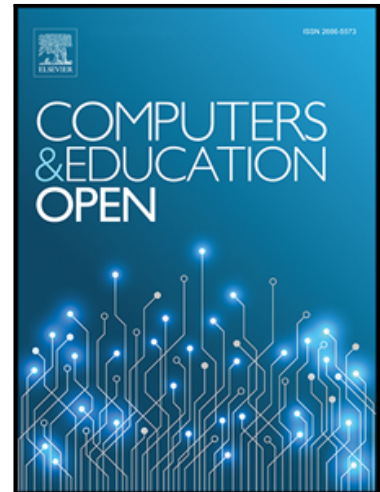


## Journal Pre-proof

A Systematic Map of Research Characteristics in Studies on Augmented Reality and Cognitive Load

Josef Buchner , Katja Buntins , Michael Kerres

PII: S2666-5573(21)00007-0  
DOI: <https://doi.org/10.1016/j.caeo.2021.100036>  
Reference: CAEO 100036



To appear in: *Computers and Education Open*

Received date: 16 November 2020  
Revised date: 20 April 2021  
Accepted date: 20 April 2021

Please cite this article as: Josef Buchner , Katja Buntins , Michael Kerres , A Systematic Map of Research Characteristics in Studies on Augmented Reality and Cognitive Load, *Computers and Education Open* (2021), doi: <https://doi.org/10.1016/j.caeo.2021.100036>

This is a PDF file of an article that has undergone enhancements after acceptance, such as the addition of a cover page and metadata, and formatting for readability, but it is not yet the definitive version of record. This version will undergo additional copyediting, typesetting and review before it is published in its final form, but we are providing this version to give early visibility of the article. Please note that, during the production process, errors may be discovered which could affect the content, and all legal disclaimers that apply to the journal pertain.

© 2021 Published by Elsevier Ltd.  
This is an open access article under the CC BY-NC-ND license (<http://creativecommons.org/licenses/by-nc-nd/4.0/>)

## A Systematic Map of Research Characteristics in Studies on Augmented Reality and Cognitive Load

Josef Buchner<sup>\*a</sup>, Katja Buntins<sup>a</sup> und Michael Kerres<sup>a</sup>

<sup>a</sup> University of Duisburg-Essen, Learning Lab, Universitätsstraße 2, 45141 Essen, Germany

\*Corresponding author: josef.buchner@uni-due.de

katja.buntins@uni-due.de

michael.kerres@uni-due.de

Declaration of interest: none

This research did not receive any specific grant from funding agencies in the public, commercial, or not-for-profit sectors.

#### Highlights

- Research on AR and CL is steadily increasing
- Results are largely based on comparative media studies
- Nasa Task Load Index (Nasa TLX) is the most frequently used measuring instrument
- Consideration of the different load types is almost completely missing

#### Abstract

In this paper, we present results from a systematic review of research on Augmented Reality (AR) with a special focus on cognitive load (CL). A total of 64 studies from the years 2007 to 2019 were analyzed. The number of publications on AR and CL is steadily increasing. While studies are often conducted by multidisciplinary teams, most are from the US and Taiwan. From a methodological perspective, quantitative research methods with experimental designs dominate. Usually, studies are conducted as media comparison studies measuring effects of AR on declarative or procedural knowledge compared to one or more control groups. The examination of AR focuses on different components, with assistance systems and instructional materials being the most common. Mostly, studies are about see-through, marker-based, spatial, and location-based AR. Markerless or web AR applications are not yet in this sample. The influence of AR glasses on the cognitive load is most often

investigated, followed by mobile devices such as smartphones or tablets. Among the survey instruments, the Nasa Task Load Index (Nasa TLX) is used most frequently; only three studies use dual task methods to measure the cognitive load. Implications for future research projects are presented and should contribute to the advancement of research on AR and cognitive load. More research is definitely needed.

**Keywords:** Augmented Reality, Cognitive Load, Systematic Review, Multimedia Learning, Systematic Map

## **A Systematic Map of Research Characteristics in Studies on Augmented Reality and Cognitive Load**

Declaration of interest: none

This research did not receive any specific grant from funding agencies in the public, commercial, or not-for-profit sectors.

### Highlights

- Research on AR and CL is steadily increasing
- Research to date is largely based on comparative media studies
- Nasa Task Load Index (Nasa TLX) is the most frequently used measuring instrument
- Consideration of the different load types is almost completely missing

### Abstract

In this paper, we present results from a systematic review of research on Augmented Reality (AR) with a special focus on cognitive load (CL). A total of 64 studies from the years 2007 to 2019 were analyzed. The number of publications on AR and CL is steadily increasing. While studies are often conducted by multidisciplinary teams, most are from the US and Taiwan. From a methodological perspective, quantitative research methods with experimental designs dominate. Usually, studies are conducted as media comparison studies measuring effects of AR on declarative or procedural knowledge compared to one or more control groups. The examination of AR focuses on different components, with assistance systems and instructional materials being the most common. Mostly, studies are about see-through, marker-based, spatial, and location-based AR. Markerless or web AR applications are not yet in this sample. The influence of AR glasses on the cognitive load is most often

investigated, followed by mobile devices such as smartphones or tablets. Among the survey instruments, the Nasa Task Load Index (Nasa TLX) is used most frequently; only three studies use dual task methods to measure the cognitive load. Implications for future research projects are presented and should contribute to the advancement of research on AR and cognitive load. More research is definitely needed.

**Keywords:** Augmented Reality, Cognitive Load, Systematic Review, Multimedia Learning, Systematic Map

## Introduction

Research on the use of Augmented Reality (AR) for teaching and learning has gained much attention in recent years [1–3]. The number of publications published has been increasing rapidly and seems to gain in importance also in the future due to the reduced technical hurdles. AR is defined as the computer-based extension of reality [4]. The virtual objects align themselves with the objects of the real world, enable interaction possibilities, and react simultaneously to these interactions [5,6]. In the field of education, the use of AR is mainly discussed from the point of view of learner-centered learning [7]. AR can, e.g., be used to make the invisible visible [8], to realize situated learning [9], and to view environments familiar to learners in a completely new way [10]. In the past, bulky devices such as head-mounted displays were needed for this purpose, but today mobile devices with an Internet connection and an appropriate app are sufficient. At least marker-based and location-based AR experiences can be realized very easily. Marker-based AR uses the technology of image recognition. So-called markers or triggers are made available to the learners. By scanning them with the camera of a mobile device, additional information, e.g. a 3D model in an analogue book, becomes visible and can be modelled via touch function. The situation is similar with location-based AR, where the virtual insertions become visible in connection with GPS data [11,12].

See-through and spatial AR are currently still technically more complex and require either special glasses or projectors to display AR elements. Newer AR techniques are markerless and web AR. Markerless AR allows the projection of virtual objects on any surface without scanning a marker beforehand. With web AR, no app is needed on mobile devices anymore; the virtual objects can be viewed directly via a browser. Because it is so easy to use, particularly web AR is seen to have great potential for many different areas [13].

Research on teaching and learning with AR has already targeted many different areas. Especially in the industry, AR seems to have become more popular and has been integrated to support and train everyday tasks [14,15].

The use of AR in formal and informal learning contexts has also been studied more intensively in recent years and, thus, some of the potential of AR can already be summed up:

- Motivation: As with other technologies, there are many positive results regarding the motivating effect of AR [16–18]. Here, flow experience as well as the ARCS model [19] have been researched particularly often [20].

- Attitudes: AR is perceived by learners as useful educational technology with which they would like to continue learning. In addition, there are studies that show that attitudes towards, e.g., science learning have changed positively with the help of AR [21–23].
- Learning achievement: Regarding learning success, current meta-analyses show medium effect sizes when learning with AR. However, it is necessary to point out the still rather limited number of primary studies as well as methodological limitations, as the authors do, too [24–26].

While research on the potentials mentioned is relatively consistent, this does not apply to another important variable for the acquisition of knowledge and skills: cognitive load (CL).

Here, authors report different study results. Some studies conclude that AR can reduce cognitive load, while others see AR as a risk of cognitive overload [27–29].

