CodeWells: Agentic RAG Chatbot for Developers

Objective

To build an *Agentic Retrieval-Augmented Generation (RAG) Chatbot* that assists developers and team members by providing intelligent, context-aware help during development blockers. The chatbot should access **Confluence pages**, **GitHub repositories**, and **Q&A documentation**, with **agentic reasoning** to take context-driven actions.

Phase 1: Requirement Gathering & Architecture Design

Tasks:

- 1. Identify the primary developer pain points (types of blockers).
- 2. Define chatbot scope internal code help, documentation queries, debugging tips, etc.
- 3. Decide on communication channel (e.g., web UI via Streamlit).
- 4. Design high-level system architecture: RAG pipeline + Agent layer + Integration layer.
- 5. Define data flow: $query \rightarrow retrieval \rightarrow reasoning \rightarrow response/action$.
- 6. Select models and embedding strategies (e.g., text-embedding-3-small).
- 7. Prepare documentation of architecture and dependencies.

Phase 2: Data Integration & Preparation

- 1. Integrate **Confluence API** to fetch internal pages (REST API).
- 2. Connect to **GitHub API** for code and repository access.

- 3. Gather internal Q&A and wiki documentation.
- 4. Implement data cleaning, metadata tagging (source, timestamp, author).
- 5. Chunk and embed documents using sentence transformers or OpenAI embeddings.
- 6. Store embeddings in a Vector Database (FAISS / Chroma).
- 7. Schedule periodic data sync jobs.

Phase 3: RAG Pipeline Development

Tasks:

- 1. Implement retrieval logic for top-k relevant documents.
- 2. Use LangChain or Google ADK for context-aware RAG flow.
- 3. Design **context builder** to merge retrieved data with user query.
- 4. Integrate reasoning layer the **Agent** that decides:
 - Whether to fetch data, generate answers, or call an API (GitHub/Confluence).
- 5. Optimize prompt templates for developer gueries.
- 6. Test RAG responses for correctness, context quality, and hallucination rate.

Phase 4: Agentic Layer & Orchestration

- 1. Implement Google ADK Agents with task orchestration capabilities.
- 2. Define agent roles:
 - **Research Agent** → fetches relevant documents.
 - Explain Agent → summarizes or explains code/docs.

- Action Agent → performs tasks like fetching pull requests or creating issues.
- 3. Add **Human-in-the-Loop (HIL)** for critical actions (e.g., PR creation, code merge).
- 4. Enable tool calling for actions (GitHub API, Confluence write).
- 5. Maintain agent memory (conversation and context).
- 6. Conduct dry runs and refine agentic workflows.

Phase 5: Backend & Frontend Integration

Tasks:

- 1. Create FastAPI backend for orchestrating chat requests and model calls.
- 2. Build Streamlit UI for conversational interface:
 - Real-time chat window
 - Code/Markdown rendering
 - Source citation display
- 3. Implement authentication (Google OAuth / company SSO).
- 4. Integrate logging and telemetry (query latency, response quality).
- 5. Establish async communication between Streamlit ↔ FastAPI.

Phase 6: Testing & Evaluation

- 1. Unit test each module data retrieval, agent reasoning, response generation.
- 2. Perform **end-to-end user scenario tests** (e.g., "Show me last merged PR", "Explain code in repo X").

- 3. Conduct internal user testing with developers.
- 4. Evaluate accuracy, relevance, latency, and user satisfaction metrics.
- 5. Fix edge cases (e.g., missing data, incorrect references).

Phase 7: Deployment & Documentation

- 1. Containerize app using **Docker**.
- 2. Deploy on GCP / internal Kubernetes cluster.
- 3. Set up CI/CD pipeline for automatic deployment.
- 4. Create developer onboarding guide and usage manual.
- 5. Prepare presentation & POC demonstration script.
- 6. Collect post-deployment feedback and improvement suggestions.