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BMJ Open Digital game-based interventions for cognitive training in healthy adults and adults with cognitive impairment: protocol for a two-part systematic review and meta-analysis

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ABSTRACT

Introduction Digital game-based training interventions are scalable solutions that may improve cognitive function for many populations. This protocol for a two-part review aims to synthesise the effectiveness and key features of digital game-based interventions for cognitive training in healthy adults across the life span and adults with cognitive impairment, to update current knowledge and impact the development of future interventions for different adult subpopulations.

Methods and analysis This systematic review protocol follows the Preferred Reporting Items for Systematic Reviews and Meta-Analyses Protocols guidelines. A systematic search was performed in PubMed, Embase, CINAHL, Cochrane Library, Web of Science, PsycINFO and IEEE Explore on 31 July 2022 for relevant literature published in English from the previous 5 years. Experimental, observational, exploratory, correlational, qualitative and mixed methods studies will be eligible if they report at least one cognitive function outcome and include a digital game-based intervention intended to improve cognitive function. Reviews will be excluded but retained to search their reference lists for other relevant studies. All screening will be done by at least two independent reviewers. The appropriate Joanna Briggs Institute Critical Appraisal Tool, according to the study design, will be applied to perform the risk of bias assessment. Outcomes related to cognitive function and digital game-based intervention features will be extracted. Results will be categorised by adult life span stages in the healthy adult population for part 1 and by neurological disorder in part 2. Extracted data will be analysed quantitatively and qualitatively, according to study type. If a group of sufficiently comparable studies is identified, we will perform a meta-analysis applying the random effects model with consideration of the I² statistic.

Ethics and dissemination Ethics approval is not applicable for this study since no original data will be collected. The results will be disseminated through peer-reviewed publications and conference presentations.

STRENGTHS AND LIMITATIONS OF THIS STUDY

- ⇒ We will adhere to the rigorous methodology in accordance with the most recent Preferred Reporting Items for Systematic Reviews and Meta-Analyses
- ⇒ The search strategy was developed in consultation with an experienced research librarian and customised for seven databases.
- ⇒ The focus on cognitive outcomes and digital gamebased intervention features will allow for in-depth analysis and insights for developing future interventions for specific populations.
- ⇒ This systematic review may be limited in power for generalisation if a limited number of studies are reported either for each adult life span stage or for each neurological disorder of interest.
- ⇒ The English language restriction may exclude relevant studies reported in other languages.

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INTRODUCTION

Although cognitive function improves early in life, it begins to decline as we age.¹ While cognitive impairments associated with normal ageing may manifest in adults, these impairments are generally not so severe that they negatively impact daily functioning and quality of life (QoL). However, abnormal ageing and various neurological disorders can result in cognitive impairments, which, in turn, may reduce self-reported QoL in some individuals.^{2 3} Reduced cognitive function has been reported to be associated with lower self-reported QoL in older adults with subjective cognitive impairment,⁴ mild cognitive impairment (MCI),² dementia,^{2 3} stroke⁵ and high-grade glioma.⁶ As the global population





ages and life expectancy increases, the incidence of such neurological disorders with associated cognitive impairment will also rise. For example, improving survival rates post stroke is expected to lead to an increase in vascular and poststroke dementias. Moreover, anticipated trends in smoking, high body mass index and high blood sugar are forecasted to triple dementia prevalence to more than 152 million people by 2050 globally, with eastern sub-Saharan Africa, North Africa, and the Middle East projected to see the highest increase in prevalence. Further, it is expected that MCI could double the mortality risk. Thus, identifying effective strategies for improving cognitive function in both healthy adults across the life span and those with cognitive impairment is increasingly valuable.

There is evidence that cognitive training can improve cognitive functions in healthy adult populations, suggesting that the ageing brain is still amenable to neuronal and cognitive plasticity. 11 It is also thought that cognitive training may delay the onset and progression of the cognitive impairment associated with some neurological disorders, which is projected to significantly reduce the global burden of the disease. 12 With mobile technologies being widely available, affordable and popular, ¹³ there is great potential to harness digital game-based training for cognitive health. For instance, several studies have shown the potential benefits of digital games for other aspects of health, such as mental health, and there has been a recent increase in interactive software programmes created with claims of their ability in improving fundamental aspects of cognition over the last decade. 14 While some studies on digital game-based cognitive training have reported no evidence that participants experience improvement after cognitive training, 15 16 others have demonstrated promising improvements across several cognitive outcomes, specifically: multiple domains, processing speed and reaction time, memory, task-switching/multitasking, mental spatial rotation, top-down attention and spatial cognition, which highlights the potential in digital game-based cognitive training.

While multiple systematic reviews and meta-analyses investigating the effects of digital game-based interventions on cognitive functioning for specific age groups 17 18 or conditions 16 have been published, there is a lack of similar evidence syntheses of such investigations in healthy individuals by stages of the adult life span and by adults with neurological disorders associated with cognitive impairment. Further, these published reviews with specific groups are siloed, making it challenging for future game-based intervention developers to be well informed. For example, one review published in 2018¹³ synthesised the evidence of video game training on cognitive and emotional skills in a healthy adult population from 18 to 59 years old published between 2013 and 2018 but did not explore effects by age groups across the life span. Moreover, the COVID-19 pandemic, starting in late 2019, gave rise to a significant increase in digital health technologies, 19 therefore a comprehensive review

including recent digital game-based interventions from the last few years is warranted.

