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**Integrating ICT in Science Classes: Is it Effective?**

**Abstract**

Many countries integrate Information and Communication Technology (ICT) in classes as a means to improve learning, advance digital literacy, and increase student achievement. However, research on the academic effectiveness of these programs is still developing. This study analyses the effectiveness of integrating ICT in learning in terms of students’ motivation, sense of self-efficacy, achievement, and collaboration, in fifth-grade science classes in Israel. The sample consisted of 145 students from two Arabic-speaking public elementary schools characterized as low-SES schools. The treatment and control group comprised 88 and 57 students, respectively. The research method was quasi-experimental. Measurements were collected before and after the implementation of the ICT program, and pre- and post-level differences between the treatment and control group were assessed using the difference-in-differences (DID) method. The results of the effectiveness analysis show a larger incremental trend in achievement and a higher level of collaboration among students in the treatment group compared to their counterparts in the control group. Changes in student motivation and self-efficacy were not statistically significant. The contribution of this study lies in the development of an effectiveness analysis that may contribute to improved performance among disadvantaged minority students and to the development of their collaboration skills.

Keywords: ICT, Science education, Effectiveness, Difference-in-differences (DID), Public elementary schools, Low-SES schools, Student achievement.

**Introduction**

The information age highlights the importance of information and knowledge in all aspects of life (Resnick 2002). Accordingly, education has moved to adopt innovative methods of teaching and learning in a computerized environment, with the aim of equipping students with the 21st-century competences they require (Pedró 2006; Zohar 2011). Following this trend, many countries in the world use Information and Communications Technology (ICT) in class, both as a tool to improve student achievement and to promote digital literacy as an end in itself (Livingstone 2012).

Many Western countries are seeing a growing trend of integrating ICT in classes, which is seen a powerful tool for innovation in education. Proper use of ICT can improve the quality of learning and connect it to real-life situations experienced by learners (Fu 2013). Integrating ICT in teaching and learning has several advantages. First, the use of ICT offers additional opportunities for developing critical thinking skills. Second, it can improve the quality of learning and teaching and support teaching by providing access to learning content (Fu 2013). Finally, using ICT can support learner-centered and self-directed learning (Sanchez & Aleman 2011) in offering a creative learning environment (Chai, Koh, & Tsai 2010).

Previous research has in the integration of ICT in science classes to be effective (Kubiatko 2010; Kubiatko & Vlckova 2010; Ziden, Ismail, Spian, & Kumutha 2011), indicating that ICT use improves science learning from an early age (Kubiatko, 2010). Additionally, integrating ICT in science classes at the primary school level was shown to improve students’ attitudes toward learning science and contributed to improved student achievement (Spiezia 2010; Ziden et al. 2010; Ziden et al. 2011).

Using ICT helps students develop new problem-solving strategies, especially in science classes, and affords them the opportunity to complete tasks at a higher level of complexity. Relatedly, studying science requires high-order abstract thinking ability, which the use of ICT allows students to develop, while also encouraging them to learn through discussion to meet the challenges of understanding new material (Kubiatko & Vlckova 2010; Oldham 2003). The use of technology assists in illustrating and simulating abstract subjects whose teaching would otherwise require scarce and expensive equipment such as microscopes and telescopes.

There are several parameters by which the effectiveness of integrating ICT in education can be measured. Fu (2013) highlights four such parameters: (1) student motivation, (2) student collaboration, (3) student self-efficacy, and (4) academic achievement. We examined these four parameters using data from students enrolled in Arabic-speaking public schools in Israel. In Israel, public schools in which the curriculum is taught in Arabic are marked by lower levels of achievement as compared to Hebrew-speaking schools (Abo Asba 2007).

**Literature Review**

***Integrating ICT in class***

ICT integration includes the use of computers, the internet, and other media such as radio and television. In many Western countries ICT is widely used in education (Fu 2013; Livingstone 2012; Sanchez & Aleman 2011), and its integration in education keeps expanding (Fu 2013). The increasing use of ICT in teaching reflects a change in the perception of learning, which is no longer seen as a passive reception of knowledge from the teacher, but as an ongoing, lifelong activity in which learners seek knowledge—and over time, they seek it from new sources. Therefore, using ICT in school supports this lifelong learning process (Fu 2013).

