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LONG PAPER

Enhancement of English learning performance by using an attention-based diagnosing and review mechanism in paper-based learning context with digital pen support

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Abstract Since English is probably the most popular second language, helping students learn English through technology is a critical issue in non-English-speaking countries. With the growth of digital pen technologies, developing an interactive learning environment that combines printed textbooks and a digital pen to support English-language classroom learning has become feasible. This work presents an attention-based diagnosing and review mechanism (ADRM) based on brainwave detection to help learners identify the passages with low attention level in a lesson as review targets in order to perform efficiently and accurately review processes while reading paper-based English texts with digital pen support in autonomous learning environments. Based on the true experimental design, this work aims to confirm whether the ADRM improves the review performance and sustained attention of learners while reading paper-based English texts with digital pen support. The research participants were a total of 108 students at an industrial vocational high school in Taipei City, Taiwan. All research participants were male and aged from 17 to 18 years. The experimental group used the ADRM while reading paper-based English texts with digital pen support, whereas the control group used the autonomous review while reading paper-based English texts with digital pen support. Experimental results reveal that the review performance of the experimental group was significantly better than that of the control group, proving that the ADRM improved review performance. The results also show that the field-dependent learners in the experimental group exhibited a great improvement in review performance in comparison with the field-independent learners. Additionally, the low-ability learners in the experimental group exhibited better review performance compared to those in the control group. Furthermore, learners with high attention level in the experimental group have exhibited better review performance and sustained attention than the learners in the control group. This work confirms that developing an ADRM based on brainwave detection to assist learners' review processes is practicable. However, the usability and acceptability of using ADRM instead of human autonomous review should be further considered in the information society.

Keywords Brainwave signals · Digital pen · English learning · Attention recognition · Attention-based diagnosing and review mechanism

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1 Introduction

English is probably the most popular second language in many non-English-speaking countries [8, 9]. Many studies [12, 17, 35] have pointed out that developing novel and effective learning environments can promote the effectiveness of students' language learning and increase their interest therein. Therefore, many computer-assisted language

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learning (CALL) [25] systems have been designed to help learners learn English using suitable technology. For example, Hu et al. [20] developed an interactive multimedia Web site as a technology-assisted learning platform to support the learning of English and compared technology-assisted learning with face-to-face learning. Their study confirmed that technology-assisted learning supported greater learning effectiveness than conventional face-to-face learning. Hui et al. [22] used the same technology-assisted learning platform [20] to support English-language learning for university students, including reading, speaking, listening, vocabulary, and writing. Their results demonstrated that CALL better supports vocabulary acquisition than face-to-face learning. Chen et al. [14] proposed a self-regulated learning (SRL) mechanism that was combined with a digital reading annotation system (DRAS) to help Grade 7 students to generate rich and high-quality annotations to improve their performance in reading English. Their study revealed that the reading comprehension of the learners was significantly improved by using the proposed DRAS with the SRL mechanisms to read English texts online.

Most CALL systems for English learning offer interactive functions that rely mainly on computer screens. A study of the computer-screen reading habits of university students showed that 74% of participants prefer paper-based to computer-screen reading [45]. Allen [2] also found that 75% of students prefer printed textbooks to digital textbooks. Mangen et al. [30] found that reading texts on paper led to significantly better comprehension performance than reading the texts on a computer screen. Therefore, most students prefer, or are used to, paper-based reading and learning activities [4, 48]. Moreover, many empirical studies have found that reading and working using printed paper results in a lower cognitive load than working with a computer [34, 46]. These studies imply that the use of screen-based technologies for learning English may not be effective or acceptable for learners. Accordingly, an interactive paper-based CALL system to support the learning of English is required. Therefore, this work proposes an integrated interactive digital pen technology for use with printed textbooks to support paper-based learning of the English language. Many studies have verified that this technology is very effective in improving learning performance [3, 12, 24]. For example, Chen et al. [12] developed an interactive learning environment that combines printed textbooks with digital pen technology to support English-language learning. This digital pen and paper interaction platform (DPPIP) enables teachers to develop paper-based activities that involve the digital pen for English-language learning and enables students to use digital pens to interact with printed reading tags to obtain immediate assistance, including oral reading demonstrations, and to record oral readings and rehearse independent reading aloud.

Students may easily lose attention during learning in the absence of supervision by a teacher [49]. However, attention is the key determinant of learning performance [43]. In recent years, developments in human physiological signal measurement technology have been considerable, and this technology has been successfully applied to the evaluation of emotion [11, 13] and attention [10, 15, 39]. Therefore, many recent studies have focused on developing e-learning systems using an attention model to improve the performance of learners by continuously measuring their physiological signals and by using wireless communication technology to monitor their attention [10, 15, 19].

