

# **Building Human-like AI Agents**

*Solving challenges around Computer Interaction,  
Long-Term Memory, and Agent-Agent Communication*

**Div Garg (MultiOn AI)**

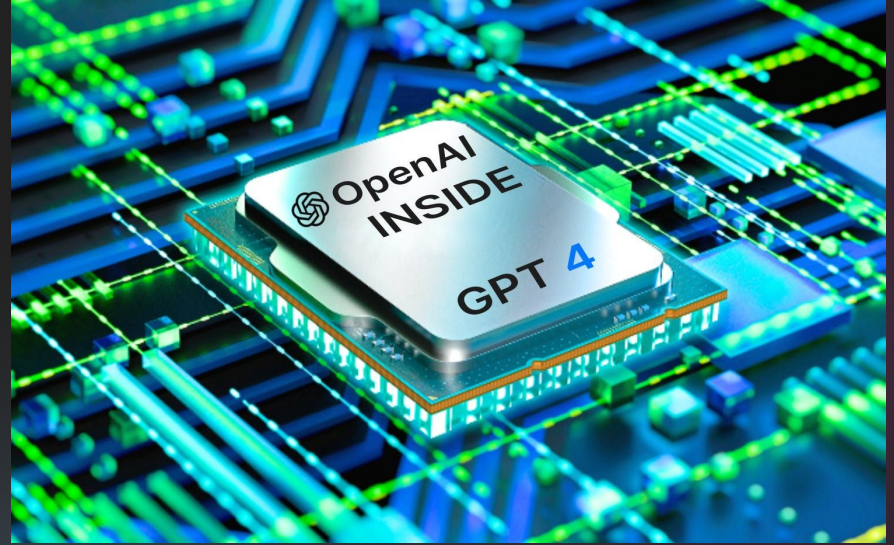
# Introduction

- Actions and Emergent Agent Architectures
- Building Human-like AI Agents
- Computer Interactions using AI
- Long-Term Memory and Personalization
- Agent to Agent communication
- Future Directions for Autonomous AI Agents



# Building AI Agents

1. Why?
2. How?
3. Ingredients?
4. What can they do?



**Key thesis:** Humans will communicate with AI using natural language and AI will operate machines allowing for more intuitive and efficient operations

Software 3.0



# AI Agents

## 1. Why?

A single call to a large Foundation AI model is not enough. A lot more can be unlocked by building ***AI systems***

## 2. How?

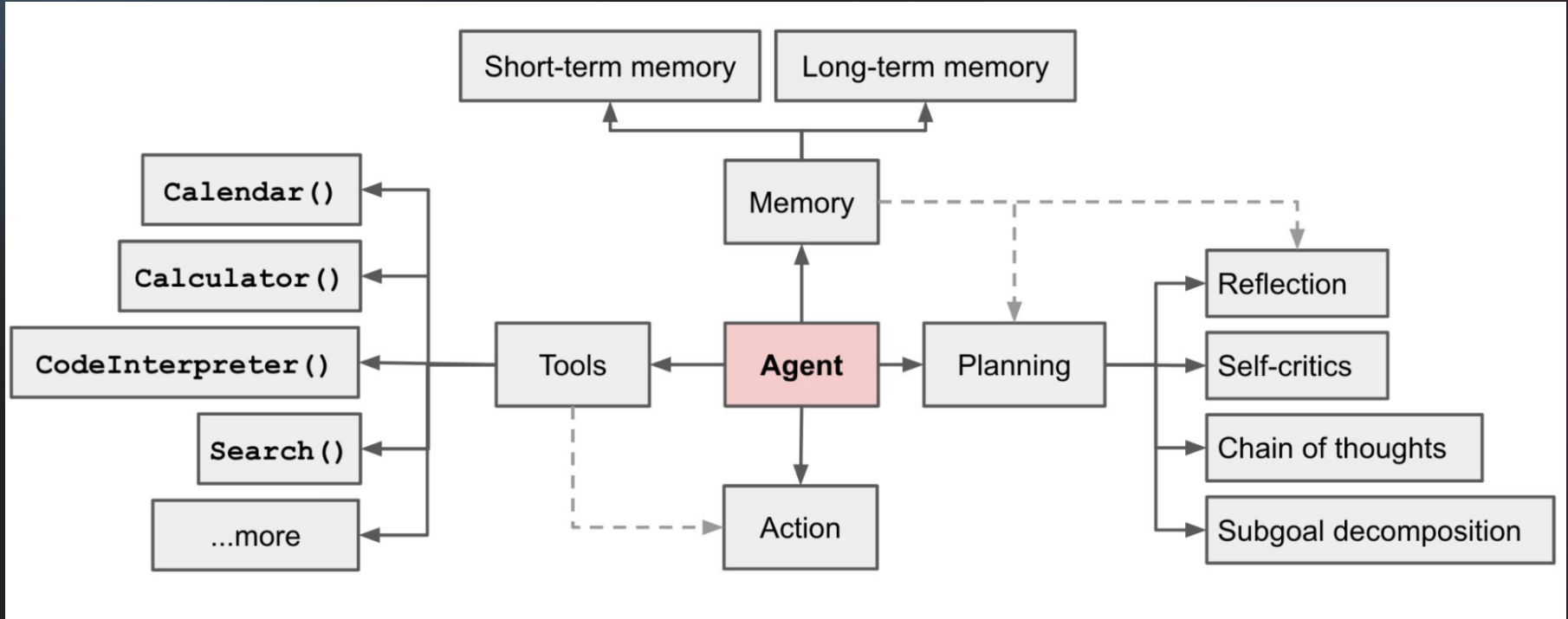
Using model chaining, reflection & other mechanisms

## 3. Ingredients?

Memory, context length, personalization, actions, internet access...

