

Rapid Communication

Group-Work Aspects in Adolescents' Self-Directed Learning

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Introduction

Self-directed learning (SDL) is the major educational aim to cultivate resilient and adaptive lifelong learners of the 21st century [1], where the “self” should be vested so that the student can adjust to new situations in the learning process [2]. This requires (a) specific SDL skills [3], and (b) the heightened capability to manage all the learning elements on one’s own, which, however, creates a severe bottleneck for novice students [4]. Because relating several mental items, while also guiding the learning steps, challenges one’s cognitive activities in making sense of the sub-material quickly enough [2,3]. Yet, the latter is the core of efficiency in SDL: task-relevant information processing in working memory, and memorizing respective results in long-term memory [5]. As this process directly depends on the cognitive load per moment - due to the limitations of human cognitive architecture - there is a high need to avoid the cognitive overload of the learner [5]. The problem is that although higher-order cognitive skills are inevitably needed in SDL to lead the learning, understand the material [3], and to memorize while completing assignments at the same time [6-8]. From the developmental perspective such a multi-level cognitive capability cannot be taken for granted in school age students [9,10]. Learners with weaker cognitive skills get more easily confused, not able to resist distractions, and therefore perform worse at memorizing the task-relevant items [11]. This aspect is important especially in novice students, restricting their as quick as in adults “online” processing [7,12]. Yet, most of the SDL suggestions have been given based on adults, while only few studies have been carried out with school-age students [3]. In spite of that, SDL requires more sophisticated learning strategies to be employed by the learners themselves [13]. This need to combine both: (1) domain information what the learner knows and what he/she needs to know to successfully carry out the learning tasks, and (2) procedural information how-to, in order to adjust if needed [5]. All this creates a remarkably higher cognitive load for learners in SDL compared to conventional learning methods, where the teacher orchestrates most of the operations, and therefore the cognitive load of learners is lower while processing the information pre-organized by the teacher [14]. However, if the cognitive load becomes too high, it directly hampers learning quality and the transfer of knowledge [4,5]. These aspects may impact young learners’ reaching a proper final conclusion [2]. On the other hand, differences have been found also in the cognitive control function

between boys and girls [10]. In light that SDL lays the ground for other competencies essential for educational growth and lifelong learning, it is reasonable to research this approach and its different corners [13]. Based on the findings given above, the current work concentrates on adolescence-age students’ SDL outdoors using a small-group learning format that has been suggested to lower one’s own cognitive load [15].

Theoretical background

The SDL definition refers from an external (i.e., teacher) to the individual taking initiative (determining learning goals, defining sources, choosing and using appropriate strategies, also evaluating the outcomes) where the control aspect of the learner is crucial to be able to conceptualize independently [3]. The latter, as the essence for change in understanding [2] requires that learners handle several information items concurrently in the focus of their limited cognitive capacity [11]. Thus, SDL needs extra advanced skills of concentration on only the proper (task-relevant) information in the working memory [16] to reach a proper final conclusion [17]. Because students in SDL may experience difficulties in adjusting their learning in a blended learning situation, which is far more demanding, compared to passive listening to teachers’ transmission of well-organized knowledge [1]. While the SDL method is based on simultaneous demand to keep “excerpted” information items in mind while making other operations [18]. It is therefore also defined as complex learning [17] that can be detrimental to “save” information in long-term memory [19]. Hence, one of the main aspects to reduce learning complexity is that the learner needs a close relationship with others (whom to rely on) to foster individual learning through belonging while learning by doing and experiencing [2]. In that way, one can base on the reciprocal effects of the fulfillment of the basic psychological needs for relatedness and autonomy so as to increase one’s own competency [20]. Competence increases through striving to perform a given task (while the experience of effectance increases a sense of mastery); relatedness is based on the feeling of belonging (amongst others); autonomy expects to be the origin of one’s own actions to govern with the choice one’s own behavior [21]. High cognitive loads, therefore, are especially detrimental to learners with weaker or not yet advanced enough cognitive skills [22-24]. As the high cognitive load severely restricts making sense [19]. As a circle back, if unable to understand, it fuels one’s uncertainty instead to cultivate self-confidence that relates to self-motivation and willingness to learn [3]. This, as a result, diminishes autonomy to govern the next learning steps [20], so hampering to reach the final conclusion set by the SDL multi component assignment [7]. In other words, complex learning - which requires several mental sub-processes - itself may cause cognitive overload [14], because its essence restricts the maintenance of only the sub-information items in a limited working memory focus [22,25].

Executive functions

Executive functions that facilitate direct and coordinate other cognitive processes, encompass a large range of top-down processes: planning, attentional control, and the regulation of action [26]. However, besides to managing skills of one's own learning required in SDL [6], it also necessitates shifting from one subtask to another (i.e., switching between the learning elements and/or strategies) to constantly update information in working memory [26-29]. This requires "putting on hold" some parts of the information while acting with other sub-tasks at the same time [7]. To be able to do that, the human cognitive capacity limits allowing to process only about 3-4 elements per time [30] become especially evident [23]. As learners with more advanced executive skills are more efficient at resisting distractions (by irrelevant items), they are more efficient in solving the relevant elements [17]. However, learners with lower executive skills are less able to resist distractions (that "conquer" their already limited cognitive space), thus they are also weaker in the processing of the relevant information [31]. This severely constrains weaker students in their sequential online operations and as a consequence their overall SDL progress [24]. Cognitive executive functions (as a controller of working memory in human mental "note-pad") are therefore needed for two purposes: (a) until processing the right (relevant) response, one needs (b) to resist/inhibit the wrong (irrelevant) ones [28]. This kind of capability is fundamentally important to solve complex tasks [32]. Yet, for school-age students (who are in the stage of human cognition's prolonged maturity), the SDL approach (that needs the processing of several info-pieces concurrently) sets a considerably higher cognitive demand than conventional learning methods [23]. This can cause their cognitive overload [14], which can lead to inappropriate learning gain because when the working memory is occupied with too many items, it cannot be used at the same time for efficient memorization into the long-term memory [19]. Although some of the cognitive abilities develop earlier, executive functions in particular (the working memory, inhibition, and switching), enabling us to act on the basis of proper choice, not on impulse [28], do not reach their maturity until early adulthood [18]. Those aspects are important especially in SDL, in light that the cognitive abilities do not mature with equal spurts in all children [12]. Prior work, therefore, highlights the need for empirical research on SDL, especially in the context of school-age children, because initial conceptualization of the SDL is focused on adult learners [10], who by their advanced cognitive maturity have also higher readiness for the SDL method compared to young learners [9,26].

