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# The influence of educational information visualization trends in higher education for students in the Russian Federation

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The establishment of scientific foundations for the integration of information technologies and innovative educational processes in student learning activities entails the necessity of creating a basis for transitioning from information processes to information technologies. The research aims to study the effectiveness of innovative information technologies in higher education and assess student involvement in using innovative information technologies. The study relies on the experimental survey method to assess respondents' involvement in the use of innovative information technologies. In addition, the modeling method was used to increase students' motivation to study through visualization and other modern technologies. A training program based on visualization and innovative information technologies aimed to study their impact on the teaching process in higher education was developed. The study results show that visualization technologies improve students' intrinsic motivation to learn. The practical significance and further research prospects are due to the possibility of applying the training program developed in the study in higher education. The program can also become the basis for developing new training programs to study other subjects as it is not tied to studying a certain discipline and requires only computer skills.

KEYWORDS

information technologies, law, mathematics, motivation, visualization

#### 1. Introduction

Visual information is perceived faster and more directly, as evidenced by the trend toward the mass use of infographics and data visualization tools in pedagogical technologies (Velichová, 2018). Mathematics in higher education is increasingly often taught based on the STEM methodology, which involves direct participation in experiments, gaining knowledge through personal experiments, and solving real problems (Mystakidis et al., 2022). Occasionally, a dearth of laboratories and apparatuses hampers the complete realization of this pedagogical approach. In this case, visualization can be used as follows: pre-made infographics on the topic being studied; machine visualization and 3D modeling of mathematical models, phenomena, formulas, and educational materials in the form of videos and three-dimensional cartoons (a higher level of

memorization and understanding); students can perform tasks aimed at the visualization of educational materials (Aldalalah et al., 2019).

Innovative information technologies that can be used in the learning process are three-dimensional visualization and animation, the ability to view educational materials on mobile devices and online learning platforms that are widely used in universities and colleges, visual presentations made by students, etc. Today schoolchildren are characterized by clip thinking. Consequently, individuals tend to experience greater ease in assimilating information when it is presented visually, such as through diagrams, tables, videos, or audio recordings. These allow the presentation of educational materials graphically, which contributes to students' creative thinking development (Nardi, 2014; McLachlan and Webley, 2021). The possibilities of using symbols and diagrams to teach mathematics have also been studied (Presmeg, 2020).

Visualization technologies are also commonly used in law studies (McLachlan and Webley, 2021). For example, the effectiveness is characterized by the use of contract comics in law teaching, which visualizes laws. Information technologies make it possible to focus on the individual approach and ensure the variability of the educational process (Maharg, 2016). Individualized learning, implemented with the help of a computer, takes into account each student's knowledge and tracks their academic performance. The interactive and innovative nature of this training promotes contact between a teacher and a student while improving information perception and cognition skills.

The pandemic has intensified the use of information technologies in education (Dwivedi et al., 2020). Distance learning was implemented with the help of special software that allows theoretical material visualization through screen sharing (Schneider and Council, 2021). As an illustration, Google Classroom facilitates the establishment of a virtual educational environment, wherein each subject can be taught individually, granting access to both teachers and students (Ramadhani et al., 2019). The Google Classroom platform offers functionalities enabling instructors to upload educational resources, pre-recorded videos, audio tracks, and design assessments. Nevertheless, it should be noted that this platform falls short of providing a comprehensive video-based solution. Another group of online learning platforms (Zoom, Skype, and Google\_Meet) has an advantage in the context of educational material visualization through presentations and online classes (Katz and Kedem-Yemini, 2021). There are also online learning platforms (Coursera and edX) that offer various online courses and can be used to visualize theoretical materials (Mutiga and Hullinger, 2021). For example, when teaching mathematics, the Desmos application is used. This is a graphical calculator for calculating data, and drawing pictures (Liang, 2016; King, 2017). Also, the 01math platform hosts tasks of various complexity levels while adapting to students' knowledge. Thus, the platform advantage is the focus on personalized learning (Hosseini et al., 2021). The Moose Math application is aimed at improving practical mathematical skills, which makes it possible to study mathematics in a playful way (Laato et al., 2020).

