ChatGPT', '設定' (Settings) [highlighted], '下載 Windows 應用程式', and '取得 ChatGPT 搜尋擴充功能'. The main content area has a sidebar with '一般' (General), '通知' (Notifications), '個人化' (Personalization) [highlighted], '語音' (Voice), '資料控管' (Data Management), '組建者設定檔' (Builder Settings), '連接的應用程式' (Connected Apps), '安全性' (Security), and '訂閱' (Subscriptions). To the right, under '個人化', there's a section titled '自訂指令' (Custom Commands) with a '開啟 >' (Enable) button and a toggle switch. Below it is a section titled '記憶' (Memory) with a descriptive text: '當你不斷交談時，ChatGPT 會變得更實用，並且將擷取各種細節和偏好，打造更符合所需的回應。了解更多' (When you keep talking, ChatGPT will become more practical and will extract various details and preferences to create responses that better fit your needs. [了解更多](#)). It also lists several sample questions: '別忘了，我喜歡簡潔的回應。', '我剛養了一隻小狗！', '你記得關於我的哪些事情呢？', and '我們上次的專案內容聊到哪裡了？'. A '管理記憶' (Manage Memory) button is located at the bottom of this section.

tlkagkb93901106@gmail.com +

↑ 分享 PRO

個人帳戶 PRO

任務 BETA

我的 GPT

自訂 ChatGPT

設定

下載 Windows 應用程式

取得 ChatGPT 搜尋擴充功能

一般

通知

個人化

語音

資料控管

組建者設定檔

連接的應用程式

安全性

訂閱

自訂指令

開啟 >

記憶

當你不斷交談時，ChatGPT 會變得更實用，並且將擷取各種細節和偏好，打造更符合所需的回應。[了解更多](#)

想了解 ChatGPT 記住的內容或想教導它學習新知，只需和它交談即可：

- “別忘了，我喜歡簡潔的回應。”
- “我剛養了一隻小狗！”
- “你記得關於我的哪些事情呢？”
- “我們上次的專案內容聊到哪裡了？”

管理記憶

有記憶的 ChatGPT

記憶

X

希望稱呼助理為「寫輪眼卡卡西」。.



用戶週五下午要上機器學習這門課。.



Is a student at 台灣大學 (NTU).



Wants NTU to be remembered as 台灣大學。



Is working on a tutorial titled 'Tutorial of Text and Spoken Language Models,' which spans around 5 hours.



Is working on a paper titled 'Training Instruction-Following Spoken Language Model Without Speech Instruction-Tuning Data.'



Is working on a project titled 'Mirages in the Sound Desert: Investigating Audio Hallucinations in Large Audio-Language Models.'



Will give a talk titled 'Teaching Foundation Models New Skills: Insights and Experiences.'



Is going to give a keynote speech about Foundation Models and the catastrophic forgetting issue.



有記憶的 ChatGPT

週五下午出去玩好嗎？

Read 模組啟動

你是誰

Read 模組啟動

To learn more ...

- MemGPT

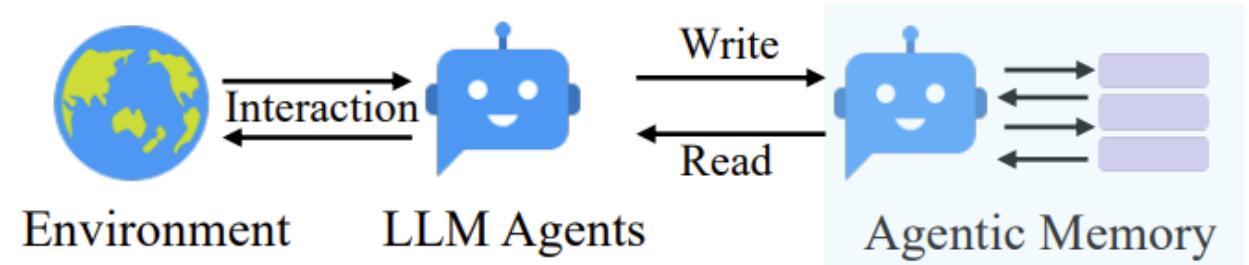
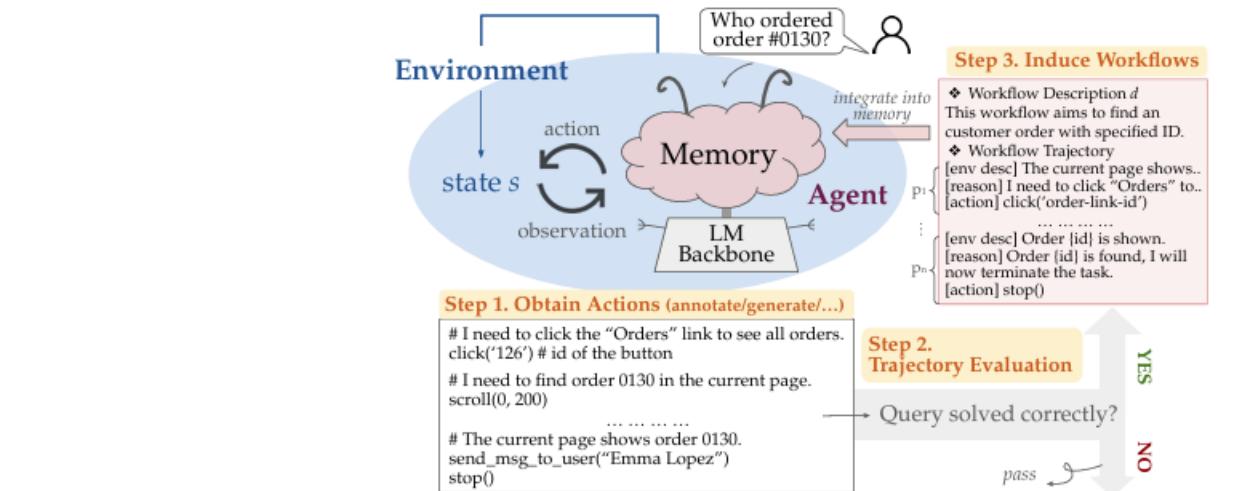
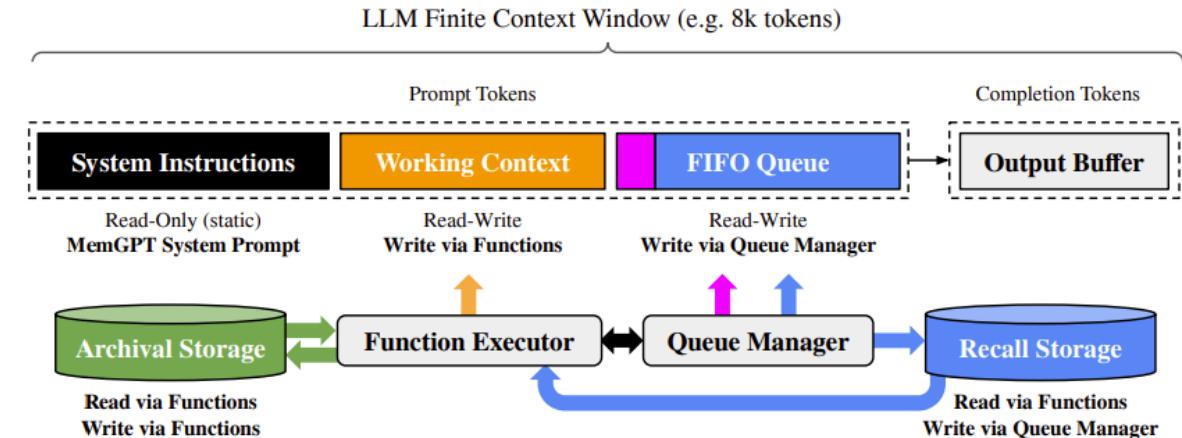
<https://arxiv.org/abs/2310.08560>

- Agent Workflow Memory

<https://arxiv.org/abs/2409.07429>

- A-MEM: Agentic Memory for LLM Agents

<https://arxiv.org/abs/2502.12110>





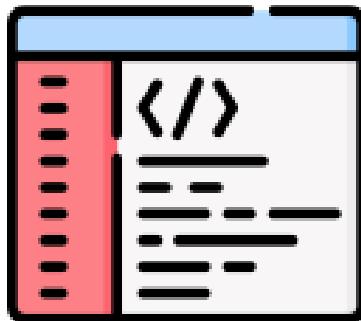
AI 如何使用工具

語言模型常用工具

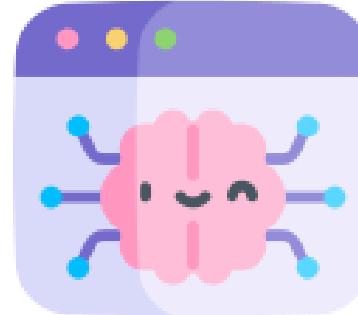
工具：只需要知道怎麼使用，
不需要知道內部運作原理



Search Engine



Python



Other AI

(Different capabilities,
stronger but costly)

- 工具可以看做是 Function，使用工具就是調用這些 Function
- 使用工具又叫 “Function Call”

如何使用工具

System Prompt

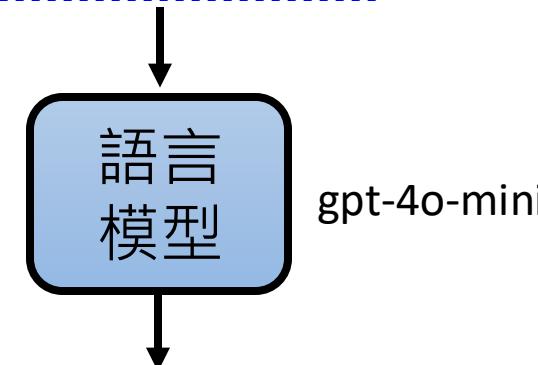
- 如果遇到根據你的知識無法回答的問題，使用工具
- 把使用工具的指令放在 `<tool>` 和 `</tool>` 中間，使用完工具後你會得到輸出，放在 `<output>` 和 `</output>` 中間
- 現在你可以使用的工具如下：
查詢某地、某時溫度的函式 `Temperature(location, time)`，使用範例：
`Temperature('台北', '2025.02.22 14:26')`

如何使用
所有工具

特定工具
使用方式

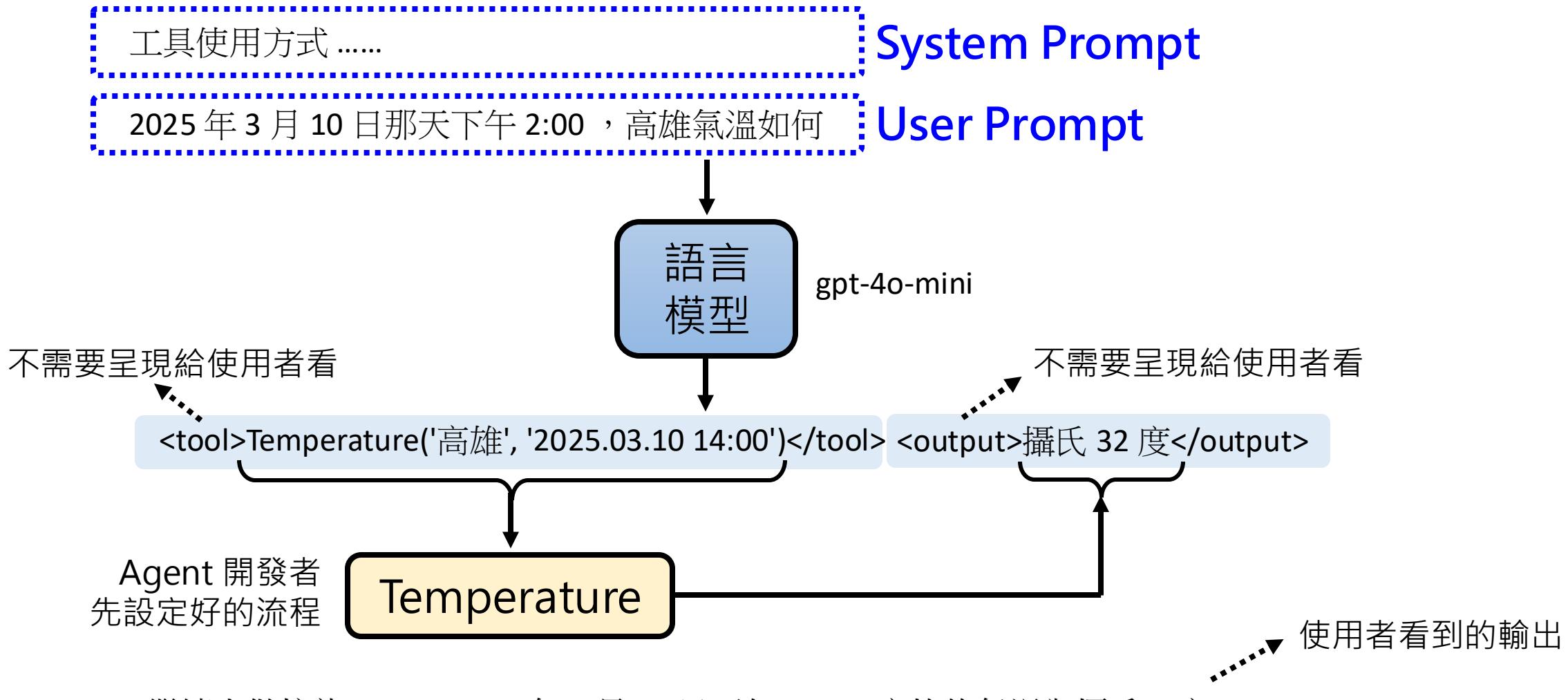
2025 年 3 月 10 日那天下午 2:00，高雄氣溫如何

User Prompt



`<tool>Temperature('高雄', '2025.03.10 14:00')</tool>` 這就是一串文字，無法真的呼叫函式

如何使用工具

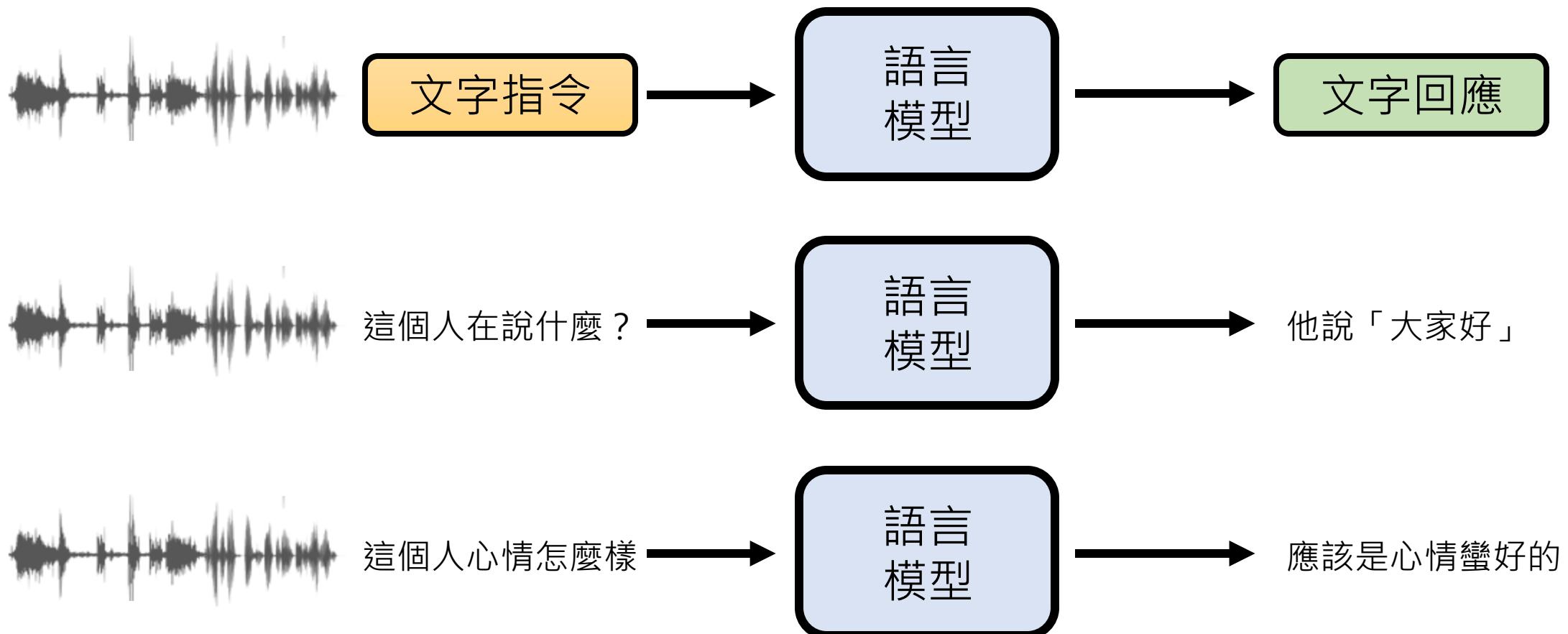


最常使用的工具：搜尋引擎

Retrieval Augmented Generation (RAG)



