

LangGraph Agentic Framework

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Agenda



- A quick intro to LangChain
- A bit of LangGraph
 - and probably another session or series
 - Replit - A use case
 - Reddit - a small survey
- **Demo/s**
- Preso copy and the code - available afterwards
- Sources:
 - <https://www.langchain.com/> and
 - <https://langchain-ai.github.io/langgraph>
 - unless mentioned

Training - courses

Short Course

AI Agents in LangGraph


Build agentic AI workflows using LangChain's LangGraph and Tavily's agentic search.

  LangChain, Tavily

Short Course

Build LLM Apps with LangChain.js


Expand your toolkit with LangChain.js, a JavaScript framework for building with LLMs. Understand the fundamentals of using LangChain...

 LangChain

Short Course

Functions, Tools and Agents with LangChain


Learn about the latest advancements in LLM APIs and use LangChain Expression Language (LCEL) to compose and customize chains and agents.

 LangChain

Short Course

LangChain: Chat with Your Data


Create a chatbot with LangChain to interface with your private data and documents. Learn from LangChain creator, Harrison Chase.

 LangChain

Short Course

LangChain for LLM Application Development






Use the powerful and extensible LangChain framework, using prompts, parsing, memory, chains, question answering, and agents.


 LangChain

<https://www.deeplearning.ai/>




Training - courses

Course Curriculum

- Welcome to the course! 
- Module 1: Introduction 
- Module 2: State and Memory 
- Module 3: UX and Human-in-the-Loop 
- Module 4: Building Your Assistant 

 **LangGraph**

About this course

-  Free
-  40 lessons
-  4 hours of video content

<https://academy.langchain.com/courses/intro-to-langgraph>

LangChain



The biggest developer community in GenAI

Learn alongside the 100K+ practitioners who are pushing the industry forward.