Small-group learning

It has been found by Schweder & Raufelder [10] that the group "as a teacher" helps to structure the SDL process - in that way fostering more efficient learning, more active engagement in the learning process, and usage of negotiating [15]. However, the group-work essence is not only talking but making reasoning explicit to others by justifications, explanations, and giving arguments [33,34]. On the other hand, it has been also found that this kind of multitasking can interrupt one's own processing, and when seeking help it can distract fellow students, which therefore may complicate the whole group's learning [34]. Especially when the group includes students with different abilities (e.g., some group-mates need more help, extra time, or repeated explanations to understand the topic), when asking

for help from fellows, it can disturb the concentration of both more skilled students and those with lower capability [35].

Gender aspects in SDL

The hormonal changes accompanying the adolescence period can be related to individually different developmental dynamics in girls and boys to direct oneself [8]. It has been shown that adolescent girls (compared to boys of the same age) through their greater willingness put more effort into their learning; while boys have been shown to implement lower control strategies than girls [10]. This seems to give an advantage to girls to learn more efficiently, based on the findings that girls generally monitor their own learning more thoroughly using steadier control skills compared to boys [10]. The latter can be related to the aspect that in adolescence the normal maturation rhythm of cognitive control sophistication generally lasts longer in boys compared to girls [36]. Another finding is that girls prefer learning settings that are familiar to them, that is, practiced earlier in terms of not challenging them (repeated and therefore "secure" methods); while boys, in turn, enjoy challenges (to explore around and discover new things hands-on) and thus also keep going to learning settings not practiced before [37]. Boys, therefore, may also like autonomous SDL more compared to girls.

Current work

Involving SDL phases such as planning, gathering evidence, synthesizing, and making final conclusions (Figure 1), we designed the SDL outdoor scenario. The current experiment was organized as a part of a more extensive research study on innovative approaches to learning and teaching outside the classroom supported by technology.

Purpose of the study

Based on the theoretical overview of the heightened cognitive loads accompanying the SDL, this study aims to examine adolescence age students' autonomous learning through the two lenses: (1) individual learning; and (2) whether the participants' group-work experiences vary based on individual prerequisite characteristics.

Data collection tools

Data for the study were collected using prior and post-understanding tests within the learning domain; the individual cognitive capacity measuring task *Fruit-Stroop*; and group-work reflection questionnaires.

We firstly aimed to analyze the trajectories of learners' conceptual understandings. For the latter, we used prior- and post-understanding questionnaires, where they were asked specific domain-knowledge questions within the learning topic.

Secondly, we aimed to detect participants' individual cognitive executive skills (that are especially required in multitasking conditions). For the latter, we used the *Fruit-Stroop* task by Meixner et al., [38] that we adapted into Estonian. This tool directly shows the learner's interplay of efficient working memory and executive attention that together enable to resist distractions [17]. Considering that executive functions are found to be largely varying among school-age students [12].

Thirdly, we aimed to analyze participants' group-work reflections as helping them to share the individual cognitive load [15], or instead as rather disturbing individual concentration [35]. The hypotheses

are as follows:

H1: There will be differences in the conceptual understanding trajectories.

H2: Group-work can be perceived differently based on participants' individual cognitive executive skills.

H3: Reflections on the group work will reveal gender differences.

Materials and Methods

We used the quantitative approach.

Study design and participants

The participants in the study were adolescent school students aged 14 - 16y (8th and 9th graders) from two municipal schools in Estonia. We aimed to investigate the SDL aspects through this age group who, still in the stage of developmental maturing, are vulnerable to high cognitive load. Based on environmental chemistry and bio-indicators, the assignment for the participants was to determine different trees (in grade 8) and to investigate the air quality (in grade 9) around their school. We aimed to investigate (1) learners' conceptual understanding levels (before and after to detect their understanding trajectories); measuring initially each student's individual cognitive executive capacity (2) to analyze the low- vs. high-capacity learners' results; and (3) their reflections by gender.

Inclusion criteria: There was a larger number of students (around 200) taking part in this experiment. However, due to various reasons (e.g., many students had not answered all the questions they were given), the final sample size $n = 122$ was used for the analysis that included 62 boys (52.4%) and 60 girls (47.6%). Permission was asked from the school director, then the science teacher. Participation in the experiment was voluntary. A letter describing the study (its aim, data management, and confidentiality, ensuring no harm will be caused to the students) was sent to the parents asking for their consent to allow their children to participate in the study. Participants gave their personal consent while they entered the experiment. They were informed that they could quit at any time.

Instruments

Fruit stroop task: We implemented this task as a web-based application of JSPsych [39] used by PCs. Each participant (individually) was consecutively presented (Figure 2) with coloured rectangles and fruits (in respective correct colours; fruits in black and white; fruits in incorrect colours). Respondents were asked to click the colour in which stimuli were printed or the colour which the fruits actually should have as quickly as possible. The principle to act correctly requires suppressing a dominant response (i.e., to click on the colour one sees).

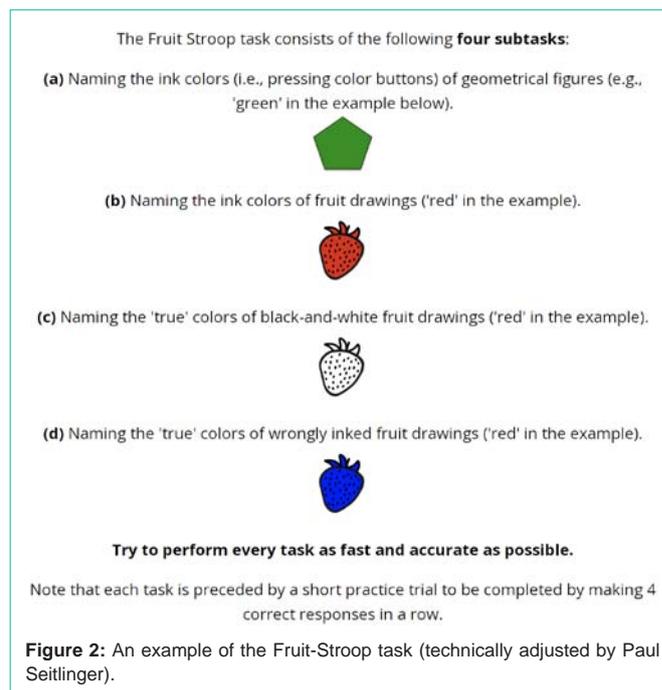


Figure 2: An example of the Fruit-Stroop task (technically adjusted by Paul Seitlinger).

