LangGraph□□

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□□□□□

1. **LangGraph□□**
2. □□□□□□□□□□□□□□□□□□□□□
3. □□□□□□
    - ○ □□□□□□□□□□□□□□□
    - ○ □□□□□□□□□□□□
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    - ○ □□□□□□□□□□□□□□□□□□□
4. □□□□□□□□□
5. □□□□□□□□□□

LangGraph[illegible]

LangGraph[illegible]LangChain[illegible]

[illegible]

- [illegible]
- [illegible]
- [illegible]
- [illegible]

□□LangGraph□□□□□□

□□□LangChain

- □□□□□□□□□□A → B → C□
- □□□□□□□□□□□□□

LangGraph□□□

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[illegible]

[illegible]State[illegible]

[illegible]

```
from typing import Annotated, TypedDict
import operator

class AgentState(TypedDict):
    messages: Annotated[Sequence[BaseMessage], operator.add]
    count: Annotated[int, operator.add]
```

[illegible]

- `TypedDict` [illegible]
- `Annotated` [illegible] `operator.add` [illegible]
- [illegible]

□□□□□□

`operator.add`□□□

```
# □□□□
state = {"messages": [msg1], "count": 1}

# □□□□□□□
return {"messages": [msg2], "count": 1}

# □□□□□□
# messages: [msg1, msg2]  # □□□□□□
# count: 2                # □□□□□
```

□□: `operator.add`□□□□□□□□□□□□□□□/□□□□□□□

□□□□Node□□□□

□□□□□□□□□□□□□□□□□

```python
def my_node(state: AgentState) -> dict:
    """□□□□□"""
    # □□□□□□□
    messages = state["messages"]

    # □□□□□
    result = do_something(messages)

    # □□□□□□□□□
    return {"messages": [result]}
```

□□□□

- □□□□□□□□□State□
- □□□□□□□□□□□□

□□□□Edge□□□□

□□□□□□□□□□□□□□□□□□□

□□□□□□

```
workflow.add_edge("NodeA", "NodeB")  # A → B
```

□□□□□□□

```
def should_continue(state):
    if state["done"]:
        return "end"
    return "continue"

workflow.add_conditional_edges(
    "NodeA",
    should_continue,
    {"continue": "NodeB", "end": END}
)
```

[illegible]Graph[illegible]

```
from langgraph.graph import StateGraph, END

# 1. [illegible]
workflow = StateGraph(AgentState)

# 2. [illegible]
workflow.add_node("NodeA", node_a_function)
workflow.add_node("NodeB", node_b_function)

# 3. [illegible]
workflow.add_edge("NodeA", "NodeB")
workflow.add_edge("NodeB", END)

# 4. [illegible]
workflow.set_entry_point("NodeA")

# 5. [illegible]
graph = workflow.compile()
```

[illegible]

```
# [illegible]
result = graph.invoke({
    "messages": [],
    "count": 0
})

# [illegible]
print(result["messages"])
print(result["count"])
```

□□1: □□□□□□□

□□□□□□□**work_1.py**□

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□□□□□□□□□□□□□□□□□□□□□□

□□□

1. □□□Deposit□
2. □□□□□□
    - □□ → □□□Full□
    - □□□ → □□□□
3. □□□□□Full□

□□□□□□

```python
from typing import Annotated, TypedDict
import operator

class PiggyBankState(TypedDict):
    total: Annotated[int, operator.add]       # □□□□□□□□
    count: Annotated[int, operator.add]       # □□□□□□□□
    last_deposit: int                          # □□□□□□
```

□□□□

- `total` □ `count` □ `operator.add` □□□
- `last_deposit` □□□□□□□Annotated□□□

□□□□□

```python
def deposit(state: PiggyBankState) -> dict:
    """□□□□□"""
    amount = int(input("Enter the amount to deposit: "))
    return {
        "total": amount,      # total□□□□□□
        "count": 1,           # count□□□□□□
        "last_deposit": amount  # □□□□□□
    }

def finalize(state: PiggyBankState) -> dict:
    """□□□□□"""
    print(f"{state['count']}□□□□□□□□□□□□□□□□□")
    print(f"{state['total']}□□□□□□□□□")
    return {"total": 0}
```

