

1. Document Structure & Chunking Logic

PDFs are converted to plain text using robust extraction (pypdf or PyMuPDF).

- Noise like headers/footers is removed with regex-based filters.
- Cleaned text is **split into overlapping, sentence-aware chunks** (default: 250 characters, 50 character overlap) using LangChain's RecursiveCharacterTextSplitter.
- Chunks are stored along with metadata indicating the source document and chunk index.

2. Embedding Model & Vector DB

- **Embeddings:** all-MiniLM-L6-v2 from Sentence Transformers. Chosen for its speed, modern pretraining, and accurate semantic similarity on short passages.
- **Vector Database:** ChromaDB (local persistent mode) stores [chunk, embedding, metadata, id] objects for fast cosine-similarity search. This enables rapid retrieval of relevant passages in response to user queries.

3. Prompt Format & Generation Logic

- Given a user query, the query is embedded via the same embedding model.
- ChromaDB retrieves the top K most relevant chunks (by default, 5).
- The prompt to the LLM follows this template:

You are an AI assistant.

Answer the user's question ONLY using the provided context from documents below.

If the answer is not present, reply:

"I could not find an answer in the documents."

Context 1: [chunk 1]

Context 2: [chunk 2]

...

User question: [user input]

Answer:

- The LLM is then invoked in streaming mode, emitting the response to the user as it is generated.

4. Example Queries (Success & Failure Cases)

User Query	Chatbot Response Example	Outcome
What is the conclusion of the report?	"The report concludes that..." <i>[from relevant passage]</i>	Success
Who are the co-authors?	"The document lists Jane Doe, John Smith as co-authors."	Success
What page is the bibliography on?	"I could not find an answer in the documents."	Correct Failure
List all survey years covered.	"The document covers surveys conducted in 2018, 2019, and 2020."	Success
What is the capital of France?	"I could not find an answer in the documents."	Correct Failure

5. Notes: Hallucinations, Limitations, and Performance

- **Hallucinations (Fabricated Answers):**
 - Mitigated by prompt constraints; LLM instructed to only answer from seen context.
 - Still possible if chunks are ambiguous or insufficient.
- **Model Limitations:**
 - If the answer is not found in the top K chunks, it will not be retrieved (recall limited by chunking overlap/size and vector search accuracy).
 - Streaming generation slows with large LLMs on low-powered machines.
- **Performance:**
 - Mistral-7B is performant on modern GPUs (10GB+ VRAM); use TinyLlama on smaller CPUs/GPUs.
 - Initial indexing of large PDFs can take several minutes but is required only once per corpus update.