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COMPUTATIONAL THINKING AND PAIR PROGRAMMING: A SYSTEMATIC REVIEW

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Abstract:

There has been a growing interest in the combined techniques of Pair Programming (PP) and Computational Thinking (CT) due to its potential in enhancing problem-solving skills and fostering collaborative learning environments. While there is a growing body of literature on CT and PP, a systematic synthesis is essential to identify trends, gaps, and methodological nuances. This review addresses the need for a consolidated analysis beyond individual studies to offer a comprehensive analysis of the effects of PP and CT in educational circumstances. Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) guidelines are adhered to by the review to ensure a rigorous and transparent methodology. An advanced searching technique is employed, utilizing CT and PP as keywords, to systematically explore the Scopus as well as Web of Science (WoS) databases. Subsequently, the inclusion and exclusion criteria are applied systematically to identify relevant studies, and a thorough quality assessment is conducted. The results present a synthesized overview of the literature, categorizing findings into two main themes derived from expert validation, which are (1) CT and PP in Primary and Elementary Education and (2) CT and PP in Middle and Secondary Education. In conclusion, this systematic review explores the integration of CT and PP in educational settings, offering valuable insights for

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educators, researchers, and policymakers, emphasizing the importance of systematic approaches.

Keywords:

Computational Thinking, Pair Programming, Systematic Review, Agile Software

Introduction

In the rapidly evolving landscape of computer science education, two key pedagogical approaches have gained considerable attention and acclaim—Computational Thinking (CT) and Pair Programming (PP). As technology continues to permeate various facets of our lives, the development of computational skills becomes paramount, and educators are faced with the challenge of preparing students for an increasingly complex and digital future. CT requires an array of problem-solving abilities based on computer science fundamentals (Wing, 2017). These skills include algorithmic thinking, abstraction, pattern recognition, and decomposition (Rahman et al., 2020). CT is not limited to courses on computer science; instead, it permeates diverse disciplines, fostering a mindset that transcends the boundaries of traditional programming. As we navigate an era dominated by data, CT equips students with the capacity to systematically evaluate and resolve issues, creating the foundation for a generation adept at addressing complex challenges.

PP, a practice originating from agile software development methodologies, involves two individuals collaboratively working on a single computer (Roque-Hernandez et al., 2021). One becomes the coder and acts as the driver, whereas the other becomes the navigator, providing feedback, suggesting improvements, and ensuring the overall quality of the code (Schulz et al., 2023). In the industry, the time allocated by a software developer or programmer for task execution is distributed as follows: 30% for solo programming, 50% for collaborative work with a single peer, and 20% for collaborative efforts involving two or more peers (Nagappan et al., 2003). PP is celebrated for its ability to enhance learning (Beasley & Johnson, 2022; Iskrenovic-Momcilovic, 2019; Umapathy & Ritzhaupt, 2017; Zhong et al., 2016), improve code quality (Alhalhouli et al., 2017), facilitate knowledge transfer among students and foster scaffolding through the communication process (Demir & Seferoglu, 2021). Beyond its immediate benefits, PP has the potential to create an inclusive and supportive learning environment, breaking down barriers and promoting a sense of shared responsibility for the learning process.

Several studies have conducted a systematic review of CT. Researchers have studied systematic reviews related to plugged applications (Bati, 2022) and unplugged applications to foster CT (Chen et al., 2023; Huang & Looi, 2020). For example, a study by Chen et al. (2023) examining the effectiveness of unplugged activities in promoting CT skills in K-12 education between 2006 and 2022 found that board and card games were the most common unplugged activities. They highlighted the potential of unplugged pedagogy in enhancing CT skills in K-12 education. Some studies conducted a systematic review that explored robot activities to promote the development of CT (Bakala et al., 2021; Funk et al., 2021; K. Yang et al., 2020). A study conducted by Yang et al. (2020) found that six different kinds of robots used in CT experiments are Arduino+scratch, virtual and physical robotics, Bee-bot Robotic, KIBO Robotic, LEGO Robotic, and ultra-low-cost line follower Robotic. LEGO Robotics is the most

often utilized robot for students of all ages. The research findings demonstrate that a robot classroom can help students develop their CT.

