

TRAINING 4 HRS

AI AGENTS



Dr. Jon Krohn

Co-founder and CEO
Y Carrot 

ML Practice Fellow
Lightning AI 

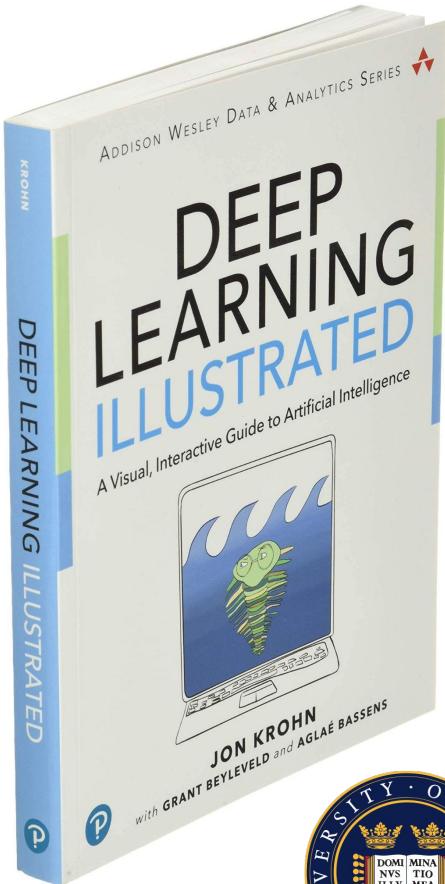


Edward Donner

Co-founder and CTO
Nebula.io

Agentic AI in Action: Build Autonomous, Multi-Agent Systems Hands-On in Python

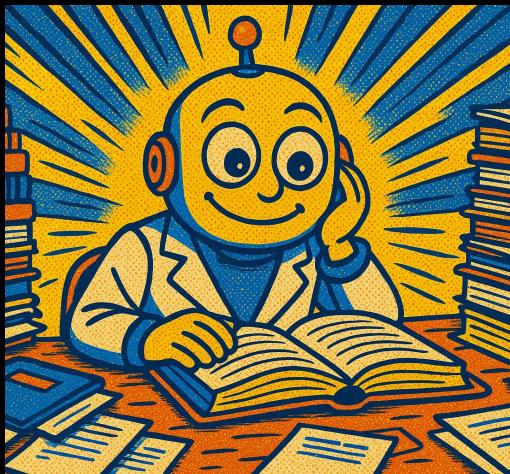




O'REILLY



Module 1:
Defining Agents



Module 1 Coding:
Deep Research
with OpenAI Agents SDK



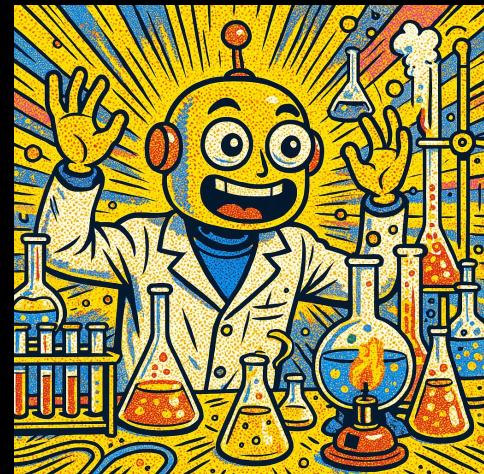
Module 2:
Designing Agents



Module 2 Coding:
Engineering Team
with CrewAI



Module 3:
Developing Agents



Module 3 Coding:
Autonomous Traders
with MCP



Module 1: **Defining** Agents

Module 1 Coding:
Deep Research
with OpenAI Agents SDK



Defining Agents (it's ambiguous...)



"AI Agents are **programs where LLM outputs control the workflow.**"

In practice, describes an AI solution that involves any or all of these:

1. Multiple LLM calls
2. LLMs with ability to use Tools
3. An environment where LLMs interact
4. A Planner to coordinate activities
5. Autonomy