Time in seconds spent on clicking correct colours, and an interference score (i.e., the wrong answer) was calculated automatically by the task application [38]. A Stroop Effect occurs when an automatic behaviour occurs that interferes with one's processing - which is related to one's weaker executive system linked to the inhibitory control that involves also the working memory contribution (because a proper performance necessitates the current rule to be kept in mind) to push the right button [40]. The higher negative value in the *Fruit-Stroop* task interference score indicates lower inhibition ability ($r = 0.78$) [38].

Prior- and post-understanding questionnaire

The participant's domain knowledge (e.g., "What aspects do you presently know about air quality?") was measured (a) before and (b) after the SDL outdoors. These results were coded by two different researchers according to Heddy et al., [41] operationalization of conceptual understanding about a certain phenomenon from a non-scientific view towards a scientific perspective: "1" - an inaccurate or wrong understanding; "2" - a hybrid conception (mixed: partly accurate but controversial or misconceptions); "3" - an accurate but underdeveloped understanding; "4" - an accurate but not perfectly developed understanding; "5" - a well-developed understanding. Cohen's kappa = 0.9 (asymptotic standard error was 0.03; approximate T_b was 17.7; $p < 0.001$) between the two researchers' estimations on participants' understanding levels showed good validity (that is near-

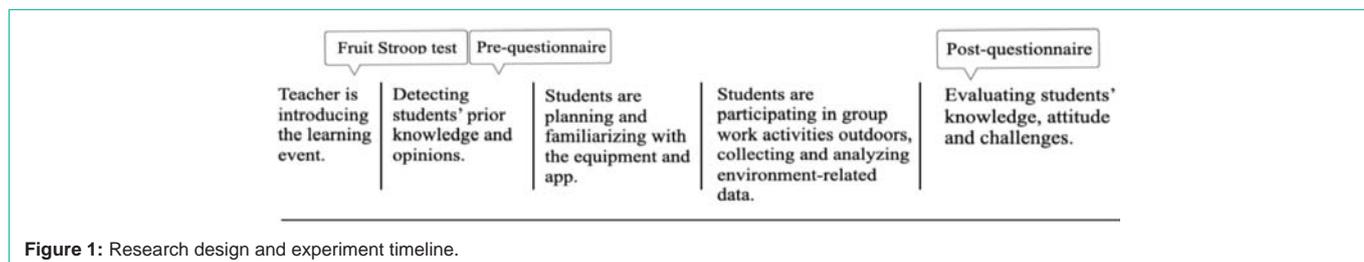


Figure 1: Research design and experiment timeline.

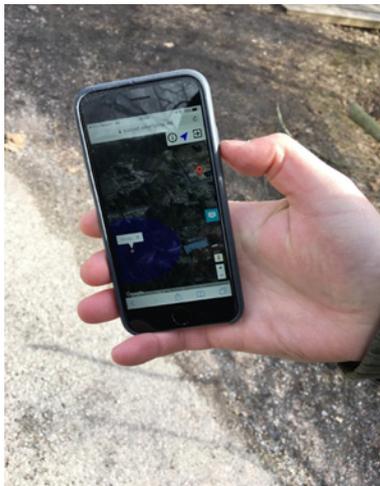


Figure 3: Mobile application to keep track outdoors (to accomplish the SDL assignments).

perfect agreement).

Group-work reflection

There were involved two different values on the group work: “Working in a group helped me to understand the topic better”; “Thanks to group-work, I wanted to study in this lesson”, “My own contribution to group-work was important” composed the Positive index (as an advantage while learning together with others and also contributing to the group-work from his/her own behalf). The agreements within the Positive index statements were counted.

“Group-work interfered with my learning”; “I could have done better on my own with the assignments”; “My group would have succeeded also without me” composed the Negative index (as not beneficial to his/her own learning, and not contributing on his/her own behalf to the group-work). The disagreements within the Negative index statements were counted.

We also asked the control question: “Did you have good cooperation with your group-mates?” as one’s perceived support offered by the group, and at the same time, their own contribution to group work as well. As the questionnaire was given by a 6-point scale: “I absolutely disagree”; “I somewhat do not agree”; “So and so”; “I somewhat agree”; “Totally agree”; “I do not know”, we re-coded the answers as follows: Agreement (containing “I somewhat agree”; “Totally agree”); Neutral (containing “So and so”); Disagreement (containing “I somewhat do not agree”; “I absolutely disagree”); I do not know (containing “I do not know”). The analysis was conducted using the r-Studio and SPSS statistics programs.

Procedure

The *Fruit Stroop* was conducted in the everyday classroom and lasted approximately 10 minutes. After that, each participant answered the prior-understanding questionnaire. Next, the participants were divided into groups (consisting of mainly 3 students) and were instructed to go outside and how to use the learning tools they were given for measuring and saving data. In the outdoor assignment, each group of participants followed a predefined path with different location points (using their mobile phones to follow the track as

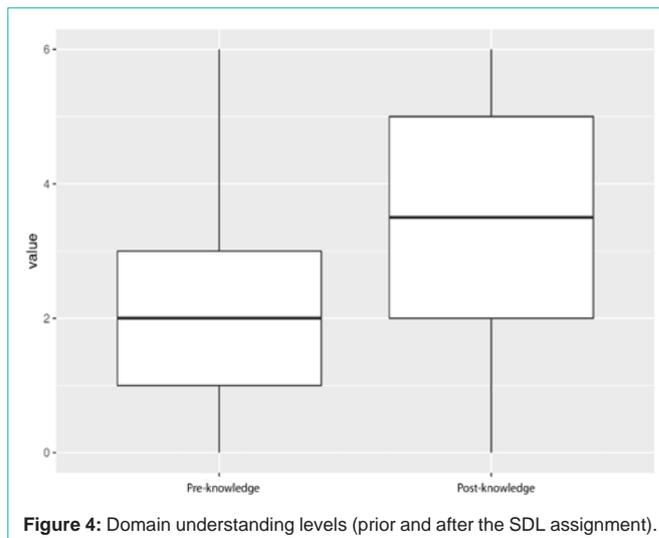


Figure 4: Domain understanding levels (prior and after the SDL assignment).

shown in Figure 3) for carrying out in each point their necessary observations and measurements about the environmental conditions.

After outdoor explorations and completing assignments, the participants came back into their classroom, analyzed the gathered data and made their final conclusion, answered the post-understanding questionnaire (each student individually).

Results

Comparing firstly all participants’ (N=122) two understanding levels before and after their SDL (Figure 4), the difference (M=1.28 units) between the average of learners’ prior- (M=2.11; SD=1.28) and post-understanding (M=3.43; SD=1.47) was statistically significant by the Paired T-test, $t(121) = -9.053$; $p < 0.001$ (p-value = $2.903e-15$).