Meanwhile, the systematic review highlights the significant educational impact of visual programming environments in K-12 education focusing on CT using Scratch (Montiel & Gomez-Zermeño, 2021) and ScratchJr (Stamatios, 2024). Stamatios (2024) reviews 18 studies focusing on the impact of ScratchJr on young children's CT, coding skills, and overall literacy. It concludes that while ScratchJr is not a universal solution, it is a beneficial tool for improving these skills. CT has gotten increased attention in mathematics education. There have been several studies in the literature reporting a systematic review regarding CT in mathematics education (Barcelos et al., 2018; Kaup, 2022; Khoo et al., 2022; Subramaniam et al., 2022; Ye et al., 2023). Ye et al. (2023) reviewed 24 articles on CT-based mathematics instruction and found that geometrized programming and student-centered approaches facilitate productive learning. CT-based learning involves an interactive, cyclical process of mathematical and computational reasoning involving the construction of CT artifacts, anticipating and interpreting outputs, and generating new mathematical knowledge.

There have been several studies in the literature conducted a systematic review of PP (Hanks et al., 2011; Hawlitschek et al., 2022; Salleh et al., 2011; Umapathy & Ritzhaupt, 2017). Study by Salleh et al. (2011) presents evidence on the effectiveness of PP as a pedagogical tool in higher education CS/SE courses. A systematic literature review identified 14 compatibility factors affecting PP's effectiveness. Students' skill level, time spent on programming, and satisfaction were found to be the most significant factors. PP was found to improve students' grades and was most effective when measured by test case success, academic performance, and expert opinion. Hanks et al., (2011) examines the benefits of PP in undergraduate computer science curricula, highlighting its advantages, such as higher success rates, improved retention, enhanced software quality, and improved learning outcomes. It also highlights its benefits for female students and challenges like scheduling and partner compatibility. Meanwhile, a meta-analysis of 18 studies involving 3,308 students found that PP is an effective pedagogical tool for student outcomes in computer programming courses. The findings suggest that PP can improve assignments, exams, passing rates, and affective measures (Umapathy & Ritzhaupt, 2017). Hawlitschek et al.(2022) reported that pairing students is an effective method for improving programming performance, especially for beginners. However, lecturers should plan implementation, monitor learning processes, and offer guidance.

While previous systematic reviews have examined CT and PP independently, there is a need for more integrative analysis that combines these two areas. The identified research gap in this study lies in the need for a comprehensive understanding and synthesis of how PP contributes explicitly to developing and enhancing CT skills. The proposed systematic review aims to bridge this gap by meticulously analyzing how PP as a pedagogical tool can effectively augment CT skills. This investigation is crucial for developing targeted educational strategies and refining curriculum designs, ensuring they align with the most effective teaching methodologies for enhancing CT competencies.

Literature Review

Computational Thinking

In the twenty-first century, CT is important, particularly for problem-solving. Seymour Papert inaugurated the concept of CT in 1980, to signify the transformative impact that computers could have on cognitive processes within the realm of mathematical education (Papert, 1980). Jeannette Wing reintroduced the term CT in 2006. CT involves not just knowledge about methods for writing programs but also ways of thinking and finding solutions to emerging problems using fundamental computer science principles such as reading, writing, and arithmetic, which every individual should master (Wing, 2006). Wing (2010) further defines CT as a problem-solving process, where information processing agents can be effectively implemented to solve problems. These information-processing agents refer to anything that follows instructions to complete a task, referring to computers, other digital devices, or humans.

Since the initial attempts to elucidate CT, various scholarly perspectives have emerged to define its essence. Aho (2012) describes CT as a cognitive process dedicated to structuring problems so that the solutions are expressible through algorithmic and computational procedures. Refer to Lee & Cho (2020) CT involves using automated ways to solve problems by identifying and abstracting them. This process relies on the fundamental concepts and principles of computational technology. Meanwhile, Tsai, Liang & Hsu (2020) categorize CT into domain-specific and domain-general categories. The domain-specific category indicates the specialized knowledge or skills required for systematically solving problems within the specific computer science or computer programming domain. On the other hand, the domain-general category refers to the competencies needed for systematically solving problems in everyday life and across all learning domains, viewing CT as a process of thought.