Episode #841
Andrew Ng

SuperDataScience
PODCAST



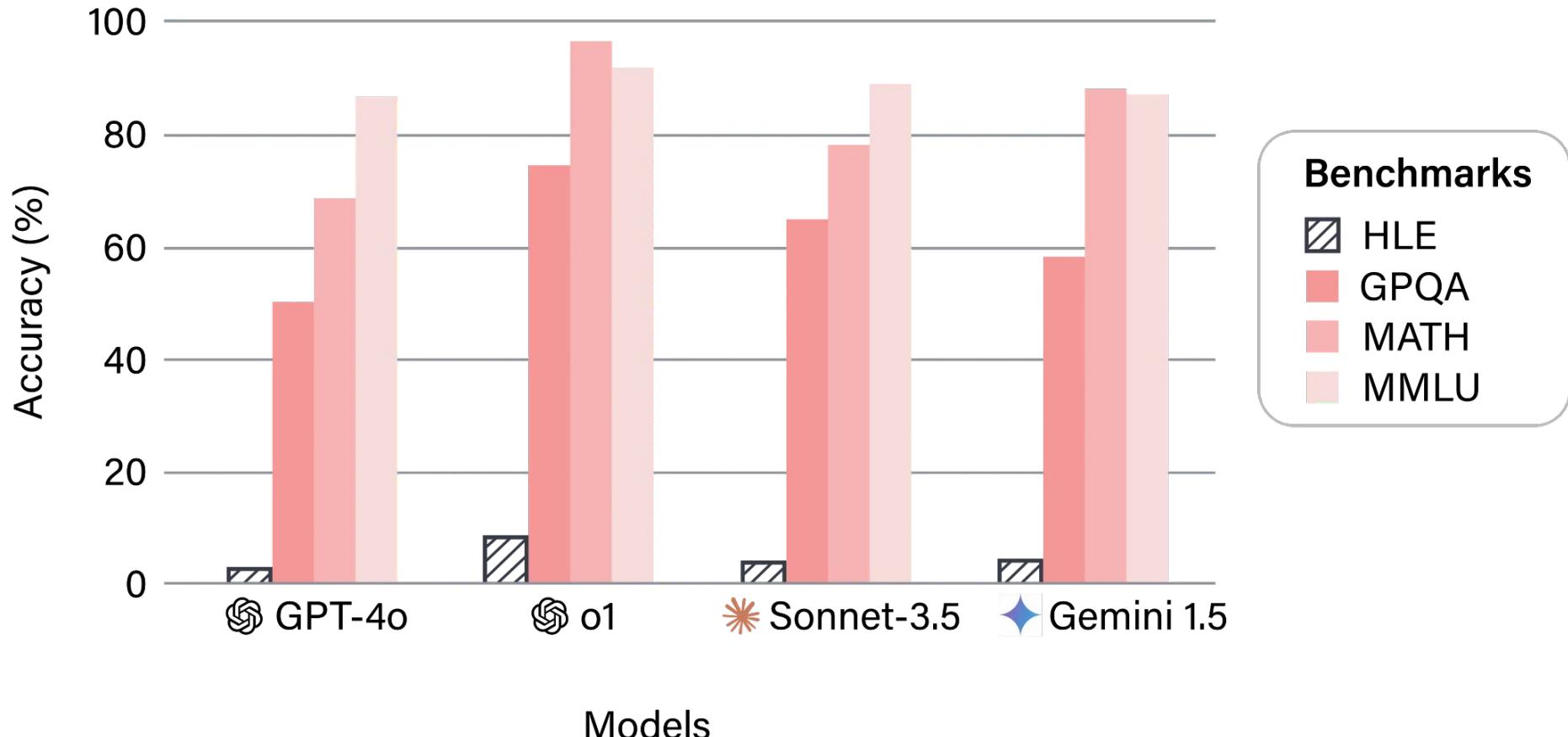
Machine Learning | AI | Success

Episode #867

Andriy Burkov

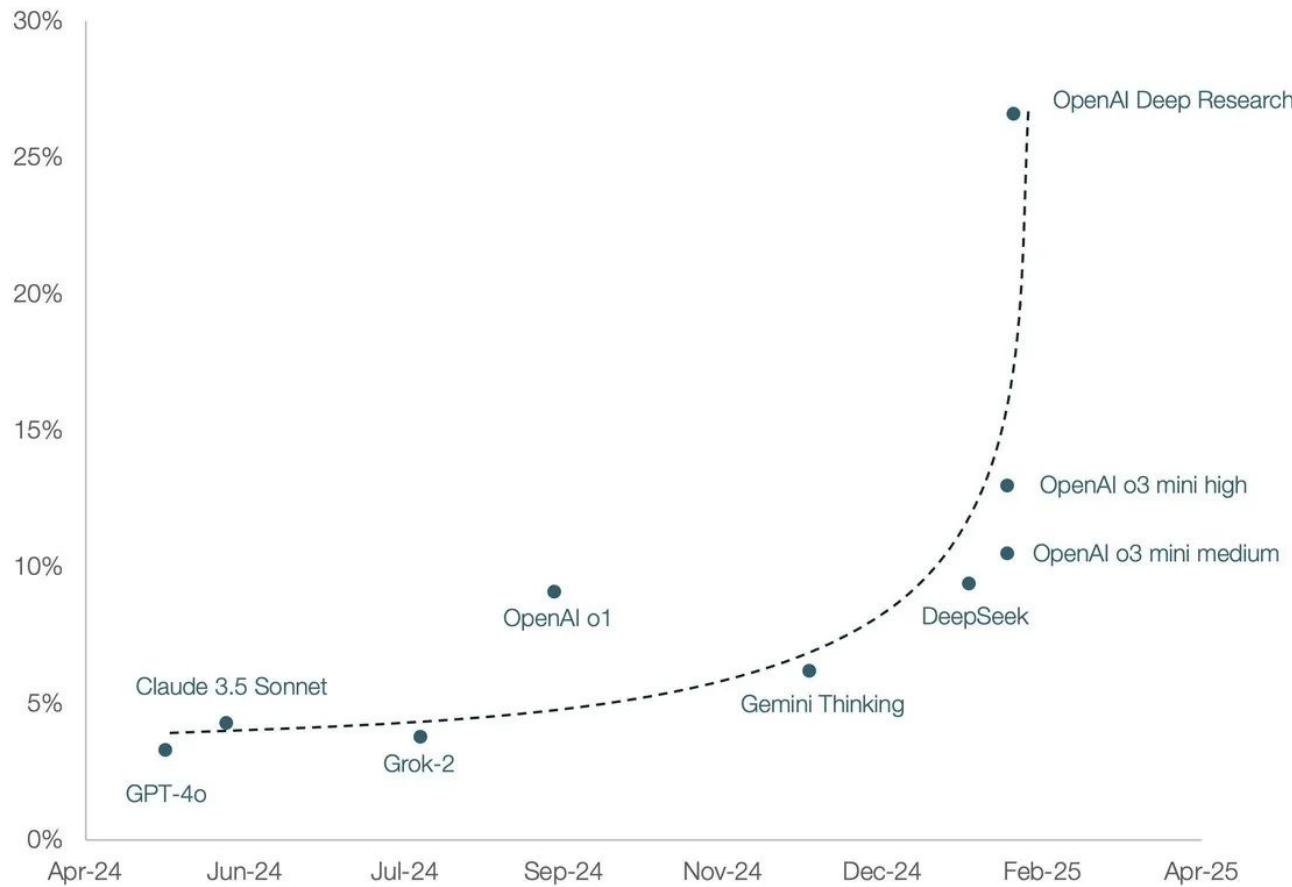


Accuracy of LLMs Across Benchmarks



Source: agi.safe.ai

AI Scores on *Humanity's Last Exam*

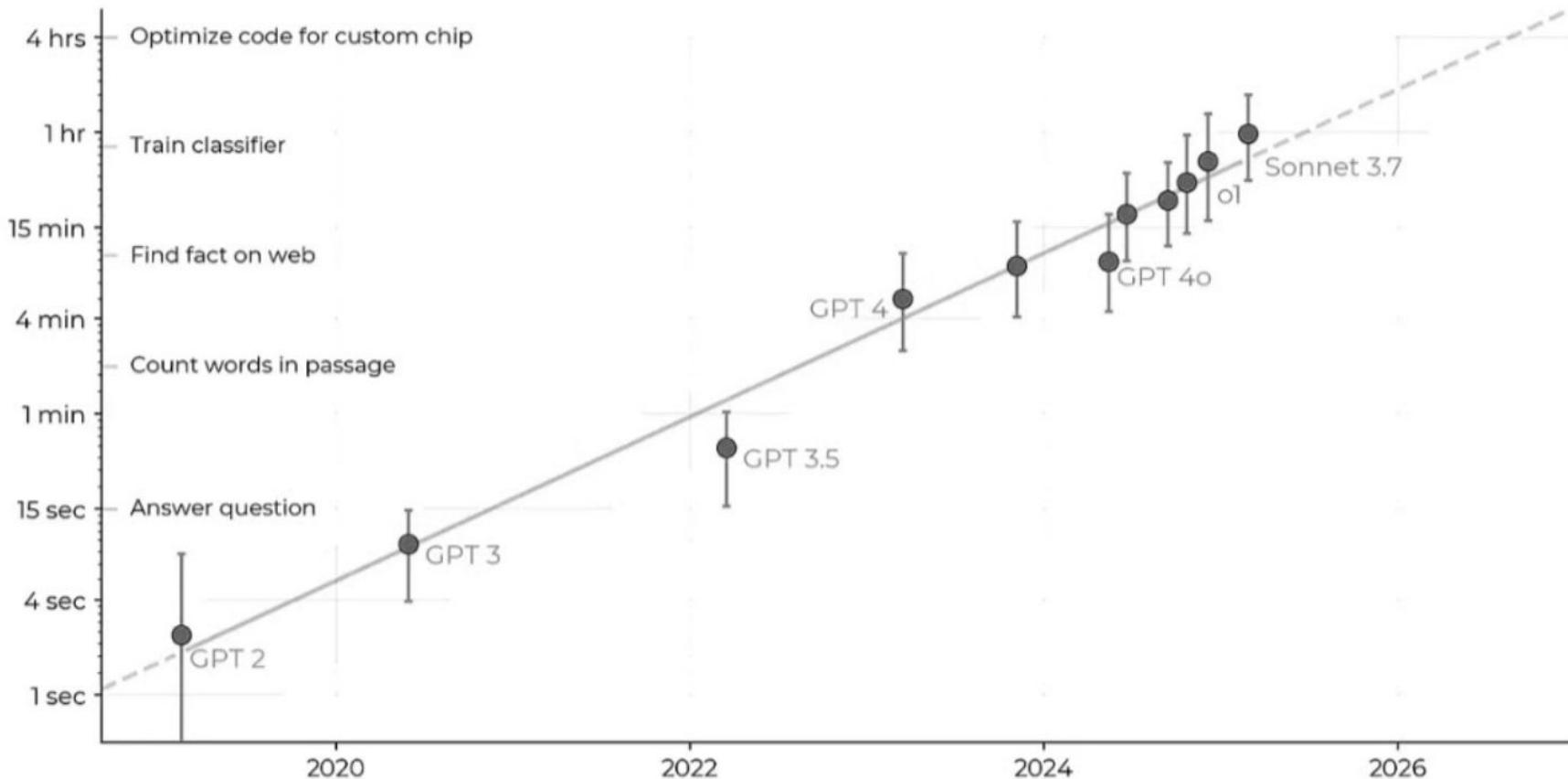


Source: Tomas Pueyo for Uncharted Territories, with data from Dan Hendrycks, of Humanity's Last Exam

The length of tasks AIs can do is doubling every 7 months



Task length (at 50% success rate)



- It's
Never
Been
A
Better
Time
To
Develop
AI
Agents
1. ML/LLM Advancements
 2. Cloud Infrastructure
 3. Data
 4. Open-Source Software
 5. Low-Cost Hardware
 6. Development Tools
 7. Connectivity
 8. Regulatory Environment
 9. Market Demand
 10. Educational Resources

Agents in Action

- Code Generation → Team of Software Developers
- Medical Diagnosis
- Scientific Literature Review
- Design and Run Experiments then Write Paper
- Replace More and More Enterprise Tasks → First Billion-\$ Firm with No Employees?