The construct of cognitive load has its theoretical foundations in Cognitive Load Theory (CLT) [30,31]. This instructional theory assumes that the human working memory is limited in its capacity. This limitation must be taken into account when providing teaching and learning opportunities so that effective learning can take place. Prior knowledge has emerged as the strongest predictor for the perception of cognitive load [32]. If learners are beginners in a certain domain, they need more guided learning opportunities, for example in problem solving. Experts, on the other hand, can also benefit from more unguided learning opportunities and acquire new knowledge and skills [33]. The preparation of the learning materials is also crucial, as unnecessary cognitive load can be reduced if the principles of multimedia learning are taken into account [34]. This type of load is called extraneous load and can be actively changed by teachers. The intrinsic load, on the other hand, is the task-induced cognitive load which can be changed by building up knowledge or by changing the task itself. The last load type is germane load, which represents the learning-relevant cognitive load [35].

AR can reduce the cognitive load when used appropriately, e.g. by scaffolding [36], or unnecessarily increase it in the case of poorly designed offers [37].

Reviews of research on AR and cognitive load are not yet available. The study by Ibili [38] does not consider primary studies, but only summarizes the findings of existing literature reviews. Again, the conclusion is that more research is needed on cognitive load in AR-supported learning. In another study, research on AR was reviewed regarding its theoretical relevance. Of 45 studies, only three mentioned cognitive load theory as a theoretical reference [39]. A detailed review of multimedia learning and cognitive load shows a similar picture: Only four studies examined the influence of AR on cognitive load [40].

This paper makes a first attempt to extend our knowledge of previous research on AR and cognitive load by analyzing the characteristics of available studies. It is quite central of being aware of the characteristics of a research field in order to overcome possible methodological deficiencies, for example. Therefore, this work makes an essential contribution to the field by providing clues for future research on AR and cognitive load in the selection of methodological approaches, survey instruments, and methodological designs. The analysis of these methodological characteristics of research can be classified as a critical issue. Findings on this can contribute significantly to shaping the future of research in a field [41,42].

Therefore, the following research questions will be addressed:

- Research question 1: Which bibliometric and geographical characteristics can be identified in research on AR and cognitive load?
- Research question 2: Which methodological characteristics distinguish research on AR and cognitive load?
- Research question 3: How has research on AR and cognitive load been conducted so far?

The further structure of the article is as follows:

First, we introduce the methodology we use and describe the process that led to the sample of 64 studies on AR and cognitive load. Then, the results for each research question are presented and discussed. The conclusion summarizes the most important findings for the reader.

## Method

To address our research questions, we systematically map the nature of the research on AR and cognitive load. Therefore, we conducted a systematic review. A systematic review is a systematically performed literature review that uses specific research methods with the aim to answer a specific question. It is characterized by a comprehensible search strategy and inclusion/exclusion criteria which lead to those studies that can contribute to answering the question. Included studies are then coded, synthesized and used to answer the research questions and to guide further research on the mapped topic [43].

### Search strategy and selection criteria

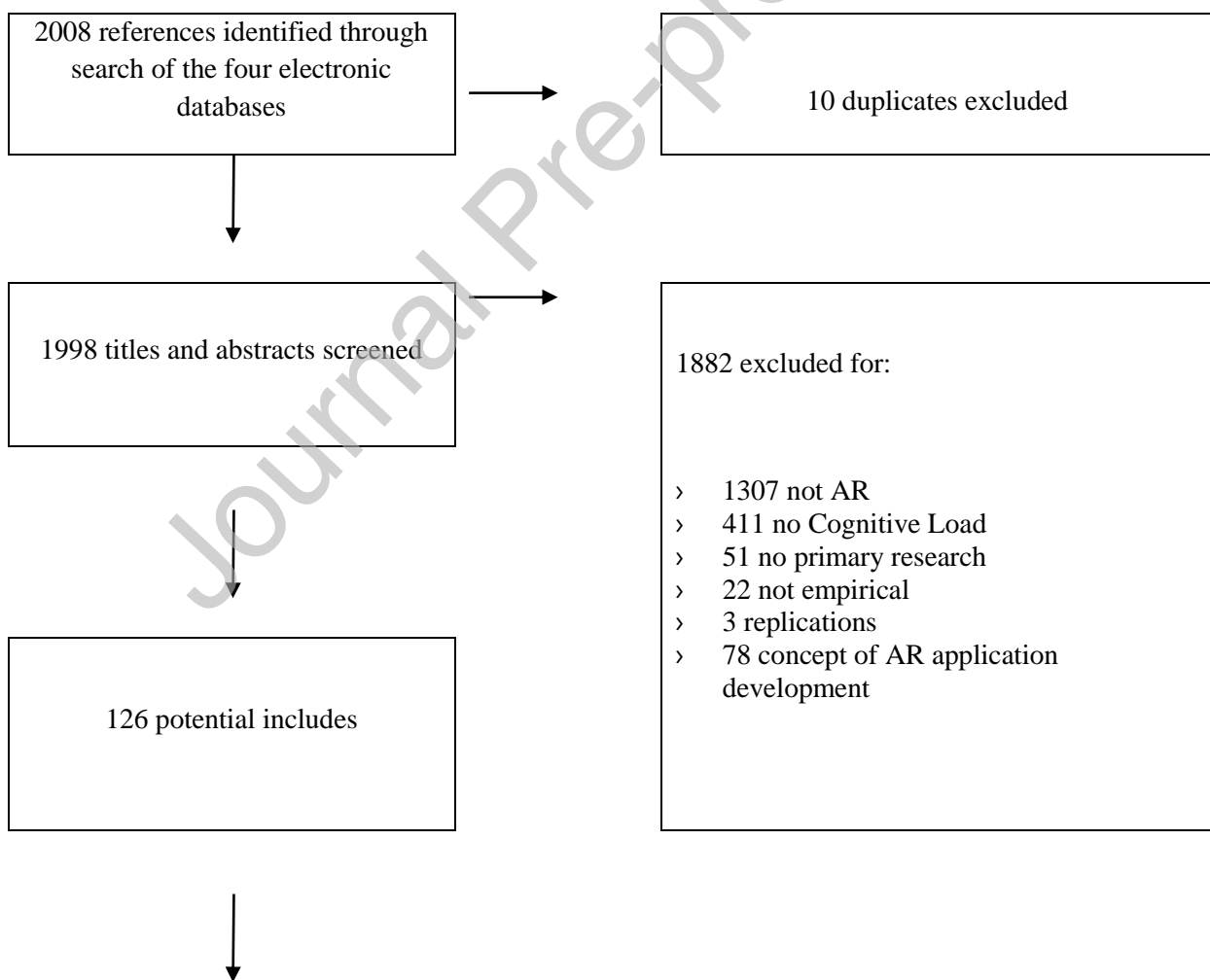
Four databases were searched in October 2019: ERIC, Web of Science, Scopus and PsycINFO. Table 1 shows the search terms used for each topic.

Topic	Search Terms
Augmented Reality	<i>“augmented reality” OR “mixed reality” OR “glass” OR “head mounted display” OR “virtual reality” OR “augmented reality AR”</i>
AND	
Cognitive Load	<i>“cognitive load” OR “cognitive load theory” OR “dual task” OR “working memory” OR “cognition” OR “attention” OR “load” OR “mental load” OR “overload” OR “mental effort” OR “germane load” OR “germane cognitive load” OR “intrinsic load” OR “intrinsic cognitive load” OR “extraneous load” OR “extraneous cognitive load”</i>

Inclusion criteria were journal articles, conference proceedings and book chapters in the English language reporting empirical results of primary studies on cognitive load and AR; including all types and devices that enable the presentation of AR content in all educational areas. No limit was set regarding time span .

The search initially revealed 2,008 references (see Fig. 1). After removing 10 duplicates, 1,998 sources remained for the first screening. The titles and abstracts of 300 publications were each screened based on the inclusion and exclusion criteria by two researchers. In case of conflicts regarding the inclusion, the title and abstract were read again together, and a decision was made on whether to accept or reject the publication.

The remaining sources were then divided between the researchers and screened according to the criteria, which resulted in 126 potential references for the review. Finally, 66 references were excluded and 60 references containing 64 studies remained for the data extraction process (see Appendix 1).



