

基于多模态大语言模型的 GUI智能体

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科技生态圈峰会+深度研习



——1000+技术团队的共同选择







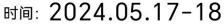


















AiDD峰会详情



▶ 演讲嘉宾



张驰 入选美国斯坦福大学发布的《2023全球前2%顶尖科学家榜单》

张驰博士, 现就职于腾讯公司担任研究科学家。将在 2024 年秋季加入西 湖大学担任博导助理教授,并创建 AGI 实验室。2021年博士毕业于新加 坡南洋理工大学计算机学院。他的博士研究课题专注于高效低成本的机器 学习和计算机视觉算法,目前的研究方向是大模型时代下的多模态模型与 AIGC模型。曾在CVPR、ICCV、NeurIPS、TPAMI等顶级国际会议期刊 上发表多篇学术论文。





- 1. 背景: 大语言模型与 Agent
- 2. 难点与挑战
- 3. 用户界面与人机交互
- 4. 基于 GUI 的智能体 AppAgent

Large language models as agent

Prompt:

Imagine that you are a home robot, and is asked to go to the kitchen to fetch something from the fridge. The image below shows your current position. Please plan your next action.



GPT-4V:

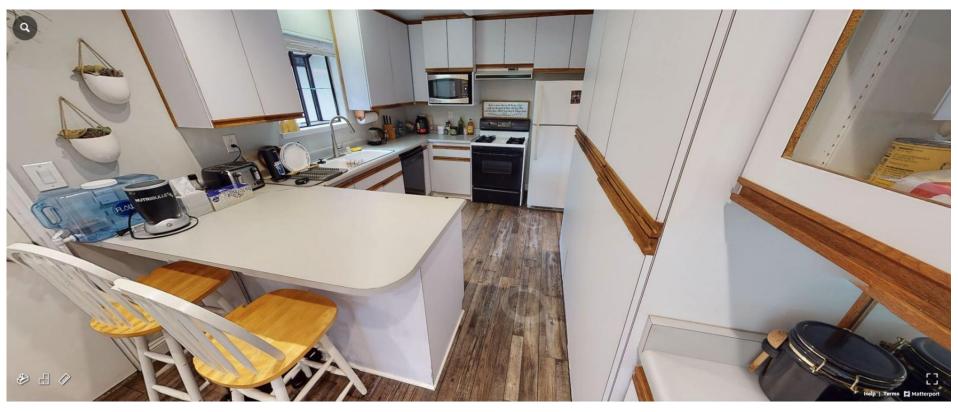
My next action would **be turn right and move forward towards the hallway**, as I can see that the kitchen is likely located in that direction. I would then continue to navigate through the hallway until I reach the kitchen and locate the fridge.



Large language models as agent

Prompt:

Now you are at the kitchen, this is what you can see from there. Can you see the fridge from here? What is your next action?



GPT-4V:

From this position, I can see the fridge on the right side of the kitchen. My next action would be to move forward and turn slightly to the right to approach the fridge

Large language models as agent

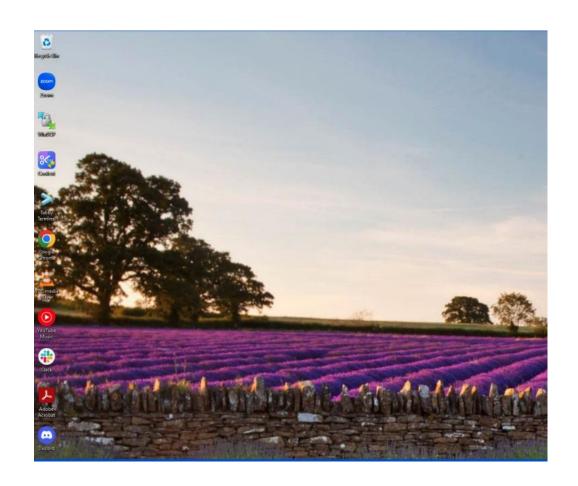
Prompt:

Imagine that you are a robot operating a computer... You are asked to find a detailed recipe of Mapo Tofu.

Below is what you see on the computer screen, predict your next move...