In the educational process, visualization contributes to the development of professional competencies and technical skills, as well as memory, imagination, understanding, and critical and strategic thinking (Wang et al., 2019). Modern trends in higher education institutions (HEIs) are associated with providing students with teaching methods that can lead to skills development and foster their creative and individual thinking (Akhmedov, 2022). Simultaneously,

educators should be knowledgeable about innovations in communication and information technologies, which can be subsequently utilized in various research areas. Concurrently, the implementation of new technologies in course delivery grants HEIs competitive advantages.

The primary challenge of implementing innovative information technologies is the financial constraints and limited government support for higher education institutions. These factors have led to the search for innovative means of survival and attracting new students to the classroom as potential users (Szymkowiak et al., 2021). The integration of innovative communication technologies utilizing ICT through computers, mobile phones, and telephone lines for access and management of electronic data on the Internet enables active student engagement in the learning process, provides lifelong learning opportunities, and grants a competitive advantage to institutions that have not fully realized the possibilities offered (Castro and Tumibay, 2021). Higher education institutions have the potential to incorporate ICT for effective communication and promotion of their services, aiming to attract both current and prospective audiences. Additionally, integrating innovative technologies enables these institutions to provide cutting-edge tools and resources for their educational processes (Miranda et al., 2021). While virtual and online learning experiences cannot fully replace the benefits of physical engagement, they can greatly enhance the overall learning journey. To foster a culture of innovation in higher education, it is crucial for institutional leadership and organizational structures to actively support and encourage such initiatives (Susilawati et al., 2021). However, upon reviewing the existing literature, it becomes evident that there is a scarcity of studies examining the effectiveness of innovative information technologies, particularly in visualization, within the domains of mathematics, pedagogy, and legal sciences in higher education. Future research endeavors are anticipated to provide deeper insights into this subject matter, addressing existing gaps and enhancing our understanding of its broader implications.

#### 1.1. Literature review

The rapid development of science and technology and the pandemic require the use of modern teaching methods and approaches. In particular, this relates to mathematics education (Bray and Tangney, 2017). Traditional methods (writing notes and learning textbook paragraphs, followed by their retelling) have become outdated and lost their effectiveness in modern realities. Today, visualization and innovative information technologies are being updated. They make it possible to present educational materials as widely as possible and to visualize them to facilitate students' learning (Martín-Gutiérrez et al., 2017). Applications such as Zoom, Discord, WC Online, Blackboard Collaborate Ultra, GoBoard, Google Hangouts, Skype, Penji, and BrainCert (Johns and Mills, 2021) are used to teach several disciplines online. The advantages of online learning encompass multiple facets, including the opportunity for learners to revisit lectures on multiple occasions, a concentrated emphasis on the cultivation of practical skills, and the utilization of visual aids to enhance the comprehension and assimilation of educational materials. Modern online learning platforms used in higher education combine education management systems and applications such as Moodle, Blackboard, Canvas, Brightspace, and

others. Thus, the educational material can be presented in the form of text, graphics, and video (Trenholm and Peschke, 2020).

Researchers from Bangladesh proposed the use of the flipped classroom method. According to this approach, theoretical material is studied as homework, while classroom classes are aimed at the practical application of the knowledge gained (Al Mamun et al., 2022). The flipped classroom model is also considered in the context of the Massive Open Online Courses (MOOCs) platform, which hosts online learning courses (Wang and Zhu, 2019). The advantage of both models is their focus on practice, the availability of an online assessment, and the possibility of uploading video and audio content. Vietnamese researchers highlight the impact of the Industry 4.0 model on higher education, which ensures its informatization, digitalization, and expansion of functionality (Tri et al., 2021).