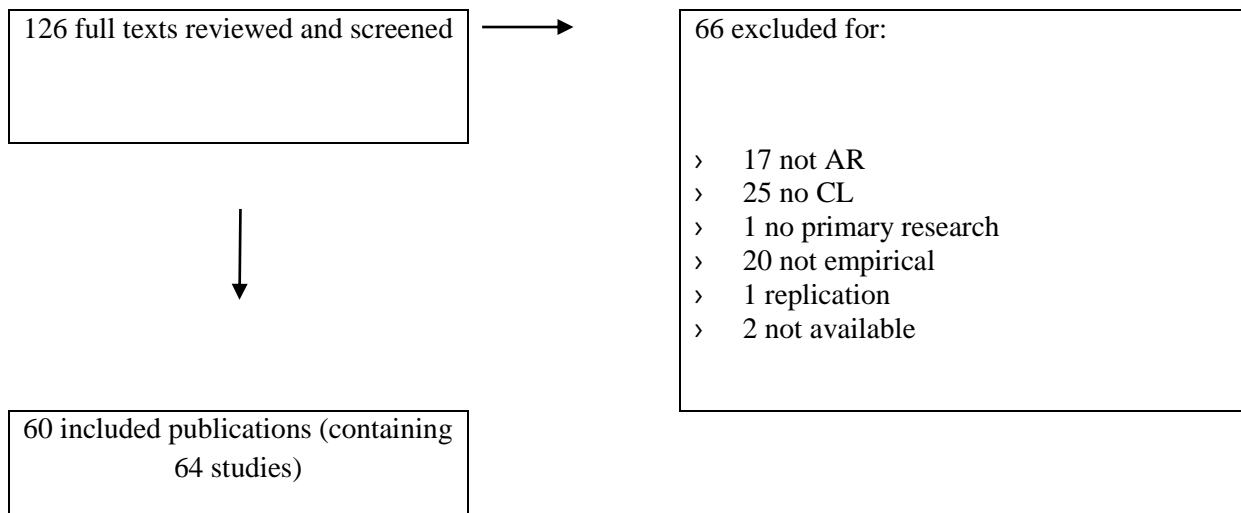


Fig. 1. Systematic review PRISMA flow chart, slightly modified after Moher et al., 2009 and Alexander, 2020.

### Data coding and categories

A comprehensive coding system was developed to extract the data from these studies. It includes more general information, as is usual in a mapping study [44], such as the origin of the authors, the institutional classification, the type of publication, and the assignment of the study to a research field. The methodological parameters were also coded to reveal possible trends or gaps in the research methodology. Furthermore, codes were developed for the research procedure, e.g., what is to be compared to find out more about the effect of AR on cognitive load. Here, we took the different types of AR and the devices with which the subjects use AR into account. We also coded the purpose of AR in each study. We distinguish between assistance systems, instructional material, training systems, AR design research, and AR games. We also coded the type of knowledge, declarative or procedural, that should be taught/trained using AR.

## Results

### RQ1: Bibliometric and geographical characteristics

The systematic map shows that 39 studies (60.9%) were published in journals and 25 studies (29.1%) in conference proceedings. As can be seen in Figure 2, contributions to the AR and CL studies date back to 2007. The years 2018 ( $n=13$ ) and 2019 ( $n=14$ ) saw a strong increase in studies, 42.2% of the studies found are from these two years. Compared to the first peak in 2016 with seven studies, publications in 2018 and 2019 almost doubled in both years.



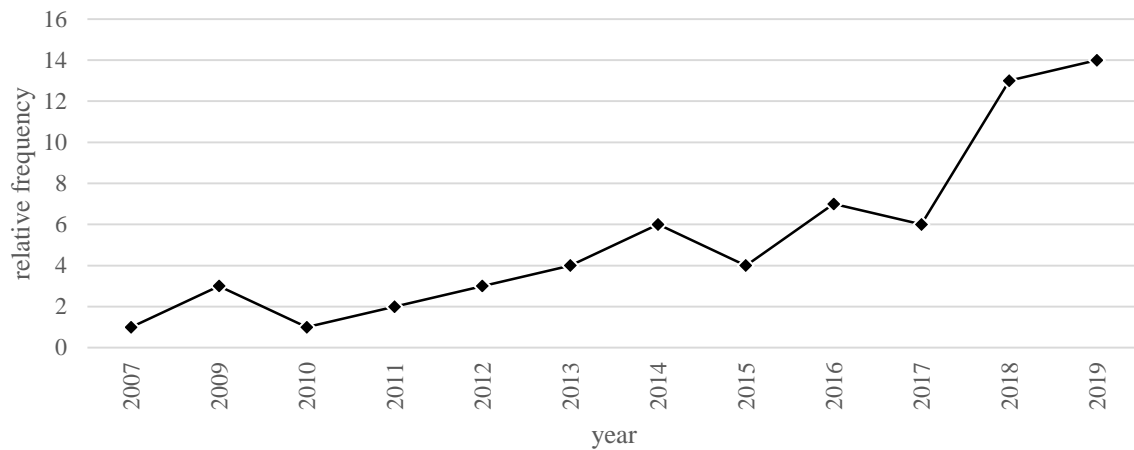


Fig. 2. Frequency of publications on AR and CL

A total of 242 authors contributed to the articles, with one author contributing three articles, 22 authors contributing two, and 219 authors contributing one.

The authors' fields of research have been assigned according to the UNESCO classification [45]. The institutional classification of the first author was used. If this information was not directly identifiable from the article, we searched for the authors' CVs and classified them according to the information found. 24 (37.5%) first authors can be assigned to the field of information & communication technologies (ICT). Nine (14.1%) first-time authors each come from the fields of education, engineering, manufacturing & construction, and health & welfare. There are eight (11.4%) first-time authors from social sciences, journalism & information. Two (2.9%) first-time authors each have their institutional roots in natural sciences, mathematics & statistics and services, just one (1.6%) first-time author belongs to the field of arts & humanities.

Furthermore, the research field of the studies was coded for AR applications according to the domains established in [46]. Thus, a total of 26 (40.6%) studies examine AR and CL for the field of education (EDU). Eleven studies each (17.2%) can be assigned to the domain manufacturing (MAN) and navigation & path planning (NPP). Five studies each (7.8%) can be assigned to the areas medical (MED) and visualization (VIS). Three (4.7%) studies fall into the military sector (MIL), two (3.1%) belong to urban planning & civil engineering (UPCE), and one study examines AR and CL in the field of robotics (ROB).

An interdisciplinary team of authors was involved in about half of the studies (46.9%,  $n=30$ ). In 50 percent of the studies, the authors were homogeneous regarding the subject ( $n=32$ ). In two studies, this could not be assigned or reconstructed (3.1%). The interdisciplinary teams are mainly found in the field of Health & Welfare (77.8%) and ICT (54.2%).

Figure 3 shows the distribution of the authors among the AR application areas.

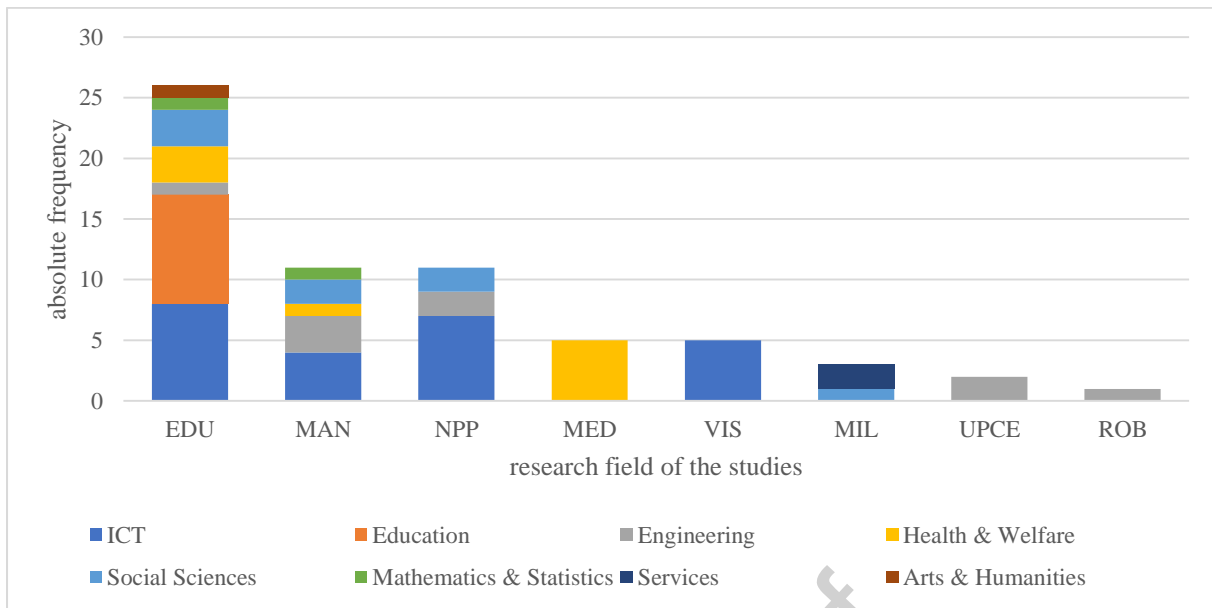


Fig. 3. Overview of the interrelation between the institutional classification of the authors (ICT, Engineering, Education, ...) and the research field of the respective study, (Education (EDU), Manufacturing (MAN), Navigation & Path Planning (NPP), Medical (MED), Visualization (VIS), Military (MIL), Urban Planning & Civil Engineering (UPCE), Robotics (ROB)).