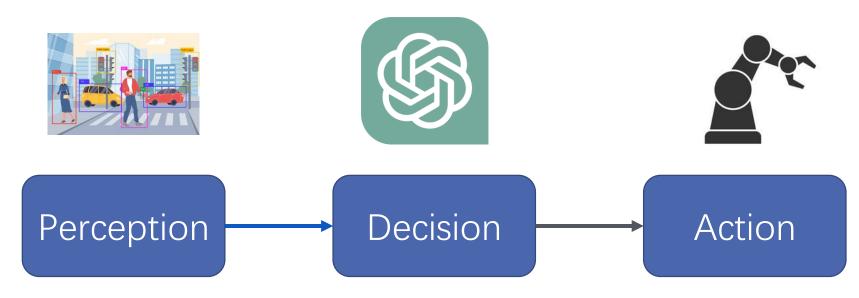
GPT-4V:

Next move: I would move the mouse to the Google Chrome icon located on the left side of the screen, approximately 1/3 of the way down from the top. I would then click on the icon to open the web browser.





A Simple Agent Prototype



Challenges

- Limitation of text-only input in current agent design
- Control alone is a big discipline
- Insufficient knowledge in LLM & high learning cost



Significance of Interface













Agent on Interface

Advantages

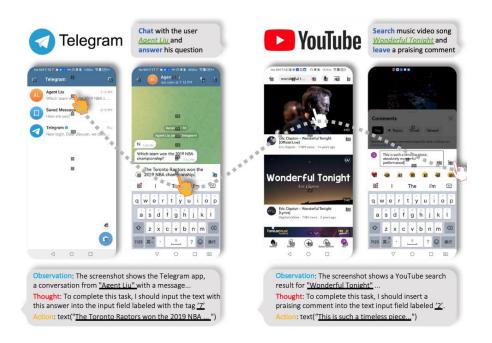
- Actions have clear semantic meaning, providing a user-friendly interaction method
- Large language model focus on decision making
- Relatively easy perception of environment and state





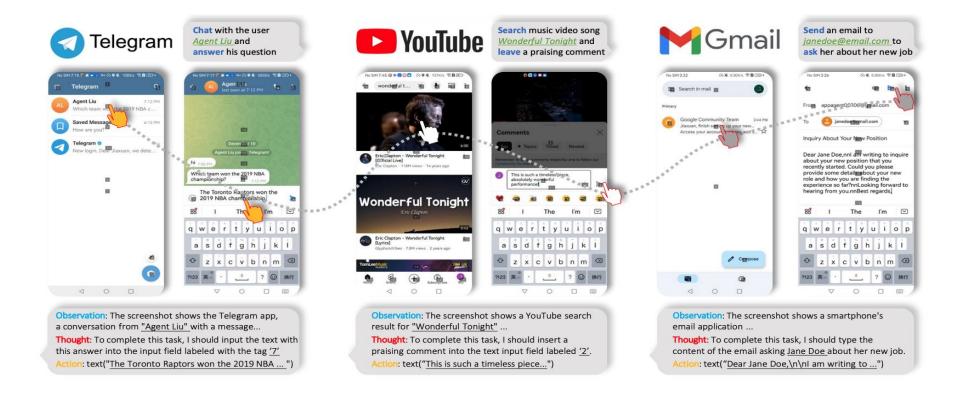
Goal

- Develop UI-based agent frameworks with strong generalization capabilities
 - Develop an multimodal LLM that can accept multimodal inputs
 - Developing an embodied agent that can interact with interfaces, such as mobile phones