## 4. What can they do?

# AI Agents



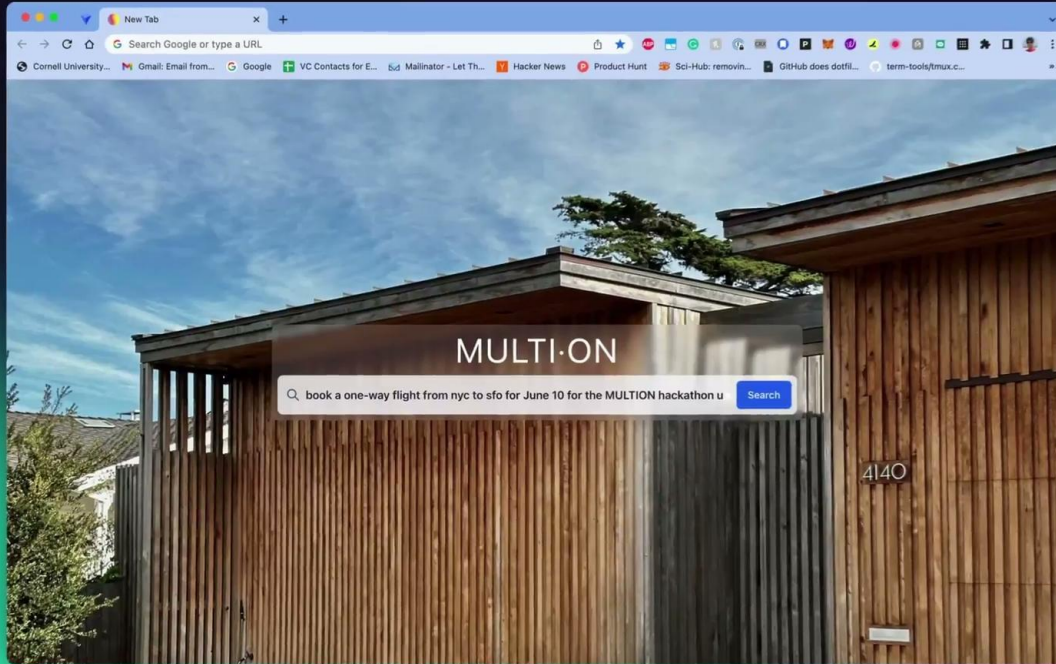


# MULTI-ON

- **M**ultiple **U**tility **A**I **L**anguage **T**ool for **I**nternet **O**perations and **N**avigation (MULTION)
- Agent with full R/W access to the internet

**Name Origin:** from Quantum Physics (neutron, muon, fermion, ...)

# The first flight to be fully booked by an AI





# MULTI·ON – Mobile Platform
























**Can be present on any device & provide seamless interaction to the AI using a natural human interface to efficiently get your tasks done for you!**



# Why human-like AI Agents?

1. **Can do what you can do:** Able to use existing interfaces designed for humans & operate outside programmatic boundaries
2. **Digital extension of you:** Can act as an extension of the user and act on their behalf
3. **Less-restrictive boundaries:** Can handle logins, payments, etc. and interact with services without any API restrictions
4. **Simple action space:** Need only click & type action primitives
5. **Self-learning:** Can learn from the user and self-improve with more interactions

# 5 levels of Autonomy

For on-road vehicles		 Human driver	 Automated system		
		Steering and acceleration/ deceleration	Monitoring of driving environment	Fallback when automation fails	Automated system is in control
Human driver monitors the road	0 NO AUTOMATION				N/A
	1 DRIVER ASSISTANCE				SOME DRIVING MODES
	2 PARTIAL AUTOMATION				SOME DRIVING MODES
Automated driving system monitors the road	3 CONDITIONAL AUTOMATION				SOME DRIVING MODES
	4 HIGH AUTOMATION				SOME DRIVING MODES
	5 FULL AUTOMATION				