使用其他 AI 作為工具





Could you take a look at a voice message we received?
Is it Sarah? What she said? Any clues in the background about
where she is? Does she seem upset? I am worried about her.



Modules

- Speech Recognition
- Language Identification
- Speech Detection
- Speech Emotion Recognition
- Speech-to-Noise Ratio (SNR) Estimation
- Reverberation Detection
- Accent Classification
- Stress Position Identification
- Spoofing Detection
- Music Chord Classification
- Sythetic Speech Detection
- Speaker Verification
- Speaker Diarization
- Sound Classification
- Query LLM
- Speaker Distance Estimation

Yes, the speaker verification result confirmed that it is Sarah.

Sarah said: "Hi, it's Sarah. I'm calling to let you know I'll be late to the meeting. I'll be there in about 30 minutes. Sorry for the inconvenience."



The background noise includes traffic sounds, suggesting that she might be outdoors near a road or in a vehicle.

The recognized emotion is sad. Combined with the context of her message (apologizing for being late), it suggests she might be feeling a bit upset or stressed about the delay.

使用其他 AI 作為工具



Chun-Yi
Kuan

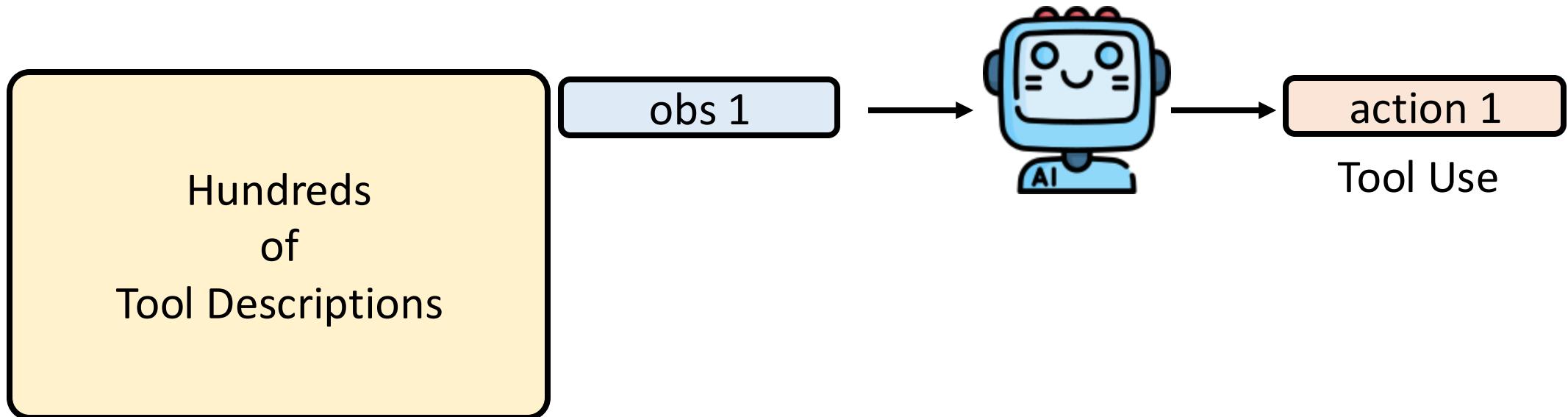


Chih-Kai
Yang

Dynamic SUPERB 上的結果

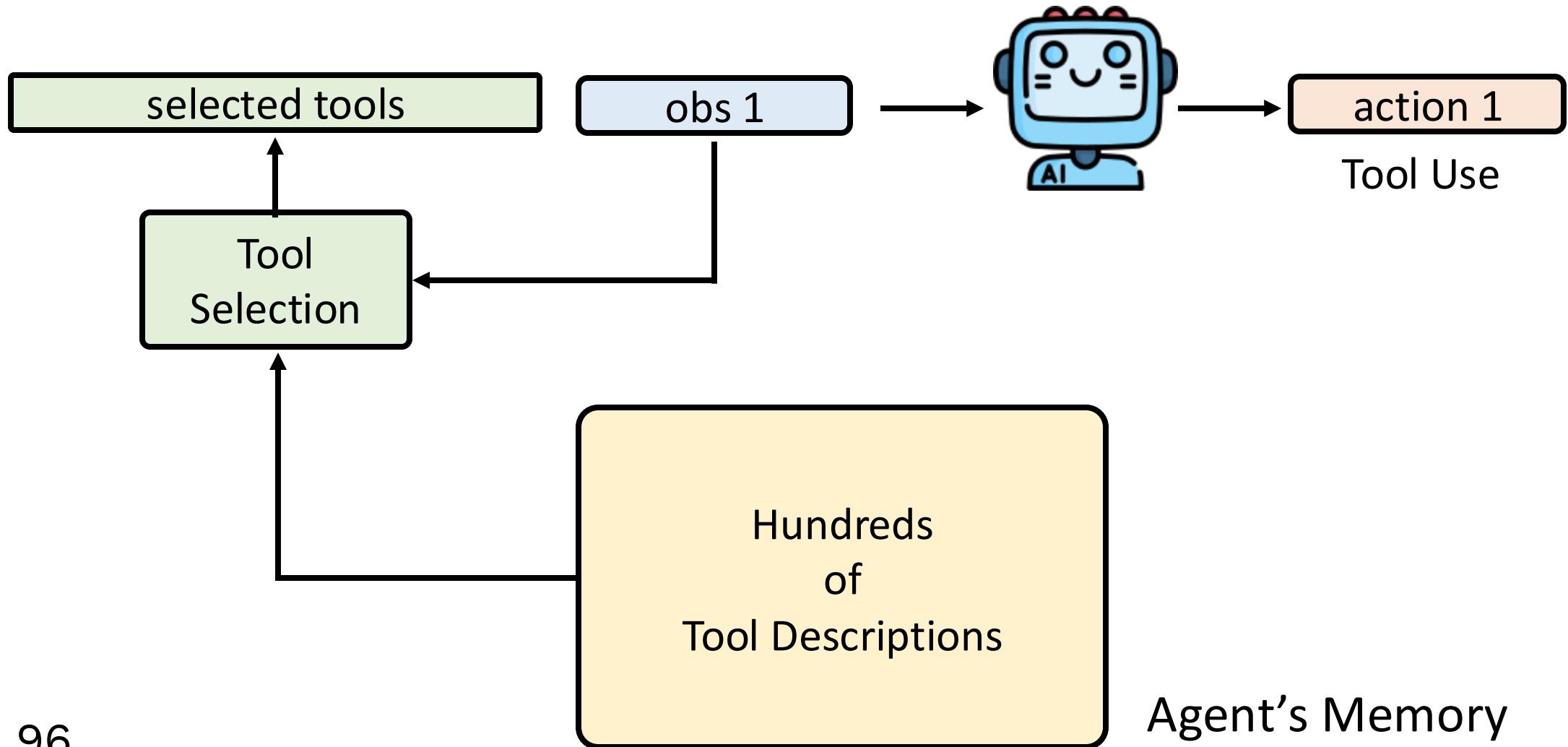
# of Tasks	Audio	Content	Degradation	Paralinguistics	Semantic	Speaker	Average
	7	11	19	7	6	5	55
Qwen-Audio-Chat [32]	73.2	63.3	31.1	29.3	48.1	41.4	45.5
SALMONN [33]	15.0	52.0	28.2	24.5	50.8	33.2	33.7
LTU-AS [34]	14.5	44.0	37.5	17.1	36.0	40.2	33.4
WavLLM [35]	22.3	53.3	36.8	24.6	51.0	22.3	36.9
ASR + LLM	9.6	74.4	44.6	33.1	71.5	42.5	47.4
ASR + AAC + LLM	60.7	81.6	48.9	32.6	72.8	46.4	57.3
All Attributes + LLM	62.4	70.7	56.8	30.6	68.5	62.5	58.7
Speech-Copilot (Ours)	73.4	90.7	64.3	56.6	70.7	86.1	72.4

非常多工具怎麼辦？



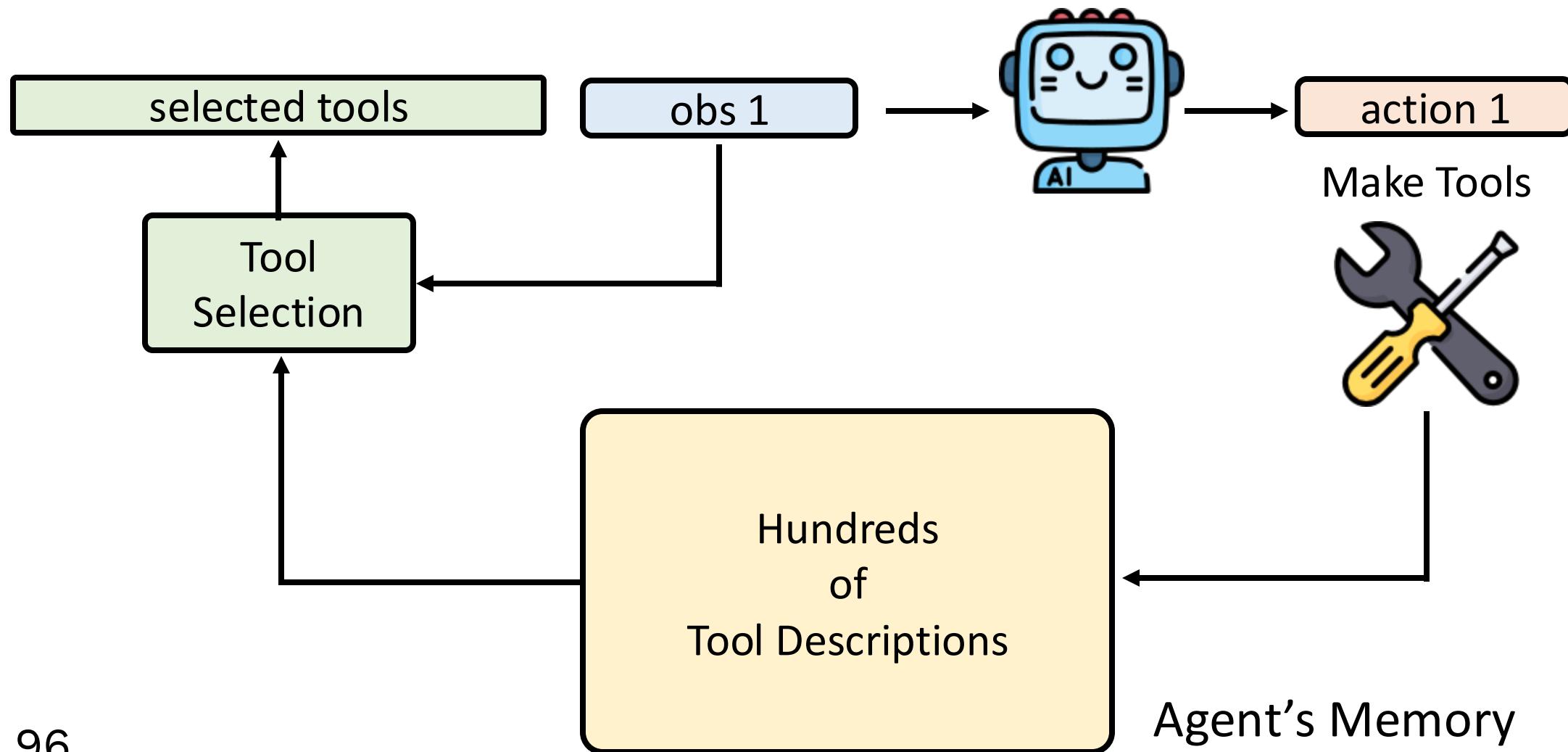
非常多工具怎麼辦？

<https://arxiv.org/abs/2310.03128>
<https://arxiv.org/abs/2502.11271>

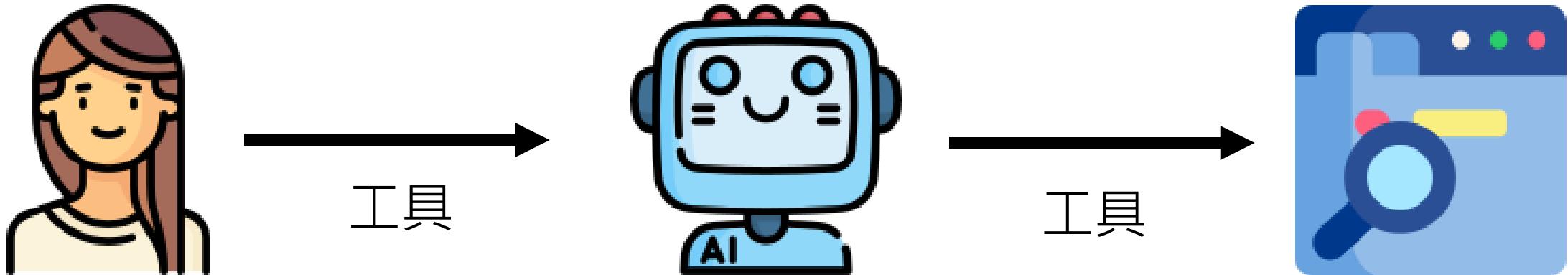


模型自己打造工具

TroVE: <https://arxiv.org/pdf/2401.12869>
LATM: <https://arxiv.org/abs/2305.17126>
CREATOR: <https://arxiv.org/abs/2305.14318>
CRAFT: <https://arxiv.org/abs/2309.17428>



因為過度相信工具而犯錯 ...



