

# Games for Computational Thinking

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## ABSTRACT

Computational thinking (CT) is increasingly seen as a core literacy skill for the modern world at par with the long-established skills of reading, writing, and arithmetic. To promote the learning of CT at a young age we capitalized on the natural inclination to engage in play. We designed two physical CT games and continued development on RabBit EscApe, to challenge kids to orient magnetized manipulative tiles to fill paths. Our vision is to have K-12 students engage in different games that introduce and broaden their understanding of CT throughout their education. The development cost for each age-appropriate game is minimal, increasing feasibility of implementation and target audience participation. Individually, the games challenge students to grow their understanding of CT in an acute, focused activity, while collectively they maintain CT as a core literacy skill throughout their education.

## Categories and Subject Descriptors

K.3.2 [Computer and Information Science Education]: Computer science education; K.3.1 [Computer Uses in Education]: Collaborative learning

## General Terms

Theory, Design, Human Factors, Experimentation

## Keywords

Computational Thinking, Games, Education

## 1. INTRODUCTION

Since Wing’s influential work preceding[34] and during[35] her service to the US National Science Foundation, the research around Computational Thinking (CT) has exploded into myriad lines of divergent pursuits. Following prior work

such as the Great Principles of Computing[17] on the topic of defining either prerequisites for computer science (CS) or its transferable skills, and coinciding with other work attempting to broaden participation in CS (e.g. CS Principles[2]), Wing et al. have demonstrated the immensity of the research space around CT. Much of this work has offered working definitions of CT[9, 10, 15], but none has become the standard.

Despite the current diversity of views, various institutions have committed to agendas supportive of “computational thinking.” For example, in their recently adopted Long Range Plan, Virginia Tech (VT) identifies CT as a fundamental competency of a broad general education [8]. In support of this mission, Dr. Dennis Kafura developed a graduate course to “develop a better understanding of what CT means at the university level of teaching and learning, and how CT could be made accessible to students in all disciplines at VT.”

In pursuit of this understanding, we developed activities to be performed with students at a younger age to help them develop CT, prior to their entrance in college.

There are countless pressures on primary school curricula to include ever more diverse subjects. Rather than asking educators to learn yet another subject, and try to squeeze it in (often resulting in something else out) of their teaching time, we intended to design activities that would support their current curricula, but add a new perspective that might help lay the ground work for more explicit CT discussions in later education.

## 2. COMPUTATIONAL THINKING

In search of a widely accepted CT definition for use while developing our game we chose the Operational Definition of Computational Thinking for K–12 Education by the International Society for Technology in Education (ISTE) [4]. We thought this to be an appropriate definition due its relevance to our target group (a large part of research on CT is being done with college-level students), but also its clear approach on the expectations, skills, and attitudes involved. According to this definition, “CT is a problem-solving process that includes (but is not limited to) the following char-

acteristics”:

- Formulating problems in a way that enables us to use a computer and other tools to help solve them
- Logically organizing and analyzing data
- Representing data through abstractions such as models and simulations
- Automating solutions through algorithmic thinking (a series of ordered steps)
- Identifying, analyzing, and implementing possible solutions with the goal of achieving the most efficient and effective combination of steps and resources
- Generalizing and transferring this problem solving process to a wide variety of problems

While our group, like many researchers before us, consider abstraction to be a critical part of CT, we believe that it is necessary to simultaneously teach the dangers of abstraction. In line with Blackwell, et al., we agree that abstraction might be “antagonistic to reasonable human concerns” [12]. Along the same lines, Turkle and Papert have argued long ago that “concrete and personal approaches” to computing should not be downplayed in favor of formal and “abstract approaches”, nor should they be dismissed as more inferior [29]. Their thesis, based on ethnographic and psychology investigations, aligns well with the theory of situated learning which postulates that people learn contextually, by being actively engaged in authentic (learning) activities, and not in the decontextualized and abstract manner of formal education [14]. Although we do not abolish abstraction altogether, we did not consider it an important element of teaching CT, especially for our target group.

## 2.1 Recruitment of Computer Scientists

Each year, for several years now, there have been insufficient computer scientists for market demand. The result is increased reliance on imported laborers, exported labor, and decreased productivity, innovation, and security. To this end, some believe that supporting an agenda of teaching CT to many if not all students could increase the number of computer scientists.

### 2.1.1 Broadening Participation

If indeed, “Computer science is no more about computers than astronomy is about telescopes,” [1] why do so many “CS0” courses begin with computers, and usually with programming? Especially as they were historically taught (with some notable exceptions such as Papert et al.) [6], programming and its allure through precise control over the machine does not appeal to all.