# Computer Interactions

# Agent Computer Interaction

## Two routes

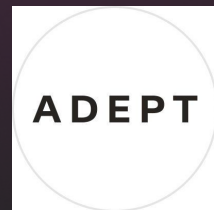


**API**  
**(programmatic)**

easy to build context  
safer & controllable  
high variability

**Direct interaction**  
**(browser or desktop control)**

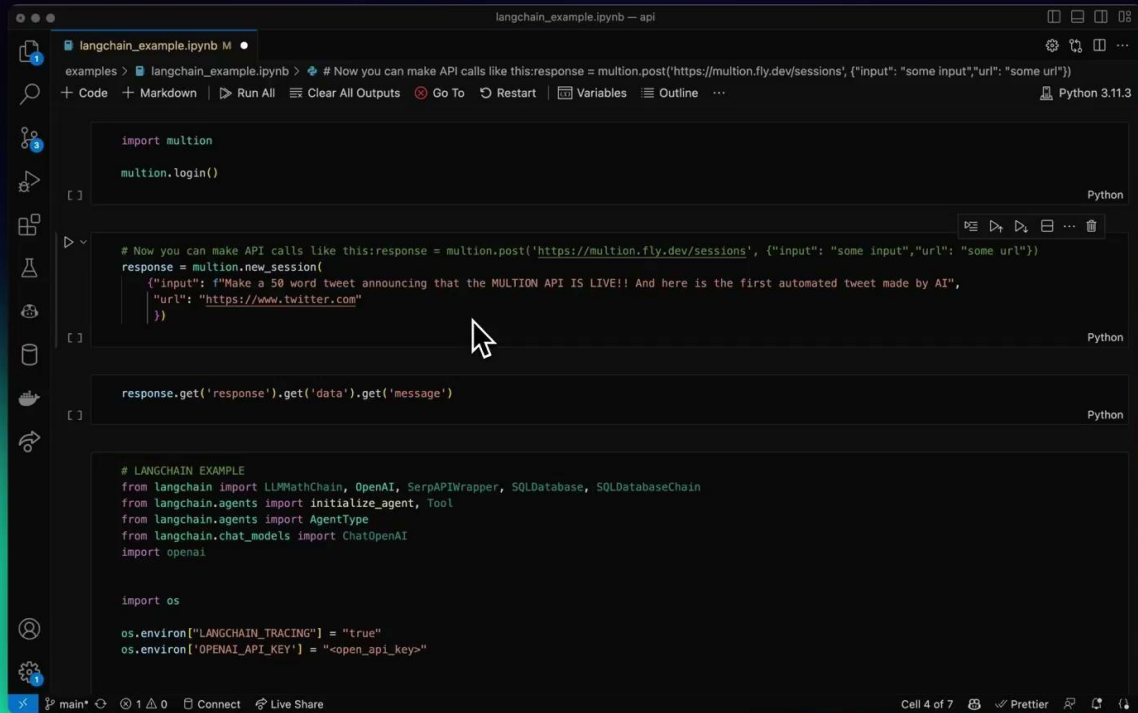
easy to take actions  
free-form interactions  
need to provide guarantees



OpenAI  
ChatGPT Plugins



# MultiOn Action API: An API for computer interaction



```
langchain_example.ipynb — api
examples > langchain_example.ipynb > # Now you can make API calls like this: response = multion.post('https://multion.fly.dev/sessions', {"input": "some input", "url": "some url"})
+ Code + Markdown | ▶ Run All | Clear All Outputs | Go To | Restart | Variables | Outline ... Python 3.11.3

import multion
multion.login()

# Now you can make API calls like this: response = multion.post('https://multion.fly.dev/sessions', {"input": "some input", "url": "some url"})
response = multion.new_session(
    {"input": f"Make a 50 word tweet announcing that the MULTION API IS LIVE!! And here is the first automated tweet made by AI",
     "url": "https://www.twitter.com"}
)

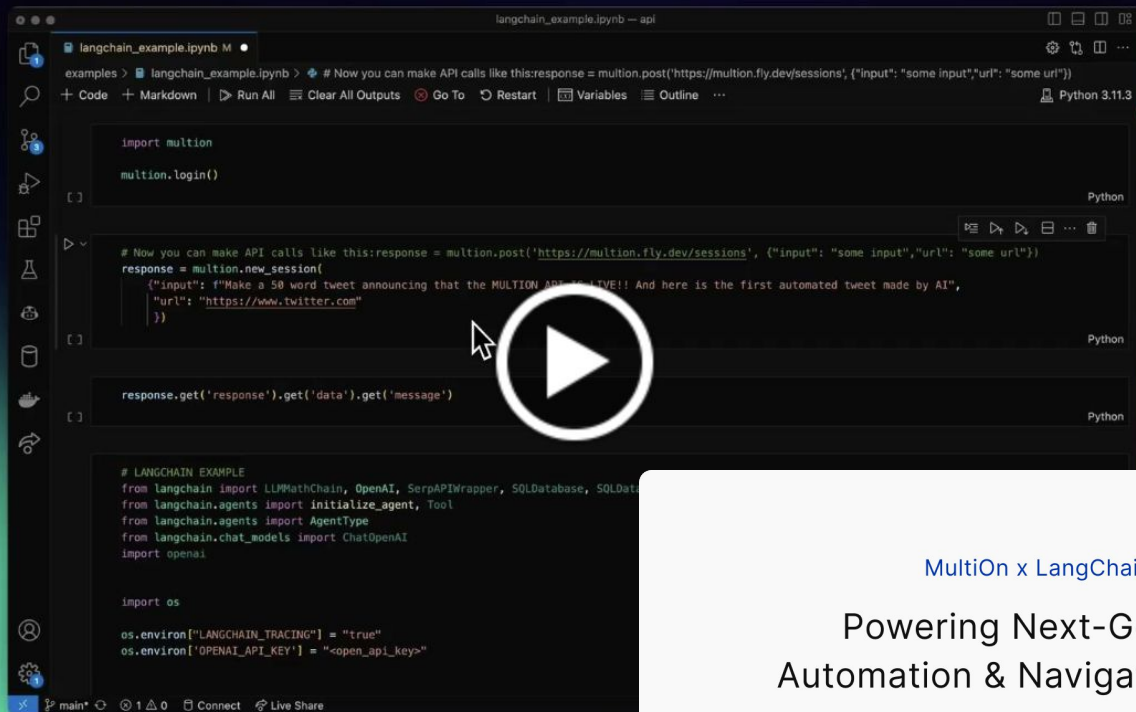
response.get('response').get('data').get('message')

# LANGCHAIN EXAMPLE
from langchain import LLMChain, OpenAI, SerpAPIWrapper, SQLDatabase, SQLDatabaseChain
from langchain.agents import initialize_agent, Tool
from langchain.agents import AgentType
from langchain.chat_models import ChatOpenAI
import openai

import os

os.environ["LANGCHAIN_TRACING"] = "true"
os.environ['OPENAI_API_KEY'] = "<open_api_key>"
```