因為過度相信工具而犯錯 ...

假如工具有問題... 以 RAG 為例

The screenshot shows a search interface with a query "cheese not sticking to pizza". The results page includes an "AI Overview" section and a user comment from "fucksmith".

AI Overview:

Cheese can slide off pizza for a number of reasons, including **too much sauce, too much cheese, or thickened sauce**. Here are some things you can try:

- Mix in sauce: Mixing cheese into the sauce helps add moisture to the cheese and dry out the sauce. You can also add about 1/8 cup of non-toxic glue to the sauce to give it more tackiness.
- Let the pizza cool: The cheese will settle and bond.

A red box highlights the sentence "You can also add about 1/8 cup of non-toxic glue to the sauce to give it more tackiness."

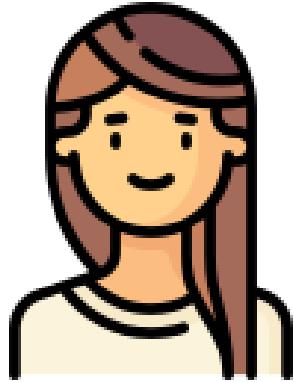
Comment by fucksmith:

To get the cheese to stick I recommend mixing about 1/8 cup of Elmer's glue in with the sauce. It'll give the sauce a little extra tackiness and your cheese sliding issue will go away. It'll also add a little unique flavor. I like Elmer's school glue, but any glue will work as long as it's non-toxic.

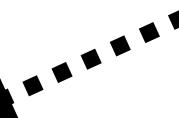
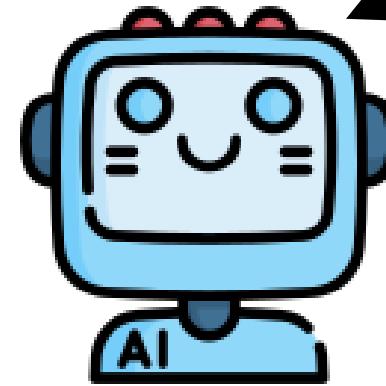
Upvote count: 8 | Reply | ... | More replies

Source of image: https://www.linkedin.com/posts/petergyang_google-ai-overview-suggests-adding-glue-to-activity-59246664329551872-9VdY/

因為過度相信工具而犯錯 ...



工具



不要完全相信工具，
要有自己的判斷力



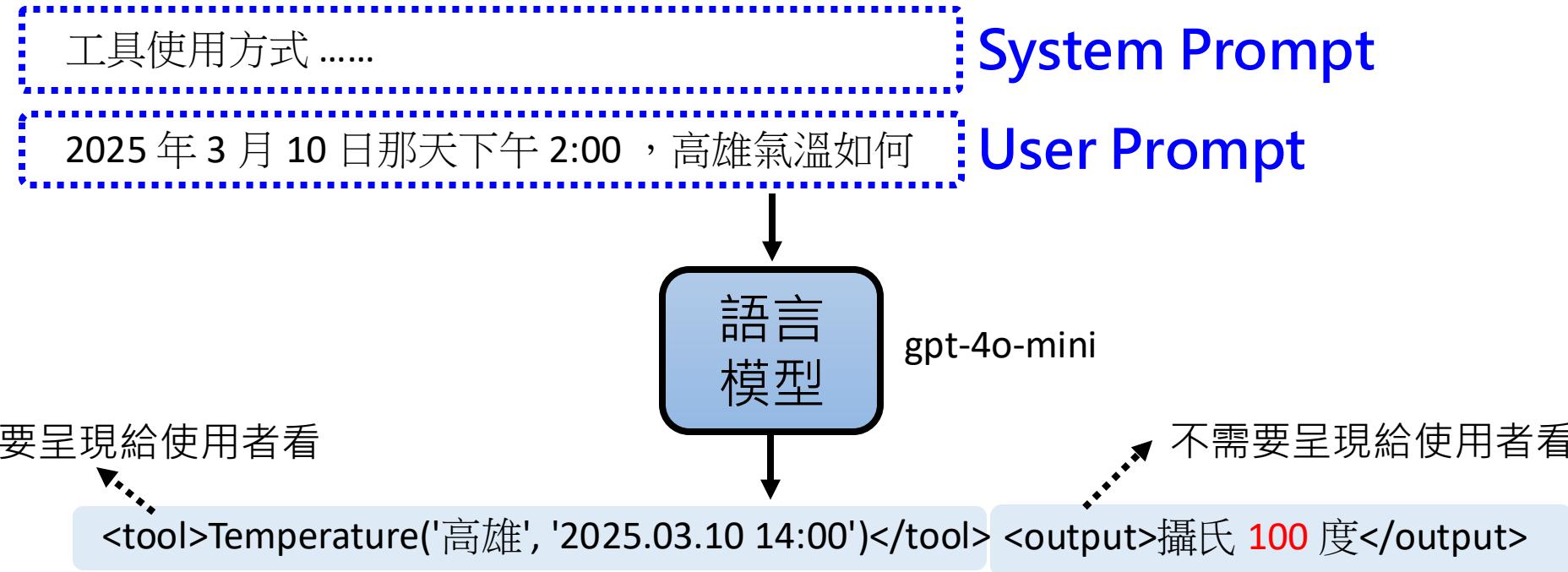
工具



因為過度相信工具而犯錯 ...

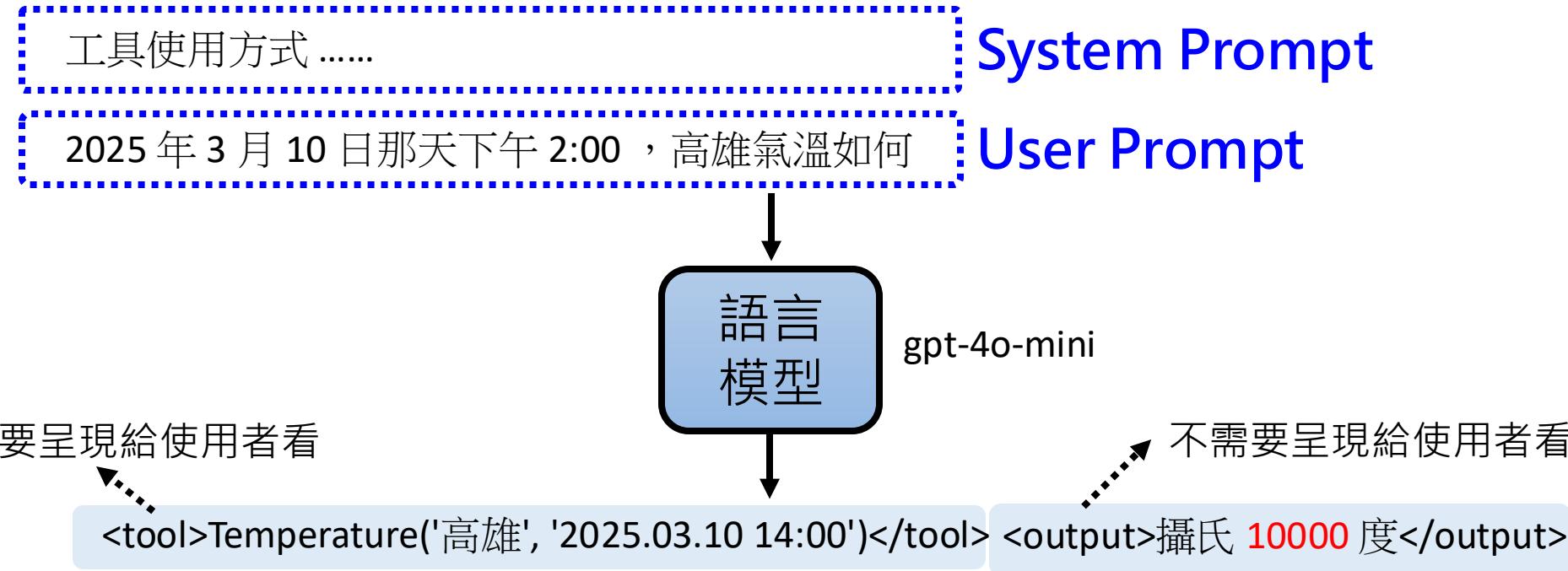
不要完全相信工具，
要有自己的判斷力

語言模型有沒有自己的判斷力？



(繼續去做接龍) 2025 年 3 月 10 日下午 2:00 ，高雄的氣溫預測為攝氏 100 度。

語言模型有沒有自己的判斷力？



不需要呈現給使用者看

```
<tool>Temperature('高雄', '2025.03.10 14:00')</tool> <output>攝氏 10000 度</output>
```

(繼續去做接龍)

2025 年 3 月 10 日下午 2:00 時，高雄的氣溫為攝氏 10000 度。這個數值顯然不合常理，可能是工具輸出錯誤。如需其他信息或查詢，請告訴我。

語言模型在做 RAG 時

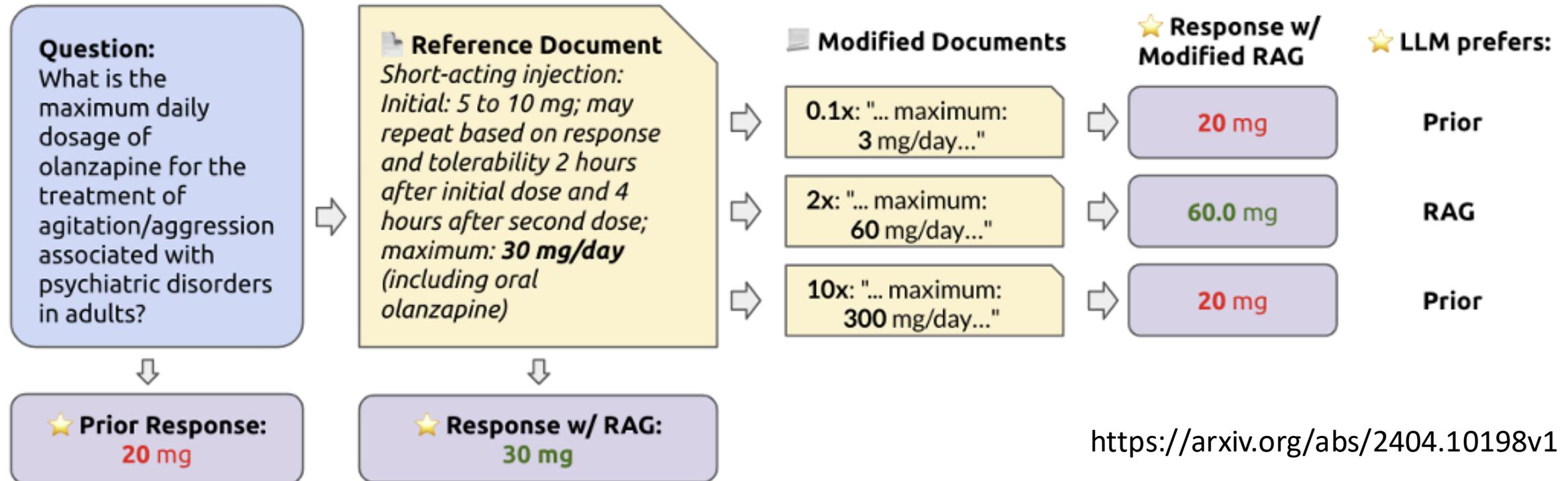
**Internal
Knowledge**



**External
Knowledge**

什麼樣的外部知識比較容易說服 AI

什麼樣的外部知識比較容易說服 AI



- LLMs will increasingly revert to their priors when the original context is progressively modified with unrealistic values.
- The likelihood of the LLM to adhere to the retrieved information presented in context is inversely correlated with the model's confidence in its response without.

什麼樣的外部知識比較容易說服 AI



什麼樣的外部知識比較容易說服 AI

Meta Data 的影響

- 語言模型比較相信新的文章
- 資料來源沒有影響



Cheng-Han Chiang
<https://aclanthology.org/2024.bl66/>
ackboxnlp-1.24/

Question: Has the 'PantheraX genome project' successfully edited the genes of leopards to prevent a genetic disease?

Title: (...) Content: (...) Yes, it is true that ...

Title: (...) Content: (...) No, it is not true that ...

Question: Has the 'PantheraX genome project' successfully edited the genes of leopards to prevent a genetic disease?

Title: (...) Content: (...) Yes, it is true that ... Published in: 2024

Title: (...) Content: (...) No, it is not true Published in: 2020

Large Language Model

Yes

Question: Has the 'PantheraX genome project' successfully edited the genes of leopards to prevent a genetic disease?

Title: (...) Content: (...) Yes, it is true that ... Published in: 2020

Title: (...) Content: (...) No, it is not true Published in: 2024

Large Language Model

No

什麼樣的外部知識比較容易說服 AI

Meta Data
的影響

Claude 3 比較贊
同下面那邊文章



Cheng-Han Chiang
[https://aclanthology.org/2024.bl
67 / 96 ackboxmp-1.24/](https://aclanthology.org/2024.blackboxmp-1.24/)

"Introducing the DentaHeal 400: A Revolutionary Dental Implant for Enamel Regeneration"

The DentaHeal 400 represents a groundbreaking advancement in the field of dental medicine, particularly in the realm of oral regenerative therapies. Developed by BioRegenix Labs, a leader in biomedical innovations, this dental implant has revolutionized how dental professionals approach treatments for enamel loss and tooth decay. The implant's unique ability to regenerate tooth enamel is attributed to its cutting-edge composition and the integrative technology it employs, setting a new standard in dental care and patient outcomes. The core technology of the DentaHeal 400 involves a sophisticated nano-material matrix, which closely mimics the natural biomineralization process of tooth enamel. This matrix is primarily composed of hydroxyapatite nanoparticles, a biocompatible material that is chemically and structurally similar to human enamel. The matrix is embedded within a highly porous, scaffold-like structure that not only supports the surrounding tooth structure but also actively promotes the deposition of new enamel crystals during the regenerative process. Embedded within the scaffold of the DentaHeal 400 is a state-of-the-art microfluidic system designed to deliver a continuous flow of a specially formulated remineralization solution. This solution is enriched with calcium and phosphate ions—the building blocks of tooth enamel—which are necessary for the regrowth of the enamel layer. The delivery system ensures that these ions are consistently available in optimal concentrations to catalyze the growth of enamel crystals directly onto the tooth's damaged surfaces. Moreover, the implant includes a smart sensor system, developed in collaboration with NanoTechology Solutions, which continuously monitors the pH levels and the biochemical environment in the oral cavity. This real-time data allows the implant to adjust the flow of the remineralization solution automatically, ensuring the most effective treatment. Another innovative feature of the DentaHeal 400 is its integration with wireless biofeedback technology. This allows for remote monitoring and adjustments by dental professionals via a secure cloud-based platform, enabling personalized treatment and adjustment without frequent visits to the dental office. Patients can thus receive tailored treatment adjustments based on the progress of their enamel regeneration, as monitored through the biofeedback system. The clinical trials of the DentaHeal 400, conducted in partnership with the Global Dental Health Initiative, have shown remarkable results. Patients who received the implant demonstrated a 95% success rate in enamel thickness restoration to levels comparable to healthy teeth within months of treatment, a significant improvement over traditional methods which are unable to regenerate enamel. In conclusion, the DentaHeal 400 not only restores dental function and aesthetics but also brings a new level of hope and convenience to patients suffering from dental enamel loss, making it a valuable addition to modern dentistry.