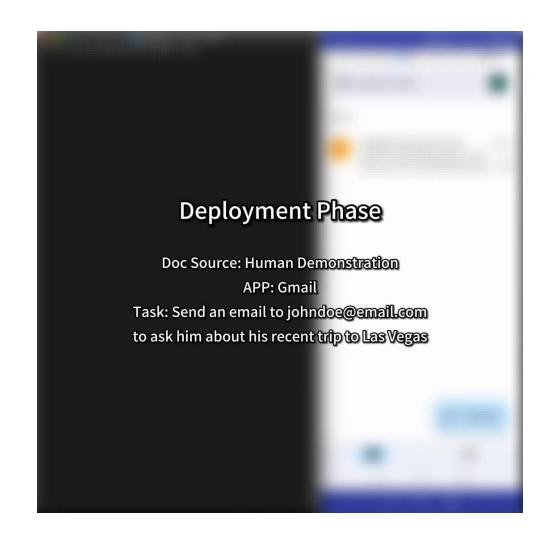




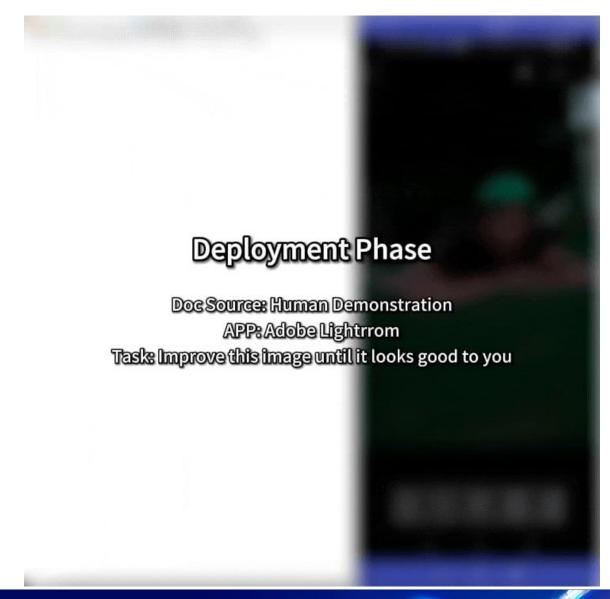


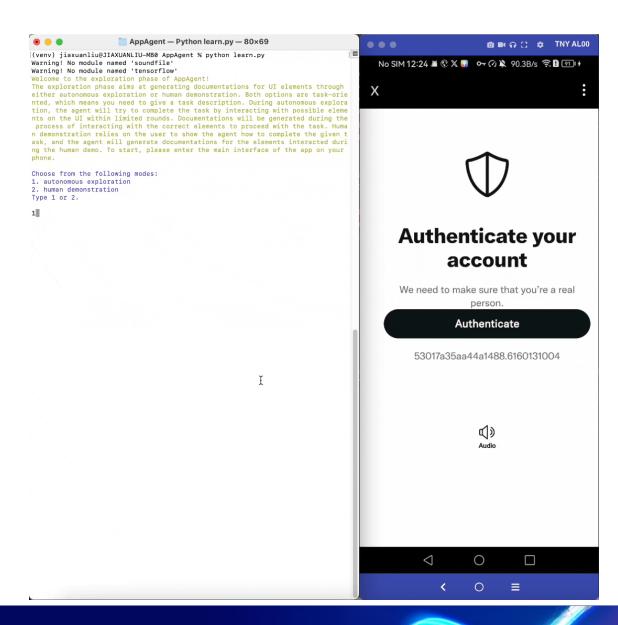
AppAgent: Multimodal Agents as Smartphone Users





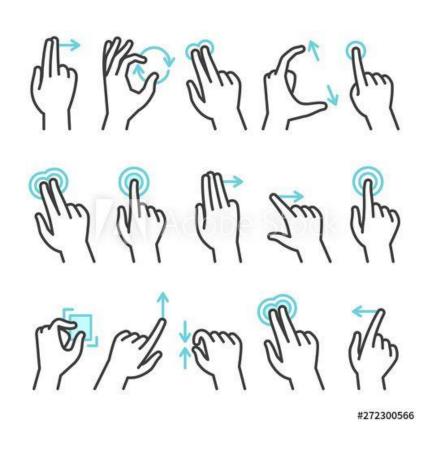


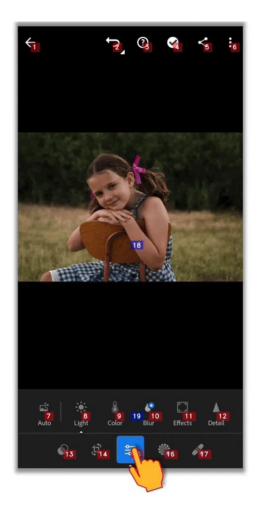






Challenge 1: How to output control?

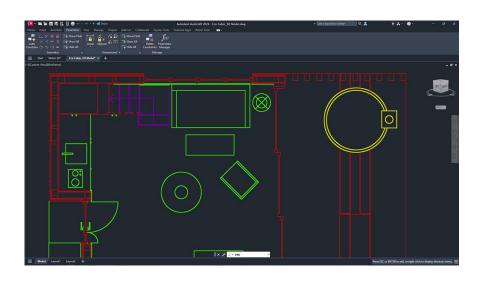






Challenge 2: How to learn?