In order to broaden the participation in computer science (CS) to more diverse demographics of students, it may be necessary to change the entry routes and introductions to be similarly diverse. In this vein, projects like ALICE [24], Media Computation [19], and CS Unplugged [3] are useful exemplars. Many of the definitions developed for CT have specifically excluded programming; however many of these

same works then attempted to teach CT using some form of programming.

Activities that differ from programming may appeal to different demographics. Additionally, some demographics that may lack resources (human, electronic, and monetary) sufficient for learning programming may be able to utilize CS Unplugged or CT curricula.

### 2.1.2 Increasing Participation

Aside from efforts attempting to broaden participation, there are efforts that merely seek to increase participation. How should someone know they might be interested in CS? From the earliest education, we expose students to reading, writing, and arithmetic. When are they exposed to CS? Unfortunately, only after a student [or their parent(s)] elects to take a programming course do they encounter CS.

CT, rather than programming, might be taught explicitly, as its own subject, or implicitly in the context of other subjects, at ages much younger than a high school programming course. Then, more students will have an opportunity to recognize an affinity for skills that would support a pursuit of education in CS, or at minimum, understand the benefits of applying CT in fields of their own interest.

## 2.2 Preparing the 21st Century Citizen

While improving recruitment of computer scientists is a major focus of many CT research agendas, an emerging concern is the general public’s preparedness for the increasingly technological modern age. Many researchers’ definitions of CT attempt to specify important skills related to technology and computation that the researchers themselves predict to be necessary as our society continues to adopt technological solutions in virtually every domain. Some call this computational or technological literacy rather than CT, but as Professor Dane Webster mentioned in a presentation to our class, “Doesn’t teaching math students to use a pencil help them to think mathematically?” [31]

### 2.2.1 Caveats

While our group (like many of the researchers before us) consider abstraction to be a critical part of CT, we believe that it is necessary to simultaneously teach the dangers of abstraction. In line with Blackwell, et al., we agree that abstraction might be “antagonistic to reasonable human concerns” [12]. Along the same lines, Turkle and Papert have argued long ago that “concrete and personal approaches” to computing should not be downplayed in favor of formal and “abstract approaches”, nor should they be dismissed as more inferior [29]. Their thesis, based on ethnographic and psychology investigations, aligns well with the theory of situated learning which postulates that people learn contextually, by being actively engaged in authentic (learning) activities, and not in the decontextualized and abstract manner of formal education [14].

## 3. EDUCATIONAL AND COMPUTATIONAL THINKING GAMES

The tradition of using games for education is a long one. Children grow up and get to know the world around them through play. Most of their interactions in an early age are

through touch, and other senses as well, and this is why most of the games of early childhood are tangible. This realization was what led the German educator Friedrich Froebel to build a series of wooden blocks known as Froebelgrabe (i.e., Froebel gifts) in an attempt to foster children’s self-directed activity in exploring the world and using the environment as a learning aid [21]. Based on this notion of learning by doing, researchers at MIT Media Laboratory have coined the term objects-to-think-with as a means to leverage the power of computation in the exploration process [26, 27]. LEGO/Logo is maybe the most famous offspring of this approach where students are learning to program by controlling enhanced LEGO structures (equipped with motors and sensors). Resnick et al. has proposed “digital manipulatives” as a continuation of this work where students are called to control through Logo programming other tangible artifacts like blocks, balls, beads, and badges [21].

Other researchers have also argued about the educational benefit of using computationally-enhanced construction kits where kids build 3D models and “learn through tactile experiences” [18]. Such smart artifacts are equipped with technology that allows them to communicate with each other, with computers, and eventually provide feedback about their state to their users. Various systems have been proposed since then, employing a variety of advanced technologies like programming robotic motion of motorized pieces through kinetic memory [25] or creating structures with blocks embedding sensors, logic circuits, and actuators for science education [27]. Although these are exceptional examples of high-tech application in the service of informal education, they are mainly research projects that in most cases do not become commercialized. On the contrary, we were interested to investigate how low-cost games with easy to manufacture components can be leveraged to provide CT exposure to very young children.

For such an audience, motivation is believed to play a significant part in the learning process; this is even more the case if learning objectives are intrinsic to the goal of the game [22]. To motivate them, learners are immersed in a fantasy world and are asked to do challenging tasks by instigating their curiosity. These practices have been used in many educational games, including ones that teach about CS and programming. Examples include either stand-alone games that leverage elements of fun to teach simple programming concepts like pattern recognition and recursion (e.g., Light-Bot), but also tools that leverage the students innate creativity to learn programming through game building (e.g., Scratch, Snap, and AgentSheets).