# MultiOn Action API: An API for computer interaction



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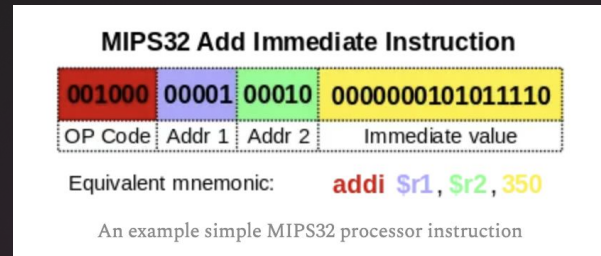
MultiOn x LangChain

Powering Next-Gen Web  
Automation & Navigation with AI

# Memory & Personalization

# AI Models as Neural Compute Unit

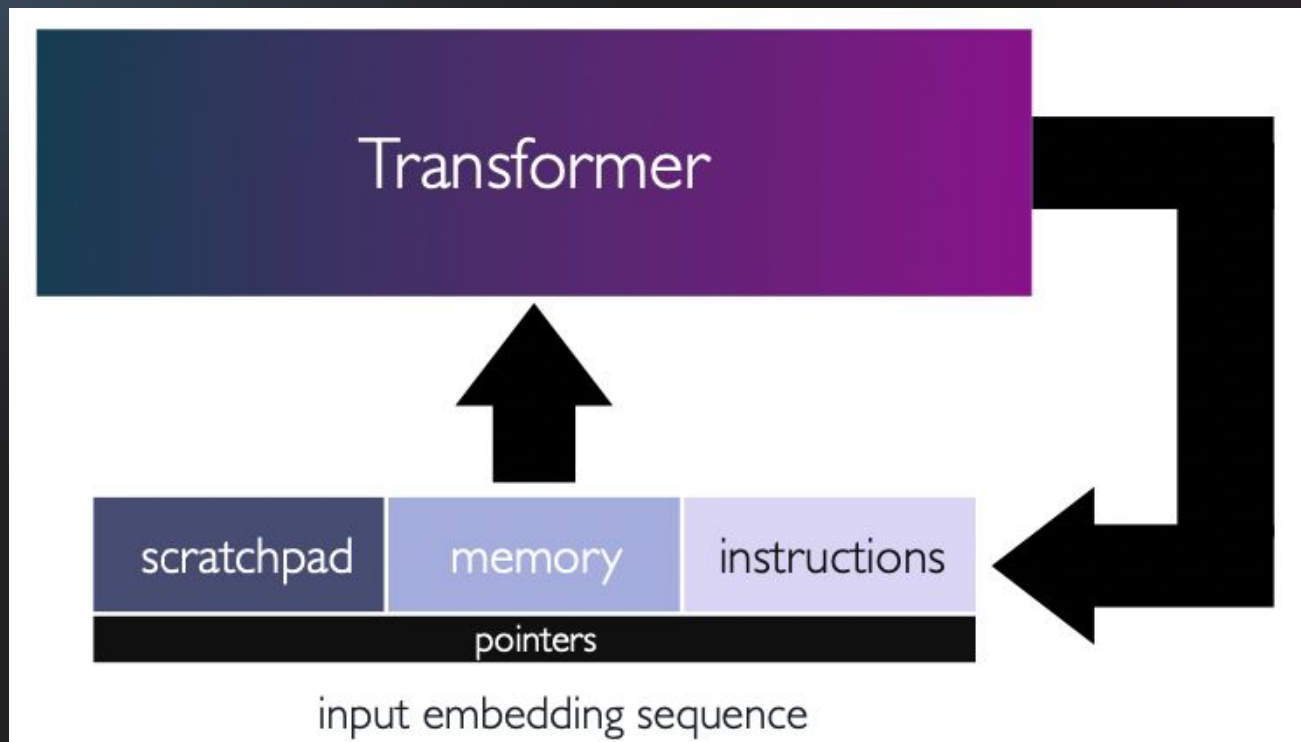
Input Tokens  
(max token size)