Agentic Systems

Anthropic distinguishes two types:



Workflows:

Systems where LLMs and tools are orchestrated through predefined code paths



Agents:

Systems where LLMs dynamically direct their own processes and tool usage, maintaining control over how they accomplish tasks

"Tools" give LLMs autonomy

Give an LLM the power to carry out actions like **query a database** or **message other LLMs**

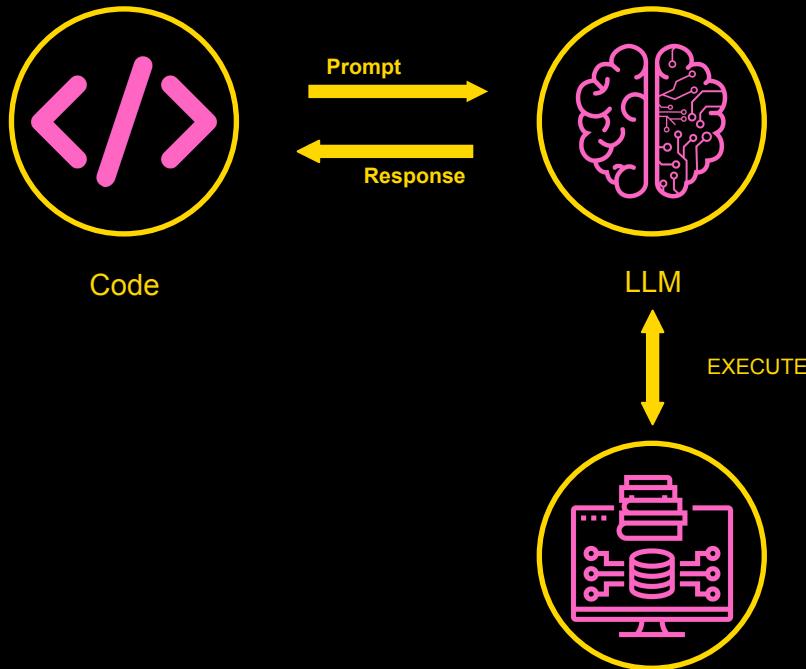
Sounds **spooky**, right?

OpenAI can reach into my computer?!

The reality is a bit **mundane**

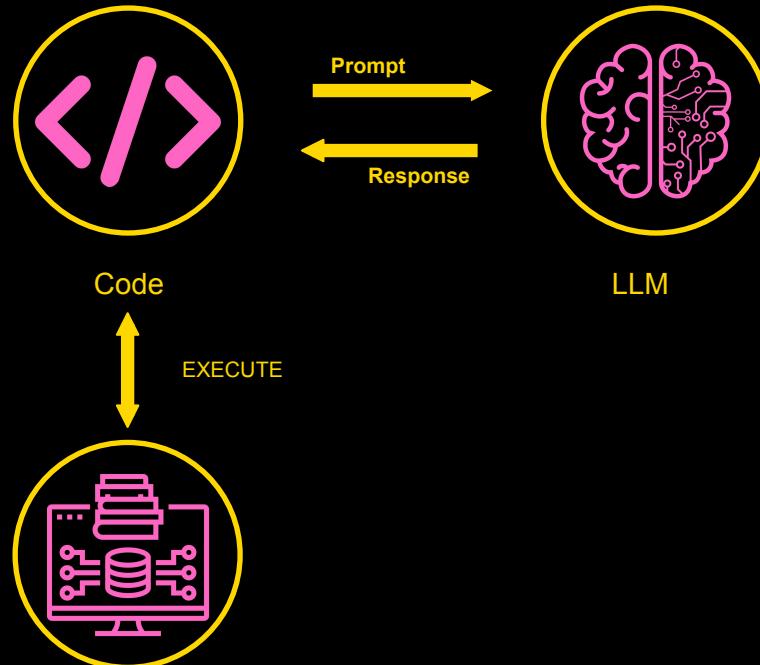
Tool Calling – popular perception

“An LLM can reach into my computer”



Tool Calling – mundane reality

An LLM responds with the actions needed



Behold Tool use.

A screenshot of a web browser window titled "Flight price to Paris". The URL is "chatgpt.com/c/67d443b3-40e4-8012-b112-1bd28a854447". The page displays the ChatGPT 4o interface. A message from the AI states: "You are a support agent for an airline. You answer user questions. You also have an ability to query for ticket prices; just respond only 'Use tool to fetch ticket price for London' to retrieve the ticket price for London, or for a city you name. Here is the user question:". Below this, a user message reads: "User: I'd like to go to Paris. How much is a flight?". The AI's response is: "Use tool to fetch ticket price for Paris.". At the bottom, there is an "Ask anything" input field and several tool buttons: "+", "Search", "Deep research", "...", a microphone icon, and a question mark icon. A footer note says: "ChatGPT can make mistakes. Check important info."

Flight price to Paris

chatgpt.com/c/67d443b3-40e4-8012-b112-1bd28a854447

ChatGPT 4o

You are a support agent for an airline. You answer user questions. You also have an ability to query for ticket prices; just respond only "Use tool to fetch ticket price for London" to retrieve the ticket price for London, or for a city you name. Here is the user question:

User: I'd like to go to Paris. How much is a flight?

Use tool to fetch ticket price for Paris.

Ask anything

⊕ Search Deep research ...

ChatGPT can make mistakes. Check important info.

Risks of Agent Systems



Unpredictable path



Unpredictable output



Unpredictable costs



Monitor



"Guardrails ensure your agents behave safely, consistently, and within your intended boundaries"

Agentic AI Frameworks

LangGraph

AutoGen

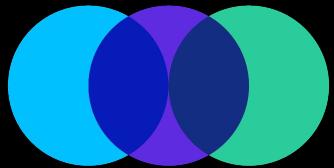
OpenAI
Agents SDK

CrewAI

No framework

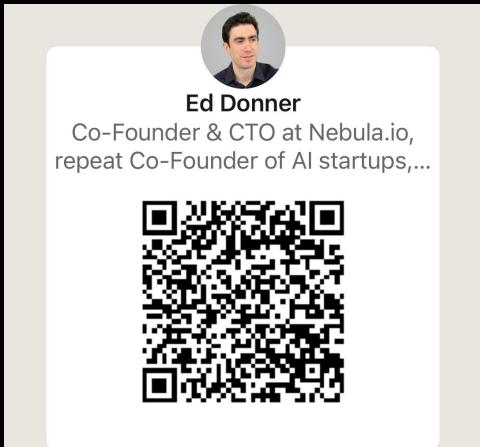
MCP

...and many, many more! Which to pick depends
on the **use case** and your **preference**



NEBULA

<https://www.linkedin.com/in/eddonner/>



Ed Donner
Co-Founder & CTO at Nebula.io,
repeat Co-Founder of AI startups,...

That's me!!

..and that's Jon!!

A LinkedIn profile card for Ed Donner. It features a circular profile picture of a man with dark hair. Below the picture, the name "Ed Donner" is displayed in bold black text. Underneath the name, a bio reads "Co-Founder & CTO at Nebula.io, repeat Co-Founder of AI startups,...". At the bottom of the card is a large QR code.



