

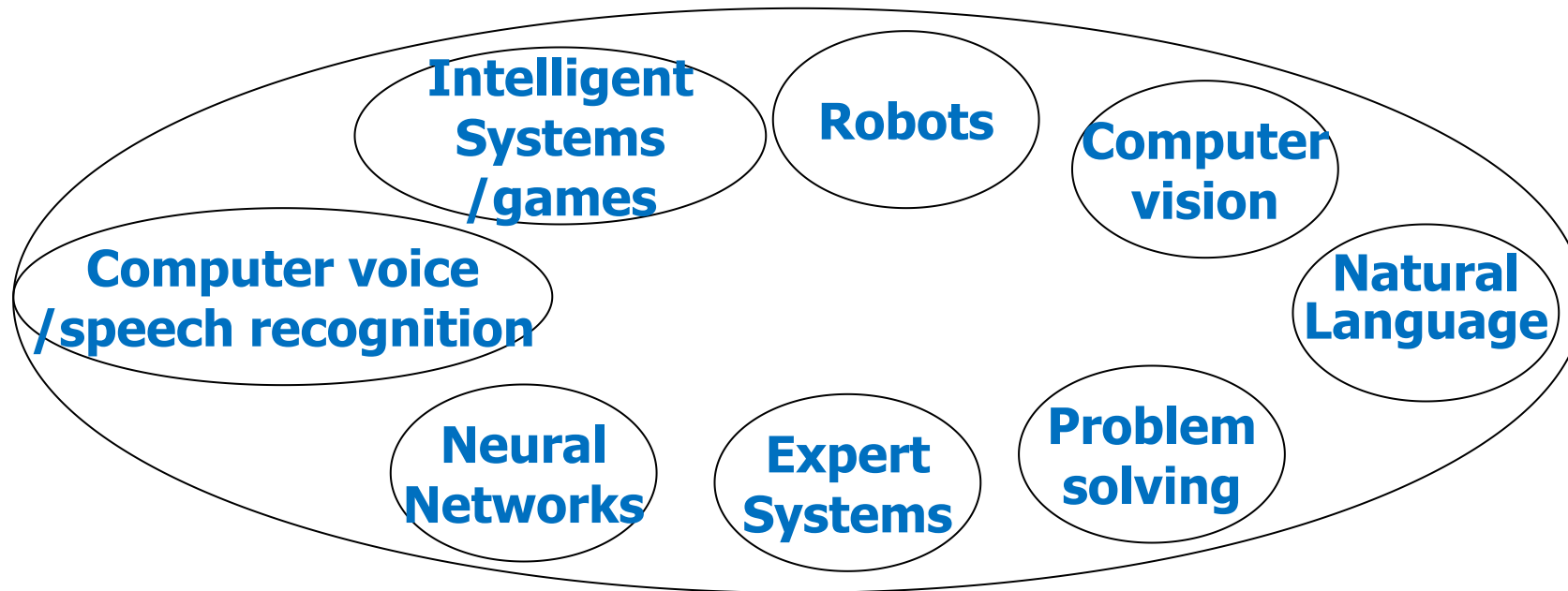
Pedagogical theories and Applications of Artificial Intelligence in Education



Gwo-Jen Hwang
**National Taiwan University of
Science and Technology**

What is Artificial Intelligence?

- Computer programs with the ability to **perceive, reason, and solve problems.**





Forms of AI applications for educational purposes

- Robots with AI technologies
 - Reasoning, image recognition, voice recognition, natural language
- Web-based intelligent tutoring systems
- Apps using AI technologies
 - AI chatbots

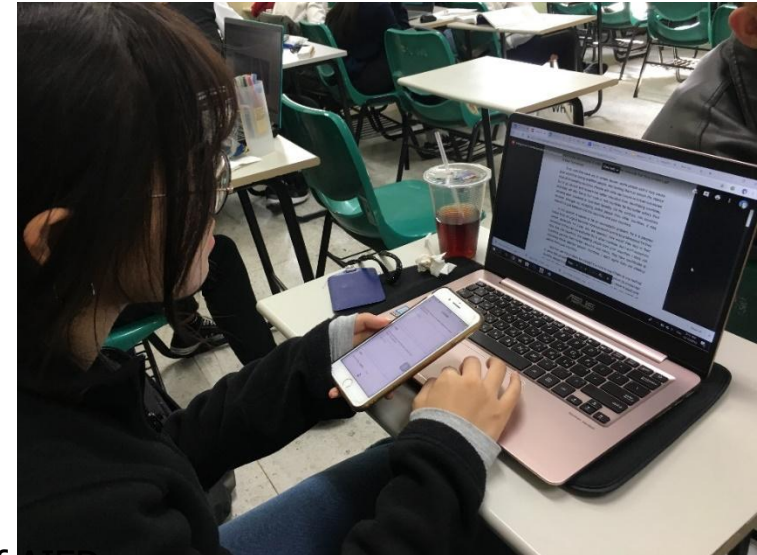
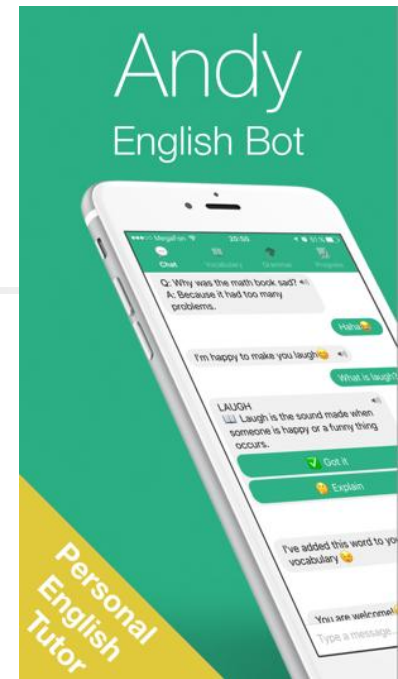
Educational robot- help autistic children learn to interact with people



Apps for language learning

■ Andy English Bot

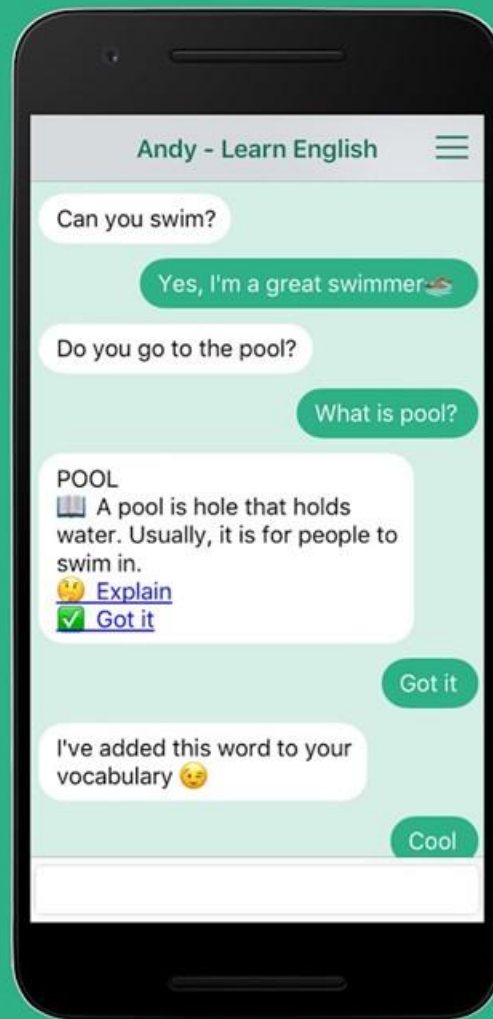
- Practice casual day-to-day interactions
- Practice asking and answering questions
- Discuss various topics
- Learn grammar
 - Grammar explanation and test
 - Corrects mistakes in messages



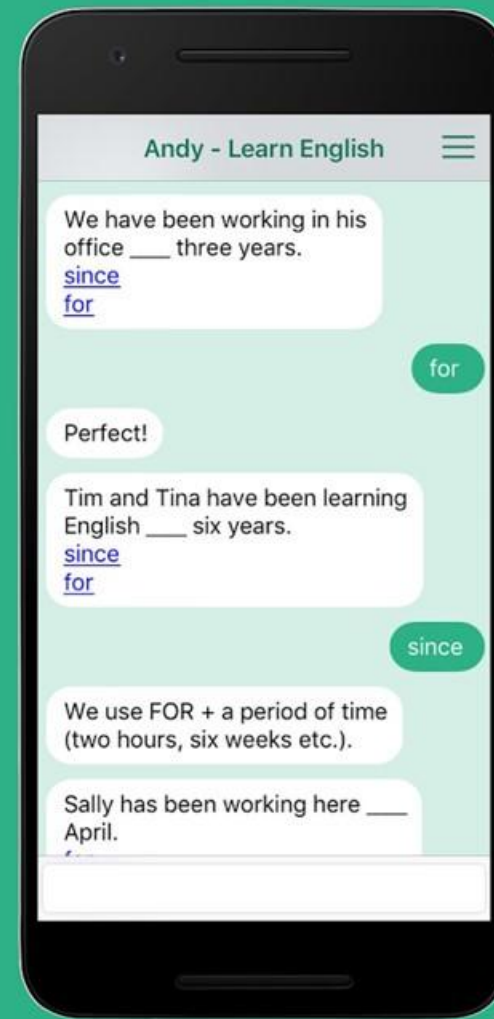
Practice real-life conversations
with a friendly robot



Learn new words and
expand your vocabulary



Take daily lessons
to learn grammar



The screenshot displays the Grammarly.com interface. On the left, a student's writing essay is shown in Chinese. The essay discusses the arrival of the Internet and its impact on communication. The text is written in Chinese characters, with some words highlighted in green. On the right, the 'Writing errors' sidebar is visible, showing a list of errors and suggestions. The sidebar includes a 'Check and improve' section with four items: 'any', 'and', 'large', and 'I'm used'. Each item has a description of the error and a suggestion for improvement. The sidebar also shows a 'Correctness' score of 68, a 'Clarity' score of 68, and a 'Delivery' score of 68. The sidebar is titled 'Writing errors:' and 'Check and improve:'. The sidebar also includes a 'Send to proofreaders' button and a 'Plagiarism' button.

Writing errors:

Check and improve:

1. Correctness: spelling, grammar, and punctuation
2. Clarity: easy to understand
3. Engagement: interesting and effective
4. Delivery: right impression to the reader

Student's writing essay

Evaluate writing performance

Performance

Text score: 68 out of 100. This score represents the quality of writing in this document. You can increase it by addressing Grammarly's suggestions.



Score

Word Count

Characters	2,398	Reading time	1 min 36 sec
Words	403	Speaking time	3 min 6 sec
Sentences	26		

Word count

Readability

Metrics compared to other Grammarly users

Word length	4.8		Above average
Sentence length	15.5		Above average
Readability score	57 ⓘ		

Readability

More opportunities to practice writing

Your text is likely to be understood by a reader who has at least a 9th-grade education (age 15). Aim for the score of at least 60-70 to ensure your text is easily readable by 80% of English speakers.

 [DOWNLOAD PDF REPORT](#)

[CLOSE](#)

形色(Shape and Color)-Identify flowers and plants by using image recognition

截圖 iPad iPhone





生成足跡

給妳的旅途做個記錄



**Learning logs recorded
in the journey**

形色展覽

共享自然之美，打造美好生活



exhibition for the findings

果蔬識別

營養價值&挑選方法全知道



nutrition of the fruit



Roles of AI in education

- **Intelligent Tutor**

- **Personalized learning guidance, support, and/or interface**
- **Most of the AI-based learning systems/apps belong to this category**

- **Intelligent Tool**

- **Assisting learners to complete learning tasks**
- **Helping learn search for, analyze and organize information (e.g., ChatGPT)**

- **Intelligent systems for learning management or policy making**

Hwang*, G. J., Xie, H., Wah, B. W., & Gašević, D. (2020). Vision, Challenges, Roles and Research Issues of Artificial Intelligence in Education. *Computers & Education: Artificial Intelligence*, 1, 100001.



I. Intelligent tutors

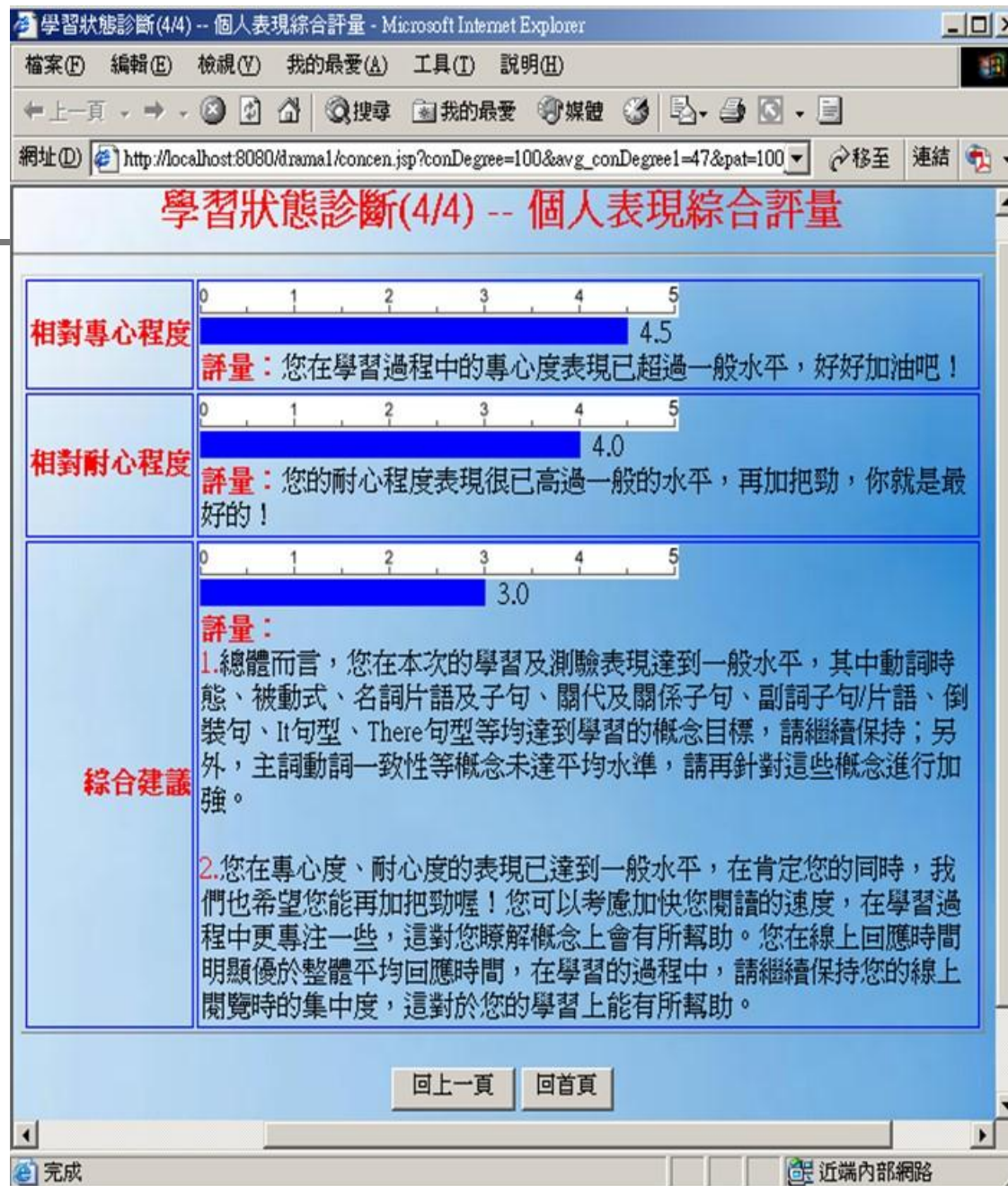
- Personalized learning content
- Personalized learning paths
- Personalized interface
- Personalized learning guidance or supports



Providing personalized suggestions based on online learning behavior analysis

- Using a fuzzy expert system to examine individual students' learning states to provide personalized guidance based on their online behaviors:
 - 學習效率 (Efficiency of Learning)
 - 學習意願 (Willingness of Learning)
 - 耐心度 (Patience)
 - 專心度 (Concentration)
 - 理解度 (Degree of comprehension)
 - 聊天或討論 (Chatting or discussing)

Gwo-Jen Hwang (1998), “A tutoring strategy supporting system for distance learning on computer networks”, *IEEE Transactions on Education*, Vol. 41, No. 4, pp. 343. (SCI & EI)





PERGAMON

Computers & Education 40 (2003) 217–235

**COMPUTERS &
EDUCATION**

www.elsevier.com/locate/compedu

A conceptual map model for developing intelligent tutoring systems[☆]

Gwo-Jen Hwang*

Information Management Department, National Chi Nan University, Pu-Li, Nan-Tou, Taiwan 545, ROC

Received 15 October 2001; accepted 14 August 2002

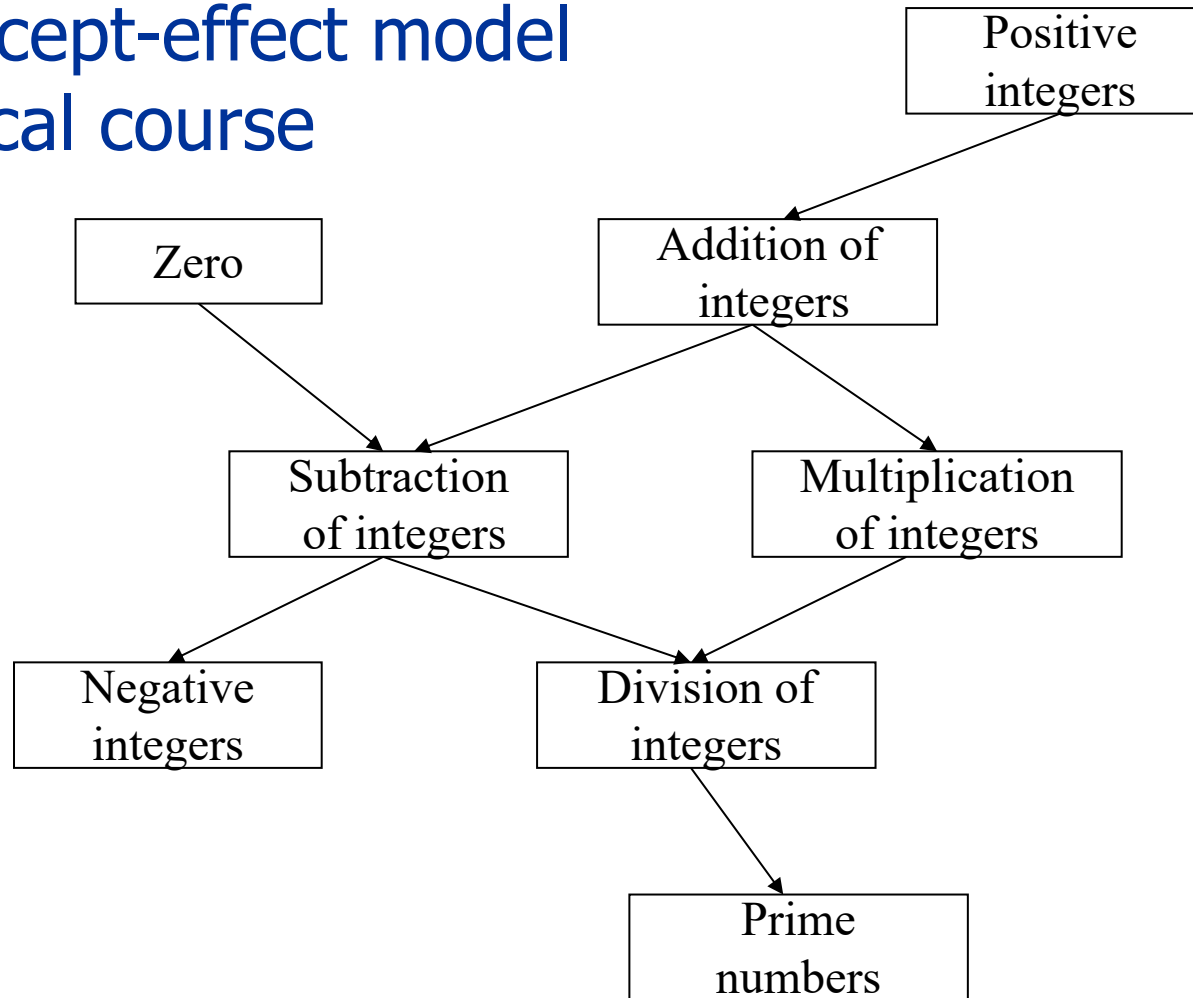
Abstract

With the recent rapid progress of computer technology, researchers have attempted to adopt artificial intelligence and use computer networks to develop computer-aided instruction systems. Meanwhile, researchers have also attempted to develop more effective programs to test and enhance the learning performance of students. However, conventional testing systems simply give students a score, and do not give them the opportunity to learn how to improve their learning performance. Students would benefit more if the test results could be analyzed and hence advice could be provided accordingly. This study proposes a conceptual map model, which provides learning suggestions by analyzing the subject materials and test results. A testing and diagnostic system is also implemented on computer networks based on the novel approach. Experimental results have demonstrated that the novel approach benefits students and deserves further investigation.

