# **Project Description:**

This is a LLM RAG Web Application which enable users to chat, query, and ask the documents you uploaded. It adopts

Awesome—let's shape your architecture around those three layers and the concrete services you listed. Below is a crisp, production-oriented blueprint with interfaces, data contracts, flow, and a runnable-ish skeleton you can drop into a repo.

# Layered Architecture (LLM Provider → Services → Presentation)

## 0) Overall dependency rule

- Presentation → Services → LLM Provider
- No inward dependency reversal (keep the core clean; use interfaces).

## 1) LLM Provider Layer

#### Goals

- One **OpenAI-compatible** client interface.
- Adapters for **Ollama**, **vLLM**, **llama.cpp** (and OpenAI/Anthropic later).
- Support: chat, streaming, tool-calls (optional), retries, timeouts.

#### Core interface

```
#llm_providers/base.py
from typing import Iterable, List, Optional, Dict, Any
from pydantic import BaseModel

class ChatMessage(BaseModel):
    role: str
    content: str

class ChatRequest(BaseModel):
    model: str
    messages: List[ChatMessage]
    temperature: float = 0.2
    max_tokens: Optional[int] = None
    tools: Optional[List[Dict[str, Any]]] = None
```

```
tool choice: Optional[str] = None
                                       # provider-specific (e.g., top_p, presence)
    extra: Dict[str, Any] = {}
class ChatChunk(BaseModel):
    delta: str
                                        # token fragment
    finish reason: Optional[str] = None
class ChatResponse(BaseModel):
    text: str
    usage: Dict[str, int] = {}
class LLMClient:
    def chat(self, reg: ChatRequest) -> ChatResponse: ...
    def stream(self, req: ChatRequest) -> Iterable[ChatChunk]: ...
OpenAI-compatible client + adapters
# llm providers/openai compat.py
import httpx
from .base import LLMClient, ChatRequest, ChatResponse, ChatChunk
class OpenAICompatClient(LLMClient):
    def init (self, base url: str, api key: str | None = None, timeout: int
        self.base url = base url.rstrip("/")
        self.api key = api key
        self.http = httpx.Client(timeout=timeout)
    def headers(self):
        \overline{h} = {\text{"Content-Type": "application/json"}}
        if self.api key:
            h["Authorization"] = f"Bearer {self.api key}"
        return h
    def chat(self, req: ChatRequest) -> ChatResponse:
        r = self.http.post(
            f"{self.base_url}/v1/chat/completions",
            headers=self. headers(),
                 "model": req.model,
                "messages": [m.model_dump() for m in req.messages],
                **req.extra
            },
        )
        r.raise for status()
        data = r.ison()
        text = data["choices"][0]["message"]["content"]
        usage = data.get("usage", {})
        return ChatResponse(text=text, usage=usage)
    def stream(self, req: ChatRequest):
        with self.http.stream(
            f"{self.base url}/v1/chat/completions",
            headers=self._headers(),
```

```
ison={
        "model": req.model,
        "stream": True,
        "messages": [m.model dump() for m in req.messages],
        **req.extra
   },
) as r:
    r.raise for status()
    for line in r.iter lines():
        if not line or not line.startswith("data: "):
            continue
        if line == "data: [DONE]":
            yield ChatChunk(delta="", finish reason="stop")
        payload = line.removeprefix("data: ")
        # parse SSE chunk safely
        try:
            j = __import__("json").loads(payload)
            delta = j["choices"][0]["delta"].get("content", "")
            finish = j["choices"][0].get("finish reason")
            if delta:
                yield ChatChunk(delta=delta, finish reason=finish)
        except Exception:
            continue
```

#### Configure per provider:

- Ollama: base\_url=http://localhost:11434, model="llama3:8b-instruct" (Ollama exposes an OpenAI-compatible endpoint when enabled; if not, add a thin translator).
- vLLM: --api-server exposes /v1/chat/completions.
- **llama.cpp**: start with OpenAI server flag; otherwise, use a translator adapter.