Introducing OpenAI Agents SDK



Lightweight and flexible



Stays out of the way



Makes common activities easy



(My favorite)

Minimal terminology



Agents represent LLMs



Handoffs represent interactions



Guardrails represent controls

Three steps

1. Create an instance of **Agent**
2. Use **with trace()** to track
3. Call **Runner.run()** to run



Coding project #1

Deep Research

Good News:

We have quite the treat in store for you

Bad News:

Partly pre-baked! And we will move fast.

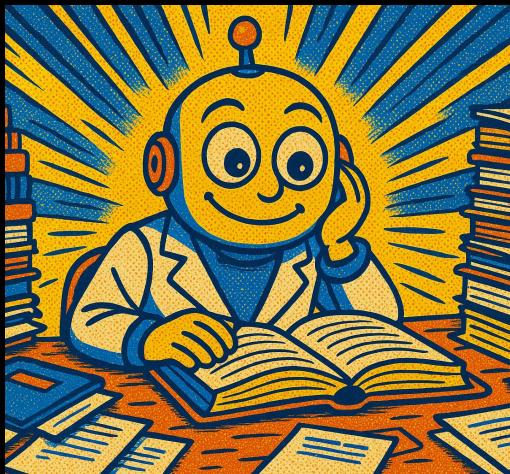
Good News:

You can recreate this yourself!

<https://github.com/ed-donner/action>



Module 1:
Defining Agents



Module 1 Coding:
Deep Research
with OpenAI Agents SDK



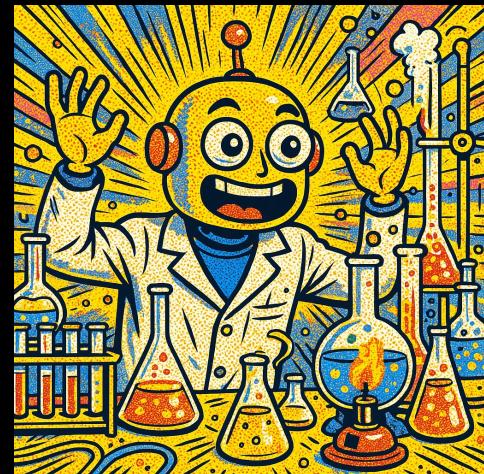
Module 2:
Designing Agents



Module 2 Coding:
Engineering Team
with CrewAI



Module 3:
Developing Agents



Module 3 Coding:
Autonomous Traders
with MCP



Module 2: **Designing** Agents

Module 2 Coding:
Engineering Team
with CrewAI



Agentic Systems

Anthropic distinguishes two types:



Workflows:

Systems where LLMs and tools are orchestrated through predefined code paths



Agents:

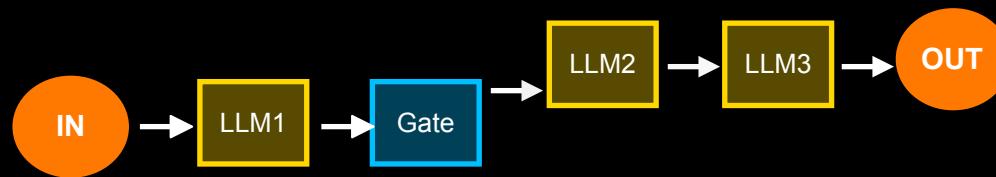
Systems where LLMs dynamically direct their own processes and tool usage, maintaining control over how they accomplish tasks



5 workflow design patterns

1. PROMPT CHAINING

Decompose into fixed sub-tasks

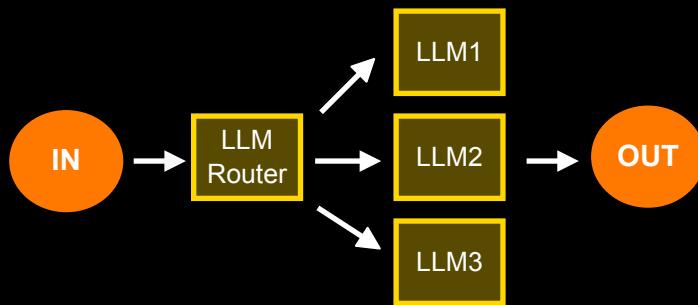




5 workflow design patterns

2. ROUTING

Direct an input into a specialized sub-task,
ensuring separation of concerns

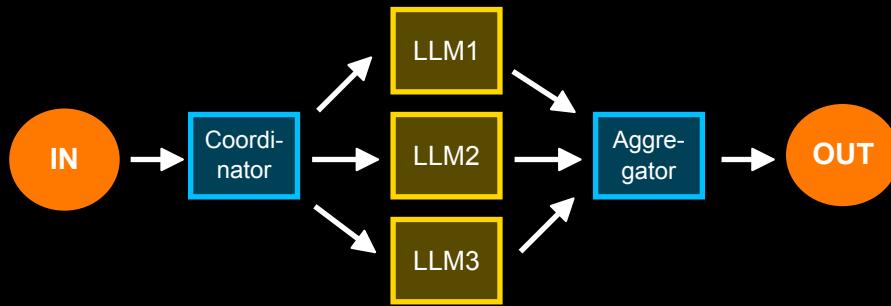




5 workflow design patterns

3. PARALLELIZATION

Breaking down tasks and running multiple subtasks concurrently

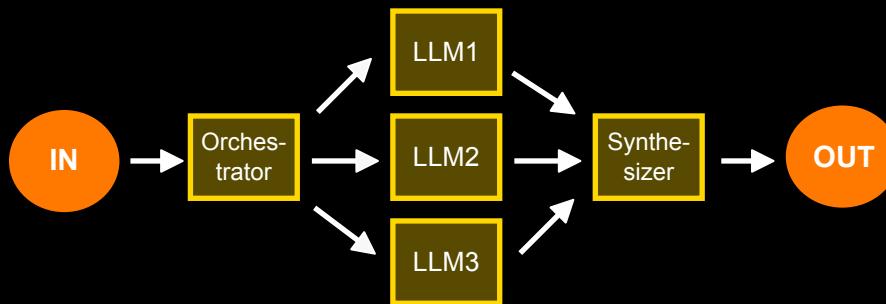




5 workflow design patterns

4. ORCHESTRATOR-WORKER

Complex tasks are broken down dynamically and combined

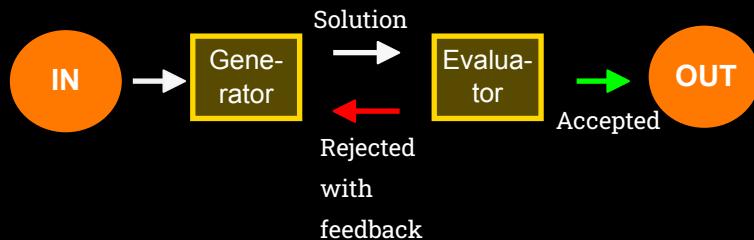




5 workflow design patterns

5. EVALUATOR-OPTIMIZER

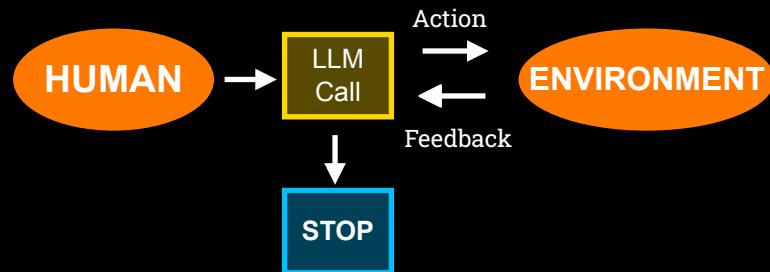
LLM output is validated by another





By contrast, Agents:

1. Open-ended
2. Feedback loops
3. No fixed path



CrewAI core concepts

Agent: an autonomous unit, with an LLM, a role, a goal, a backstory, memory, tools

Task: a specific assignment to be carried out, with a description, expected output, agent

Crew: a team of **Agents** and **Tasks**; either:

- | Sequential: run tasks in order they are defined
- | Hierarchical: use a Manager LLM to assign

*Lightweight, but somewhat more opinionated than OpenAI Agents SDK -
more terminology, more prescriptive*

Five Steps to a Crew AI project

- 1 Create the project with:
`crewai create crew my_project`
- 2 Fill in the config yaml files to define the **Agents** and **Tasks**
- 3 Complete the crew.py module to create the **Agents**, **Tasks** and **Crew**, referencing the config
- 4 Update main.py to set any inputs
- 5 Run with:
`crewai run`

Giving coding skills to an Agent

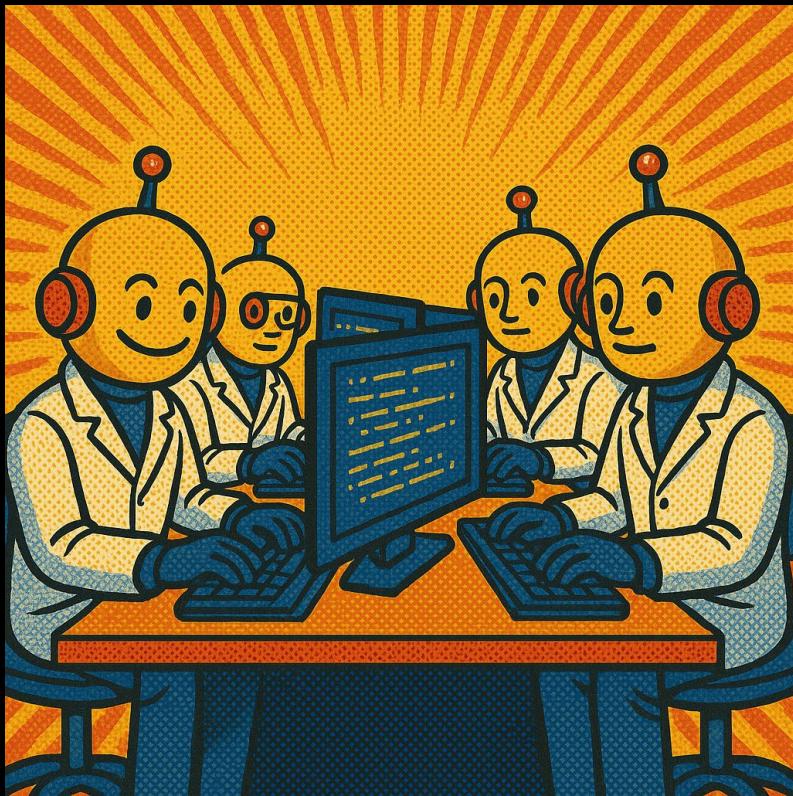
It's **hard** and it's **complex**, but you can have an Agent in Crew that has the ability to write code, execute it securely isolated in a Docker container, and investigate the results

Except it's not.

```
Agent(  
    allow_code_execution=True,  
    code_execution_mode="safe"  
)
```

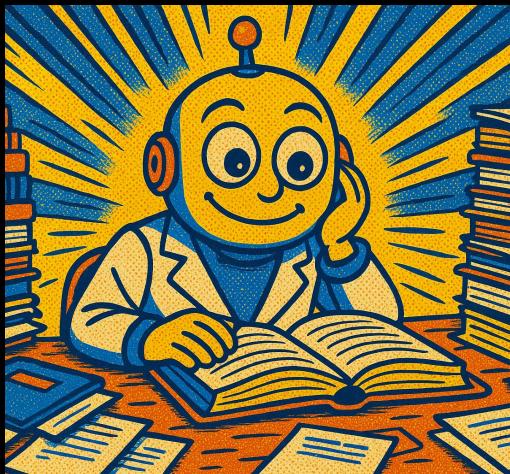
These are often described as Coder Agents.

Engineering Team



-  Engineering Lead
-  Backend Engineer
-  Frontend Engineer
-  Test Engineer

Module 1:
Defining Agents



Module 1 Coding:
Deep Research
with OpenAI Agents SDK



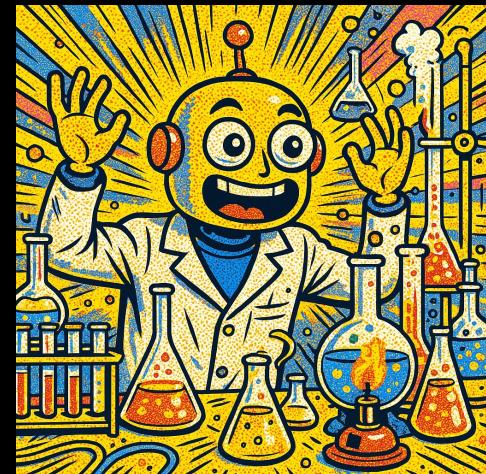
Module 2:
Designing Agents



Module 2 Coding:
Engineering Team
with CrewAI



Module 3:
Developing Agents



Module 3 Coding:
Autonomous Traders
with MCP



Module 3: **Developing** Agents

Module 3 Coding:
Autonomous Traders
with MCP



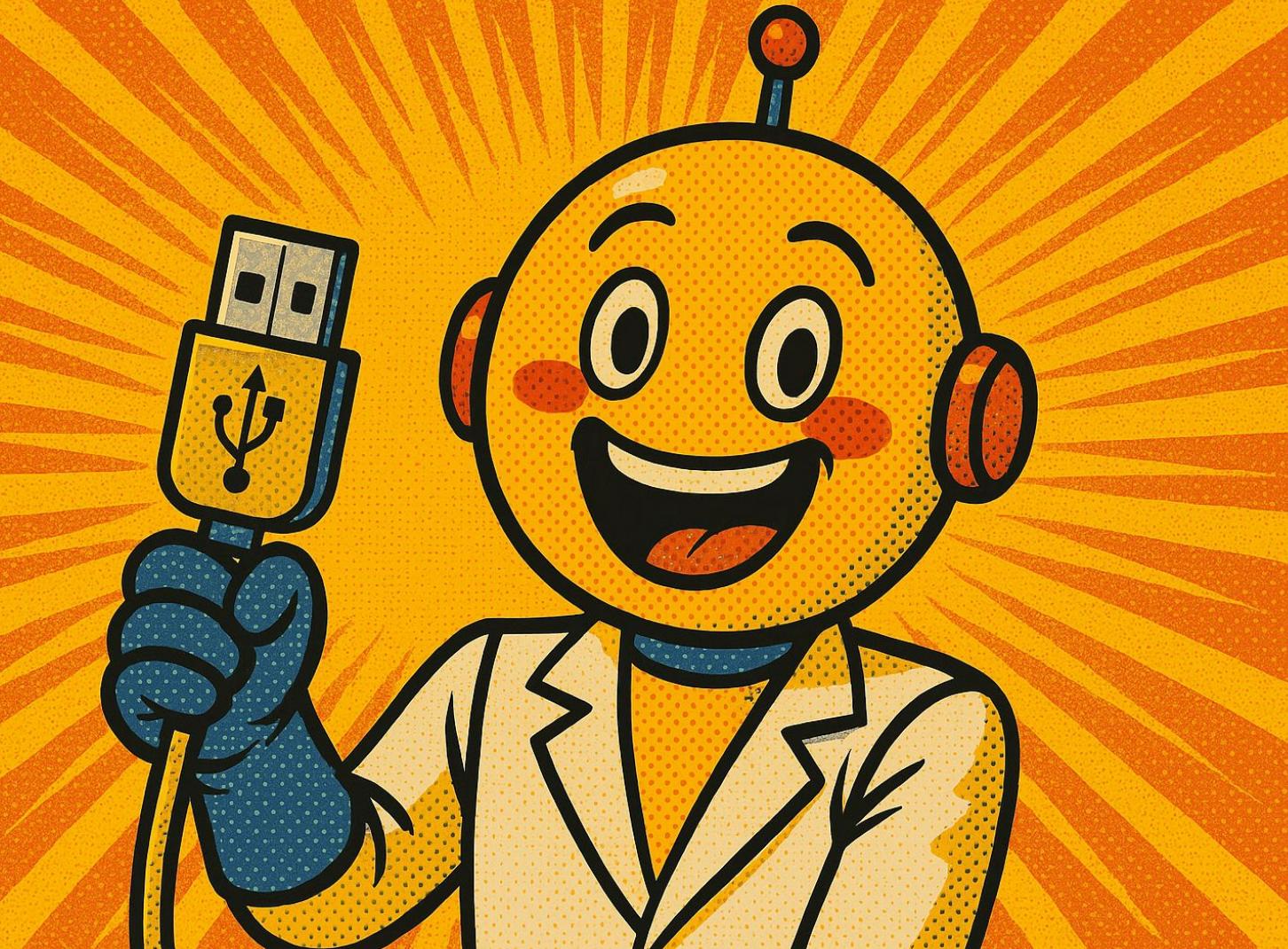
And now!