□□□□□□□

```
def check_goal(state: PiggyBankState, goal: int) -> str:
    """□□□□□□□□□"""
    if state["total"] >= goal:
        return "full"      # □□□□
    else:
        return "continue"  # □□
```

□□□□: □□□□□□□□□□□□□

□□□□□

```
graph TD
    Start([□□]) --> Deposit[□□]
    Deposit --> Check{□□□□?}
    Check -->|□□□| Deposit
    Check -->|□□| Full[□□□□]
    Full --> End([□□])
```

□□□□□□

```
import functools

def piggy_bank(goal: int):
    workflow = StateGraph(PiggyBankState)

    # □□□□□
    workflow.add_node("Deposit", deposit)
    workflow.add_node("Full", finalize)

    # □□□□□□□
    workflow.add_conditional_edges(
        "Deposit",
        functools.partial(check_goal, goal=goal),
        {"continue": "Deposit", "full": "Full"}
    )

    workflow.add_edge("Full", END)
    workflow.set_entry_point("Deposit")

    return workflow.compile()
```

[illegible]

```
Enter the amount to deposit: 300
Enter the amount to deposit: 400
Enter the amount to deposit: 500
3[illegible]
1200[illegible]
[illegible]500[illegible]
```

[illegible]

- [illegible]`operator.add`[illegible]
- [illegible]`add_conditional_edges`[illegible]
- [illegible]

□□2: □□□□□□□□□□□□

□□□□□□□□□□（work_2.py）

[illegible]

LLM[illegible]

[illegible]

1. [illegible]
2. [illegible]
3. [illegible]

□□□□□□

```
from langchain_core.tools import tool
import subprocess

@tool
def exec_command(shell_command: str) -> str:
    """□□□□□□□□□□□□□□
    shell_command: Linux□□□□□□□
    """
    result = subprocess.run(
        shell_command,
        shell=True,
        capture_output=True
    )
    return result.stdout.decode("utf-8") + \
           result.stderr.decode("utf-8")
```

□□□□□□

```
from typing import Annotated, Sequence, TypedDict
from langchain_core.messages import BaseMessage
import operator

class AgentState(TypedDict):
    messages: Annotated[Sequence[BaseMessage], operator.add]
```

□□□□

- □□□□□□□□□
- `operator.add`□□□□□□□□□□□

LLM□□□□□□

```python
from langchain_openai import AzureChatOpenAI

llm = AzureChatOpenAI(
    azure_deployment=os.environ.get("AZURE_OPENAI_CHAT_DEPLOYMENT"),
    api_key=os.environ.get("AZURE_OPENAI_API_KEY"),
    azure_endpoint=os.environ.get("AZURE_OPENAI_ENDPOINT"),
    api_version=os.environ.get("AZURE_OPENAI_VERSION"),
    temperature=0,
)

# □□□□□□□□
llm_with_tool = llm.bind_tools([exec_command])
```

[illegible]

```
def agent_node(state: AgentState):
    """[illegible]LLM[illegible]"""
    messages = state["messages"]
    response = llm_with_tool.invoke(messages)
    return {"messages": [response]}
```

[illegible]

1. [illegible]
2. LLM[illegible]
3. LLM[illegible]

□□□□□□

```
from langchain_core.messages import ToolMessage

def tool_node(state: AgentState):
    """□□□□□□□□□□□□□"""
    messages = state["messages"]
    last_message = messages[-1]

    tool_messages = []
    for call in last_message.tool_calls:
        if call["name"] == "exec_command":
            value = exec_command.invoke(call["args"])
            tool_message = ToolMessage(
                content=value,
                name=call["name"],
                tool_call_id=call["id"],
            )
            tool_messages.append(tool_message)

    return {"messages": tool_messages}
```

[illegible]

```python
def should_continue(state: AgentState):
    """[illegible]"""
    messages = state["messages"]
    last_message = messages[-1]

    if last_message.tool_calls:
        return "tool"   # [illegible]
    else:
        return "end"    # [illegible]
```

□□□□□

```
graph TD
    Start([□□]) --> Agent[□□□□□□]
    Agent --> Check{□□□□□□□?}
    Check -->|Yes| Tool[□□□□□]
    Tool --> Agent
    Check -->|No| End([□□])
```