# 2) Services Layer

#### Domain models & state

```
# domain/models.py
from enum import Enum
from pydantic import BaseModel
from typing import List, Dict, Any, Optional

class SessionState(str, Enum):
    READY = "READY"
    RETRIEVING = "RETRIEVING"
    PROMPTING = "PROMPTING"
    GENERATING = "GENERATING"
    PARSING = "PARSING"
    DONE = "DONE"
    ERROR = "ERROR"

class TurnInput(BaseModel):
    user text: str
```

```
attachments: List[str] = []

class Evidence(BaseModel):
    chunks: List[Dict[str, Any]]
    citations: List[str] = []

class PromptBundle(BaseModel):
    system: str
    user: str
    context: str = ""
    tools: List[Dict[str, Any]] = []

class TurnOutput(BaseModel):
    markdown: str
    state: SessionState
    usage: Dict[str, int] = {}
    meta: Dict[str, Any] = {}
```

## CoreLogicService

• Orchestrates a turn using the other services.

```
# services/core logic.py
from domain.models import *
from .prompt service import PromptService
from .retrieval service import RetrievalService
from .state transition service import StateTransitionService
from .input data service import InputDataHandleService
from .llm gateway import LLMGateway
class CoreLogicService:
    def init (self, prompt: PromptService, retriever: RetrievalService,
                 state: StateTransitionService, input svc: InputDataHandleServi
                 llm: LLMGateway):
        self.prompt = prompt
        self.retriever = retriever
        self.state = state
        self.input = input svc
        self.llm = llm
    def run turn(self, session id: str, turn: TurnInput) -> TurnOutput:
        s = self.state.advance(session id, SessionState.READY, SessionState.RE1
        preprocessed = self.input.normalize(turn)
        ev = self.retriever.retrieve(preprocessed)
        self.state.set(session id, SessionState.PROMPTING)
        bundle = self.prompt.build(preprocessed, ev)
        self.state.set(session id, SessionState.GENERATING)
        md, usage = self.llm.generate(bundle)
        self.state.set(session id, SessionState.PARSING)
        # no transformation here; presentation handles optimistic parsing
```

```
self.state.set(session_id, SessionState.DONE)
return TurnOutput(markdown=md, state=SessionState.DONE, usage=usage)
```

## InputDataHandleService

• Cleans user text, extracts keywords, handles file attachments.

```
# services/input_data_service.py
from domain.models import TurnInput
class InputDataHandleService:
    def normalize(self, turn: TurnInput) -> TurnInput:
        text = turn.user_text.strip()
        # TODO: language detect, redact PII, strip control chars, etc.
        return TurnInput(user text=text, attachments=turn.attachments)
```

# **PromptService**

• Composes **system / context / user** with quardrails.

```
# services/prompt_service.py
from domain.models import PromptBundle, TurnInput, Evidence

SYSTEM_BASE = (
"You are a helpful assistant. Use provided CONTEXT faithfully. "
"Prefer citations when available. Respond in Markdown."
)

class PromptService:
    def build(self, turn: TurnInput, ev: Evidence) -> PromptBundle:
        context = "\n\n".join([c.get("text", "") for c in ev.chunks[:10]])
        system = SYSTEM_BASE + "\n\nCONTEXT:\n" + (context or "N/A")
        return PromptBundle(system=system, user=turn.user_text, context=context
```

#### RetrievalService

```
• Abstracts your RAG stack (Milvus/FAISS + DuckDB).
```

```
# services/retrieval_service.py
from domain.models import Evidence, TurnInput
class RetrievalService:
    def __init__(self, store):
        self.store = store  # composition: any vector store adapter

def retrieve(self, turn: TurnInput) -> Evidence:
    # store.search returns [{"text": "...", "score": 0.42, "meta": {...}},
    chunks = self.store.search(query=turn.user_text, top_k=8)
    citations = [c.get("meta", {}).get("source","") for c in chunks]
    return Evidence(chunks=chunks, citations=citations)
```