 Integrating ICT in the learning process has several benefits. First, it may assist students in accessing digital information efficiently and effectively and promote shared and distance learning. Second, it offers more opportunities for developing critical thinking. Using ICT in teaching can improve the quality of learning and support teaching by providing access to learning content (Fu 2013). Third, using ICT in teaching can support learner-centered and self-directed learning (Sanchez & Aleman 2011) and afford a creative learning environment (Chai, Koh, & Tsai 2010). However, the mere use of ICT in teaching does not guarantee all these advantages: it is likely more beneficial when integrated with a relevant pedagogy. Furthermore, the integration of ICT in class may also have a negative impact on learning (Martinovic & Zhang 2012). For example, a teacher with poor ICT skills might not further students’ learning by integrating ICT. Another scenario concerns the personal aspects of teaching and learning: if the use of ICT replaces the teacher-student relationship, the student might perceive a lack of feedback from the teacher, which may not only make it more difficult to understand the material but also damage the student’s self-confidence (Fu, 2013).

***Integrating ICT in science class***

Previous research has found integrating ICT in science classes to be effective (Kubiatko 2010; Kubiatko & Vlckova 2010; Ziden, Ismail, Spian & Kumutha 2011; Zucker, Tinker, Staudt, Mansfield, & Metcalf 2008). Specifically, the use of ICT has increased high school students’ interest in science. Similar findings were reported for elementary schools. In a study comparing an experimental group that studied science using ICT with a control group that studied science using traditional means only, ICT use not only improved students’ attitudes towards the material taught and science in general, but also improved their achievement (Ziden et al. 2011; Zuker et al. 2008). According to Spiezia (2011), while ICT programs in science teaching have been found to be effective at positively influencing student achievement and scientific literacy in many countries, research has not placed sufficient emphasis on understanding students’ use of computers at home, a variable that has been found to significantly impact student achievement in the sciences.

***Measuring the effectiveness of integrating ICT in class***

The literature points out that ICT integration is effective in terms of (1) student motivation, (2) student collaboration, (3) student self-efficacy, and (4) academic achievement (Fu 2013). Using ICT in education in general, and at a young age in particular, contributes to increasing student motivation (Livingstone 2012). Additionally, integrating online learning with face-to-face learning widens students’ opportunities for collaboration, and increases their willingness to connect with other students (Anastasiades et al. 2010). The use of ICT in teaching contributes to students’ sense of self-efficacy, especially regarding the use of computers (Celik & Yesilyurt 2013). Finally, the use of ICT contributes to improving academic achievement, especially in science (Ziden et al. 2010).

***The Israeli context***

In Israel two local initiatives integrate ICT in science classes: the “A Laptop for Every Student Project” and the “Classroom Computer Student and Teacher Project.” As part of these initiatives, science teaching is conducted through animation videos. For example, videos are used to teach "Earth and the Universe" in elementary school, and "Materials and Their Properties" in middle school (Klein 2011).

 While research on the effectiveness of ICT integration in science classes in Israel is scarce, studies on integrating ICT in class in general (with no focus on science) are more numerous (Brands & Strauss 2013). In a study examining high school teachers’ and students’ attitudes toward a program teaching biology using computers in Israel, both teachers and students identified with the program’s goals for integrating ICT into life science teaching. Many of them were aware of the added value ​​they received from the program, but at the same time pointed out the unique effort and investment required (Shemesh et al. 2008).

Although many initiatives at both the national and local level have been implemented to promote ICT integration in class, the incorporation of new technologies into the education system has not kept pace with technological developments. Also, the current gap between the possibilities afforded by ICT and its actual uses is large, and the state of the infrastructure and students’ levels of access to computers and the internet are still very limited (Vorgan 2010). Due to this gap, some of the goals of ICT integration in class are not realized (Brands & Strauss 2013). For example, one of the purposes of teaching with ICT is to bring the school “closer” to the students in terms of their everyday experience: while students are exposed to advanced technologies outside of school, most schools in the country use a traditional pedagogy that does not include the technological means the student is accustomed to. This leads to school being perceived by the students as distant from their everyday lives in a way that impairs their motivation for and interest in school learning. In this context, a representative survey by the Center for Educational Technology revealed that at home, students use computers primarily for games and communication with friends; computer use for educational purposes remains largely limited to searching and writing (Brandes & Strauss 2013).