(A more detailed analysis of the knowledge change aspects is presented in another article by us). Exploring next the trajectory of participants’ conceptual understanding (by calculating one’s post-understanding level minus his/her prior-understanding score), we see the following dynamics (Figure 5).

We see that although many of the participants improved their final understanding (increasing it by “1”; “2”; “3”; “4”; “5” or even “6” units), still a proportion (25%) of learners kept the same level shown by “0”. However, there also appeared a negative dynamic in some participants’ final understanding (i.e., instead of improving it rather decreased by “-1” and “-2” units, compared to the initial understanding level). To detect which specific contributors might have had an impact on one’s final understanding improvement, we created a linear regression model, where included: the post-understanding level (DV) and the static variables (IV) such as gender, grade, and *Fruit Stroop* score. The model was statistically significant (i.e., the selected combination of the features significantly affected the change) with $R = 0.065$ (Multiple R-squared). Although no strong relationship was found, the descriptive power of the model was 6.5% of the variance ($R^2 = 0.041$), $F(117) = 2.732$ (on 3) p-value = 0.04697 ($p < 0.05$), and the gender girl, $p < 0.05$ (p-value = 0.0218) ($\beta = 0.62234$) had a significant predictive value in a higher increase in the post-knowledge (Standard Error of the Estimate = 0.2). H1 (There will be differences in the conceptual understanding trajectories) was

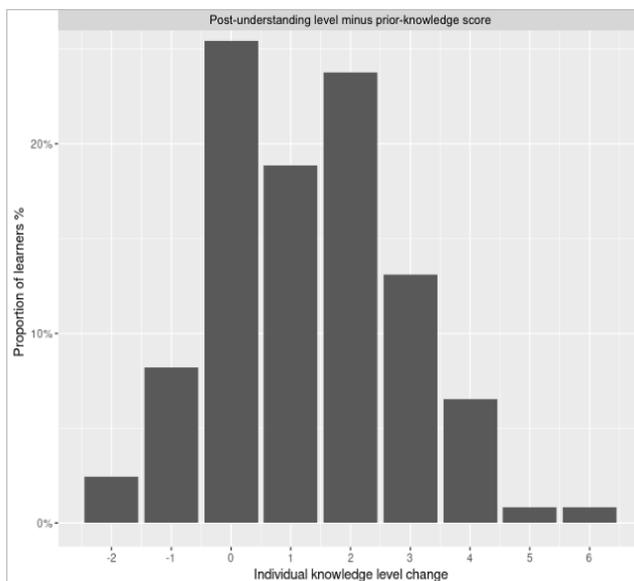


Figure 5: Domain understanding trajectories (from prior- to post-understanding).

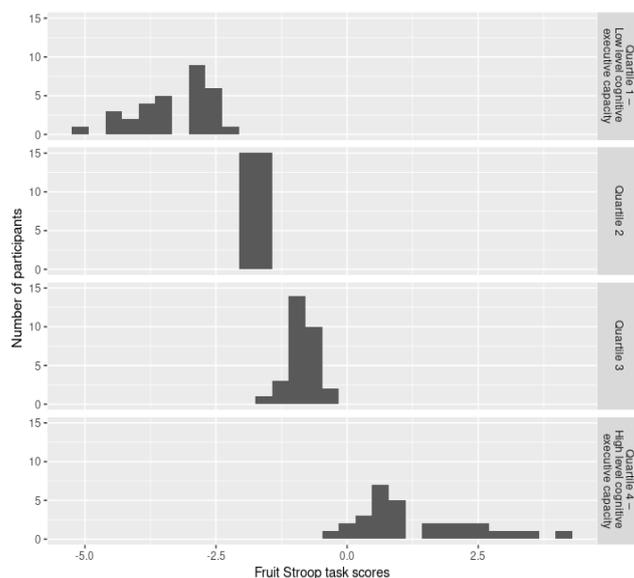


Figure 6: The Fruit-Stroop task scores: Quartile 1: Low-capacity; Quartile 4: High-capacity.

confirmed.

Individual cognitive executive profile and group-work reflections

We detected each student’s individual cognitive executive skills according to his/her *Fruit Stroop* task score (Figure 6). To differentiate high- and low-capacity profiles (with a maximum difference), the following variables emerged: Quartile 1 - the weakest scores in cognitive executive skills, and therefore the participant falling in this range was categorized as a “low-capacity profile” that included 31 participants (the upper cell in Figure 6). Quartile 4 - the highest scores, and the participant falling in this range was categorized as a “high-capacity profile” that included 30 participants (the lowest cell

in Figure 6). The Two-Sample T-test showed a significant difference between these two quartile-profiles, $t(47.998) = -18.878$; $p < 0.001$ ($p\text{-value} = 2.2e-16$).

We next included the high- and low-capacity characteristics (of the cognitive executive skills) into the examination of participants’ reflections on their group work through the lens of the Positive and Negative index. On the Positive index (“Working in a group helped me to understand the topic better”; “Thanks to group-work, I wanted to study in this lesson”, “My own contribution to group-work was important”), there were no significant differences between high- and low-capacity students’ reflections, $X^2(3, n=61)=1.17$, $p > 0.05$ ($p=0.761$). This shows that both groups (as low- as well as high-