Pair Programming

Pair programming is identified as one of the strategies for learning programming (Silva et al., 2020; Wei et al., 2021). This method has been implemented in software development to boost programmer productivity. Pair programming is a facet of extreme programming, a software development methodology introduced in the mid-1990s (Roque-Hernandez et al., 2021) and has gained widespread adoption in the programming industry. Team members share their knowledge during the pair programming process by discussing their perspectives on tasks, including problem-solving skills and programming concepts (Yang et al., 2016). Consequently, studies indicate that pair programming is more effective for learning programming compared to solo programming (Iskrenovic-Momcilovic, 2019; Regis Anne & Carolin Jeeva, 2022).

Pair programming involves two students collaborating continuously to solve problems using a computer (Xu et al., 2023). Conventional pair programming paradigms typically involve two learners collaborating close to a singular computing station, jointly developing identical code sequences (Hawlitshchek et al., 2022). In contrast, contemporary iterations of pair programming exhibit a localized distribution of programmers, diverging from the traditional co-located format known as distributed pair programming (Satratzemi et al., 2023). During the implementation of pair programming, students play the role of the driver and navigator. The driver writes code by controlling the mouse and keyboard, while another student, the navigator, checks and guides the driver, and they periodically switch roles between driver and navigator (Schulz et al., 2023). Papadakis (2018) conducted a study where students switched roles

approximately every 20 minutes to take on the driver and navigator roles. In a different study, the students interchangeably switch between the roles of driver and navigator every 5 minutes (Lewis, 2011; Zhong et al., 2017).

Continuous communication, questioning, and answering between the driver and navigator are essential, and they contribute suggestions on the best ways to solve problems (Nicolescu & Plummer, 2003). The driver and navigator communicate at least every 45–60 seconds (Williams et al., 2002). Researchers employ numerous methods to ascertain pairings for pair programming. Williams et al. (2002) randomly assigned pairs rather than allowing students to choose their partners, and students worked with the same partner. In contrast, the study by Ayub et al. (2019, 2020) conducted an experiment that paired a slow-paced student with a fast-paced student.

CT and PP Implementation in School Settings

Researchers have studied CT and PP in school settings. The study is focused on using PP as a pedagogical approach to foster and enhance CT. In primary school programming Lin & Ke, 2020 examines the instructional procedures and strategies of primary school programming education to foster CT. The result shows that the instructional procedure for cultivating CT in programming teaching generally involves five major stages: review, new knowledge exploration, problem analysis, programming on a computer, and reflection. Instructional strategies to cultivate CT include mind map-supported, unplugged programming, pair programming, and log reflection. Another study Al-Jarrah & Pontelli delineates a distinctive contribution through the integration of virtual PP within Alice, aimed at facilitating CT exposure among middle school students. It articulates the development of an innovative extension to Alice, tailored to enable collaborative programming endeavors among this demographic. This enhanced iteration of Alice incorporates support for virtual PP, thereby permitting the distant sharing of a virtual environment and the allocation of specific roles for educators.

The complexity of PP for elementary students is mitigated through collaboration scripts, as evidenced by a pilot study indicating enhanced collaboration, improved CT skills, and positive student perceptions (Ma et al., 2020). The effectiveness of PP in teaching junior high school students CT is explored through project-based learning and graphical programming which has a positive impact in fostering CT (Liu et al., 2022). Furthermore, (Chang & Tsai, 2018) design a curriculum for computer game-making that involves PP roles, using motion-based touchless games to enhance students' CT skills. PP serves as an effective tactic for fostering CT among students. The study results indicate that PP surpasses solo programming in its efficacy in bolstering and enriching students' grasp of fundamental programming concepts and CT skills and elevating their motivation towards programming (Leow & Huang, 2021).

CT and PP Implementation Across Diverse Demographics

This literature review explores the integration of CT and PP methodologies across various target groups, namely undergraduate students, teachers, and individuals with Attention Deficit Hyperactivity Disorder (ADHD). The effectiveness of combining CT and PP in the educational experience of undergraduate students majoring in science, technology, engineering, and mathematics (STEM) has been investigated in earlier research. The DIVAS project contributes to addressing workforce challenges by training students in Python programming through interventions that include PP exercises (Meysenburg et al., 2018). Moreover, attention is

directed towards professional development initiatives for educators. A notable example involves Computing's PD workshops in 2018-2019, complemented by a virtual conference in 2020, utilizing technology and Snap! PP to enhance teacher engagement and collaboration. This intervention resulted in a noticeable improvement in self-efficacy in the CT teaching process (Jocius et al., 2021). An additional investigation discusses the difficulties of teaching CT to individuals with ADHD. By presenting a case study that employs a three-stage method and incorporating PP, this study highlights the effectiveness of this pedagogical approach in facilitating strong learning abilities among students with ADHD (Da Silva et al., 2020).