 Despite these challenges, research based on classroom observations suggests that integrating laptops in class may contribute to the adoption of innovative pedagogies, since the practice may advance skills regarded as crucial to the 21st century such as collaborative learning (Manny-Ican, Berger-Tikochinsky, & Bashan 2013). In a more recent study, Getz and Goldberg (2016) found that since Vorgan’s (2010) study, the situation in Israel has improved with regard to the integration of instructional ICT, partly because of the implementation of the 21st-Century Education Adjustment Program and the activities of the "Thought Center,” which was founded to support computer teachers in Israel (Getz & Goldberg 2016). However, despite this improvement, Nir et al. (2016) report that the changes have put a lot of pressure to fulfill technological requirements on teachers and administrators. Specifically, due to the large effort invested in dealing with technology, teachers are reported to lack time for significant in-person teaching.

The objective of this study is to assess the effectiveness (in terms of motivation, self-efficacy, achievement, and collaboration) of the ICT program implemented as part of fifth-grade science classes in Arabic-speaking public schools in Israel.

The following research questions are addressed:

1. Is the change in motivation level greater in the students on the ICT program than in their counterparts on the traditional program?
2. Is the change in the level of self-efficacy greater in the students on the ICT program than in their peers on the traditional program?
3. Is the change in achievement greater in the students on the ICT program than in their peers on the traditional program?
4. Are there differences in the level of collaboration between the students studying on the ICT program and their peers on the traditional program?

Based on the literature review, our hypotheses are the following:

1. Studying on the ICT program will improve motivation, self-efficacy, student achievement and collaboration among students in the experimental group.
2. The improvement will be significantly greater among students in the experimental group than among those in the control group.

**Methods**

***Study variables***

***--insert Table 1 here--***

***Research design***

The present study uses a mixed-method paradigm: the quantitative part is intended to test the research hypotheses, while the qualitative part aims to validate the quantitative findings as well as examine variables that are hard to quantify, such as the degree of student collaboration in class.

In the quantitative part, the research design is quasi-experimental: pre- and post-measurements were carried out in an experimental group (students studying on the ICT program) and a control group (students studying on a traditional, non-ICT program); however, the experimental conditions could not be assigned randomly. A quasi-experimental setup was chosen because it allows us to measure the effect of the intervention (in this case, integrating ICT in science classes) on an experimental group as compared to a control group. It was not possible to implement a true experimental setup, as we had no control over which schools chose to implement the ICT program; thus the assignment of students to groups could not be randomized. In this situation, using the difference-in-differences (DID) method is appropriate (see below, Angrist & Pischke 2008). Both student groups were assessed at two points in time: in the experimental group, the first measurement was conducted prior to the implementation of the ICT program, and the second one a year into the program. The control group was assessed at the same interval.

The qualitative part comprised six structured classroom observations: three observations of science classes on the ICT program and three corresponding observations at the non-computerized school.

***Intervention***

Students at both schools studied the same science curriculum, which was delivered using different teaching methods (ICT vs. traditional). The computerized school had joined the ICT program five years prior. A computer-based program for teaching 5th-grade science was developed, comprising about 35 lessons taught over the course of an academic year. Each week one such lesson was held in a special computer room with digital tools; a second weekly science lesson was held in a regular classroom with laptops. Two talented science teachers with experience in ICT-facilitated teaching delivered the program using advanced digital tools. Students received instructions for learning activities at the beginning of each class, which included collaborative lessons (group learning). The teachers and other observers appreciated the group collaboration between the students.

While the 5th-graders at the non-computerized school studied the same content, most of the lessons were delivered using textbooks and regular lab activities prepared by the teacher. Group learning lessons were also held without the incorporation of digital tools. Occasionally the teacher used computers and other technical tools as teaching supports; however, the equipment was far more limited than that used at the experimental group’s school.

About the lesson plans that took place in the intervention of the experimental group that studied science through ICT.

