A Game Approach to Assessing Learning Outcomes

David N. Prata, Patrick Letouze, Stefano Cerri, and Evandro Costa

Abstract—Persuasive technological strategies directed towards changing users’ attitudes or behaviors have thus far been applied in commercial and health promotion contexts, but not for educational purposes. The main reason for this lack of research in educational settings can be attributed to an insufficient understanding of which attitudes or behaviors should be adopted through the evaluation of students’ effective learning outcomes. In this study, we present an association between interpersonal conflict and positive learning and depicted the speaker’s intention and the hearer’s interpretation for cooperative and competitive player roles in light of game theory.

Index Terms—Computer-supported collaborative learning, flaming, insults, interpersonal conflict.

I. INTRODUCTION

During collaboration in computer-supported collaborative learning (CSCL), students engage in a wide variety of collaborative and learning behaviors, which impact each student’s learning in a variety of ways [1]-[3]. Throughout CSCL tasks, interactions between students are recorded in protocols. The analysis can be time consuming due to the large amount of data that must be managed. Hence, an automatic coding procedure for coding dialogue acts is required.

Reference [4] recognized at least four general activities for the analysis of the interactive processes in collaborative learning dialogues: social, cognitive, affective, and meta-cognitive. [5], however, argues that it is inconceivable to dissociate cognitive tasks from social tasks because all cognitive tasks have a social component. In addition to these activities, other variables can be identified, for example, dialogue structure and sequence [6] and didactic-pedagogic issues [7].

Some researchers [8]-[10], have encouraged collaborative knowledge sharing. Reference [11] and [12] argued that social interaction is crucial to productive collaborative learning. Cognitive processes in collaboration, such as problem solving [13], are as important as social factors, such as motivating environments with positive affective relationships [14], [15].

Studies from the 1970s have demonstrated that conflict and interaction promote cognitive development [16]-[20], and describe distinctions between conflict and content [21], consistent with Piaget’s [22] discussion of the equilibration process.

Several studies have found that cognitive conflict and learning emerge from the process of collaboration, when students mutually engage to co-construct shared knowledge [1]-[3]. Additionally, other studies have provided evidence suggesting that cognitive conflict does not only occur in purely collaborative and consensus-based processes. For example, [23] and [24] provide evidence that conflicting ideas often lead to interpersonal conflict.

This study aimed to evaluate how social behavior can influence student’s learning. Previous studies (e.g., [25]) have found insults to be associated with positive learning. In this study, we describe complementary findings for the role of insults in collaborative learning, depicting the speaker’s intention and the hearer’s interpretation for cooperative and competitive player roles in light of game theory.

II. PLAYER ROLES IN COLLABORATIVE LEARNING

Collaborative learning can be seen as a social game in which agents (players) are able to cooperate or compete in order to solve a problem. For game theory, the classic prisoner dilemma, the goal is to win goodness; competition means win-lose, cooperation means win-win, but there is also the awkward ‘lose-lose’ collaborative situation. The medium could be communication, negotiation, and/or mediation. We sought to investigate who was most likely to gain knowledge (the goal) in CSCL games by examining the roles of the person who cooperates or competes as well as the person who sends information or receives it, and the effects of communication, negotiation, and mediation on the knowledge-building process.

Based on the findings of [25] and [26], we have developed Fig. 1.

The analysis of a set of chat protocols using this coding scheme allowed us to identify speech acts [27] that correlated with learning gains for cooperative and competitive student player roles. These categories were qualified in terms of
cognitive and social behavior activities in accordance with

III. GAME THEORY AND DISPUTE RESOLUTION

Game theory is a strategic decision-making paradigm — studied primarily in economics, political sciences, psychology, as well as biology and logic — which study the interactions between agents pursuing their own self-interests. Game theory also studies automated negotiation, as the negotiating parties can be characterized as self-interested. In game theory, the space of possible agent actions is frequently accepted to be sufficiently known by the agents. It turns out that the search space of strategies and interactions must be considered to have exponential growth, which means that the problem of finding an optimal strategy is, in general, computationally intractable [28]. Argumentation-based negotiation approaches aim to remove these limitations. In the negotiation game theory approach, the only feedback that can be provided by an agent is a counter-proposal. For argumentation negotiation, in addition to rejecting a proposal, an agent can offer a critique of the proposal, explaining why it is unacceptable. These new argumentations can lead to a whole new area of the negotiation space not worth exploring for the other agent.