15M+

Monthly Downloads

100K+

Apps Powered

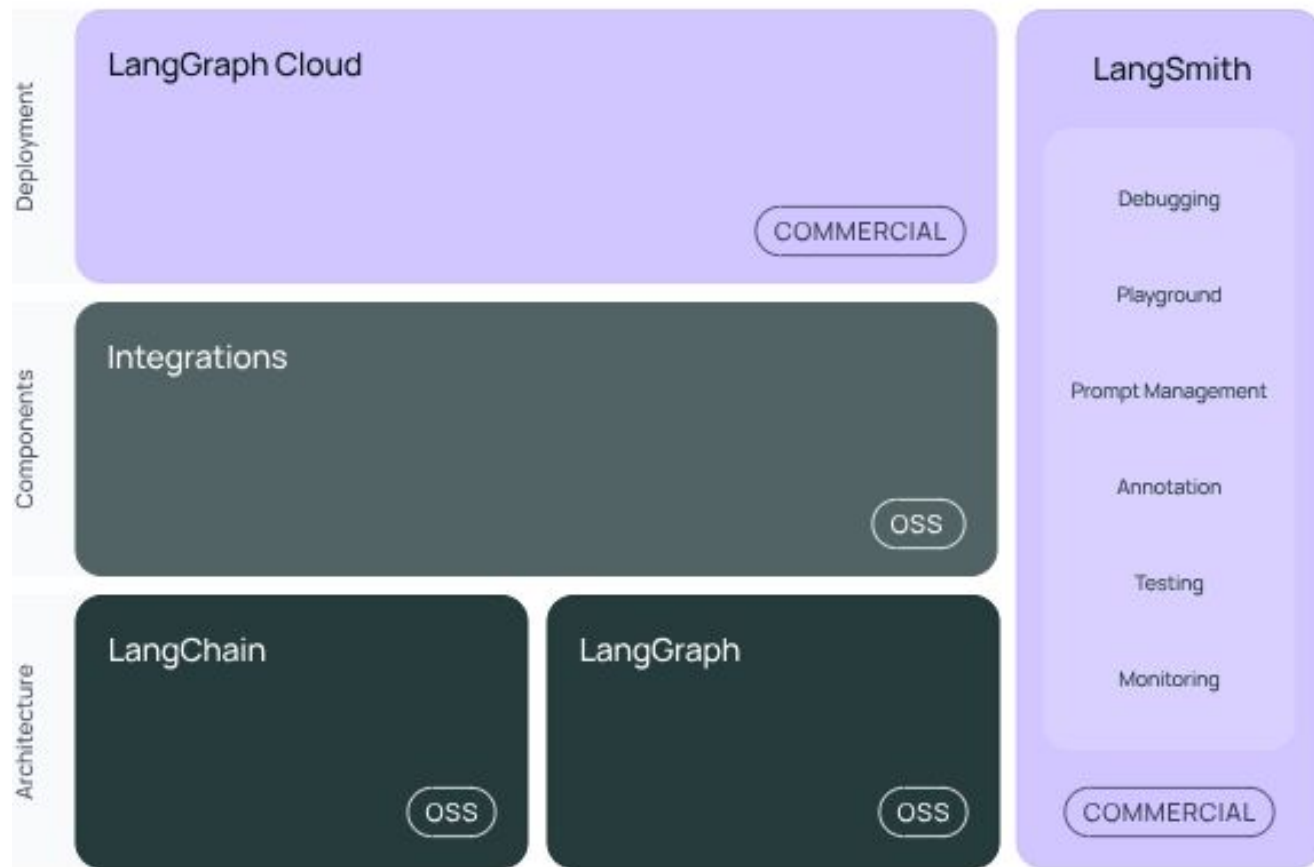
75K+

GitHub Stars

3K+

Contributors

LangChain



Langchain

- Open-source framework for developing applications powered by language models.
- Integration with various LLMs
- To provide a standard interface for chaining together different components
- Combines LLMs with external data sources and computational tools
- Facilitates the creation of AI agents that can interact with their environment
- Modular architecture for easy customization and extension
- Built-in memory and context management
- Support for external data sources and tools

Components of Langchain

- Models: LLMs and embeddings
- Prompts: Templates and management
- Indexes: For efficient data retrieval
- Chains: Combine LLMs with other components
- Agents: Autonomous task completion

Agents in Langchain

- By themselves, language models can't take actions - they just output text.
- Agents are systems that use an LLM as a reasoning engine to determine
 - which actions to take and
 - what the inputs to those actions should be.
- Uses:
 - Autonomous decision-making entities
 - Tool selection and usage
 - Memory and state management
 - Goal-oriented task completion

001



Plan-and-
execute

002



Multi-agent

003



Critique
Revise

004



ReAct

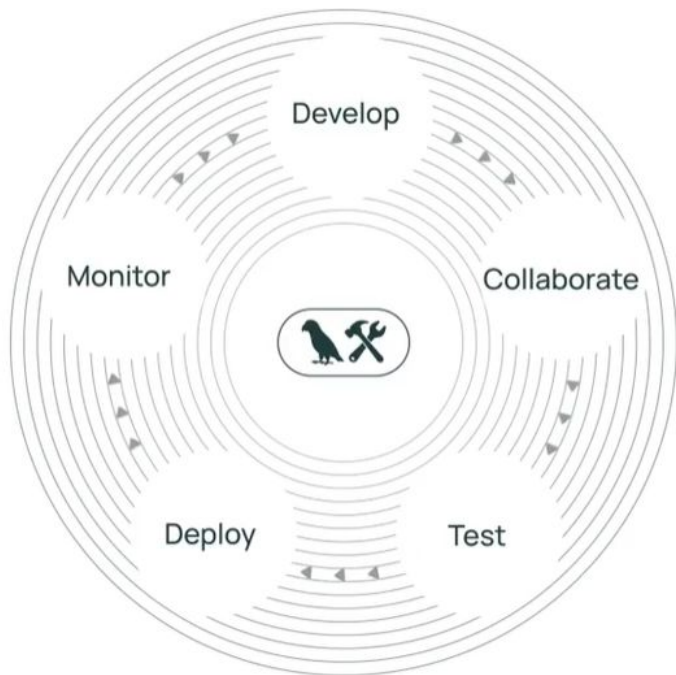
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Self-ask

LangSmith

a **platform** for building production-grade LLM applications. It allows you to closely **monitor and evaluate** your application



The interface displays a **TRACE** for a **chat-langchain** application. The trace shows a sequence of steps:

- chat-langchain** (5.13s, 5,846 tokens)
- FindDocs** (0.70s)
- RetrievalChainWith...** (0.68s)
- Retriever** (0.68s) - This step is highlighted.
- GenerateResponse** (5.07s)
- ChatOpenAI** (4.33s)

The **Retriever** step is expanded to show its **INPUT** and **OUTPUT**.