 ***Designs demonstrate learning in the experimental group:***

***Participants***

The sample consisted of 57 fifth-graders from a school that operates a non-ICT program, and 88 fifth-graders from a school that joined the ICT program, giving a total of 145 students. Both schools are located in the same geographic area and classified as Arabic-speaking public schools. The school from which we recruited the control group is the only elementary school in the area that at the time of the study had not entered the ICT program; it was selected because it closely resembles the ICT-integrated school with respect to other characteristics (such as geographical area, socioeconomic status, heterogeneous level of achievement). The classes constituting the sample were heterogeneous and included students with special educational needs and learning disabilities. The control group comprised 28 girls (49%) and 29 boys (51%), which was representative of the student population in this school.

This population was selected because so far there are only few studies of ICT programs in Arabic-speaking public schools in Israel (Nachmias et al. 2010). In addition, education in Arabic-speaking public schools suffers from many difficulties, including severe resource limitations (Abu-Asaba, 2007), so studies that may contribute to the evaluation of cost-effectiveness are of particular importance.

The schools were selected in a convenience sample. This sampling method is not probabilistic and therefore reduces the external validity of the study. However, the statistical method used in the present study (DID) makes it possible to isolate the effect of the program.

***Tools***

In order to examine the research hypotheses on (1) motivation, (2) self-efficacy, and (3) achievement, data sets were collected using two questionnaires and one achievement test, respectively. The questionnaires and test were administered at the beginning and end of the academic year by the science teachers.

*Student motivation questionnaire*

The Personal Achievement Goal Orientation (PAGO) scale by Midgley et al. (1998) was used to measure student motivation. The questionnaire comprises 24 items rated on a 5-point Likert scale ranging from “strongly disagree” to “strongly agree.” The questionnaire helps assess the motivations or goals that students adopt when dealing with their assignments. The internal consistency of the questionnaire as determined in previous studies ranged from 0.71 to 0.80 (Midgley et al. 1998); in the present study, it was 0.66. The score was calculated by averaging over all questions answered by the respondent. The questionnaire was translated into Arabic by teachers proficient at translation and tested by two other teachers to verify the accuracy of the language. In addition, confirmatory factor analysis (CFA) with adjustment was carried out, yielding a comparative fit index (CFI) of 0.968.

*Self-efficacy questionnaire*

To test the students’ sense of self-efficacy, we used the scale developed by Chen and Gully (1997). The questionnaire comprises 14 items rated on a 5-point Likert scale ranging from “Not at all describing me” to “Describing me to a great extent.” Various studies have confirmed its high content and predictive validity (Chen et al. 2001), finding an alpha coefficient of over .90 (Chen & Gully 1997). Reliability in the present study was 0.84, again averaging over all questions to which the respondent replied. The questionnaire was translated into Arabic by teachers versed in translation and tested by two teachers to verify the accuracy of the language. In addition, CFA with adjustment was again performed, yielding a CFI of 0.906.

*Science achievement test*

A structured achievement test was developed for the purposes of this study by a science-based steering team. It included knowledge and comprehension questions on science subjects taught in school, and was validated by a content table featuring all test items, including a weight and level for each item. The test was translated and administered to the students in Arabic. When checking for reliability in terms of internal traceability, we obtained a .86 correlation between the two halves of the test. To calculate the final reliability value, a correction according to the Spearman-Brown formula was performed, yielding a .92 correlation.

*Structured* *observation to assess student collaboration*

We used structured observation to examine the research hypothesis on (4) student collaboration during the students’ preparation of a final product in group work. The observations were conducted with a checklist compiled by Wadawi (2013) and found to be cross-validated with other research methods, such as interviews with students and teachers (Wdmani 2012). Collaboration was evaluated using three observations each at the computerized and non-computerized school, respectively. In each instance, notes on the checklist were taken by the researcher and two additional observers from the science team to ensure the reliability of the data. Observations were carried out three times over the course of the study, and at the end of each observation the researcher and the two other observers cross-commented on each criterion included in the structured observation.

***Quantitative data analysis***

The statistical analysis was performed using the DID method, in which the effect of a particular policy (in this case, the integration of ICT in science teaching) is calculated by estimating the relationships between the dependent and independent variables and comparing the average change in the experimental group with the average change in the control group at two corresponding time points (before and after the intervention). This calculation is performed using multiple linear regression analyses, where the dependent variable is the measured variable (e.g., the level of achievement), and the explanatory variables are the intervention (i.e., ICT-integrated vs. traditional learning), the time (before and after learning), and the interaction between intervention and time. The significance of the interaction indicates whether the difference in differences between groups is statistically significant (Card & Krueger 1994).