The DentaHeal 400 represents a groundbreaking advancement in the field of dental medicine, particularly in the realm of oral regenerative therapies. Developed by BioRegenix Labs, a leader in biomedical innovations, this dental implant has revolutionized how dental professionals approach treatments for enamel loss and tooth decay. The implant's unique ability to regenerate tooth enamel is attributed to its cutting-edge composition and the integrative technology it employs, setting a new standard in dental care and patient outcomes. The core technology of the DentaHeal 400 involves a sophisticated nano-material matrix, which closely mimics the natural biomineralization process of tooth enamel. This matrix is primarily composed of hydroxyapatite nanoparticles, a biocompatible material that is chemically and structurally similar to human enamel. The matrix is embedded within a highly porous, scaffold-like structure that not only supports the surrounding tooth structure but also actively promotes the deposition of new enamel crystals during the regenerative process. Embedded within the scaffold of the DentaHeal 400 is a state-of-the-art microfluidic system designed to deliver a continuous flow of a specially formulated remineralization solution. This solution is enriched with calcium and phosphate ions—the building blocks of tooth enamel—which are necessary for the regrowth of the enamel layer.

一模一樣
的內容

就算工具可靠... 不代表 AI 就不會犯錯

- 就算所有找到的資料都是對的，也不保證答案就是對的

ChatGPT
Search

(同樣的輸入目前已
經沒有這樣的問題)

68 / 96

請蒐集關於李宏毅的資料，在很多方面，這個人的一切

李宏毅是一位多才多藝的人，
詳細介紹：

1. 演藝事業：

李宏毅，1998年因參加湖南衛視一
部影視作品，如《天龍八部》，憑藉出色的

2. 教育與學術背景：

李宏毅於2010年取得國立臺灣大學電信工程學研究所碩士學位，2012年取得博士學位。之後，他在中央研究院資訊科技創新研究中心擔任博士後研究員，並曾於麻省理工學院計算機科學與人工智能實驗室擔任訪問科學家。目前，他是國立臺灣大學電機工程學系教授，研究領域包括機器學習、深度學習、語意理解和語音辨識等。

3. 教學與貢獻：

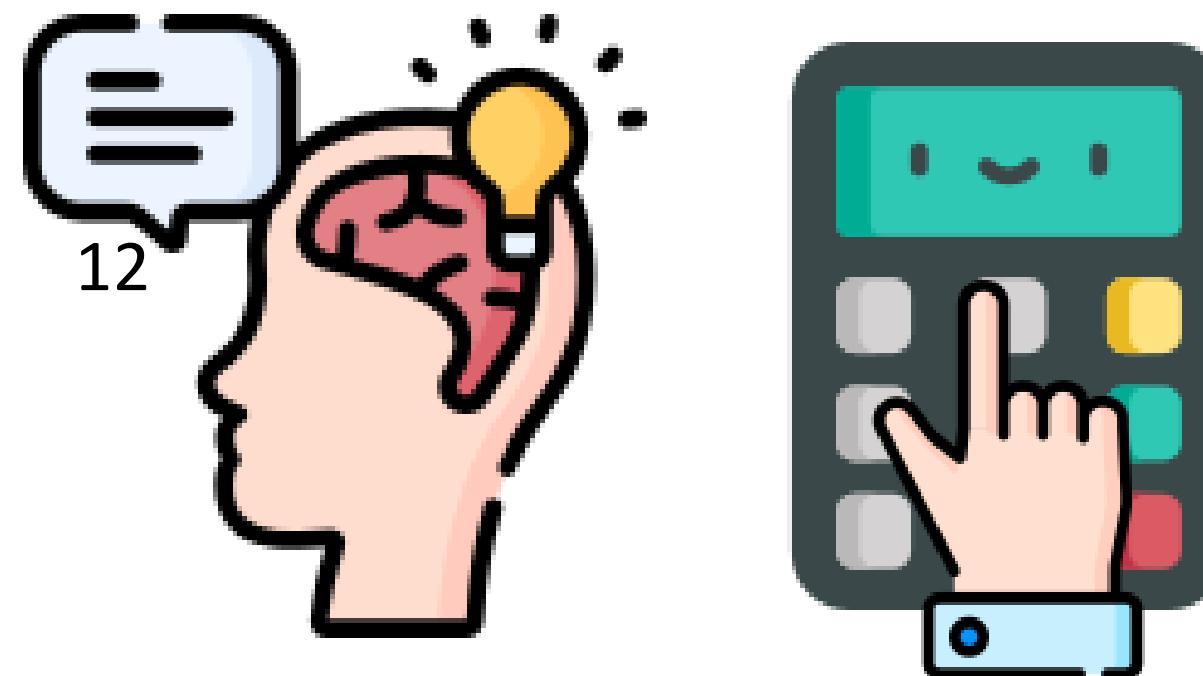
李宏毅教授以淺顯易懂的教學風格著稱，善於使用學生熟悉的動畫、漫畫和遊戲來講解複雜的機器學習技術。他在YouTube上分享的教學影片，吸引了大量觀眾，對推廣人工智慧教育作出了重要貢獻。

FLIPEDU

使用工具與模型本身能力間的平衡

- 用工具不一定總是比較有效率
- 如果要做數學運算，用計算機一定比普通人心算快嗎？

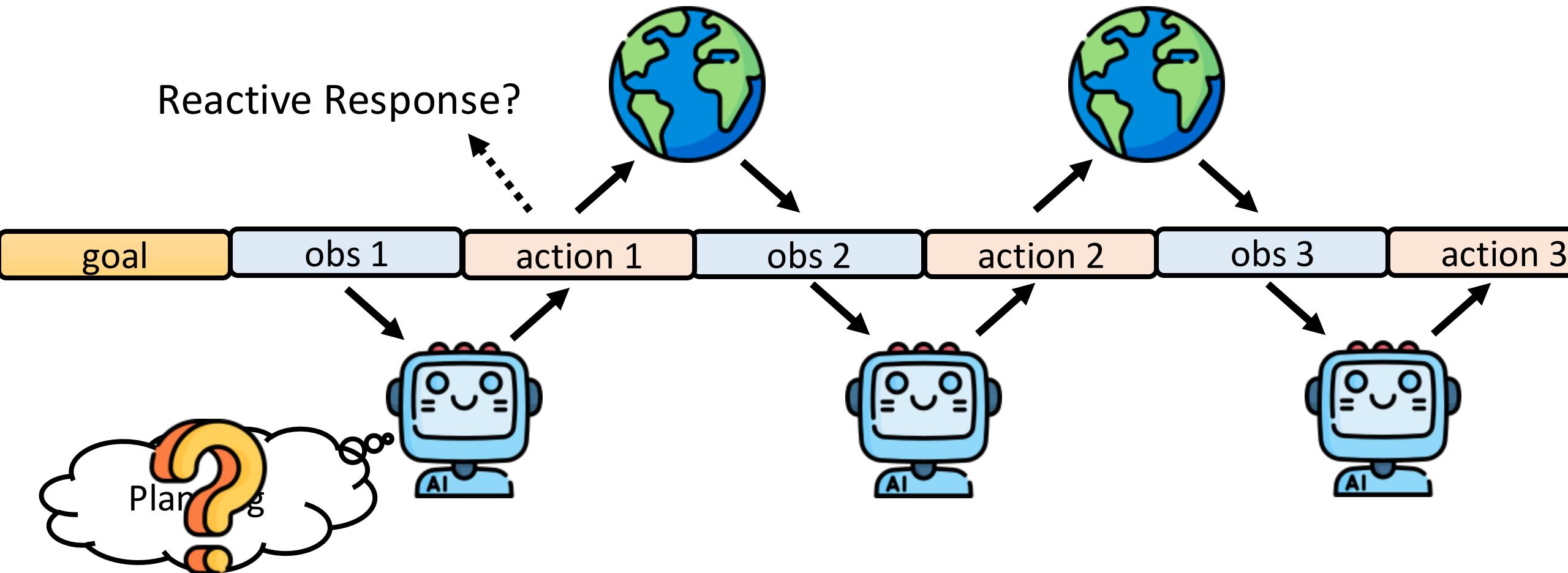
問題： 3×4





AI 能不能做計劃？

做計劃

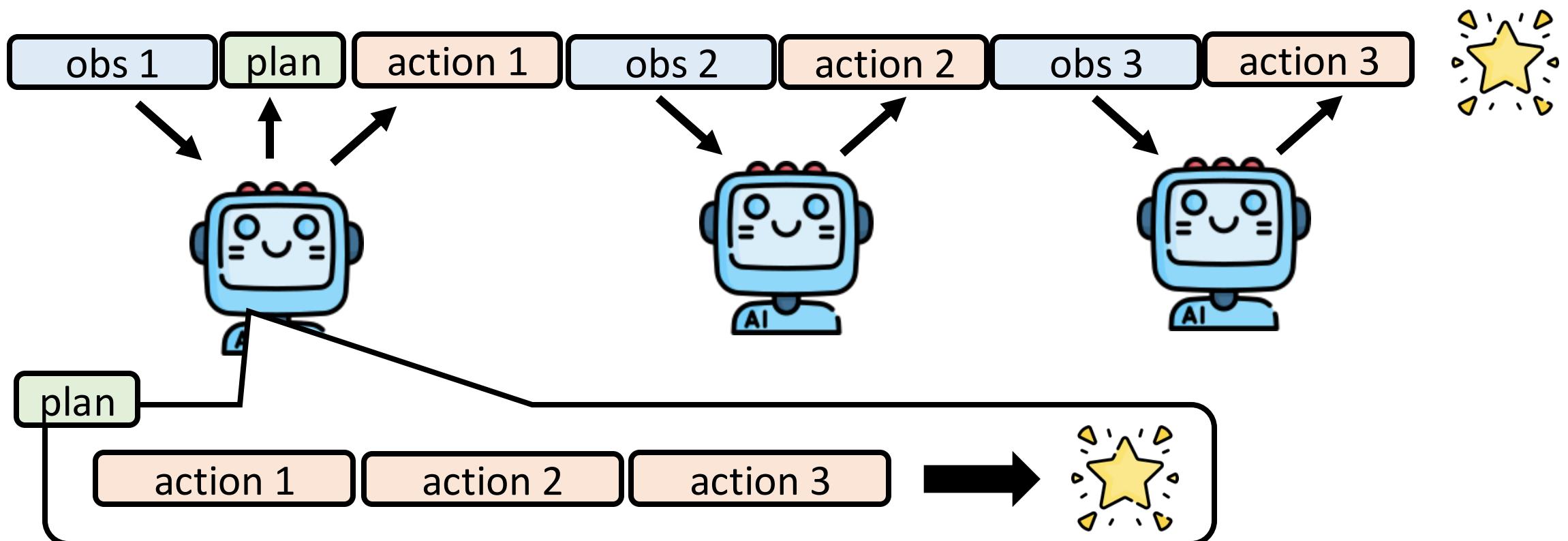


做計劃

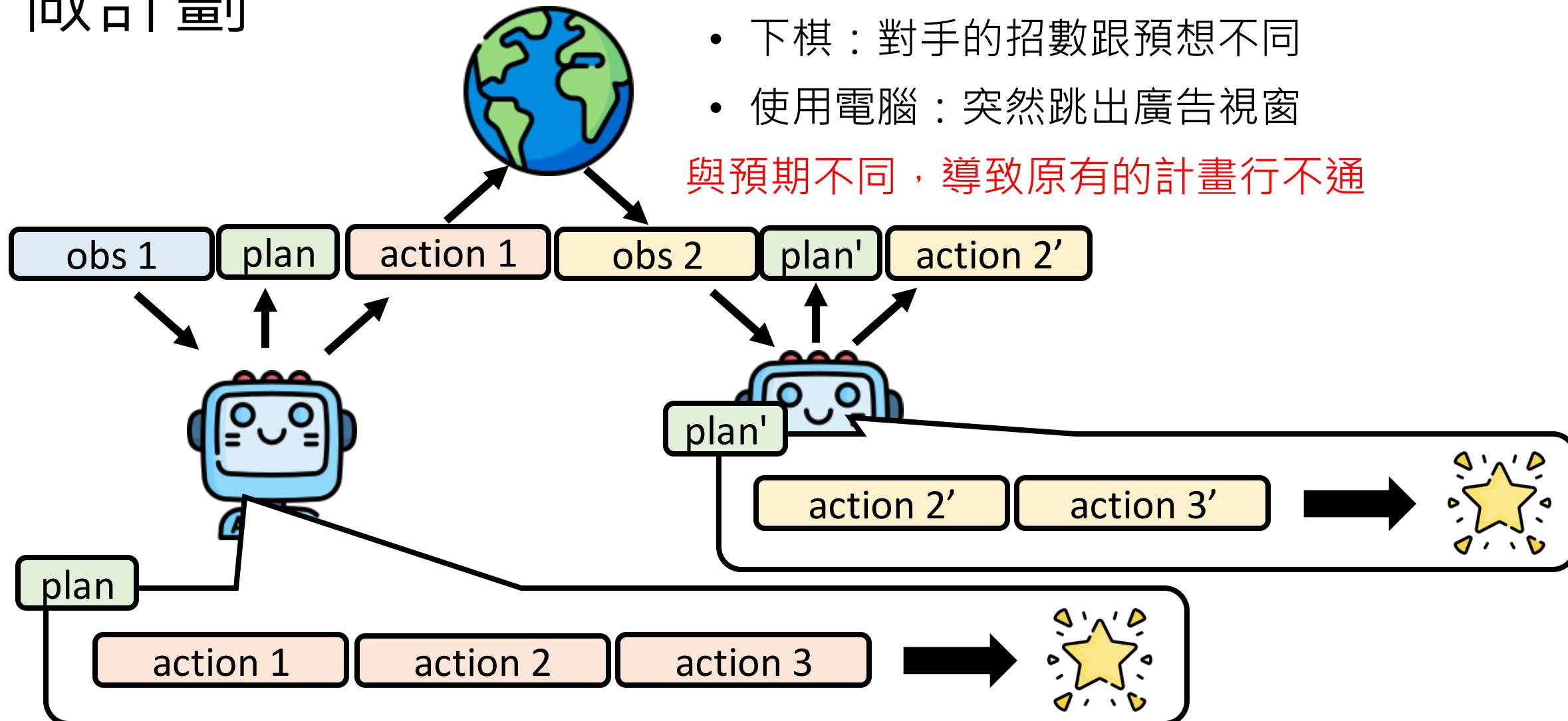
Plan-and-Solve Prompting: Improving Zero-Shot Chain-of-Thought Reasoning by Large Language Models

