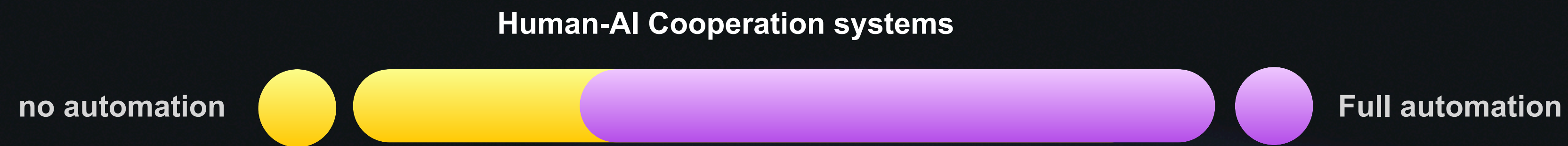


Human-AI Cooperation System

Personal Learning Path Advisor

Human-AI Cooperation

The capabilities of artificial intelligence (AI) are continuously increasing. Humans can give a growing number of decision-making tasks to automated systems.



Q1:

How to
evaluate?

Q2:

What role do
humans
play?

Q3:

How to
design?

Not the accuracy of AI, But **decision quality of the entire Human-AI system**



The doctor and the CD recognition AI
work together to diagnose the patient [1]

90% accuracy AI

VS

70% accuracy AI

Human's perceptions

Human's behaviours

When an AI system makes a bad decision, should the responsibility lie with the algorithm developer, the user, or the machine itself?

For cooperation system,

Human take the major responsibility!

Understanding

Trusting

Independent

Automation bias

Conformist

How to design such system? — a Minimum Viable Product (MVP)

Personal Learning Path Advisor (PLPA)

This role or tool is designed to guide learners through the complexities of online education, ensuring that they receive the most relevant and effective learning experience tailored to their needs.

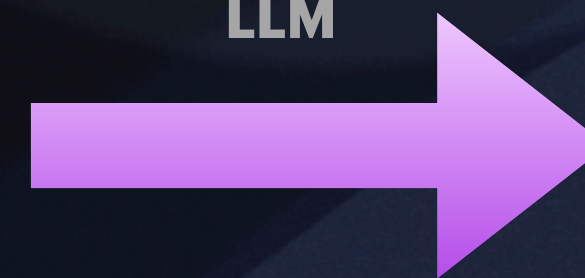
Personalisation

A PLPA customizes learning experiences to match individual preferences, learning speeds, and interests, ensuring that learners engage with content that is most relevant and beneficial to their personal and professional goals.

Efficiency

The PLPA helps learners navigate the vast array of available courses, identifying and recommending the most effective learning paths.

LLM



Evaluate

**Motivation
and
Engagement**

Workflow

Current stage



1. Personalization Parameters
2. Technical Requirements
3. Course Platform

Requirement Gathering

1. Data Processing
2. Agent Prompt
3. Retrieval-Augmented Generation

Data collection, Agent design

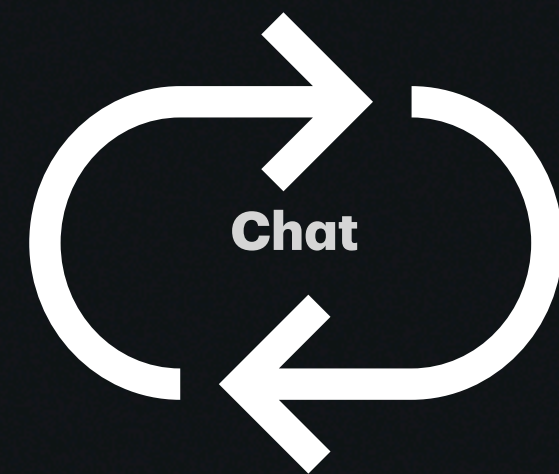
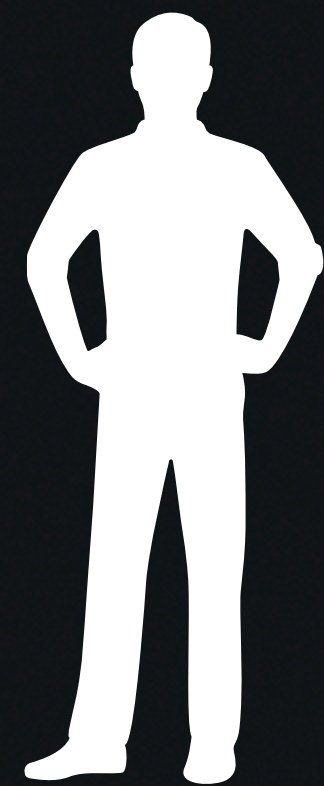
1. Agent integrating
2. User interface

Prototype Development

1. Real users test to gather feedback
2. Deployment

User Testing Iteration

Framework



**Personal Learning Path Advisor
Agent Group**

Project Demo

User test link: [path_advisor_user_test](#)

The image is a composite of two side-by-side screenshots. The left screenshot shows a code editor with Python code for initializing two agents, 'agent_survey' and 'agent_recommender'. The code includes system messages that define the agents' roles as a 'Learning Path Advisor' and a 'Learning Path Recommender'. The right screenshot shows a web application interface for 'PathFinder', a 'Learning Path Advisor'. The interface has a header with the name 'PathFinder' and a description 'your dedicated Learning Path Advisor here.'. Below this is a form with four input fields: 'Model' (set to 'gpt-4'), 'OpenAI API Key', 'Azure OpenAI API Key', and 'Base url'. There are buttons for 'Retry', 'Undo', and 'Clear' below the form. A 'Submit' button is on the right. Below the form is a chatbot interface with a message history and a 'Submit' button. The chatbot's response, based on the code, provides course recommendations for someone with 8 hours a week to spare, listing three courses: 'Culture-Driven Team Building', 'Modern Masterpieces of World Literature', and 'World Music Cultures: How Music Shapes Our Lives'. The code on the left includes system messages for the agents, defining their roles and the context of the learning path advisor.

Findings

Tech

- Observing machine behaviour made me reflect more on the nature of human thinking. (More advanced)
Human: (Reasoning + Acting) ; LLM (Searching) —> (Reasoning) + (Acting) + (Observe)
- Information cocoon (hidden pattern in LLM)
Narrow AI agent, Narrow AI knowledge -> info update

Humanity

- whether PLPAs empower learners by offering personalized choices or create a dependence that might limit their ability to self-direct their learning journey.
- how PLPAs might change the goals of education. Are they merely optimizing for efficiency and marketable skills, or do they also support broader educational values such as critical thinking, creativity, and personal growth?
- How does the integration of AI in learning environments shape our understanding of human learning?
- Do personalized paths lead to higher motivation, or could they possibly lead to an overload of choices that paralyze some learners?

Challenges

- The **token limit** has led to the finiteness of Agent's memory, a more advanced memory storage solution may be needed such as long-term and short-term memory.
- **Agents communicate** in a completely natural language format, enhancing the model's transparency and understandability. However, this also results in higher operating costs and hinders large-scale deployment.
- A lot of **assumptions and biases**, need more **user test** or survey to ensure the user need.
- **evaluate or observe** the impact

Further Enhancement

UI & UX

User Testing

Prompt Tuning
&
Deployment