Introducing the

Model

Context

Protocol



MCP

What it's not

- A framework for building agents
- A fundamental change to how agents work
- A way to code agents

What it is

- A protocol - a standard
- A simple way to integrate tools, resources, prompts
- "A USB-C port for AI applications"

MCP

Reasons not to be excited

It's just a standard, it's not tools themselves

LangChain already has a big Tools ecosystem

You can already make any function into a Tool

Reasons to be excited

Makes it frictionless to integrate

It's taking off! Exploding ecosystem

HTML was just a standard, too 😊

MCP Core Concepts

The Three Components:

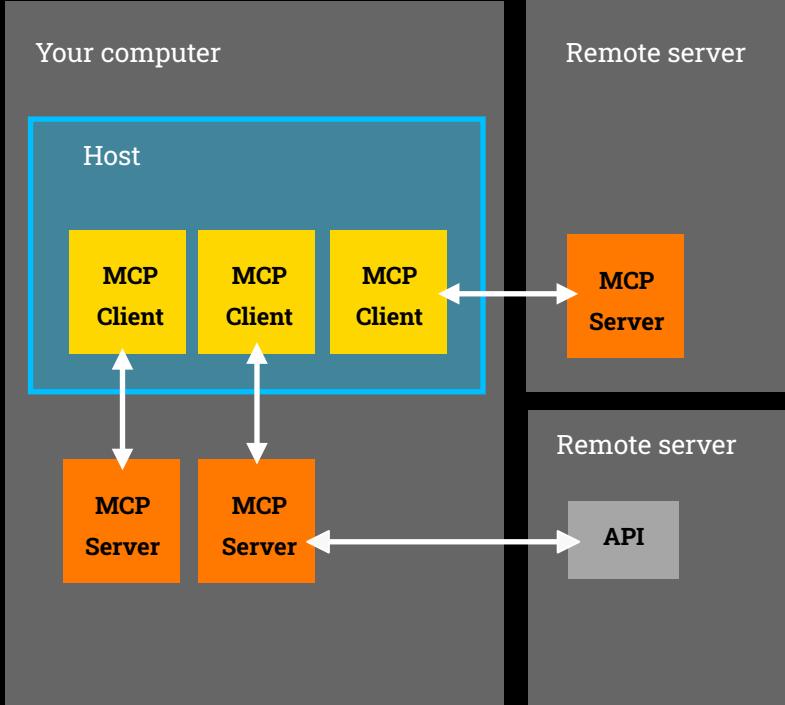
- | **Host** is an LLM app like Claude or our Agent architecture
- | **MCP Client** lives inside Host and connects 1:1 to MCP Server
- | **MCP Server** provides tools, context and prompts

Example:

Google Maps is an **MCP Server** with geolocation tools ([see here](#))

You can configure **Claude Desktop** (the host) to run an **MCP Client** that then launches the Google Maps MCP Server on your computer

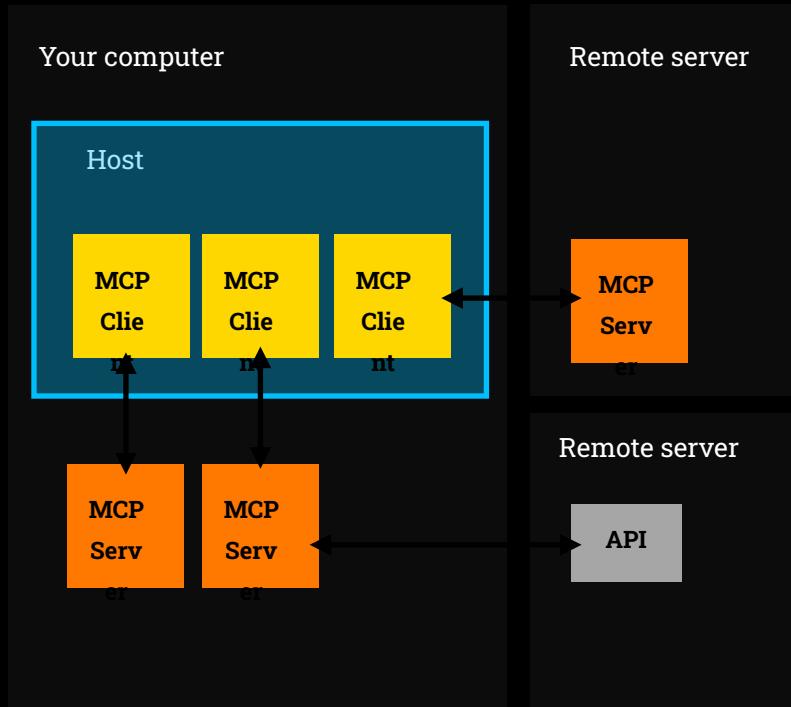
Architecture



Common misconception:
MCP Servers run remotely

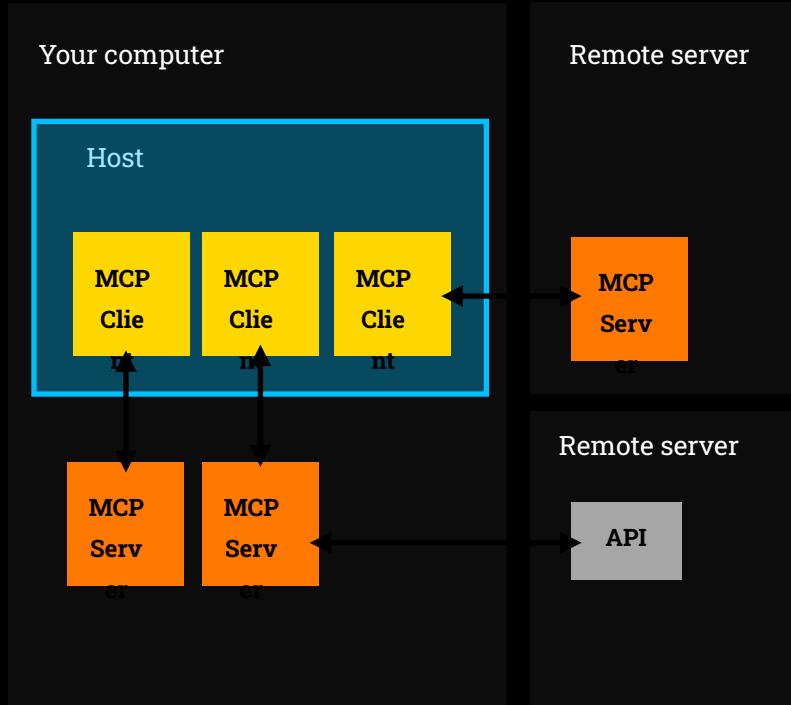
Most common reality:
Download open-source MCP Server
Run locally