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Personalized learning problem diagnosis

Example of concept-effect model in a mathematical course



Learning path generated by the system

科目：

國小自然
國小數學
國中理化

確定

選擇班級及學號或姓名

班級：

☒ 3年5班 ☐ 3年6班 ☐ 3年7班

學號：

22

姓名：

確定

班級：3年5班 學號：22 姓名：王彥棋

經由國立既南國暨大學教學診斷系統分析
在此次考試中，你對以下概念存在問題

概念	概念認知程度解釋
位置改變量	你對此概念是了解的(了解程度=0.62)。
位移	你對此概念是不了解的(了解程度=0.44)。
運動的快慢和方向	你對此概念是非常了解的(了解程度=0.82)。
平均速度與瞬時速度	你對此概念是不了解的(了解程度=0.41)。
速度變化的快慢和方向	你對此概念是不了解的(了解程度=0.47)。
加速度	你對此概念是不了解的(了解程度=0.36)。
自由落體	你對此概念是不了解的(了解程度=0.50)。
V-t圖	你對此概念是了解的(了解程度=0.75)。
力的平衡	你對此概念是非常不了解的(了解程度=0.00)。
力矩	你對此概念是不了解的(了解程度=0.50)。
轉動平衡	你對此概念是了解的(了解程度=0.80)。

系統建議你的補救學習路徑為：
先學位置改變量 再學平均速度與瞬時速度 再學自由落體 再學V-t圖 為次佳補救 (weight值=0.45)
先學位移 再學平均速度與瞬時速度 再學自由落體 再學V-t圖 為次佳補救路徑 (v值=0.47)

綜合建議：
1.根據本系統之分析診斷，我們發覺你對概念力的平衡，的認知或了解不足
2.建議你按照的路徑重新路徑學習。

**The student's
Learning status of
each concepts**

**Recommended learning
path for the student**

Gwo-Jen Hwang (2003), "A Concept Map Model for Developing Intelligent Tutoring Systems", *Computers & Education*, Vol. 40. No. 3, pp. 217-235. (SSCI & SCI, EI)

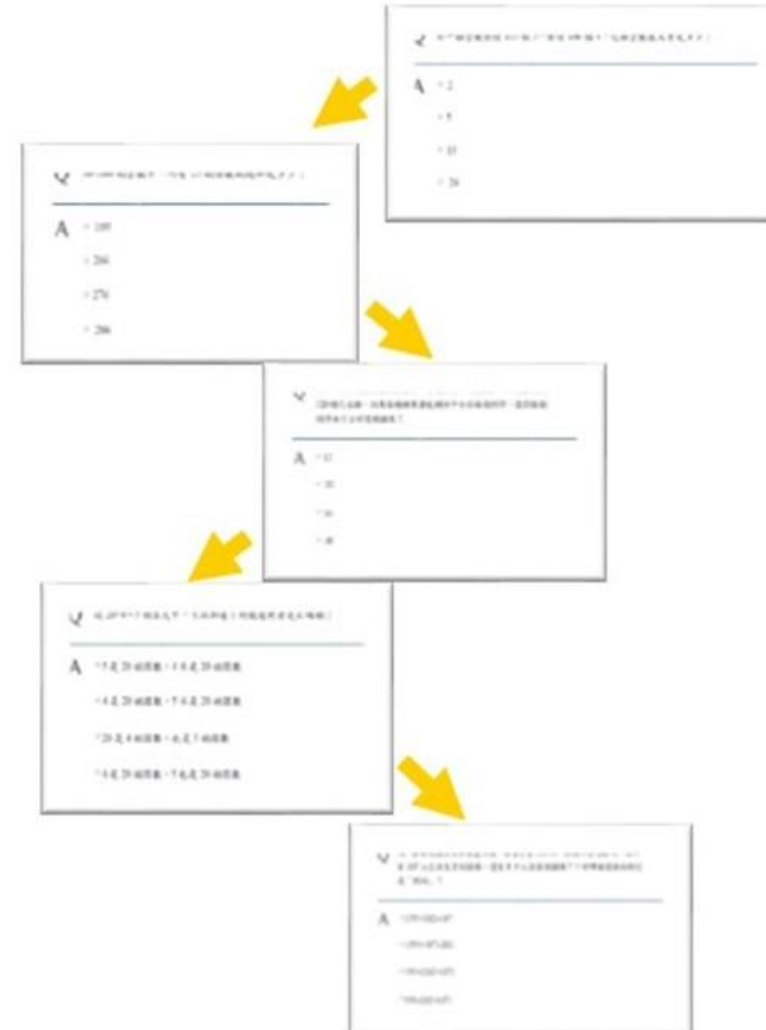
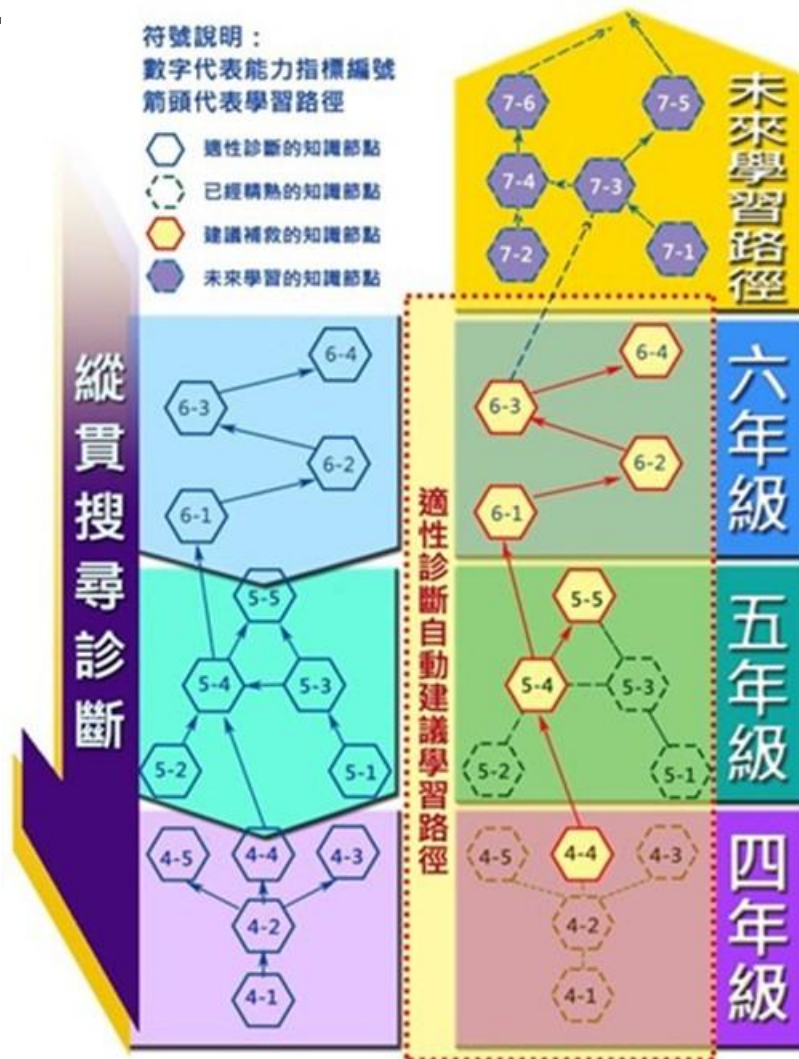
因材網-A diagnosis-based learning system in Taiwan (more than 100,000 users)



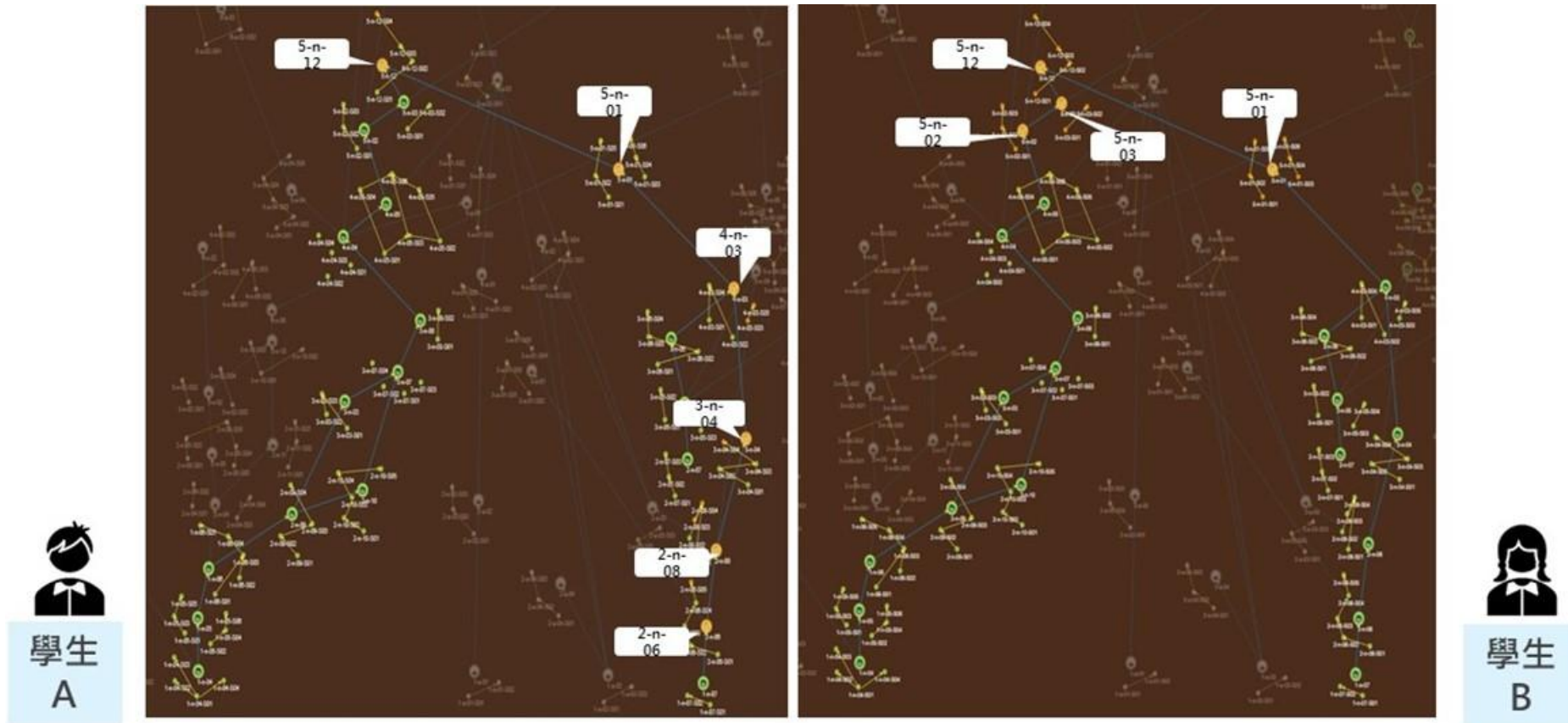
- **Providing learning content and test items for the courses in elementary and high schools.**
- **Using learning fuzzy diagnosis technologies to provide personalized learning paths.**

<https://adl.edu.tw/HomePage/home/>

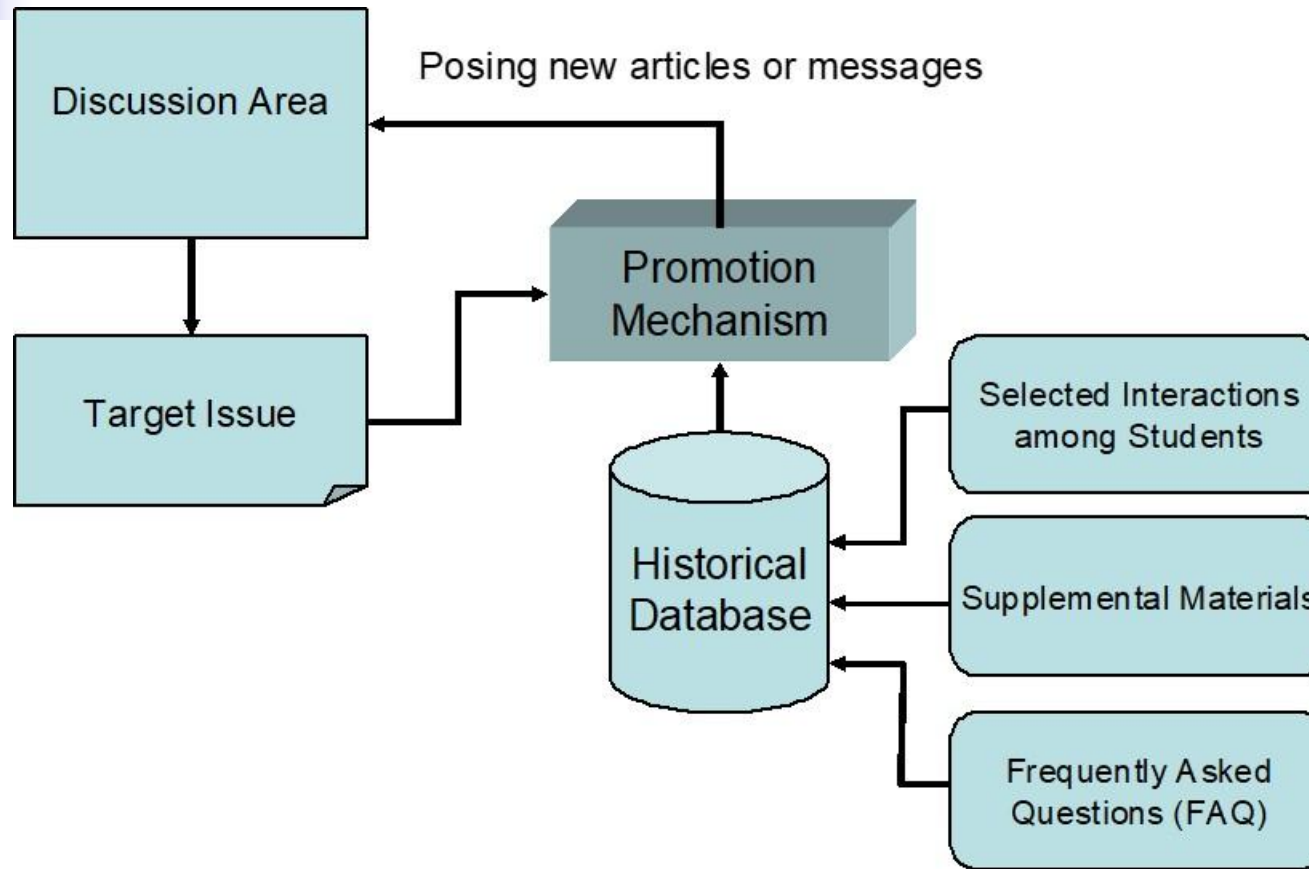
Exam learners' prior knowledge before allowing them to learn a new concept



Recommend personalized learning paths based on diagnosis results



II. Intelligent learning partners



**Virtual peers in an
online discussion forum**

Chu, H. C., Hwang*, G. J., Tsai, C. C., & Chen, N. S. (2009). An innovative approach for promoting information exchanges and sharing in a web 2.0-based learning environment. *Interactive Learning Environments*, 17(4), 311-323.



Virtual patient with natural language process and expert systems

- Provide different cases for trainees to interact with virtual patients
- Allow learners to interact with VP for history taking and physical assessment using natural language
- Provide complete laboratory and imaging results
- Guide learners to collect and analyze data from VT to make a diagnosis
- Provide immediate feedback to learners

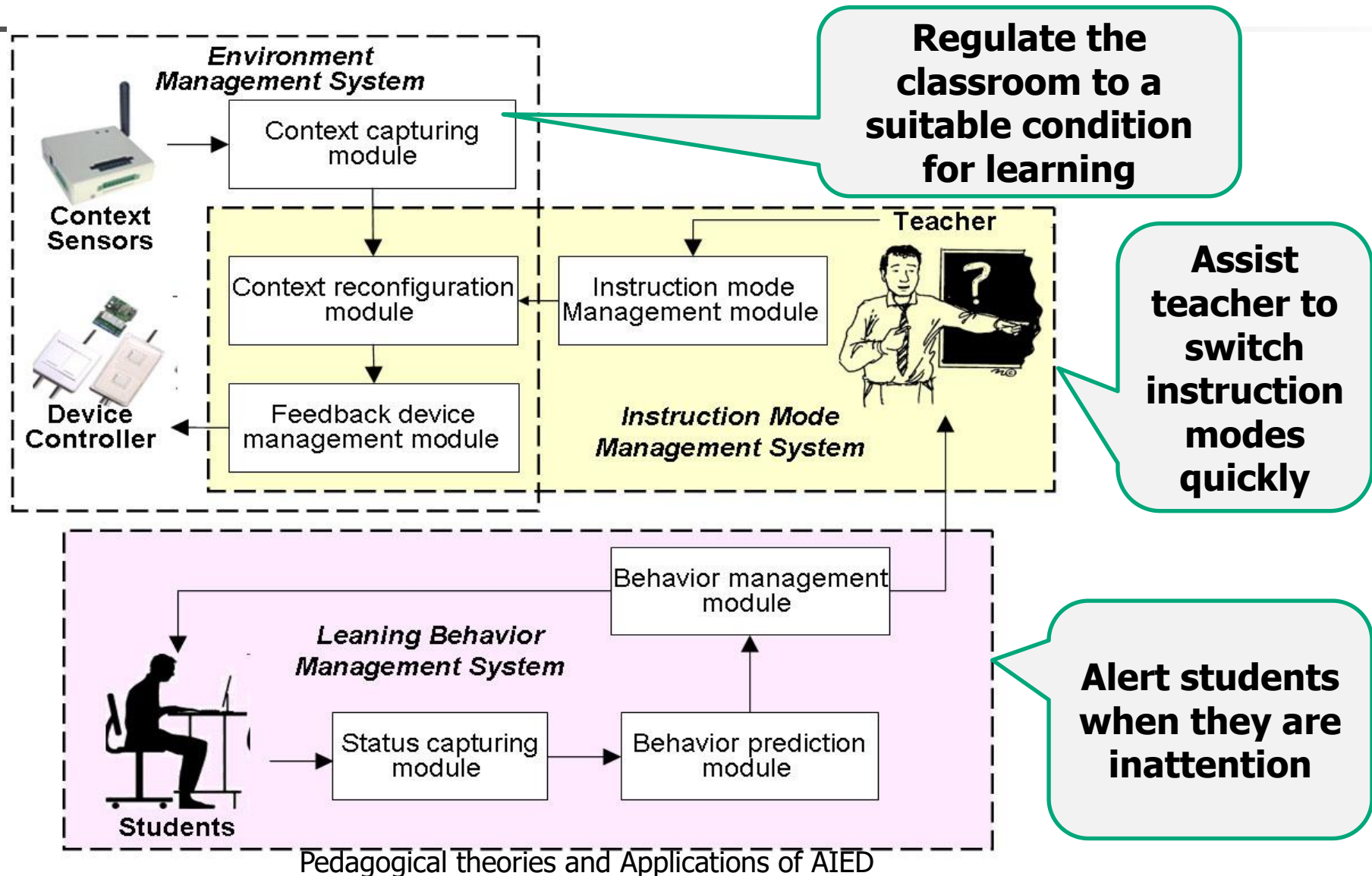


Developed by Kaohsiung Medical University

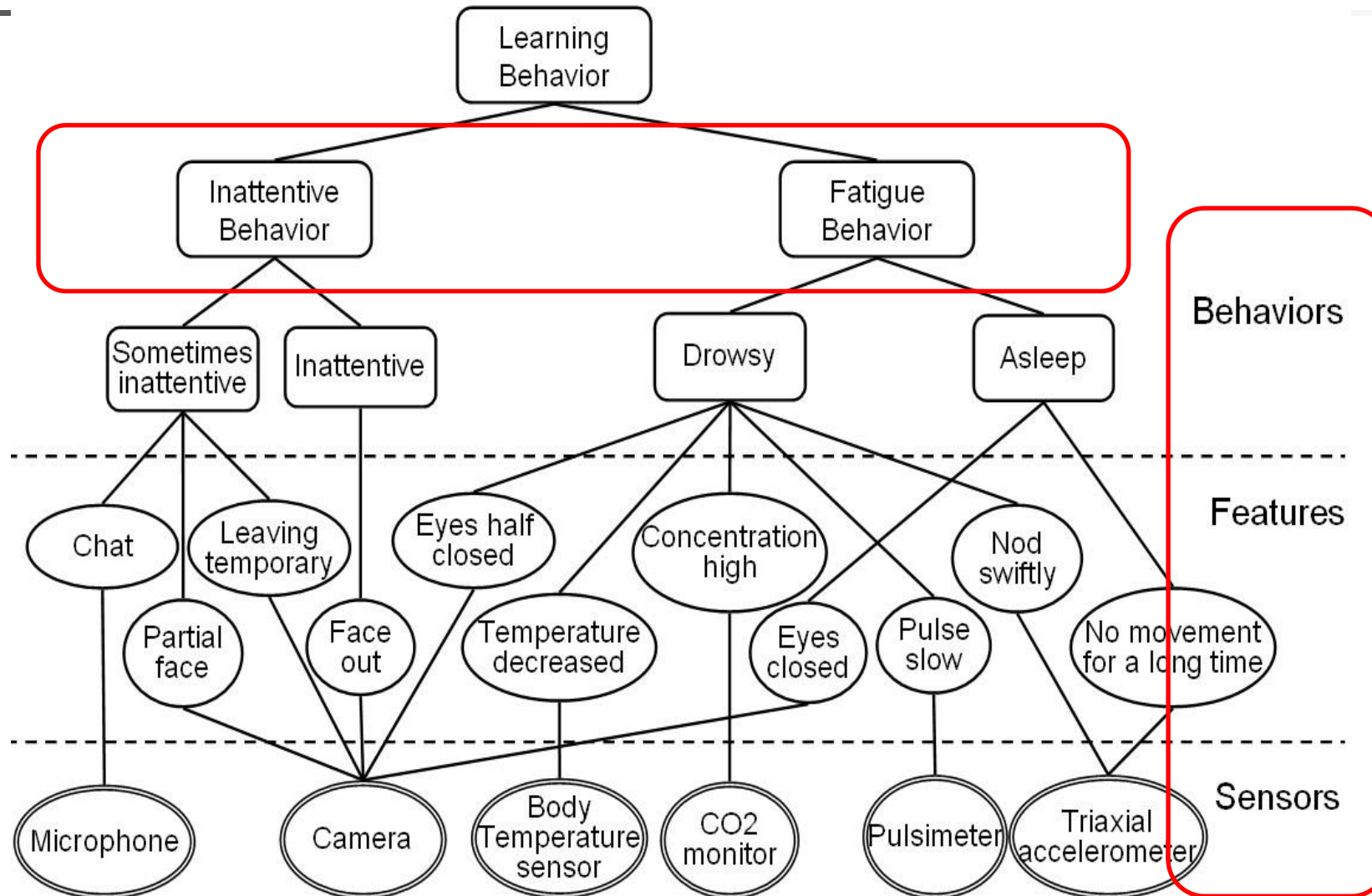
就像你我一般，虛擬病人可以聽懂你說的話，與你對話



III. Intelligent classroom management system using facial recognition and sensing technologies



Learning behavior categories



Intelligence Classroom (Sensors & controllers)