It is natural to want to extend the enthusiasm and promise of educational games to every domain, CT should be no exception. To offer an environment in which play and hopefully fun also result in learning CT would be ideal. However unlike many other domains, the definition and scope of CT is still in flux, making it challenging to argue (or at least to have agreement) that a given activity would support CT, without being so attached to computers and CS concepts. For example, Berland and Lee explored the CT that might be taught in the commercialized board game Pandemic [11]. As Pandemic is essentially a graph-theoretical representation of several major cities in the world, and the game is

cooperative, with the result that the game mechanic is the opponent rather than the other human players, there is some promise to this idea. The aspects of CT they chose to focus on were conditional logic, distributed processing, debugging, simulation, and algorithm building.

Our research led us to review many current commercialized games, and to develop some ideas that can potentially be used for teaching CT indirectly, as seen in *Comparison of Games*. We analysed each game for the following common CT definitional paradigms: modeling, abstraction, algorithms, artistic creation, goal dissection, risk/reward comparison, shared roles, patterns, simulation, and other unique yet clear CT characteristics. We describe CT **modeling** in games as the creation of an operational abstraction that captures the properties of an object sufficient for reasoning or simulation; e.g. in Guess Who you have to model a person to identify, and understand the different physical characteristics of the person as well as the articles that each person may wear. **Abstraction** is the process of theoretically describing existing problems without a specific examples in a manner that enables reusability of produced solution(s) in the same or other contexts; e.g. in Battleship you have to abstract the opponent’s pattern of ship placement to locate and destroy his fleet. **Algorithms** are reusable components (most often deriving from abstraction) describing a procedure that facilitates problem-solving; e.g., in Tic-Tac-Toe or Chess, a user can construct an algorithm of game play that produces the same result whenever enacted. **Artistic Creation** is described as the creation or definition of a model or idea in an artistic nature utilizing personal intuition or ecological inspiration, not stemming from any pre-requisite, defined requirement, or traditional linear thought; Mad Lib’s use of open ended queries for parts of speech exemplifies participant’s answers as artistic creation/interpretation. **Goal Dissection** is described as breaking down the goals or intentions of a game into smaller unique achievable or comprehensible units; to win Acquire, a player must understand the winning condition and the many different ways it can be achieved, by themselves and others. **Risk vs Reward** is an situation where a correct solution is unknown and each potential step has to be weighed against the consequences of discovering if it is a correct solution or dead end; While trying to determine the killer in Clue, several options might exist to declare to hopefully gain insight into another clue, however no currently known information easily guides the player to take one action over another. **Shared Roles** roles generally define some rules that may be specific to a subset of the players, and they may additionally modulate the relationships or abilities of players. Understanding the effects of a role and being able to empathize with others’s roles at least improves (or even enables) one to simulate future events in the game; while Chess does have an opponent, their roles, actions, and opportunities do not differ from oneself, whereas in Cranium, several smaller games require you to empathize with a teammate’s knowledge to communicate in non-traditional methods to reach an understanding. **Patterns** are distinguishable events, results, consequences, arrangements, designs, or aesthetics that can be identified to or realized by participants; Checkers openings or end game situations can be recognized as a situational pattern. **Simulation** is to imitate possible outcomes given a certain state (for example given a set of models and their relationships, as

potentially modified by roles or other special circumstances) and stimuli. This means understanding the conditional interaction of models and their environment and stimuli and could be used to forecast future events in turn-based or other games; Dominoes can be setup in the same layout and played in repetition to discuss alternative gameplay and strategy.

And, to our delight, exactly contemporary with this stage of our work, CT was getting attention from a much broader audience through a Kickstarter.com project, teaching programming to little kids using a board game [7]. Having completed this extensive analysis, unsatisfied, and questioning whether it would be possible to teach CT in tangible games, we decided to pursue our own low-cost game ideas.

### 3.0.2 *RabBit EscApe*

Besides the identified need to involve children with CT from an early age, few endeavors focus on primary school children and younger. RabBit EscApe is a board game with tangible wooden pieces intended for ages 8 and up. As shown from previous work, tangible wooden blocks like the Froebel blocks[21] are very engaging and educational for this age group, contributing to children’s emotional, social, and physical development through play. The game was inspired by the combination of the magnetic tile game Picasso-Tiles[5] and the work from Weller et al. on objects-to-think-computationally-with using the Posey construction kit and a Pacman-style game to teach state machine representations to children [32]. In our approach we decided to avoid using any electronic medium like a computer in an attempt to reach younger ages which are accustomed to fiddling with tangible objects but are not yet ready to make connections between physical objects and virtual representations. The outcome was a combination of a board game with wooden pieces with encased magnets, described in the following section.