#### **StateTransitionService**

• Small finite-state machine (FSM) with validation.

```
# services/state transition service.py
from domain.models import SessionState
from typing import Dict
ALLOWED = {
    "READY": {"RETRIEVING"},
    "RETRIEVING": {"PROMPTING", "ERROR"},
"PROMPTING": {"GENERATING", "ERROR"},
    "PROMPTING": {"GENERATING", "ERROR" "GENERATING": {"PARSING", "ERROR"},
    "PARSING": {"DONE", "ERROR"},
    "DONE": set(), "ERROR": set()
}
class StateTransitionService:
    def init (self):
         self. states: Dict[str, SessionState] = {}
    def set(self, sid: str, new: SessionState):
         cur = self. states.get(sid, SessionState.READY)
         if new.name not in ALLOWED[cur.name]:
             raise RuntimeError(f"Illegal transition {cur} -> {new}")
         self. states[sid] = new
    def advance(self, sid: str, expect: SessionState, new: SessionState):
         cur = self. states.get(sid, SessionState.READY)
         if cur != expect:
             # tolerate first call when nothing stored
             self. states[sid] = new
         else:
             self.set(sid, new)
         return self. states[sid]
```

# **LLMGateway (ties Services→Provider)**

```
# services/llm gateway.py
from typing import Tuple
from domain.models import PromptBundle
from llm providers.base import ChatRequest, ChatMessage, LLMClient
class LLMGateway:
    def __init__(self, client: LLMClient, default_model: str):
        self.client = client
        self.model = default model
    def generate(self, bundle: PromptBundle) -> Tuple[str, dict]:
        reg = ChatRequest(
            model=self.model,
            messages=[
                ChatMessage(role="system", content=bundle.system),
                ChatMessage(role="user", content=bundle.user),
            extra={"temperature": 0.2}
        resp = self.client.chat(req)
```

# 3) Presentation Layer

## A) Optimistic Progressive Markdown Parsing (OPMP)

Goal: render as tokens stream in (SSE), while staying robust to malformed Markdown.

#### Algorithm (stream handler):

- 1. Maintain a token buffer and a parse cursor.
- 2. As chunks arrive:
- 3. Append to buffer.
- 4. Try to parse *only the new suffix* with a tolerant parser.
- 5. Close any **open constructs optimistically** (tables, lists, fenced code) for rendering; mark them as **tentative**.
- 6. If later chunks fix structure (e.g., closing ```), **reconcile** and re-render the affected region.
- 7. Expose **checkpoints** (e.g., after headings, paragraph end, or fenced code fence) to minimize reflows.

#### Server streaming endpoint (FastAPI):

```
# presentation/http stream.py
from fastapi import APIRouter
from fastapi.responses import StreamingResponse
from services.core logic import CoreLogicService
from domain.models import TurnInput
router = APIRouter()
@router.post("/chat/stream")
def chat stream(payload: dict):
    svc: CoreLogicService = router.svc # injected at startup
    turn = TurnInput(user text=payload["query"], attachments=payload.get("attac
    def gen():
        # call the llm provider streaming directly for OPMP
        bundle = svc.prompt.build(turn, svc.retriever.retrieve(turn))
        req = svc.llm. to request(bundle) # or expose a stream() method
        for chunk in svc.llm.client.stream(reg):
            yield f"data: {chunk.model dump json()}\n\n"
    return StreamingResponse(gen(), media type="text/event-stream")
```

#### Client-side OPMP (pseudo):

- Maintain renderState.
- On each SSE delta:
- buffer += delta

- render(partialParse(buffer))
- If parser detects an unmatched code fence/table: render with a ghost closing fence; mark as tentative.
- On reconciliation: replace tentative blocks with finalized blocks.