Architecture



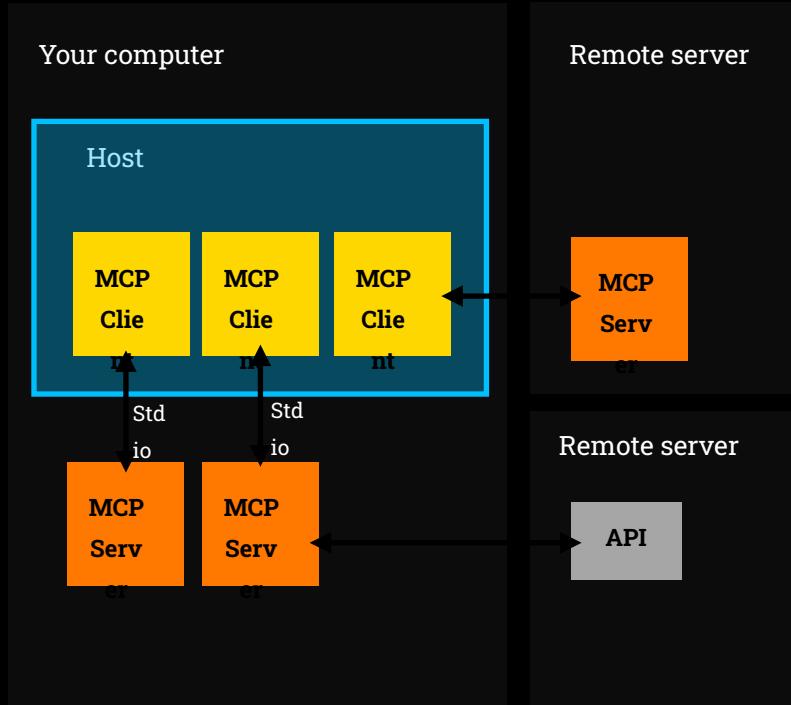
MCP Servers most often run on your box

Download open-source MCP Servers, run them locally



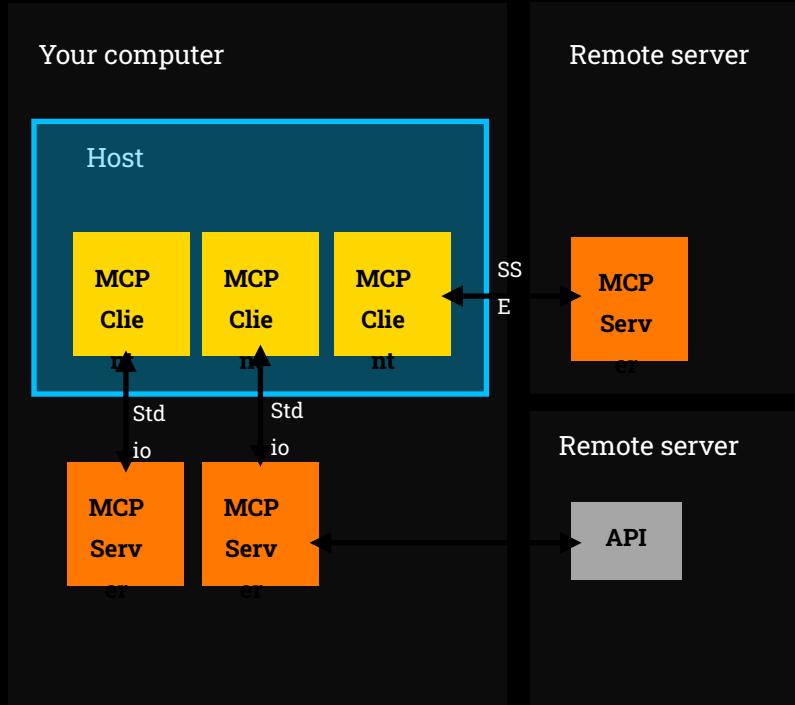
Two "Transport" mechanisms

Stdio spawns a process and communicates via standard input/output



Two "Transport" mechanisms

..while SSE uses HTTPS connections with streaming



Making an MCP Server

Why make an MCP Server

Sharing! Allow others to incorporate tools and resources

Consistently incorporate all our MCP Servers

Understand the plumbing

Reasons not to make an MCP Server

If it's only for us, then we could just make tools -
the **@function_tool** decorator can make any function into a tool

Module 3 Project

Autonomous Traders



Commercial



6 MCP servers with 44 tools and 2 resources



Agent interactions



Autonomous



Do not use for trading decisions!

Note: we will go through the code quickly; use it to get some intuition and explore later!

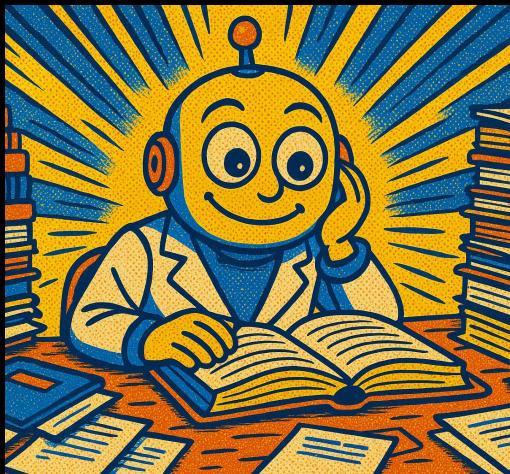


NEWS

74.50
72.34

153.72

Module 1:
Defining Agents



Module 1 Coding:
Deep Research
with OpenAI Agents SDK



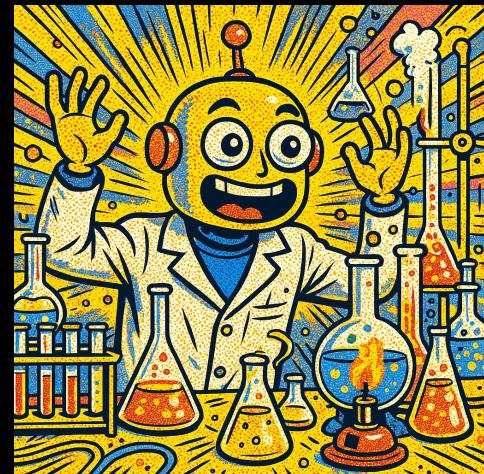
Module 2:
Designing Agents



Module 2 Coding:
Engineering Team
with CrewAI



Module 3:
Developing Agents



Module 3 Coding:
Autonomous Traders
with MCP



- It's
Never
Been
A
Better
Time
To
Develop
AI
Agents
1. ML/LLM Advancements
 2. Cloud Infrastructure
 3. Data
 4. Open-Source Software
 5. Low-Cost Hardware
 6. Development Tools
 7. Connectivity
 8. Regulatory Environment
 9. Market Demand
 10. Educational Resources

Workforce Implications

For coming years, more jobs created by AI than lost

However: funding for reskilling programs is key

How data scientists in particular can “future-proof”:

- Stay on top of AI trends
- Focus on multi-agent orchestration and management
- Don’t underestimate power of foundational subjects
- Develop domain expertise
- Develop human-AI collaboration skills
- Hone communication / influence skills within organization

- 
- A photograph of a sailboat on the water at night. The sky is filled with stars and a large, dramatic lightning bolt strikes through a cloud formation in the center. The boat is silhouetted against the bright horizon.
1. Energy
 2. Nutrition
 3. Lifespans
 4. Education
 5. Freedom from violence
 6. Freedom of expression
 7. Sustainability
 8. Cultural preservation
 9. Exploration
 10. Community

Thank you! Please stay in touch

Jon

jonkrohn.com to sign up for email newsletter



linkedin.com/in/jonkrohn



youtube.com/c/JonKrohnLearns



ycarrot.com: consulting + hiring!