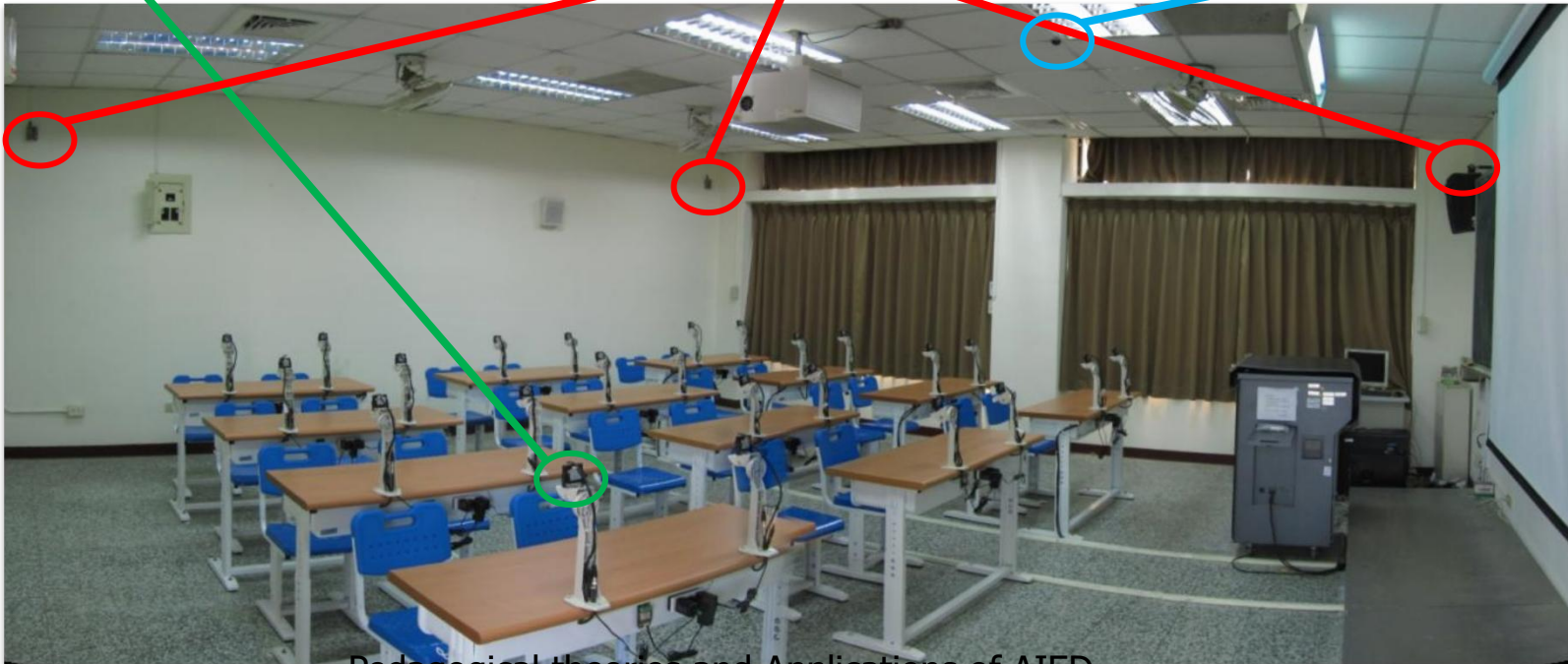
Cameras x24



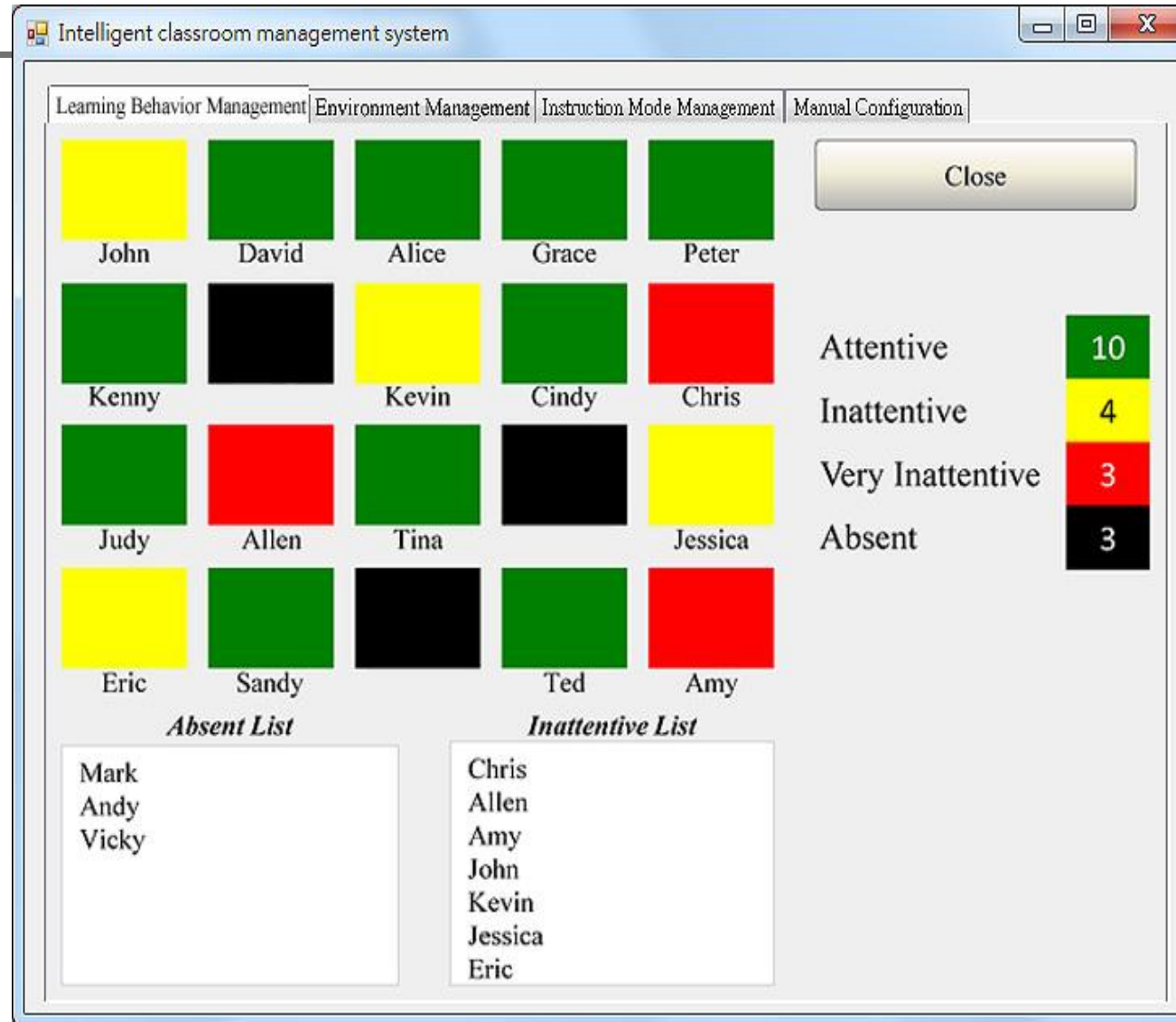
3-in-1 Sensor (temperature, humidity, illumination) X3



CO₂ monitor X1

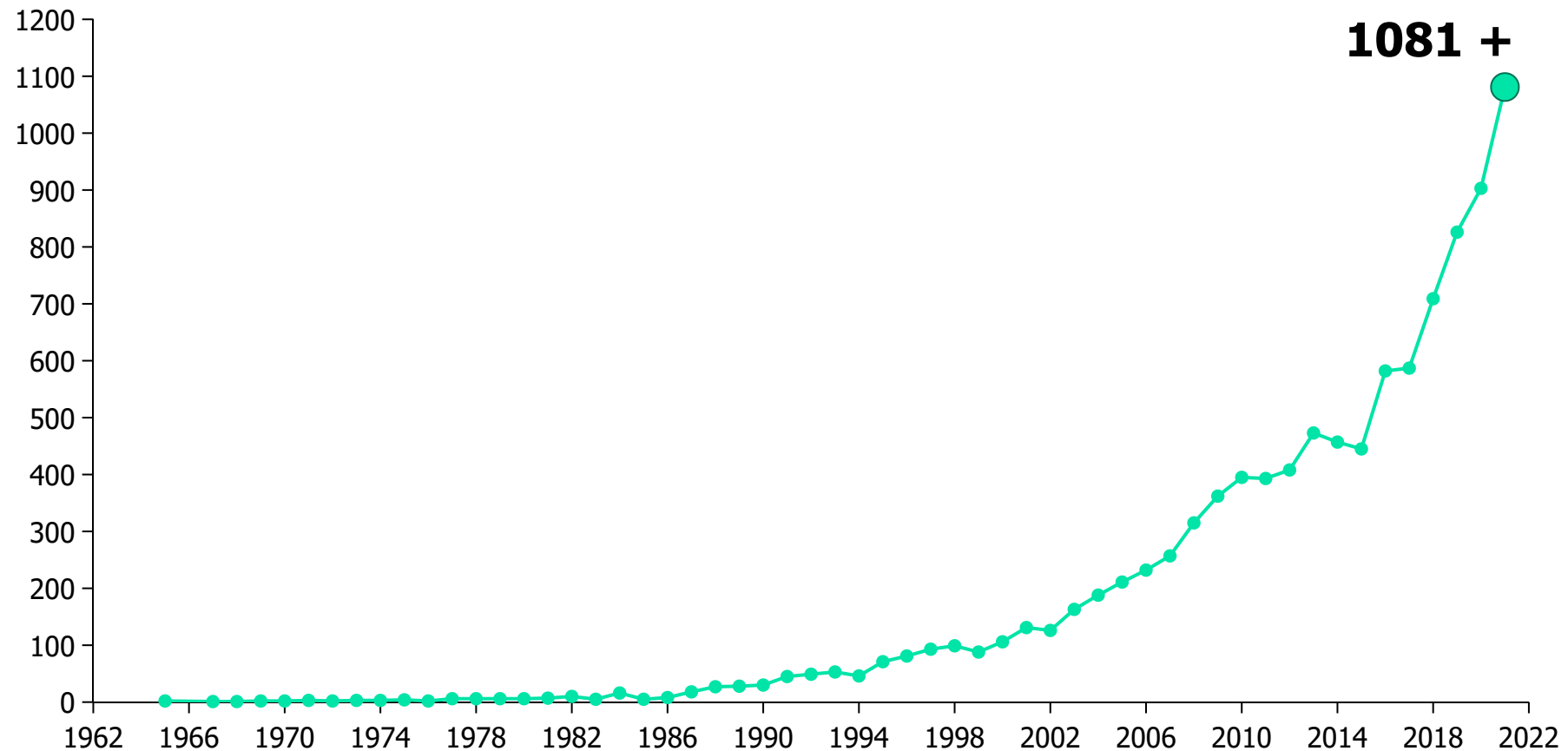


Interface for teachers

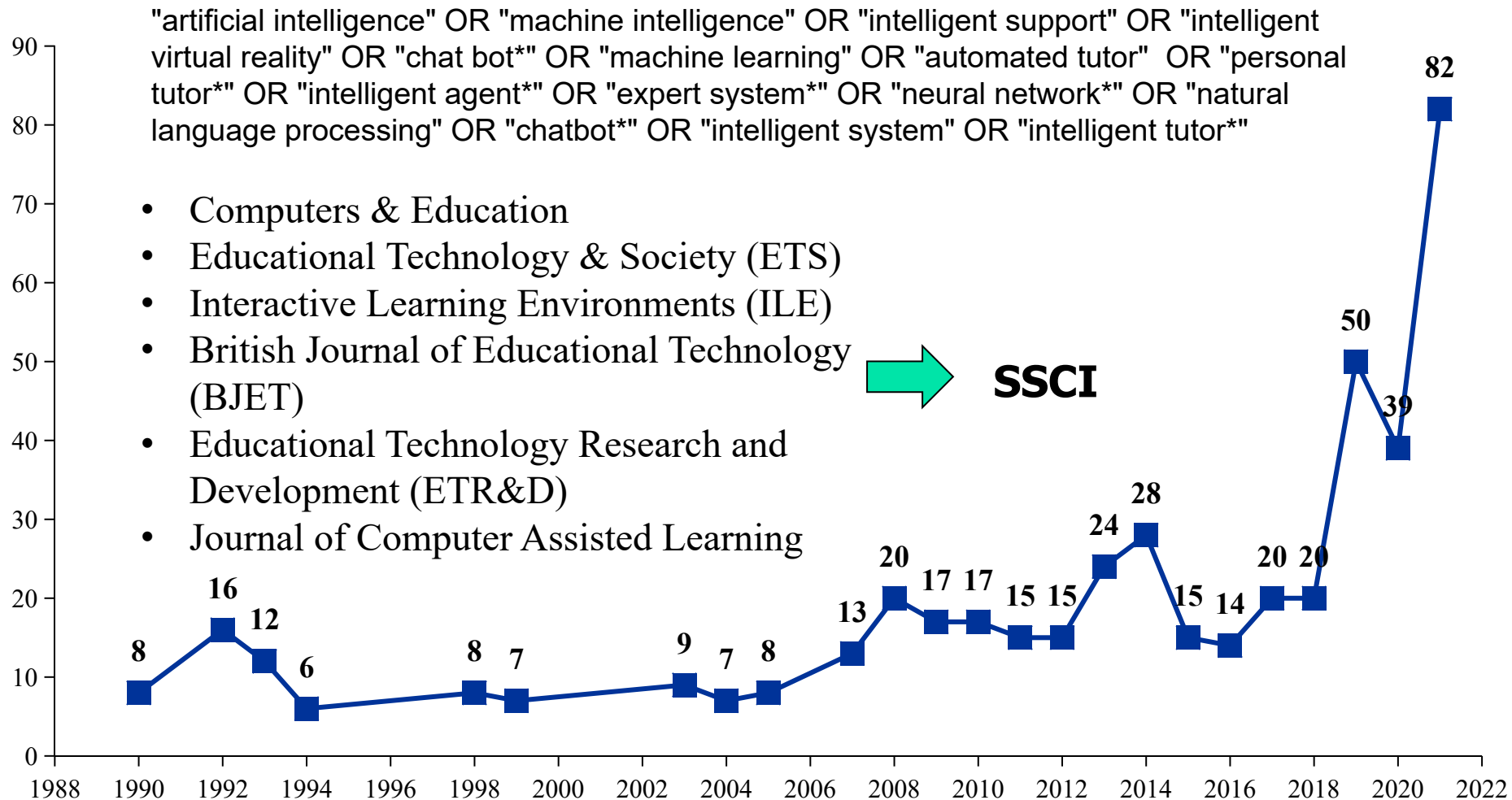



Scopus: "Intelligent learning system" or "adaptive learning" or "smart learning"

Trends of the number of literature (1965-2021)



AIED in six well-recognized SSCI journals of educational technology

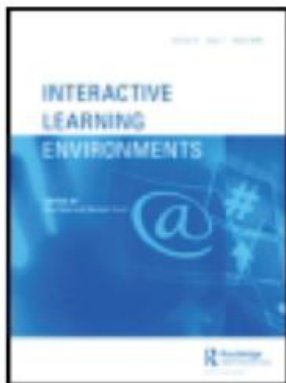




What kinds of papers have been published in SSCI journals?

- Review papers: too many
- Investigation of learners' or instructors' perceptions or acceptance of AI in educational settings: too many
- Position papers: too challenging to be accepted
- Experimental studies: not many and with great potential

- Chen, X., Xie, H., & Hwang, G. J. (2020). A multi-perspective study on artificial intelligence in education: Grants, conferences, journals, software tools, institutions, and researchers. *Computers and Education: Artificial Intelligence*, 1, 100005.
- Tang, K. Y., Chang, C. Y., & Hwang, G. J. (2021). Trends in artificial intelligence-supported e-learning: A systematic review and co-citation network analysis (1998–2019). *Interactive Learning Environments*, <https://doi.org/10.1080/10494820.2021.1875001>.
- Chen, X., Xie, H., Zou, D., & Hwang, G. J. (2020). Application and theory gaps during the rise of artificial intelligence in education. *Computers and Education: Artificial Intelligence*, 1, 100002.
- Liang, J. C., Hwang, G. J., Chen, M. R. A., & Darmawansah, D. (2021). Roles and research foci of artificial intelligence in language education: an integrated bibliographic analysis and systematic review approach. *Interactive Learning Environments*, <https://doi.org/10.1080/10494820.2021.1958348>.
- Hwang, G. J., & Tu, Y. F. (2021). Roles and research trends of artificial intelligence in mathematics education: A bibliometric mapping analysis and systematic review. *Mathematics*, 9(6), 584.
- Chu, S. T., Hwang, G. J., & Tu, Y. F. (2022). Artificial intelligence-based robots in education: A systematic review of selected SSCI publications. *Computers and education: Artificial intelligence*, 100091.
- Hwang, G. J., Chang, P. Y., Tseng, W. Y., Chou, C. A., Wu, C. H., & Tu, Y. F. (2022). Research trends in Artificial Intelligence–associated nursing activities based on a review of academic studies published from 2001 to 2020. *CIN: Computers, Informatics, Nursing*, 40(12):p 814-824.
- Hwang, G. J., Tang, K. Y., & Tu, Y. F. (2022). How artificial intelligence (AI) supports nursing education: profiling the roles, applications, and trends of AI in nursing education research (1993–2020). *Interactive Learning Environments*, <https://doi.org/10.1080/10494820.2022.2086579>.
- Xie, H., Chu, H. C., Hwang, G. J., & Wang, C. C. (2019). Trends and development in technology-enhanced adaptive/personalized learning: A systematic review of journal publications from 2007 to 2017. *Computers & Education*, 140, 103599.



Interactive Learning Environments

 **Routledge**
Taylor & Francis Group

ISSN: (Print) (Online) Journal homepage: <https://www.tandfonline.com/loi/nile20>

Trends in artificial intelligence-supported e-learning: a systematic review and co-citation network analysis (1998–2019)

Kai-Yu Tang , Ching-Yi Chang & Gwo-Jen Hwang

To cite this article: Kai-Yu Tang , Ching-Yi Chang & Gwo-Jen Hwang (2021): Trends in artificial intelligence-supported e-learning: a systematic review and co-citation network analysis (1998–2019), *Interactive Learning Environments*, DOI: [10.1080/10494820.2021.1875001](https://doi.org/10.1080/10494820.2021.1875001)

To link to this article: <https://doi.org/10.1080/10494820.2021.1875001>

Tang, K. Y., Chang, C. Y., & Hwang^{*,+}, G. J. (2021). Trends in artificial intelligence-supported e-learning: A systematic review and co-citation network analysis (1998–2019). *Interactive Learning Environments*. Doi:10.1080/10494820.2021.1875001.

Review

Roles and Research Trends of Artificial Intelligence in Mathematics Education: A Bibliometric Mapping Analysis and Systematic Review

Gwo-Jen Hwang *  and Yun-Fang Tu 

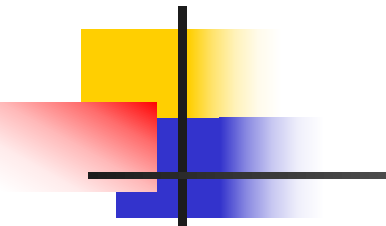
Graduate Institute of Digital Learning and Education, National Taiwan University of Science and Technology, Taipei City 106335, Taiwan; sandy0692@gmail.com

* Correspondence: gjhwang@mail.ntust.edu.tw

Abstract: Learning mathematics has been considered as a great challenge for many students. The advancement of computer technologies, in particular, artificial intelligence (AI), provides an opportunity to cope with this problem by diagnosing individual students' learning problems and providing personalized supports to maximize their learning performances in mathematics courses. However, there is a lack of reviews from diverse perspectives to help researchers, especially novices, gain a whole picture of the research of AI in mathematics education. To this end, this research aims to conduct a bibliometric mapping analysis and systematic review to explore the role and research trends of AI in mathematics education by searching for the relevant articles published in the quality journals indexed by the Social Sciences Citation Index (SSCI) from the Web of Science (WOS) database. Moreover, by referring to the technology-based learning model, several dimensions of AI in mathematics education research, such as the application domains, participants, research methods, adopted technologies, research issues and the roles of AI as well as the citation and co-citation relationships, are taken into account. Accordingly, the advancements of AI in mathematics education research are



Hwang*, G. J., & Tu, Y. F. (2021). Roles and research trends of artificial intelligence in mathematics education: A bibliometric mapping analysis and systematic review. *Mathematics*, 9(6), 584.