***Qualitative data analysis***

This study used the phenomenographic approach (Marton 1986) to analyze data and classify concepts based on an ongoing comparison and search for similarity, variation, and complementarity between the two. The approach is based on the collection of descriptions, sentences, statements, ideas, thoughts, and experiences during fieldwork. Analysis starts with the identification of common features and patterns in the data collected, on the basis of which preliminary conceptual categories are formed. After “refining” the categories and determining their hierarchy, criteria for including a data point in each category are developed. In the present study, descriptions of the three observations by all observers were mined for similarities. Shared and similar descriptions of each category were summarized in the checklist table.

**Results**

This section presents the analysis of the three regression models for the variables (1) motivation, (2) self-efficacy, and (3) achievement, and the observation analysis for the (4) collaboration variable.

**Hypothesis Testing**

**(1) Motivation.** To examine the effect of the learning method (ICT-integrated learning vs. traditional learning) on the dependent variables, the mean and standard deviations of the students’ levels of motivation were calculated, as presented in Table 2 and Fig. 1.

--Insert Table 2 here—

--Insert Fig. 1 here--

Table 2 and Fig. 1 show that the average motivation ratings in the experimental group before and after the intervention were 2.28 and 2.26, respectively; we see a minimal decrease in motivation between the first and second measurement. For the control group, the means were 2.23 and 2.24, respectively, indicating a minimal increase in motivation between the first and second measurement.

To test the first hypothesis, expecting a greater increase in motivation among fifth-graders at Arabic speaking public schools with ICT integration in science classes compared to that among their peers studying in the traditional manner, the following DID equation was formulated (**Eq. 1**):

$$M(i)=a+β\_{1}C+β\_{2}T+β\_{3}I+e$$

where *M* is motivation of student *i*; $a$ is the cutter; *β* is the regression coefficient; *C* is the group (treatment/control); *T* is the measurement (motivation before/after); *I* is the interaction (*C × T*); and *e* is the error term. The results of the analysis are presented in Table 3.

--Insert Table 3 here--

Table 3 shows no significant interaction effect, meaning that no significant differences were found between the motivation level of students studying on the ICT program and that of their peers studying on the non-ICT program. Thus the results lead us to reject the first hypothesis: learning with ICT integration does not have a statistically significant effect on student motivation.

**(2) Self-efficacy.** To test the effect of the learning method (ICT-integrated learning vs. traditional learning) on self-efficacy, the means and standard deviations of the students’ levels of self-efficacy were calculated as presented in Table 4 and Fig. 2.

--Insert Table 4 here--

--Insert Fig. 2 here--

Table 4 and Fig. 2 show that the mean self-efficacy scores in the experimental group before and after the intervention were 1.70 and 1.69, respectively, showing a slight decrease in self-efficacy between the first and second measurements. For the control group, the means were 1.67 and 1.71, respectively, showing a slight increase in self-efficacy over this period.

To test the second hypothesis, expecting a greater increase in self-efficacy among students on the ICT program compared to their peers attending the traditional program, the following DID equation was formulated (**Eq. 2**):

$$SE(i)=a+β\_{1}C+β\_{2}T+β\_{3}I+e$$

where *SE* is the self-efficacy of student *i*; $a$ is the cutter; *β* is the regression coefficient; *C* is the group (treatment/control); *T* is the measurement (motivation before/after); *I* is the interaction (*C × T*); and *e* is the error term. The results of the analysis are presented in Table 5.

--Insert Table 5 here--

Table 5 shows that no significant effect was found for the interaction, meaning that no differences were found between the change in self-efficacy of students studying on the ICT program and that of their peers studying on the non-ICT program. That is, learning with ICT integration does not have a statistically significant effect on student self-efficacy. Thus, the findings do not support the second hypothesis.

**(3) Achievement.** To test the effect of the learning method (ICT-integrated learning vs. traditional learning) on achievement, the means and standard deviations of the students’ achievement were calculated as presented in Table 6 and Fig. 3.