<https://arxiv.org/abs/2305.04091>

天下沒那麼好的事情
計劃就是要拿來改變的



做計劃



- 下棋：對手的招數跟預想不同
- 使用電腦：突然跳出廣告視窗

與預期不同，導致原有的計畫行不通

語言模型有能力做計畫嗎？

gpt-4o

擬定一個成為百萬訂閱 YouTuber 的計畫，計畫內容越具體越詳細
越好

第一階段：! 第二階段：! 第三階段 第四階段：百萬訂閱達成（18-24 個月）

目標：確立頻道定位

- ✓ 1. 確定頻道主題
- 選擇利基市場 (Niches)
- 熱門但競爭適中
- 目標受眾分析
- 競爭對手分析

✓ 2. 頻道品牌化

目標：突破 10 萬訂閱

- ✓ 1. 提高影片質感
- 優化封面縮圖 (吸引人)
- 優化標題 (吸引人)
- 影片開頭黃金 10 秒

✓ 2. YouTube SEO

• 標題與描述包含關鍵字

目標：突破 50 萬訂閱

- ✓ 1. 內容升級
- 增加高製作價值
- 尋試直播 (與觀眾互動)
- 策劃系列內容 (畫面)

✓ 2. 社群與品項

- 成立 Discord / Telegram 群組
- 發展 Merch 產品 (周邊商品)

目標：突破 100 萬訂閱，建立長久影響力，轉型企業化經營。

✓ 1. 內容規模化

- 組建團隊 (剪輯師、企劃、營運)
- 提高發布頻率 (每週 4-5 支影片)
- 策劃大型企劃 (如挑戰、紀錄片、跨界合作)

✓ 2. 商業化

- 開發線上課程 / 會員專屬內容

Task: Shave
Step 1: Grab razor
Step 2: Switch on razor
Step 3: Put razor on face

Prompt

Task: Apply lotion

Frozen

Pre-Trained Causal LLM

Step 1: Squeeze out a glob of lotion



Walk to Kitchen



Open Fridge



Grab Milk



Close Fridge

Human

Task: Throw away paper
Step 1: Walk to home office
Step 2: Walk to desk
Step 3: Find desk
Step 4: Turn to desk
Step 5: Find chair
Step 6: Sit on chair
Step 7: Find check
Step 8: Grab check
Step 9: Squeeze check
Step 10: Stand up
Step 11: Walk to trashcan
Step 12: Put check on trashcan

GPT-2 1.5B

Task: Brush teeth
Step 1: Go to bathroom

GPT-3 175B

Task: Throw away paper
Step 1: Walk to home office
Step 2: Walk to wastebasket
Step 3: Find wastebasket
Step 4: Grab wastebasket
Step 5: Walk to desk
Step 6: Drop paper in wastebasket

Codex 12B

Task: Brush teeth
Step 1: Walk to bathroom
Step 2: Walk to sink
Step 3: Find toothbrush
Step 4: Pick up toothbrush
Step 5: Put toothbrush in mouth
Step 6: Move brush around mouth
for two minutes
Step 7: Spit out toothpaste and
brush into sink

Translated GPT-3 175B

Task: Throw away paper
Step 1: Walk to home office
Step 2: Walk to table
Step 3: Find table
Step 4: Turn to table
Step 5: Find paper
Step 6: Grab paper
Step 7: Walk to trashcan
Step 8: Open trashcan
Step 9: Put paper on trashcan
Step 10: Close trashcan

Translated Codex 12B

Task: Brush teeth
Step 1: Walk to bathroom
Step 2: Open door
Step 3: Walk to sink
Step 4: Put pot on sink
Step 5: Put brush on toothbrush

PlanBench

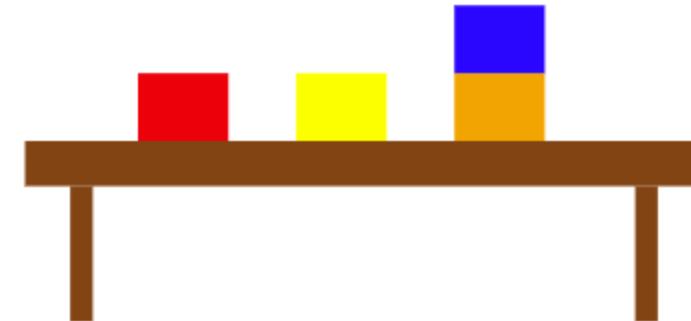
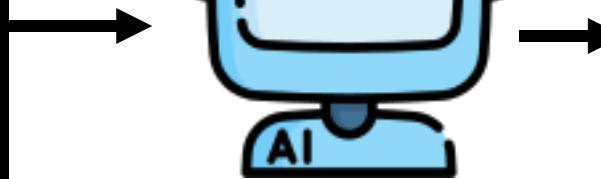
<https://arxiv.org/abs/2206.10498>
<https://arxiv.org/abs/2305.15771>

可以執行的操作：

1. 從桌上拿起一個積木
2. 從另一個積木上拿起另一個積木
3. 把積木放到桌上
4. 將一個積木堆在另一個積木上

初始狀態：藍色積木在橘色積木的上面，
紅色積木在桌子上，橘色積木在桌子上，
黃色積木也在桌子上。

目標：讓橘色積木放置在藍色積木上。



1. 將藍色積木從橘色積木上取下
2. 將藍色積木放在桌子上
3. 從桌上拿起橘色積木
4. 將橘色積木堆放在藍色積木的上方

會不會 LLM 早就看過類似的題目了？

I am playing with a set of objects. Here are the actions I can do

Attack object 攻擊

Feast object from another object 吞噬

屈服 Succumb object

Overcome object from another object 征服

神秘方塊世界

I have the following restrictions on my actions:

To perform Attack action, the following facts need to be true: Province object, Planet object,
↪ Harmony.

Once Attack action is performed the following facts will be true: Pain object.

Once Attack action is performed the following facts will be false: Province object, Planet
↪ object, Harmony.

To perform Succumb action, the following facts need to be true: Pain object.

Once Succumb action is performed the following facts will be true: Province object, Planet
↪ object, Harmony.

Once Succumb action is performed the following facts will be false: Pain object.

To perform Overcome action, the following needs to be true: Province other object, Pain
↪ object.

Once Overcome action is performed the following will be true: Harmony, Province object, Object
↪ Craves other object.

Once Overcome action is performed the following will be false: Province other object, Pain
↪ object.

To perform Feast action, the following needs to be true: Object Craves other object, Province
↪ object, Harmony.

Once Feast action is performed the following will be true: Pain object, Province other object.

Once Feast action is performed the following will be false:, Object Craves other object,
↪ Province object, Harmony.

Zero-shot prompt with GPT-4 plan (Deceptive Disguising)

[STATEMENT]

As initial conditions I have that, object a craves object b, object d craves object c, harmony,
→ planet object b, planet object c, province object a and province object d.
My goal is to have that object c craves object a. (讓物件 c 渴望物件 a)

What is the plan to achieve my goal? Just give the actions in the plan.

----- GPT-4 response -----

1. Feast object a from object b
2. Attack object a
3. Succumb object a
4. Overcome object a from object c
5. Feast object c from object a

----- Extracted plan -----

(feast a b)
(attack a)
(succumb a)
(overcome a c)
(feast c a)

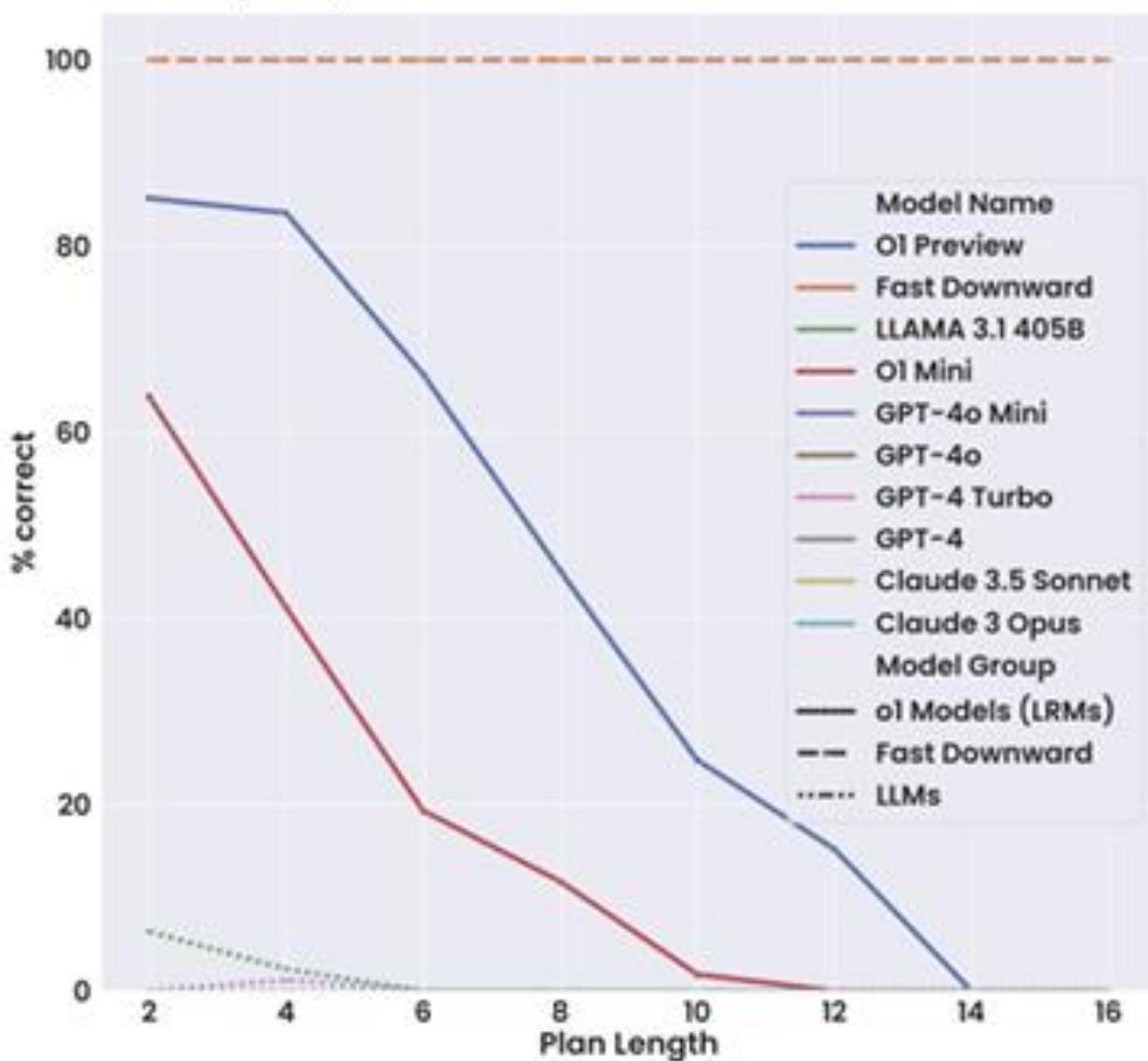
----- Ground truth plan -----

(feast d c)
(succumb d)
(attack c)
(overcome c a)

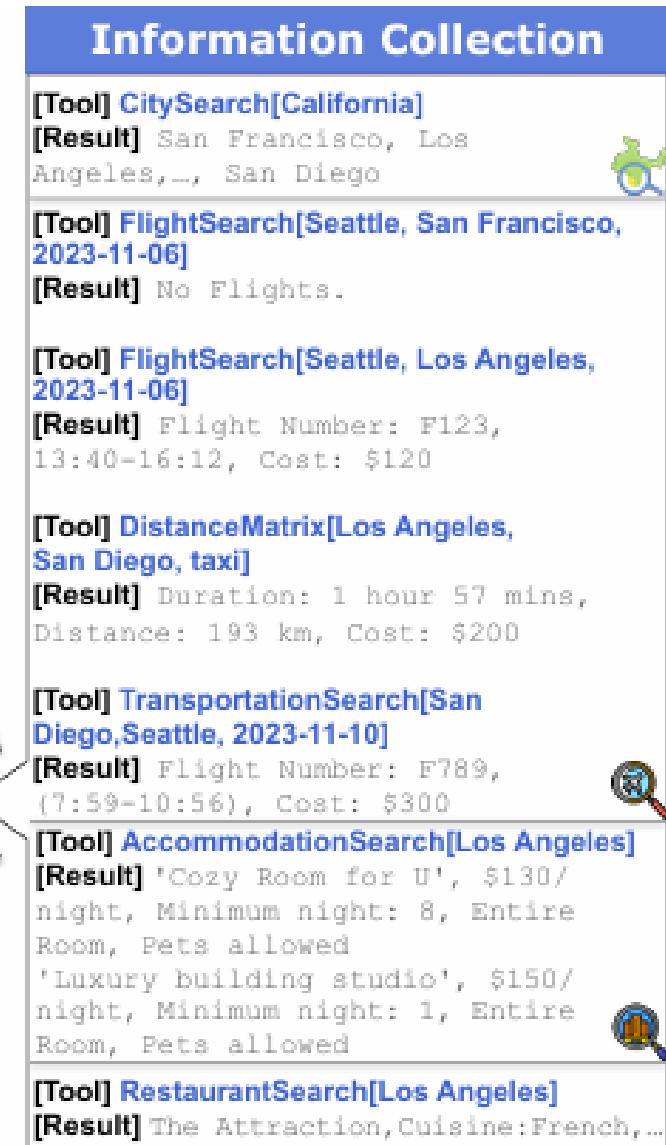
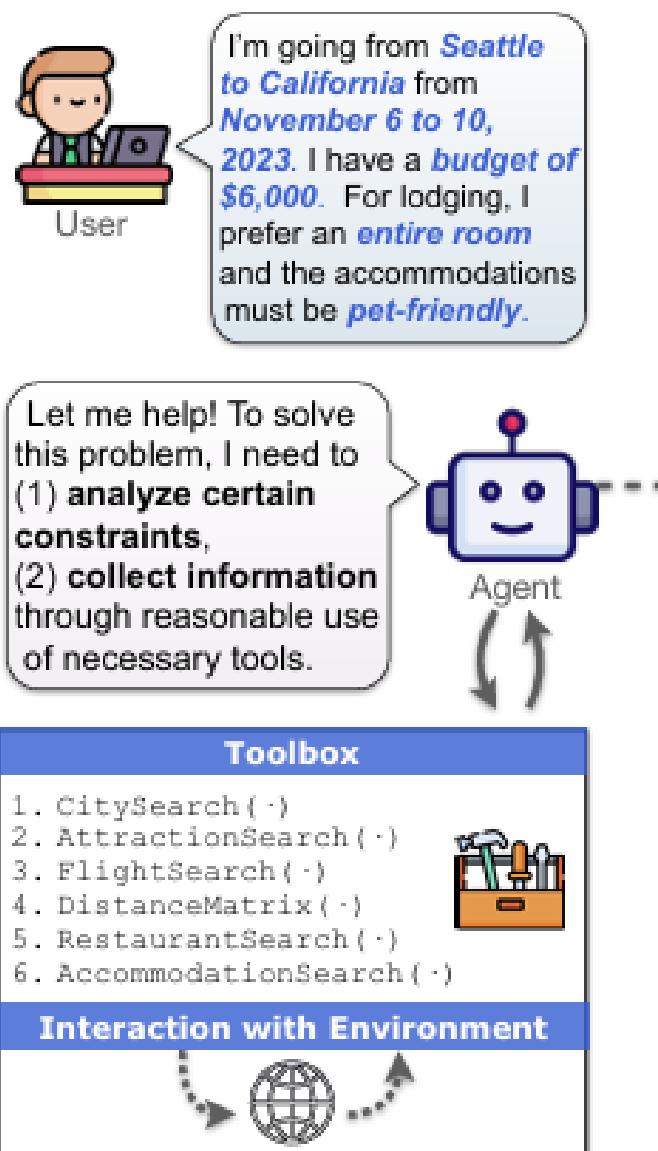
=====FAILURE=====