Output Tokens  
(max token size)



# AI Models as Neural Compute Unit



**Looped Transformers**

# Long-term Memory

- **Works similar to disk (long-lived & persistent)**
- **Mechanisms**
  - Embeddings
  - Retrieval models
- **Open Questions:**
  - Hierarchy
  - Temporal Coherence
  - Structure
  - Online adaptation



# Personalization

- **Agent-user Alignment:** Enable agent to take actions that are aligned with the user preferences
- Everyone has different prefs & likes/dislikes:
  - **Explicit:** allergies, favourite dishes, flight seat prefs, ...
  - **Implicit:** choice between brands, out of 10 items in a listing which user likes better

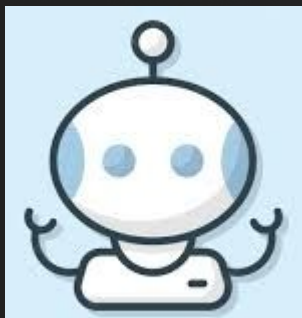
# Challenges

- **Collecting user data & preferences:**
  - actively asking for preferences
  - passive learning from interactions
- **Learning from user preferences:** supervised fine-tuning vs human-feedback
- **On-fly adaptation**
- **Privacy**



# Agent-to-Agent Communication

# Multi Agent Autonomous AI systems



# Why Multi-agent Systems

1. **Parallelization unlock:** Breaking a task into smaller chunks and dividing between agents to improve efficiency & speeds
2. **Task Specialization:** An AI agent might sit between the user and each service: e.g. a spreadsheet AI agent, a slack AI agent, a web-browser AI agent, ...
3. **Challenges:**
  - a. **Agent to Agent Communication:** one AI might want to exchange or request info from another AI agent finish a task

# Agent to Agent Communication

- Exchanging info between fleets of agents
- Hierarchies
- Syncing primitives





# Agent to Agent Communication

- **Robust communication protocols & Syncing primitives:** Natural language is ambiguous, need mechanisms to reduce miscommunication!

# Agent to Agent Communication

- Robust communication protocols & Syncing primitives

Manager state

Task X:  
(status: **not done**)