Material and Methods

The analysis in this study used the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) technique, which is a well-recognised and accepted standard for performing systematic literature reviews. Publication rules are typically essential in providing writers with guidance on how to evaluate and scrutinise the precision and thoroughness of a review while including pertinent and essential information. The PRISMA framework also emphasises the importance of including randomised trial evaluation surveys in systematic analysis reports for various types of studies (Moher et al., 2009) (Figure 1). The methodology of this research was evaluated using two prominent databases, known as Scopus as well as Web of Science (WoS), due to their strong characteristics. Furthermore, this section presents a comprehensive overview of the four main sub-sections: 1) identification, 2) screening, 3) eligibility, as well as 4) data abstraction and analysis.

Identification

The process of paper selection for this report comprises three key phases within the systematic review methodology. In the first phase, keywords were identified, and associated terms were explored using thesauri, dictionaries, encyclopedias, and prior scholarly inquiries. Following the identification of relevant keywords, search strings were formulated for both the Scopus and WoS databases, as can be seen in Table 1. Based on the search string in Table 1, Scopus and WoS are characterized by their unique organizational frameworks, indexing conventions, and categorical distinctions, leading to a divergence in the results of identical search terms attributable to their respective and distinct classification systems. As a result, 60 papers were managed to be obtained from the databases utilized for this research investigation during the first stage of the systematic review procedure.

Table 1: The Search String

| | |
|---------------|---|
| Scopus | TITLE-ABS-KEY ("computational thinking" AND "pair programming") AND (LIMIT-TO (PUBYEAR, 2012) OR LIMIT-TO (PUBYEAR, 2013) OR LIMIT-TO (PUBYEAR, 2014) OR LIMIT-TO (PUBYEAR, 2015) OR LIMIT-TO (PUBYEAR, 2016) OR LIMIT-TO (PUBYEAR, 2017) OR LIMIT-TO (PUBYEAR, 2018) OR LIMIT-TO (PUBYEAR, 2019) OR LIMIT-TO (PUBYEAR, 2020) OR LIMIT-TO (PUBYEAR, 2021) OR LIMIT-TO (PUBYEAR, 2022) OR LIMIT-TO (PUBYEAR, 2023)) AND (LIMIT-TO (DOCTYPE, "ar")) AND (LIMIT-TO (PUBSTAGE, "final")) AND (LIMIT-TO (SRCTYPE, "j")) AND (LIMIT-TO (LANGUAGE, "English")) |
| WoS | "computational thinking" AND "pair programming" (Topic) and Article (Document Types) and English (Languages) and 2023 or 2022 or 2021 or 2020 or 2019 or 2018 or 2017 or 2016 or 2014 or 2011 (Publication Years) |

Screening

In this phase, duplicate documents will be systematically eliminated from the list of documents that have been retrieved. The initial screening phase resulted in the exclusion of 39 publications, followed by a subsequent phase involving the detailed examination of 21 papers using particular inclusion as well as exclusion standards listed in Table 2. The primary criterion applied pertained to the nature of the literature, with a focus on research papers as the main resource for relevant suggestions. Supplementary materials not covered in the most recent study included book series, conference proceedings, reviews, meta-synthesis, book series, meta-analyses, books, as well as chapters. Furthermore, only English-language publications were included in the review. It is imperative to emphasise that the methodology was confined to the years 2011 through 2023. The search conducted within WoS revealed that there were no articles published in the years 2012 and 2013. In the end, the duplication criteria led to the exclusion of 5 publications.

Table 2: The Selection Criterion

| Criterion | Inclusion | Exclusion |
|--------------------------|-------------------|--------------------------|
| Language | English | Non-English |
| Timeline | 2011 to 2023 | < 2011 |
| Literature type | Journal (Article) | Book, Conference, Review |
| Publication Stage | Final | In Press |

Eligibility

In the third phase of the PRISMA technique, known as eligibility, the focus is on delineating the criteria for inclusion and exclusion pertinent to the review, as well as detailing the methodology employed for categorising studies for subsequent synthesis (Moher et al., 2009; Page et al., 2021). In the eligibility phase a compilation of 16 articles was assembled. A meticulous examination of each article's title and core content was conducted to ascertain adherence to inclusion criteria and alignment with the specific research objectives. Consequently, two report was excluded due to their deviation from the study's scope, insignificance in title, and lack of relevance in the abstract concerning the study's objectives, as substantiated by empirical evidence. Consequently, 14 articles remained eligible for comprehensive review, as illustrated in Figure 1.