### 3.0.3 *Design*

Our idea started by using manipulatives that have been a favorite kids’ educational toy for a long time, but also wanted to provide some structure to the game to better support CT, hence we decided to construct a board, as well. We opted for wooden pieces both for their elegance and warm feeling, but also for health reasons preferred over plastic or other chemically manufactured materials.

The game is comprised of fourteen different shapes of wooden pieces half an inch thick which we call bits; each bit is equipped with small magnets (1/16” thick and a diameter of 1/4”) which are encased in different sides of the bit and can attract or repel each other depending on polarity. By putting two bits together, you can make a block which is usually a square, rectangle, or hexagon. Other polygon shapes (traditional or custom) can be constructed as well for more advanced levels. Magnets are placed either at the middle of a bit’s side or near one of the side’s corners to allow a variety of path formations. From the fourteen different shapes, there are twenty-nine unique bits due to varying magnet placement and polarity combinations. We also provide a selection of boards with a path comprised of all, or a subset, of these 29 bits. Boards are of different levels of difficulty depending on the combination of pieces and the ambiguity in block formations.



**Figure 1:** (a) Designed completed board for first full level; (b) Physical game of the same board with most bits in place.

The goal of the game is to put the bits on the predefined path and help the rabbit (a separate token) escape from the fierce apes; hence the name of the game RabBit EscApe! The apes are square pieces which are placed in different positions on the board and the player(s) need to make sure that the adjacent bit repels an ape piece (i.e., same polarity magnets), instead of attracting it which is the objective when constructing the path. *Figure 1a* depicts the path of Level A as it was designed on the computer, and *Figure 1b* is a photograph of the actual board with most pieces placed in the right order (two are left intentionally off the path for illustrative purposes).

What makes the game especially challenging is the correct identification of the bits’ properties and subsequent utilization of these properties to construct the blocks and then the whole path. These properties are:

- the size of each bit
- the position of the magnet on the bit
- the polarity of each magnet (engraved on the bit’s long side)
- the orientation of the bit (or whole block)

Players must combine all these attributes in order to put the bits next to each other in such a manner that they stick together at the right place (center or top of the bit’s side), while also repelling the enemies positioned around the board. Level A utilized all 29 pieces and all 4 enemies; we have made two variations, one with the block divisions drawn on the map and one without them.

### 3.0.4 *Play Strategies*

In order to help players understand the game mechanics and the importance of the different piece properties and how they affect completing the board effectively, we suggest a training session preceding the actual gameplay. The session’s purpose is to scaffold the players’ understanding of how putting the pieces together allows them to construct different shapes and satisfy the activity objective. This need derived from our informal evaluation in a primary school and is described in more detail under the Instructional Design section.

The possible suggested activities for teaching CT with the game are described in more detail in the section that follows,

although we understand that there are many variations that can derive from the suggested ones.

### 3.0.5 Individual or Collaborative

Players are given a predefined number of bits and a board and need to complete the board with all the pieces (i.e. build the path printed on the board), in a predefined amount of time (optional). They are playing individually or as a team and can either place a block on the board in turns or negotiate about path building. To increase difficulty they can add one or more of the enemy blocks by rolling the dice to decide enemy position; polarity is predefined on each board but players can reverse it to make the game easier or more difficult (preferably before starting the placement of the blocks).

Since each player has to conduct a rule-based plan based on their understanding of the game and combine their shared knowledge we consider this to be a manifestation of distributed computation. Through the “considerations, contingencies, and strategy formation” of multiple parties a distributed cognition of different knowledge resources is created [32] and has to be maintained during the game to reach completion. Distributed computation thinking was indicated as one of the distinguishing properties of CT compared to CS, according to the National Research Council [15].

### 3.0.6 Competitive

Players are playing against each other and have to complete the path but starting from different directions. They roll the dice and can place as many bits as the number rolled. This activity demands well organized planning, since making the wrong choice will render the board impossible to complete. The first student to complete the activity is the winner. While advancing a longer path first may be considered making further progress, reaching a situation where there lack sufficient appropriate bits to complete the path results in the player having to disassemble the path to get the correct arrangement.

