MDAgent Document.

Absolutely! I'd be glad to help you design a multi-agent AI system. To get started, I'll need some details about your requirements and goals for the system. Here are some questions to guide us:

A Purpose and Goals:

- What is the primary goal of the system? (e.g., customer support, resource optimization, content generation)
- Are there specific problems or tasks you want the agents to solve?

Let's analyze the purpose and goals of the **Medical Decision-Making Agents (MDAgents) framework** based on the content provided. Here's a breakdown to address your questions:

Primary Goal of the System

The primary goal of the **MDAgents framework** is to **assist in medical decision-making** by processing medical queries and performing the following steps:

- 1. Medical Complexity Check
- 2. Recruitment of appropriate teams
- 3. Analysis and Synthesis of data
- 4. **Final Decision** for solving medical problems.

This system is particularly designed to **manage complexity** by distributing cases to the appropriate levels of expertise (e.g., Primary Care Clinicians, Multidisciplinary Teams, or Integrated Care Teams).

Specific Problems or Tasks the Agents Solve

1. Handling Medical Queries:

The system interprets diverse medical queries involving **diagnosis**, **differential diagnosis**, **and reasoning** using medical knowledge.

2. Complexity Check:

The system determines the complexity of a medical case (low, moderate, or high).

- Low Complexity: A Primary Care Clinician (PCC) handles simpler tasks.
- Moderate Complexity: A Multidisciplinary Team (MDT) collaboratively discusses the case.
- High Complexity: An Integrated Care Team (ICT) performs deep analysis and generates detailed reports.

3. Medical Problem Solving:

Examples of tasks include:

- Determining a correct diagnosis for a patient.
- o Prioritizing possible differential diagnoses.
- Reasoning through complex, multi-modal information like imaging and pathology results.

0

B. Agents' Roles:

- Do you already have an idea of the types of agents you want in the system?
 (e.g., a recommendation agent, a data analysis agent, etc.)
- Should the agents specialize in different tasks, or would you like redundancy for resilience?

Let's align the **agents' roles** based on the **MDAgents framework** presented in the diagram and provided materials.

Types of Agents in the System

The framework already implies a multi-agent setup where agents handle different levels of complexity and tasks. Here's a breakdown:

1. Primary Care Clinician (PCC) Agent:

- o Role: Handles low-complexity cases.
- Task: Provides direct answers to straightforward medical queries using basic medical knowledge and prompting.

2. Multidisciplinary Team (MDT) Agent:

- Role: Solves moderate-complexity cases through collaborative discussion.
- Task: Involves multiple agents interacting to analyze medical queries and exchange ideas (M-turns and N-rounds).

3. Integrated Care Team (ICT) Agent:

• Role: Focuses on **high-complexity** cases requiring advanced reasoning.

 Task: Performs in-depth analysis, generates detailed reports, and synthesizes findings across specialized agents or teams.

Specialization vs. Redundancy

Specialization:

- Agents should specialize in specific tasks based on case complexity (e.g., PCC for simple cases, MDT for discussions, ICT for deep analysis).
- This specialization ensures efficiency and faster decision-making.

Redundancy for Resilience:

- For high-risk or critical cases, you might introduce redundancy in the system where multiple agents cross-check solutions to minimize errors.
- This would ensure resilience and reliability in medical decisions.

Suggested Agent Roles

To summarize, the roles can be:

- 1. **Recommendation Agent:** Suggests initial diagnoses or actions for low-complexity cases.
- 2. Collaboration Agent: Facilitates discussions among MDT agents.
- Data Analysis Agent: Processes imaging, pathology, and other multi-modal data for complex cases.
- 4. **Report Generation Agent:** Synthesizes findings and generates detailed reports for ICT-level cases.

0

C. Target Audience and Environment:

- Who will use this system, and in what context? (e.g., internal business tools, end-user services, automation systems)
- o Is the system operating in real-time, batch processing, or another mode?

Let's determine the **target audience** and **operating environment** based on the **MDAgents framework** materials provided.

Target Audience

The system is designed for **healthcare professionals** and teams in a **clinical or medical environment**. Specifically:

1. Primary Care Clinicians (PCC):

- Handle simple, low-complexity cases.
- Likely to use this system as an internal diagnostic tool for rapid decision-making.