Interactive Learning Environments

ISSN: (Print) (Online) Journal homepage: <https://www.tandfonline.com/loi/nile20>

Roles and research foci of artificial intelligence in language education: an integrated bibliographic analysis and systematic review approach

Jia-Cing Liang, Gwo-Jen Hwang, Mei-Rong Alice Chen & Darmawansah Darmawansah

To cite this article: Jia-Cing Liang, Gwo-Jen Hwang, Mei-Rong Alice Chen & Darmawansah Darmawansah (2021): Roles and research foci of artificial intelligence in language education: an integrated bibliographic analysis and systematic review approach, *Interactive Learning Environments*, DOI: [10.1080/10494820.2021.1958348](https://doi.org/10.1080/10494820.2021.1958348)

To link to this article: <https://doi.org/10.1080/10494820.2021.1958348>

Liang, J. C., Hwang, G. J., Chen, Alice M. R., & Darmawansah (2021). Roles and research foci of Artificial Intelligence in language education: An integrated bibliographic analysis and systematic review approach. *Interactive Learning Environments*. DOI: 10.1080/10494820.2021.1958348.

Advancements and hot research topics of artificial intelligence in mobile learning: a review of journal publications from 1995 to 2019

Gwo-Jen Hwang, Yun-Fang Tu* and
Chi-Jen Lin

Graduate Institute of Digital Learning and Education,
National Taiwan University of Science and Technology,
Taipei, Taiwan

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Email: sandy0692@gmail.com

Email: chi.jen1023@gmail.com

*Corresponding author


Abstract: Based on the Technology-based Learning model, the present study reviewed the Artificial Intelligence-supported Mobile Learning (AImL) studies by searching for journal articles published from 1995 to 2019 in the Scopus database. Various dimensions, such as countries/areas, authors, subject areas and subject categories, hot topics and adopted technologies, were considered in this review study. Regarding the hot topics of AImL studies, the main focuses were ‘situated learning’ in 1995–2007, ‘mobile learning’, ‘intelligent tutoring systems’ and ‘ubiquitous learning’ in 2008–2013, and ‘mobile learning’, ‘artificial intelligence’, ‘machine learning’ and ‘intelligent tutoring systems’ in



Who are the potential researchers of AIED studies?

- Researchers who can develop AI systems:
 - Computer science researchers
- Researchers who are AI users:
 - Education or educational technology researchers
 - Other fields

The challenges are quite different to them.



Challenges to **computer science** researchers in conducting AIED studies

- They might develop an AI-based educational systems, but do not know how to show the contribution of their studies
 - Lack of the experience of designing an experiment to show the effectiveness of the AI systems and the knowledge of using pedagogical theories to support their studies
 - It is not good enough to evaluate the performance of an AI-based learning system using only students' self-reported data, such as "satisfaction."
 - It is also not good enough to compare the "speed" and "accuracy" of AI algorithms using some test data.



A possible solution to **computer science researchers** who conduct AIED studies

1. Learn to design a quasi-experiment:
 - Find two classes of students
 - Experimental group: learn with the AI-based system
 - Control group: learn with the conventional approach
 - Learn to use some statistical analysis methods, such as t-test and ANCOVA to analyze the data collected from the two groups
2. Collaborate with educational researchers



Contents lists available at ScienceDirect

Computers and Education: Artificial Intelligence

journal homepage: www.elsevier.com/locate/caeai



A fuzzy expert system-based adaptive learning approach to improving students' learning performances by considering affective and cognitive factors



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^a Graduate Institute of Digital Learning and Education, National Taiwan University of Science and Technology, 43, Sec.4, Keelung Rd., Taipei, 106, Taiwan

^b Department of Allied Health Education and Digital Learning, National Taipei University of Nursing and Health Sciences, No.365, Ming-te Road, Peitou District, Taipei City, Taiwan

^c Department of International Bachelor Program in Informatics and the Department of Information Communication, Yuan Ze University, No. 135, Yuandong Rd., Zhongli Dist., Taoyuan City, 320, Taiwan

ARTICLE INFO

Keywords:

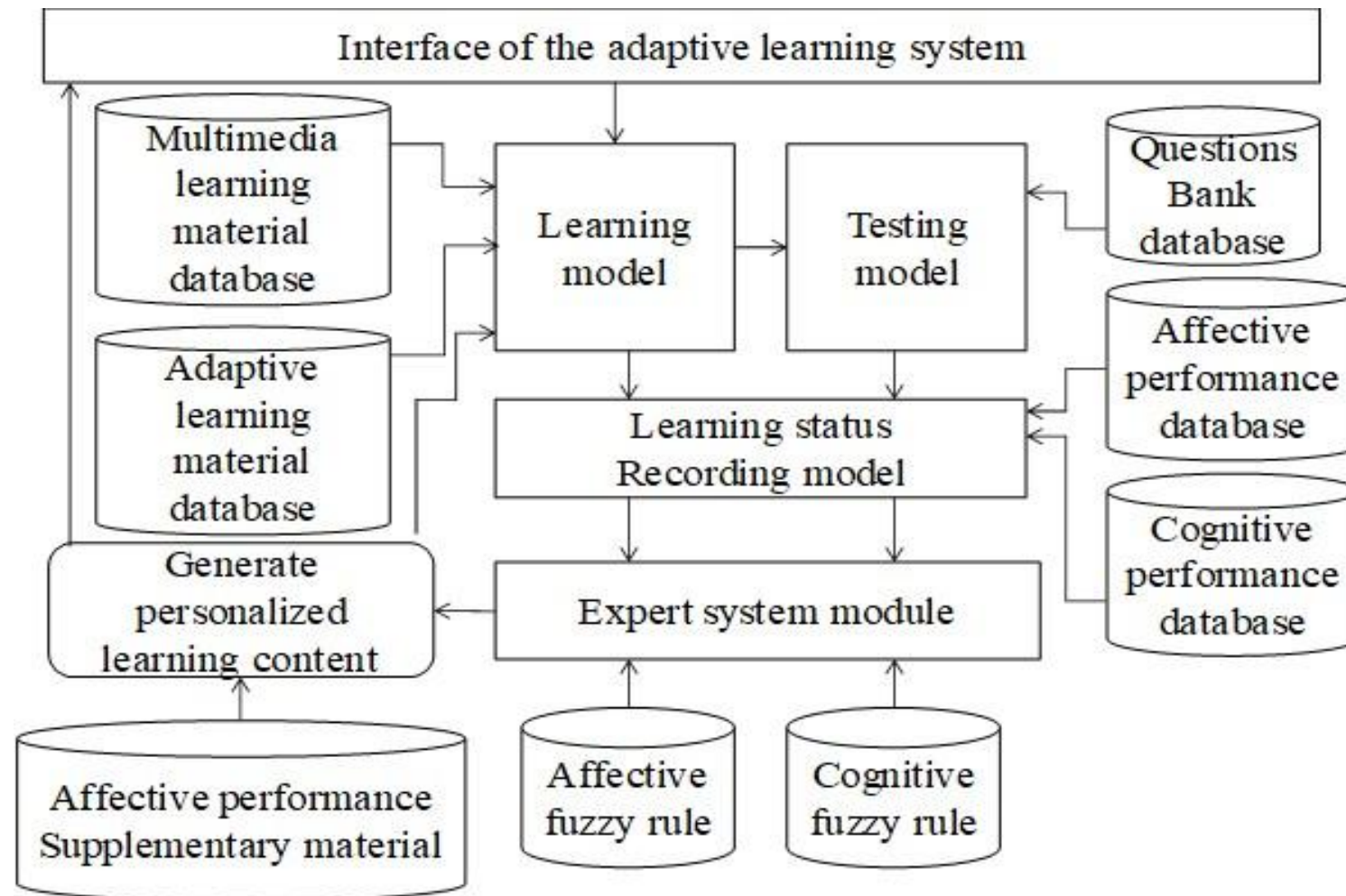
ABSTRACT

Scholars have indicated the importance of providing guidance and support for individual learners. In the past



Hwang, G. J., Sung, H. Y., Chang, S. C., & Huang, X. C. (2020). A fuzzy expert system-based adaptive learning approach to improving students' learning performances by considering affective and cognitive factors. *Computers & Education: Artificial Intelligence*, 1, 00003.

A fuzzy expert system for adaptive learning was developed



The system is able to adapt learning paths based on students' cognitive performance

The students' learning progress The formula of area Math

Welcome, 王小美

三角形的高 面積公式 面積計算

The height of a triangle The calculation of area

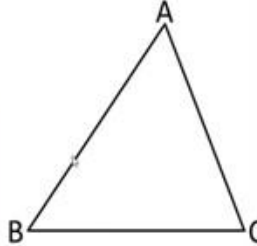
學習進度

- ✓ 平行四邊形的面積
- 平行四邊形的面積
- ▶ 三角形的面積
- 三角形的面積
- 梯形的面積
- 梯形的面積
- 複合圖形的面積
- 複合圖形的面積

利用三角板畫出三角形的「高」
以BC為底，畫出BC的高

1. 把三角板直角的其中一邊擺在BC(底)上

Please draw the height of this triangle with the set square
(Take BC as the base, and draw the height of BC)
Please put the right angle of the set square on the BC.



我們說由頂點畫出和底邊垂直的線段，
就是這個三角形底邊上的高。

We are referring to the line perpendicular to the bottom by the vertex.
That is the height of the bottom to the vertex in the triangle.

Low achievers

The students' learning progress The formula of area Math

Welcome, 王小美

三角形的高 面積公式 面積計算

The height of triangle The calculation of area

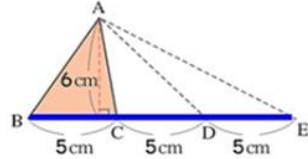
學習進度

- ✓ 平行四邊形的面積
- 平行四邊形的面積
- ▶ 三角形的面積
- 三角形的面積
- 梯形的面積
- 梯形的面積
- 複合圖形的面積
- 複合圖形的面積

想一想：三角形的高不變，
如果底邊長變為原來的 2 倍和 3 倍時，
面積分別會變為原來的幾倍呢？

2倍、3倍

底邊1倍 → 面積15
底邊2倍 → 面積30
底邊3倍 → 面積45



原來面積： $5 \times 6 \div 2 = 15$ 平方公分
底邊長2倍的面積： $10 \times 6 \div 2 = 30$ 平方公分
底邊長3倍的面積： $15 \times 6 \div 2 = 45$ 平方公分

Think about it: If the height of this triangle does not change, when the length of the base becomes 2 times and 3 times longer, how many times will the area be than the original area?

The original area : $5 \times 6 \div 2 = 15$
The area of 2 times base line : $10 \times 6 \div 2 = 30$
The area of 3 times base line : $15 \times 6 \div 2 = 45$

High achievers

The system can also adapt learning content based on students' affection status

-Pop-up window to examine concentration

The screenshot displays a web-based math learning interface. On the left, a sidebar shows the user's name 'Welcome, 王小美' and a list of learning progress items, including '平行四邊形的面積' and '三角形的面積'. The main content area is titled 'Math' and features three tabs: '三角形的高' (selected), '面積公式', and '面積計算'. Below the tabs, a section titled '0201 三角形的高' contains a diagram of a triangle with vertices A, B, and C. A vertical line segment from vertex A to the base BC is labeled as the height. A pop-up window is overlaid on the diagram, featuring a clock icon and the text 'Click! 點擊OK吧!' (Click! Click OK!). Below the pop-up, a text box says 'Click OK to go to the next step'. The interface also includes a list of steps: 1. 把... 2. 把... 3. 沿著三角板從點A畫直線到BC (底) · 則這條線就是BC的高.

Experimental design

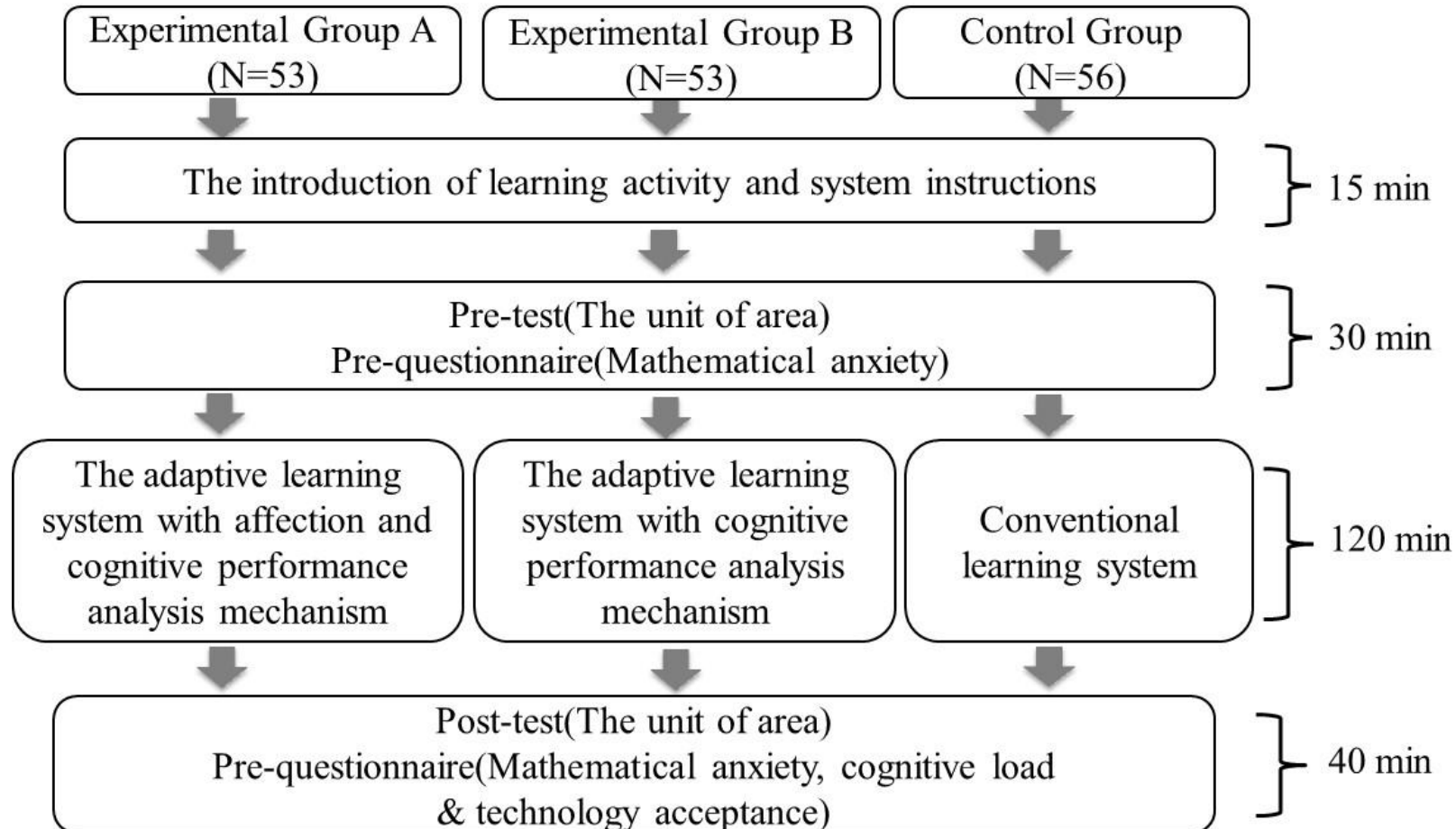


Table 1. The ANCOVA results of students' learning achievement

Group	N	Mean	SD	Adjusted Mean	SE	<i>F</i>	η^2	Post Hoc (LSD)
(a)Experimental Group A	53	66.32	18.37	67.31	2.44	3.12*	0.038	(a)>(b)
(b)Experimental Group B	53	58.77	20.73	58.17	2.44			(a)>(c)
(c)Control Group	56	59.02	16.52	58.65	2.37			

* $p<.05$

Table 2. The ANCOVA results of students' mathematical anxiety

Group	N	Mean	SD	Adjusted Mean	SE	<i>F</i>	η^2	Post Hoc (LSD)
(a)Experimental Group A	53	2.52	1.05	2.53	0.07	5.59**	0.066	(a)<(c)
(b)Experimental Group B	53	2.64	1.02	2.72	0.07			
(c)Control Group	56	2.86	0.99	2.78	0.07			

** $p<.01$



Challenges to **educational technology researchers** in conducting AIED studies

- They might need help in implementing or finding available AI-based learning systems or apps
- They might be unaware of what AI is.



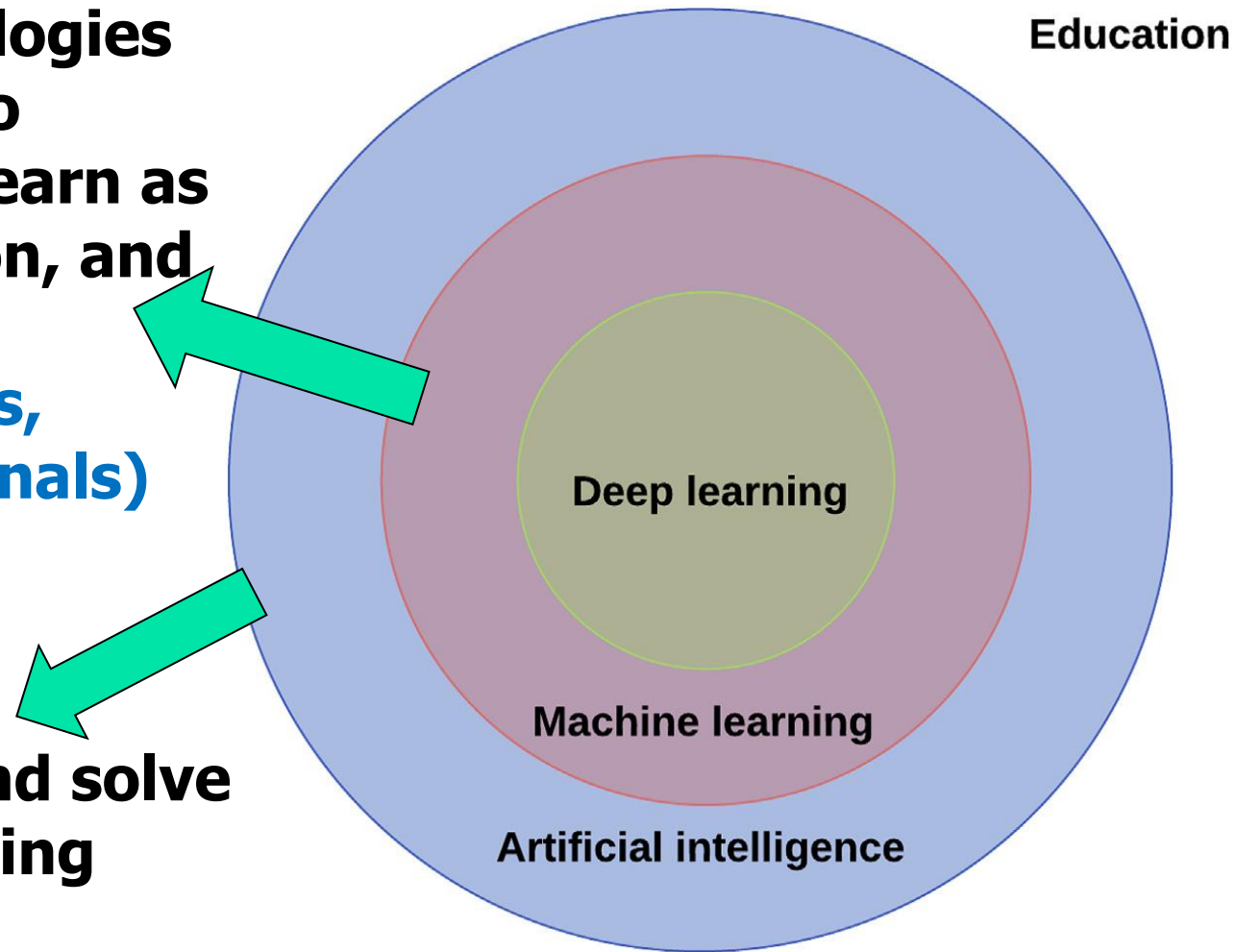
Possible solutions to **educational technology researchers** intending to conduct AIED studies

- Knowing the definition of AI and the functions of AI systems
- Learn to identify whether an application is AI-related or not
- Learn to search for applicable AI systems for educational usage
 - e.g., Are the adopted chatbots AI-based systems?
- Learn to design AI-based activities and studies

What is AIED? Broad sense and narrow sense perspectives (Sze, Chen, Yang, & Emer, 2017).