Generally, learners adopt an autonomous review method that performs the review process based on self-judgment to review the lessons that they have not learnt well while performing English learning. However, it is difficult to memorize correctly those lessons that need to be reviewed by themselves during the reading of English texts with a digital pen support due to the limited working memory. To improve review performance during the reading of English texts with a digital pen support, brainwave detection technology is used herein to develop an ADRM which can diagnose and record the printed reading tags with corresponding English texts that the digital pen can click for individual learners who are paying little attention on the printed reading tags. The system then provides reviews of those texts to which learners were paying little attention, providing an opportunity for the student to consolidate everything that should have been learned. The research questions of the study address whether any significant differences exist in the review performance and review attention of learners using the ADRM and that of those using the autonomous review while reading paper-based English texts with digital pen support, and whether significant differences exist in review performance and review attention of learners with distinct cognitive styles, distinct learning abilities, and distinct attention levels using the ADRM and of the corresponding groups of learners using the autonomous review while reading paper-based English texts with digital pen support.

2 Literature review

2.1 Digital pen technology-supported learning

In recent years, digital pen technology has been studied as an assistive educational technology. For example, Huang et al. [21] used a digital pen to support English learning for primary school students. They confirmed that using a digital pen as a tool to learn English can effectively reduce anxiety and increase learners' interest. Higgins and Raskind [18] examined the compensatory effectiveness of the digital pen in the reading comprehension of students with learning

disabilities. In their experiment, students with reading disabilities aged between 10 and 18 were given 2 weeks of training in using the digital pen as a learning tool. Their results demonstrated that the digital pen had a positive impact on reading comprehension. In addition, Chang [5] developed a collaborative English as a foreign language (EFL) reading platform that integrated a digital pen and Wiki. This system provided a learning environment that supported EFL reading. Piper et al. [37] studied the practices of speech therapy and demonstrated that the digital pen and paper interface has potential for speech-language therapy.

Alvarez et al. [3] utilized digital pens and interactive whiteboards in support of individual work and found that these increased the motivation of students to work with the teacher to solve problems. Lai et al. [24] developed an interactive multimedia textbook for computer programming with a digital pen to support learning. Their research results demonstrated a positive effect on understanding programming concepts. Chen et al. [12] proposed a digital pen and paper interaction platform (DPPIP) that integrated digital pen technologies, printed textbooks, and a course management system, to support the repetitive reading strategy for improving fluency in the oral reading of English. Their results revealed that using the DPPIP to support an English-language course had significantly positive effects on fluency, motivation to learn, and satisfaction with learning for junior high school students. The DPPIP helped students with field-independent and field-dependent cognitive styles [47] accelerate improvement in oral reading fluency. Therefore, this work proposes an ADRM based on brainwave detection to help learners review lessons with low attention level while reading paper-based English texts with digital pen support and examined the potential of this proposed system to improve English-language learning performance.

2.2 Effects of attention awareness on learning performance

Sustained attention has been considered to be a critical issue in cognitive psychology because of its strong relationship with learning performance [15, 43]. Keller and Suzuki [23] indicated that an e-learning lesson must gain and sustain learners' attention because learners' attention spans are typically 20–30 min. Therefore, many recent studies have focused on the development of e-learning systems based on a model of attention awareness to promote learning performance of learners or alert teaching statuses of teachers in a digital learning environment by monitoring their states of attention. Developing an attention aware system to identify a learner's attention level based on human physiological signals for promoting digital learning performance has been confirmed as an applicable approach. For example, Hsu et al. [19] developed a reading concentration monitoring system for use with e-books in an intelligent classroom. The system captured the learning behaviors of students using three kinds of sensor: webcam sensors, heartbeat sensors, and blood oxygen sensors. Various physiological signals are collected and used to evaluate the concentration of students on reading. The researchers found that their developed system helped instructors to understand the students' reading concentration rates in a classroom learning environment. Chen et al. [7] developed a novel attention aware system (AAS) capable of recognizing students' attention levels accurately based on EEG signals, thus having high potential to be applied in providing timely alert for conveying low attention level feedback to online instructors in an e-learning environment. Chen and Huang [10] proposed a Web-based reading annotation system with an attention-based self-regulated learning mechanism (ASRLM), which is based on brainwave detection, to enhance the sustained attention of learners while reading annotated English texts online, and thereby promote online reading performance. Also, Raca and Dillenbourg [38] developed a system for monitoring the attention paid by teachers in a classroom and giving feedback to the teacher when it drops. It is obvious that the effects of attention awareness on promoting e-learning performance are significant.

However, to the best of our knowledge, few studies have focused on developing attention awareness system based on human physiological signals to diagnose learners' learning problems in digital learning environments. Therefore, a novel ADRM, which dynamically monitors individual attention levels and provides a lesson review list based on diagnosing periods of low attention, was designed herein to support the paper-based reading of English texts with digital pen. This study logically supposed that reviewing the passages with low attention level can perform efficiently and accurately review processes while reading paper-based English texts with digital pen support in autonomous learning environments. Based on this assumption, this study examines the effects of English learning with ADRM support on the attention of learners and review performance determined by the score of posttest after performing the review process.