Researchers point to the effectiveness of virtual reality in learning by implementing an interdisciplinary approach in the context of the Science, Technology, Engineering, and Mathematics (STEM) model (Mystakidis et al., 2022). The STEM model is distinguished by its exploration of subjects across four distinct knowledge domains accompanied by the cultivation of professional skills and competencies encompassing critical thinking, academic proficiency, and other relevant attributes (Loyalka et al., 2021). Regarding STEM education, the examination of mathematics through an experimental framework is given due consideration (Maass et al., 2019). Moreover, this study examines the utilization of animation, drawings, and videos as instructional aids in university-level subjects, emphasizing the imperative to integrate contemporary technologies, particularly visualization, into the learning process (Salim and Tiawa, 2015). STEM education makes it possible to improve mathematical literacy, technological pedagogical knowledge, and mathematical thinking skills (Yıldırım and Sidekli, 2018). An illustrative instance is the Geogebra application, renowned for its remarkable efficacy in facilitating the study of mathematics. The software allows users to design 3D drawings without using rulers and compasses (Celen, 2020). The SimReal+ interactive application is designed to visualize educational materials with the help of drawings, animations, diagrams, and other interactive technologies (Hadjerrouit and Gautestad, 2019). In addition, the SimReal+ application contains a graphical calculator, video tutorials, broadcasting capabilities, and video and interactive simulations for teaching mathematics (Hadjerrouit, 2017).

Artificial intelligence (AI) is used to visualize theoretical material (Yu, 2020) in higher education. This contributes to the expansion of teaching methods taking into account an individual approach to each student's knowledge level and the use of information technology (Surden, 2019; Hwang and Tu, 2021). Chinese researchers have developed an education system based on the VisMis visualization platform (Zhu et al., 2018). Researchers from Colombia have studied the features of using visualization in teaching gifted students in the 3D computer environment (Benedicto et al., 2015).

Researchers from Norway have studied the possibilities of artificial intelligence and emotional intelligence technologies in legal education (Carrel, 2019). The findings demonstrate that information technologies play a dual role, not only aiding students in comprehending laws but also significantly enhancing their professional competencies and skills, particularly in the realms of decision-making and problem-solving. It is highlighted that visualization increases students' motivation to learn. Additionally, it facilitates the rapid acquisition of theoretical knowledge and fosters a dynamic interplay between theory and practice, prioritizing the practical application of the acquired information. The advantages of the training course are an adequate pace of work, simplicity, interaction, etc. Researchers from Israel have considered visualization effectiveness in mathematics in the context of self-efficacy and problem-solving skills (Kohen et al., 2022).

#### 1.2. Problem statement

The article aims to study the effectiveness of innovative information technologies, in particular visualization, for teaching mathematics, pedagogical education, and legal sciences in higher education. The study objectives are as follows: based on a survey, our aim was to identify students' involvement in innovative information technologies, to compare indicators among students of 1–3 years of study, analyze students' motivation to study and the impact of visualization on increasing motivation, and to develop a training program based on innovative information technologies.

## 2. Methods and materials

#### 2.1. Sample

The study involved 62 students from three educational institutions: Kazan Federal University (Elabuga, Russia), Financial University under the Government of the Russian Federation, and a teacher training college located in Israel (Kfar Saba) (a total of 186 students). The sample was formed through a random selection process, taking into account the stipulated criteria of equal representation among male and female participants, as well as individuals from the 1st, 2nd, and 3rd year of study from each respective university Students were selected at random and invited to participate. In the event of refusal, an offer was extended to other students, following a similar random sampling procedure. This process was repeated until the sample was fully formed. If we consider the total number of students in each university and college across the 1-3 years of study, the acceptable sampling error should not exceed p = 4.87. In other words, as long as the sample falls within these limits, it can be deemed representative of the study.

#### 2.2. Intervention

There were three stages in the study. In the first stage, a training program "Innovative information technologies in Education" was developed (Figure 1). The course "Innovation and Information Technologies in the Learning Process" was exclusively undertaken by participants assigned to the experimental group. The only requirement was computer skills, as during the training program development, the emphasis was not on the subject the students studied but on teaching innovative information technologies.