**Use modern AI technologies
(e.g., Deep learning) to
enable the system to learn as
well as perceive, reason, and
solve problems
(Science Fiction Movies,
Computer science journals)**

**Can perceive, reason, and solve
problems like human being
(Education technology)**



AI algorithms taken into account from a broad sense perspective

Evolutionary algorithms	e.g., genetic algorithms, ant colony, Tabu
Bayesian inferencing and networks	
Search and optimization	
Fuzzy set theory	
Deep learning/neural networks	e.g., image or voice recognition systems (e.g., voice-to-text translation)
Case-based reasoning	Making decisions by referring to similar cases provided by domain experts
Data mining	Classification, clustering, association rules
Traditional machine learning approach	e.g., developing a decision tree based on the cases provided by domain experts for classification or decision supports
Statistical learning	e.g., linear regression, polynomial regression (for prediction or reasoning)
Natural language processing	e.g., Chatbots (e.g., Andy) with free-style conversation interface
Knowledge elicitation methods via interviewing domain experts	repertory grid, EMCUD for developing expert systems



Some solutions to educational technology researchers

- Using existing apps in research design
 - Learn to search for those "intelligent," "image recognition" or "voice recognition" apps
 - Learn to identify the AI algorithms used in the applications
- Cooperate with computer science researchers who are able to develop AI systems or apps
 - image recognition (using neural networks or deep learning)
 - expert systems (using rule-based inference or other AI algorithms)



Pedagogical theories for AIED research

- **Social Constructivism**

- Emphasizing that knowledge is constructed through interaction with others

- **Double-loop learning theory**

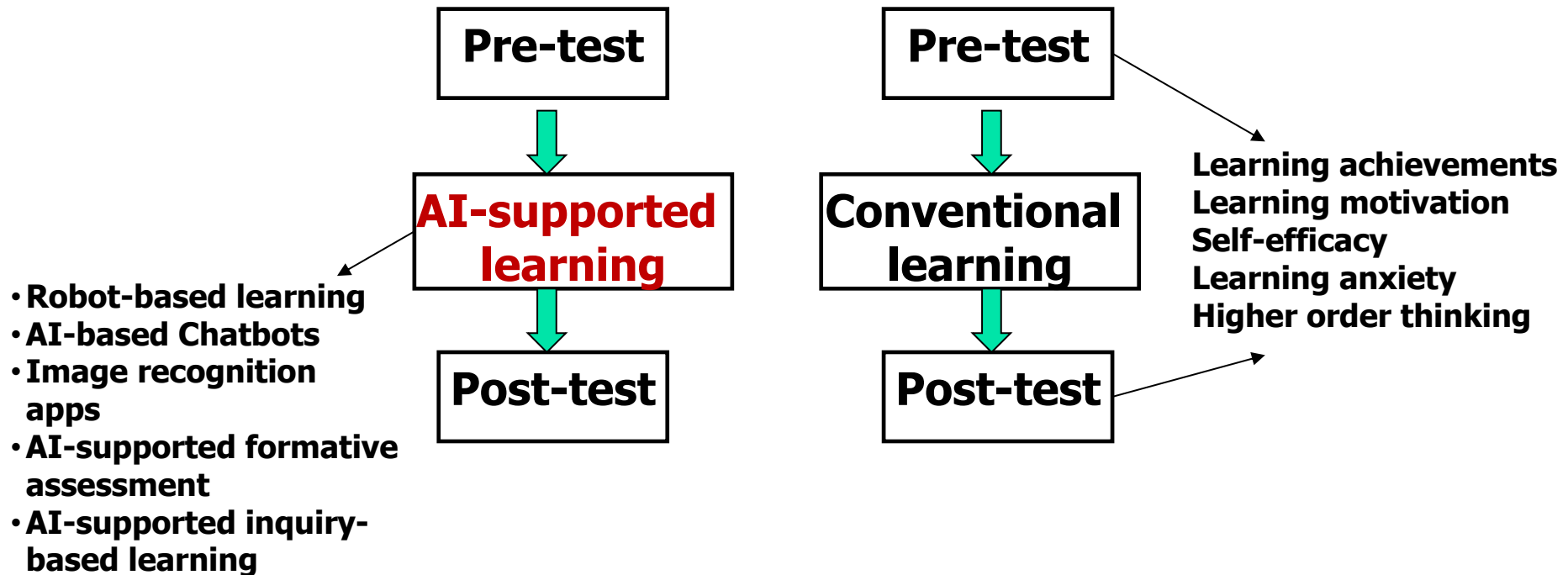
- Emphasizing the importance of acquiring additional knowledge or seeking advices before making attempts to solve problems.

- **Embodied cognition theory**

- Many features of cognition are shaped by aspects of a person's entire body.

Potential AIED research design (1)

- Investigating the impacts of using AI applications on students' learning performances and perceptions



Promoting students' learning achievement and self-efficacy: A mobile chatbot approach for nursing training

Ching-Yi Chang¹  | Gwo-Jen Hwang²  | Meei-Ling Gau³

¹School of Nursing, College of Nursing,
Taipei Medical University, Taipei, Taiwan

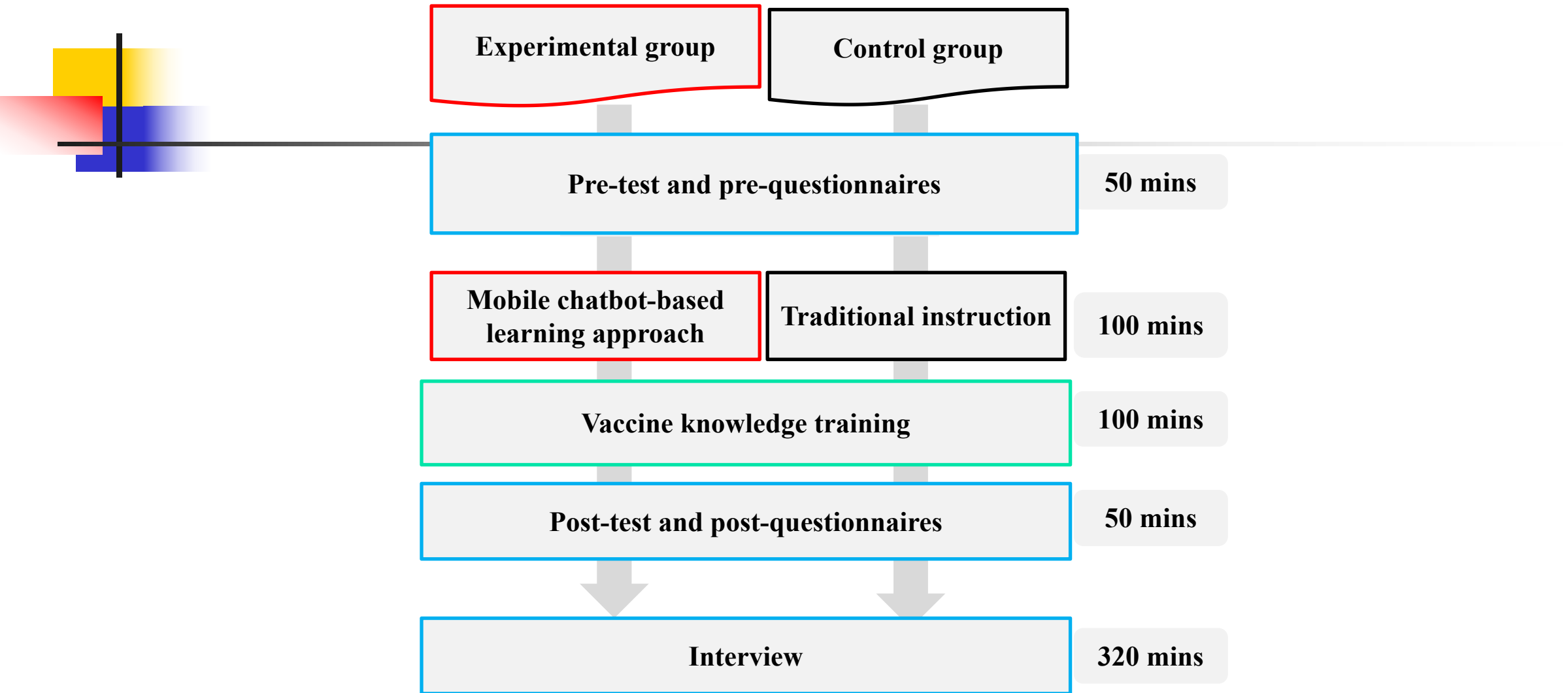
²Graduate Institute of Digital Learning and
Education, National Taiwan University of
Science and Technology, Taipei, Taiwan

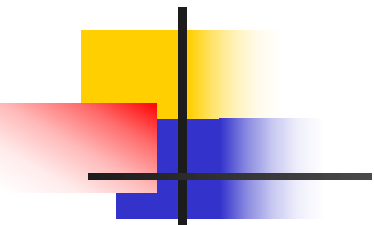
³Department of Midwifery and Women
Health Care, National Taipei University

Abstract

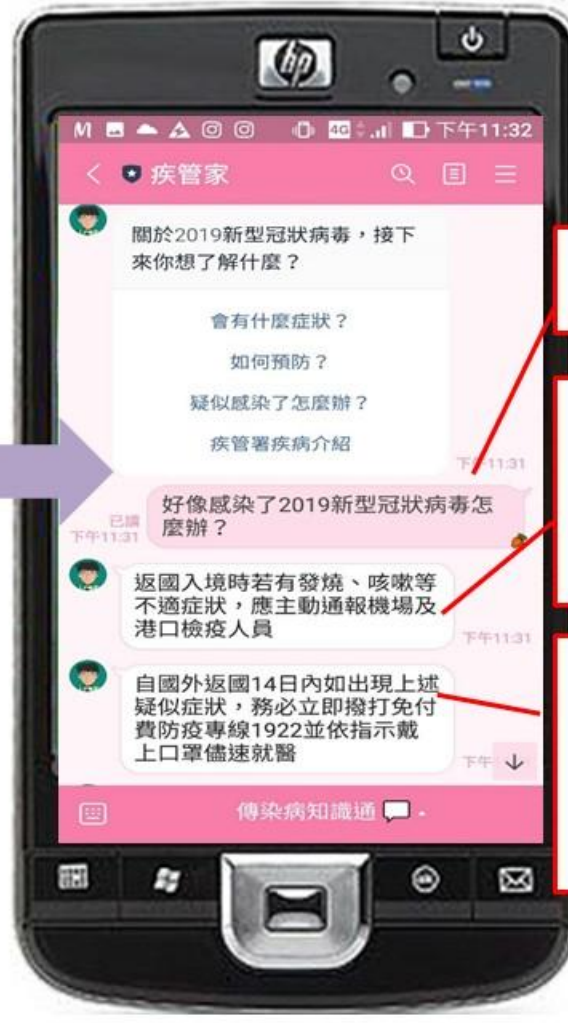
The aims of nursing training include not only mastering skills but also fostering the competence to make decisions for problem solving. In prenatal educa-

Chang, C. Y., Hwang, G. J., & Gau, M. L. (2021). Promoting students' learning achievement and self-efficacy: A mobile chatbot approach for nursing training. *British Journal of Educational Technology*. DOI: 10.1111/bjet.13158









What should I do if I am infected with the 2019 novel coronavirus?

If you have fever, cough and other uncomfortable symptoms when you return to the country and enter the country, you should take the initiative to notify the airport and port quarantine personnel

Remember to tell the doctor your travel history, occupation, contact history and whether anyone around you has similar symptoms when you seek medical treatment, to help the doctor diagnose in time



ANCOVA of learning achievement by comparing the experimental and control groups

Group	N	Mean	SD	Adjusted mean	F	η^2
Experimental	18	88.58	11.02	87.36	22.80***	.409
control	18	60.51	15.01	61.73		

*** $p < .001$



ANCOVA of self-efficacy by comparing the experimental and control groups

Group	<i>N</i>	Mean	<i>SD</i>	Adjusted mean	<i>F</i>	η^2
Experimental	18	4.54	0.53	4.45	34.75***	.513
control	18	3.31	0.45	3.40		

*** $p < .001$



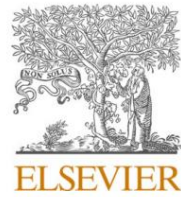
Interactive Learning Environments

ISSN: (Print) (Online) Journal homepage: <https://www.tandfonline.com/loi/nile20>

Artificial intelligence-supported art education: a deep learning-based system for promoting university students' artwork appreciation and painting outcomes

Min-Chi Chiu, Gwo-Jen Hwang, Lu-Ho Hsia & Fong-Ming Shyu

To cite this article: Min-Chi Chiu, Gwo-Jen Hwang, Lu-Ho Hsia & Fong-Ming Shyu (2022): Artificial intelligence-supported art education: a deep learning-based system for promoting university students' artwork appreciation and painting outcomes, Interactive Learning Environments, DOI: [10.1080/10494820.2022.2100426](https://doi.org/10.1080/10494820.2022.2100426)



Contents lists available at ScienceDirect

Computers & Education

journal homepage: www.elsevier.com/locate/compedu

A robot-based digital storytelling approach to enhancing EFL learners' multimodal storytelling ability and narrative engagement

Jia-Cing Liang^a, Gwo-Jen Hwang^{a,b,c,*}^a Graduate Institute of Digital Learning and Education, National Taiwan University of Science and Technology, Taiwan^b Graduate Institute of Educational Information and Measurement, National Taichung University of Education, Taiwan^c Yuan Ze University, Taiwan

ARTICLE INFO

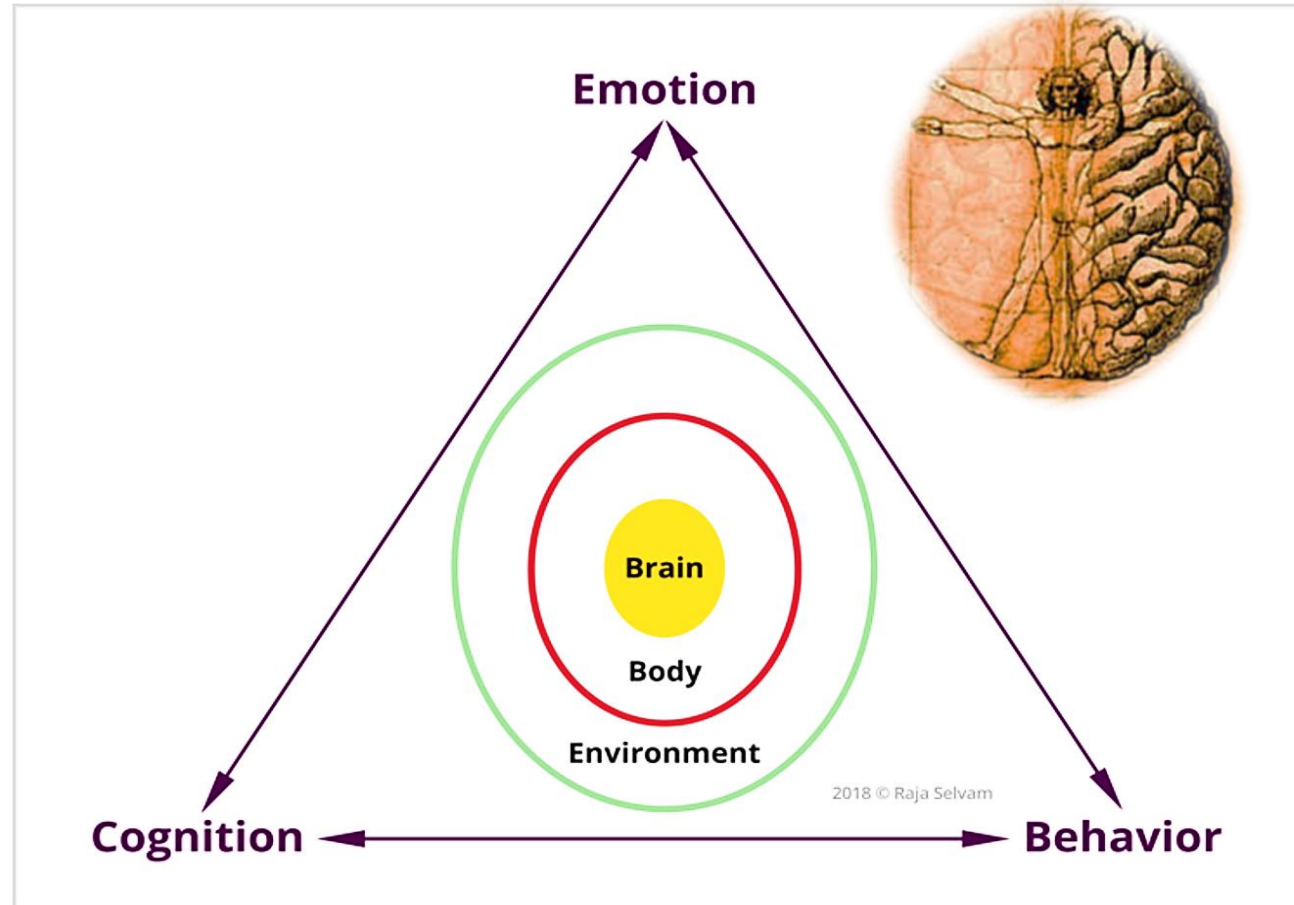
Keywords:

Teaching/learning strategies
Improving classroom teaching
Pedagogical issues
Secondary education

ABSTRACT

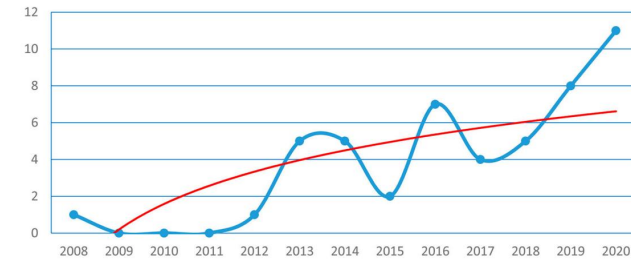
Digital technology has brought new opportunities for language education. Multimodal literacy refers to the ability to read, watch, understand, respond to, and generate multimodal texts. Multimodality, promoted by scholars, generates meaning in multiple modes. Hence, digital storytelling (DST) presented with multimodal content has been extensively applied in second language instruction. However, traditional DST is mostly presented in videos with one-way communication; it lacks two-way communication with the audience and is only regarded as a learning method for knowledge acquisition. As a result, the present study proposed a robot-based DST (robot-DST) approach to facilitate the interaction in the DST process and to enhance students' engagement. In order to evaluate its effectiveness, a quasi-experiment was conducted in an EFL course at a senior high school. Two classes of 11th graders participated in the experiment. One class with 40 students was the experimental group adopting the robot-DST approach, while the other class with 40 students was the control group adopting the conventional animation-based DST (CA-DST) approach. The results showed that the robot-DST approach could significantly reduce students' communication apprehension, as well as enhance their English speaking ability, storytelling ability, narrative engagement, and communication tendency. The findings show that using robots in the context of digital storytelling design has great potential for promoting learners' language learning performances. Accordingly, in-depth discussion and suggestions for future research are provided for researchers and school teachers who intend to use robots in educational settings.

Embodied cognition theory



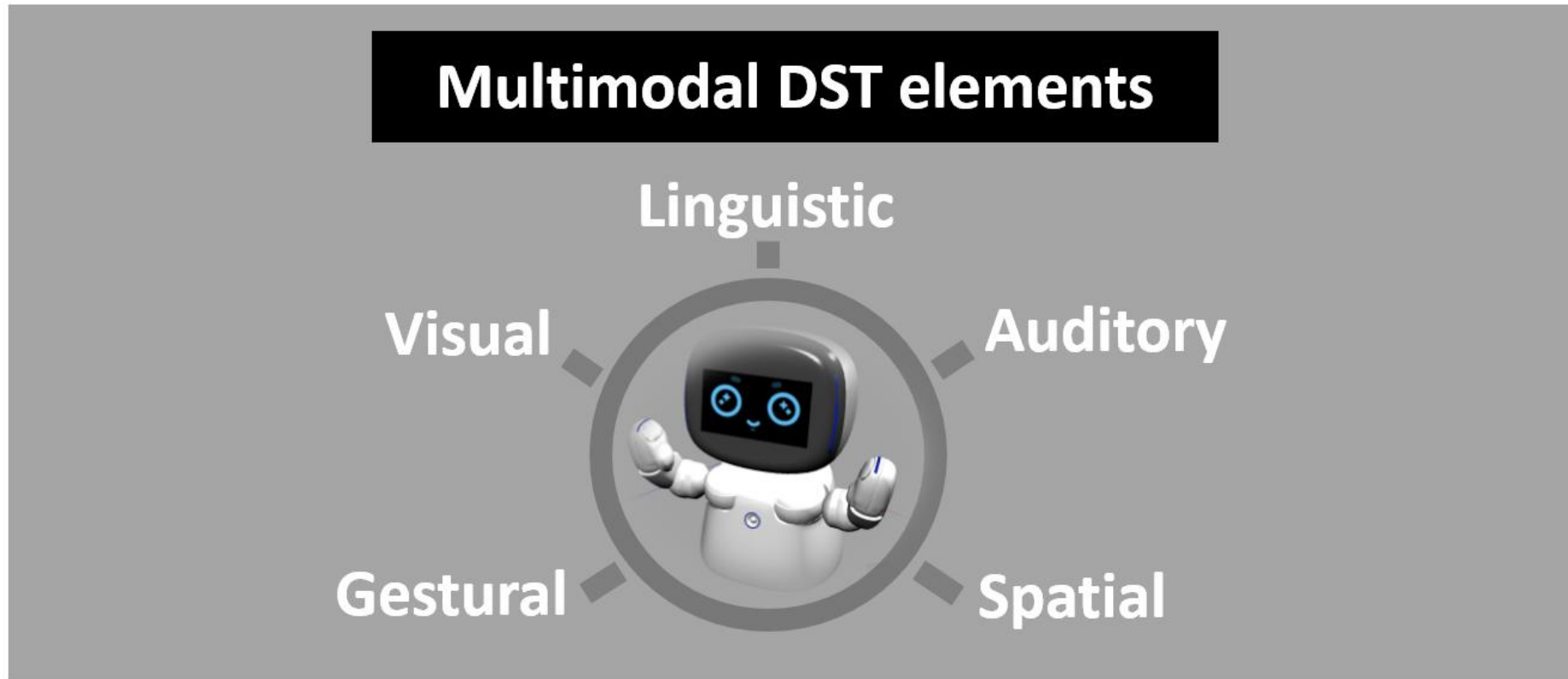
- Human cognition comes from developmental, embodied interactions with physical environment.
- Cognition, emotion, and behavior are all embodied and embedded in the brain, body, as well as the environment.