The analysis of the geographical characteristics shows that most of the first authors of the studies come from the US ( $n=14$ , 21.9%) and Taiwan ( $n=13$ , 20.3%). Seven (10.9%) come from Germany and five (7.8%) from China.

Overall, the studies come predominantly from western countries, such as the USA, Canada (6.3%,  $n=4$ ), Australia (4.7%,  $n=3$ ), New Zealand (6.3%,  $n=4$ ), and Europe. France, Austria, Portugal, Switzerland, Spain, and Great Britain each supply one study (1.6%). Besides Taiwan, there are studies from Japan (3.1%,  $n=2$ ), Turkey (4.7%,  $n=3$ ), China (7.8,  $n=5$ ), and South Korea (4.7%,  $n=3$ ).

## RQ2: Methodological characteristics

Of the 64 studies, 64 percent have a quantitative approach ( $n=41$ ), 34.4 percent a mixed method approach ( $n=22$ ), and one study has a purely qualitative approach (1.6%). 54 of the 64 studies use an experimental design (84.4%), another four studies use a quasi-experimental design (6.3%), four studies use a non-cross-sectional design and compare, e.g., different age groups with one another (6.3%). One study uses a design-based approach with an emphasis on multiple case study design (1.6%).

Of the experimental studies, 25 (46.3%) have a between-subject approach. 22 of these 25 studies use an experimental control group approach. Of these 22 studies, four studies also have a within-subject design. The other three studies have more than two experimental groups. One of the studies also has within-subject factors. 35 of the 54 studies with an experimental approach have a within-subject design (64.8%). In three studies, only two factors are varied. In all other studies with an experimental within-subject design, more than two conditions are tested. All four studies with a quasi-experimental approach have a classical experimental control group design.

In 23 (35.9%) of the reviewed articles, hypotheses were developed and tested. An explorative approach was chosen 37 times (57.8%).

### **RQ3: Characteristics of research on AR and CL to date.**

As the systematic analysis shows, studies examine the use of AR for six different purposes and how it affects the cognitive load. In 27 studies (43%), AR is used as an assistance system to support specific action requirements, like physical computing, surgery or navigation tasks [e.g. 47–49]. AR is used in 18 studies (28%) as a technology for instruction [e.g. 50–52] and in 15 further studies (23%) to guide assembly tasks [e.g. 53–55]. In the two studies (3%) in Alrashidi et al. [56] and Loup-Escande et al. [57] AR is used to provide real-time feedback. One study aims at examining AR for spatial ability training [58] and further one focuses on collaborative problem solving [59].

Summarizing these purposes, it appears that the majority of the studies ( $n=46$ , 72%) examined the cognitive load in promoting procedural knowledge [60]. In 18 studies (28%), the effect of learning with AR on the cognitive burden of acquiring declarative knowledge [61] was examined.

Four different AR types were identified in the studies, two of which appear together in five studies. See-through AR appears in 27 studies (42.2%), marker-based AR in 21 (32.9%). Spatial AR is investigated in 19 studies (29.7%), whereas location-based AR is only investigated in two studies (3.1%). No study examines the effect of markerless or web AR on cognitive load.

AR is visualized via glasses ( $n=27$ ), mobile devices such as smartphones or tablets ( $n=18$ ), webcams and screens ( $n=13$ ), projectors ( $n=6$ ), windshields ( $N=3$ ) [62], and custom-made AR systems, e.g. a pen, as in [57].

In 73% ( $n=47$ ) of the studies, AR is compared with one or more other media types (see Fig. 4). 29 studies, e.g., compare AR with screen and 20 studies compare AR with paper-based materials. Auditory information is contrasted with AR in four studies, real task situations in three. One study compares AR with VR.

In twelve studies (19%), an AR system is compared to another AR system and in six studies (9.4%), more than one AR system is contrasted with another medium.

Five studies (8%) study only the influence of an AR system on the cognitive load. In just two studies, a correlation is calculated and the influence of motivational or affective variables on the cognitive load while learning with AR is explored [63,64].

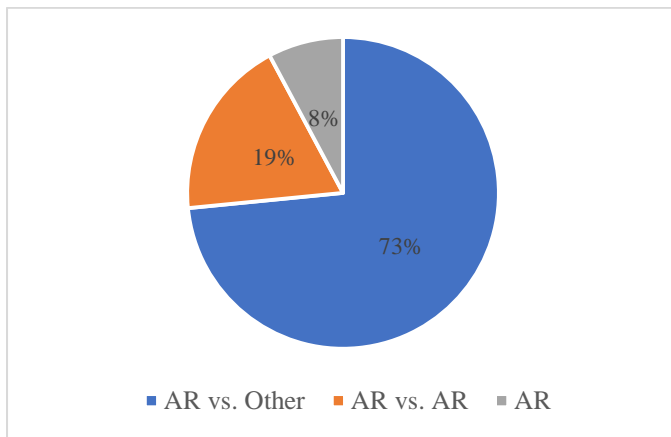


Fig. 4. Distribution according to the comparisons made

Regarding survey instruments, our mapping study shows that the Nasa Task Load Index (Nasa TLX) [65] is used in 36 studies (56.3%); either in two of these together with the Cooper Harper Workload Rating Scale [66]. Five studies (7.8%) use a questionnaire with five items on mental load and three items on mental effort (referenced as based on [67]). A similar questionnaire with two mental load items and two mental effort items (referenced as based on [31]) is used in four studies (6.3%). In another four studies (6.3%), a self-made survey instrument is used to record the cognitive load. Three studies (4.7%) each assess the cognitive load using the 9-Point Cognitive Load Scale (9-Point CLS, referenced as based on [68]) and a dual task approach [69]. The Rating Scale Mental Effort (RSME) [67] and a cognitive load subjective ratings scale (PAAS) (referenced as based on [70]) are used twice (3.1%). An adapted Nasa TLX version, the RAW-TLX [71], the Surg-TLX [72], the Cognitive Load Scale (CLS) [73], and a qualitative approach in form of an interview are chosen [28] once each (1.6%). Fig 5 provides a summary of the survey instruments used.

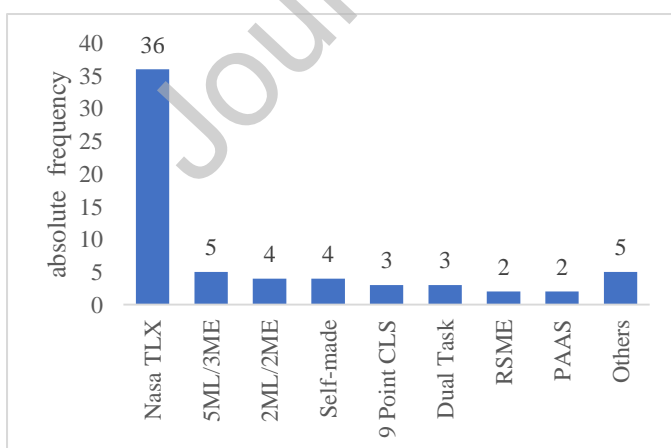


Fig. 5. Summary of the survey instruments used. The description of the abbreviations can be found in the text.

In 46 (71.9%) of the 64 studies, cognitive load is reported as overall cognitive load by using only one scale or by combining several scales.

If the Nasa TLX is used to measure cognitive load ( $n=36$ ), the overall cognitive load is reported in 31 (86.1%) of the studies. The scales of the Nasa TLX are reported with varying frequency. Data on mental demand are reported in 20 (55.6%) studies, on physical demand in 19 (52.8%), on effort and frustration in 18 (50%), and on temporal demand and performance in 17 (47.2%) studies.