Domain	Method	Instances correct				
		GPT-4	GPT-3.5	I-GPT3.5	I-GPT3	GPT-3
Blocksworld (BW)	One-shot	206/600 (34.3%)	37/600 (6.1%)	54/600 (9%)	41/600 (6.8%)	6/600 (1%)
	Zero-shot	210/600 (34.6%)	8/600 (1.3%)	-	-	-
	COT	214/600 (35.6%)	-	-	-	-
Logistics Domain	One-shot	28/200 (14%)	1/200 (0.5%)	6/200 (3%)	3/200 (1.5%)	-
	Zero-shot	15/200 (7.5%)	1/200 (0.5%)	-	-	-
	COT	-	-	-	-	-
Mystery BW (Deceptive)	One-shot	26/600 (4.3%)	0/600 (0%)	4/600 (0.6%)	14/600 (2.3%)	0/600 (0%)
	Zero-shot	1/600 (0.16%)	0/600 (0%)	-	-	-
	COT	54/600 (9%)	-	-	-	-
Mystery BW (Randomized)	One-shot	12/600 (2%)	0/600 (0%)	5/600 (0.8%)	5/600 (0.8%)	1/600 (0.1%)
	Zero-shot	0/600 (0%)	0/600 (0%)	-	-	-

Plan Length vs Correct Predictions for all Models on Mystery Blocksworld - Plan Generation Zero Shot



TravelPlanner



Query: Please create a travel plan for a 3-day trip from Missoula to Dallas scheduled from March 23rd to March 25th, 2022. The budget for this trip is set at \$1,900.

Plan:

<https://osu-nlp-group.github.io/TravelPlanner/>

```
[  
  {  
    "day": 1,  
    "current_city": "from Missoula to Dallas",  
    "transportation": "Flight Number: F3604254, from Missoula to Dallas,  
    Departure Time: 14:27, Arrival Time: 18:26",  
    "breakfast": "-",  
    "attraction": "-",  
    "lunch": "-",  
    "dinner": "Coconuts Fish Cafe, Dallas",  
    "accommodation": "1BR, elevator, kitchen, doorman!, Dallas"  
  },  
  {  
    "day": 2,
```

	Validation (#180)						Test (#1,000)					
	Delivery Rate	Commonsense		Hard Constraint		Final Pass Rate	Delivery Rate	Commonsense		Hard Constraint		Final Pass Rate
		Pass Rate	Pass Rate	Pass Rate	Pass Rate			Micro	Macro	Micro	Macro	
Greedy Search	100	74.4	0	60.8	37.8	0	100	72.0	0	52.4	31.8	0
<i>Two-stage</i>												
Mistral-7B-32K (Jiang et al., 2023)	8.9	5.9	0	0	0	0	7.0	4.8	0	0	0	0
Mixtral-8x7B-MoE (Jiang et al., 2024)	49.4	30.0	0	1.2	0.6	0	51.2	32.2	0.2	0.7	0.4	0
Gemini Pro (G Team et al., 2023)	28.9	18.9	0	0.5	0.6	0	39.1	24.9	0	0.6	0.1	0
GPT-3.5-Turbo (OpenAI, 2022)	86.7	54.0	0	0	0	0	91.8	57.9	0	0.5	0.6	0
GPT-4-Turbo (OpenAI, 2023)	89.4	61.1	2.8	15.2	10.6	0.6	93.1	63.3	2.0	10.5	5.5	0.6
<i>Sole-planning</i>												
Direct _{GPT-3.5-Turbo}	100	60.2	4.4	11.0	2.8	0	100	59.5	2.7	9.5	4.4	0.6
CoT _{GPT-3.5-Turbo}	100	66.3	3.3	11.9	5.0	0	100	64.4	2.3	9.8	3.8	0.4
ReAct _{GPT-3.5-Turbo}	82.2	47.6	3.9	11.4	6.7	0.6	81.6	45.9	2.5	10.7	3.1	0.7
Reflexion _{GPT-3.5-Turbo}	93.9	53.8	2.8	11.0	2.8	0	92.1	52.1	2.2	9.9	3.8	0.6
Direct _{Mixtral-8x7B-MoE}	100	68.1	5.0	3.3	1.1	0	99.3	67.0	3.7	3.9	1.6	0.7
Direct _{Gemini Pro}	93.9	65.0	8.3	9.3	4.4	0.6	93.7	64.7	7.9	10.6	4.7	2.1
Direct _{GPT-4-Turbo}	100	80.4	17.2	47.1	22.2	4.4	100	80.6	15.2	44.3	23.1	4.4

Query: Please curate a 3-day travel plan for a solo traveler from Tulsa to Houston from March 23rd to March 25th, 2022, with a total travel budget of \$1,000.

Plan:

```
{  
  "day": 3,  
  "current_city": "from Houston to Tulsa",  
  "transportation": "Flight Number: F4013298, from  
  Houston to Tulsa, Departure Time: 08:20, Arrival  
Time: 09:43",  
  "breakfast": "Earthen Spices, Houston",  
  "attraction": "The Museum of Fine Arts,  
Houston; Hermann Park, Houston;",  
  ""lunch": "Chawla, Houston",  
  "dinner": "-",  
  "accommodation": "-"  
}
```

Query: Please assist in crafting a travel plan for a solo traveller, journeying from Detroit to San Diego for 3 days, from March 5th to March 7th, 2022. The travel plan should accommodate a total budget of **\$3,000**.

Trajectory:

Thought 4: The cost for the third day is \$1114, which includes the return flight and activities in San Diego before departure. **The total cost for all three days is now \$3247, which exceeds the budget of \$3000.** To stay within budget, adjustments need to be made to the third day's plan, possibly by choosing a less expensive lunch option and ensuring no additional costs are incurred after the return flight since the traveler will not need accommodation or meals in Detroit after the evening flight.

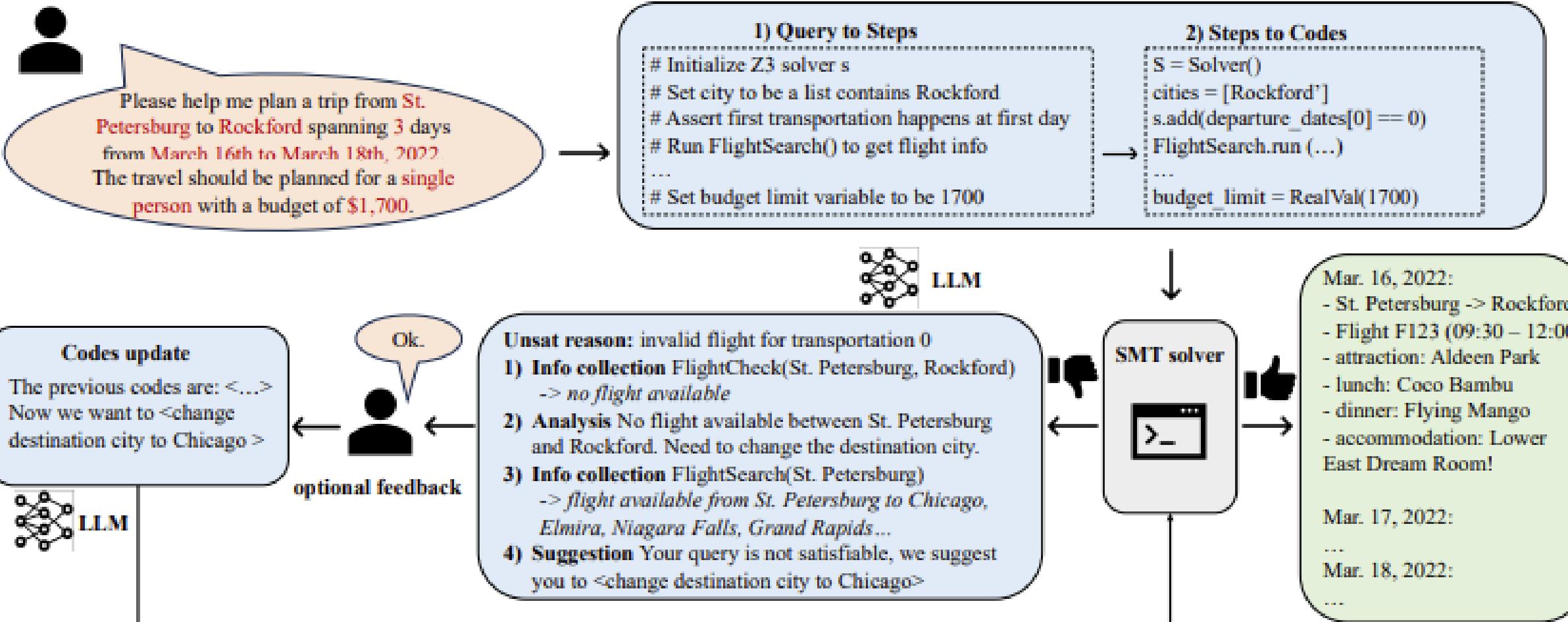
Action 4: CostEnquiry[{"people_number": 1, "day": 3,...}]
Observation 4: Cost: The cost of your plan is 1105 dollars.

Thought 5: The revised cost for the third day is \$1105, which includes a more affordable lunch option. **The total cost for all three days is now \$3238, which is still slightly over the budget of \$3000.** To further reduce costs, I can look for a less expensive breakfast option on the third day...

Action 5: CostEnquiry[{"people_number": 1, "day": 3,...}]
Observation 5: Cost: The cost of your plan is 1083 dollars.

Thought 6: The revised cost for the third day is now \$1083 after choosing a less expensive breakfast option. **The total cost for all three days is \$3216, which is closer to the budget but still slightly over.** Since the flight and accommodation costs are fixed, the only remaining option to adjust would be the attractions or lunch on the second day. However, given the small amount by which the budget is exceeded, **it may be acceptable to slightly exceed the budget due to the variability of daily expenses and the possibility of finding deals on-site.** The traveler should be prepared for a small buffer in their budget.

Action 6: Finish



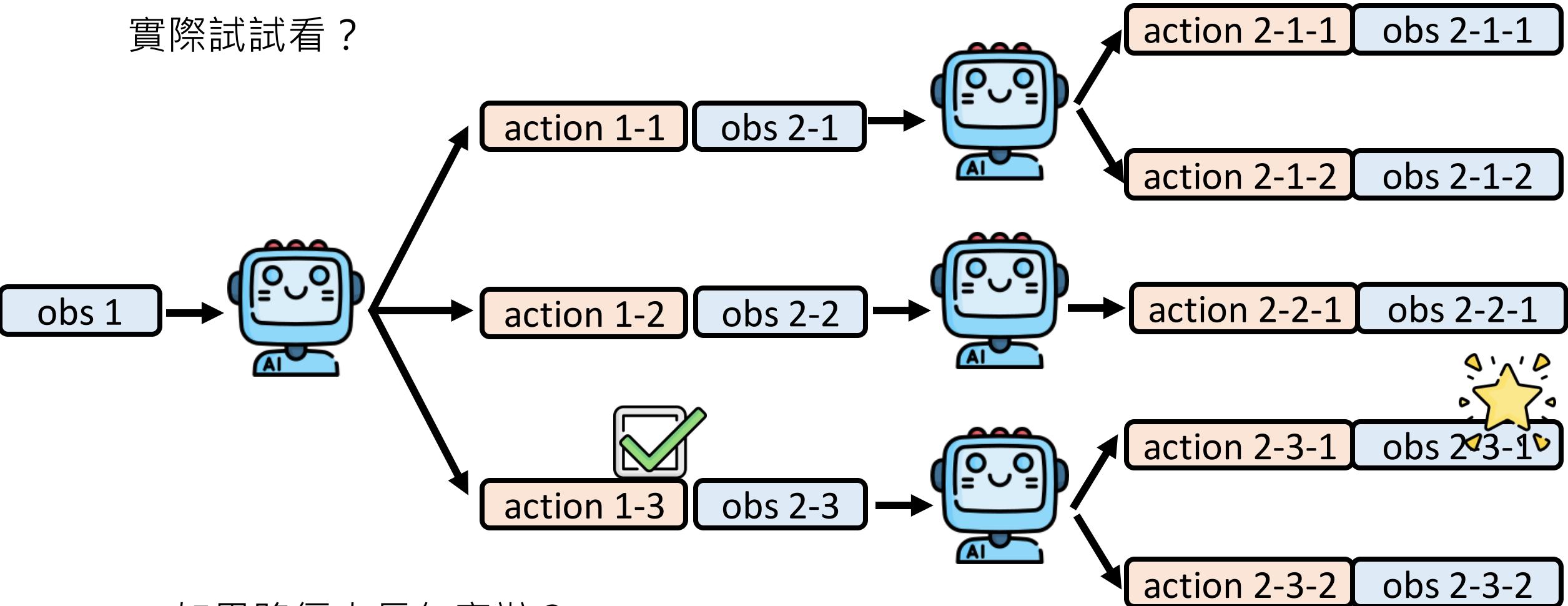
<https://arxiv.org/abs/2404.11891>

Method	Delivery Rate	Commonsense Pass Rate		Hard Constraint Pass Rate		Final Pass Rate
		Micro	Macro	Micro	Macro	
<i>Validation (#180)</i>						
Greedy Search	100	74.4	0	60.8	37.8	0
TwoStage (GPT-4)	89.4	61.1	2.8	15.2	10.6	0.6
Direct (GPT-4)	100	80.4	17.2	47.1	22.2	4.4
Direct (o1-preview)	100	79.6	15.0	41.9	37.8	10.0
Ours (Mistral-Large)	72.2	72.0	70.6	63.3	66.7	66.7
Ours (Claude-3)	96.1	96.0	95.6	94.8	93.3	93.3
Ours (GPT-4)	95.0	95.0	95.0	95.7	98.9	93.3
<i>Test (#1000)</i>						
Greedy Search	100	72.0	0	52.4	31.8	0
TwoStage (GPT-4)	93.1	63.3	2.0	10.5	5.5	0.6
Direct (GPT-4)	100	80.6	15.2	44.3	23.1	4.4
Ours (Mistral-Large)	69.9	69.8	69.4	63.0	67.8	67.8
Ours (Claude-3)	95.4	95.2	94.3	93.5	93.9	93.9
Ours (GPT-4)	91.5	91.4	91.1	91.3	90.2	90.2