The training course consisted of the thematic module "Innovative and information technologies" divided into classes aimed at familiarizing students with modern technologies, developing professional competencies, and increasing motivation to learn (Table 1). To partake in the training program, respondents



TABLE 1 Content of the training program based on innovative information technologies.

Thematic module	Thematic module components	Tasks	Resources used
"Innovative information technologies in the learning process"	<ul> <li>Innovative and information technologies:</li> <li>visualization</li> <li>online whiteboard</li> <li>desktop computers and laptops</li> <li>projectors</li> <li>3D printing</li> <li>emotional intelligence</li> <li>artificial intelligence</li> <li>virtual reality</li> </ul>	<ul> <li>Forming the skill of working with modern technologies in the learning process;</li> <li>Increasing motivation to learn</li> </ul>	<ul> <li>Computer with Internet access, headphones, and interactive whiteboards</li> <li>"Data Analysis with Python" on the Coursera platform (Coursera, 2021b)</li> <li>"Introduction to Mathematical Thinking" on the Coursera platform (Coursera, 2021c)</li> <li>"Handbook of Research on Barriers for Teaching 21st-Century Competencies and the Impact of Digitalization" (Dhir, 2021)</li> <li>"Emotional Intelligence" (Goleman, 2020)</li> <li>"Artificial Intelligence for all" on the Coursera platform (Coursera, 2021a)</li> <li>"Virtual Reality" on the Coursera platform (Coursera, 2021d)</li> </ul>

merely required access to a computer to view educational materials and videos and utilize learning platforms. The human resources involved in the learning process are the students (the respondents) and the university teachers participating in the experiment. All classes were conducted in university classrooms. For convenience, the students were divided into several groups of 10–15 people. The training process took place over 2 weeks. The educational material aimed to familiarize learners with innovative information technologies and the possibilities of visualization in the learning process.

The training process by the program developed took place at the second stage of the study. The training program was uploaded on the Moodle distance learning platform. Access to the program was given to teachers and all students. To get acquainted with the program and view all its components, it was necessary to register with a Google account. An invitation to join the program and an access code was emailed to everyone who entered their data. To log in to the system, each teacher or student was required to enter the email address specified during registration and the access code. The training program, the educational material, and links to all websites for

familiarization with innovative information technologies or downloading applications needed for training were posted on the platform page.

#### 2.3. Research design

The study relies on the experimental survey method to assess respondents' involvement in the use of innovative information technologies. In addition, the modeling method was used to increase students' motivation to study through visualization and other modern technologies.

The survey was conducted immediately before the intervention with a training course (pre-test) and immediately after the end of this course (post-test). In this case, two tests were carried out. The first is The Self-Regulation Questionnaires Learning Self-Regulation Questionnaire (SRQ-L) (Williams and Deci, 1996; Black and Deci, 2000) aimed at identifying extrinsic or intrinsic motivations and its strength for adult students. This method of studying intrinsic motivation and various types of motivation is widely known and often used in practice and academic research. Its advantage is that it has several specialized and well-validated robust options for classrooms, schools, universities, or business applications. The second test asked participants to rate: "Does the use of visualization affect motivation to learn?" on a 5-point Likert scale (where 1 point was "does not affect motivation at all" and 5 points was "very strongly motivates"). To determine the presence of statistically significant changes in the results before and after the intervention and the presence of differences between the control and experimental groups, the Student's t-test was used. To check the normality of the distribution in the sample, the Shapiro-Wilk test was used for the pre-test results in the experimental, control group, and the entire sample as a whole. The results of both types of tests were checked by a two-tailed Student's t-test. Testing was carried out in the classroom after the completion of classes with the direct participation of assistants trained by the researchers to control and assist in the test performance.