## B) Data Export

• Export the final **TurnOutput.markdown** to multiple formats.

```
# presentation/exports.py
from domain.models import TurnOutput
class Exporter:
    def to markdown(self, out: TurnOutput) -> str:
        return out.markdown
    def to json(self, out: TurnOutput) -> dict:
        return {"markdown": out.markdown, "usage": out.usage, "meta": out.meta}
    def to csv(self, out: TurnOutput) -> str:
        # trivial example: split headings/paragraphs
        import csv, io, re
        rows = []
        for block in re.split(r"\n\s*\n", out.markdown.strip()):
            rows.append([block.replace("\n","\\n")[:32000]])
        buf = io.StringIO()
        csv.writer(buf).writerows(rows)
        return buf.getvalue()
    # For PDF/HTML: run markdown-it/MD to HTML then to PDF via wkhtmltopdf/Weas
```

# Request Flow (Sequence)

```
sequenceDiagram
 participant UI as Presentation (UI/HTTP)
 participant CLS as CoreLogicService
 participant IDS as InputDataHandleService
 participant RS as RetrievalService
 participant PS as PromptService
 participant LG as LLMGateway
 participant LP as LLM Provider
 UI->>CLS: turn(query)
 CLS->>IDS: normalize(query)
 IDS-->>CLS: normalized input
 CLS->>RS: retrieve(input)
 RS-->>CLS: Evidence(chunks,citations)
 CLS->>PS: build(input, evidence)
 PS-->>CLS: PromptBundle(system,user,context)
 CLS->>LG: generate(bundle)
 LG->>LP: chat/stream (OpenAI-compatible)
 LP-->>LG: tokens/usage
 LG-->>CLS: markdown, usage
```

```
CLS-->>UI: stream tokens
UI->>UI: OPMP partial parse & render
UI->>UI: Export on demand (md/json/csv/pdf)
```

# FastAPI wiring (minimal)

```
# main.py
from fastapi import FastAPI
from llm providers.openai compat import OpenAICompatClient
from services.llm gateway import LLMGateway
from services.core logic import CoreLogicService
from services.prompt service import PromptService
from services.retrieval service import RetrievalService
from services.input data service import InputDataHandleService
from services.state transition service import StateTransitionService
from presentation.http stream import router as stream router
def build app():
    app = FastAPI()
    # Choose one provider at deploy-time:
    client = OpenAICompatClient(base url="http://localhost:11434")
                                                                      # Ollama
    llm = LLMGateway(client, default model="llama3:8b-instruct")
    retriever = RetrievalService(store=YourVectorStore())
                                                                       # impl el
    svc = CoreLogicService(
        prompt=PromptService(),
        retriever=retriever,
        state=StateTransitionService(),
        input svc=InputDataHandleService(),
        llm=llm
    stream router.svc = svc
    app.include router(stream router, prefix="/api")
    return app
app = build app()
```

# Testing strategy (quick hits)

- **Unit**: PromptService (context assembly), StateTransitionService (legal transitions), RetrievalService (rank/recall), LLMGateway (mock provider).
- **Contract**: One test suite per **OpenAI-compatible** endpoint (Ollama/vLLM/llama.cpp) asserting JSON schema and streaming SSE conformance.
- **OPMP**: snapshot tests on progressively longer token streams (tables, code fences, nested lists).
- Exports: golden files for md/json/csv; visual diff for PDF.

## Where to extend

- Tool-calling (function calling) in LLMGateway by passing tools via PromptBundle.tools.
- Caching: add infra/cache.py (e.g., Redis) to memoize retrieval & partial prompts.
- Telemetry: usage tokens + latencies to infra/metrics.py (OpenTelemetry).
- Guardrails: add safety filters in InputDataHandleService.

If you'd like, I can drop this into a **ready-to-run skeleton repo** (with FastAPI, a minimal OPMP web client, and a mock retrieval adapter) or tailor the retrieval adapter to **Milvus + DuckDB** like you typically use.