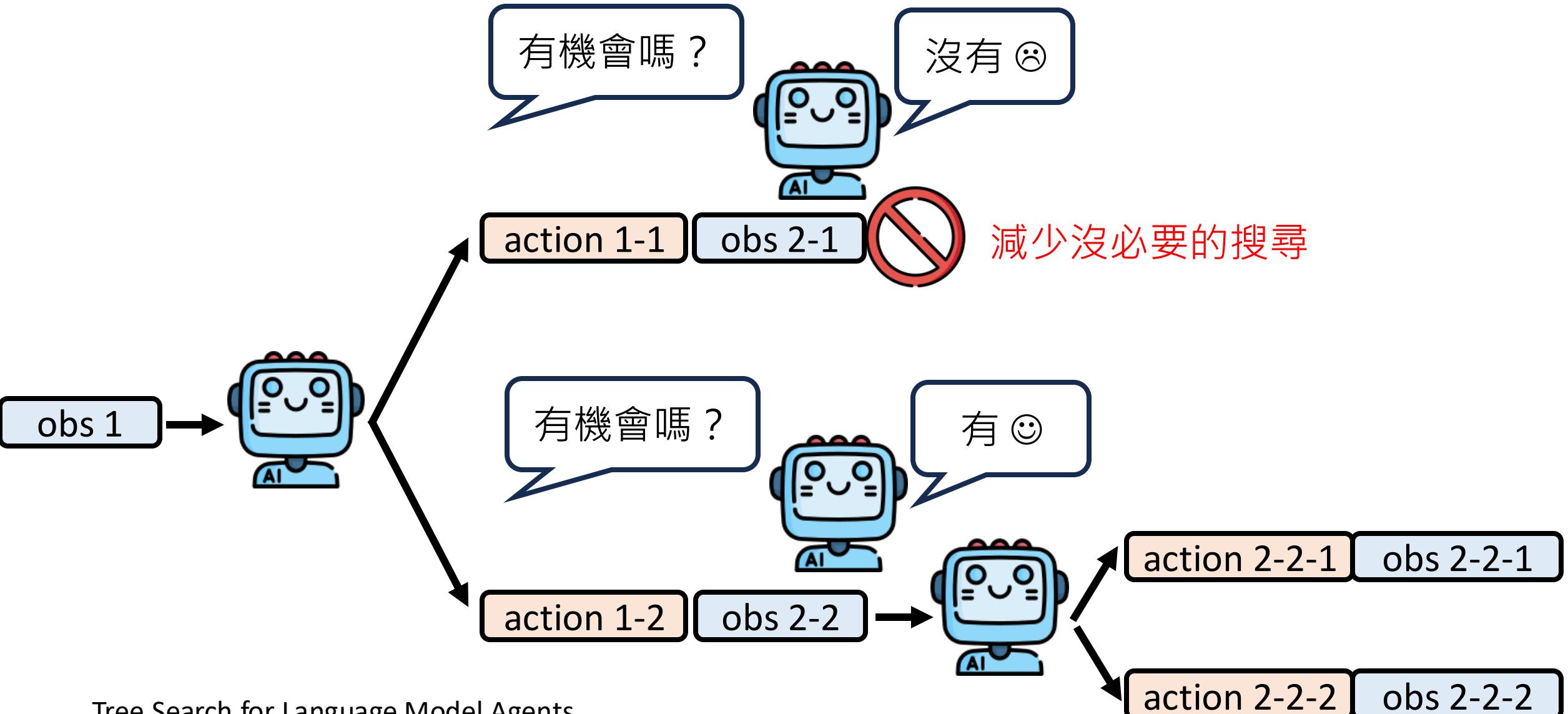
<https://arxiv.org/abs/2404.11891>

強化 AI Agent 的規劃能力

實際試試看？



如果路徑太長怎麼辦？



Tree Search for Language Model Agents

<https://arxiv.org/abs/2407.01476>



Task Instruction (I): "Can you add this and the other canned fruit (of the same brand) that looks like this, but red instead of brown to the comparison page?"