2.3 Effects of cognitive style on learning performance

Among a variety of individual characteristics, cognitive style significantly affects learning performance. Cognitive style has also been identified as significantly influencing learners' preferred learning materials. Mampadi et al. [29] proposed an adaptive hypermedia learning system to examine the relationships between learners' cognitive style and their learning perceptions and learning performance, based on their responses to the proposed system. Their results indicated that adaptation to cognitive style improves learning, and an adaptive hypermedia learning strategy has a greater effect on

learners' learning perceptions than on their learning performance. Two of the most important kinds of learning styles are Witkin's field-dependent and field-independent cognitive styles [47]. Nozari and Siamian [31] examined how the field-dependent and field-independent cognitive styles affect the reading comprehension while reading an English text. Their results revealed a significant linear relationship between field dependence/independence and learning performance. Greater field independent is associated with higher reading comprehension. Sabet and Mohammadi [41] studied the relationship between the field-dependent and field-independent cognitive styles and the reading comprehension abilities of EFL readers. Their results demonstrated a relationship between the two cognitive styles and reading comprehension. Chen [16] proposed a Web-based learning system that uses Web-based learning programs to identify how learners' field-dependent and field-independent cognitive styles and learning behavior are related to each other. They thus confirmed that participants with different cognitive learning styles have different learning strategies and favor different navigation tools for the purposes of learning.

Chen et al. [12] proposed a digital pen and paper interaction platform (DPPIP) in which digital pen technologies were integrated with printed textbooks and a course management system to support the repetitive reading strategy for improving oral reading fluency in English. Analytical results demonstrated that using the DPPIP to support an English-language course helped students with field-independent or field-dependent cognitive styles improve their oral reading fluency. Therefore, this study focuses on finding whether significant differences exist in review performance and review attention of learners with distinct cognitive styles while performing the ADRM and the autonomous review in the context of reading paper-based English texts with digital pen support.

3 Methodology

3.1 Research architecture

In this work, the independent variable is the use of the ADRM or autonomous review to assist the learning of English-language texts in a paper-based learning context with digital pen support. The experimental group used the ADRM to learn English-language texts in paper-based learning context with digital pen support, whereas the control group used the autonomous review. Dependent variables are review performance and review attention paid during performing the review of English-language texts. Several previous studies have argued that e-learning may generate different effects on learners who have distinct learner characteristics such as cognitive styles [12], sustained attention levels [10], and learning abilities [32]. This work thus considered the three learner characteristics as the background variables to explore whether the use of the ADRM or autonomous review generated different effects on review performance and review attention of learners with distinct cognitive styles, sustained attention levels, and learning abilities. Both groups were taught the same English texts for the same period in an autonomous learning environment.

3.2 Experimental design

This work applies the true experimental design [42] to perform the instructional experiment. The participants of the study were randomly recruited from Grade 10 (42 students) and Grade 11 (66 students) at an industrial vocational high school in Taipei City, Taiwan. All participants were male, aged 17–18 years. According to the true experimental design, participants were randomly assigned to the experimental group and the control group. Those in the experimental group learned selected English-language texts with the ADRM support in paper-based learning context with digital pen support, whereas those in the control group learned the same texts as with the experimental group using the autonomous review. Of the 108 participants, the experimental group comprised 53 and the control group comprised 55 participants.

3.3 Experimental procedure

Figure 1 shows the learning procedure in the instructional experiment. The experimental procedure can be divided into three stages, as follows.

1. *First stage*
   Before the instructional experiment was performed, students took a pretest that involved the selected English texts to evaluate the English-language proficiency of both groups. The Group Embedded Figures Test (GEFT) [47] was used to identify the cognitive styles of learners in both groups. Then, all participants in both groups were taught how to use a digital pen to interact with printed reading tags to obtain immediate assistance in reading and learning English. The wearing of MindSet earphones, which were used to record the level of sustained attention in the learning process, was also demonstrated.
2. *Second stage*
   In the instructional experiment, all participants in both groups learned the same English texts with the assistance of the digital pen for 20 min. Figure 2 shows the English texts with printed tags that can be clicked with the digital pen for learning. First, participants started by clicking the printed tag "begin reading" (step 1 of Fig. 2). Then, the learners could click the English text