Data Abstraction and Analysis

Throughout this study, integrative analysis—which includes mixed, qualitative, and quantitative research methods—came to light as a crucial evaluation technique. This research's main goal was to find appropriate topics as well as subtopics. The initial phase involved the systematic collection of data, constituting the foundational step in theme development. Figure 1 visually represents the meticulous examination of 14 publications, where the authors systematically scrutinised assertions and content relevant to the study's topics. Following this, a comprehensive evaluation of significant studies related to CT and PP ensued, encompassing methodologies and research findings. Collaborative efforts among authors facilitated the extraction of themes grounded in the study's context, documented through a log that captured analyses, perspectives, queries, and other insights relevant to data interpretation. To ensure coherence, the authors conducted a comparative analysis of results, addressing any inconsistencies in theme design through internal discussions. In instances of conceptual disagreements, authors engaged in collaborative discussions. The produced themes underwent

refinements for consistency. Two experts with specialised knowledge in both PP and CT independently conducted examinations to strengthen the finding's validity, ensuring domain validity. The iterative process involved adjustments based on the author's discretion, incorporating feedback and comments from expert evaluations.

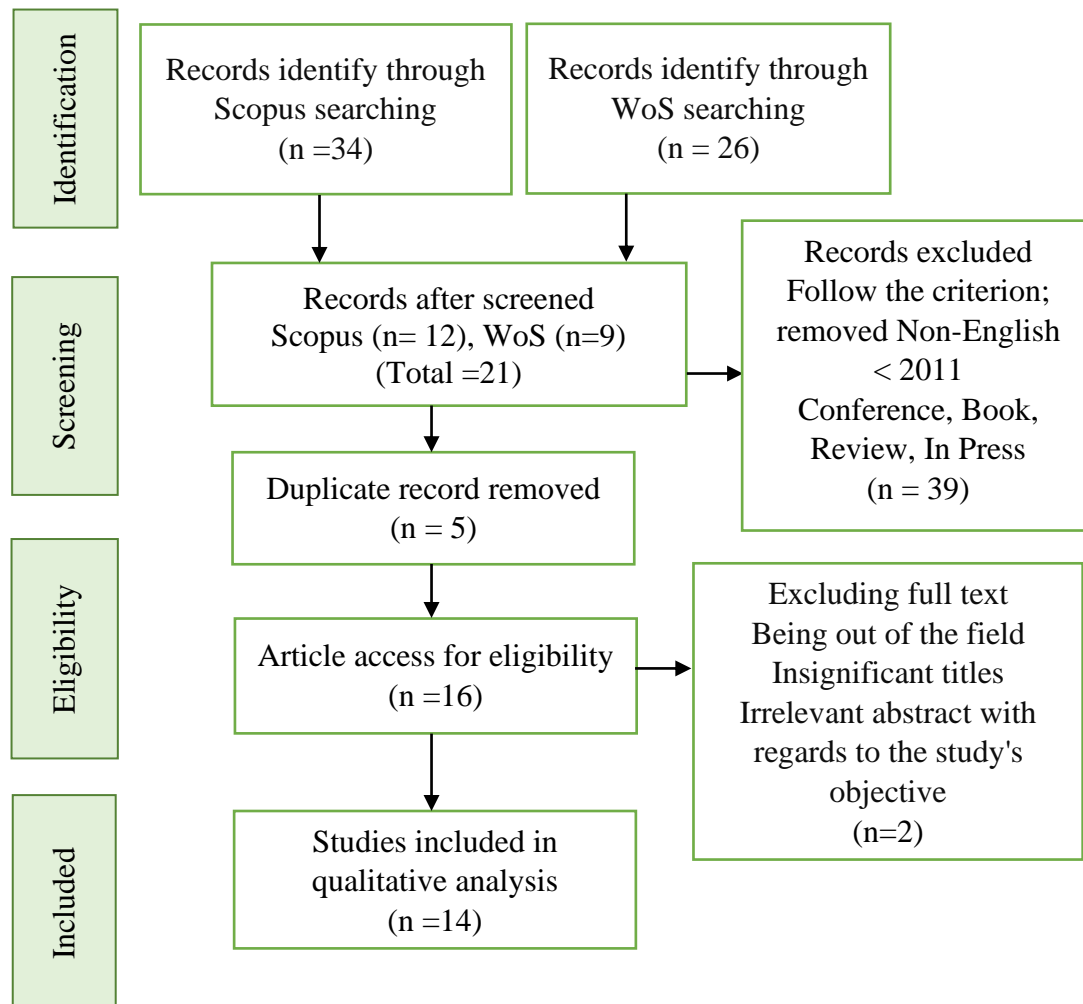


Figure 1: Flow Diagram of The Proposed Searching Study

Source: (Moher et al., 2009)

Result and Finding

The integration of CT through PP involves collaboratively coding with a partner, fostering problem-solving skills, algorithmic reasoning, and effective communication, thereby enhancing students' holistic understanding of computational concepts. Using a systematic search approach, 14 articles were identified and subjected to analysis. These articles were then classified according to two primary themes: (1) PP and CT in Primary and Elementary Education (8 articles) as well as (2) PP and CT in Middle and Secondary Education (6 articles).

Computational Thinking and Pair Programming in Primary and Elementary Education

The collective analysis of these diverse studies reveals significant insights into the pedagogical implications and finding of integrating CT and PP in primary and elementary education. The summary of theme 1 is shown in Table 3.