- Complex software
- Easy software

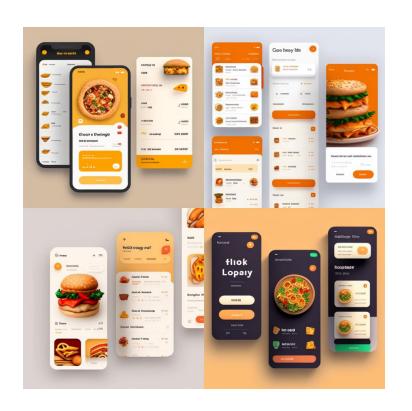


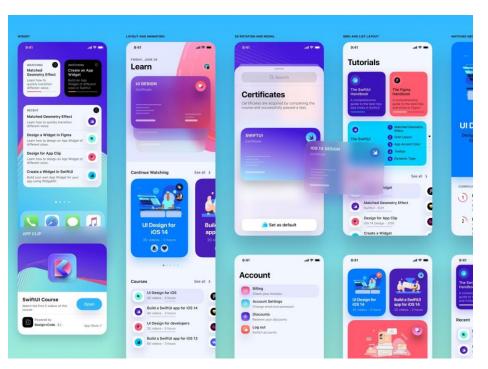
VS





Challenge 3: How to generalize?



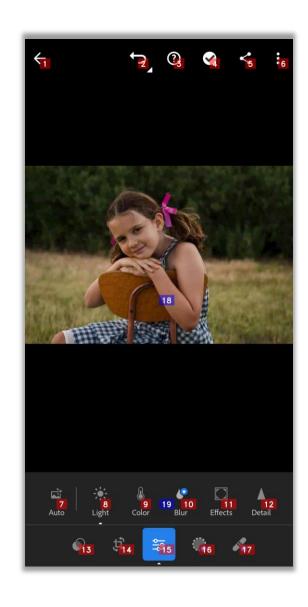






Action Space

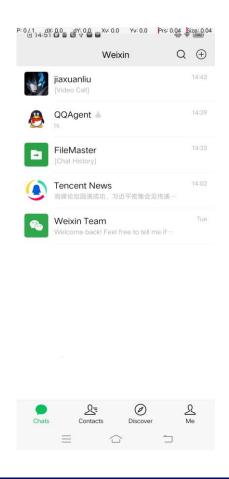
- Tap(element : int)
- Long_press(element : int)
- Swipe (element : int, direction : str, dist : str)
- Text(text : str)
- Back()
- Exit()





Human-Like system design

Supervised finetuning of LLM —— Are you sure?



"Briefly describe the functions of the four buttons in the bottom bar of this screenshot."

"Can you provide the bounding box coordinates for the Profile Phot o button on the screen?"

Human-Like system design

How do we human learn?

- Quick Learning process
 - **➤** Self-exploration
 - **➤** Watching demos
- Good generalization capability



Human-Like system design

Overall Idea: Exploration->Deployment

- Explore how to use an App (self-exploration or watching demos)
- Generate a document after exploration, used as an external database
- Refer to the Doc for better decision making