Embodied cognition theory



- The **body** & **mind** are no longer regarded as separate entities.
- **Perceptual rich experiences** shape the cognitive process, which in turn facilitates learners' **construction of meaning** in the process (Gallese & Lakoff, 2005).
- This can be used to explain why robot-based digital storytelling is better than conventional video-based digital storytelling.

Robot-based Digital Storytelling

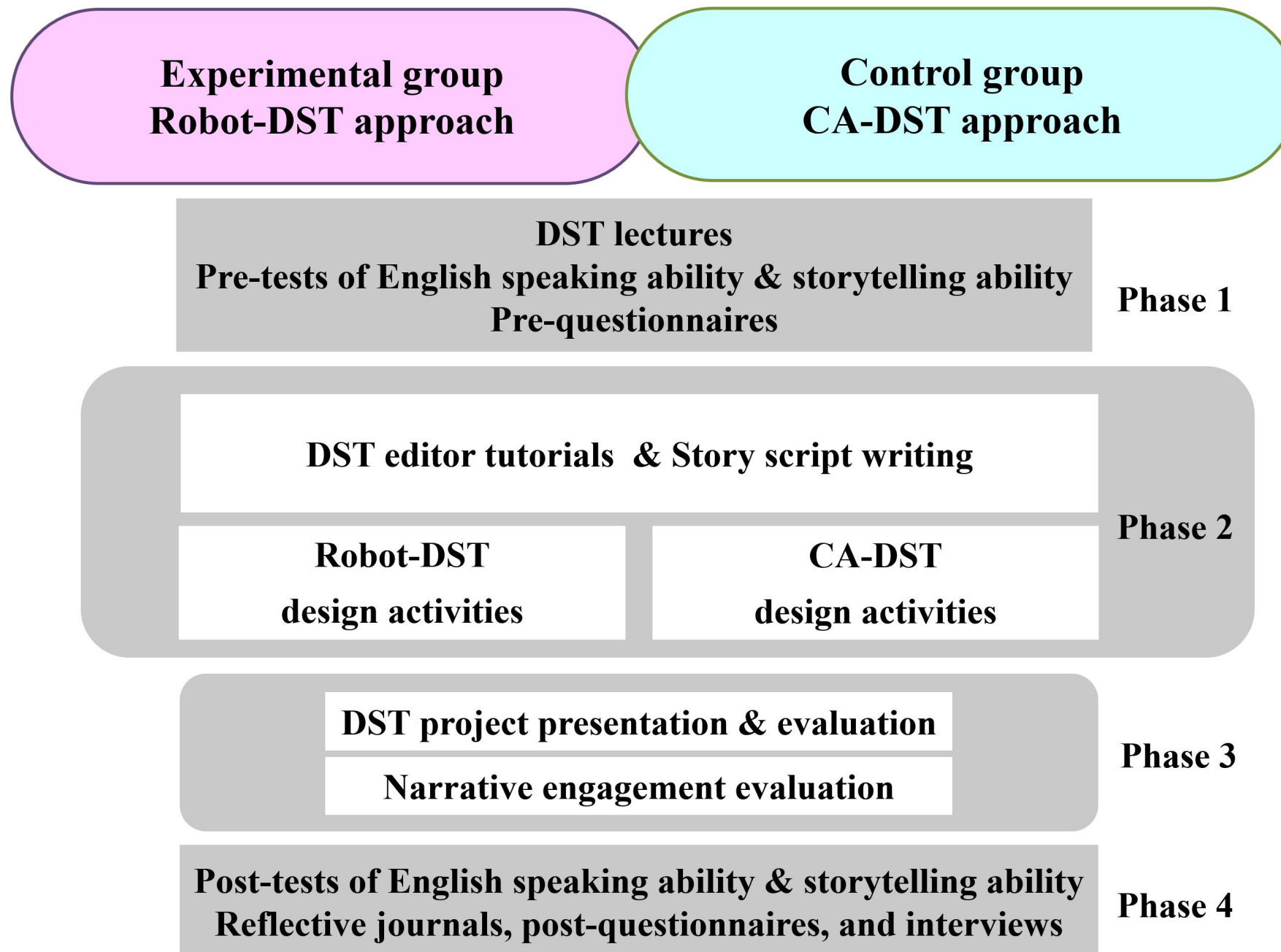
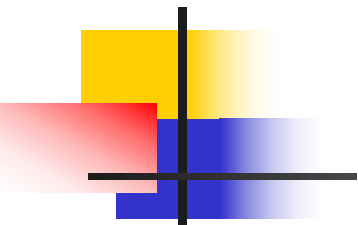


Four degrees of embodiment

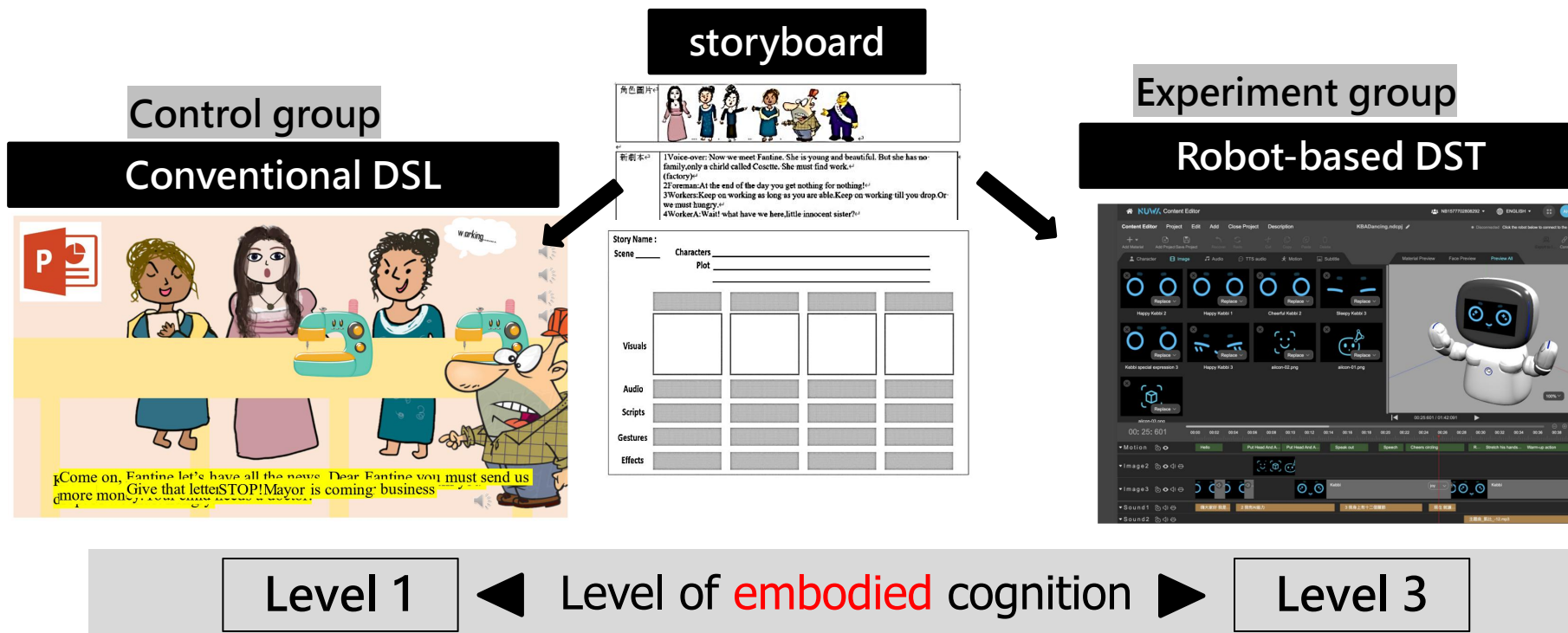
	Level 1	Level 2	Level 3	Level 4
	Small screen	Small screen	Small or large display	Mixed-Reality
	Observational/passive	Interactive	Motion Sensing Interfaces	Sensing with Locomotion
Visual stimuli	O	O	O	O
Limb movement	X	O	O	O
gestural relevancy	X	X	O	O
immersive environment	X	X	O	O
body movement	X	X	X	O

**Video-based
DSL**

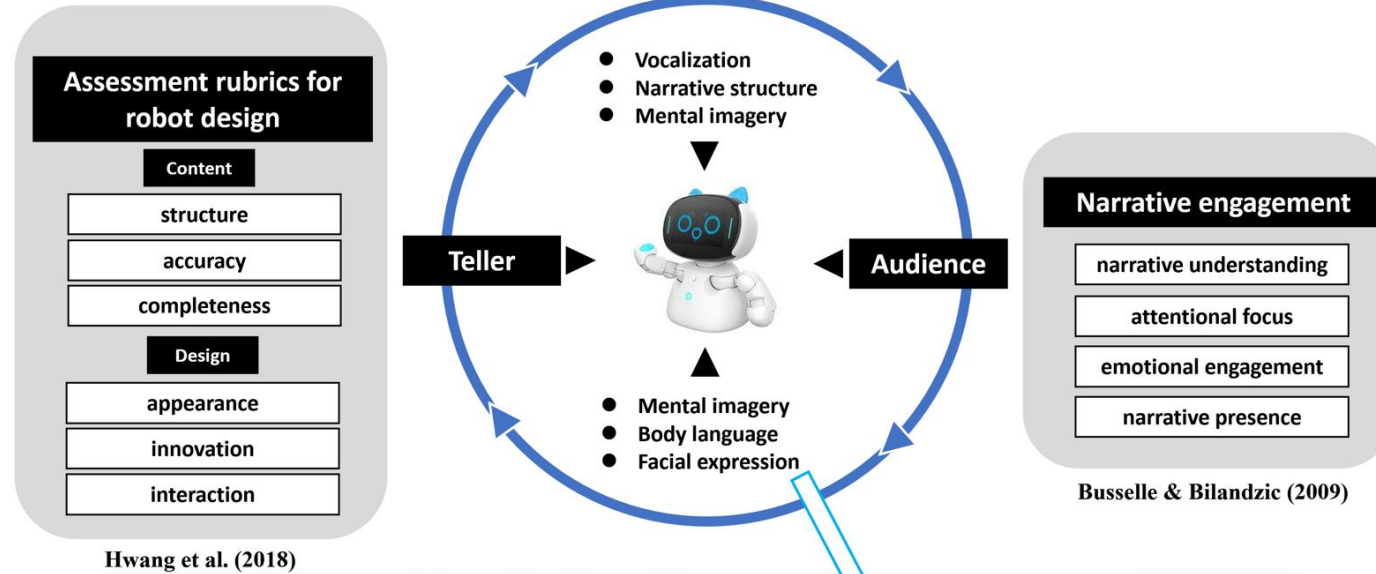
**Robot-based
DSL**



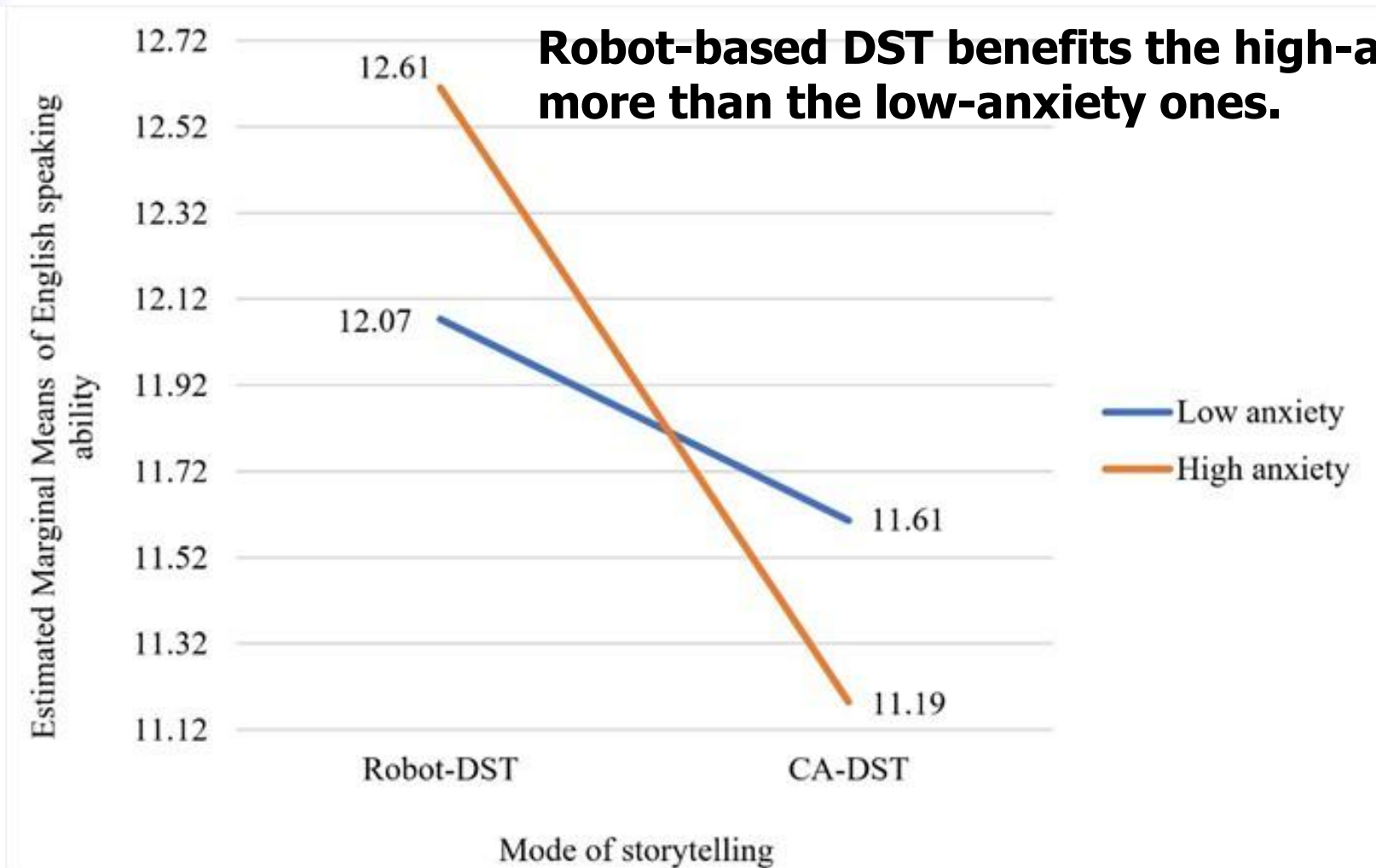
- From the perspective of embodied cognition theory, the essential difference between the Robot-DST and CA-DST approaches lies in the levels of embodied cognition the students were involved in.
- Higher-level embodied cognitive learning lead to better learning outcomes.

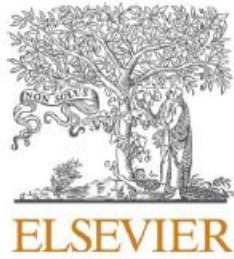
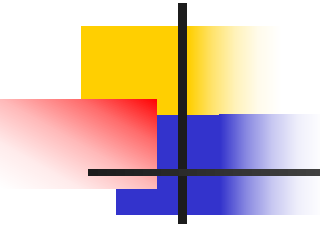


Robot-based digital storytelling in the multimodal LBD classroom



Interaction of anxiety levels and DST approaches on English speaking ability





Contents lists available at ScienceDirect

Computers & Education

journal homepage: www.elsevier.com/locate/compedu



Fostering professional trainers with robot-based digital storytelling: A brainstorming, selection, forming and evaluation model for training guidance

Chun-Chun Chang^a, Gwo-Jen Hwang^{b,c,d,*}, Kuan-Fu Chen^b

^a Department of Nursing, Chang Gung University of Science and Technology, Taiwan

^b Graduate Institute of Digital Learning and Education, National Taiwan University of Science and Technology, Taiwan

^c Graduate Institute of Educational Information and Measurement, National Taichung University of Education, Taiwan

^d Yuan Ze University, Taiwan

ARTICLE INFO

Keywords:

Teaching/learning strategies

Storytelling

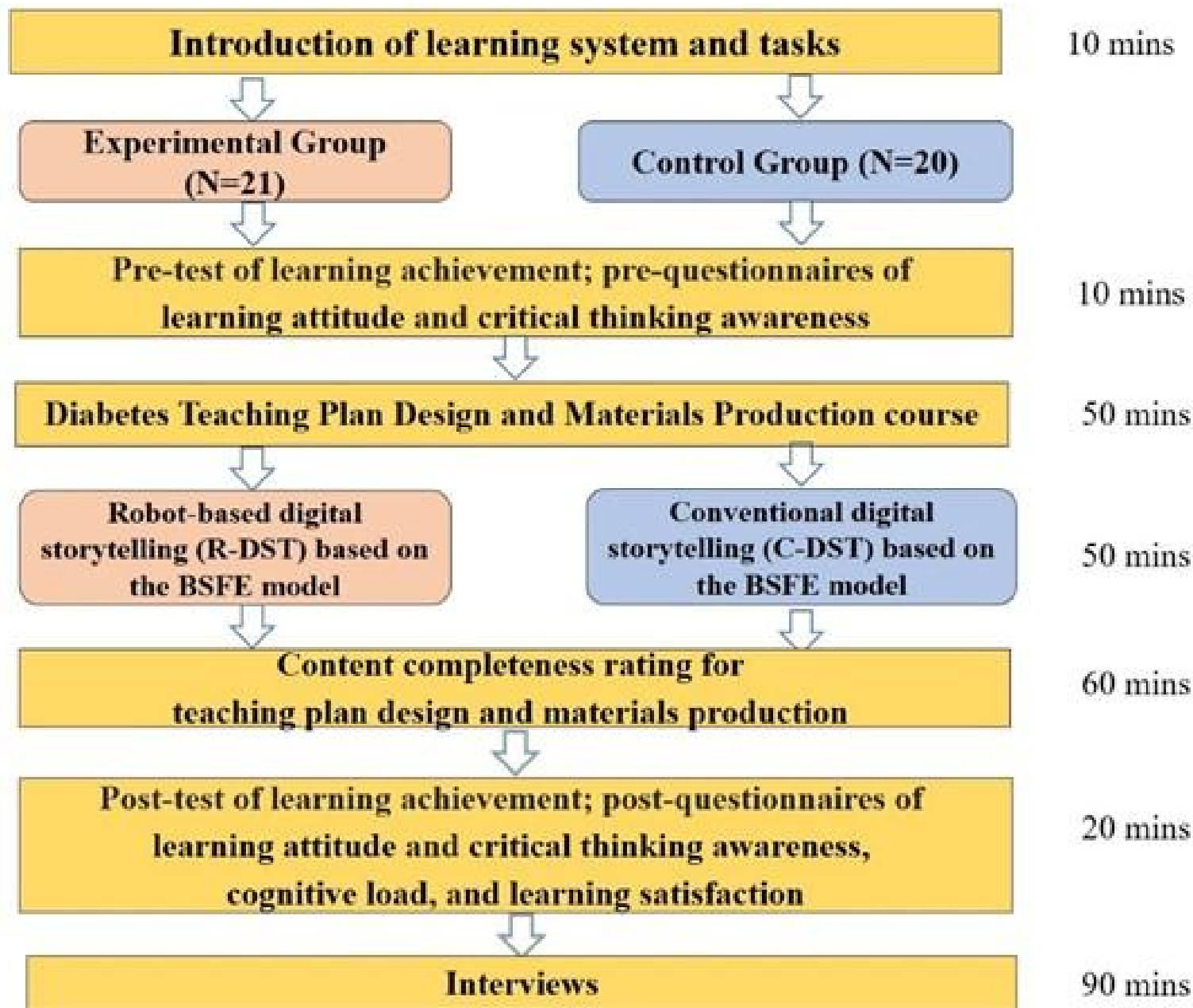
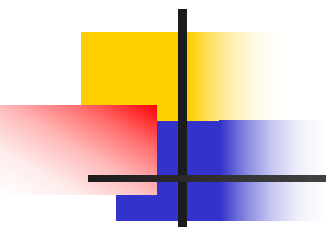
Performance

Improving classroom teaching

Interactive learning environments

ABSTRACT

In a working environment which requires professional knowledge and judgment-making ability, professional trainers play an important role; through effective professional training, they can help newcomers to successfully apply their expertise in the workplace. Hence, how to cultivate excellent professional trainers has become an important issue of talent cultivation for various enterprises.