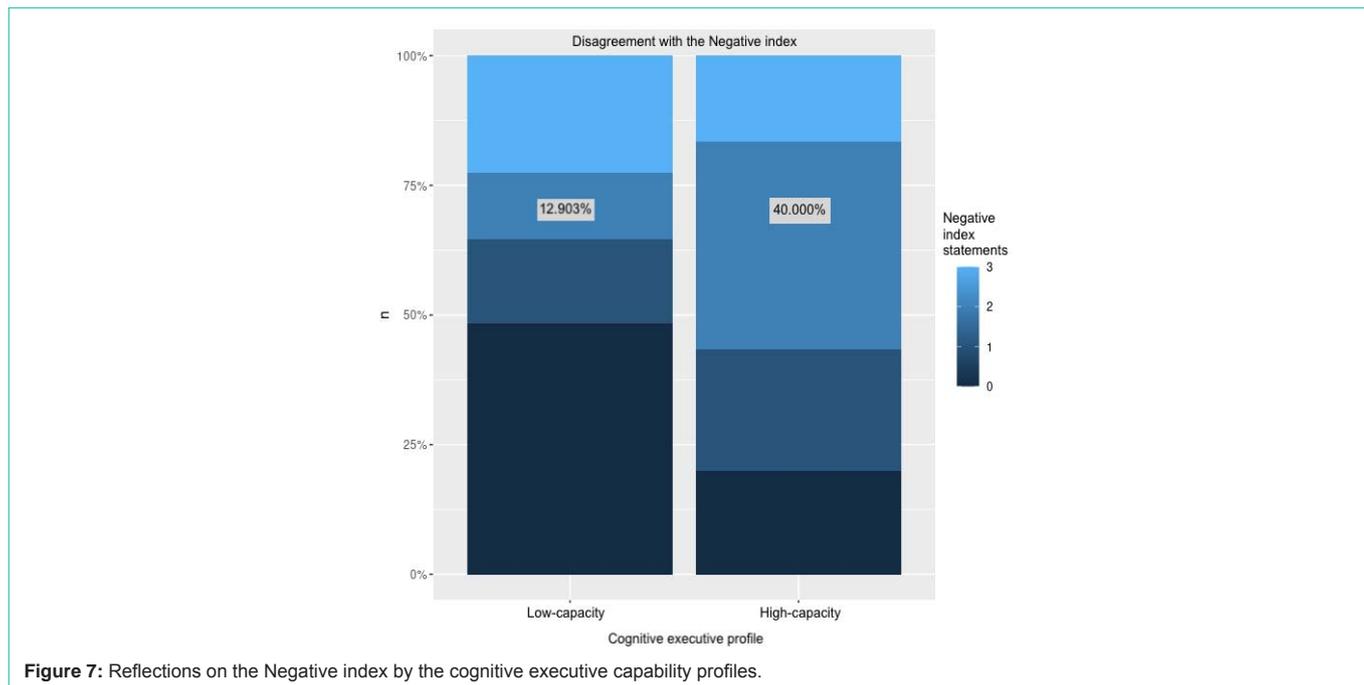


Figure 7: Reflections on the Negative index by the cognitive executive capability profiles.

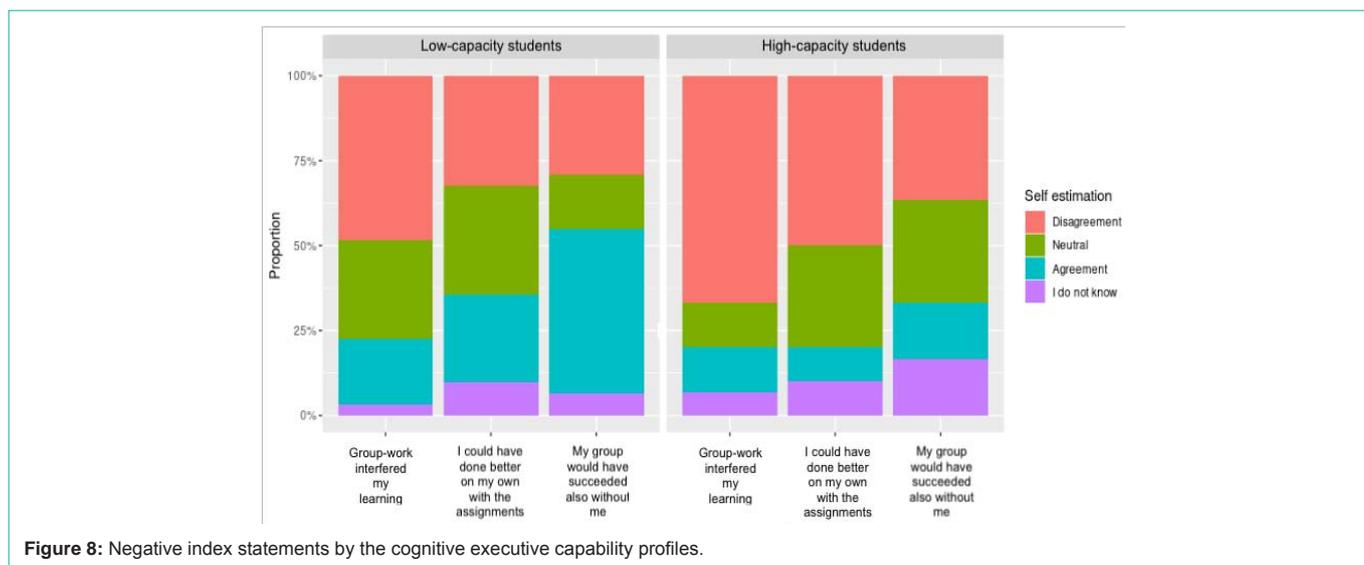


Figure 8: Negative index statements by the cognitive executive capability profiles.

capacity participants) equally valued the group’s benefit for them highly. However, on the Negative index (“Group-work interfered with my learning”; “I could have done better on my own with the assignments”; “My group would have succeeded also without me”), there was a significant difference (Figure 7).

High-capacity participants remarkably more (40%) disagreed within the Negative index (compared to low-capacity students). The chi-square test revealed that the Negative index and the individual capacity profile were related, $\chi^2(3, n=61)=8.51, p < 0.05 (p=0.037)$. The Cramer’s $V = 0.22 (p = 0.036)$ showed a moderate strength. The sub-statements of the Negative index are shown below (Figure 8).

This outcome allows us to say that H2 (Group-work can be perceived differently based on participants’ cognitive executive skills) was confirmed.

Gender and group-work experience

Regarding the Positive index (Figure 9), the chi-square test revealed that the Positive index and gender were related, $\chi^2(3, n=122)=9.25, p < 0.05 (p=0.026)$. Although the Cramer’s $V = 0.16 (p = 0.026)$ showed a weak relationship, investigating the statements within the Positive index in more detail, it came out that girls (compared to boys) predominantly agreed with the statement “Working in a group helped me understand the topic better” ($p < 0.05$).

This indicates that girls still needed the support offered by the group to understand the learning topic more than boys. An overview of the sub-components of the Positive index is given below (Figure 10).

Regarding the Negative index (Figure 11), also clear differences between boys’ and girls’ estimations were revealed: girls significantly