In twelve studies, mental effort and mental load (18.8%) are reported.

Extraneous, germane, and intrinsic load were measured in one of the 64 studies (1.6%), task difficulty in three studies (4.7%), and psychological effort in 3.1% of the studies ( $n=2$ ).

In 24 studies (37.5%), only the overall cognitive load is reported. In 16 studies (66.7%), this is measured by using several scales, e.g. from the Nasa TLX: four times by using the scale Mental Effort, three times by using the scale Mental Load, and once by using only the scale Mental Demand.

## Discussion

The aim of this study is to map research characteristics of studies investigating the role of cognitive load during AR-enriched learning and training. As the bibliometric characteristics show, research on AR and cognitive load is an emerging field, telling by the increasing number of published studies each year. We identified a high number of existing studies addressing the issue of cognitive load while learning with AR, in contrast to the review in [40]. Researchers should be aware of this body of research when setting research questions and planning studies. Consequently, this will enable the expansion of knowledge on cognitive load and AR.

A possible extension for future studies is to include memory performance as a moderating variable. As other review studies have shown, it is neglected in research on multimedia and CL [74]. Neither did we find any study that included memory performance as an influencing variable. A possible cause is that half of the studies were conducted by authors from the same discipline. Since the assumptions of CLT are based on Baddeley's working memory model [31], we recommend for future studies the collaboration of multidisciplinary teams, especially with experts in memory research, to overcome these limitations.

The majority of the studies is conducted by researchers from Western countries and Taiwan, as geographical characteristics show. This is not only to be found in AR-based learning studies, but also in research of other educational technologies [75]. No study from an African country is available, which results in an enormous research gap. Learning is always dependent on cultural and educational realities, so there is a need for diverse findings on the use of educational technologies.

Regarding the methodological characteristics quantitative approaches are preferentially applied. Interestingly, there is also a qualitative study that reports on the risk of cognitive overload when learning with AR. This finding comes from interviews with learners after the AR intervention [28].

An exploratory research approach dominates in the studies, meaning that no hypotheses are tested but an open research question is pursued. Researchers justify this by saying that there are still few studies on AR and CLT. Therefore, it is not possible to formulate and test hypotheses. Our study, on the other hand, shows that a large number of studies on AR and CLT are already available and that it would be appropriate to test hypotheses. In addition, research on cognitive load has a long tradition, which would make hypothesis testing even in AR-enhanced learning environments reasonable [31].

With regard to the research objectives, the analysis shows, most of the studies investigate the role of cognitive load during the AR-based fostering of procedural knowledge. Here, AR serves as a supportive technology that might reduce cognitive load and thus assists the performance of different tasks. The other studies use AR to teach declarative knowledge and prove, if AR is perceived as an additional burden while learning.

As noted in the CLT, the learning environment, including the technologies used, can influence cognitive load [76]. Therefore, both the assumption of a reduction as well as an increase of CL in AR-based learning environments are worth of investigation.

However, the research designs used to investigate these assumptions are questionable. As our data shows, media comparison studies dominate in the analyzed studies, i.e. an AR system is compared to video instruction.

Media comparison studies have been criticized for over 40 years because they focus on technology rather than the actions and processes of the learners [77–81]. Reeves and Reeves [82] call this thing-oriented research, which has no impact on practice because only contradictory findings are produced. This is because media comparison studies are inherently wrong, as exactly the same conditions can never be established for the experimental and control groups [81,83,84].

Incidentally, this cannot be justified by randomized design either. In this, too, researchers believe that it is the technology that influences performance and not the actions triggered by it [85].

This belief is also not in line with the theoretical assumptions from CLT, according to which prior knowledge and the individual capacities of working memory as well as the instructional approach are decisive for learning effectiveness and not the technology used [32].

In order to generate robust insights into the role of cognitive load in learning with AR, other, usually more complex, research designs are needed. Such studies can consider the interplay of technology-method-task or investigate the effect of an AR system for learners with different prerequisites, e.g. higher vs. lower prior knowledge [81].

If media comparisons are still conducted in the future, they should at least address different learning objectives [84]. Thus, it could be assumed that AR-based 3D representations are more effective for training spatial skills than 2D paper-based illustrations. Studies with such designs do not ask any more if one technology is better than the other but address educational problems [82]. As a result, these studies provide solutions how AR may support learners to achieve specific learning goals while perceiving lower cognitive load.

In 12 studies we identified value-added or intra-media research designs that allow the investigation of such solutions. These studies compare two or more AR applications under different instructional conditions or

variations with regard to the media attributes. By focusing on learning processes and activities rather than the technologies used, these research designs are best suited for studying instructional effectiveness [86]. As an example, Lampen et al.'s study explored three different display variations when completing a task using AR glasses [54]. As it turned out, the demonstration of the task by a human avatar was the most effective support to accomplish the task and the cognitive load was also lowest in this condition. It is strongly recommended to conduct more such studies and focus more on value-added studies rather than continuing to conduct media comparisons. The described study by Lampen et al. helps to figure out how AR applications should be designed to make learning and training more effective.

With regard to the instruments used to measure cognitive load, it is noticeable that the Nasa-TLX questionnaire dominates. In principle, this questionnaire is well suited to capture the multidimensionality of cognitive load [87]. However, all scales from the questionnaire should then also be reported in the results section of the studies. As our data show, this is not the case. Rather, the reporting of the scales varies greatly without being justified by the authors. Another problem with the Nasa-TLX scale is its estimation of cognitive load level. For example, many authors find lower cognitive load scores for the AR condition, but only compared to the control condition. As describe above, mostly the control group consists of participants learning with other media or technologies. Whether the cognitive load from, for example, a paper-based instruction was high or perhaps already very low and actually not perceived as cognitively demanding is not addressed in the studies. However, this would be necessary, because otherwise no real statement can be made about whether AR actually reduces the load. When interpreting the values from the Nasa-TLX, we recommend referring to the recommendations in Grier [88] in order to be able to interpret the values found accordingly.

Furthermore, if the Nasa-TLX is used, all scales should also be reported for the readers and if not all scales are relevant, authors should justify this.

Furthermore, it is striking that the measurement of the different cognitive load types intrinsic, extraneous and germane cognitive load has not been considered so far. Only one study used a corresponding questionnaire [89]. It should be noted that currently germane load is no longer recognized as a load type on its own by some CLT researchers [31]. On the other hand, instructional design researchers continue to see great importance in measuring germane load. Namely, it allows learning designers to determine whether the interventions they develop are actually triggering the processes that promote learning [90].

For research on AR and cognitive load, it must be strongly recommended at this point to at least distinguish between intrinsic and extraneous cognitive load when measuring the cognitive affordances of AR-enhanced learning environments. Further consideration of germane load is also appropriate at this time, as there is currently no evidence of this with respect to AR technologies. Future studies should also increasingly use alternative methods to measure cognitive load, for example dual-task methods or eye tracking.

## **Conclusion**

Research on AR and cognitive load is an emerging research field that is still dominated by media comparison studies that investigate the question whether AR can be used to learn or perform better. Such studies have to be

interpreted with great care, since exactly comparable conditions can never be established. As a consequence, no conclusions can be drawn about causal relationships. As an alternative, value-added studies or studies that take into account the characteristics of the learners are suggested. Especially in the case of cognitive load, it is useful to differentiate between lower and higher prior knowledge and to examine AR systems against this background. Value-added studies are characterized by comparing two AR systems under variation of a variable, e.g., the addition of a learning strategy. Such studies help establish features and principles for designing AR applications for the purpose of learning and training.

Measurement of cognitive load is based on self-reporting scales, mostly by the Nasa-TLX. Reporting lacks any indication of whether the reported load is high or low; it is interpreted only in comparison to the control group.

Completely missing are measurements on the three cognitive load types, here further research is urgently needed. The studies should then not only be exploratory but should derive and test hypotheses based on the CLT.

Research on AR and cognitive load is a multidisciplinary research field, therefore researchers from different disciplines should also collaborate in conducting such studies.

Long-term studies are also needed to further inform practice, and such studies are not yet available in the sample of this study.

In conclusion, the characteristics found in this mapping study may shape the future of research on AR and cognitive load and can contribute to the design of more rigorous studies. This would help both research and practice.