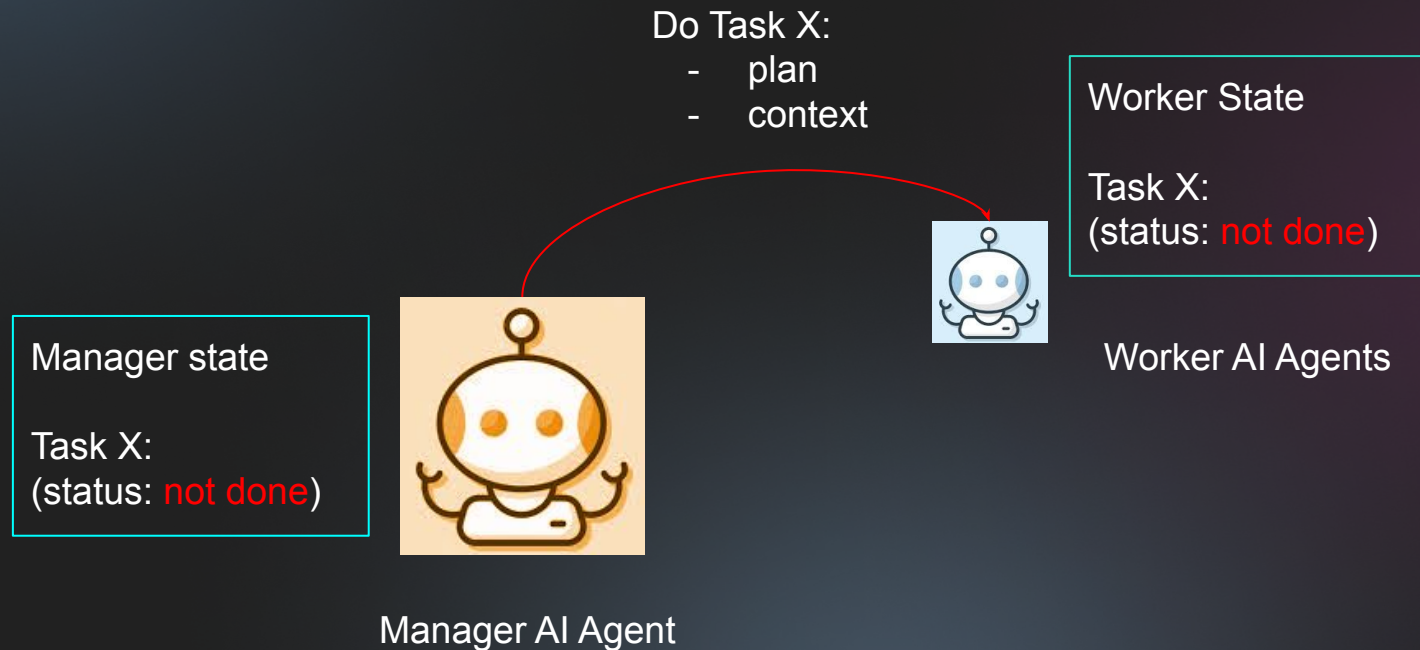
Manager AI Agent



Worker AI Agents

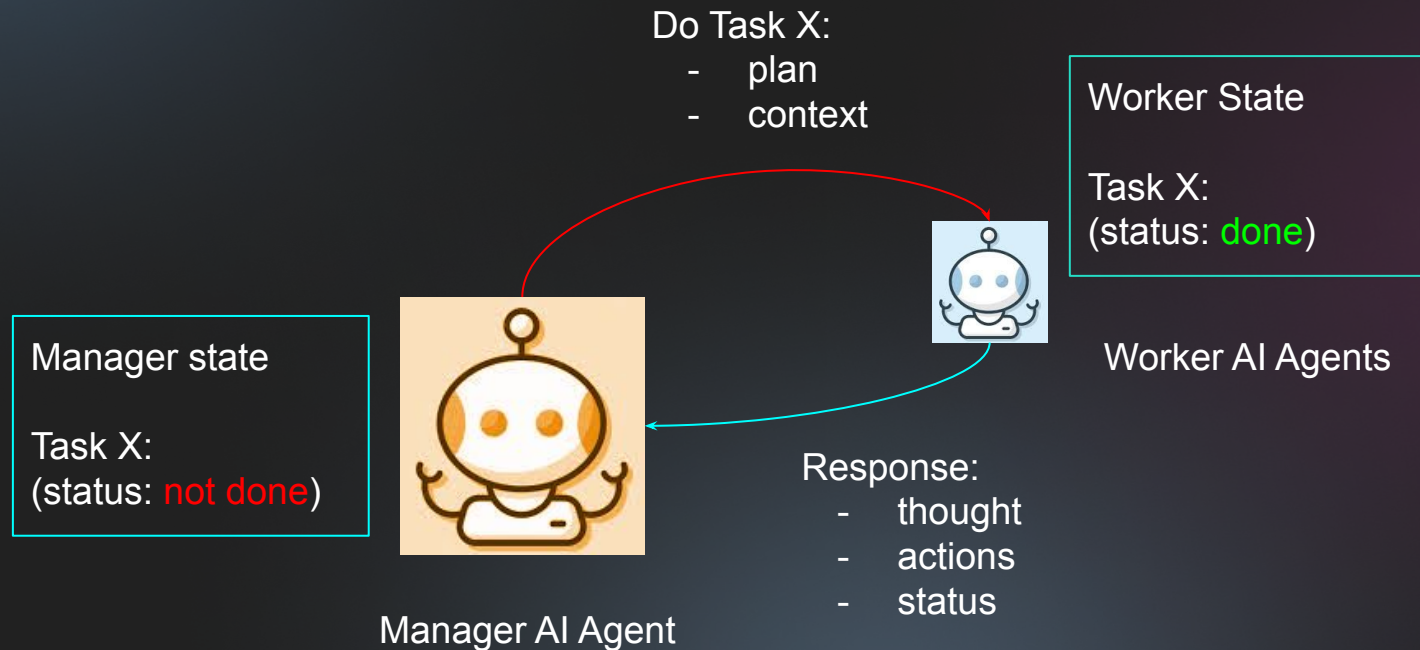
# Agent to Agent Communication

- Robust communication protocols & Syncing primitives



# Agent to Agent Communication

- Robust communication protocols & Syncing primitives





# Agent to Agent Communication

- Robust communication protocols & Syncing primitives

Verify if task was correctly done & follows all specifications

Verify Task X:  
- required spec

Worker State

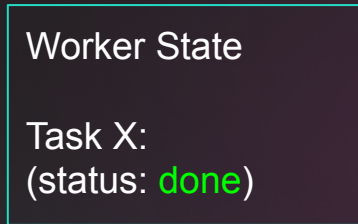
Task X:  
(status: **done**)

Manager state

Task X:  
(status: **verify done**)



Manager AI Agent



# Agent to Agent Communication

- Robust communication protocols & Syncing primitives

Scenario 1:

Task was correctly done &  
follows all specifications

Manager state  
  
Task X:  
(status: **verify done**)