During the argumentation-based negotiation process, agents can be convinced or persuaded to change their point of view. An example is the Adjusted Winner algorithm [29] that often leads to a win-win situation, in a similar manner to the Nash equilibrium [30]. Argumentation-based negotiation has been used in dispute resolution to denote participants’ roles, (i.e., negotiator, mediator, conciliator, and arbitrator). Negotiation is a discussion among two or more individuals with the aim to reach a consensus. Mediation is a volunteer process, in which a third neutral party helps two or more persons in conflict to construct a mutually acceptable solution. Conciliation is an informal process in which a third party acts in an attempt to resolve any differences between parties. Arbitrage is a process in which a third neutral party, after reviewing the evidence, imposes a legally binding decision for both sides [31].
specific to sociocultural language groups. In the context of these statements, we can presume that not all language that appears to be hostile is negative and/or undesirable for a given social interaction. In a CSCL study, [25] found that learning gains were positively correlated with insults. That is, the protocol dialogue analysis revealed that students’ learning gains benefited from insults.

VI. METHODS

Thirty-two sixth-grade students from a suburban elementary school participated in this study. The students were arranged by the experimenter into pairs with a mixture of mixed-ability and homogeneous ability pairs.

The materials for the experimental were the following: a) a mathematics tutoring program covering problems on fraction addition, subtraction, multiplication, and division; and b) two extensive isomorphic tests designed for pre-test and post-test use. The pre-test and post-test versions consisted of 49 and 47 questions, respectively.

The experimental procedure spanned four school days. On the first day, a pre-test was completed individually by each student. The pre-test lasted for approximately 30 minutes with the aim of assessing how much the students knew about the subject matter. A short collaboration training manual was also provided to teach students about good collaborative dialogue. On the second and third days, the students worked together in labs for approximately 45 minutes per day. The post-test was administered on the fourth day and was separated from the third day by a weekend. This two-day lag between the last lab day and the post-test day allowed for a measure of retention. Each student performed the post-test alone. Teams remained the same throughout the experiment.

The students were encouraged to work in cooperation by offering a small prize for the teams at the end of the study based on how much they learned the subject matter. A short collaboration training manual was also provided to teach students about good collaborative dialogue. On the second and third days, the students worked together in labs for approximately 45 minutes per day. The post-test was administered on the fourth day and was separated from the third day by a weekend. This two-day lag between the last lab day and the post-test day allowed for a measure of retention. Each student performed the post-test alone. Teams remained the same throughout the experiment.

The students were encouraged to work in cooperation by offering a small prize for the teams at the end of the study based on how much they learned the subject matter and how many problems they solved correctly while working together.

This experiment allowed us to investigate students’ knowledge gains based on the pre- and post-tests and to analyze the chat and the math tutoring program contributions based on students’ pairs and the students alone. A total of 24 students participated in all of the experimental days. Because one student did not participate in the chat interface during two of the lab days, we reduced the sample to 23 students.

VII. RESULTS

We analyzed the correlations between pre- and post-test learning gains and the frequency of each category of our coding scheme in each pair’s dialogue. Interestingly, student insults were associated with significantly higher learning gains, \( r = 0.70, t(22) = 4.53, p < .001 \). In Fig. 2, we provide evidence that the four students who made learning gains of upwards of 20% were involved with insults.