□□□□: □□□□□□ ⇄ □□□□□□□

□□□□□□

```
workflow = StateGraph(AgentState)

# □□□□□
workflow.add_node("Agent", agent_node)
workflow.add_node("Tool", tool_node)

# □□□□□□□
workflow.add_conditional_edges(
    "Agent",
    should_continue,
    {"tool": "Tool", "end": END}
)

# □□□ → □□□□□□
workflow.add_edge("Tool", "Agent")

workflow.set_entry_point("Agent")
graph = workflow.compile()
```

□□□□□

```
query: □□□□□□□□□□□□□□□□□□□□

[□□□□]
1. Agent: "ls | wc -l" □□□□□□□□□
2. Tool: □□□□□□ → "42"
3. Agent: □□□□□□□□□

[□□]
□□□□□□□□□□□42□□□□□□□□□□□□
```

□□□□□

- □□□□□□
- □□□□□□ ⇄ □□□□□□□
- □□□□□□□□□□

□□3: □□□□□□□□□□□

2□□□□□□□□□work_3.py□

[illegible]

[illegible]

[illegible]

- [illegible]: [illegible]
- [illegible]: [illegible]

[illegible]

1. [illegible]
2. [illegible]
3. [illegible] or [illegible]

[illegible]

```
from langchain_core.prompts import ChatPromptTemplate

salesman_prompt = ChatPromptTemplate.from_messages([
    SystemMessage(
        "[illegible]"
        "[illegible]FINISH[illegible]"
        "[illegible]"
    ),
    HumanMessage(content="[illegible]"),
    ("placeholder", "{messages}"),
])

shed_prompt = ChatPromptTemplate.from_messages([
    SystemMessage("[illegible]"),
    ("placeholder", "{messages}"),
])
```

[illegible]

```
from langchain_openai import AzureChatOpenAI

llm = AzureChatOpenAI(...)

salesman_agent = salesman_prompt | llm
shed_agent = shed_prompt | llm
```

[illegible]

- [illegible]LLM[illegible] `|` [illegible]
- [illegible]

□□□□□□

```
class AgentState(TypedDict):
    messages: Annotated[Sequence[BaseMessage], operator.add]
```

□□□□: □□□□□□□□□□□□

[illegible]

```python
from langchain_core.messages import AIMessage

def agent_node(state, agent, name):
    """[illegible]"""
    result = agent.invoke(state)
    message = AIMessage(
        **result.model_dump(exclude={"type", "name"}),
        name=name
    )
    print(f"{name}: {message.content}")
    return {"messages": [message]}
```

[illegible]

- `functools.partial` [illegible]
- [illegible] `name` [illegible]

□□□□□□□□

```python
import functools

salesman_node = functools.partial(
    agent_node,
    agent=salesman_agent,
    name="Salesman"
)

shed_node = functools.partial(
    agent_node,
    agent=shed_agent,
    name="SHED"
)
```

`functools.partial`□□□□□□□□

□□□□□□□

```python
def route(state):
    """□□□□□□□□□□□□□□□□□□"""
    messages = state["messages"]
    last_message = messages[-1]

    if "FINISH" in last_message.content:
        return "finish"    # □□□□
    return "continue"      # □□□□
```

□□□□□

```
graph TD
    Start([□□]) --> Salesman[□□□]
    Salesman --> Check{FINISH?}
    Check -->|No| SHED[□□]
    SHED --> Salesman
    Check -->|Yes| End([□□])
```

□□□□: □□□ ⇄ □□□□□□

□□□□□□

```
workflow = StateGraph(AgentState)

# □□□□□
workflow.add_node("Salesman", salesman_node)
workflow.add_node("SHED", shed_node)

# □□□□□□□
workflow.add_conditional_edges(
    "Salesman",
    route,
    {"continue": "SHED", "finish": END}
)

# □□ → □□□
workflow.add_edge("SHED", "Salesman")

workflow.set_entry_point("Salesman")
graph = workflow.compile()
```

[illegible]

```
Salesman: [illegible]
SHED: [illegible]
Salesman: [illegible]
SHED: [illegible]
Salesman: [illegible]FINISH
```

[illegible]

- [illegible]
- [illegible]
- [illegible]

[illegible]4: [illegible]

[illegible]work_4.py[illegible]

[illegible]

4[illegible]

[illegible]

- **Leader**: [illegible]
- **Programmer**: [illegible]
- **TestWriter**: [illegible]
- **Evaluator**: [illegible]