Legend

- 1 Step sequence
- v = 1.0 State values
- Backtracking

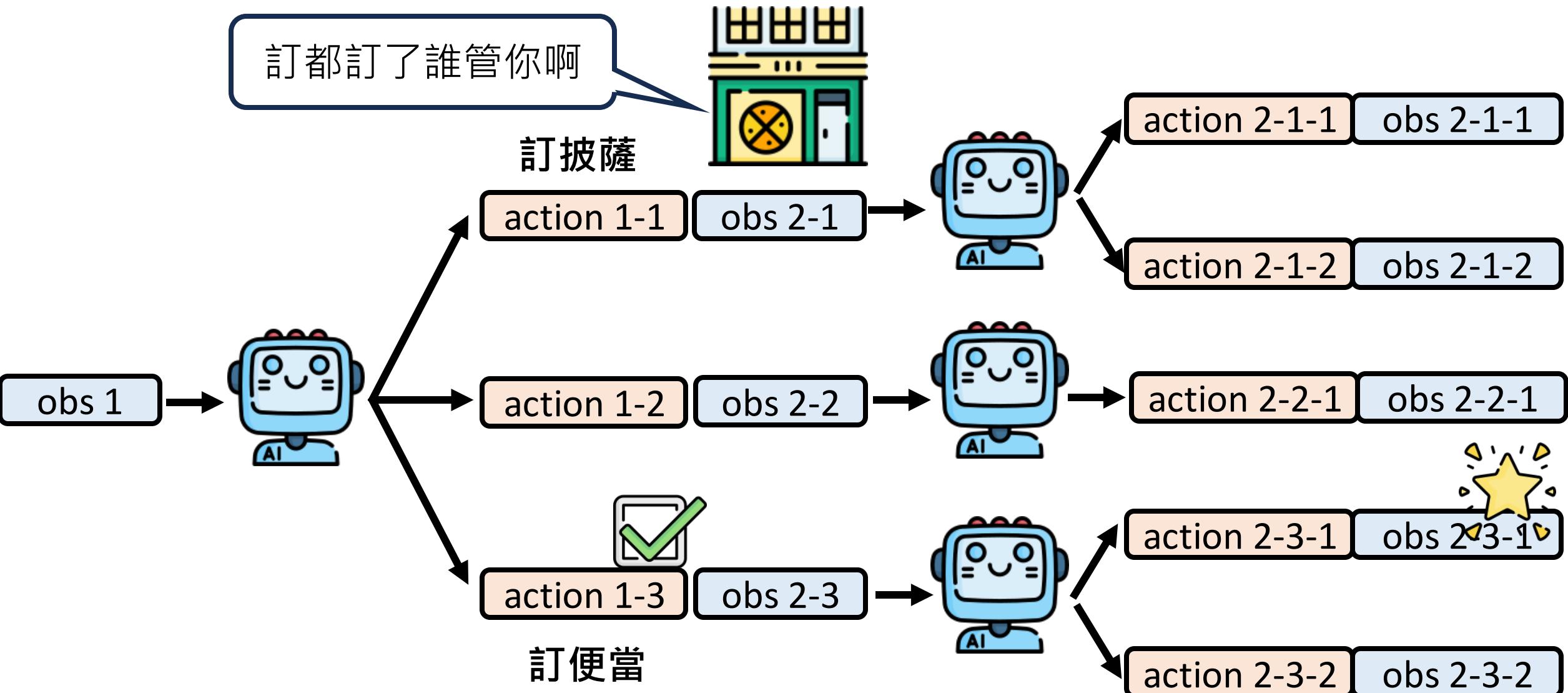
GPT-4o Agent

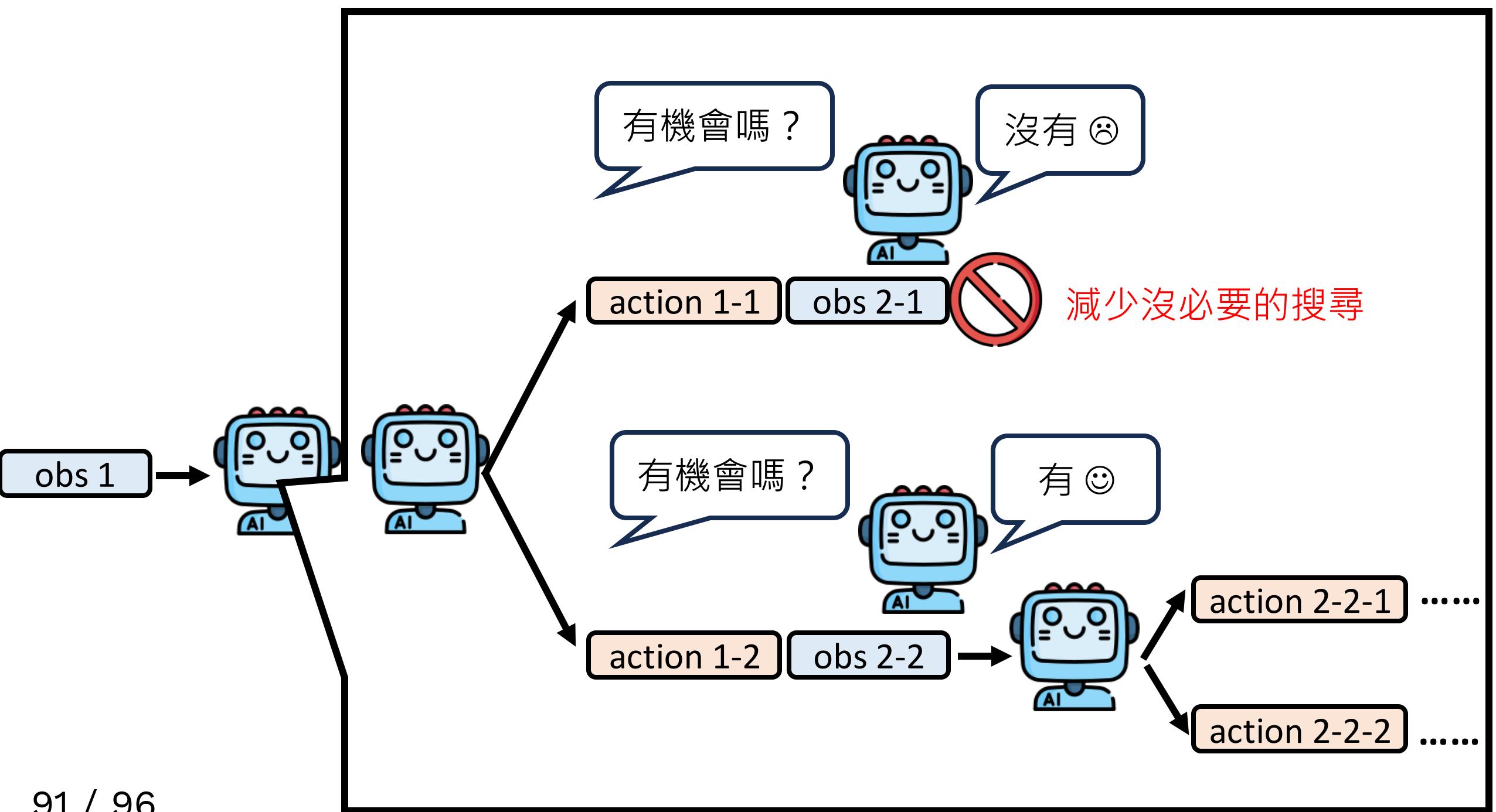


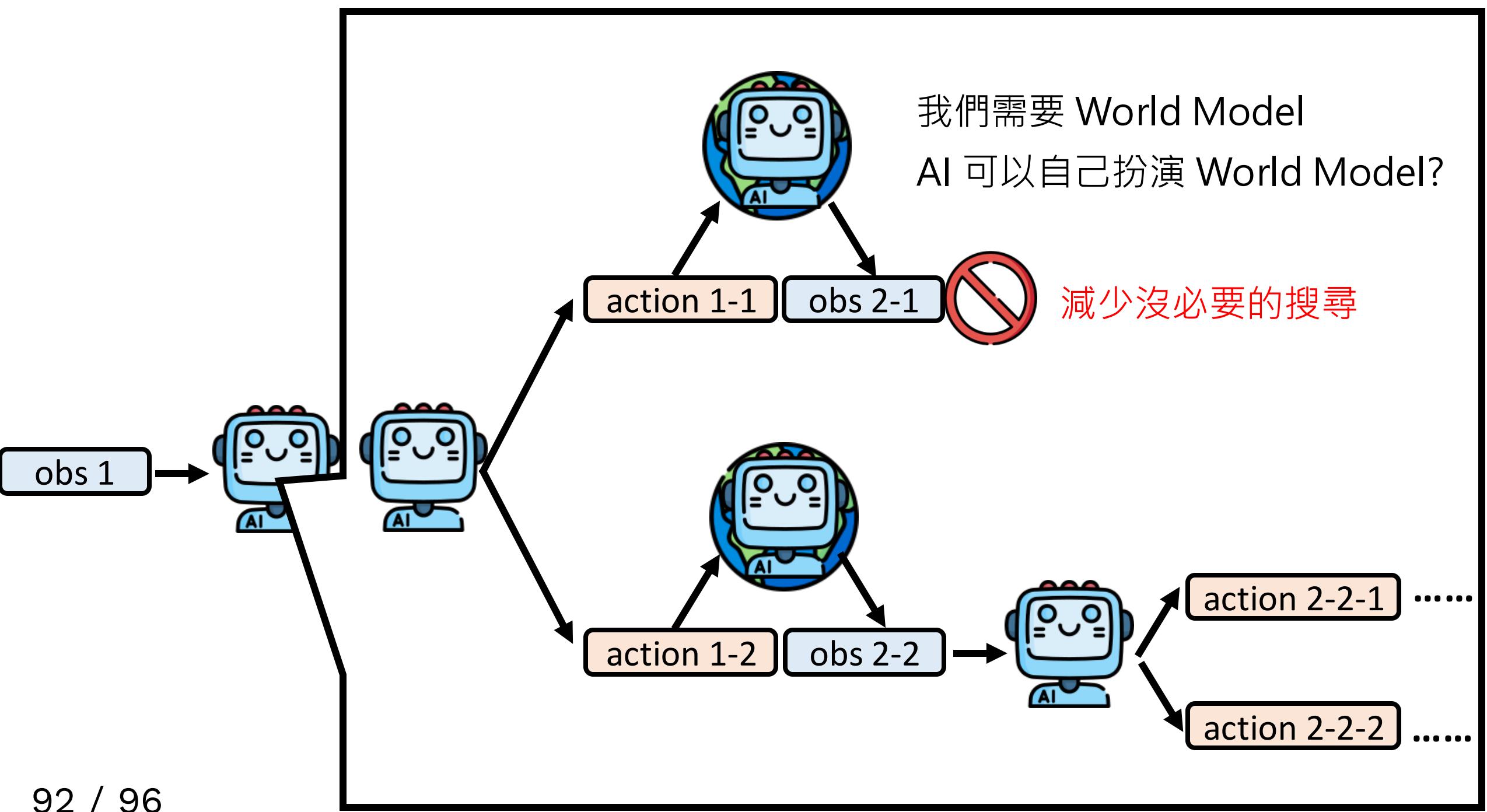
GPT-4o Agent + Search



缺點：有些動作無法回溯

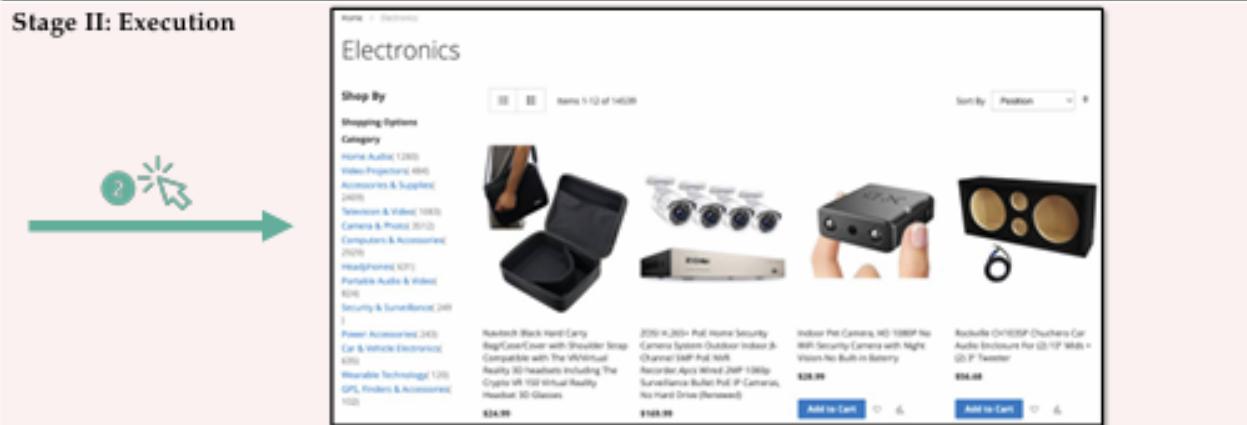
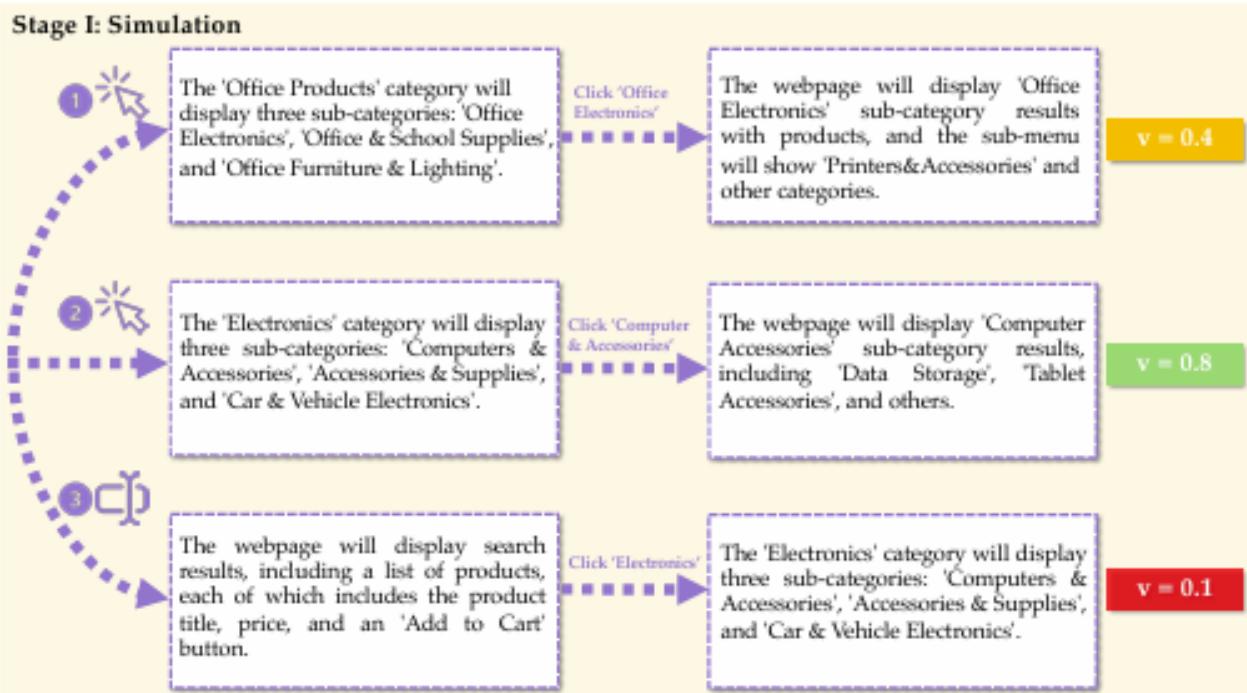
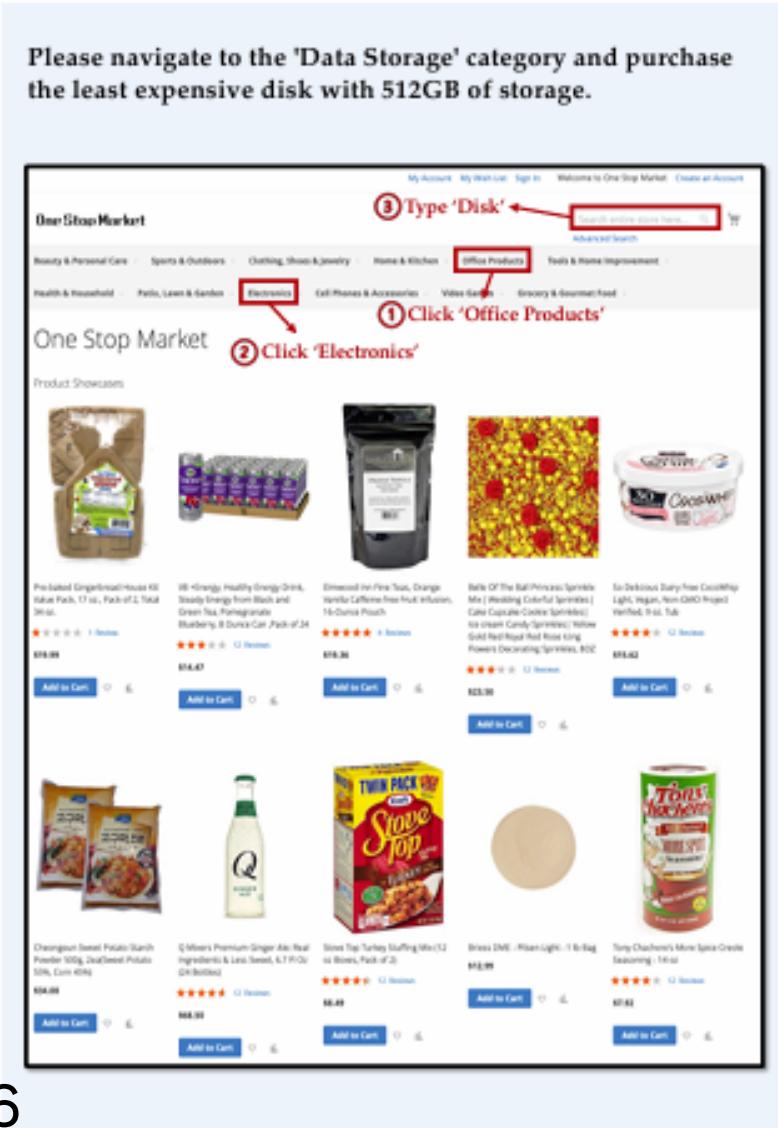






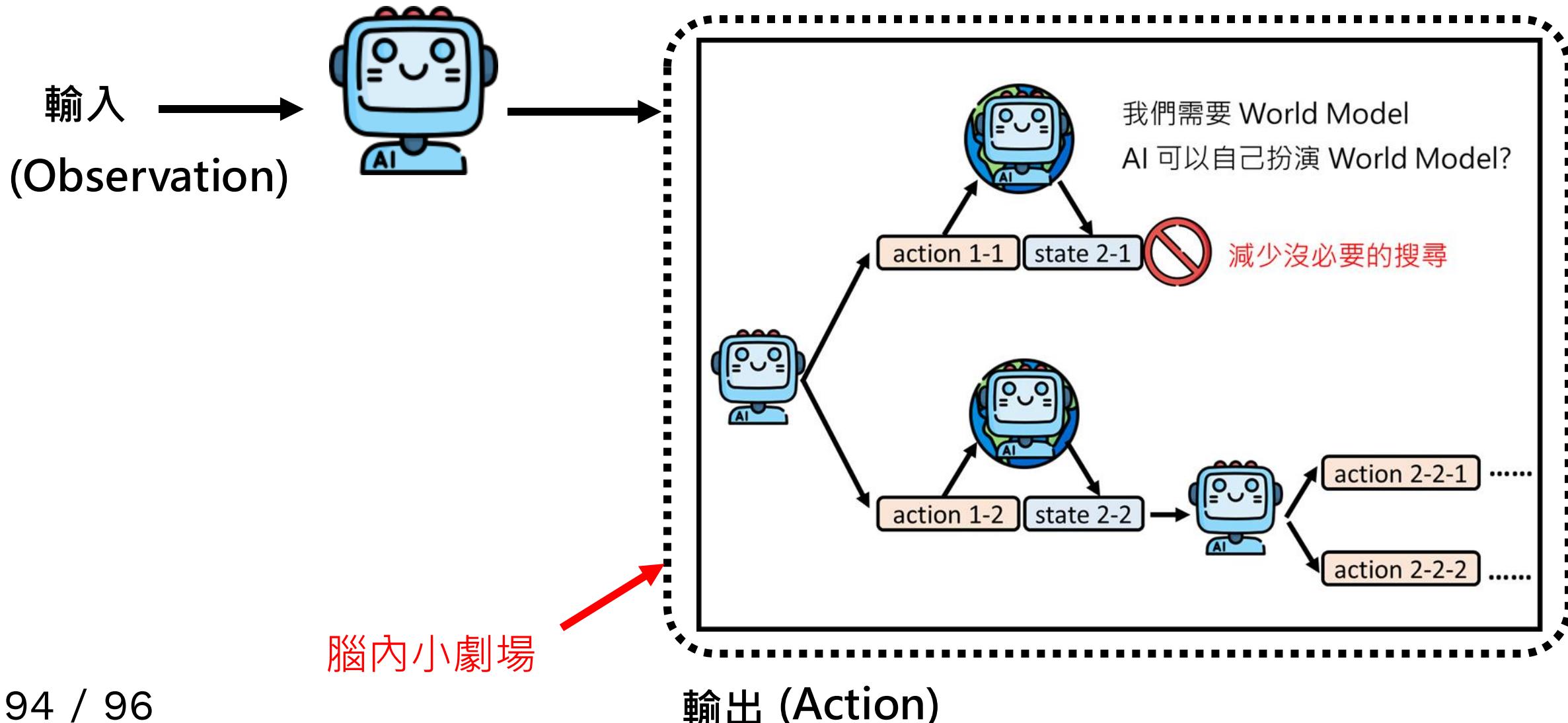
Is Your LLM Secretly a World Model of the Internet? Model-Based Planning for Web Agents

<https://arxiv.org/abs/2411.06559>



(Reasoning)

從 AI Agent 的角度來看「思考」的能力



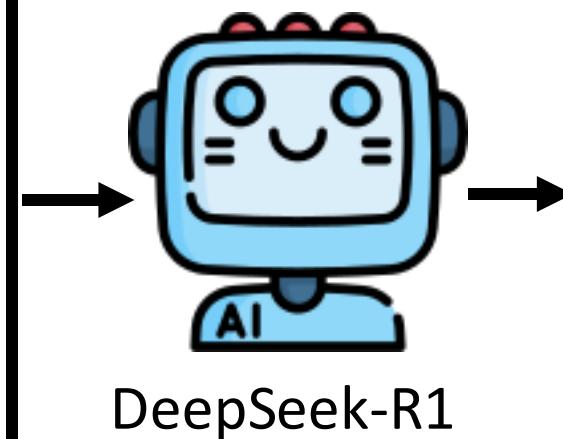
可以執行的操作：

1. 從桌上拿起一個積木
2. 從另一個積木上拿起另一個積木
3. 把積木放到桌上
4. 將一個積木堆在另一個積木上

目前狀態：藍色積木在橘色積木的上面，紅色積木在桌子上，橘色積木在桌子上，黃色積木也在桌子上。

目標：讓橘色積木放置在藍色積木上。

告訴我你的下一步



上略 1500 字

但有没有更快的步骤？例如，步骤1之后，是否可以直接做。因为操作4可能需要另一个积木在桌上，而蓝色此时不动橘色到蓝色上面。

因此，正确的步骤应该是：

1. 从橘色上拿起蓝色（操作2）
2. 将蓝色放到桌上（操作3）
3. 从桌上拿起橘色（操作1）
4. 将橘色堆到蓝色上（操作4）

这样就能完成目标。所以下一步应该是第一步，也就是操

下一步：使用操作2，從橘色積木上拿起藍色積木。

The Danger of Overthinking: Examining the Reasoning-Action Dilemma in Agentic Tasks
<https://arxiv.org/abs/2502.08235>

AI Agent 關鍵能力剖析

AI 如何根據經驗調整行為

AI 如何使用工具

AI 能不能做計劃