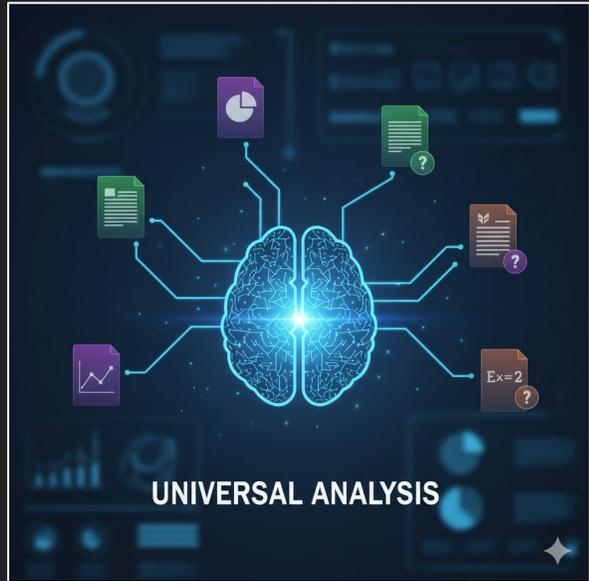


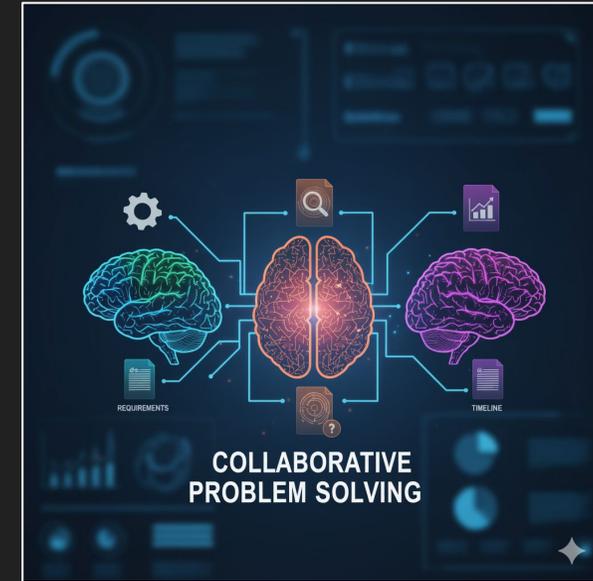
Understanding Multi-Agent Systems

From “One” to “Many”



Single Agent System:

One “brain”, one perspective, one approach



Multi-Agent System:

Multiple “brains” with different perspectives and specializations

Common Multi-Agent Design Patterns



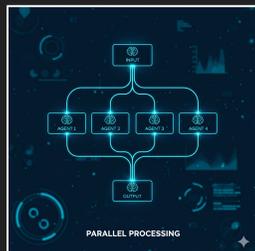
Sequential Systems



Hierarchical Systems



Crowdsourcing Systems



Parallel Systems



Reviewer Systems



Hybrid Systems

Pattern 1: Task Decomposition (Sequential System)



SEQUENTIAL SYSTEM

Problem it Solves:

- Large, complex tasks overwhelm single agents
- Context windows have limits
- Quality degrades with task complexity

How it works

- Break complex task into smaller, logical subtasks
- Each agent specializes in one subtask
- Output from Agent 1 becomes input for Agent 2
- Each agent maintains focus and expertise, and so on

Key Consideration

- Define well-contained, isolated tasks with singular focus - avoid creating dependencies that could cascade errors

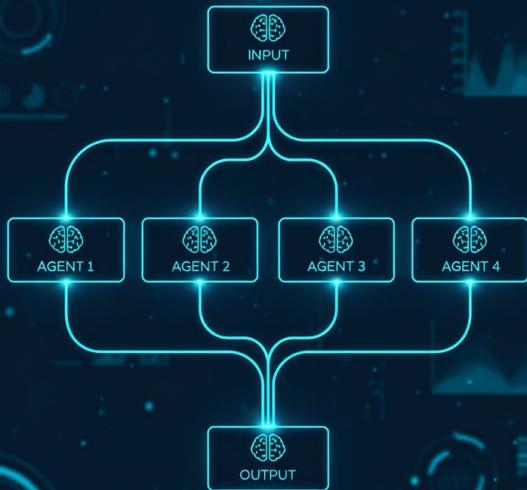
HEOR Example:

Literature review →

Data extraction →

Quality assessment →

Evidence synthesis



PARALLEL PROCESSING

Pattern 2: Independent Validation (Parallel Processing)

Problem it Solves:

- Single agent responses lack confidence indicators
- No way to assess reliability without human review
- Difficult to identify potential errors or biases

How it works

- Multiple agents tackle identical tasks independently
- Each agent uses different approaches/prompts
- Compare outputs to assess confidence and identify discrepancies
- Agreement = higher confidence; disagreement = flag for review

Key Consideration

"Use different LLMs or significantly different approaches to the same problem - avoid identical setups that would produce identical errors"

HEOR Example:

Two agents independently assess same clinical study for bias risk

Pattern 3: Conflict Resolution (Reviewer System)



Problem it Solves:

When parallel agents disagree, how do you decide which is correct?
Human review of all disagreements defeats the purpose of automation
Need systematic way to resolve conflicts and make decisions

How it works

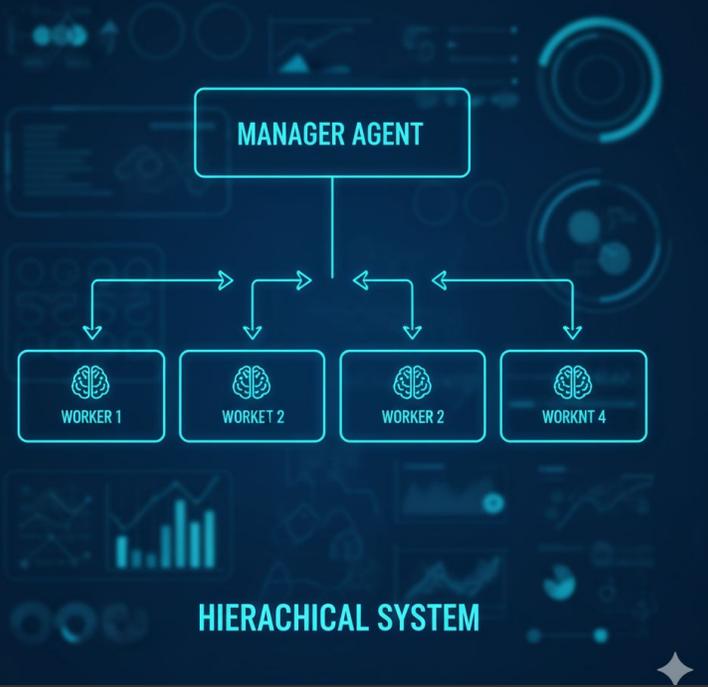
Third agent acts as adjudicator for disagreements
Reviews original data plus both conflicting outputs
Makes final decision or escalates to human review
Focused solely on decision-making, not task execution

Key Consideration

"Carefully define tie-breaker role and constraints - the reviewer agent should have different instructions than task execution agents"

HEOR Example:

Two agents disagree on whether a study meets inclusion criteria for systematic review



Pattern 4: Hierarchical (Manager/Worker System)

Problem it Solves:

- Complex projects need coordination and task distribution
- Different subtasks require different expertise levels
- Need oversight and quality control across multiple work streams
- Resource allocation and prioritization decisions

HEOR Example:

Manager agent coordinates HEM development by directing **research assistant** to gather disease information, sharing findings with **concept developer**