## References

- [1] M. Akçayır, G. Akçayır, Advantages and challenges associated with augmented reality for education: A systematic review of the literature, *Educational Research Review*. 20 (2017) 1–11. <https://doi.org/10.1016/j.edurev.2016.11.002>.
- [2] M. Karakus, A. Ersozlu, A. Clark, Augmented Reality Research in Education: A Bibliometric Study, *Eurasia Journal of Mathematics, Science and Technology Education*. 15 (2019). <https://doi.org/10.29333/ejmste/103904>.
- [3] F. Arici, P. Yildirim, . Caliklar, R.M. Yilmaz, Research trends in the use of augmented reality in science education: Content and bibliometric mapping analysis, *Computers & Education*. 142 (2019) 103647. <https://doi.org/10.1016/j.compedu.2019.103647>.
- [4] T.P. Caudell, D.W. Mizell, Augmented reality: an application of heads-up display technology to manual manufacturing processes, in: *Proceedings of the Twenty-Fifth Hawaii International Conference on System Sciences*, IEEE, Kauai, HI, USA, 1992: pp. 659–669 vol.2. <https://doi.org/10.1109/HICSS.1992.183317>.
- [5] R. Azuma, Y. Baillet, R. Behringer, S. Feiner, S. Julier, B. MacIntyre, Recent advances in augmented reality, *IEEE Computer Graphics and Applications*. 21 (2001) 34–47. <https://doi.org/10.1109/38.963459>.



- [6] R. Azuma, A Survey of Augmented Reality, Teleoperators and Virtual Environments. (1997) 355–385.
- [7] M. Dunleavy, C. Dede, Augmented Reality Teaching and Learning, in: J.M. Spector, M.D. Merrill, J. Elen, M.J. Bishop (Eds.), *Handbook of Research on Educational Communications and Technology*, Springer New York, New York, NY, 2014: pp. 735–745. [https://doi.org/10.1007/978-1-4614-3185-5\\_59](https://doi.org/10.1007/978-1-4614-3185-5_59).
- [8] S. Sotiriou, F.X. Bogner, Visualizing the invisible: augmented reality as an innovative science education scheme, *Advanced Science Letters*. 1 (2008) 114–122.
- [9] M. Dunleavy, Design Principles for Augmented Reality Learning, *TECHTRENDS TECH TRENDS*. 58 (2014) 28–34. <https://doi.org/10.1007/s11528-013-0717-2>.
- [10] E. Klopfer, J. Sheldon, Augmenting your own reality: student authoring of science-based augmented reality games, *New Directions for Youth Development*. 128 (2010) 85–94.
- [11] S. Jung, J. Song, D.-J. Hwang, J.Y. Ahn, S. Kim, A Study on Software-based Sensing Technology for Multiple Object Control in AR Video, *SENSORS*. 10 (2010) 9857–9871. <https://doi.org/10.3390/s101109857>.
- [12] P.Q. Brito, J. Stoyanova, Marker versus Markerless Augmented Reality. Which Has More Impact on Users?, *International Journal of Human–Computer Interaction*. 34 (2018) 819–833. <https://doi.org/10.1080/10447318.2017.1393974>.
- [13] X. Qiao, P. Ren, S. Dustdar, L. Liu, H. Ma, J. Chen, Web AR: A Promising Future for Mobile Augmented Reality—State of the Art, Challenges, and Insights, *Proceedings of the IEEE*. 107 (2019) 651–666. <https://doi.org/10.1109/JPROC.2019.2895105>.
- [14] E. Bottani, G. Vignali, Augmented reality technology in the manufacturing industry: A review of the last decade, *IIEE Transactions*. 51 (2019) 284–310. <https://doi.org/10.1080/24725854.2018.1493244>.
- [15] K. Lee, Augmented reality in education and training, *TechTrends*. 56 (2012) 13–21.
- [16] Á. Di Serio, M.B. Ibáñez, C.D. Kloos, Impact of an augmented reality system on students’ motivation for a visual art course, *Computers & Education*. 68 (2013) 586–596. <https://doi.org/10.1016/j.compedu.2012.03.002>.
- [17] S. Giasiranis, L. Sofos, Flow Experience and Educational Effectiveness of Teaching Informatics using AR, *Educational Technology & Society*. 20 (2017) 78–88.
- [18] M.B. Ibáñez, Á. Di Serio, D. Villarán, C. Delgado Kloos, Experimenting with electromagnetism using augmented reality: Impact on flow student experience and educational effectiveness, *Computers & Education*. 71 (2014) 1–13. <https://doi.org/10.1016/j.compedu.2013.09.004>.
- [19] J.M. Keller, *Motivational Design for Learning and Performance*, Springer, Boston, MA, 2010.
- [20] J. Cabero-Almenara, R. Roig-Vila, The Motivation of Technological Scenarios in Augmented Reality (AR): Results of Different Experiments, *Applied Sciences*. 9 (2019) 2907. <https://doi.org/10.3390/app9142907>.
- [21] L. Cen, D. Ruta, L. Mahmoud Mohd Said Al Qassem, J. Ng, Augmented Immersive Reality (AIR) for Improved Learning Performance: A Quantitative Evaluation, *IEEE Transactions on Learning Technologies*. (2019) 1–1. <https://doi.org/10.1109/TLT.2019.2937525>.
- [22] S. Oh, H.-J. So, M. Gaydos, Hybrid Augmented Reality for Participatory Learning: The Hidden Efficacy of Multi-User Game-Based Simulation, *IEEE Trans. Learning Technol.* 11 (2018) 115–127. <https://doi.org/10.1109/TLT.2017.2750673>.
- [23] D. Sahin, R.M. Yilmaz, The effect of Augmented Reality Technology on middle school students’ achievements and attitudes towards science education, *Computers & Education*. 144 (2020) 103710. <https://doi.org/10.1016/j.compedu.2019.103710>.

- [24] J. Garzón, J. Acevedo, Meta-analysis of the impact of Augmented Reality on students' learning gains, *Educational Research Review*. 27 (2019) 244–260. <https://doi.org/10.1016/j.edurev.2019.04.001>.
- [25] J. Garzón, J. Pavón, S. Baldiris, Systematic review and meta-analysis of augmented reality in educational settings, *Virtual Reality*. 23 (2019) 447–459. <https://doi.org/10.1007/s10055-019-00379-9>.
- [26] H. Tekedere, H. Göker, Examining the Effectiveness of Augmented Reality Applications in Education: A Meta-Analysis, *International Journal of Environmental and Science Education*. 11 (2016) 9469–9481.
- [27] K.R. Bujak, I. Radu, R. Catrambone, B. MacIntyre, R. Zheng, G. Golubski, A psychological perspective on augmented reality in the mathematics classroom, *Computers & Education*. 68 (2013) 536–544. <https://doi.org/10.1016/j.compedu.2013.02.017>.
- [28] M. Dunleavy, C. Dede, R. Mitchell, Affordances and Limitations of Immersive Participatory Augmented Reality Simulations for Teaching and Learning, *Journal of Science Education and Technology*. 18 (2009) 7–22. <https://doi.org/10.1007/s10956-008-9119-1>.
- [29] A.-F. Lai, C.-H. Chen, G.-Y. Lee, An augmented reality-based learning approach to enhancing students' science reading performances from the perspective of the cognitive load theory, *British Journal of Educational Technology*. 50 (2019) 232–247. <https://doi.org/10.1111/bjet.12716>.
- [30] J. Sweller, Cognitive Load During Problem Solving: Effects on Learning, *Cognitive Science*. 12 (1988) 257–285.
- [31] J. Sweller, J. van Merriënboer, F.G.W.C. Paas, Cognitive Architecture and Instructional Design: 20 Years Later, *Educ Psychol Rev*. 31 (2019) 261–292. <https://doi.org/10.1007/s10648-019-09465-5>.
- [32] S. Kalyuga, A.-M. Singh, Rethinking the Boundaries of Cognitive Load Theory in Complex Learning, *Educational Psychology Review*. 28 (2015) 831–852. <https://doi.org/10.1007/s10648-015-9352-0>.
- [33] P.A. Kirschner, Cognitive load theory: implications of cognitive load theory on the design of learning, *Learning and Instruction*. 12 (2002) 1–10. [https://doi.org/10.1016/S0959-4752\(01\)00014-7](https://doi.org/10.1016/S0959-4752(01)00014-7).
- [34] R.E. Mayer, Thirty years of research on online learning, *Applied Cognitive Psychology*. 33 (2019) 152–159. <https://doi.org/10.1002/acp.3482>.
- [35] F. Paas, J. Sweller, Implications of Cognitive Load Theory for Multimedia Learning, in: R.E. Mayer (Ed.), *The Cambridge Handbook of Multimedia Learning*, Second Edition, Cambridge University Press, Cambridge, UK, 2014: pp. 27–42.
- [36] M.-B. Ibanez, A. Di-Serio, D. Villaran-Molina, C. Delgado-Kloos, Support for Augmented Reality Simulation Systems: The Effects of Scaffolding on Learning Outcomes and Behavior Patterns, *IEEE Trans. Learning Technol*. 9 (2016) 46–56. <https://doi.org/10.1109/TLT.2015.2445761>.
- [37] J.J.G. Van Merriënboer, L. Kester, The Four-Component Instructional Design Model: Multimedia Principles in Environments for Complex Learning, in: R.E. Mayer (Ed.), *The Cambridge Handbook of Multimedia Learning*, Second Edition, Cambridge University Press, Cambridge, UK, 2014: pp. 104–150.
- [38] E. Ibili, Effect of augmented reality environments on cognitive load: pedagogical effect, instructional design, motivation and interaction interfaces, *IJPE*. 15 (2019) 42–57. <https://doi.org/10.29329/ijpe.2019.212.4>.
- [39] M.M.O. da Silva, J.M.X.N. Teixeira, P.S. Cavalcante, V. Teichrieb, Perspectives on how to evaluate augmented reality technology tools for education: a systematic review, *J Braz Comput Soc*. 25 (2019) 3. <https://doi.org/10.1186/s13173-019-0084-8>.
- [40] D. Mutlu-Bayraktar, V. Cosgun, T. Altan, Cognitive load in multimedia learning environments: A systematic review, *Computers & Education*. 141 (2019) 103618. <https://doi.org/10.1016/j.compedu.2019.103618>.