Retriever (0.68s, 5 DOCUMENTS)

INPUT 09:01:00

How do I use a RecursiveUrlLoader to load content from a page?

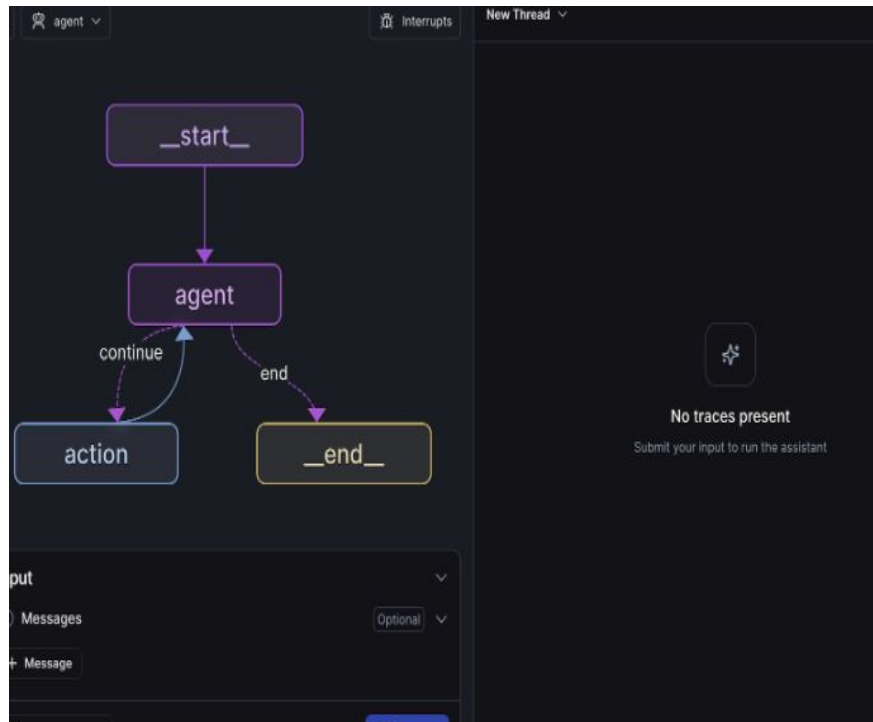
OUTPUT 09:01:68

- Recursive URL | Langchain [Skip to main content](#_docu...
- langchain_community.document_loader.RecursiveUrlLoader-La...
- lazy_load() Lazy load web pages. load() Load web pages. load_An...
- python os.environment["LANGCHAIN_TRACING_V2" = "true" os...
- for result in results: print("Content:", result[0].page_content, "----"

At the bottom, there are three buttons: **Add to Dataset**, **Annotate**, and **Playground**.

LangGraph

- An extension of LangChain
- specifically aimed at creating
 - highly controllable and customizable agents.

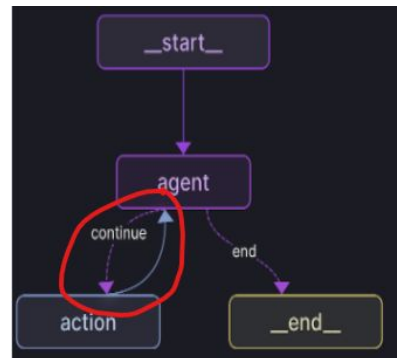


LangGraph

[pypi](#) [v0.2.37](#) [downloads/month](#) [1M](#) [open issues](#) [44](#) [docs](#) [latest](#)

⚡ Building language agents as graphs ⚡

- A library - used to create **agent** and multi-agent **workflows**.
- Core benefits: cycles, controllability, and persistence
- a very low-level framework
 - fine-grained control over both the flow and
 - state of your application
- includes built-in persistence, enabling
 - advanced human-in-the-loop and
 - memory features
- Streaming Support
- LangGraph integrates seamlessly with LangChain and LangSmith
 - But can be used without LangChain.