To establish the presence of consistent changes in the quality of students' motivation, Pearson's direct correlation compared the results of the pre-test and post-test SRQ-L for the same participants. As per the researchers' observations, the presence of a correlation signifies a connection between the changes in individual student outcomes. This correlation, when examined alongside a *t*-test, may reveal statistically significant differences; however, it also indicates a consistent alteration in the motivation levels of a significant number of students. A correlation between test score changes for a large proportion of students will show such a change. A study was also made on the correlation between the subjective assessment of students during the post-test and the results of the SRQ-L. This correlation was supposed to show the awareness and accuracy of students' self-assessment, or vice versa, and the desire to indicate a positive result in the real absence of it.

In the third stage, a survey was conducted. First, the respondents were sent a Google form questionnaire, which consisted of the following questions: "Which teaching methods are preferred in your educational institution? (traditional/modern);" "Are visualization and innovative information technologies used in the classroom?" "Assess your motivation to learn (high, medium, or low);" "Does the use of visualization affect motivation to learn?" "What motivation factors, do you think, affect the learning process?." There was no time limit to complete the questionnaire.

#### 2.4. Statistical processing

The respondents' answers were processed in Statistica and Microsoft Excel; charts reflecting each question indicator were created.

#### 2.5. Ethical issues

The experiment was conducted in compliance with all ethical standards and anonymity; there were no requirements to provide confidential information (first name, last name, place of residence, etc.). The respondents gave their written consent to conduct the experiment and process data. The survey participants were asked to indicate their year of study at the time of the experiment. The integration of a new academic discipline into the experimental group was meticulously planned and incorporated into the class schedule to ensure minimal disruption to the ongoing educational process. The use of the experimental intervention did not adversely affect participants' academic performance or interfere with their studies.

## 3. Results

The normality of the distribution by the Shapiro-Wilk method is shown for the experimental group where W = 1.783; for the control group, W = 1.567; for the entire sample, W = 1.271. Thus, it should be recognized that within the sample as a whole and in each of the groups (control and experimental), the distribution is close to normal, and the Student's parametric t-test can be applied in this case. A comparison of the results of the test of internal motivation for students before the intervention showed no statistically significant differences between the groups (p=1.256); the average values are within the standard deviation. At the same time, after the intervention, the posttest shows the presence of significant differences (p = 0.001) (Table 2). This result allows us to suggest that the use of the proposed course really increased the intrinsic motivation for learning as a result of gaining knowledge and skills in using tools and methods of information visualization. The comparison of the results of the experimental group pre- and post-test also demonstrates the presence of significant changes (p=0.000) with a significant increase in the average test score (from 24.17 to 34.59 points out of the 49.00

TABLE 2 Two-tailed student's *t*-test results for pre- and post-test of SRQ-L comparisons.

		Mean	SD	df	t	p
Pre-test	Exp.	24.17	1.14	185	7.893	1.256
	Cont.	23.02	1.22			
Post-	Exp.	34.59	1.34		1.973	0.001*
test	Cont.	25.12	1.46			
Exp.	Pre-test	24.17	1.14	92	1.987	0.000*
	Post-test	34.59	1.34			

\**p*≤0.05.

maximum allowable). This indicates that the differences with the control group were not random because the changes in the experimental group are also significant (Table 2).

The results of a survey with a subjective assessment of the impact of knowledge about visualization on learning motivation are similar to the results of the first test. The pre-test showed no statistically significant differences between the groups. Post-test indicates a statistically significant difference (p=0.011). For the experimental group, the difference between the results of the subjective assessment of participants pre- and post-test also appears to be significant (p=0.002) (Table 3). Thus, it can be said that the subjective assessment of the increase in motivation for learning with the development of knowledge and skills in information visualization also steadily increases significantly in the group that underwent such training (from 3.11 to 4.04 points out of the 5.0 maximum possible).