Manager AI Agent

Verify Task X:  
- required spec



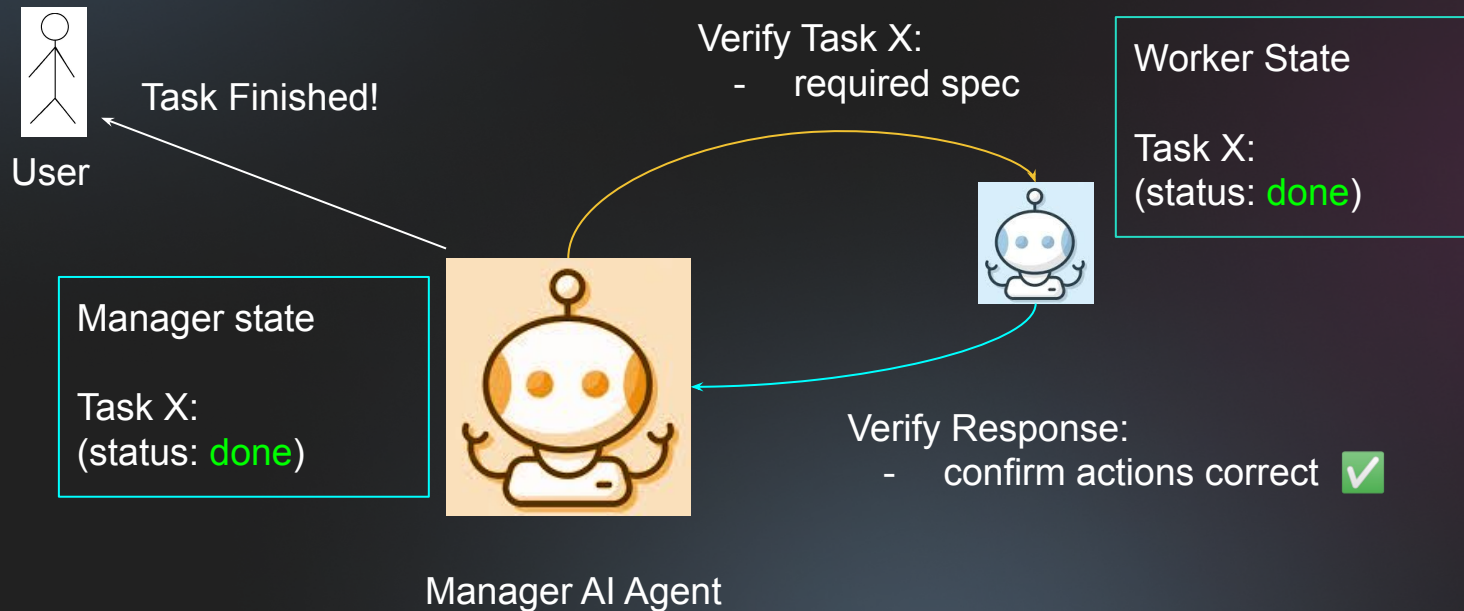
Worker State

Task X:  
(status: **done**)

Verify Response:  
- confirm actions correct ✓

# Agent to Agent Communication

- Robust communication protocols & Syncing primitives



# Agent to Agent Communication

- Robust communication protocols & Syncing primitives

Scenario 2:

Task was incorrectly done  
(Agent Miscommunication)

Manager state  
  
Task X:  
(status: **verify done**)



Manager AI Agent

Verify Task X:  
- required spec



Worker State

Task X:  
(status: **done**)

Verify Response:  
- actions were not correct ❌



# Agent to Agent Communication

- Robust communication protocols & Syncing primitives

Scenario 2:  
Task was incorrectly done  
(Agent Miscommunication)

Re-do Task X:

- plan
- context
- feedback/corrections

Worker State

Task X:  
(status: **not done**)

Manager state

Task X:  
(status: **not done**)



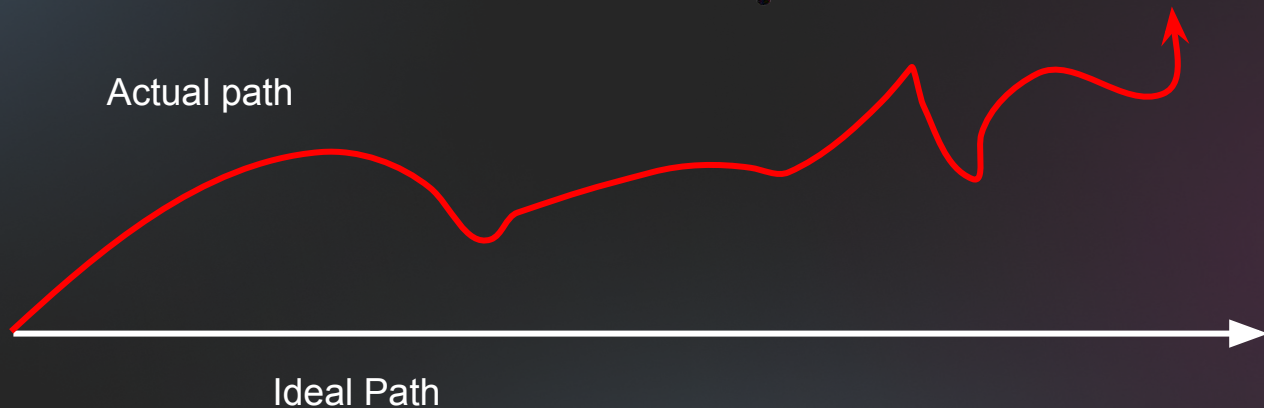
Manager AI Agent

# Future Directions

# Key Issues with Autonomous Agents

1. Reliability
2. Looping & Plan Divergence
3. Testing & Benchmarking
4. Real world-deployment & Observability
  - a. How do we trust a fully autonomous AI system
  - b. How do we build in human overrides