LangGraph - Replit Agent

- Platform that simplifies writing, running, and collaborating on code
 - for over 30+ million developers.
- Complex workflow built on LangGraph,
 - enables a highly custom agentic workflow
 - i. with a high-degree of control and
 - ii. parallel execution.
- seamless integration with LangSmith,
 - deep visibility into their agent interactions (to debug tricky issues).
- With reviewing and writing code, also performs a wider range of functions :
 - planning,
 - creating dev environments,
 - installing dependencies, and
 - deploying applications for users.

Source:

<https://blog.langchain.dev/customers-replit/>

A Study - LangGraph Use Cases

- **Content Generation:** multiple AI agents collaborate to draft, fact-check, and refine research papers in real-time.
- **Customer Service:** dynamic response systems that analyze sentiment, retrieve relevant information, and generate personalized replies with built-in clarification mechanisms.
- **Financial Modeling:** valuation models in real estate that adapt in real-time based on market fluctuations and simulated scenarios.
- **Academic Research:** adaptive research assistants capable of gathering data, synthesizing insights, and proposing new hypotheses within a single integrated system.

Source: https://www.reddit.com/r/LangChain/comments/1eh0ly3/spoke_to_22_langgraph_devs_and_heres_what_we_found/

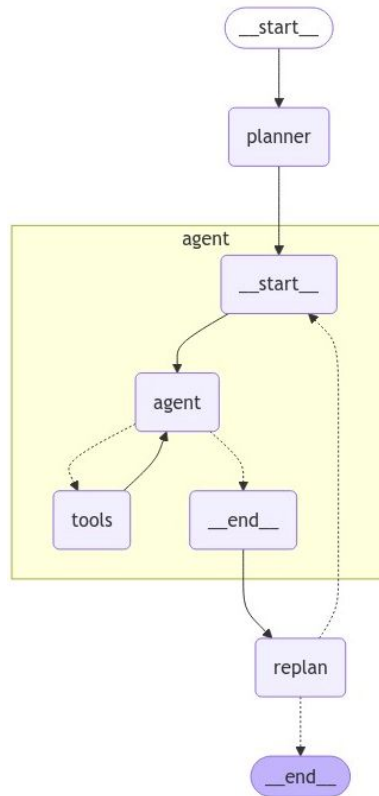
LangGraph vs Alternatives (CrewAI and Microsoft's Autogen)

- Handling Complex Workflows: including **cycles** (CrewAI can only handle DAGs)
- Developer Control: LangGraph offers **a level of control** that many find unmatched, especially for custom use cases.
- **Mature Ecosystem**: LangGraph's longer market presence has resulted in more resources, tools, and infrastructure.
- The ability to use **LangSmith** in conjunction with LangGraph for debugging and performance analysis is a significant differentiator."
- Leader in functionality and tooling for developing workflows.

Source: https://www.reddit.com/r/LangChain/comments/1eh0ly3/spoke_to_22_langgraph_devs_and_heres_what_we_found/

LangGraph - Three key components

- **State:**
 - A shared data structure that represents **the current snapshot** of your application. It can be any Python type, but is typically a TypedDict or Pydantic BaseModel.
- **Nodes:**
 - Python functions that encode **the logic of your agents**. They receive the current State as input, perform some computation or side-effect, and return an updated State.
- **Edges:**
 - Python functions that determine **which Node** to execute next based on the current State. They can be **conditional** branches or **fixed** transitions.
- Nodes and Edges are nothing more than Python functions (contain LLM or code)
- Summary: Nodes **do the work**. Edges tell **what to do next**.



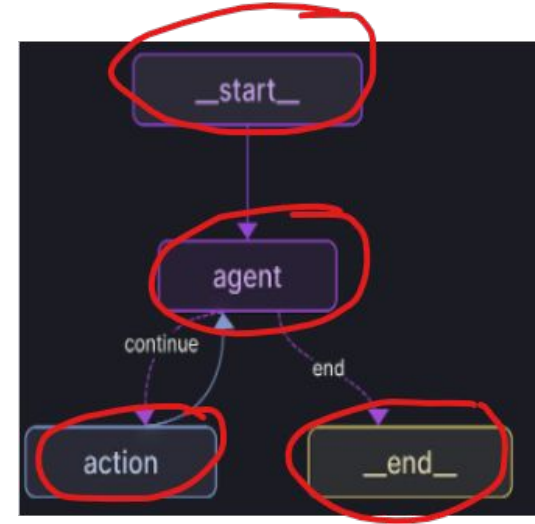
State

```
class State(TypedDict):  
    # Messages have the type "list". The 'ac  
    # in the annotation defines how this sta  
    # (in this case, it appends messages to  
    messages: Annotated[list, add_messages]
```

- Consists of
 - the schema of the graph as well as
 - reducer functions which specify how to apply updates to the state.
- The schema of the State will be **the input schema to all Nodes and Edges** in the graph
- All Nodes will **emit updates to the State** which are then applied using the specified **reducer function**.