Pearson's correlation between pre-and post-test results gives a value of r = 0.565 for the control group (medium correlation strength) and r = 0.861 (strong correlation) for the experimental group. The correlation between pre-and post-test results for the experimental group indicates an even stronger direct correlation, r = 0.941. This means that the majority of participants in the experimental group

TABLE 3 The results of a two-tailed student's t-test to compare the preand post-test of a survey on the subjective assessment of motivation (5-point Likert scale).

		Mean	SD	df	t	p
Pre-test	Exp.	3.11	0.28	185	7.893	1.256
	Cont.	3.02	0.18			
Post-	Exp.	4.04	0.16		1.974	0.011*
test	Cont.	3.14	0.22			
Exp.	Pre-test	3.11	0.28	92	1.987	0.002*
	Post-test	4.04	0.16			

 $*p \le 0.05.$ 

consistently increased the values of motivation. The comparison of post-test results for SRQ-L tests and subjective assessment of motivation shows r = 0.816. Based on the results, it can be concluded that there is a strong correlation between a more objective assessment through the SRQ-L test and a subjective assessment. In other words, students in the experimental group are cognizant of the change in their intrinsic motivation and comprehend its underlying source. Their assessment is not only the result of a desire to demonstrate performance improvement but may objectively correspond to it.

The figures show the descriptive statistics results for additional surveys. Figure 2 demonstrates the responses to the question "Which teaching methods are preferred in your educational institution? (traditional/modern)." A significant proportion of first-year (56%) and second-year (55%) students acknowledged the prevalence of traditional teaching methods, suggesting a lack of progress in the integration of innovative information technologies within contemporary higher education. Accordingly, 44% of first-year and 45% of second-year students mentioned a preference for modern teaching methods in their educational institutions. Among the third-year students, these figures are 51% (traditional) and 49% (modern).

The respondents' answers to the second question "Are visualization and innovative information technologies used in the classroom?" show that the majority of first-year (55%), second-year (53%), and third-year (57%) students selected the option of "Yes, but rarely" while the majority of fourth-year students (60%) ticked "Yes, often" (Figure 3). The "Yes, often" indicators among the first-, second-, and third-year students were as follows: 35, 34, and 33%, respectively.

Figure 4 shows the respondents' answers to the question "Assess your motivation to learn (high, medium, or low)." The majority of first-year students (62%) assess their motivation to study as high. At the same time, motivation decreases in accordance with the year of study. A considerable portion of second-year (57%) and third-year (61%) students exhibit a predominantly moderate level of motivation. The other motivation indicators were as follows: 30% of first-year students have medium and 8% have low motivation; 23% of







second-year respondents have high and 20% have low motivation; 30% of third-year students have high motivation and, accordingly, 9% have low motivation to study.

The results of the question "Does the use of visualization affect motivation to learn?" show that the majority of the respondents (first-year students – 65%; second-year students – 56%; third-year students – 50%) believe that visualization affects their motivation to learn (Figure 5). However, the "No" indicators were obtained: first-year learners – 35%; second-year learners – 44%; third-year learners – 50%.

The respondents' answers to the question "What motivation factors do you think affect the learning process?" are described in Figure 6. Among the first-year students, the most common answers were "self-development" (56%), "motivation" (43%), "interesting subjects" (38%), and "knowledge" (36%); the second-year students noted, "knowledge" (46%), "self-development" (49%), "motivation" (52%), and "diploma" (38%); third-year students indicated "application of knowledge in practice" (63%), "knowledge" (60%), "self-development" (52%), and "diploma" (37%).





# 4. Discussion

The analysis of the results obtained shows the relevance of studying the effectiveness of innovative information technologies

in education not only in China but also in other countries. For example, Turkish researchers studied the self-efficacy of teachers in the context of modern technology applications (Doğru, 2017). As a result, a self-efficacy scale was developed, and it was concluded that modern technologies are highly effective in training. This is consistent with the findings of the present study's experiment.

The features of using modern technologies in legal studies were analyzed by Polish researchers (de Araújo, 2021). The results show that new technologies contribute to the development of information skills and professional competencies in law, in particular civil, family, corporate, and arbitration proceedings. The researchers noted that the ability to present information as well as current research increased motivation and engagement in law education.