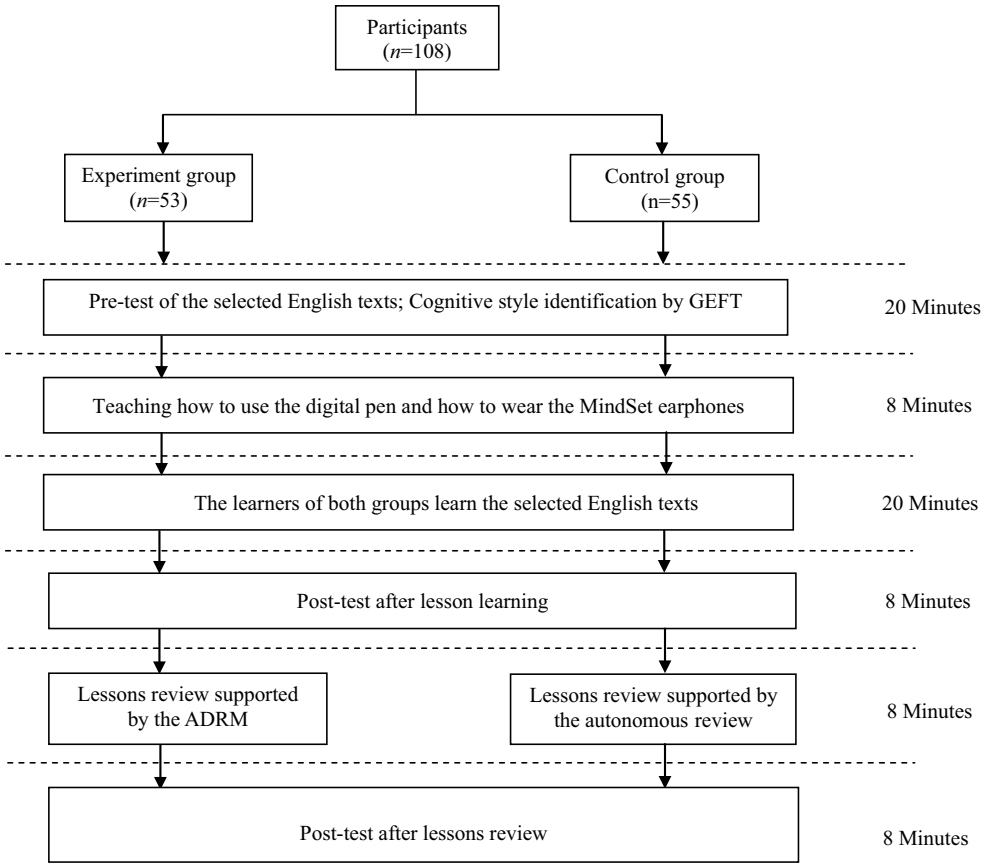

Fig. 1 Learning procedures of the designed instructional experiment

Fig. 2 English text with printed tags that can be clicked with the digital pen for learning

with the printed tag to play the corresponding oral reading of the English text (step 2 of Fig. 2), to reveal an explanation in English (step 3 of Fig. 2), to reveal an explanation in Chinese (step 4 of Fig. 2), or to learn vocabulary (step 5 of Fig. 2). In addition to step 1, the other learning steps are optional, not fixed, and mandatory steps, respectively. The learners could determine the order and combination of learning steps 2–5 by themselves. At the same time, the learners wore the MindSet earphones, which assessed the level of sustained attention during the learning process as they read the selected English-language texts. After 20 min of learning, the students were given a posttest to assess their learning performance.

3. *Third stage*
   Following the above, learners of the experimental group were treated with a learning review that was supported by the ADRM, which was based on attention detection. Learners in the control group reviewed their own learning in an autonomous review. Learners in the experimental group needed to follow the guide of the ADRM to perform their review processes. This work supposed that the use of ADRM has potential benefits in enhancing learners' long-term knowledge retention so that their learning performance can be significantly improved because the ADRM can accurately and efficiently guide them to perform the review process. On the other hand, the autonomous review means that learners in the control group could perform review processes based on their self-judgment. For example, they could click the printed tag "legendary" that appears in Fig. 2 by using the digital pen to learn the vocabulary again if they felt the vocabulary needs to be reviewed based on their self-judgment. In this case, the learners' decision may be due to paying little attention to learning the vocabulary or still being unfamiliar with the vocabulary even if the vocabulary has been learned.

To assess the effects of the lesson review mechanisms—the ADRM and autonomous review—on the review performance of both groups, the learners of both groups had to take a posttest immediately after the end of the lesson review. The review performance was determined by evaluating the score of the posttest after performing the review process. This study designed the pretest performed before lesson learning, posttest performed after lesson learning, and posttest performed after lesson review that contain the same questions with different sequences of selecting items in a multiple-choice design. The aim is to control that the three test sheets have the same difficulty and to reduce the probability of giving correct answer based on guessing. Based on the results of the posttests of both groups following their lesson review, this work examined whether the review performance and review attention in the experimental group were better than those in the control group.

3.4 Research participants

A total of 108 students who speak Chinese as their first language were recruited to participate in the instructional experiment. Their English-language skills are basic level of General English Proficiency Test (GEPT), which is a test of English-language proficiency commissioned by Taiwan's Ministry of Education. The students were from four classes at an industrial vocational high school in Taipei City, Taiwan. All participants were male, aged between 17 and 18 years. Of the 108 participants, 53 were randomly assigned to the experimental group, reviewing their lessons with ADRM support, while the remainders were randomly assigned to the control group, reviewing their lessons autonomously.

3.5 Research instruments

3.5.1 Paper-based reading with digital pen support

The study used the Livescribe™ smartpen to support paper-based classroom English learning. This kind of digital pen is an advanced paper-based computer in the form of a pen that can synchronously record everything one hears and writes and provide both audio and visual feedback, powerful processing capabilities, and substantial built-in storage [26]. Moreover, to perform paper-based operations, the Livescribe smartpen uses Livescribe™ dot paper, which is standard paper with printed microdots on its surface. These dots are nearly invisible to the human eye; however, the smartpen can easily see and use them to know which page one is writing on and the exact location on that page. The Livescribe smartpen is composed of nine components including replaceable ink tip, soft rubber grip, anti-roll design, built-in speaker, built-in microphone, organic light-emitting diode (OLED) display, power button, micro-USB connector, and headset/audio jack. Figure 3 shows the components of the Livescribe smartpen.