LangGraph - Nodes

```
def my_node(state: dict, config: RunnableConfig):  
    print("In node: ", config["configurable"]["user_id"])  
    return {"results": f"Hello, {state['input']}!"}  
  
# The second argument is optional  
def my_other_node(state: dict):  
    return state  
  
builder.add_node("my_node", my_node)  
builder.add_node("other_node", my_other_node)
```

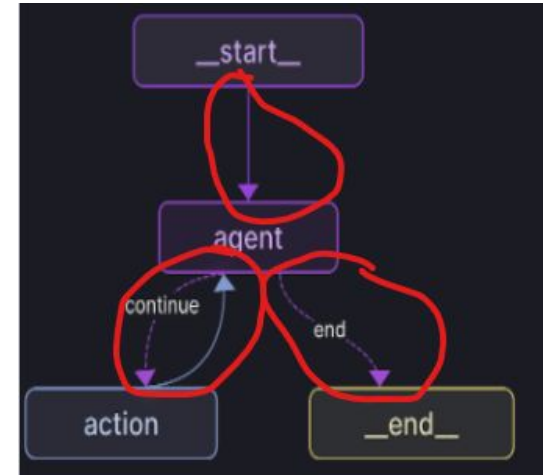


- START Node is a special node that represents the node sends user input to the graph
- The END Node is another special node - a terminal node i.e. no actions after

Type of Edges

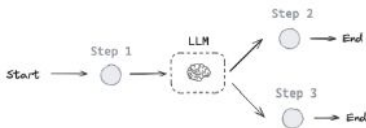
- Normal Edges:
 - Go directly from one node to the next.
- Conditional Edges:
 - Call a function to determine which node(s) to go to next.
- Entry Point:
 - Which node to call first when user input arrives.
- Conditional Entry Point:
 - Call a function to determine which node(s) to call first when user input arrives.

```
# Set the entrypoint as `agent`  
# This means that this node is the first  
workflow.add_edge(START, "agent")  
  
# We now add a conditional edge  
workflow.add_conditional_edges(  
    # First, we define the start node.  
    # This means these are the edges to  
    "agent",  
    # Next, we pass in the function that  
    should_continue,
```



Agent Architectures

Router

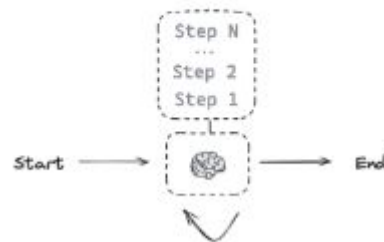


Levels of autonomy in LLM applications

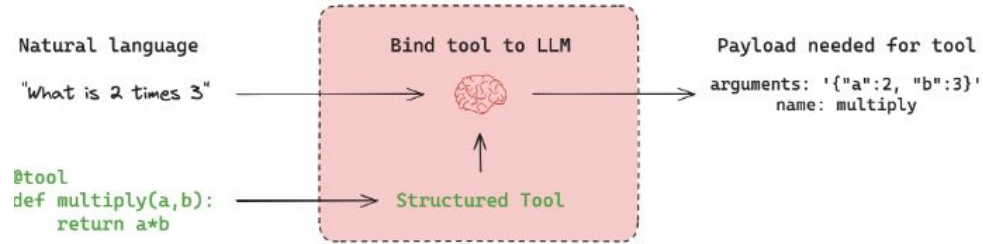
			code	LLMs
		Decide Output of Step	Decide Which Steps to Take	Decide What Steps are Available to Take
HUMAN-DRIVEN	1	Code		
	2	LLM Call	 one step only	
	3	Chain	 multiple steps	
	4	Router	 no cycles	
AGENT-EXECUTED	5	State Machine	 cycles	
	6	Autonomous		

LangChain

Fully Autonomous



Tool calling agent (ReAct)