Table 3: Summary of Computational Thinking and Pair Programming in Primary and Elementary Education

| Authors | Tools | Country | Aim and finding |
|--|-------------------------|------------------|---|
| Fagerlund J.; Vesisenaho M.; Häkkinen P. (Fagerlund et al., 2022) | Scratch | Finland | This research investigates CT of elementary school students within the framework of collaborative programming in pairs. The findings offer evidence-based pedagogical knowledge for supporting open-ended programming in CT education, including project planning, balancing self-directed design with instructional support, and promoting shared design processes in PP. |
| Zhong B.; Wang Q.; Chen J.; Li Y. (Zhong et al., 2017) | Scratch | China | The study aimed to investigate the influence of the switching period on PP in promoting CT among young students. The study found that semi-free role switching was more effective for learning achievement than fixed periods, and students who took on a new role every five minutes proved to be more enjoyable. In semi-free classes, role switching became much less common over time, but driver-navigator negotiation ended up being more active. |
| Hsu T.-C.; Chang C.; Wu L.-K.; Looi C.-K. (Hsu et al., 2022) | Robot | China | The aim is to validate the impact of PP and question-and-response interaction in a board-game activity on young learners' CT skills. The study found that English as a Foreign Language (EFL) students demonstrated better cooperation and problem-solving skills in CT. In contrast, Chinese as a Second Language (CSL) students displayed more trial-and-error behaviours, suggesting cross-disciplinary learning as well as cross-context instruction. |
| Barth-Cohen L.A.; Jiang S.; Shen J.; Chen G.; Eltoukhy M. (Barth-Cohen et al., 2018) | Robot | United States | The study examines fifth-grade students' CT problem-solving skills in a PP robotics interview. They navigate through various representations, including task instructions, coding interfaces, outputs, and a tangible robot. The findings show proficiency in interpreting and manoeuvring through information simultaneously. |
| Seo Y.-H.; Kim J.- H. (Seo & Kim, 2016) | Scratch and Entry | Korea | This research investigates the impact of incorporating PP into coding education to enhance CT and creativity among elementary school students. Results showed insignificant differences between the two groups, but the experimental group showed a significant increase in CT and creativity. Using |