Articles in the "Ivy League Analytical English" magazine for senior high school students were selected as the English learning materials. Paper-based reading, integrating with Livescribe™ smartpen, printed tags made of Livescribe™ dot paper, and printed textbooks, were used to assist English learning. Students could use their digital pens to click printed tags to interact with the texts in printed textbooks (Fig. 4).

3.5.2 Proposed ADRM for promoting review performance

Electrical EEG brainwave monitoring equipment, NeuroSky's MindSet earphones [33], was used herein to measure the sustained attention of learners. The device comprises a headset, an ear clip, and a sensor arm. Attention values in the range 0–100 were calculated form collected real-time EEG signals that were wirelessly transmitted to a computer with a brainwave receiver, using a patented algorithm developed by NeuroSky. Chen and Huang [10] applied Pearson product-moment correlation analysis to confirm the scores of all participants in the Birdwatching game, an attention training game developed by Lumosity (http://www.lumosity.com/) and the attention values measured by the NeuroSky's MindSet earphones to verify the correlations. The result shows that the two were strongly correlated ($r = .730$, $p = .000 < .05$), thus proving that the MindSet earphone

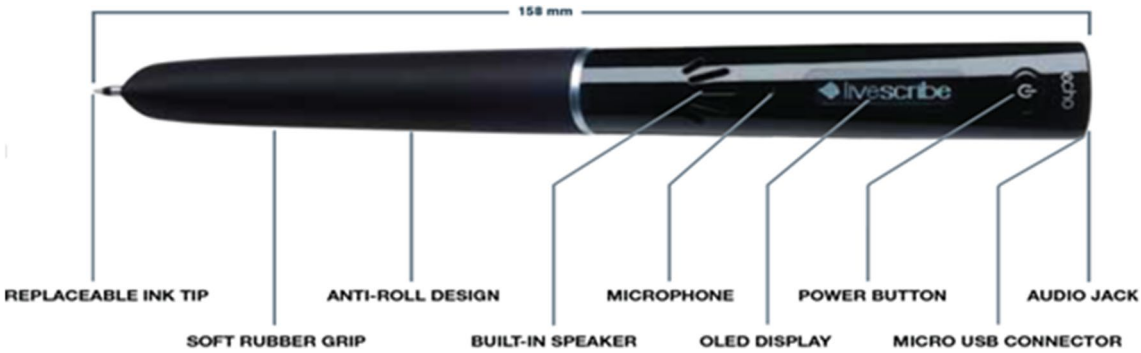

Fig. 3 Components of Livescribe smartpen

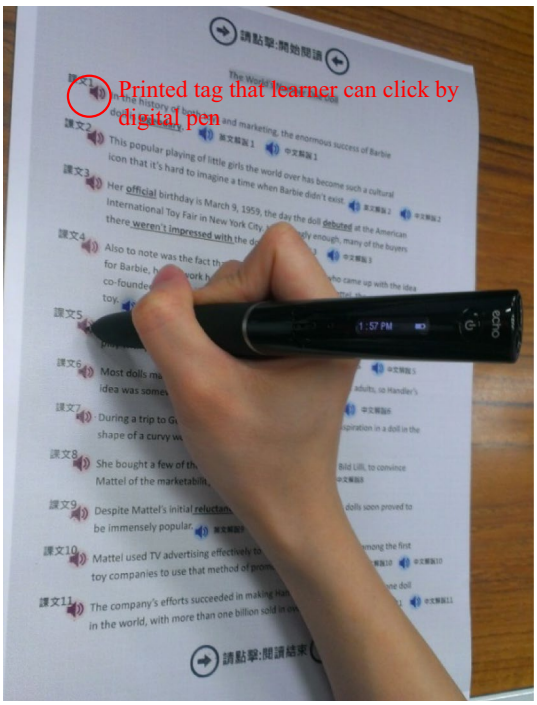

Fig. 4 Example of using the digital pen in paper-based English learning

was a valid measurement tool to identify learner attention. Therefore, the proposed ADRM integrated the paper-based reading with digital pen support and the measurement of sustained attention using NeuroSky's MindSet earphones to diagnose whether learners generated low attention while clicking the printed tags by digital pen for learning English-language texts. Figure 5 presents the integrated user interface.

The proposed ADRM can record the learning processes of an individual learner, including the time stamps associated with clicking on printed reading tags and the attention values for every second of the individual learners. An attention graph with time as the *X* coordinate and attention value upon clicking a labeled tag as the *Y* coordinate is plotted. An attention threshold value is set based on a pilot study to divide the learners into low- and high-attention groups. Then, based on a sorted list of printed tags that were clicked when attention was low, the ADRM recommends review content to the students in the experimental group.

Several pilot experiments were performed to set the threshold between low- and high-attention groups. The procedure for determining the threshold value is as follows. First, the NeuroSky's MindSet earphone set is used to record the attention values during the learning of the selected English-language texts. Then, the average value of attention is calculated from the collected data. Based on the trial-and-error pilot experiments, when the attention value of a learner is less than the average for 8 s on a printed tag that the digital pen can click, then the printed tag is recorded as the printed tag that the learner needs to review. Since EEG signals may oscillate during the recording, when the attention value of learner remains above average for 5 s, the recording ends.