--Insert Table 6 here--

--Insert Fig. 3 here--

Table 6 and Fig. 3 show that the average student achievement in the experimental group increased from 61.16 before the intervention to 70.97 after the intervention. For the control group, the respective scores were 69.74 and 71.42, also showing a small increase between measurements.

To test the third hypothesis, which proposes a greater increase in achievement among students on the ICT program compared to their peers attending the traditional program, the following DID equation was formulated (**Eq. 3**):

$$G(i)=a+β\_{1}C+β\_{2}T+β\_{3}I+e$$

where *G* is the grade of student *i*; $a$ is the cutter; *β* is the regression coefficient; *C* is the group (treatment/control); *T* is the measurement (motivation before/after); *I* is the interaction (*C × T*); and *e* is the error term. The results of the analysis are presented in Table 7.

--Insert Table 7 here--

Table 7 shows a statistically significant interaction effect, indicating a significant difference in the change in achievement between programs: the increase in achievement between measurements was higher for students on the ICT program than for those on the traditional program. These findings confirm the third hypothesis, which states that the improvement in achievement will be significantly greater for students on the ICT program than for students at the non-participating school.

**(4) Collaboration.** To test the fourth hypothesis, which proposes a difference between the level of collaboration among students attending the ICT program compared to that found among their peers attending the traditional program, we used a structured observation (Wadawi 2013). Table 8 shows the criteria included in the collaboration checklist and descriptions of all observations conducted by the researcher and the two other observers in the experimental and control groups.

--Insert Table 8 here--

Table 8 shows that the level of collaboration among students enrolled in the ICT-integrated program was high with respect to the following aspects: the level of interest in learning from peers, student trust, encouragement and support among group members, students’ willingness to study in a group, quality of communication between group members, and students’ self-confidence in group learning. An analysis of the observations revealed that a high degree of cooperation was consistently seen across all three observations.

In contrast, observations on the traditional learning program were mixed, suggesting that collaboration between students in the control group was partial and inconsistent. Regarding interest in learning from peers, some observations revealed a high level of interest, whereas others noted interest in learning from peers only in some of the task phases. Concerning student trust, during most observations a trusting atmosphere among students was perceived, but in one observation trust among the students was seen in only some of the groups. In terms of encouragement and support among group members, some of the observations did not see mutual encouragement by the students, while others saw encouragement of only the high-achieving students. Regarding students’ willingness to study in a group, the observations were split between instances in which most of the students expressed a willingness to study in groups, and others in which only some of the students expressed enthusiasm. Regarding communication between group members, two observations reported good communication between most students during the group tasks, whereas one observation noted good communication in only some of the groups. With regard to students’ self-confidence during group work, only some of the students demonstrated self-confidence, especially the high-achieving ones who received encouragement.

These findings confirm the fourth hypothesis: the level of collaboration among fifth-graders at the Arabic-speaking school with ICT-integrated science classes is higher than that found among their peers studying on the traditional program.

**Discussion**

The purpose of this study was to examine the effectiveness of integrating ICT in science classes in Israel. The effectiveness measures were selected to align with the original goals of the ICT program (Brandes & Strauss 2013).

The results of the study show that, contrary to expectations, there were no significant differences between the groups regarding improvement in motivation. These findings are inconsistent with those of Livingstone (2012), who proposes that the use of ICT in education in general, and at an early age in particular, contributes to increasing student motivation, and also with those of Kubiatko (2010), who showed that the use of ICT in science instruction increased students’ interest in the material being studied.

There are two possible explanations for this discrepancy. The first explanation is based on the distinction between the ICT program’s design and its implementation. According to Vorgan (2010), the gap between the possibilities afforded by ICT and its actual use can lead to some of the program goals not being realized (Brandes & Strauss 2013). The actual implementation of the ICT program may not bring out the program’s full potential, and so not increase motivation. According to this explanation, training teachers to deliver a more successful implementation of the program may improve student motivation.