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|---|---------|---------|---|
| | | | cooperative learning and PP approaches enhances students' CT and creativity. |
| Wei X.; Lin L.; Meng N.; Tan W.; Kong S.-C.; Kinshuk (Wei et al., 2021) | Scratch | China | This study aimed to evaluate the impact of partial PP (PPP) on elementary school students' CT skills and self-efficacy (SE). In accordance with the research, students within the experiment group outperformed those in the control group in terms of improvement in their CT and SE skills. PP was beneficial for CT and building programming knowledge, especially among less experienced students. Initial computer experience and attitude towards collaboration influenced partners' success. |
| Bodaker L.; Rosenberg-Kima R.B. (Bodaker & Rosenberg-Kima, 2023) | Scratch | Unknown | The study analyzed elementary school children's performance and attitudes towards an online programming learning activity using the PP method, aiming to enhance collaboration and CT. Children enjoyed online learning activities, with PP benefiting girls. However, they took longer to complete tasks, perceived the third task as harder, and were less active with competent partners. |
| Zhong B.; Wang Q.; Chen J. (Zhong et al., 2016) | Alice | China | This research aim to investigate how two social variables, namely gender and partnership, influence PP effectiveness in cultivating CT in an elementary school environment. The study found no significant difference in compatibility among gender pairs but significant differences in partnership pairs. Girls showed increased productivity and confidence in PP, suggesting teachers should consider partnerships in collaborative learning to reduce gender gaps and promote socialisation. |

Computational Thinking and Pair Programming in Middle and Secondary Education

The collective analysis of these diverse studies reveals significant insights into the pedagogical implications and findings of integrating CT and PP in middle and secondary education. Table 4 displays a summary of theme 2.

Table 4: Summary of Computational Thinking and Pair Programming in Middle and Secondary Education

| Authors | Tools | Country | Aim and finding |
|---|--------------|------------------|---|
| Denner J.; Werner L.; Campe S.; Ortiz E. (Denner et al., 2014) | Alice | United States | This study examine whether PP is effective for middle school students, what it is effective for, and how partners influence each other. The study reveals that PP is beneficial for CT and programming knowledge, especially among less experienced students, with more experienced |

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|---|-----------|---------------|--|
| | | | students gaining more confidence and positive attitudes. |
| Lee J.Y.; Oh S.Y.; Kim S.B. (Lee et al., 2016) | Entry | Korea | The study aims to enhance CT and creativity in coding education through an effective PP scheme, focusing on the advantages of educational programming languages. The study demonstrates that this approach can enhance coding proficiency and mutual learning by fostering collaboration among coding learners. |
| Werner L.; Denner J.; Campe S.; Torres D.M. (Werner et al., 2020) | Alice | United States | The widespread adoption of CT activities in secondary schools faces a challenge in measuring student learning from game programming and similar activities, known as computational learning (CL). This study refines the Game Computational Sophistication (GCS) model to facilitate the evaluation of computational learning among middle school students engaged in game programming using the PP approach. Finding: (1) Creating GCS 2.0 to generate a singular measure of a game's complexity; (2) Validating this model with 39 games, considering the intricacy added by using multiple game mechanics and (3) Integrating GCS 2.0 into a broader framework for evaluating CL in secondary students that design and programme games. |
| Sun, D; Ouyang, F; Li, Y; Chen, HY (Sun et al., 2021) | Minecraft | China | The study uses PP to enhance computer programming education in Chinese secondary schools, addressing frustration and boredom among novice programmers in enhancing CT. The results reveal discrepancies among three pairs: low-ranked, middle-ranked, and high-ranked. The low-ranked pair spent more time on distracted activities, while the middle-ranked pair focused on programming explorations and questioning. The high-ranked pair focused more on debugging programming codes. The study also found complex correlations between programming behaviors, discourses, and perceptions, which may significantly influence collaborative programming quality, performance, and experience. |
| Zhong, BC; Li, TT. (Zhong & Li, 2020) | Robot | China | This research aims to conduct a comparison experiment (pair learning versus individual learning) in robotic education (RE). The study found that students in a pair learning group (PLG) possessed higher success rates in troubleshooting robot artefacts than those in an |

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|--|--------------------------------|---------------|--|
| | | | individual learning group (ILG) yet were unsuccessful in further indicators. These findings suggest that in the context of robotics education, collaborative (pair) learning is similar to individual learning, particularly in aspects of troubleshooting. |
| Zha S.; Jin Y.; Moore P.; Gaston J. (Zha et al., 2020) | Hopscotch and Flipped Learning | United States | This study explores the integration of CT using a flipped learning module. The research found that integrating technology and instructional methods like team-based learning, flipped classrooms and PP improved students' understanding and application of CT concepts. |