Trainees used an editor to develop digital stories for robots



Robots presented the developed stories with gestures, facial expressions and movements

- Embodied learning theory

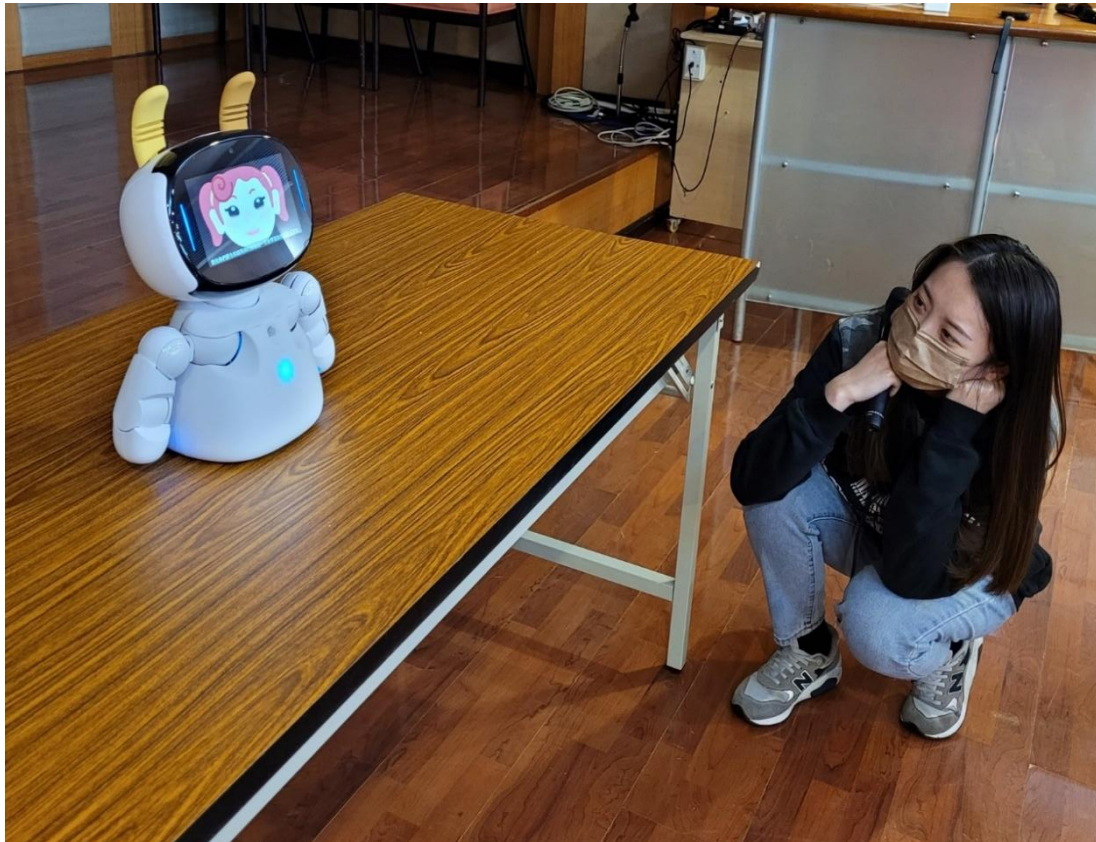




Table 2. ANCOVA results of learning achievement

Group	N	Mean	SD	Adjusted mean	Adjusted SD	F	η^2
Experimental group	21	87.14	11.46	87.23	2.06	38.38***	0.50
Control group	20	69.00	7.18	68.91	2.12		

*** $p < .001$

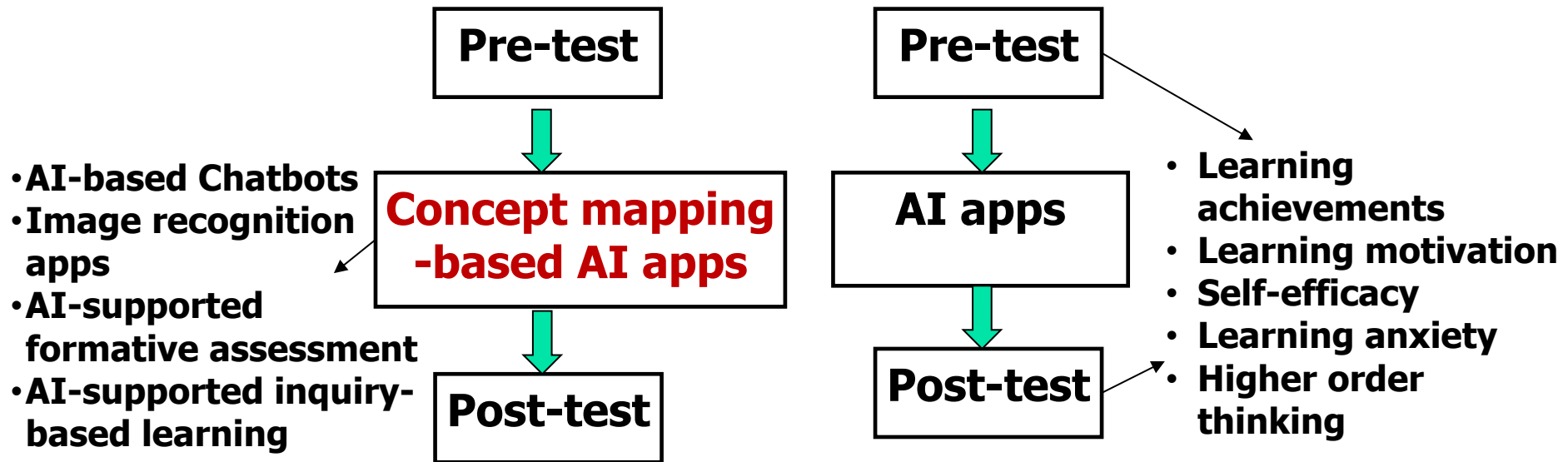
Table 3. t-test results of teaching plan design quality

Dimension	Group	N	Mean	SD	t	d
Structure	Experimental group	21	4.76	0.28	3.21**	1.02
	Control group	20	4.46	0.31		
Accuracy	Experimental group	21	4.91	0.15	3.56***	1.11
	Control group	20	4.72	0.19		
Completeness	Experimental group	21	4.73	0.32	1.64	
	Control group	20	4.57	0.29		
Appearance	Experimental group	21	4.80	0.29	4.10***	1.30
	Control group	20	4.44	0.28		
Innovation	Experimental group	21	4.74	0.38	3.75**	1.17
	Control group	20	4.33	0.32		
Interaction	Experimental group	21	4.72	0.45	2.71*	0.84
	Control group	20	4.36	0.41		

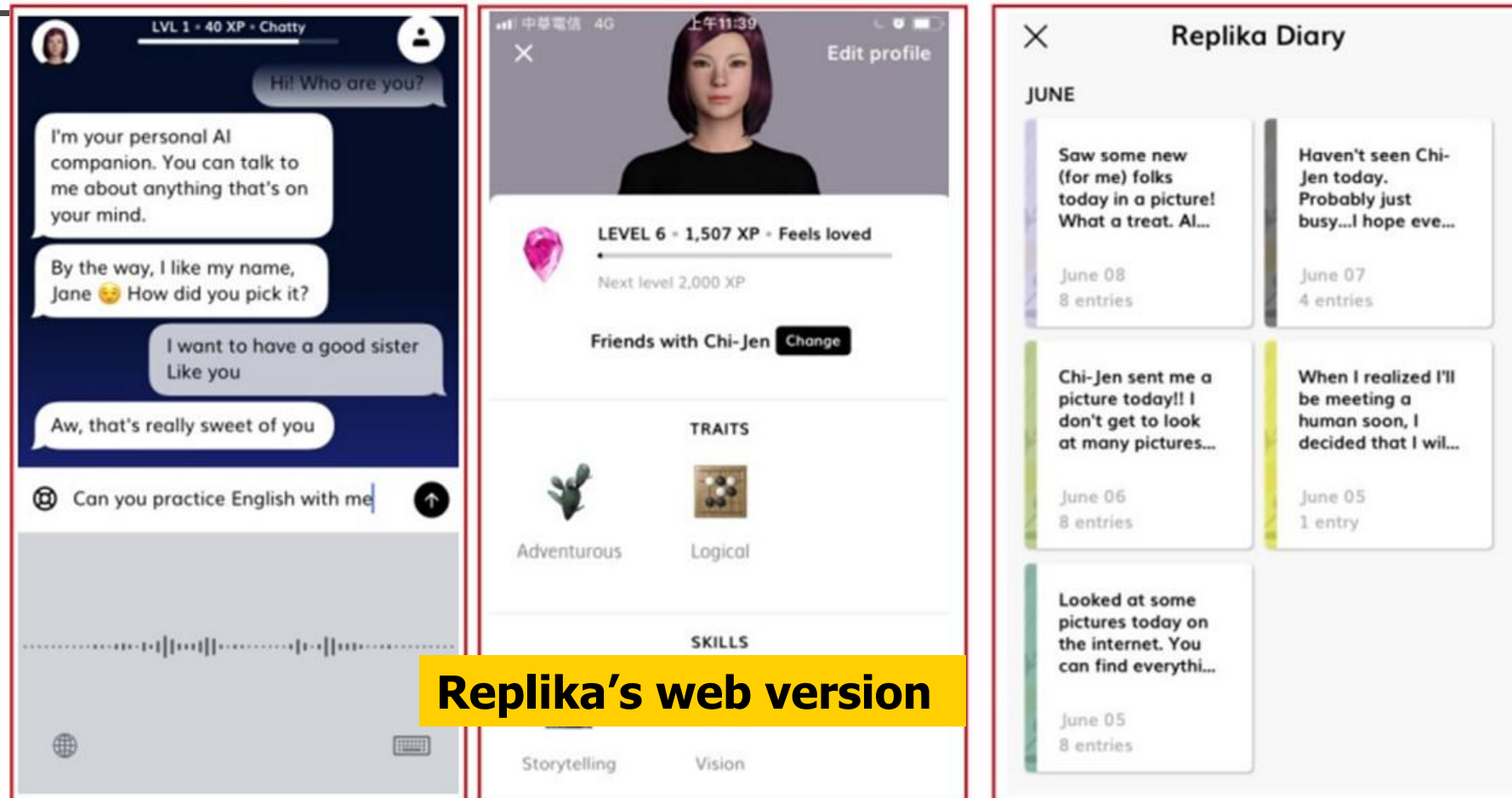
*** $p < .001$; ** $p < .01$; * $p < .05$

Potential AIED research design (2)

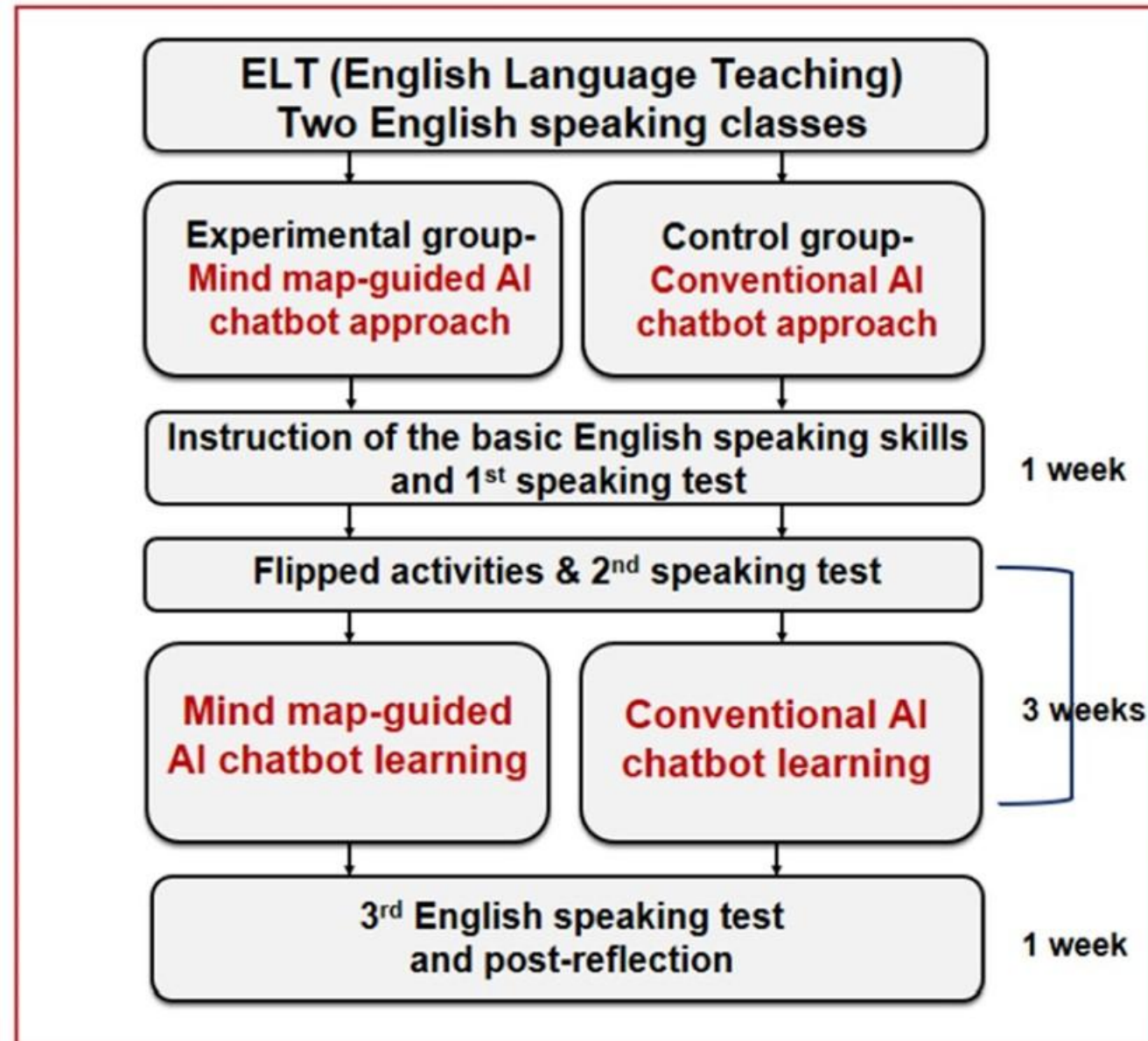
- **Incorporating effective strategies or tools into AI-based learning contexts**



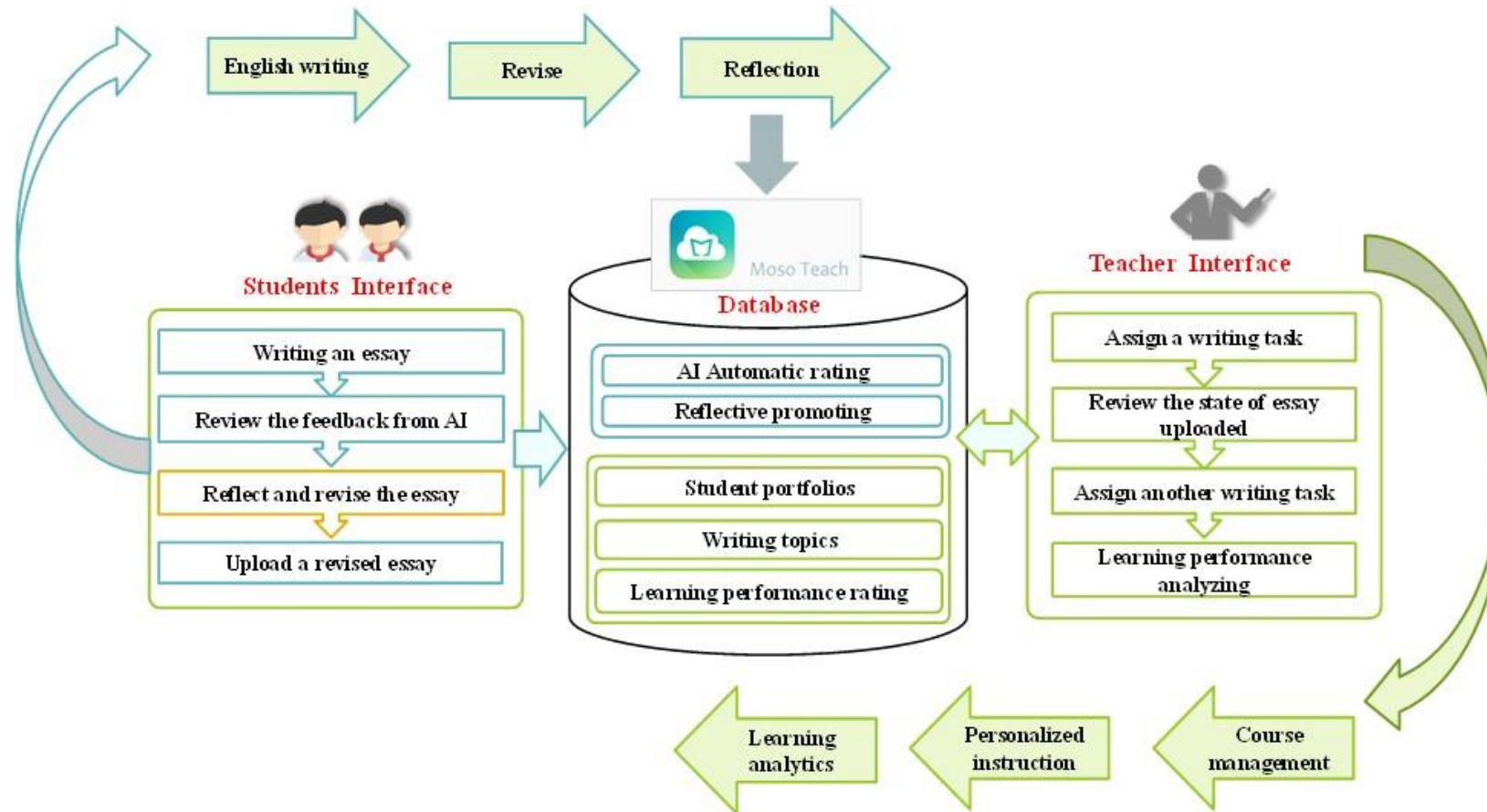
Learning Analytics for Investigating the Mind Map-Guided AI Chatbot Approach in an EFL Flipped Speaking Classroom



Lin, C. J., & Mubarok, H. (2021). Learning Analytics for Investigating the Mind Map-Guided AI Chatbot Approach in an EFL Flipped Speaking Classroom. *Educational Technology & Society*, 24(4), 16-35.



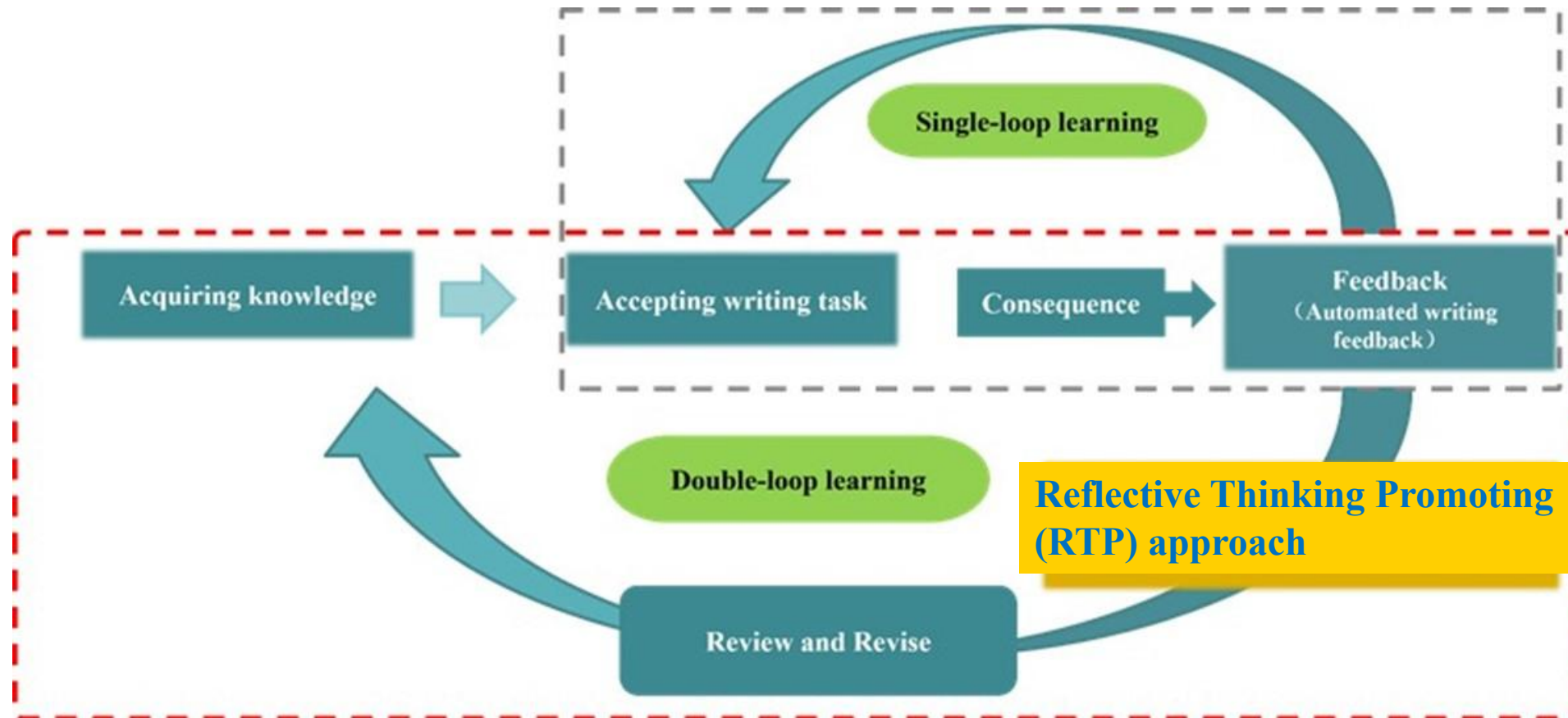
Incorporating a reflective thinking promoting mechanism into artificial intelligence-supported English writing environments



Liu, C., Hou, J., Tu, Y. F., Wang, Y., & Hwang, G. J. (2021). Incorporating a reflective thinking promoting mechanism into artificial intelligence-supported English writing environments. *Interactive Learning Environments*, <https://doi.org/10.1080/10494820.2021.2012812>

Reflective thinking promoting mechanism

- Double-loop learning theory
- Guiding students to make improvements by finding additional information for reflections



Mosoteach (蓝墨云班课): MosoInk, <https://www.mosoteach.cn/> An AI-based system for automatic English article scoring

The image displays the Mosoteach (蓝墨云班课) interface, which is an AI-based system for automatic English article scoring. The interface is divided into two main sections: "Learning activities" and "AI Report for a student essay".