□□□□□□

```
class AgentState(TypedDict):
    messages: Annotated[Sequence[BaseMessage], operator.add]
    next: str      # □□□□□□□□□□
    task: str      # □□□□□
```

□□□□

- `messages`: □□□□
- `next`: □□□□□□□□□□□□□□
- `task`: □□□□□□□□□

Structured Output□□□

```
from pydantic import BaseModel, Field

class LeaderResponse(BaseModel):
    reasoning: str = Field(description="□□□□□□□□□□□")
    next: Union[Literal["Finish"], str] = Field(
        description="□□□□□□□□□□□□□□□□□"
    )
    instructions: str = Field(description="□□□□□□□□□□□□□")
```

□□□□: LLM□□□□□□□□□□□□`next`□□□

[illegible]

```python
@tool
def evaluate(code: str, test: str) -> tuple[str, str]:
    """
    [illegible]
    """
    with open("product.py", "w") as f:
        f.write(code)
    with open("test_product.py", "w") as f:
        f.write(test)
    result = subprocess.run(
        ["pytest", "test_product.py"],
        capture_output=True
    )
    return result.stdout.decode(), result.stderr.decode()
```

Evaluator[illegible]

□□□□□□□□

```
def create_agent(llm, name: str):
    """□□□□□□□□□□□□□□"""
    prompt = ChatPromptTemplate.from_messages([
        SystemMessagePromptTemplate.from_template(
            "□□□□□□□□□□□□□□□□□□□{name}□□□"
            "□□□□□□: {members}\n\n"
            "{member_roles}"
        ),
        HumanMessagePromptTemplate.from_template("task: {task}\n"),
        MessagesPlaceholder("messages"),
    ]).partial(name=name, members=members, member_roles=member_roles)

    return prompt | llm
```

[illegible]

```
llm = AzureChatOpenAI(...)

# Leader[illegible]
leader_agent = create_agent(
    llm.with_structured_output(LeaderResponse),
    "Leader"
)

programmer_agent = create_agent(llm, "Programmer")
tester_agent = create_agent(llm, "TestWriter")
evaluator_agent = create_agent(
    llm.bind_tools([evaluate]),
    "Evaluator"
)
```

[illegible]

```python
def leader_node(state: AgentState) -> dict:
    """[illegible]"""
    response = leader_agent.invoke(state)
    return {
        "messages": [
            HumanMessage(content=response.instructions, name="Leader")
        ],
        "next": response.next,  # [illegible]
    }
```

[illegible]: `next` [illegible]

□□□□□□□

```
def member_node(state: AgentState, agent, name: str) -> dict:
    """□□□□□□□□□"""
    result = agent.invoke(state)

    # □□□□□□□□□□□□□□□□□□□

    return {
        "messages": [
            AIMessage(**result.model_dump(exclude={"type", "name"}), name=name)
        ]
    }

# □□□□□□□□□□□
programmer_node = functools.partial(member_node, agent=programmer_agent, name="Programmer")
tester_node = functools.partial(member_node, agent=tester_agent, name="TestWriter")
evaluator_node = functools.partial(member_node, agent=evaluator_agent, name="Evaluator")
```

□□□□□□□ToolNode□

```
from langgraph.prebuilt import ToolNode

# □□□□□□□□□
tool_node = ToolNode([evaluate])
```

□□□□: `ToolNode`□□□□□□□□□□□□□

[illegible]

```python
def router(state: AgentState) -> str:
    """Evaluator[illegible]"""
    messages = state["messages"]
    last_message = messages[-1]

    if last_message.tool_calls:
        return "call_tool"
    return "continue"
```

□□□□□

```
graph TD
    Start([□□]) --> Leader[Leader]
    Leader --> Decision{next}
    Decision -->|Programmer| Prog[Programmer]
    Decision -->|TestWriter| Test[TestWriter]
    Decision -->|Evaluator| Eval[Evaluator]
    Decision -->|Finish| End([□□])
    Prog --> Leader
    Test --> Leader
    Eval --> ToolCheck{□□□□□□□?}
    ToolCheck -->|Yes| Tool[□□□□□]
    ToolCheck -->|No| Leader
    Tool --> Eval
```