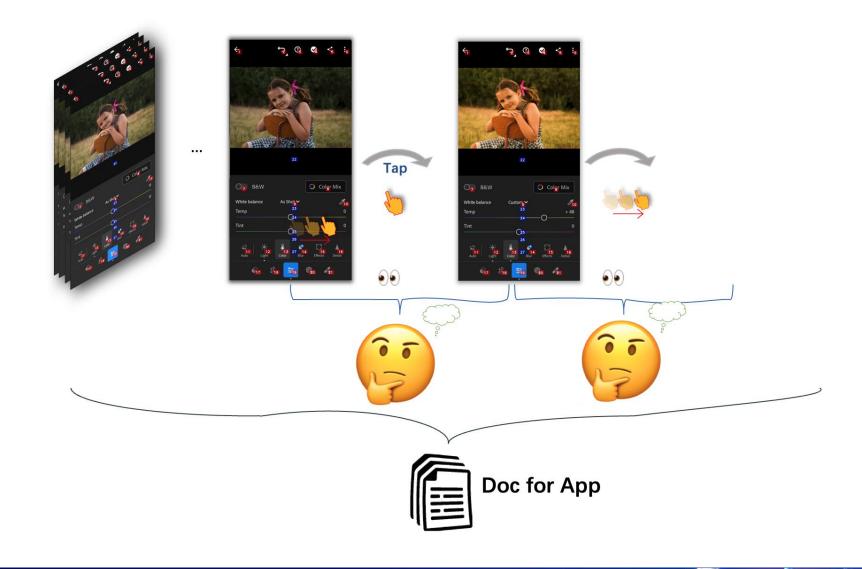


Exploration Phase





Exploration Phase



Deployment Phase

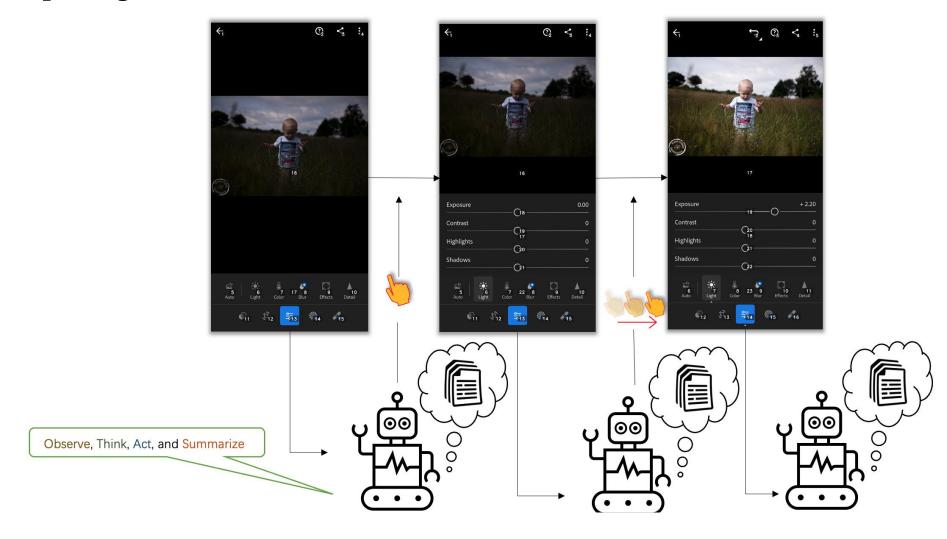
Task:

"beautify this photo for me…"





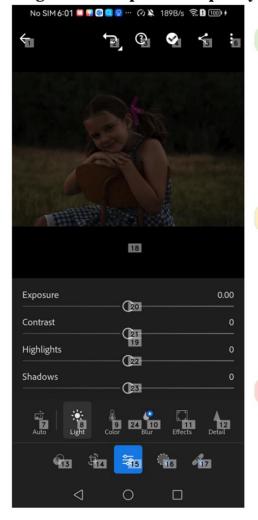
Deployment Phase





Deployment Phase

Lightroom: improve the quality of this image until it looks good to you



Observation

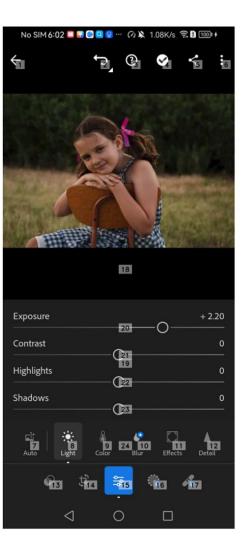
The screenshot shows a photo editing application interface with various adjustment settings for exposure, contrast, highlights, and shadows. These adjustments have numeric tags 20, 21, 22, and 23 respectively. The settings are currently at their default values, and the image appears underexposed, needing improvement in lighting.

Thought

To improve the image quality and correct the underexposure, I need to increase the exposure. The slider for the exposure setting is labeled with numeric tag 20, which I can interact with to adjust the exposure level. I will swipe right on this slider to increase the exposure.

Action

swipe(20, "right", "medium")





Experiment

Method	Document	Action Space	SR↑	Reward ↑	Avg. Steps	
GPT4 (Baseline)	None	Raw	2.2%	0.6	4.0	
OF 14 (Daseille)	None	Ours	48.9%	3.5	6.9	
	Auto. Exploration	Ours	73.3%	5.1	4.4	
AppAgent	Watching Demos	Ours	84.4%	4.7	5.1	
	Manually Crafted	Ours	95.6%	5.5	5.5	