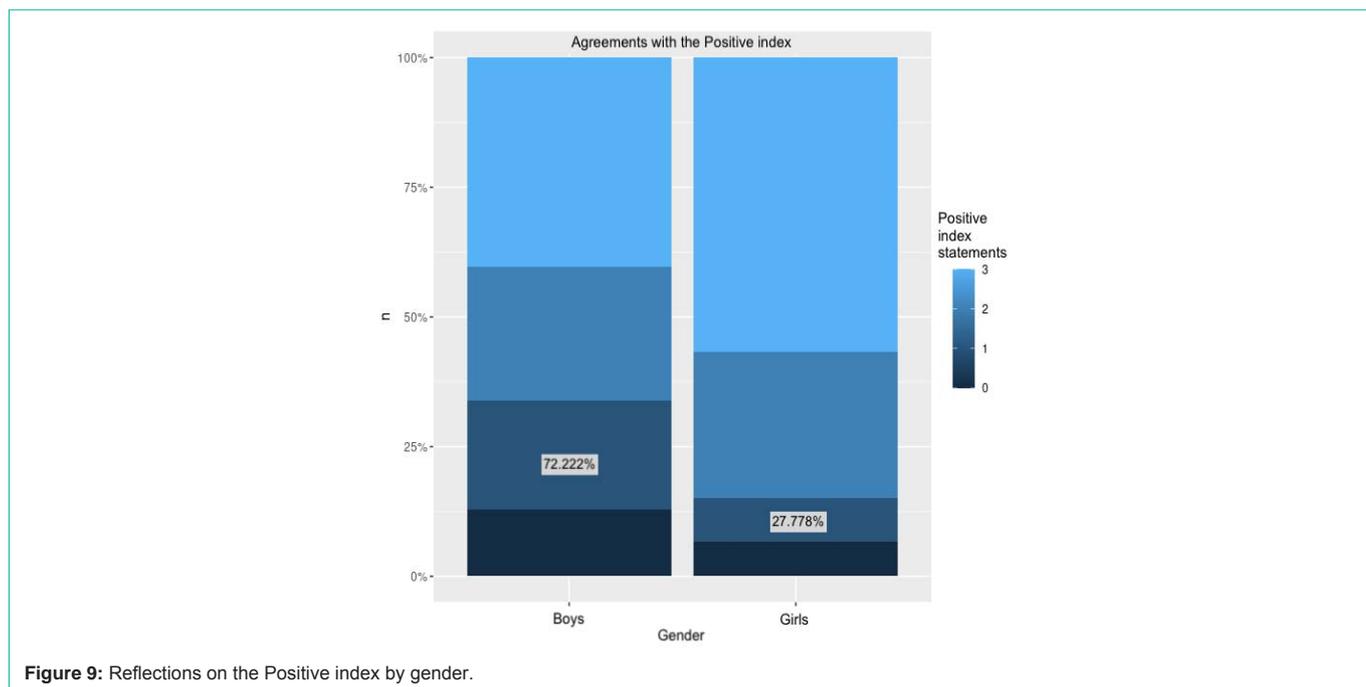


Figure 9: Reflections on the Positive index by gender.

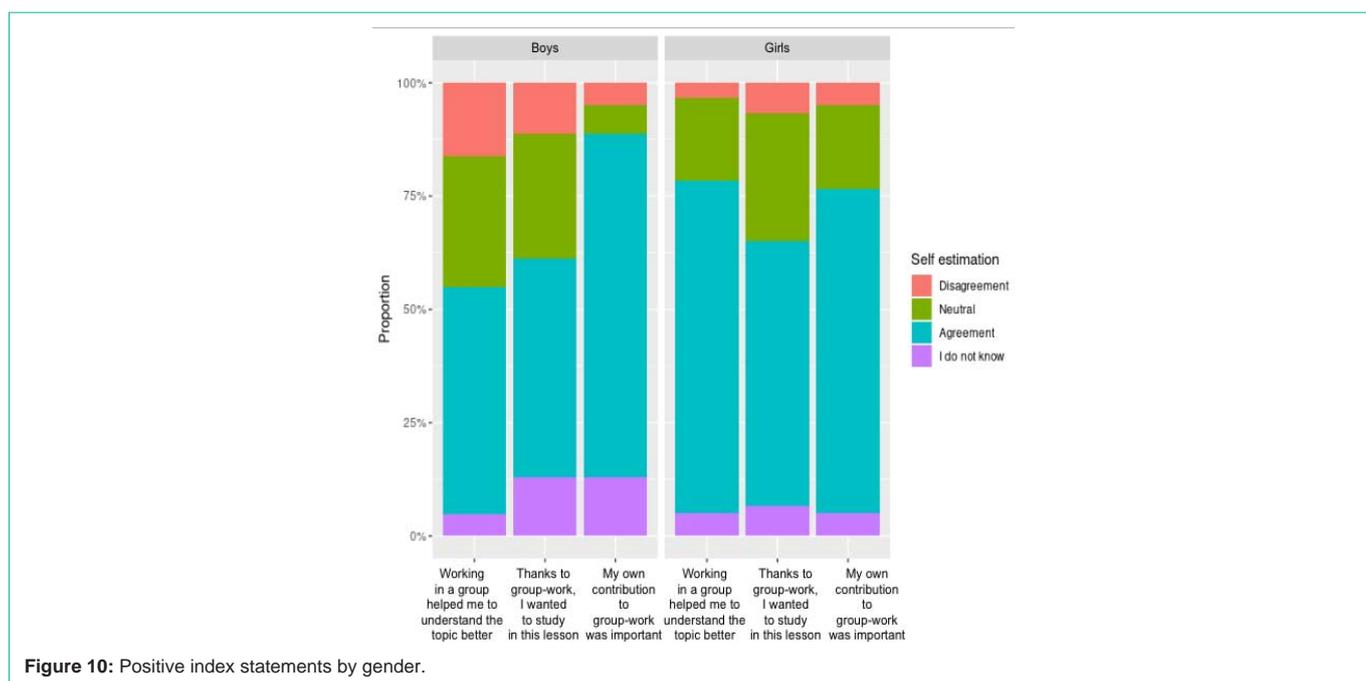


Figure 10: Positive index statements by gender.

more (48%) disagreed with the Negative index (compared to boys).

The chi-square test revealed that the Negative index and gender were related, $\chi^2(3, n=122)=11.91, p < 0.01$ ($p=0.008$). Cramer’s V = 0.622 showed a moderate relationship. The sub-statements of the Negative index are given below (Figure 12).

Investigating in more detail the sub-statements within the Negative index, it turned out that girls significantly more (compared to boys) disagreed with the statement “I could have done better on my own with the assignments”. The chi-square test revealed, $\chi^2(3, n=122)=10.273, p < 0.05$ ($p=0.016$). The Cramer’s V = 0.18 ($p = 0.008$),

which (although a weak relationship) indicates that girls seemingly needed the support offered by the group more than boys. This outcome also relates to the control question used in this work “Did you have good cooperation with your group-mates?”, which showed that nearly all of the girls (90%) said they had good cooperation with their group-mates (compared to boys). The chi-square test revealed, $\chi^2(3, n=122)=10.34, p < 0.05$ ($p=0.015$). The Cramer’s V = 0.54 ($p = 0.02$) showed a relatively strong association. Based on this outcome H3 (Reflections on the group work will reveal gender differences) was confirmed.