[illegible]

```
workflow = StateGraph(AgentState)

# [illegible]
workflow.add_node("Leader", leader_node)
workflow.add_node("Evaluator", evaluator_node)
workflow.add_node("Tool", ToolNode([evaluate]))
workflow.add_node("Programmer", programmer_node)
workflow.add_node("TestWriter", tester_node)

# Evaluator[illegible]
workflow.add_conditional_edges(
    "Evaluator",
    router,
    {"continue": "Leader", "call_tool": "Tool"}
)

# Leader[illegible]
workflow.add_conditional_edges(
    "Leader",
    lambda x: x["next"],
    {
        "Programmer": "Programmer",
        "TestWriter": "TestWriter",
        "Evaluator": "Evaluator",
        "Finish": END,
    },
)

workflow.add_edge("Programmer", "Leader")
workflow.add_edge("TestWriter", "Leader")
workflow.add_edge("Tool", "Evaluator")

workflow.set_entry_point("Leader")
```

□□□□□

```
task: □□□□□□□□□N□□□□□□□□□□□□□□□□

Leader: Programmer□□□□□□□□□□□□□□□□□□□□
Programmer: [□□□□□]
Leader: TestWriter□□□□□□□□□□□□□□
TestWriter: [□□□□□]
Leader: Evaluator□□□□□□□□□□□□□□□
Evaluator: [□□□□□□□] → □□□□□
Leader: □□□□□□□Finish
```

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- **Structured Output**: LLM□□□□□□□
- **ToolNode**: □□□□□□□□□□□
- □□□□□□□□: `lambda x: x["next"]`□□□□□□□□□□□□□□
- □□□□□□□□□: □□□□□□□□□□□□□□□□□

[illegible]

□□□□□□□□□

1. □□□□□□□□

```
# ❌ □□
class State(TypedDict):
    messages: List[BaseMessage]
    message_count: int  # messages□□□□□□
    last_message: str   # messages□□□□□□

# ✅ □□□□
class State(TypedDict):
    messages: Annotated[Sequence[BaseMessage], operator.add]
```

2. □□□□□□□

- □□/□□□: `operator.add`
- □□□: Annotated□□

□□□□□□

1. □□□□□□

```python
# ❌ □□□□□
def process_node(state):
    data = fetch_data()       # □□□□□
    result = analyze(data)    # □□
    save(result)              # □□
    return {"result": result}

# ✅ □□□□□
def fetch_node(state): ...
def analyze_node(state): ...
def save_node(state): ...
```

[illegible]

2. [illegible]

```
# ❌ [illegible]
global_counter = 0
def bad_node(state):
    global global_counter
    global_counter += 1
    return {"count": global_counter}

# ✅ [illegible]
def good_node(state):
    return {"count": 1}  # operator.add[illegible]
```

[illegible]: [illegible]

□□□□□□□□□□□

1. □□□□□□□

```
MEMBERS = {
    "Leader": "□□□□□□□□□□□□□□□□□□□",
    "Programmer": "□□□□□□□□□□□□□",
    "TestWriter": "□□□□□□",
    "Evaluator": "□□□□□□□□□□□□□□□□□□□",
}
```

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[illegible]

2. [illegible]

```python
# ✅ [illegible]
def should_continue(state):
    if state["goal_reached"]:
        return "end"
    if state["max_iterations"] >= 10:
        return "end"  # [illegible]
    return "continue"
```

[illegible]: [illegible]

[illegible]

1. [illegible]

```
result = graph.invoke(initial_state)

# [illegible]
for step in result:
    print(f"Step: {step}")
    print(f"State: {result[step]}")
```

2. [illegible]

```
# [illegible]
state = {"messages": [HumanMessage(content="test")]}
result = my_node(state)
assert "messages" in result
```

[illegible]

□□□□□

1. □□□□□**State**□: TypedDict + Annotated□□□□□
2. □□□□**Node**□: □□□□□□□□State□□□□□□□□□□
3. □□□□**Edge**□: □□□□□□□□□□□□□□□
4. □□□□**Graph**□: StateGraph → add_node/add_edge → compile

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[illegible]

1. [illegible]

- LangGraph Documentation
- [illegible]

2. [illegible]

- **Persistence**: [illegible]
- **Human-in-the-loop**: [illegible]
- **Streaming**: [illegible]
- **Subgraphs**: [illegible]

3. [illegible]

- [illegible]

Q&A

[illegible]

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Happy Coding with LangGraph!