- [41] P.A. Alexander, Methodological Guidance Paper: The Art and Science of Quality Systematic Reviews, *Review of Educational Research*. 90 (2020) 6–23. <https://doi.org/10.3102/0034654319854352>.
- [42] P.K. Murphy, S.L. Knight, A.C. Dowd, Familiar Paths and New Directions: Inaugural Call for Manuscripts, *Review of Educational Research*. 87 (2017) 3–6. <https://doi.org/10.3102/0034654317691764>.
- [43] M. Newman, D. Gough, Systematic Reviews in Educational Research: Methodology, Perspectives and Application, in: O. Zawacki-Richter, M. Kerres, S. Bedenlier, M. Bond, K. Buntins (Eds.), *Systematic Reviews in Educational Research: Methodology, Perspectives and Application*, Springer Fachmedien Wiesbaden, Wiesbaden, 2020: pp. 3–22. [https://doi.org/10.1007/978-3-658-27602-7\\_1](https://doi.org/10.1007/978-3-658-27602-7_1).
- [44] K. Petersen, R. Feldt, S. Mujtaba, M. Mattsson, Systematic Mapping Studies in Software Engineering, in: 2008. <https://doi.org/10.14236/ewic/EASE2008.8>.
- [45] UNESCO Institute for Statistics, International Standard Classification of Education. Fields of education and training 2013 (ISCED-F 2013) - Detailed field descriptions, Montreal QC, Canada, 2015. <http://dx.doi.org/10.15220/978-92-9189-179-5-en> (accessed February 15, 2020).
- [46] M. Mekni, A. Lemieux, Augmented Reality: Applications, Challenges and Future Trends, *Applied Computational Science*. (2014) 205–214.
- [47] J. Alves, B. Marques, M. Oliveira, T. Araujo, P. Dias, B.S. Santos, Comparing Spatial and Mobile Augmented Reality for Guiding Assembling Procedures with Task Validation, in: 2019 IEEE International Conference on Autonomous Robot Systems and Competitions (ICARSC), IEEE, Porto, Portugal, 2019: pp. 1–6. <https://doi.org/10.1109/ICARSC.2019.8733642>.
- [48] A. Bellucci, A. Ruiz, P. Díaz, I. Aedo, Investigating augmented reality support for novice users in circuit prototyping, in: *Proceedings of the 2018 International Conference on Advanced Visual Interfaces - AVI '18*, ACM Press, Castiglione della Pescaia, Grosseto, Italy, 2018: pp. 1–5. <https://doi.org/10.1145/3206505.3206508>.
- [49] B.J. Dixon, H. Chan, M.J. Daly, A.D. Vescan, I.J. Witterick, J.C. Irish, The effect of augmented real-time image guidance on task workload during endoscopic sinus surgery, *International Forum of Allergy & Rhinology*. 2 (2012) 405–410. <https://doi.org/10.1002/alr.21049>.
- [50] S.-C. Chang, G.-J. Hwang, Impacts of an augmented reality-based flipped learning guiding approach on students' scientific project performance and perceptions, *Computers & Education*. 125 (2018) 226–239. <https://doi.org/10.1016/j.compedu.2018.06.007>.
- [51] H.-C.K. Lin, M.-C. Chen, C.-K. Chang, Assessing the effectiveness of learning solid geometry by using an augmented reality-assisted learning system, *Interactive Learning Environments*. 23 (2015) 799–810. <https://doi.org/10.1080/10494820.2013.817435>.
- [52] M.W. Boyce, C.P. Rowan, P.L. Shorter, J.D. Moss, C.R. Amburn, C.J. Garneau, R.A. Sottolare, The impact of surface projection on military tactics comprehension, *Military Psychology*. 31 (2019) 45–59. <https://doi.org/10.1080/08995605.2018.1529487>.
- [53] M. Funk, T. Kosch, A. Schmidt, Interactive worker assistance: comparing the effects of in-situ projection, head-mounted displays, tablet, and paper instructions, in: *Proceedings of the 2016 ACM International Joint Conference on Pervasive and Ubiquitous Computing - UbiComp '16*, ACM Press, Heidelberg, Germany, 2016: pp. 934–939. <https://doi.org/10.1145/2971648.2971706>.
- [54] E. Lampen, J. Teuber, F. Gaisbauer, T. Bär, T. Pfeiffer, S. Wachsmuth, Combining Simulation and Augmented Reality Methods for Enhanced Worker Assistance in Manual Assembly, in: *Procedia 52nd CIRP Conference on Manufacturing Systems*, 2019: pp. 588–593. <https://doi.org/10.1016/j.procir.2019.03.160>.
- [55] Z. Yang, J. Shi, W. Jiang, Y. Sui, Y. Wu, S. Ma, C. Kang, H. Li, Influences of Augmented Reality