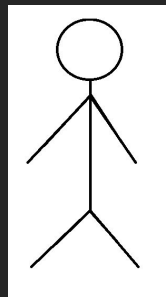
# Plan Divergence



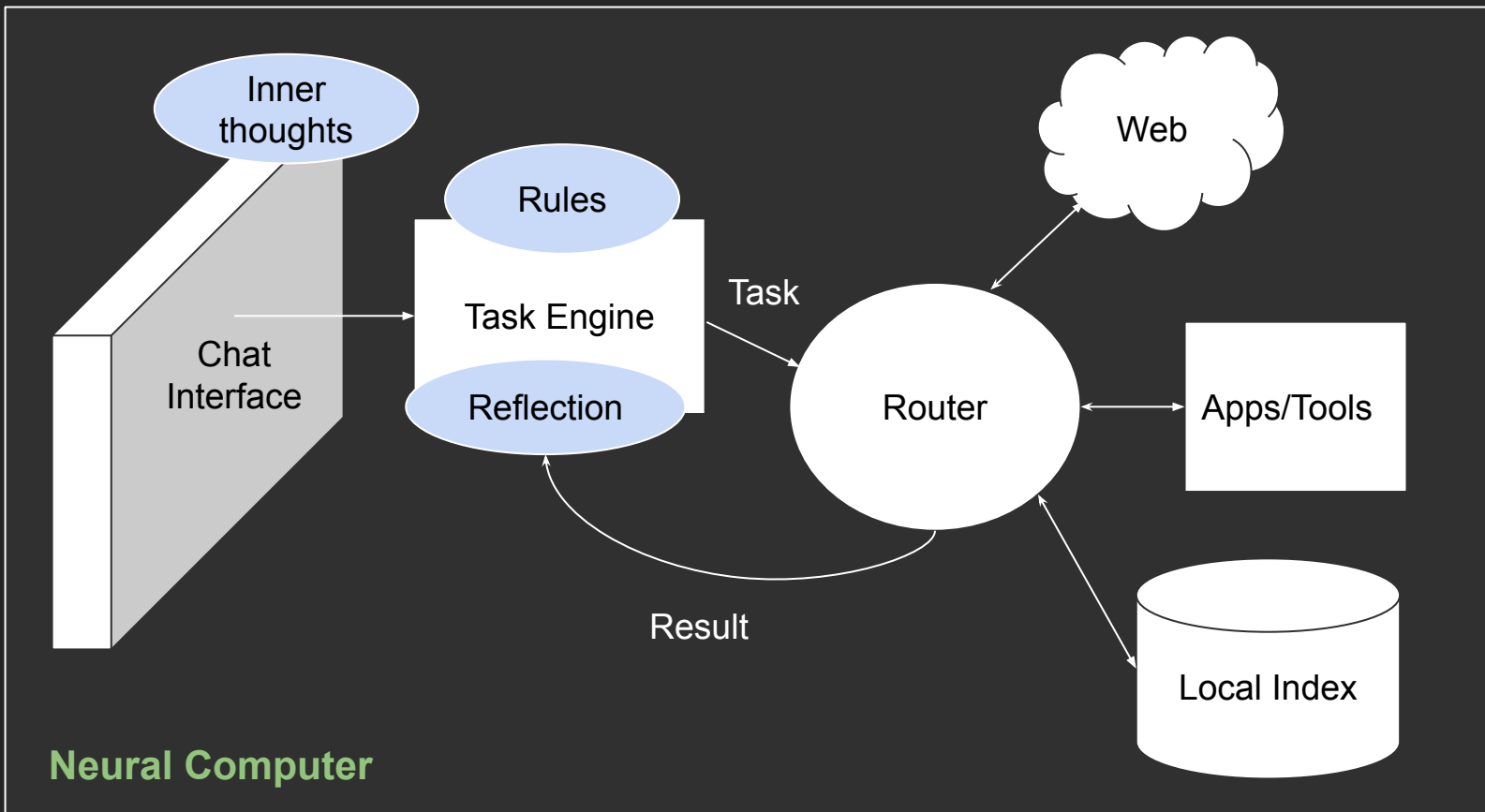
**AI Agents like AutoGPT don't know how to correct on making a mistake!**



# Building Generalized AI Systems



User



# Future needs for AI agents

- Error correction mechanisms & better agent frameworks
- Security & user permission models
- Sandboxing & deployment in risky settings

**Thank you!**