The impact of information technologies on the management of computer science classes has been analyzed (Barinova et al., 2018). The research advantage is the study of the impact of modern technologies and information visualization on the effectiveness of the learning process, in particular, students' academic performance. The effectiveness of information technologies in monitoring the learning process was confirmed. The described method can be applied not only in monitoring the study of computer science but also in other subject areas.

English researchers have studied the features of interactive visualization and personality-oriented education (Firat and Laramee, 2018). Based on the analysis of the results, it was concluded that interactive visualization facilitates the perception of information and the educational process. It is preferable to classify potential resources for the study of modern technology applications in the learning process by thematic groups. There was a similar study in the USA, which confirmed the impact of interactive visualization on students' motivation to study (Schweitzer and Brown, 2007). The researchers also described a method for involving students in the educational process—active learning based on visualization.

In Spain and the USA, self-organized maps (SOM) were developed to visualize theoretical materials (Qian et al., 2019). This approach stands out for its utilization of self-organized maps, which enhance the learning process, effectively save time, and aid in organizing and delivering information in a more accessible manner. SOM (Self-Organizing Map) is a machine learning technique that employs dimensionality reduction based on property similarities to visualize the relationships among materials in a multidimensional dataset. In this study, Self-Organizing Map (SOM) was employed to investigate the correlations among 21 material properties in a dataset consisting of more than 398 commercial materials. The trained SOM model was visualized using U-matrix maps, clustering maps, and heat maps. The clustering and heatmaps derived from SOM were employed to identify unique materials and establish correlations between material properties and the underlying material structure.

Many learners must cope with a visual barrier that they are not even aware of (Parzysz, 1988). The use of digital tools to investigate and study 3D objects could help students overcome visual obstacles. Komatsu and Jones (2020) reported that students with limited spatial vision managed to deal with mathematical problems using technological tools. In their study, they employed Dynamic Geometry Environments (DGE). The authors analyzed lessons with students from a secondary school (aged 14–15; 9th grade). As a result, they revealed that the incorporation of Dynamic Geometry Environments (DGE) helped students in their ability to generalize the concepts they had been taught. While initially unable to achieve generalization when using DGE, the authors later succeeded through a combination of paper, pencil, and innovative technologies. That is to say, the use of technological tools combined with adequate meditation by a teacher has an important role in closing gaps.

Chinese researchers studied the effectiveness of 3D printing in teaching mathematics and concluded that this type of visualization improves thinking skills and understanding of instructional materials (Sun and Li, 2017). The innovative teaching method was implemented during the study of geometry by students. Following a mathematical equation and the representation of the Möbius strip in MATLAB 3DMAX, and other software tools were utilized to create 3D models, enabling the visualization of the three-dimensional form of the Möbius strip. From the exploration of mathematical equations to the completion of printed works, although more demanding and rigorous compared to traditional mathematical education, this approach proves highly beneficial in terms of the depth and breadth of learning. Throughout the learning process, students demonstrated their creative abilities, which were not necessarily confined within the boundaries of mathematical disciplines. This instructional approach lays a robust groundwork for the exploration of mathematics and other academic disciplines in subsequent years, contingent upon students acquiring a sound comprehension of spatial concepts and graphics. The mathematics textbook itself offers various types of instructional activities and specific materials for teaching, but it may not fully meet the practical needs of teaching. Teachers can utilize 3D printing technology to facilitate the teaching of spatial concepts and graphics, employing 3D printed instructional materials to enhance visualization in mathematics education. Within the mathematics classroom, students have the opportunity to cultivate their spatial learning models, a practice that has the potential to enhance student engagement, foster enthusiasm, and ignite their curiosity and capacity for innovative thinking. Additionally, students can employ physical models to verify the accuracy of their graphical representations, thereby enriching their learning experience.