2. Multidisciplinary Teams (MDT):

- o Consist of specialists collaborating to solve moderate-complexity cases.
- Use the system for **collaborative discussions** and cross-disciplinary input.

3. Integrated Care Teams (ICT):

- A team of experts handling highly complex cases.
- Utilize the system for data analysis, report generation, and synthesis of findings.

Context of Use

• Clinical Decision Support:

- The system serves as a **decision-support tool** in hospitals, clinics, or other healthcare settings.
- It processes medical queries to aid diagnosis, differential diagnosis, and reasoning.

• Internal Medical Tools:

 The system functions as an internal tool for doctors, specialists, and care teams rather than end-users (patients).

Operating Mode

1. Real-Time Processing:

 For low-complexity cases handled by PCC agents, the system likely provides immediate prompts or suggestions in real time.

2. Near Real-Time Collaboration:

 Moderate-complexity cases require interaction among MDT agents. This would involve near real-time discussions (M-turns and N-rounds).

3. Batch Processing for High-Complexity Cases:

- High-complexity cases processed by ICT agents involve:
 - In-depth analysis of data (e.g., imaging, pathology).
 - Report generation, which could operate in a batch processing mode due to the complexity of data synthesis.

Summary

- Target Audience: Healthcare professionals (PCC, MDT, ICT) in clinical settings.
- Context: Internal tools for medical decision-making and collaborative problem-solving.
- Operating Mode:
 - o Real-time for simple tasks.
 - Near real-time for collaboration.
 - Batch processing for complex data analysis and reporting.

Does this match your understanding, or would you like me to clarify further on any point?

0

D. Data and Resources:

- What kind of data will the agents work with? (e.g., text, images, structured data)
- o Do the agents need access to external APIs or databases?

Let's define the **data and resources** that the agents will work with, based on the **MDAgents framework** and your query.

Types of Data

The agents will work with various types of medical data depending on the case complexity and the level of reasoning required:

1. Text Data:

- Medical histories, symptoms, and notes (e.g., "19-year-old male with hypopigmented skin...").
- o Differential diagnosis lists (e.g., probabilities for PSVT, anemia, etc.).
- Clinical descriptions and reasoning prompts.

2. Image Data:

- Medical images such as X-rays, pathology slides, or MRIs.
- Example in the diagram: Circle on an image requiring reasoning about "abnormal mitotic figures."

3. Structured Data:

- Probabilities and numerical data for differential diagnosis (e.g., PSVT: 0.22, Panic attack: 0.14).
- Lab results, vitals, and pathology metrics, likely in tabular formats.

4. Multi-Modal Data:

 A combination of text, images, and structured data for complex cases requiring advanced reasoning.

Access to External APIs or Databases

Yes, agents will likely require access to external systems for:

1. Medical Knowledge Bases:

 APIs for clinical guidelines, diagnostic pathways, and up-to-date medical research (e.g., **PubMed**, medical ontologies).

2. Electronic Health Records (EHR):

o To retrieve patient history, lab results, and past diagnoses.

3. Imaging Databases:

• Access to medical imaging systems (e.g., PACS systems for radiology).

4. Decision Support Tools:

 External APIs for clinical calculators, medical risk scoring, or Al-assisted image analysis tools.

5. Data Storage Systems:

 For storing and retrieving generated reports, collaborative logs, and analysis outputs.

Summary

- Types of Data: Text, images, structured data, and multi-modal data.
- **Resource Access:** External APIs (medical knowledge, imaging tools) and databases (EHRs, structured data repositories).

E. Integration and Communication:

- Should the agents communicate with each other, and if so, how? (e.g., message-passing, shared memory, hierarchical coordination)
- Will they need to interact with other systems or human users?

Let's align the **integration and communication** strategies for the agents based on the **MDAgents framework**.

Agent-to-Agent Communication

Yes, the agents need to communicate with each other to manage **different levels of complexity** effectively. The communication can follow these patterns:

1. Hierarchical Coordination:

- \circ Agents operate at different complexity levels (PCC \rightarrow MDT \rightarrow ICT).
- Low-complexity queries are first handled by the Primary Care Clinician (PCC) agent.
- If unresolved, the query is escalated to the **Multidisciplinary Team (MDT)** agents, who collaborate to analyze the problem.
- For high-complexity cases, the problem is forwarded to the Integrated Care Team (ICT) agents, who perform in-depth reasoning and synthesis.
- 2. Flow: PCC \rightarrow MDT \rightarrow ICT.