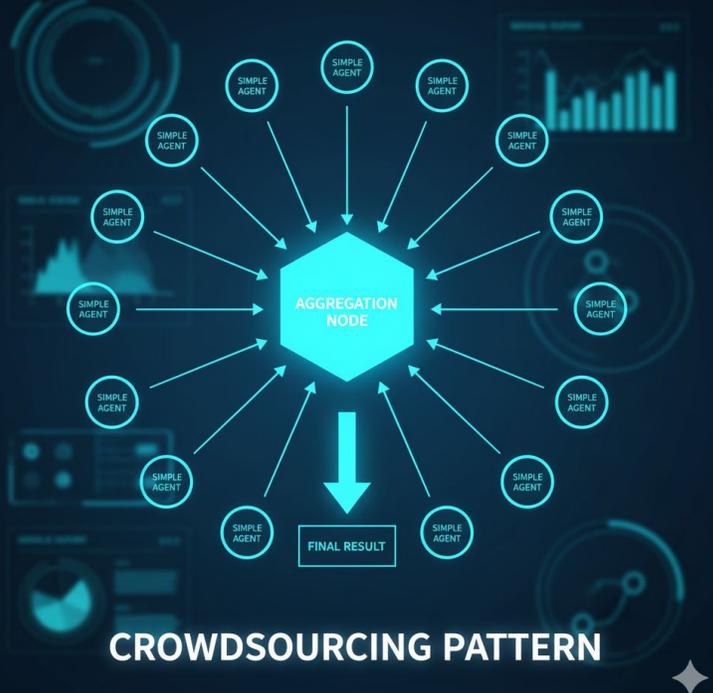
How it works

- Manager agent coordinates overall workflow and assigns tasks
- Worker agents execute specialized tasks based on assignments
- Two-way communication: manager gives instructions, workers provide updates
- Manager synthesizes results and makes high-level decisions

Key Consideration

Manager agent needs different skills than workers - focus on coordination, decision-making, and synthesis rather than detailed task execution"

Pattern 5: Crowdsourcing (Collective Intelligence)



CROWDSOURCING PATTERN

Problem it Solves:

Large-scale data processing tasks that are tedious for sophisticated agents
Cost-effective approach when many simple judgments are needed
Need for statistical confidence through volume of simple assessments
Reducing individual agent bias through collective decision-making

How it works

Many simple agents each perform focused, limited tasks
Each agent operates independently with basic instructions
Central aggregator combines all individual contributions
Final output emerges from collective patterns, voting, or statistical aggregation

Key Consideration

Individual agents should be simple and focused - complexity comes from aggregation, not from sophisticated individual reasoning"

HEOR Example:

Fifteen agents each evaluate the same economic model's "assumption realism: Reasonable/Questionable/Unrealistic"



HYBRID SYSTEM

Pattern 6: Hybrid Networks (Combined Approaches)

Problem it Solves:

Most HEOR projects require multiple types of coordination and validation
No single pattern addresses all workflow needs
Different phases of analysis benefit from different multi-agent approaches
Need flexibility to adapt pattern to specific project requirements

How it works

Combines multiple patterns within one integrated system
Different workflow stages use different multi-agent approaches
Seamless transitions between patterns as project progresses
Flexible architecture adapts to changing analytical needs

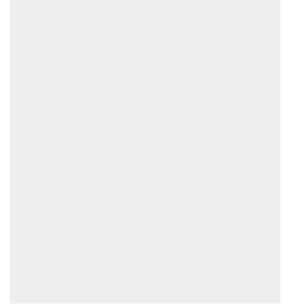
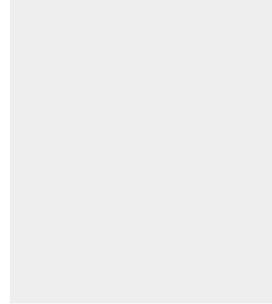
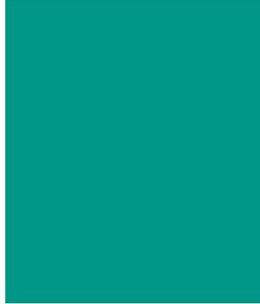
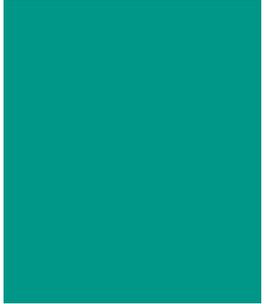
Key Consideration

Design clear transition points between patterns - avoid complexity that obscures rather than improves the workflow

HEOR Example:

Two agents disagree on whether a study meets inclusion criteria for systematic review

Multi-Agent Systems: Key Considerations



Improved Quality: Multiple perspectives and validation reduce errors

Increased Confidence: Agreement between agents provides reliability indicators

Specialized Expertise: Each agent optimized for specific tasks

Reduced SME Burden: AI-to-AI validation before human review

Scalability: Handle complex, large-scale analyses systematically

Increased Complexity: More components to design, test, and maintain

Slower Processing: Sequential dependencies and validation loops take time

Coordination Overhead: Managing agent interactions and data flow

Debugging Challenges: Harder to identify where errors originate

Higher Costs: Multiple API calls and computational resources

Multi-agent systems require significant development, debugging and monitoring complexity in return for potentially higher quality outputs