This competitive mode demands efficient modeling skills since opponents would need to simulate the construction of a large portion of the board with the available pieces, to avoid the cost of losing points and negotiating retraction of a previous block or bit placement. In a sense the effective combination of bit properties can be thought as algorithms that players need to compile during simulation in order to avoid these adverse consequences. For example, deciding which two bits need to be placed together in a way to accommodate locking the blocks with adjacent ones (i.e., having the magnets in the right position and polarity), and do this for a series of blocks is a complex cognitive process similar to compiling an algorithm and testing hypothesis (simulation). Both model building and simulation (forming and contrasting hypotheses) have been defined as foundational aspects of CT and revealed increased benefits compared to traditional methods of instruction [33].

### 3.0.7 Board Construction

With an entry point on one side of the board and finish on an exit point at another side, players can use all the bits or a random subset and make a custom path on an empty board. They have to do this by drawing the blocks on the

board but without placing the bits. They will need to use the bits and blocks by creating a mental model of the path, taking each “used” block out before moving on, until they believe they have drawn the whole path. Adding enemies would be optional to increase the difficulty of the game. The second player (or another group of players) can then use this custom board to play the game in either of the first two ways.

Like the competitive activity, this construction method demands well organized planning to combine bit properties in order to make a playable board. Considering bits and their properties to be the data, players need to construct sets of pieces as part of the path using logic during the process similarly to writing an algorithm (e.g. [conditional], “If I place this bit here, then this block has a minus on the bottom and needs a big square piece with a plus on the top center”). This activity in particular demands the complex skill of combining different requirements to build a set of steps that will lead to an efficient solution to a problem (i.e., build a path from point *A* to point *B*, using *X* number of pieces, and avoid *Y* enemies) and has been defined as procedural thinking - teaching concept abstraction into algorithms [23], a core concept of CT [15].

### 3.0.8 Development of CT

RabBit EscApe satisfies most of the characteristics of the Operational Definition of CT for K-12 Education as defined by the International Society for Technology in Education (ISTE) [4]. More specifically, students playing the game should be able to: 1) logically organize and analyze data, 2) automate solutions through algorithmic thinking (a series of ordered steps), and 3) identify, analyze, and implement possible solutions with the goal of achieving the most efficient and effective combination of steps and resources. Considering the game mechanics and suggested activities discussed previously, we can make the following arguments considering support of these three characteristics:

1. Bits have to be organized in blocks and block combinations that are meaningful according to bit properties and the printed path's form; pattern recognition is important in this process for identifying which bits create blocks that can fit the path printed on the board while also attracting adjacent blocks or repelling enemy blocks (demands analyzing the board based on possible bits combinations and organizing them on the path)
2. Board Construction setup demands that players devise some kind of strategy for correctly utilizing bits and matching the polarity and magnet position; for this purpose they need to come up with some kind of “recipe” for putting bits together while drawing the path on the board, also accounting for the remaining pieces (demands some kind of procedural or algorithmic thinking)
3. In all game setups, especially Individual/Collaborative and Competitive, players need to correctly identify the combination of blocks and bits by analyzing the path's comprising shapes and then simulate possible solutions

for effectively completing the board, with the least number of bits and in the minimum time (efficiency).

Additionally, the game supports all dispositions and attitudes that are essential dimensions of CT, as expressed by the aforementioned definition which is pertinent to K-12 students:

- **Confidence in dealing with complexity:** puzzles are inherently complex systems and without an operational strategy for dealing with complexity, the task might prove too challenging. RabBit EscApe introduces added complexity due to the additional puzzle piece properties that need to be accounted for. Confidence is built through successive iterations and attempts during the scaffolded activities, as discussed further under the section on Instructional Design.
- **Persistence in working with difficult problems:** deriving from the previous attitude, students are called to overcome initial frustration and persist in finding the solution. Our observations verified this point, since both teams finished the game with one wrong bit placement, but still persevered to start over and get the whole path completed correctly.
- **Tolerance for ambiguity:** All three of the suggested play strategies include some degree of ambiguity deriving from either the complexity of the board and the amount of clues provided (e.g. including block divisions or a “cheat sheet”), or from the collaborative or competitive nature of the game (i.e. no two players have the same understanding about, nor expectations for the game).
- **The ability to deal with open-ended problems:** Being able to cultivate the previous attitude naturally leads to practicing their ability to deal with open-ended problems. Game strategy C. Board Construction, especially, demands that players both have a good understanding of the game mechanics and bit properties, and are willing to deal with the messy process of modeling a new path with minimal constraints.
- **The ability to communicate and work with others to achieve a common goal or solution:** All three modes of play have been designed to encourage or demand some form of collaboration or competition. This requires players to externalize their mental models and rectify any misconceptions. Even in the competitive strategy, students have to express their intentions through negotiations with the opponent(s), as a means to achieve their individual or team goal.