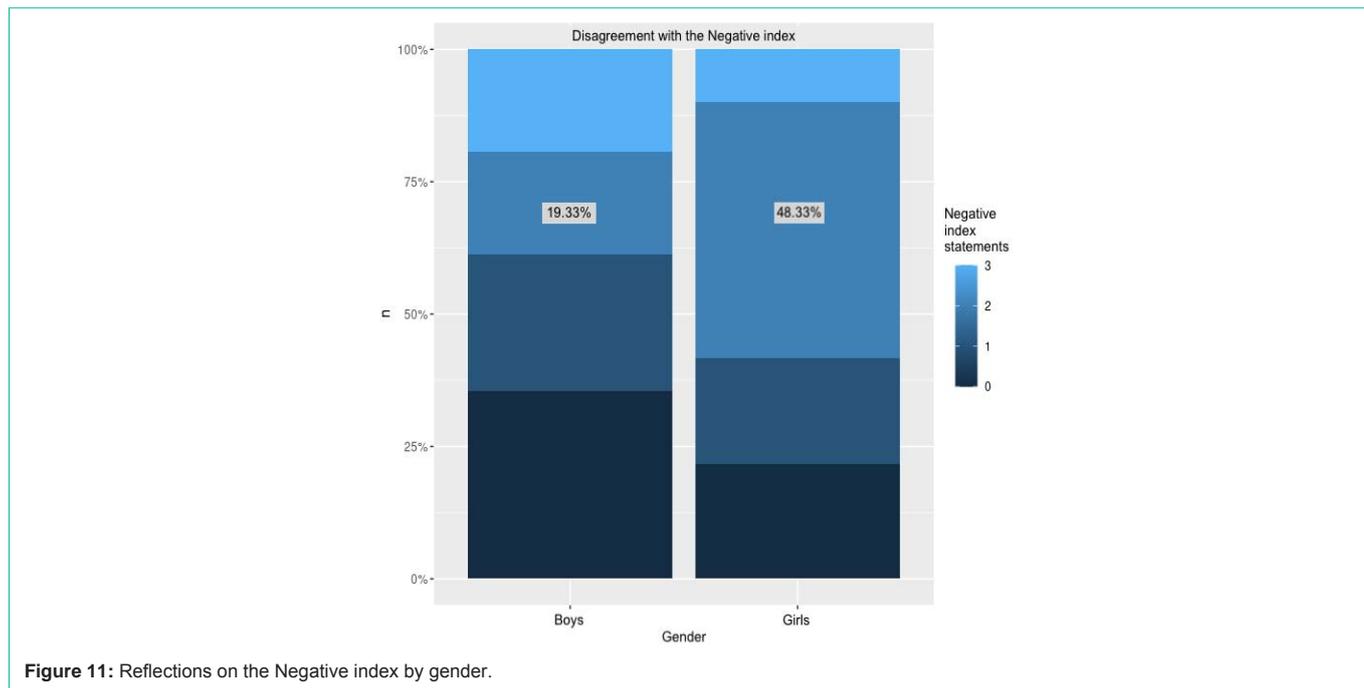


Figure 11: Reflections on the Negative index by gender.

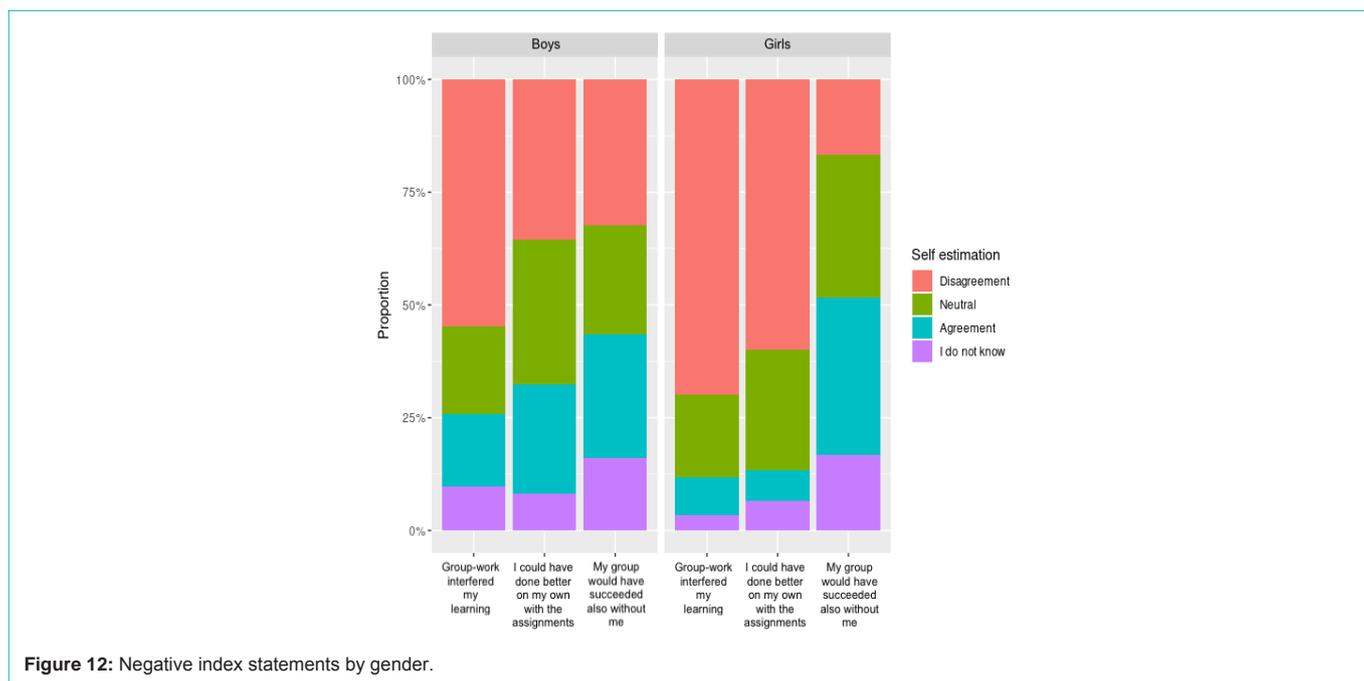


Figure 12: Negative index statements by gender.

Discussion

This study concentrated on adolescent school students' SDL outdoors, where we examined the individual conceptual understanding trajectory as a result of their small-group learning format, and the relationships between participants' individual characteristics and their group-work experience.

Our first finding, which showed that girls gained a higher post-understanding level (compared to boys) is in line with prior work: adolescent females (compared to males of the same age) have greater

willingness to put more effort into their learning, while boys have lower control skills because the maturation of the cognitive control advancement lasts longer in boys than in girls [10,36]. More efficient control thus gives an advantage to girls to monitor their own learning more thoroughly [10], which, in turn, fosters their learning efficacy. This aspect, which in addition confirmed previous findings showing a significant difference between university students' SDL skills and gender in favor of female students [3], might be the reason also for the aforementioned differences that came out by our experiment results. Based on this we can conclude that H1 (There will be differences in

the conceptual understanding trajectories) was confirmed.