3.5.3 Group embedded figures test (GEFT)

All participants were classified by cognitive style into field-dependent (FD) and field-independent (FI) learners, using the modified Chinese version of the Group Embedded Figures Test (GEFT) [47]. The aim was to determine whether different lesson review methods cause differences in the effectiveness for students with field-independent and field-dependent cognitive styles. The scale's reliability by the Spearman–Brown prophecy formula is .82. This work applied the GEFT to identify students whose GEFT scores were higher and lower than the average score as field-independent and field-dependent styles, respectively.

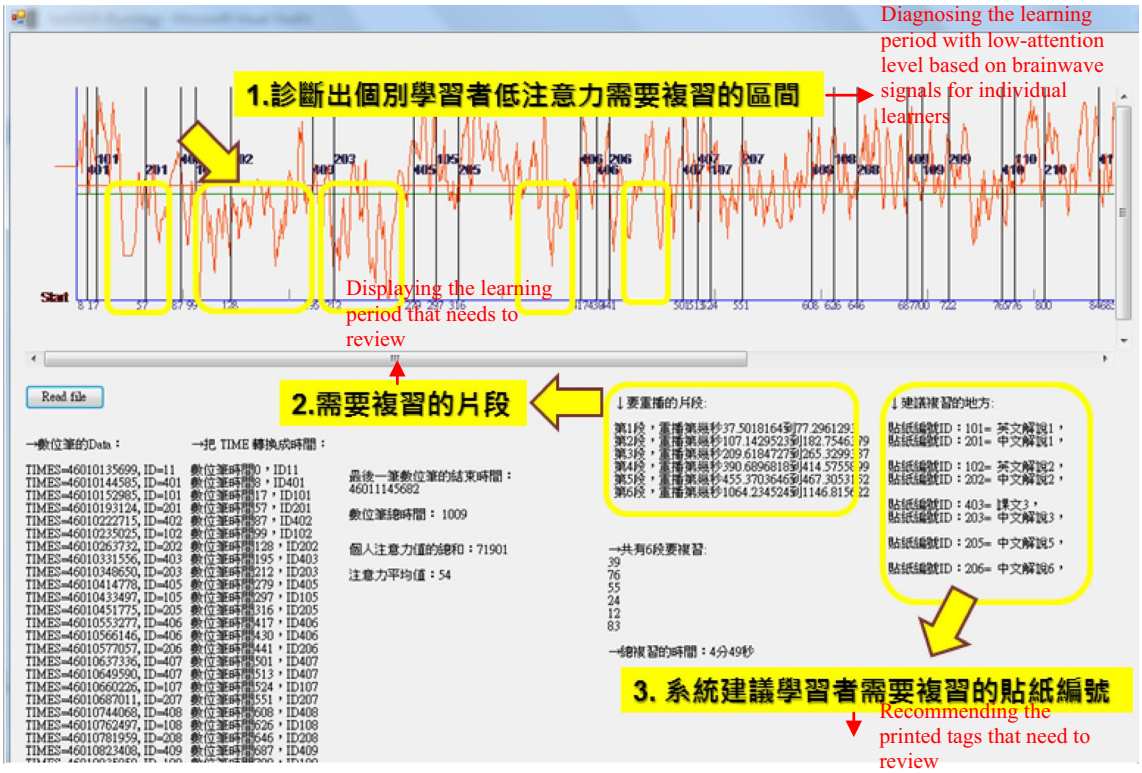

Fig. 5 Integrated user interface of paper-based reading with digital pen and ADRS support

4 Experimental results

4.1 Analysis of initial English abilities of learners in both groups

The initial English abilities of learners in the two learning groups were assessed before the instructional experiment was performed. The independent samples t test was conducted to identify differences between the initial English abilities of learners in both groups. The results reveal that the difference between the pretest results of both groups was not statistically significant ($t = .858$, $p = .393 > .05$), indicating that learners in both groups had equivalent English abilities.

4.2 Analysis of difference in review performance and attention of both groups

The analysis of difference in review performance aimed to assess whether the review performance and review attention paid by both groups differ significantly with the use of the ADRM or autonomous review to support English-language texts learning based on the independent samples t test. Table 1 shows the results, demonstrating that the review performance of the two groups differed significantly ($t = 2.00$, $p = .048 < .05$) and the experimental group had better review performance compared to the control group. Therefore, the review performance of learners was significantly improved by the proposed ADRM. However, the review attention paid by learners in both groups did not differ significantly ($t = .84$, $p = .401 > .05$).