#### 4. EVALUATION AND OBSERVATIONS

We ran an informal pilot at an elementary school with two groups of three students each: one boy and two girls in each group, aged between 8 and 10 years. Both groups used the same board with play strategy A. Collaborative, but in one of them the dividers between blocks were not printed, making the game more open-ended and difficult. We followed Brandt’s anecdote and interrogator method [13] for data collection, to help protect the confidentiality of the students.

More specifically, in order to protect our subjects’ privacy, we took no notes, pictures, or videos during the actual session, but immediately thereafter wrote up the observations. Later in the same day, we interrogated each other’s accounts and elaborated on the observations made, providing explanations whenever necessary. In addition to protecting the children’s privacy, this method of data collection allowed us to devote our entire attention to observation, and not be distracted by documentation during the pilot.

The challenge of putting the puzzle together seemed relatively easy at first, as the students had many pieces available that could potentially fit within the path at any position. However we provided them with exactly as many pieces as they needed in our planned solution. The result was that once the students got good at placing the shapes within the lines, they had to confront the actual game challenges. They had to make sure that polarity was correct between the bits. Adjacent pieces should attract, rather than repel, each other, while pieces adjacent to the enemies should repel them. An additional challenge was found as they were trying to join the two ends of the path in the middle, since they started working at opposite ends (toward the middle) simultaneously. The result was a lucky scaling of difficulty/separation of concerns that was impossible to handle without a good understanding of the game mechanics.

At that point we decided to intervene by providing clues about the bit properties that children had to accommodate. In such an instance we tried to lead students in evaluating the different properties of a missing piece by themselves. Questions like, “What does this big piece need to have?” and, “What do we know about it?” while pointing at the larger block on the board (at the bottom right of *Figure 1b*) prompted students to use conditional logic (a fundamental concept of CT) in identifying the properties and eventually the piece. More specifically, one of the students started to respond to these prompts by saying, “It is a big piece” and then, “it needs to have a plus magnet here”, while pointing at the bottom where the ape is, and “it should have two more magnets on these sides,” pointing at the top and bottom left where the large piece connects with the remaining path. Such instances indicated that students could grasp the conditions that had to be satisfied for successful block construction and placement.

We also noticed the way students communicated their intentions. At first, students described only the shape of the piece; however, they soon learned that the piece placement was too tightly constrained to merely try to swap out pieces of the same shape.

After all, they could not be sure whether it was the piece in question that needed to be replaced, or its surroundings. They then realized that they should specify the shape and also the polarities of the magnets; however, even this was an underspecification. Because similarly shaped pieces may have the same number of magnets, but in different positions within a piece, they had to also specify the magnet locations. This demanded some kind of procedural or algorithmic thinking that is further discussed in the next section.

After almost 40 minutes of game play, both teams almost simultaneously thought they had completed the puzzle. At that point we encouraged the groups to compare their solutions. Each group discovered an error in the other team's solution as well as noting similarities and differences in their arrangements. Neither group had a solution that broke the lines of the path (so they satisfied this requirement); the errors discovered were single mistakes in polarity. Aside from their initial frustration, both teams demonstrated perseverance in starting over, despite the limited time remaining, and the fact that they basically had to start over again. This was an indication of willingness to confront the ambiguity in the game design.

Among many other interesting observations, there was a girl who seemed more systematic in bit placement. She was sometimes testing her hypotheses by pointing at the polarity signs while holding and rotating the bits in her hands, without actually trying to place them physically next to the ones on the board. This type of simulation is another important aspect of CT we have anticipated but have not systematically encouraged. Instances like this, but also the frustration caused by the lack of instructions and initial guidance, motivated us to consider the appropriate instructional interaction design that could help students play the game effectively while acquiring the largest learning benefits.

## 5. INSTRUCTIONAL INTERACTION DESIGN IN SUPPORT OF COMPUTATIONAL THINKING

Although we did not have sufficient time to complete a rigorous evaluation of RabBit EscApe, we discovered that scaffolding is a necessary step in enabling children to get the most out of such a game. Scaffolding includes levels of increasing difficulty, starting from making a single block (comprised of two to four bits) and moving on to more complicated shapes. At some points they will have the option to construct the different shapes using more than one combination of bits, and will have to incrementally take into account other piece properties and examine the implications of their choices. This mental modeling of the different affordances of each piece and the possible blocks it can construct will enable children to be more efficient in the actual game activities, without demanding extra cognitive load to process them during gameplay.