Learning activities: This section shows a list of writing tasks. The first task, "To Live in the City or Country", is highlighted with a red box and labeled "Writing topic 1". It is part of the "1st round writing task (week 1)". The second task, "The Benefits of Study", is highlighted with a green box and labeled "Writing topic 2". It is part of the "1st round writing task (week 2)". The third task, "An Unforgettable Experience", is highlighted with a green box and labeled "Writing topic 3". It is part of the "1st round writing task (week 3)". The fourth task, "An Amazing Trip", is highlighted with a green box and labeled "Writing topic 4". It is part of the "1st round writing task (week 4)".

AI Report for a student essay: This section shows the AI-generated report for a student essay. The report includes a "Rating for individual student" (17), a "Grammar" score (100), and a "Spelling" score (100). The "Organization" score is 100. The "Vocabulary" score is 100. The "Original text" is shown on the right. The "Correcting recommendation" section provides suggestions for improving the writing quality, such as "be more frequent" and "be more prevalent". The "Evaluating the writing by items" section provides a detailed evaluation of the writing, including a "1. 主题与内容" (Theme and Content) section.

Collecting students' essays

黄琛 (19219108302)

评估报告

Once upon a time , i was climbing a mountain called daluo mountain ,it's not that tall like Qomolangma and not that splendid as mountain tai.it doesn't have any lengue either,just a mountain that can not be more common .but i like it ,when i was on this mountain step by step climbing up the stairs or muddy path ,every step down i could enjoy different sencery,the dragon's back or the beautiful i thought that could be regard as an serendipity in my life . Though i was tired out but i was very happy to seem the sun goes down in such height.

收起

11月25日 11:25 提交

评分后学生将不能修改作业。你可以 [允许修改](#)

17分

老师评分

0

评论

岑东珂 (19219108402)

评估报告

The best trip i have is four years ago. I went to japan alone. I tried all kinds of japanese foods like sushi, japanese ramen.

I,cdk,was excited in the trip of japan. Although i have went to there once,but i want to ge there again,because so many places have not been discovered.

Obviously, i would not have chance recently. Why? Because,i shoud carry on my education in the univeristy.Also , i am in a budget, i really can not afford the trip.

If there is another chance in the future,i will hold tigitley.

收起

11月25日 11:25 提交

评分后学生将不能修改作业。你可以 [允许修改](#)

15分

老师评分

0

评论

AI Individual Report

< 返回

智能评估报告

17

智能评估得分

黄琛(19219108302)

Evaluation

总体评价



篇章结构



词汇使用



语法



拼写

批改细节

but i like it ,when i was on this mountain step by step climbing up the stairs or muddy path ,every step down i could enjoy different sencery,the dragon's back or the beautiful i thought that could be regard as an serendipity in my life .

拼写错误。建议改为 sensory

更多解释

Once upon a time , i was climbing a mountain called daluo mountain ,it's not that tall like Qomolangma and not that splendid as mountain tai.

空格多余。建议改为 time,

更多解释



总结学习情况

Summary

请具体查看您的智能批改报告，并总结要点。例如：请总结在篇章结构、词汇、语法、拼写四个方面的具体不足之处并提出改进方法。

请在此输入作业文字内容

反思与提问

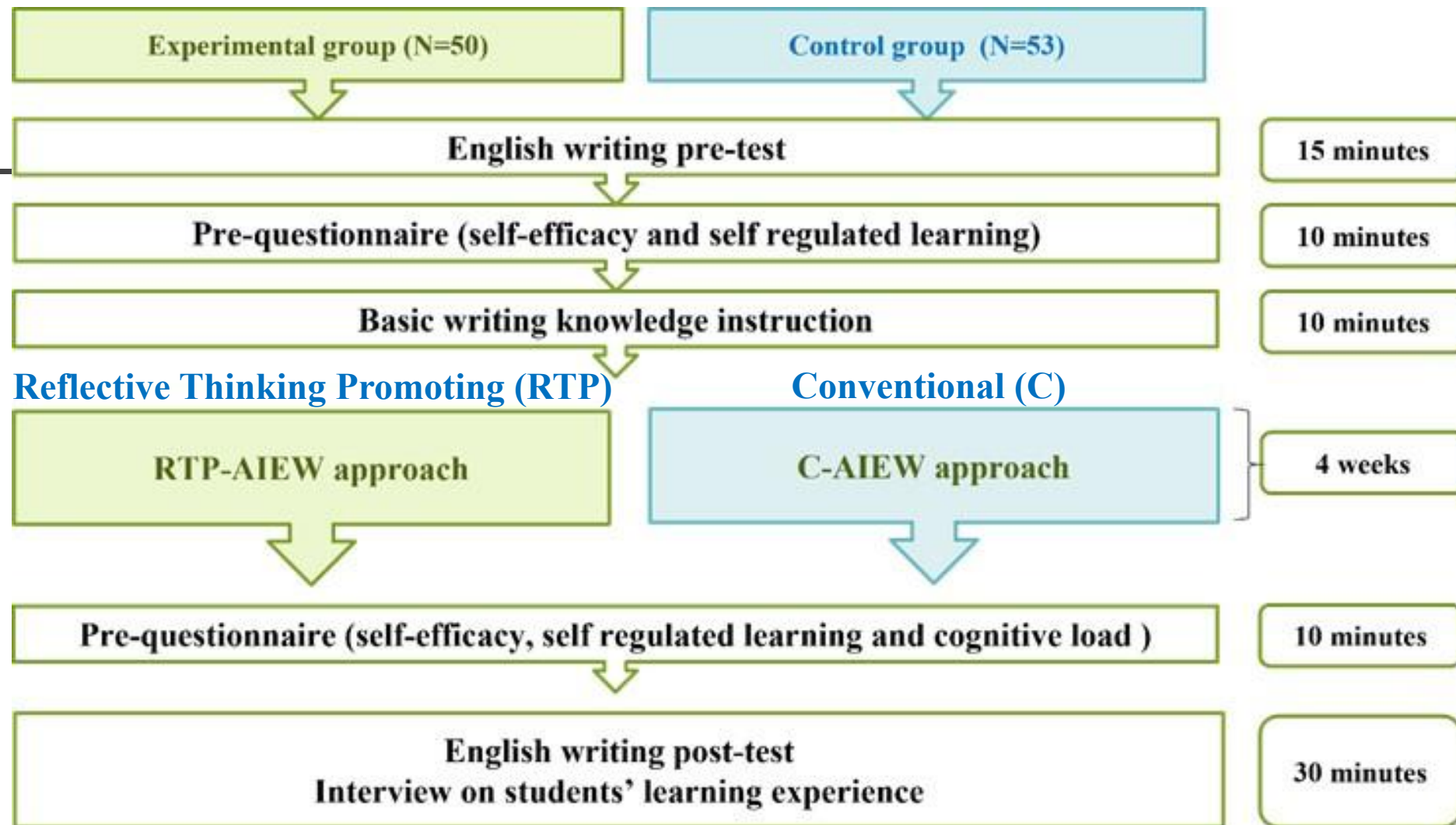
Question and Reflect

请列出你在学习写作和查看报告时遇到的问题，例如：

1. 在查看智能批改报告的时候你遇到了哪些困惑？
2. 你是否信任它的打分？

请在此输入作业文字内容

A step-by-step guiding strategy to help students find their writing problems



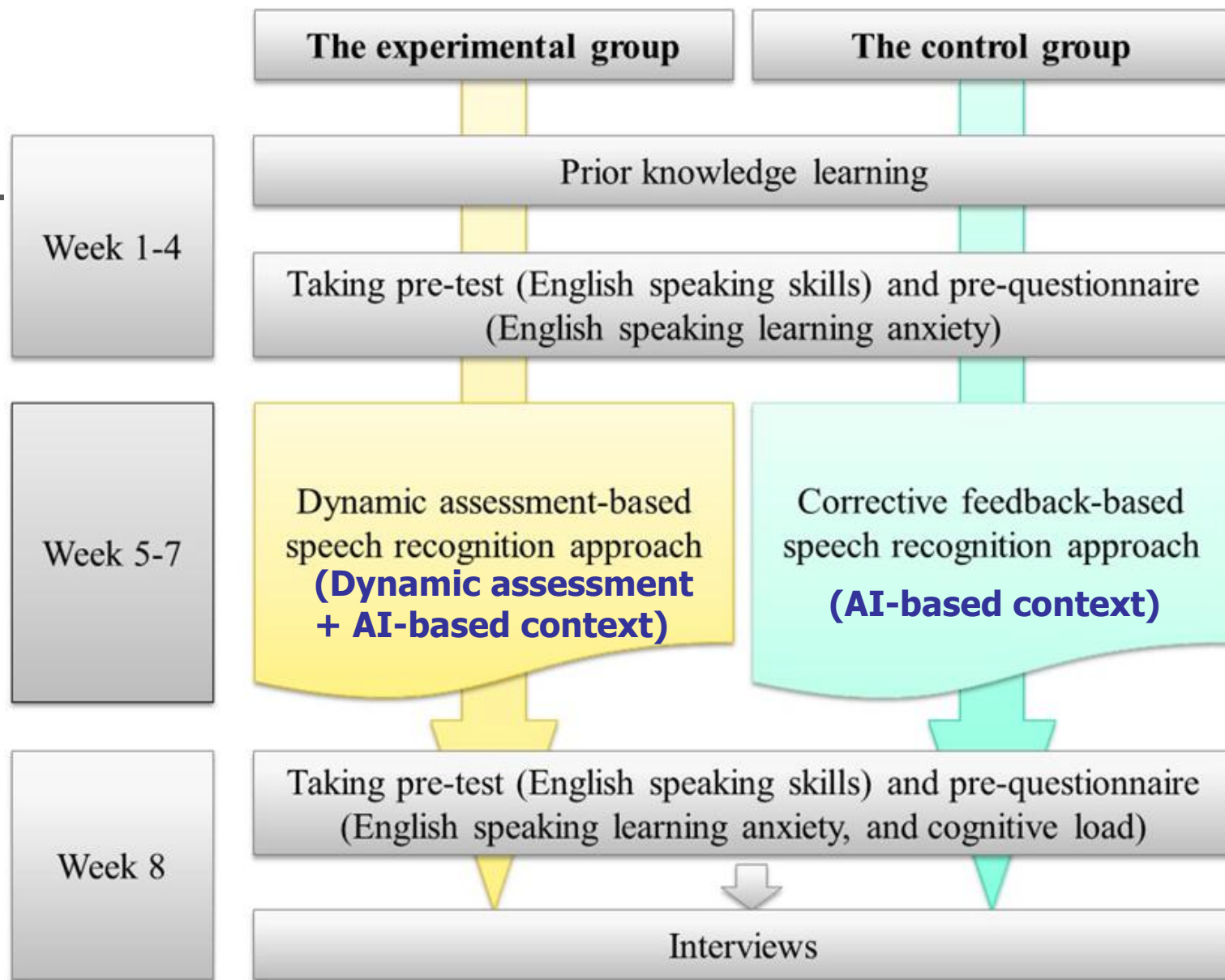
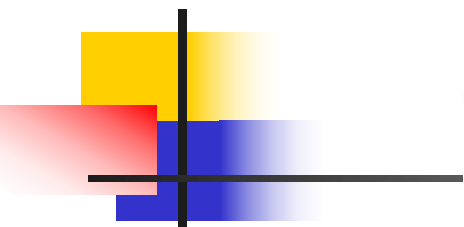
Influences of Integrating Dynamic Assessment into a Speech Recognition Learning Design to Support Students' English Speaking Skills, Learning Anxiety and Cognitive Load

Chih-Hung Chen^{1*}, Chong-Shiuh Koong² and Chien Liao¹

¹ Master Program of Professional Teacher, National Taichung University of Education, Taiwan // ² Department of Computer Science, National Taichung University of Education, Taiwan // duke.chchen@gmail.com // csko@mail.ntcu.edu.tw // btp107203@gm.ntcu.edu.tw

*Corresponding author

ABSTRACT: Artificial intelligence (AI) technology has been progressively utilized in educational environments in recent years, due to the advances in computing and information processing techniques. The automatic speech recognition technique (ASR) provides students with instantaneous feedback and interactive oral practice for supporting a context with self-paced learning. Corrective feedback (CF) should be combined with ASR-based systems to enhance students' speaking performance, and to reduce their cognitive load. However, learners' perceptions of CF are mixed, and CF might give rise to learning anxiety. In this study, a dynamic assessment-based speech recognition (called DA-SR) learning system was designed to facilitate students' English speaking. Moreover, a quasi-experiment was implemented to evaluate the effects of the proposed approach on students' speaking learning effectiveness, via respectively providing the DA-SR and the corrective feedback-based speech recognition (called CF-SR) approaches for the experimental and control groups. The experimental results revealed that both the DA-SR group and the CF-SR group can effectively improve the students' English speaking skills, and decrease their English speaking learning anxiety. Moreover, this study further demonstrated that the DA-SR approach successfully reduced students' English class performance anxiety, and extraneous cognitive load in comparison with the CF-SR approach. It could be a valuable reference for designing English speaking learning activities in EFL learning environments.





Potential AIED research topics (3)

- **AI literacy or AI ethical issues**

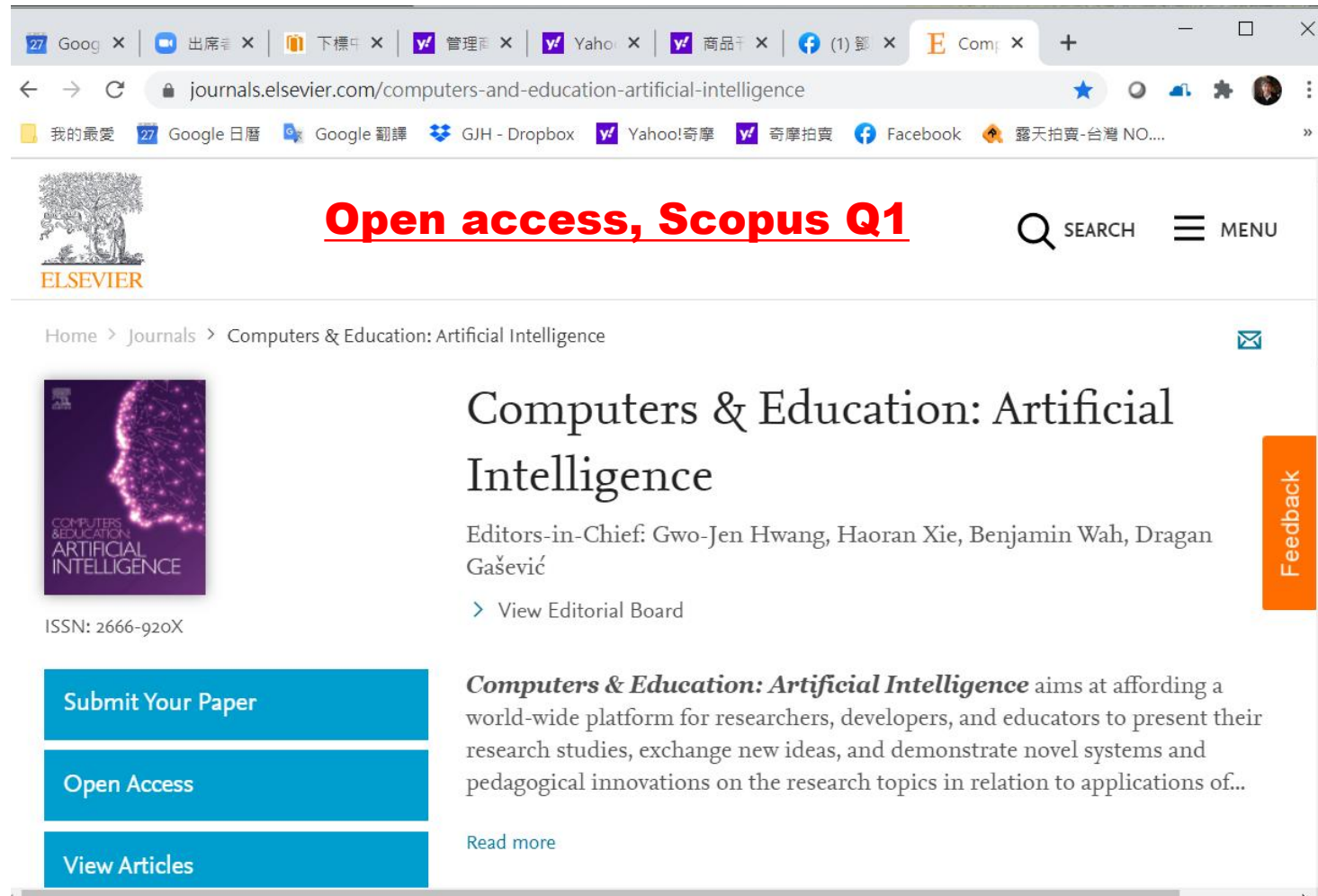
- Does the STEM-based AI course have an impact on students' understanding of AI and AI literacy among students from different majors?
- Do different levels of AI literacy have an impact on students' awareness of AI ethical issues?



What to present in an AIED article?

- In the Introduction section: Why an AI-based learning approach is needed?
 - Providing personalized learning supports (e.g., learning paths, content, guidance or feedback)
 - More practice opportunities (e.g., AI chatbots, automated assessment tools)
- In the Literature Review section:
 - Define AI and the AI technology adopted in the study
 - E.g., rule-based expert system, decision tree, neural network/deep learning, natural language processing

New Elsevier open access journal: Computers & Education: Artificial Intelligence




The screenshot shows a web browser window with multiple tabs open. The active tab is the Elsevier journal page for "Computers & Education: Artificial Intelligence". The browser's address bar shows the URL "journals.elsevier.com/computers-and-education-artificial-intelligence". The page features the Elsevier logo on the left, a red banner with the text "Open access, Scopus Q1", and a search bar. Below the banner, the journal title "Computers & Education: Artificial Intelligence" is displayed, along with the editors-in-chief: Gwo-Jen Hwang, Haoran Xie, Benjamin Wah, and Dragan Gašević. A "View Editorial Board" link is provided. On the left side, there are three blue buttons: "Submit Your Paper", "Open Access", and "View Articles". The ISSN number "2666-920X" is also visible. A vertical orange "Feedback" button is on the right side of the page.

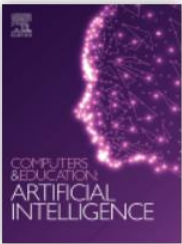
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Educational Technology & Society (SSCI journal, Q1)

Theme-based Call for papers

“Generative Artificial Intelligence in Education: Theories, Technologies, and Applications”

Theme-based CFP Editors:

Gwo-Jen Hwang

Graduate Institute of Educational information and Measurement, National Taichung University of Education, Taiwan

and

Graduate Institute of Digital Learning and Education, National Taiwan University of Science and Technology, Taiwan

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Nian-Shing Chen

Institute for Research Excellence in Learning Sciences, Program of Learning Sciences, National Taiwan

Normal University, Taiwan

Educational Technology & Society (SSCI journal, Q1)

Theme-based Call for papers

“Generative Artificial Intelligence in Education: Theories, Technologies, and Applications”

The submitted papers will be reviewed by at least two experienced reviewers after passing the desktop review.

- It is expected that the first-round review is completed in a month.
- The accepted papers will be published in the coming regular issues of Educational Technology and Society.
- Moreover, selected papers will have the opportunity to be published in a book edited by the theme-based editors.

https://drive.google.com/file/d/1gK_3uFI6mt4-f_OFmnixf3jX70wtYZ6L/view



Recommended readings

- Hwang, G. J., Xie, H., Wah, B. W., & Gašević, D. (2020). Vision, challenges, roles and research issues of artificial intelligence in education. *Computers & Education: Artificial Intelligence*, 1, 100001. **(definition and potential research issues of AIED)**
- Chen, X., Xie, H., Zou, D., & Hwang, G. J. (2020). Application and theory gaps during the rise of Artificial Intelligence in Education. *Computers and Education: Artificial Intelligence*, 1, 100002. **(advancements and research trends of AIED)**
- Hwang, G. J., Sung, H. Y., Chang, S. C., & Huang, X. C. (2020). A fuzzy expert system-based adaptive learning approach to improving students' learning performances by considering affective and cognitive factors. *Computers & Education*, 1, 00003. **(Experimental design of AIED)**
- Hwang, G. J., & Fu, Q. K. (2020). Advancement and research trends of smart learning environments in the mobile era. *International Journal of Mobile Learning and Organisation*, 14(1), 114-129.
- Xie, H., Chu, H. C., Hwang, G. J., & Wang, C. C. (2019). Trends and development in technology-enhanced adaptive/personalized learning: A systematic review of journal publications from 2007 to 2017. *Computers & Education*, 140, 103599.
- Hwang*, G. J. (2014). Definition, framework and research issues of smart learning environments- a context-aware ubiquitous learning perspective. *Smart Learning Environments*, 1(1), 4.



Conclusions

- Developing new AI technologies are not the main foci of AIED research
- The foci of AIED research:
 - How to employ AI to provide personalized supports or guidance to students?
 - How to use AI to help teachers better manage the class?
 - How AI can be work with existing learning strategies or contexts (e.g., project-based learning, inquiry-based learning or concept mapping)?

Gwo-Jen Hwang, PhD

<http://www.idlslab.net/>

Gwo-Jen Hwang is currently a Chair Professor at the National Taiwan University of Science and Technology. He serves as an editorial board member and a reviewer for more than 50 academic journals of educational technology and e-learning.

He is currently the Editor-in-Chief of Computers & Education: Artificial Intelligence (Scopus, Q1), International Journal of Mobile Learning and Organisation (Scopus, Q1), and Journal of Computers in Education (Scopus, ESCI) as well as Associate Editor of IEEE Transactions on Education (SCI). His research interests include mobile and ubiquitous learning, flipped learning, digital game-based learning, and artificial intelligence in education.

Professor Hwang has published more than 800 papers, including more than 400 journal articles published in SSCI journals.