VIII. DISCUSSION AND CONCLUSION

Some authors [46], [56], [40] have found that there is a particular pattern of conflict — task conflict — that is associated with higher team performance. Indeed, a CSCL environment is a task-driven environment, and thus the conflicts that occurred here should be classified as task conflict. As we observed, conflicts arose in a competitive manner. Reference [51] described a theoretical perspective for disputes that focused on the meaning and interpretations of social actors in the development and management of disputes. However, a disputing perspective is less concerned with sources or types of conflict. The findings provide evidence that the competitive player role is beneficial to the speaker. The greatest learning gains were achieved by students who adopted the competitive player role against his/her partner. In the present case, the student who did not assume a competitive role achieved below-median learning gains. Furthermore, the six students studied here who experienced lesser learning gains included student 23, who did not hold a competitive position. In the post-test, student 23 correctly answered 20 hits compared to 33, 42, 35, 35, and 34 correct answers from students 5, 6, 19, 20, and 24, respectively.

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<th>TABLE I: PRISONER’S DILEMMA, GAME THEORY</th>
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<th>TABLE II: COLLABORATIVE LEARNING GAIN GAME, BASED ON PRATA ET AL.’S (2012) SPEECH ACTS</th>
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* There is little evidence to support this—further research is required.

In Table I and Table II we depict a comparison between the prisoner’s dilemma and the game of collaborative learning gain. It is important to note the difference in communication means between the two scenarios. For the prisoner’s dilemma, there is no communication or negotiation between parties. The prisoner has to independently decide, without reciprocal input, whether s/he cooperates with or defects from his/her partner. Finally, an arbitrator reviews the evidence and legally decides the fate of the prisoners. For the collaborative learning gain, the objective is to bidirectional negotiate a
construction of meaning and understand the problem solving process, encouraging students to expose their beliefs by mediation.

The results of these studies foster the development of collaborative learning games in which students can play by competing with each other to learn about some subject matter. Furthermore, an intelligent agent, playing the role of a dialogue part, could persuade a student to adopt a more competitive approach towards effective learning. For instance, the design of persuasive technology is intended to change attitudes or behaviors of the users through persuasion [57]. However, most applications to date have been developed in commercial and health promotion contexts [58]. Studies in educational settings have been uncommon due to a lack of understanding of behaviors or attitudes that should be adopted by students for optimally effective learning outcomes. For instance, many studies have been based on content analysis — a wide and heterogeneous approach — or design models based on quantitative data on levels of participation [59], [60].

It appears that, in the “collaborative learning game,” learners benefit from assuming a competitive role. At first glance, the competitive role does not appear to make sense. It is important, here, to understand that CSCL is a collaborative setting. That is, the students must cooperate with each other in order to construct their knowledge together. The infrastructure and methodology reflect this characteristic as well, given the encouragement of students to cooperate with the reward of a small prize. However, we looked for greater learning gains, and found that the competitive role was the best choice for effective learning, as long as they remained cooperative.

The prisoner’s dilemma and the collaborative learning gain have different mediums. As [61] stated, “the medium is the message.” In other words, the message is the medium itself, not the content it carries. Following McLuhan, we could presume that changing the medium would therefore change the game paradigm. The prisoner’s dilemma is more like the traditional channels (e.g., TV and radio), whereas the Internet represents the collaborative learning channel. The TV channel is unidirectional, whereas the Internet is bidirectional. While on the Internet we can exchange messages, on TV we can only receive messages as a passive spectator. The paradigm of the “mass-age” has long characterized our society. In the traditional classroom configuration, students are inclined to behave like the prisoner, adopting cooperative behavior in order to receive mild punishment from the arbitrator. However, this study suggests that students must compete with each other by exposing and exchanging their ideas. This, presumably, facilitates cognitive development in a CSCL environment.

According to our study, for the collaborative learning game, when both students compete in a CSCL environment, both win. When one competes and the other does not, the competitor wins. Reference [26] also observed positive learning for the cognitive behavior of competition. According to [5], it is inconceivable to dissociate cognitive tasks from social tasks because all cognitive tasks have a social component. For future work, we must extend our investigation to better understand the role of cooperation in a CSCL environment. In the current study, in the case of pair 23-24’s conversation, it would be advisable for the agent to intervene in the dialogue to suggest that student 23 change his/her passive position to a more competitive one. However, further research using CSCL with students from others cultures and countries would be worthwhile.

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REFERENCES


1 McLuhan punned on the word “message.”
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