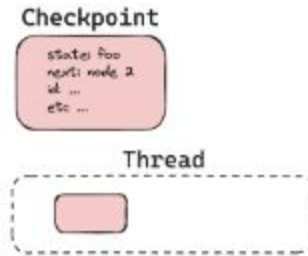
Human-in-the-loop - Approval

(1) Hit a breakpoint



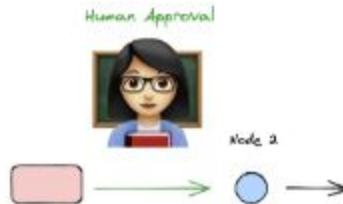
Graph stops at breakpoint before Node 2

(2) Wait for approval



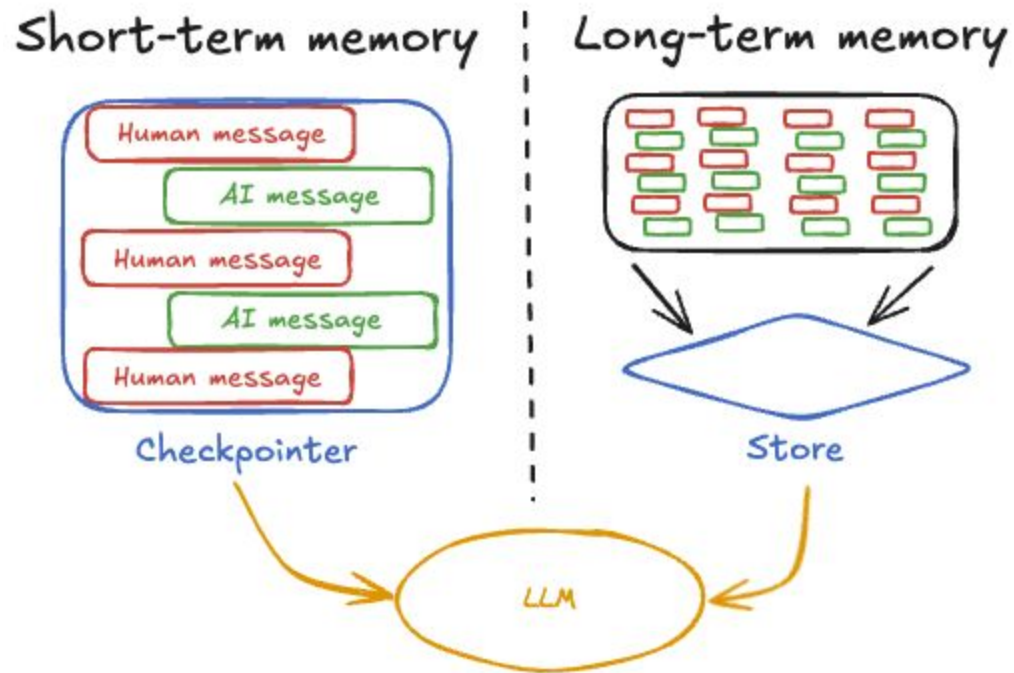
When stopped, we have a persistence layer with the current checkpoint written to it