Significance and Impact

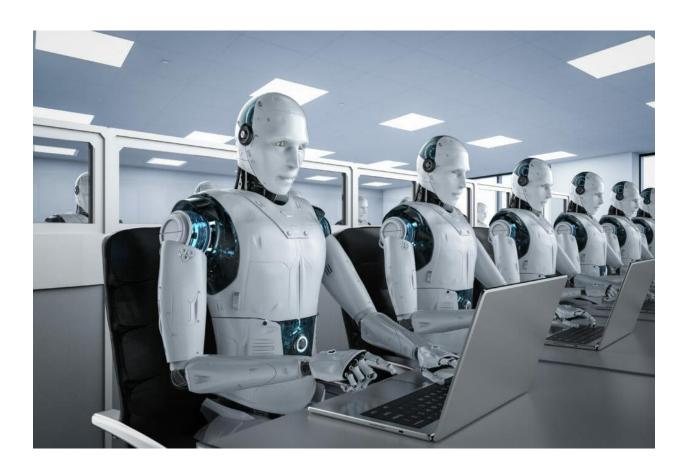
Revolutionizing Human-Computer Interaction





Significance and Impact

Digital employee and super assistants







Significance and Impact

Software testing and user study



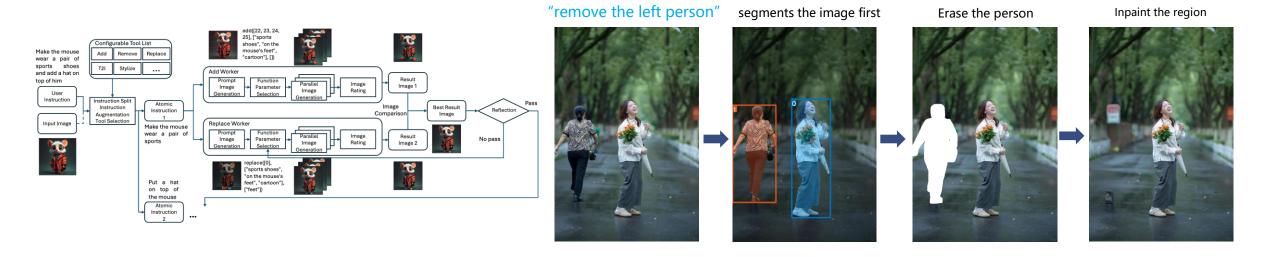




More Research on Agents

Application

The AppAgent framework and ideas have been validated in the company's key prouducts such
as image editing and 3D room layout generation, and will continue to be explored and
developed in the future.

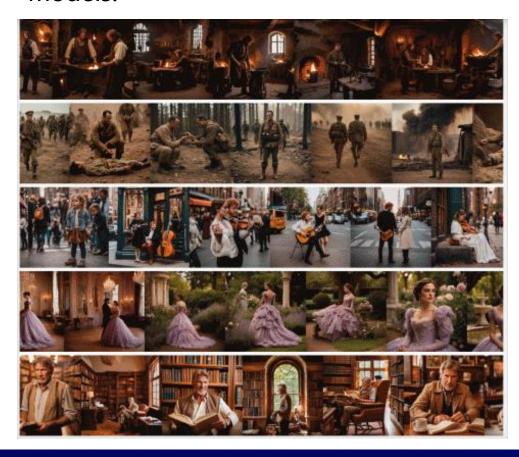


arXiv preprint arXiv:2312.13771 (202

More Research on Agents

Application

We also design agent, MovieLLM, to create movies for training long-video understanding models.







Frame 395





Line: I must let Thomas know, he must know how I feel.

I wonder what

these old pages



Line: Could this... could this be for me?

Line: Words penned with such passion... Could it be Thomas?



How did he know of my feelings for him?

Frame 392

Frame 388

Question: Why is Rosamund so surprised and emotional after reading the letter?

Answer: Because she believes that the love letter reflects the same feelings she has for Thomas.

Frame 394



More Research on Agents

AppAgent的应用

• AppAgent框架与思路在公司的图像编辑,3D小屋等重点业务能上得到验证,未来会被继续探索与发展

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381	382	383	384	385	386	387	388	389	390	391	392	393	394	395	396	397	398	399	400



LLM for Agents

本地模型能力适配

- 多图,长context,理解能力
- OCR能力 (多语言)
- Visual pointing的能力 (通过网格,数字指代图像元素)
- 调用函数、工具的能力
- In-context能力 (格式跟随)
- App/UI的先验增强
- 特殊图像内容判断能力 (P图)
- 提高 LLM 预测速度



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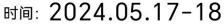


















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