A second possible explanation concerns the premises of the ICT program itself. Due to the technological requirements, the implementation of such a program creates great pressure on teachers and administrators. Specifically, due to the effort invested in managing the technology, teachers do not have time for significant in-person teaching (Nir et al. 2016). According to this explanation, the teachers might have been so occupied with implementing the technology that they had less time left for in-person interactions with the students. Personal contact in teaching is an important factor affecting students’ interest and involvement in class. As a result of the reduction in contact, student motivation could have decreased; on the other hand, this decrease could have been balanced with the increase in motivation that other studies (Livingstone 2012, Kubiatko 2010) associate with the use of ICT, so that in effect no group difference in the change in student motivation was observed.

Regarding student collaboration, the findings agree with previous research that showed ICT-integrated learning combined with face-to-face learning to expand students’ opportunities for ICT application, collaboration and expression, and to increase their willingness to connect with other students (Anastasiades et al. 2010). Also, the study is in line with the findings of Manny-Ican et al. (2013), who showed that using laptops in class promotes collaborative learning in small groups, which in turn supports the application of 21st-century skills. The findings of the present study confirm that the ICT program improved students’ collaborative learning in terms of their interest in learning from peers, student trust, encouragement and support among group members, students’ willingness to study in groups, communication skills among group members, and students’ self-confidence in group learning.

Collaborative learning contributes to improved academic achievement, and ICT supports learning through discussion (Kubiatko & Vlckova 2010). Our observations indicate that ICT use did indeed contribute to learning through discussion, which thus may be one of the factors that significantly improved students’ achievement.

Concerning self-efficacy, the research findings do not align with previous research. While the literature finds a positive relationship between the use of ICT and self-efficacy (Celik & Yesilyurt 2013), our study found no significant differences in self-efficacy. One explanation might again be the gap between the potential of ICT and its actual use (Vorgan 2010), precluding the realization of some of the program’s goals (Brandes & Strauss 2013), including the enhancement of students’ sense of self-efficacy. The second explanation might be inherent in the ICT program. According to Fu (2013), when ICT replaces the teacher-student relationship, the student may receive insufficient teacher feedback; this deficit may make it difficult for the student to understand the material and also impede the development of self-confidence. According to this explanation, when students do not receive the teacher feedback they need in the learning process, even though they may assimilate the material and improve their achievement, they may still not feel confident and therefore not improve their sense of self-efficacy.

On the other hand, our findings are consistent with previous research showing that ICT programs improve student achievement (Kubiatko 2010; Ziden et al. 2011; Zuker et al. 2008) and that ICT integration is effective at improving achievement in science and scientific literacy (Spiezia 2010). The integration of ICT in science classes facilitates the development of new problem-solving strategies and the completion of tasks at a higher level of complexity. Also, science studies require high-order abstract thinking ability, which the use of ICT encourages students to develop (Kubiatko & Vlckova 2010). ICT use also helps illustrate abstract material and simulate subjects which would otherwise require scarce and expensive equipment (e.g., microscopes, telescopes, etc.) to demonstrate (Oldham 2003). Engagement with ICT supports science teaching by encouraging divergent and multidimensional thinking and facilitating the visual representation of complex phenomena (Klein 2011).

In line with these explanations, it is not surprising that the present study, like previous research, finds that the ICT program improves students’ achievement in the sciences. In addition, apart from enhancing students’ ability to understand abstract subjects, improving scientific literacy, and supporting students’ high-order thinking ability, we found that ICT may also improve students’ achievement via increased collaboration.

***Limitations and further research***

This study has several limitations. First, the assignment of students into control and treatment groups was not randomized; thus selection bias might blur our findings. Second, the school sample was not random, which might affect the effectiveness of ICT integration observed. Both factors limit the generalizability of these results. Third, the study examined student achievement in general, without looking at specific aspects of knowledge and comprehension; future research should test the effect of the ICT program on more specific aspects of students’ skills. Fourth, since the study compared the ICT program only to a traditional program, it could not evaluate its effectiveness compared to other types of non-traditional programs. Fifth, while computer literacy was not measured, it may also have affected the research findings; future research should examine and control for computer literacy. In addition, the two groups were taught by different teachers; for future research a design deploying the same teachers is recommended, so that only the teaching method is variable. Future studies in other countries that have minority populations suffering from educational resource constraints could benefit from the findings of this study.

**Declarations**

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**Conflict of Interest:** The authors declare that they have no conflict of interest.

**Availability of data and material:**(data transparency)

**Code availability:**Not applicable

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