- Assistance on Performance and Cognitive Loads in Different Stages of Assembly Task, *Front. Psychol.* 10 (2019) 1703. <https://doi.org/10.3389/fpsyg.2019.01703>.
- [56] M. Alrashidi, K. Almohammadi, M. Gardner, V. Callaghan, Making the Invisible Visible: Real-Time Feedback for Embedded Computing Learning Activity Using Pedagogical Virtual Machine with Augmented Reality, in: L.T. De Paolis, P. Bourdot, A. Mongelli (Eds.), *Augmented Reality, Virtual Reality, and Computer Graphics. AVR 2017. Lecture Notes in Computer Science*, Springer International Publishing, Cham, 2017: pp. 339–355. [https://doi.org/10.1007/978-3-319-60922-5\\_27](https://doi.org/10.1007/978-3-319-60922-5_27).
- [57] E. Loup-Escande, R. Frenoy, G. Poplimont, I. Thouvenin, O. Gapenne, O. Megalakaki, Contributions of mixed reality in a calligraphy learning task: Effects of supplementary visual feedback and expertise on cognitive load, user experience and gestural performance, *Computers in Human Behavior.* 75 (2017) 42–49. <https://doi.org/10.1016/j.chb.2017.05.006>.
- [58] Z.-Y. Hoe, I.-J. Lee, C.-H. Chen, K.-P. Chang, Using an augmented reality-based training system to promote spatial visualization ability for the elderly, *Univ Access Inf Soc.* 18 (2019) 327–342. <https://doi.org/10.1007/s10209-017-0597-x>.
- [59] X. Wang, P.S. Dunston, Comparative Effectiveness of Mixed Reality-Based Virtual Environments in Collaborative Design, *IEEE Trans. Syst., Man, Cybern. C.* 41 (2011) 284–296. <https://doi.org/10.1109/TSMCC.2010.2093573>.
- [60] N.M. Seel, ed., Procedural Knowledge, in: *Encyclopedia of the Sciences of Learning*, Springer US, Boston, MA, 2012: pp. 2693–2694. [https://doi.org/10.1007/978-1-4419-1428-6\\_2349](https://doi.org/10.1007/978-1-4419-1428-6_2349).
- [61] N.M. Seel, ed., Declarative Knowledge, in: *Encyclopedia of the Sciences of Learning*, Springer US, Boston, MA, 2012: pp. 909–909. [https://doi.org/10.1007/978-1-4419-1428-6\\_2118](https://doi.org/10.1007/978-1-4419-1428-6_2118).
- [62] S. Kim, A.K. Dey, Simulated augmented reality windshield display as a cognitive mapping aid for elder driver navigation, in: *Proceedings of the 27th International Conference on Human Factors in Computing Systems - CHI 09*, ACM Press, Boston, MA, USA, 2009: p. 133. <https://doi.org/10.1145/1518701.1518724>.
- [63] K.-H. Cheng, Reading an augmented reality book: An exploration of learners' cognitive load, motivation, and attitudes, *Australasian Journal of Educational Technology.* 33 (2017) 53–69. <https://doi.org/10.14742/ajet.2820>.
- [64] S. Kucuk, R.M. Yilmaz, Y. Goktas, Augmented Reality for Learning English: Achievement, Attitude and Cognitive Load Levels of Students, *Education and Science.* 39 (2014) 393–404.
- [65] S.G. Hart, L.E. Staveland, Development of NASA-TLX (Task Load Index): Results of Empirical and Theoretical Research, *Advances in Psychology.* 52 (1988) 139–183. [https://doi.org/10.1016/S0166-4115\(08\)62386-9](https://doi.org/10.1016/S0166-4115(08)62386-9).
- [66] G.E. Cooper, R.P. Harper, The use of pilot rating in the evaluation of aircraft handling qualities., Ames Research Center, NASA 1969. NASA Technical Report TN D-5153, Moffett Field (CA), 1969.
- [67] F.G. Paas, Training strategies for attaining transfer of problem-solving skill in statistics: A cognitive-load approach., *Journal of Educational Psychology.* 84 (1992) 429–434. <https://doi.org/10.1037/0022-0663.84.4.429>.
- [68] F.G.W.C. Paas, J.J.G. Van Merriënboer, The Efficiency of Instructional Conditions: An Approach to Combine Mental Effort and Performance Measures, *Hum Factors.* 35 (1993) 737–743. <https://doi.org/10.1177/001872089303500412>.
- [69] R. Brünken, J.L. Plass, D. Leutner, Direct Measurement of Cognitive Load in Multimedia Learning, *Educational Psychologist.* 38 (2003) 53–61. [https://doi.org/10.1207/S15326985EP3801\\_7](https://doi.org/10.1207/S15326985EP3801_7).

- [70] F.G.W.C. Paas, J.J.G. Van Merriënboer, Instructional control of cognitive load in the training of complex cognitive tasks, *Educ Psychol Rev.* 6 (1994) 351–371. <https://doi.org/10.1007/BF02213420>.
- [71] S.G. Hart, NASA-Task Load Index (NASA-TLX); 20 Years Later., in: *Proceedings of the Human Factors and Ergonomics Society 50th Annual Meeting, HFES, Santa Monica, 2006*: pp. 904–908.
- [72] M.R. Wilson, J.M. Poolton, N. Malhotra, K. Ngo, E. Bright, R.S. Masters, Development and validation of a surgical workload measure: the surgery task load index (surg-tlx)., *World J Surg.* 35 (2011) 1961–1969.
- [73] J. Leppink, F. Paas, C.P.M. Van der Vleuten, T. Van Gog, J.J.G. Van Merriënboer, Development of an instrument for measuring different types of cognitive load, *Behavior Research Methods.* 45 (2013) 1058–1072. <https://doi.org/10.3758/s13428-013-0334-1>.
- [74] Ø. Anmarkrud, A. Andresen, I. Bråten, Cognitive Load and Working Memory in Multimedia Learning: Conceptual and Measurement Issues, *Educational Psychologist.* 54 (2019) 61–83. <https://doi.org/10.1080/00461520.2018.1554484>.
- [75] R. Bodily, H. Leary, R.E. West, Research trends in instructional design and technology journals, *Br J Educ Technol.* 50 (2019) 64–79. <https://doi.org/10.1111/bjet.12712>.
- [76] H.-H. Choi, J.J.G. van Merriënboer, F. Paas, Effects of the Physical Environment on Cognitive Load and Learning: Towards a New Model of Cognitive Load, *Educational Psychology Review.* 26 (2014) 225–244. <https://doi.org/10.1007/s10648-014-9262-6>.
- [77] R.E. Clark, Reconsidering Research on Learning from Media, *Review of Educational Research.* 53 (1983) 445–459.
- [78] R.E. Clark, D.F. Feldon, Ten Common but Questionable Principles of Multimedia Learning, in: R.E. Mayer (Ed.), *The Cambridge Handbook of Multimedia Learning, Second Edition*, Cambridge University Press, Cambridge, UK, 2014: pp. 151–173.
- [79] R.B. Kozma, Will media influence learning? Reframing the debate, *Educational Technology Research and Development.* 42 (1994) 7–19. <https://doi.org/10.1007/BF02299087>.
- [80] C. Hodges, S. Moore, B. Lockee, T. Trust, A. Bond, The Difference Between Emergency Remote Teaching and Online Learning, *Educause Review.* (2020) 12. <https://er.educause.edu/articles/2020/3/the-difference-between-emergency-remote-teaching-and-online-learning>.
- [81] D.W. Surry, D. Ensminger, What’s Wrong with Media Comparison Studies?, *Educational Technology.* 41 (2001) 32–35. <https://www.jstor.org/stable/44428679>.
- [82] T.C. Reeves, P.M. Reeves, Reorienting educational technology research from things to problems, *Learning: Research and Practice.* 1 (2015) 91–93. <https://doi.org/10.1080/23735082.2015.1008120>.
- [83] T.C. Reeves, E.G. Oh, The goals and methods of educational technology research over a quarter century (1989–2014), *Educational Technology Research and Development.* 65 (2017) 325–339. <https://doi.org/10.1007/s11423-016-9474-1>.
- [84] S.M. Ross, G.R. Morrison, D.L. Lowther, *Educational Technology Research Past and Present: Balancing Rigor and Relevance to Impact School Learning*, (2010) 20.
- [85] S.M. Ross, Delivery trucks or groceries? More food for thought on whether media (will, may, can’t) influence learning, *ETR&D.* 42 (1994) 5–6. <https://doi.org/10.1007/BF02299086>.
- [86] R.E. Mayer, *Multimedia Learning, Third Edition*, Cambridge University Press, Cambridge, UK, 2020. [cambridge.org/9781107187504](https://doi.org/10.1017/9781107187504).
- [87] T. de Jong, Cognitive load theory, educational research, and instructional design: some food for

thought, *Instr Sci.* 38 (2010) 105–134. <https://doi.org/10.1007/s11251-009-9110-0>.

[88] R.A. Grier, How High is High? A Meta-Analysis of NASA-TLX Global Workload Scores, *Proceedings of the Human Factors and Ergonomics Society Annual Meeting*. 59 (2015) 1727–1731. <https://doi.org/10.1177/1541931215591373>.

[89] M.P. Strzys, M. Thees, S. Kapp, J. Kuhn, Smartglasses in STEM laboratory courses – the augmented thermal flux experiment, in: *2018 Physics Education Research Conference Proceedings, American Association of Physics Teachers, Washington, DC, 2019*. <https://doi.org/10.1119/perc.2018.pr.Strzys>.

[90] M. Klepsch, F. Schmitz, T. Seufert, Development and Validation of Two Instruments Measuring Intrinsic, Extraneous, and Germane Cognitive Load, *Frontiers in Psychology*. 8 (2017). <https://doi.org/10.3389/fpsyg.2017.01997>.

Journal Pre-proof