

Implementing Real-Time Agent Reasoning Visualization in Streamlit with DeerFlow Integration

Overcoming Streamlit's UI Limitations for Dynamic Agent Feedback

When implementing AI research workflows with Streamlit and DeerFlow, displaying real-time agent reasoning presents unique challenges due to Streamlit's execution model. This analysis explores technical solutions grounded in Streamlit's API capabilities and DeerFlow's multi-agent architecture, supported by 20 research sources.

Streamlit Execution Model Constraints

Streamlit's script rerun-on-interaction paradigm creates three core challenges for real-time agent feedback:

1. **State Persistence:** Agent reasoning steps require preservation across script executions^{[3][15]}
2. **Concurrent Processing:** Long-running research tasks block UI updates^{[4][9]}
3. **Dynamic Rendering:** Traditional widgets don't support incremental updates^{[17][19]}

```
# Baseline implementation showing blocking execution
def research_flow():
    st.write("Starting research...")
    result = deerflow_agent.execute() # Blocks UI
    st.write(result)
```

Solution Architecture

Hybrid Execution Model

Implement a producer-consumer pattern with Streamlit's session state:

```
if 'research_queue' not in st.session_state:
    st.session_state.research_queue = []
    st.session_state.current_step = None

def agent_callback(step):
    st.session_state.research_queue.append(step)

def ui_consumer():
    while st.session_state.research_queue:
        step = st.session_state.research_queue.pop(0)
```

```

        st.session_state.current_step = step
        # Rerun to update UI
        st.rerun()

# DeerFlow integration
deerflow_agent.set_callback(agent_callback)

```

Real-Time Visualization Techniques

1. Streaming Output with write_stream

Utilize Streamlit's native streaming API for incremental updates^{[7][10]}:

```

def thinking_generator():
    yield "Starting research...\n"
    for step in deerflow_agent.steps():
        yield f"Processing: {step}\n"
        time.sleep(0.1)

with st.status("Research Progress", expanded=True):
    st.write_stream(thinking_generator())

```

2. Fragment-Based Partial Updates

Isolate dynamic components using experimental fragments^{[3][19]}:

```

@st.experimental_fragment
def thinking_fragment():
    placeholder = st.empty()
    while deerflow_agent.is_running():
        placeholder.markdown(f"""
            **Current Step**: {deerflow_agent.current_step}
            **Elapsed**: {deerflow_agent.elapsed_time}s
            """)
        time.sleep(0.1)

```

3. Animated Status Indicators

Combine spinner with progress visualization^{[8][9]}:

```

with st.spinner("Analyzing data..."):
    progress_bar = st.progress(0)
    for i in range(100):
        deerflow_agent.process_chunk(i)
        progress_bar.progress(i + 1)
        time.sleep(0.05)

```

DeerFlow Agent Integration

Custom Callback Handlers

Implement LangChain-style callbacks for step capture^{[6][10]}:

```
from langchain.callbacks import BaseCallbackHandler

class StreamlitThinkingHandler(BaseCallbackHandler):
    def on_agent_action(self, action, **kwargs):
        st.session_state.research_steps.append(action.log)

    def on_llm_new_token(self, token, **kwargs):
        st.session_state.current_token = token
        st.rerun()

# Agent configuration
deerflow_agent.add_callback(StreamlitThinkingHandler())
```

Multi-Agent State Management

Leverage DeerFlow's architecture for distributed reasoning tracking^{[11][14]}:

```
class ResearchCoordinator:
    def __init__(self):
        self.agents = {
            'planner': PlannerAgent(),
            'researcher': ResearchAgent(),
            'analyst': AnalysisAgent()
        }

<div style="text-align: center">❌</div>
```

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[^32]: https://python.langchain.com/docs/integrations/memory/streamlit_chat_message_history
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