Table 1 Independent samples t test of review performance and attention of both groups

Test item	Learning group	Number of learners	Mean	SD	t	Significance (two tailed)
Review performance	Experimental group	53	5.38	1.86	2.00	.048*
	Control group	55	4.60	2.16		
Review attention	Experimental group	53	65.01	12.36	.84	.401
	Control group	55	62.85	14.13		

* $p < .05$

4.3 Analysis of difference in review performance and attention of learners with different cognitive styles between both groups

This analysis aimed to assess whether the review performance and attention of learners with either the field-independent (FI) or the field-dependent (FD) cognitive style differs significantly between both groups, using the independent samples *t* test. Table 2 shows the results, which reveal that the review performance of FD learners differed significantly between both groups ($t = 2.25$, $p = .028 < .05$), although the review performance of FI learners did not differ significantly between both groups ($t = .46$, $p = .647 > .05$). The review attention paid did not differ significantly between both groups for FD learners ($t = .34$, $p = .746 > .05$) and FI learners ($t = 1.00$, $p = .325 > .05$). As shown in Table 2, the mean review scores of FD learners in the experimental group were higher than that of FD learners in the control group ($M = 5.44 > 4.15$), indicating that FD learners in the experimental group had a better review performance than FD learners in the control group. Restated, the use of the ADRM as a review mechanism rather than autonomous review greatly improved the review performance of learners with the FD cognitive style.

4.4 Analysis of difference in review performance and attention of learners with different learning abilities between both groups

The posttest scores after performing the 20-min learning activities were applied to identify students whose posttest scores were higher or lower than the average score as high-ability learners and low-ability learners, respectively. Whether the review performance and attention of learners with low ability and high ability differed significantly was also determined. Table 3 shows the results, which reveal that the review performance of low-ability learners differed significantly between both groups ($t = 2.27$, $p = .027 < .05$), although that of high-ability learners did not ($t = .83$, $p = .409 > .05$). However, sustained attention did not differ significantly between both groups for either low-ability learners ($t = .86$, $p = .392 > .05$) or high-ability learners ($t = .28$, $p = .781 > .05$). Restated, the low-ability learners in the experimental group had better review performance than

Table 2 Independent samples *t* test of the review performance and attention of the field-dependent and field-independent learners in both groups

Test item	Learning group	Cognitive style	Number of learners	Mean	SD	*t*	Significance (two tailed)
Review performance	Experimental group	FD	36	5.44	1.86	2.25	.028*
	Control group		26	4.15	2.66		
	Experimental group	FI	17	5.24	1.92	.46	.647
	Control group		29	5.00	1.51		
Review attention	Experimental group	FD	36	64.14	12.51	.34	.746
	Control group		26	63.04	14.00		
	Experimental group	FI	17	66.86	12.20	1.00	.325
	Control group		29	62.69	14.49		

* $p < .05$

Table 3 Independent samples *t* test of the review performance and sustained attention of both group learners with low and high ability

Test item	Group	Learning ability	Number of learners	Mean	SD	*t*	Significance (two tailed)
Review performance	Experimental group	Low ability	27	4.56	1.28	2.27	.027*
	Control group		30	3.63	1.77		
	Experimental Group	High ability	26	6.23	2.01	.83	.409
	Control group		25	5.76	2.03		
Review attention	Experimental group	Low ability	27	66.32	14.18	.86	.392
	Control group		30	62.95	15.14		
	Experimental Group	High ability	26	63.66	10.25	.28	.781
	Control group		25	62.74	13.13		

* $p < .05$

the control group. This result verifies that the review performance of low-ability learners was significantly improved by the proposed ADRM. However, the high-ability learners did not differ significantly in review performance or review attention between the two groups.

4.5 Analysis of difference in review performance and attention of learners with different attention levels in experimental group

During the 20-min learning activities, sustained attention values assessed by the MindSet earphone set were applied to identify students whose sustained attention values were higher or lower than the average score as high-attention learners and low-attention learners, respectively. To assess how attention levels of learners in the experimental group affected review performance and sustained attention, the difference in the review performance and sustained attention of learners with low or high attention levels in the experimental group was evaluated using an independent samples *t* test. Table 4 presents the results, which show that the low- and high-attention learners of the experimental group differed significantly in the review performance ($t = 2.07$, $p = .044 < .05$) and review attention ($t = 2.63$, $p = .011 < .05$), indicating that high-attention learners in the experimental group who used the ADRM support had better review performance and review attention compared to the low-attention learners in the experimental group.

4.6 Analysis of difference in review performance and attention of learners with different learning abilities in experimental group

To assess how the learning ability of learners in the experimental group affects review performance and attention, the difference in the review performance and attention of learners with low and high ability in the experimental group was evaluated using the independent samples *t* test. Table 5 shows the results, which indicate that the difference in review performance between the low- and high-ability learners in the experimental group was statistically significant ($t = 3.61$, $p = .001 < .05$) in favor of the high-ability learners. However, the difference in the review attention between the low- and high-ability learners of the experimental group was not statistically significant ($t = -.78$, $p = .439 > .05$). Therefore, the use of ADRM support significantly improved the review learning performance of high ability learners.