3. Collaborative Communication:

- Within the **MDT** and **ICT levels**, agents interact through:
 - **Message-Passing:** Agents exchange diagnostic information, reasoning updates, and insights in **M-turns** and **N-rounds** (as shown in the MDT section).
 - Shared Logs/Memory: Collaborative discussions can be recorded in a shared log for transparency and future reference.
- This ensures multiple agents contribute their specialized knowledge to solve complex problems.

Interaction with Other Systems

Yes, the agents need to integrate with **external systems** to retrieve and process medical data:

1. Electronic Health Records (EHRs):

- o Access to patient history, symptoms, vitals, and past diagnoses.
- 2. Medical Imaging Systems:
 - Integration with PACS systems to analyze radiology images.
- 3. Knowledge Databases/APIs:
 - o Clinical guidelines, medical ontologies, and diagnostic tools.
- 4. Report Storage Systems:
 - Generated reports and analysis logs need to be stored and accessed by healthcare teams.

Interaction with Human Users

Yes, the system is designed to **assist healthcare professionals**, so human-agent interaction is critical:

- 1. Primary Care Clinicians (PCC):
 - Receive direct answers or suggestions for low-complexity cases.
- 2. Multidisciplinary Teams (MDT):
 - Collaborate through agents to support clinical decision-making.
- 3. Integrated Care Teams (ICT):
 - o Review synthesized reports and final decisions from the system.

Summary

1. Agent-to-Agent Communication:

- Hierarchical coordination with message-passing and shared logs/memory.
- 2. System Integration:
 - o Agents connect to EHRs, imaging systems, and medical knowledge APIs.
- 3. Human Interaction:
 - Agents assist clinicians and teams with diagnostic support, collaborative discussions, and final decision synthesis.

F. Constraints and Requirements:

 Are there any technical, ethical, or regulatory constraints? (e.g., latency limits, privacy concerns, resource restrictions)

Let's address the **constraints and requirements** for the system, focusing on the **MDAgents framework** and its use in a medical context.

1. Technical Constraints

Latency Limits:

- Real-time or near-real-time responses are essential for low-complexity cases (PCC).
- For moderate to high-complexity cases (MDT, ICT), a slight delay is acceptable due to collaborative discussions and detailed report generation.

Resource Limitations:

- High-complexity tasks involving multi-modal data (e.g., images + text) may require significant computational resources (e.g., GPU processing for imaging).
- Scalability is crucial to handle a growing volume of medical gueries.

• Integration Requirements:

- Agents need seamless integration with external systems like EHRs, imaging tools, and medical APIs.
- Ensuring compatibility with existing hospital infrastructure and databases is key.

2. Ethical Constraints

Patient Privacy and Confidentiality:

- Compliance with HIPAA (in the U.S.) or GDPR (in Europe) to protect sensitive patient data.
- Agents must anonymize or encrypt data when transferring or storing patient information.

• Bias and Fairness:

- The system should be trained and validated on diverse datasets to avoid biases in diagnosis or recommendations.
- Regular audits are required to ensure fairness across demographic groups.

• Explainability and Transparency:

- Clinicians must understand the reasoning behind the agents' decisions (e.g., diagnostic suggestions).
- Logs or audit trails of decision-making processes are essential for accountability.

3. Regulatory Constraints

• Medical Device Regulations:

 If the system influences clinical decisions, it may need certification as a medical device (e.g., FDA approval in the U.S., CE marking in Europe).

• Data Handling Compliance:

- Strict adherence to regulations regarding storage, transfer, and processing of medical data.
- Ensuring data security with robust encryption, access controls, and regular monitoring.

Summary

1. Technical Constraints:

 Real-time latency for simple cases, computational resources for complex tasks, and smooth system integration.

2. Ethical Constraints:

• Ensuring **privacy**, **fairness**, and **explainability** while avoiding biases.

3. Regulatory Constraints:

 Compliance with HIPAA/GDPR, and medical device certification for clinical use.

Once I have this information, I can propose a high-level architecture with specific agent roles, workflows, and communication mechanisms. If you'd like, I can also create diagrams to visually represent the system. Let me know how you'd like to proceed!