Machine Learning | AI | Success



- Skip waitlist
- 15 free credits per month
- 20% off first month of Pro

Ed

Full Agentic AI course available on Udemy



linkedin.com/in/eddonner



edwarddonner.com



Complete Agentic AI course on Udemy



Code Screenshots

Outputs to the labs are here:

<https://github.com/ed-donner/action/tree/main/outputs>

Gradio

127.0.0.1:7860

Deep Research

What topic would you like to research?

What should I attend at ODSC East on Thursday May 15th 2025?

Run

ODSC East 2025: Event Overview for May 15th

Introduction

ODSC East 2025 is set to take place from May 13–15, 2025, at the Boston Convention and Exhibition Center. This report focuses on the key events and sessions occurring specifically on Thursday, May 15th, helping potential attendees maximize their experience at the conference.

Background of ODSC East

The Open Data Science Conference (ODSC) has established itself as a pivotal gathering for data scientists, AI experts, and industry professionals. The 2025 event marks the 10th anniversary of the conference, showcasing advancements in AI and data science through workshops, keynote presentations, and networking opportunities.

Key Events on May 15, 2025

1. ODSC Conference Sessions

Thursday marks the final day of the main conference with a focus on hands-on training sessions, workshops, and keynote presentations. These events are designed to cater to a diverse audience, ranging from nascent data scientists to seasoned professionals.

Trading Simulation Platform

127.0.0.1:7860

Trading Simulation Platform

Account Management Trading Reports

Create Account

User ID: 123 Initial Deposit (\$): 1000

Create Account

Deposit/Withdraw Funds

Deposit Amount (\$):

Deposit

Withdraw Amount (\$):

Withdraw

Operation Result

Account created for 123 with initial deposit of \$1000.00

Account Information

User ID: 123
Cash Balance: \$1000.00
Portfolio Value: \$1000.00
Profit: \$0.00

Trading Simulation Platform

127.0.0.1:7860

Trading Simulation Platform

Account Management **Trading** Reports

Buy Shares

Symbol (AAPL, TSLA, GOOGL)

Quantity

Buy Shares

Sell Shares

Symbol

Quantity

Sell Shares

Operation Result

Successfully bought 1 shares of AAPL at \$150.00 each.

Account Information

User ID: 123
Cash Balance: \$50.00
Portfolio Value: \$1000.00
Profit: \$0.00

Holdings:
TSLA: 1 shares at \$800.00 each = \$800.00

Trading Simulation Platform x +

127.0.0.1:7860

Trading Simulation Platform

Account Management Trading **Reports**

Account Summary

Portfolio Value

Portfolio Value

Total portfolio value: \$1000.00

Profit/Loss

Profit/Loss

Profit: \$0.00

Current Holdings

Holdings

Current Holdings:

TSLA: 1 shares at \$800.00 each = \$800.00

AAPL: 1 shares at \$150.00 each = \$150.00

Transaction History

Transactions

Transaction History:

1. Deposit: \$1000.00
2. Buy: 1 shares of TSLA at \$800.00 = \$800.00
3. Buy: 1 shares of AAPL at \$150.00 = \$150.00

Warren (GPT 4.1 Mini) - Patience

\$10,116 ↑ \$116

```

2025-05-08 14:57:46 : [response] Started response
2025-05-08 14:57:46 : [function] Ended function buy_shares
2025-05-08 14:57:46 : [function] Ended function sell_shares
2025-05-08 14:57:46 : [account] Retrieved account details
2025-05-08 14:57:46 : [account] Bought 2 of NVDA
2025-05-08 14:57:46 : [account] Retrieved account details
2025-05-08 14:57:51 : [function] Started function push
2025-05-08 14:57:51 : [response] Ended response
2025-05-08 14:57:52 : [response] Started response
2025-05-08 14:57:52 : [function] Ended function push
2025-05-08 14:57:52 : [trace] Ended: Warren-rebalancing
2025-05-08 14:57:55 : [agent] Ended agent Warren
2025-05-08 14:57:55 : [response] Ended response
    
```

Holdings

Symbol	Quantity
MSFT	10
NXPI	2
NVDA	10

Recent Transactions

symb...	quantit...	price	timestamp
MSFT	10	436.15056	2025-05-05 15:00
AMD	15	98.99759999999999	2025-05-05 15:00
ON	30	38.31648	2025-05-06 11:00
NXPI	10	183.02532	2025-05-06 11:00

George (DeepSeek V3) - Bold

\$10,202 ↑ \$202

```

2025-05-08 14:58:12 : [function] Started function sell_shares
2025-05-08 14:58:12 : [generator] Ended generation
2025-05-08 14:58:33 : [function] Started function push
2025-05-08 14:58:33 : [function] Ended function push
2025-05-08 14:58:33 : [generator] Ended generation
2025-05-08 14:58:41 : [generator] Started generation
2025-05-08 14:58:41 : [function] Ended function push
2025-05-08 14:58:41 : [function] Started function push
2025-05-08 14:58:41 : [generator] Ended generation
2025-05-08 14:58:53 : [trace] Ended: George-rebalancing
2025-05-08 14:58:53 : [agent] Ended agent George
2025-05-08 14:58:53 : [generator] Ended generation
    
```

Holdings

Symbol	Quantity
NVDA	2
AVGO	22
QCOM	29

Recent Transactions

symb...	quantit...	price	timestamp
NVDA	20	114.729	2025-05-05 15:00
PINS	50	26.92374060000000	2025-05-05 15:00
AT	50	21.72336	2025-05-06 11:00
PINS	-50	27.06076999999999	2025-05-06 12:00

Ray (Gemini 2.5 Flash) - Systematic

\$10,093 ↑ \$93

```

2025-05-08 14:57:06 : [generator] Started generation
2025-05-08 14:57:11 : [generator] Ended generation
2025-05-08 14:57:11 : [function] Ended function push
2025-05-08 14:57:11 : [function] Started function push
2025-05-08 14:57:11 : [generator] Ended generation
2025-05-08 14:57:14 : [generator] Started generation
2025-05-08 14:57:14 : [function] Ended function push
2025-05-08 14:57:14 : [function] Started function push
2025-05-08 14:57:14 : [generator] Ended generation
2025-05-08 14:57:17 : [trace] Ended: Ray-rebalancing
2025-05-08 14:57:17 : [agent] Ended agent Ray
2025-05-08 14:57:17 : [generator] Ended generation
    
```

Holdings

Symbol	Quantity
VOO	18
NVDA	6

Recent Transactions

symb...	quantit...	price	timestamp
VOO	9	517.2374100000000	2025-05-07 10:27
VOO	10	514.7274000000000	2025-05-07 11:29
NVDA	1	113.8373202000000	2025-05-07 12:31
VOO	-1	512.9121200000000	2025-05-07 15:38

Cathie (Grok 3 Mini) - Crypto

\$10,275 ↑ \$275

```

2025-05-08 14:57:52 : [account] Bought 10 of ICLN
2025-05-08 14:57:52 : [function] Started function buy_shares
2025-05-08 14:57:52 : [generator] Ended generation
2025-05-08 14:57:53 : [generator] Started generation
2025-05-08 14:57:53 : [function] Ended function buy_shares
2025-05-08 14:57:53 : [account] Retrieved account details
2025-05-08 14:57:58 : [generator] Started generation
2025-05-08 14:57:58 : [function] Ended function push
2025-05-08 14:57:58 : [function] Started function push
2025-05-08 14:57:58 : [generator] Ended generation
2025-05-08 14:58:03 : [trace] Ended: Cathie-rebalancing
2025-05-08 14:58:03 : [agent] Ended agent Cathie
2025-05-08 14:58:03 : [generator] Ended generation
    
```

Holdings

Symbol	Quantity
NVDA	76
ARKK	3
ICLN	13

Recent Transactions

symb...	quantit...	price	timestamp
NVDA	50	114.729	2025-05-05 15:00
NVDA	37	113.13081	2025-05-06 12:00
ARKK	1	49.10801999999999	2025-05-07 12:00
NVDA	-1	113.61731	2025-05-07 15:00