5 Discussion

Although the digital pen technology is relatively new, many studies have confirmed its benefits in terms of improving language learning [3, 12, 24]. Lam and Beale [27] demonstrated that the attention factor ratings were strongly correlated with reading comprehension scores for normally developing children. Briefly, solving problems associated with sustained attention may be the best way to improve learning performance. In that respect, the work presented in this paper has proposed an ADRM combined with paper-based reading with digital pen support to automatically provide an order in which lesson contents

Table 4 Independent samples *t* test of review performance and attention of the learners with low and high attention level in the experimental group

Test item	Attention group	Number of learners	Mean	SD	*t*	Significance (two tailed)
Review performance	High attention level	25	5.92	2.040	2.07	.044*
	Low attention level	28	4.89	1.571		
Review attention	High attention level	25	69.49	11.214	2.63	.011*
	Low attention level	28	61.01	12.132		

* $p < .05$

Table 5 Independent samples *t* test of review performance and sustained attention of the learners with low and high ability in the experimental group

Test item	Learning ability group	Number of learners	Mean	SD	*t*	Significance (two tailed)
Review performance	High ability	26	6.23	2.01	3.61	.001*
	Low ability	27	4.56	1.28		
Sustained attention	High ability	26	63.66	10.25	− .78	.439
	Low ability	27	66.32	14.18		

* $p < .05$

should be reviewed by monitoring periods of low attention of learners. Its potential in improving English-language learning performance was examined. Experimental results reveal that the experimental group with ADRM support exhibited significantly better review performance than the control group with autonomous review, proving that the ADRM improved review performance. Clearly, the proposed ADRM accurately identified the printed tags with low-attention periods of learners based on the EEG attention scores to enable them to effectively review their lessons with review outcomes that are better than would be achieved by self-review. This finding confirmed that diagnosing the lesson that the learners needed to review by using the EEG attention scores is an applicable approach. This is consistent with the results of Chen and Huang [10], who found that sustained attention paid and learning performance were significantly positively correlated with each other. Therefore, reviewing the printed tags with low attention level for individual learners provides benefit in terms of improving review performance. Restated, learning performance can be improved by reviewing the lesson contents with low attention level.

A number of previous studies of field dependence and independence [28, 36] have yielded inconsistent results in various learning scenarios. The present study has found that using ADRM as a review mechanism for English-language learning improved the review performance of field-dependent learners though not of field-independent learners. One possible reason is that field-dependent learners are more easily affected by their environment than field-independent learners and that field-dependent learners tend to rely on information that is provided by the outer world [6, 47]. However, Chen et al. [12] developed a digital pen and paper interaction platform (DPPIP) that comprised a student learning tier, a course management tier, and a teacher tutoring tier, in which digital pen technologies were integrated with printed textbooks and a Moodle course management system to support the repetitive reading strategy for improving English-language oral reading fluency. They confirmed that the DPPIP helped students with field-independent and field-dependent cognitive styles improve oral reading fluency. Many studies have found that field-independent students do better in L2 learning situations [1, 31, 44]. Abraham [1] also indicated that field-independent students performed better than field-dependent students in learning English. Nozari and Siamian [31] claimed that greater field independence is associated with greater reading comprehension skills and greater academic achievement. Tinajero and Páramo [44] showed that field-independent students consistently achieve higher academic results than field-dependent students. It is encouraged that the proposed ADRM provided good benefits to field-dependent learners with low attention to review English learning materials effectively.

Low-ability learners who use the ADRM to review lessons exhibited better review performance than those who reviewed lessons autonomously, indicating that low-ability learners gain the most from ADRM support for review when the paper-based reading with digital pen is used to study English, perhaps because it is difficult for low-ability learners to perform autonomous review. Thus, CALL systems, such as the ADRM, provide more help to low-ability learners of English than to others.

Some limitations of this work warrant consideration. First, the proposed ADRM was used for review purposes to support the use of paper-based learning with digital pen support by male students at an industrial vocational high school in Taiwan for studying English-language texts. Research results cannot be transferred readily to female students or to research subjects of different academic levels. Second, articles in the "Ivy League Analytical English" magazine were used as English learning materials for high school students. Whether the research results hold for learning materials related to different subjects needs to be examined further.

6 Conclusions and future work

In this work, an ADRM, which is based on brainwave detection, is designed to help learners review lessons that involve the reading of paper-based English texts with digital pen support. Analytical results reveal that providing lessons for review to which learners originally paid little attention improves review performance. The monitoring of learners for learning periods with low attention as they read English texts on paper feasibly improves review performance. Analytical results demonstrate that the ADRM provides a greater benefit to field-dependent as compared to field-independent learners in this respect. Low-ability learners with ADRM support for reading English texts exhibited a greater improvement in review performance than high-ability learners. Also, high-attention learners in the experimental group exhibited better review performance and attention than low-attention learners. High-ability learners who reviewed with either ADRM support or autonomously significantly outperformed low-ability learners in review performance. The research findings generate impacts on using an attention awareness system [40] to successfully develop an effective learning diagnosing mechanism based on human EEG physiological signals in an autonomous and interactive learning environment that combines printed textbooks and a digital pen to support English-language classroom learning.

Additional studies are required. First, participants should include primary school students, junior high school students or college students to confirm whether learners with various levels of academic achievement attain different outcomes when they are using ADRM support and that without in

the learning of English texts. Second, future studies can use reading materials other than English-language reading texts from a textbook. Third, the proposed ADRM was developed based on a small sample of male vocational high school students. A future study should enlarge the pool of participants and consider the balance of genders to get more reliable research results.

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