In addition, Australian scholars considered visualization in the context of enhancing students' spatial thinking and math performance (Lowrie et al., 2019). The study results show that visualization technologies improve students' academic performance and motivate them to study. This study aimed to investigate the effectiveness of a spatial visualization intervention program in enhancing students' spatial thinking abilities and mathematics achievement. The participants consisted of 327 students from 17 classes across 10 schools, with nine classes assigned to the experimental group and eight classes serving as the control group. The intervention program was implemented by classroom teachers over 3 weeks, while the control group received traditional mathematics instruction. Compared to the control group, the intervention group participants exhibited notable enhancements in their spatial cognitive skills, specifically in the domains of spatial visualization and spatial orientation. The intervention group also exhibited significant improvements in their mathematics test scores; participants in the intervention group outperformed their counterparts in the control group in geometry and word problem tasks but not in mathematical questions requiring graphic decoding (non-geometry-related graphical tasks). These findings provide evidence that the spatial thinking enrichment program implemented by teachers within their classrooms can enhance both spatial thinking abilities and mathematics achievement.

The practical significance and further research prospects are due to the possibility of applying the training program developed in the study to teach mathematics and legal sciences to university students. Also, the training program can become the basis for the development of modern programs to study other subjects as it focuses on innovative and information technologies rather than disciplines. Based on the results obtained, the impact of innovative information technologies can be studied in different universities around the world in a comparative context.

# 5. Conclusion

The experiment findings indicate the need to introduce innovative information technologies into curricula and training programs. A training program that aimed to introduce innovative information technologies of information visualization into the learning process was developed. A total of 186 participants took part in the study, consisting of three groups comprising 62 students, each from two universities and a college. They were divided into experimental and control groups, from which the experimental group received intervention in the form of a training program "Innovative information technologies in Education" developed by the author. The Self-Regulation Questionnaires Learning Self-Regulation Questionnaire (SRQ-L) was used to assess change in intrinsic motivation. Statistically significant positive changes in the intrinsic motivation of students in the experimental group were ascertained through the utilization of the Student's t-test, both in comparison to the control group and in comparison to the pre-test results of the experimental group. There is also a strong correlation between participants in the treatment group between their test scores, which further captures that the positive changes are the result of the proposed intervention. It was found that in the learning process, modern technologies are used by 44% of first-year, 45% of second-year, and 51% of third-year students; 60% of fourth-year respondents reported that visualization and innovative information technologies are used in the educational process. The majority of the respondents (first-year students - 65%; second-year -56%; third-year students - 50%) believe that visualization affects their motivation to learn. Among the first-year students, the most common answers were "self-development" (56%), "motivation" (43%), "interesting subjects" (38%), and "knowledge" (36%); the second-year students noted, "knowledge" (46%), "self-development" (49%), "motivation" (52%), and "diploma" (38%); third-year students indicated "application of knowledge in practice" (63%), "knowledge" (60%), "self-development" (52%), and "diploma" (37%). The practical significance and further research prospects are due to the possibility of applying the training program developed in the study to teach mathematics and legal sciences to university students. Also, the training program can become the basis for the development of modern programs to study other subjects as it focuses on innovative and information technologies rather than disciplines. Based on the results obtained, the impact of innovative information technologies can be studied in different universities around the world in a comparative context.

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# Data availability statement

The original contributions presented in the study are included in the article/supplementary material, further inquiries can be directed to the corresponding author.

## **Ethics statement**

The research was conducted ethically in accordance with the World Medical Association Declaration of Helsinki. The study was approved at the meeting of the Ethics Committee of Kazan Federal University. The patients/participants provided their written informed consent to participate in this study.

# Author contributions

The study's conception and design were contributed by NM, LD, IK, and FS. LD handled the conceptualization. IK and FS were responsible for material preparation, data collection, and analysis. NM drafted the initial manuscript. NM, LD, IK, and FS provided feedback on earlier versions of the manuscript. All authors contributed to the article and approved the submitted version.

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# **Conflict of interest**

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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