Another idea to aid the bit selection and usage process is to have a separate "cheat sheet" with all pieces and their count, next to the actual game boards. Players can cross out any pieces that have been used with a marker in order to keep track of what has been used and what is still available. This cheat sheet can be used during the initial sessions where players are learning the available bits and practicing with the strategies of putting them together. Then, these mental aids can be progressively removed, letting the users depend on their ability to recognize the physical pieces. This is a common process of scaffolding in instructional design, also called fading, because the additional information (scaffold) is removed (faded) over time.

These introductory puzzles can also assist in the pedagogical scaffolding necessary to promote CT and for the children

to be able to complete more challenging puzzles by employing CT concepts. In order to deal with the underspecification problems that were observed during our pilot we suggest that children should have a very clear understanding of the piece properties and the constraints that they introduce. Thus, we need to help them form some kind of algorithmic representation including all the properties that bits should have in any given position, and show them how to apply it in similar situations. This can be achieved through guiding questions that will lead children to evaluate the different properties of any missing piece on the board. Questions like "How big should this piece be?", "How should it attach to adjacent blocks?", and "What polarity should the magnets have?" will help them construct mental functions of bit and path properties that need to be evaluated at every point in the game.

Social interactions are of pivotal importance in the conversion of the game attributes (i.e., path shape on board, bit properties, remaining bits) into mental functions. Students need not only rely on the guidance of a tutor but also on their peers; students should be encouraged to question each other's assumptions while moving from the initial introductory puzzles to more complex game boards. The goal would be to keep the students in the optimal cognitive state where they feel confident in dealing with the task at hand (i.e., forming parts of the path), but they are not overwhelmed by the complexity of the problem (i.e., completing the whole board). This condition, also known as the "zone of proximal development" [30] is where learning is more effective, by internalizing external representations through social negotiations.

Finally, in designing this game for children, we recognize the importance of keeping the activity fun since this is a major motivating factor for children. Having colorful boards with a playful theme like the one used in the game (i.e., help the rabbit escape the lurking apes) is part of our instructional design approach that has been shown in our pilot to be effective, since children were compelled with the design and moved the rabbit piece even before fully completing the board. Teaching CT concepts in such a young age is not an easy task, thus we intentionally moved the focus of the game away from mathematical concepts which are predominant in similar game setups.

Through a sort of discovery process, we expect the children to use incremental formalism [28] to indicate what pieces they are looking for, and simultaneously to enhance their spoken representation of the pieces. This may reflect evolution of their mental models of the game and its pieces as well.

### 5.1 Alternative Games Not Pursued

During our analysis of current games and brainstorming on new games that highlight teachable CT principles, two games also stood out alongside RabBit EscApe, a catapult game and a comic hero game.

The catapult game was a three stage game (interaction/playground, test, and execute) where team members would learn how to operate a variable catapult to achieve desired results. While the game design was quite concrete and well

developed for addressing several CT principles not present in other games, consistent performance from the catapult at the scale we needed could not be achieved with the materials and size of the catapult chosen. Another idea of a create-your-own superhero and enemy to compete against other characteristic specific heroes/enemies and student created heroes/enemies. This game accentuates the creative nature of each student and challenges them in areas that align with more artistic definitions of CT, including modeling. The superhero game also offers opportunities to be one of the lowest cost games as it can involve just paper and a writing utensil similar to Live Action Role Playing games, where the imagination is paramount and requires descriptive well thought descriptions to be successful.

## 5.2 Discussion

Fabricating our own game was an interesting challenge. Records must be established to keep track of which pieces have been cut, tapped, sanded, and implanted with magnets throughout the production stage. The use of various custom jigs is important not only for speed, but also for consistent results require for piece alignment during gameplay. For future work, we might propose just such exercises for high school students or above in a “workshop”-style class. From RabBit EscApe’s theoretical design, we believe it shows promise for teaching CT. With additional levels that highlight common obstacles faced (ie. all pieces must have a southern faced )

## 6. CONCLUSION

As CT continues to be discussed in academic and professional communities and until a more concrete definition emerges, a significant leap must be made to educate our communities’ youth as society continues to develop systems with which they must interact, whether or not they can understand them.

VT has embarked on a bold course to develop the CT capabilities of all its graduates. Simultaneously the US National Science Foundation is funding research into how to develop these skills in the broader population. While we think that VT can be effective in this pursuit, we believe that to truly change the CT of the population as a whole, we must have myriad interventions at various stages of an individual’s formal and informal education.