(3) Continue

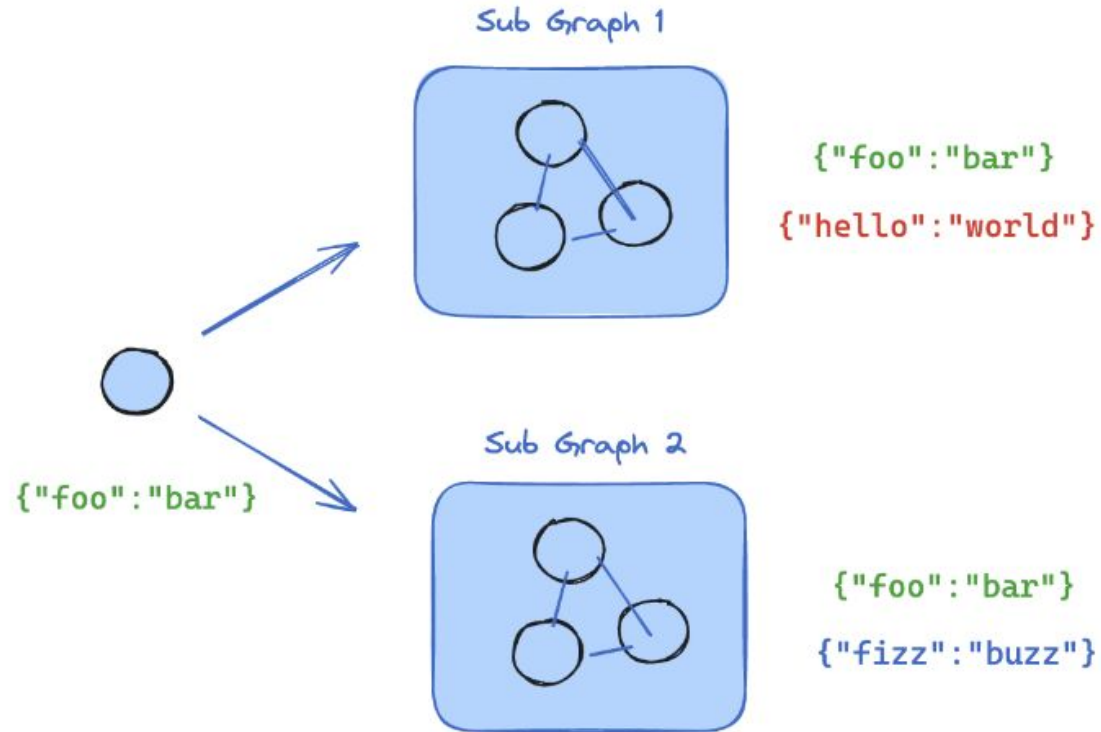


When a human approves the next step (Node 2), graph proceeds from the current checkpoint

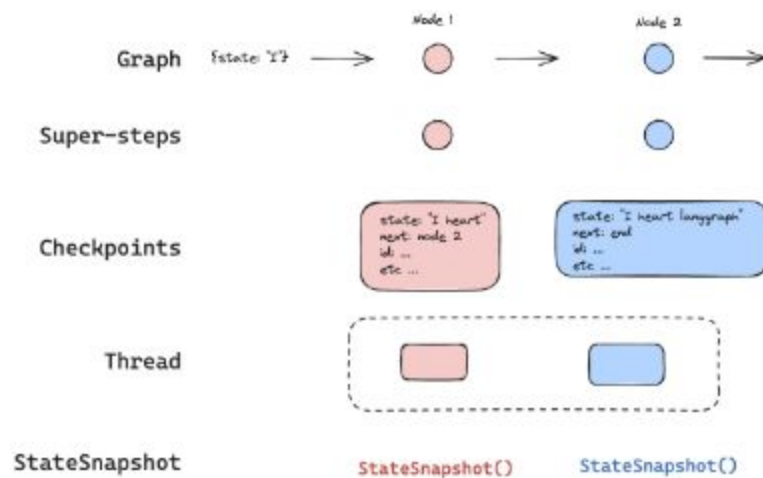
Memory



Multi-agent system - Agents as nodes

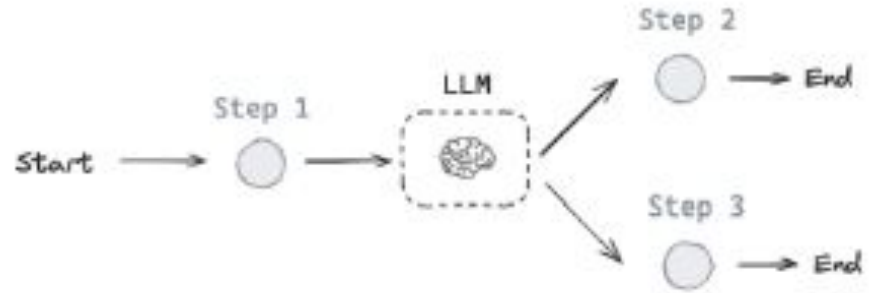


Persistence



Flow

- Initialize the model and tools.
- Initialize graph with state.
- Define graph nodes.
- Define entry point and graph edges.
- Compile the graph.
- Execute the graph.



Demos

1. Very Basic like HelloWorld
2. Plan-and-Execute example from LangGraph

(<https://langchain-ai.github.io/langgraph/tutorials/plan-and-execute/plan-and-execute/#define-our-execution-agent>)

What Next?

- Open source project - Via GitHub repo - All Welcome!

?

Thanks