Our second finding showed a clear relation between the individual cognitive executive skills' profile and the group-work experience. Low-capacity (at cognitive executive skills) students did not consider group work as valuable for them. This outcome relates to prior work which describes the SDL as an approach that, because it requires the processing of several info-pieces concurrently, sets a much higher cognitive demand than conventional learning methods [14,23]. Yet, when working memory is occupied with too many items, it cannot be used at the same time for quick sense-making that, however, is the basis of SDL- to sequentially memorize sub-information in long-term memory [19]. Therefore, our outcome can be interpreted that learners with lower-level cognitive executive skills are less able to avoid distractions caused by the multi-level processing requirement accompanied with SDL [7]. Whereas the cognitive difficulty is derived by several different info-items "competing" into the limited working memory focus that hampers processing of relevant information [11]. Thus, for low-capacity students, social noise (induced by group discussions that can distract one's own mental acts) while he/she tries to concentrate only on task-appropriate info-elements [17] can be felt much harder compared to high-capacity profile students who have an advantage to resist distraction in their group-work (expressed also by their own words on group work as a rather positive experience). Resisting distractions, however, is fundamental in order to avoid attentional "capture" by an irrelevant disturbance [11]. Therefore, the interaction between the working memory and executive control (to sequentially relate info-items to make sense) becomes especially evident [30,38]. This, however, is restricted when working memory is being used to search for sub-solutions thus cannot be used for other functions [19]. This also explains the aspect that there are no resources left to contribute to the group work because individually lower cognitive capacity restricts one's own processing in SDL [7]. Thus, although it has been suggested to share the cognitive load in a group-work [15], which certainly has some benefits for many students, communication itself (within the group) can be exhausting for other learners, especially for low-capacity students, because it may interrupt their individual processing [35]. Hence, learners with more efficient resistance towards irrelevant (or inhibition of automatic response) are better at solving complex tasks [17]. While those with poor attentional control are thus also weaker in processing [31] and in switching between sub-tasks and rules [7], which directly constrains their entire SDL progress [24]. Based on this, it can be concluded that H2 (Group-work can be perceived differently based on participants' individual cognitive executive skills) was confirmed.

Our third finding that girls highlighted "Working in a group helped me understand the topic better" and disagreed with "I could have done better on my own with the assignments" also relates to prior findings. Girls (who in general are better at tasks previously practiced) often do not perform so well in novel situations requiring unconventional skills and/or a new (not practiced earlier, as it accompanies the SDL context) format [37]. Therefore, learning together with others and receiving feedback from group mates increases one's feelings of relatedness, which is found to be more important for girls than for boys [8]. The latter additionally confirms our findings mentioned above: as females, in general, prefer to learn in a collaborative environment, social support through their interaction

with peers seems to be more important for girls, which is found to be not so important for boys [37]. This indicates that, as girls seemingly needed the support offered by the group more than boys, nearly all of them (90%) according to their own words also had good cooperation with their group-mates (compared to boys) revealed by our control question outcome. It can be concluded that H3 (Reflections on the group work will reveal gender differences) was confirmed.

To sum up, although SDL is an increasingly needed educational approach, and group-work is recommended as a beneficial format [15], our results clearly show that not all group members always benefit at a similar level, as the efficient interplay between the working memory and executive attention that facilitates resisting distractions [17] largely varies among school-age students [12]. Therefore, especially within the SDL paradigm that induces a heightened cognitive load, when learners deal with novel information, we cannot ignore the importance of younger students' (compared to adults) not yet fully mature executive attention [7,27] and the limits of their working memory [42]. Consequently, in order to enhance personal growth and prepare for life-long learning as the ultimate aim of SDL, education in its holistic meaning needs to connect both: the findings of constructivism as well as cognitive and developmental psychology to relate together important aspects of young students' SDL [43]. Only in this way autonomous learners can realize their potential that is required to perform in SDL [2].

From the novelty side, we contribute through the aspect that in addition to measuring the experiment variables, we also asked participants' own experience with their group work. This gives a broader overview of the SDL that is one of the 21st-century educational aims [3,13,44]. In line with prior work, our findings are also important considering the current global pandemic situation, which (a) requires additional precautions (to avoid possible infections in classrooms) and therefore (b) increasingly the SDL approach. Yet, in its implementation, it is nevertheless highly important to ensure the quality of all students' learning outcomes, despite the different learning settings and also the students' different individual capabilities. Therefore, all the fine-grained details of the autonomous learning to keep the school-students' motivation (not overburdening them with too high cognitive load), helping them to become critically thinking citizens able to make sense as of learning, as well as the world around them [2] should be studied further, considering the normal developmental restrictions of the young learners and possible individual differences in their prerequisites for SDL.

Limitations

On the negative side, we had to leave out many participants who did not complete all the sub-tasks of the experiment. As the whole experiment consisted of several subtasks, the participants could get tired, which also could influence their answers. The latter can additionally be related to the complexity of the multitasking situation (to keep in mind several sub-items to complete the entire assignment) that accompanies SDL (e.g., "don't forget to add the code you created to every sub-task"; "follow the learning path"; "find the answers"; "gather data"; "come back into the classroom on time and make your conclusion"). If we could involve a larger sample size, our results probably would also show stronger results. The latter refers to the need to research further the aspects described in this work more

deeply to broaden our understanding of SDL.

Conclusion

This work indicates that there exist remarkable differences in school-age learners' capability in managing complex tasks accompanying the SDL approach. In light that SDL is an increasingly used trend in schools, its content regarding multi-level cognition has so far been handled little from the school-age learner's not fully matured yet perspective. This work explored the SDL, its small-group format aspects, and complex learning components in general through the lens of developmental psychology. In line with prior studies, our work confirms the crucial aspects in this: unequal cognitive executive skills among school-age learners (needed in heightened cognitive load accompanying SDL, compared to conventional methods), and gender differences. Based on those outcomes, how to enhance the SDL approach without overburdening school-age students but rather scaffolding their fundamental skills and metacognitive strategies required for quality SDL - usable across life-long learning to adapt, cope and flexibly reorient in the rapidly changing circumstances - remains an open question to be studied further.

Declaration

Informed consent was obtained: All procedures performed in this study were in accordance with the ethical standards of the institutional research committee of Estonia and Tallinn University. The privacy rights were carefully followed, no harm caused, no additional accompanying aspects observed. We have no conflicts of interest to disclose.

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