In support of educating students at a younger age (than undergraduate students), we have developed RabBit EscApe to teach CT in a relatively explicit way. We believe that addressing CT directly, in conjunction with more subtle interactions such as integrating CT with core content in existing formal education curricula[16] will best facilitate the learning of CT and its successful transfer and application to each individual’s area of interest or expertise.



Game	Modeling	Abstraction	Functions	Artistic Cre- ation	Goal Dissection	Risk/Reward == Com- parison	Situational Turn Based Forecasting	Shared Roles	Patterns	Algorithms	Simulation
Current Games											
Pandemic	NO	NO	NO	NO	YES	YES	NO	YES	YES	NO	NO
Settlers Of Catan	NO	NO	NO	NO	YES	NO	YES	NO	NO	NO	NO
Robot Tur- tles	NO	NO	YES	NO	YES	NO	NO	NO	YES	YES	YES
Mr. Jack	NO	NO	NO	NO	YES	NO	NO	NO	NO	NO	NO
Ticket To Ride	NO	NO	NO	NO	YES	NO	YES	NO	YES	NO	NO
Carcassonne	NO	NO	NO	NO	YES	NO	YES	NO	NO	NO	NO
Guess Who	YES	NO	NO	YES	NO	NO	YES	NO	YES	YES	NO
Chess	In forma- tions	NO	YES	NO	MAYBE	NO	YES but even strong computers fail at this	NO	NO	NO	NO
Checkers	NO	NO	YES	NO	NO	YES	YES	NO	NO	NO	NO
Blockus	NO	NO	NO	NO	YES	NO	YES, in end game	NO	YES	NO	NO
Resistance	NO	NO	NO	NO	YES	NO	NO	NO	NO	NO	NO
Acquire	NO	NO	NO	NO	YES	NO	NO	NO	NO	NO	NO
Tic Tac Toe	NO	NO	NO	NO	NO	YES	YES	NO	YES	YES	NO
Clue	NO	NO	YES - to minimize turns taken	NO	NO	YES	NO	NO	NO	YES	NO
3-15	NO	NO	NO	NO	YES	NO	NO	NO	NO	NO	NO
Cranium	NO	NO	NO	YES	NO	NO	NO	YES	NO	NO	NO
Battleship	NO	YES	YES	NO	NO	NO	YES	NO	YES	YES	NO
Dominoes	NO	NO	YES	NO	NO	NO	YES	NO	NO	YES	NO
Mad Lib	YES	NO	NO	YES	NO	NO	NO	NO	NO	NO	NO
Proposed Games											
nMotion (Catapult)	Weapons, targets, ammunition, play field (with constraints)	Methods vs models, Trial & error to understand each model.	EASY: Aim, prime, fire, and move. DIFFICULT: switch people, defend, and how to define communication(parameters) to each other	Less so, but maybe if they create their own weapons/funcs.	Starting with a goal, they identify the components that will help them achieve their goal. Several layers of dissection will be needed to occur to be proficient	Given a limited number of attempts	A correct analysis of the situation, as well as appropriate selection and execution of methods enables role playing and challenges that should expand stronger methods, models, and artistic creation.	Team based competi- tion	There are patterns in the trial and error in recognizing performance	The students can create a set of nested steps to perform tasks.  The effectiveness of another team member executing the task without any follow up communication (verbal or other) can be measured. The team's collective algorithms could be assessed on another team performing the task and the questions that arise out of their performance.	The play phase of this game is simula- tion
Hero Game	YES	YES	NO	YES	NO	YES	NO	NO	NO	NO	NO
Sorting heights of students	NO	NO	YES	NO	YES	NO	NO	NO	NO	YES	NO
Collaborative matching	NO	NO	NO	NO	NO	NO	NO	NO	NO	NO	NO
Mixing water bottles (from Die Head(20))	YES	YES	YES	NO	YES	NO	NO	NO	YES	NO	NO
Bi-Direc- tional Mad Libs	YES	YES	NO	YES	NO	NO	NO	NO	NO	NO	NO
Rab-Bit Esc-Ape	The wooden bits and designed path structures	NO	NO	Creating new path levels	Path must be broken down into chunks and separate models constructed for each chunk	Given a time restriction, strategies come into play	NO	Players can choose to work either in different parts of the board or the same one	Bit combi-nations, by analyzing the path, the enemies, and magnet polarity	reusability of paths or boards; extra points are awarded for using such blocks. Over time they get better at this algorithmic approach of reusing bits per case (e.g., round corners, U turns, etc.)	NO

Table 1: Comparison of Games

## 7. ACKNOWLEDGMENTS

Dane Webster, our CT class?

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