Discussion

Based on the result in Table 3 for Theme 1, the most frequent tool used by PP to foster CT in primary education is Scratch. With its simplicity and visual appeal, Scratch is ideal for introducing basic programming concepts and fostering collaboration. Using a block-based coding system, students can construct computational sequences of instructions (Fagerlund et al., 2022). Furthermore, the three-dimensional framework of CT, encompassing computational concepts, practices, and perspectives, aligns well with the characteristics of Scratch programming. This congruence offers a theoretical foundation for accurately depicting the CT inherent in programming tasks (Jou et al., 2021). From the provided data in Table 3, it is clear that China is the country where such studies have been conducted most frequently, with four out of the eight listed studies taking place there. Finland, the United States, and Korea each have one study, while the location of one study remains unspecified. According to the findings in Table 4, for Theme 2, Alice is the most frequently used tool by PP to promote CT in secondary education. Alice provides visually engaging and simplified programming environments that are suitable for beginners because Alice affords its users the capability to manipulate characters within three-dimensional settings through a drag-and-drop programming interface. (Denner et al., 2014). Table 4's findings indicate that the United States is the country conducting the majority of the studies in this field. This prevalence may reflect a strong interest or initiative in the United States regarding innovative educational strategies like PP in the context of CT education.

The incorporation of CT and PP in educational settings proves highly advantageous. The results demonstrate that PP not only enriches CT and programming knowledge, especially with regard to students with less experience but also instils confidence and positive attitudes in more seasoned learners (Denner et al., 2014). The affirmative impact of PP on CT skills and self-efficacy is conspicuous, especially among less experienced students, underscoring the influence of initial computer experience and collaborative attitudes (Wei et al., 2021). Moreover, the research indicates that integrating technology with traditional teaching methods and PP enhances students' understanding and application of CT concepts (Zha et al., 2020). Although technology use aligns with heightened success rates, it emphasises that collaborative learning may not consistently outperform individual learning across all measures (Zhong & Li, 2020). This underscores the substantial influence of these approaches on students' educational achievements. Online PP activities prove advantageous for girls despite extended task completion times, perceived challenges, and reduced activity levels with proficient partners (Bodaker & Rosenberg-Kima, 2023). Notably, the examination of gender and partnership

dynamics suggests the consideration of partnerships in collaborative learning, offering a promising avenue for diminishing gender gaps and fostering socialization (Zhong et al., 2016). The engagement of students in PP not only enhances their technical proficiency but also nurtures a holistic understanding of CT. Moreover, the positive impact of PP extends beyond the academic realms, preparing students for the collaborative demands of the professional world.

Conclusion

Based on the systematic review, the proposed research areas encompass a broad spectrum of investigations into CT and PP for further research. This includes examining the implementation and effects of CT and PP across various educational settings, including tertiary, vocational, and adult education. Additionally, teacher training programs should be evaluated for their effectiveness in implementing CT and PP, and innovative curriculum models should be explored. This strategy enhances technical proficiency and critical thinking skills, aligns with industry demands, and prepares students for modern workplaces. Adequate training and continuous assessment are essential for optimal learning outcomes. Gender dynamics within CT and PP are scrutinized to increase female participation and address gender-specific challenges while examining the impact of these methodologies on social and emotional learning outcomes such as empathy, teamwork, and resilience. Furthermore, the integration of emerging technologies like augmented reality (AR), virtual reality (VR), and artificial intelligence (AI) is explored to enhance educational experiences and advance digital literacy. Finally, there is a demand for the creation of developing PP approach modules emphasizing collaboration, diverse coding activities, role rotation, and problem-solving challenges to augment CT education.

Overall, the systematic review advocates for the widespread adoption of CT and PP practices in primary and secondary education. In conclusion, integrating CT and PP has a positive impact on the students. The reason is that PP has the ability to enhance students' CT in terms of concept and practice. Furthermore, the continuous assessment and refinement of CT through PP implementations are deemed essential, serving as integral components to gauge effectiveness and adapt pedagogical strategies for optimal student learning outcomes. Prospective research and ongoing innovation in this realm are imperative, playing a pivotal role in shaping the future landscape of computer science education and equipping students to effectively confront the evolving challenges of the digital age. This strategic integration not only enhances the quality of learning but also contributes significantly to the formation of a cohort of graduates possessing the intellectual acumen and teamwork proficiency requisite for success in today's intricate and ever-changing work environments. With implications for pedagogy, curriculum development, and gender gap reduction, it provides a robust foundation for educators, curriculum developers, and policymakers to enhance teaching practices and create inclusive learning environments.

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