With this in mind, we aim to undertake a systematic review of the recent literature on digital game-based cognitive training interventions from the last 5 years. Specifically, our research objectives are: (1) to evaluate the effectiveness of digital game-based interventions for improving cognitive function and (2) to identify the key features of these digital game-based cognitive interventions. We will synthesise the findings from these research objectives by two broad population groups: (1) healthy adults across the adult life span and (2) adults with neurological disorders with associated cognitive impairment. We aim to report the results in a two-part review—one for each of the populations mentioned—and perform a meta-analysis if sufficiently comparable studies are identified. The proposed protocol to conduct this two-part systematic review with meta-analyses is detailed below.

METHODS AND ANALYSIS

This systematic review will be conducted and reported following the 2020 Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) guidelines.²⁰ The current reported protocol adheres to the PRISMA Protocols reporting guidelines (online supplemental appendix 1).²¹

ELIGIBILITY CRITERIAType of studies

Experimental, observational, exploratory, correlational, qualitative (where a cognitive training game is being developed and/or assessed for acceptability, feasibility, usability, etc), and mixed methods studies will be eligible as long as they report one of the five cognitive domains 22 23 (namely executive function, perceptual-motor function, language, learning and memory, and complex attention) and include at least one digital game-based intervention intended for cognitive training. Reviews will be excluded but retained in order to search their reference lists for other relevant studies. Randomised control trials will be considered for meta-analyses and all other study types will be synthesised narratively. We will include studies from all settings (e.g., home, community, hospital ward, long-term care facilities, etc.).

Types of participants

For part 1 of the review, participants will include healthy adults (18+) across all stages of the adult life span. For part 2 of the review, participants will include adults with prevalent neurological disorders with associated cognitive impairment, specifically: MCI, dementia, Alzheimer's disease, stroke and brain tumours.

Type of interventions

Digital game-based interventions intended for cognitive training are defined as any computerised tasks for



the specific purpose of improving at least one cognitive function: executive function, perceptual-motor function, language, learning and memory, and complex attention.

Type of control

For relevant study designs, the comparison intervention can include passive or active controls digital game-based interventions, placebo intervention, no intervention or standard of care.

Type of outcomes

Our primary outcome measures will be cognitive function and digital game-based intervention features to address our research questions. Our secondary outcome measures will include study design/implementation features and any potential game-based digital biomarkers for cognitive function. Specifically, digital biomarkers will be defined as objective, quantifiable physiological and behavioural data collected from the digital game-based intervention that may offer the ability to detect changes in cognitive function. ^{22 23}

INFORMATION SOURCES

A systematic search was performed by two independent reviewers (S-BT and JT) in PubMed, Embase, CINAHL, Cochrane Library, Web of Science, PsycINFO and IEEE Explore on 31 July 2022 to identify relevant literature published from January 2017 to July 2022. A customised search strategy following the Population, Intervention, Control, and Outcomes method was applied in each database in consult with a research librarian and tailored according to the specific database requirements. The searches were limited to publications in the English language. Where applicable, the type of publication was limited to academic journals, articles in the press and conference papers, but not abstracts or trial registrations. The reference lists of studies meeting the inclusion criteria will be searched to identify additional relevant studies. After full-text screening, eligible articles will be separated by part 1 and part 2 populations for analyses.

SEARCH STRATEGY

The searches for each specific database are available in the online supplemental appendix 2.

The search terms used were:

1. Digital games

Types of games: digital, online, video, computer games, interactive, serious, mobile, tablet, app-based, web-based, handheld, console, commercial, multiplayer, single player, video, mobile, simulation, cognitive, training

Gaming genre: platforming, shooters, strategy games, racing games, real-time strategy, simulation and sports, survival, horror, puzzles, party, etc.

- Game device: digital device, smartphone, tablet, simulator, Kinect, computer, virtual reality, handheld device, console, controllers, keyboard, augmented reality
- 2. Cognitive training and functioning: cognitive training, cognition, cognitive task, memory, learning, executive function, language, perceptual-motor function, complex attention, attention, sustained attention, divided attention, selective attention, processing speed
- 3. Adult: adults, 18+, seniors, elderly, middle-aged, early middle-aged, late middle-aged, young adults.

4. (1) AND (2) AND (3).

The search was developed in consultation with an experienced research librarian at the National University of Singapore and incorporated controlled vocabulary terms for each specific database searched.

DATA RECORDS AND MANAGEMENT

Initial searches were performed by one reviewer. All duplicate removal and screening will be completed using Covidence (a web-based systematic review software available at www.covidence.org). To date, at least two reviewers have applied eligibility criteria to titles and abstracts. At least two reviewers will next apply eligibility criteria to the full-text articles. Any discrepancies will be addressed by a third independent reviewer. Reasons for the exclusion of studies will be recorded during the full-text screening phase.

Two reviewers will independently extract study data, with findings compared and agreed on. A bespoke data extraction spreadsheet (Excel) will be adapted and modified from Pallavicini et al. 13 Data will be coded into three broad categories: (1) cognitive function outcomes; (2) digital game-based intervention outcomes; and (3) study outcomes. Cognitive function outcomes include but are not limited to domain; memory; working memory; episodic memory; near transfer; far transfer; general intelligence; processing speed; reaction timing; taskswitching/multitasking; mental spatial rotation; inhibition control; attention; executive function; visuospatial function; language; speed attention; numeric reasoning; potential digital biomarkers; global cognition; QoL. Digital game-based intervention outcomes include but are not limited to game category; game genre; platform of delivery; the number of players; the primary purpose of the game; gamification features; game description; duration of intervention; frequency of intervention; prescription of game. Study outcomes include but are not limited to: abstracts; the aim of the study; study design; population; diagnosis and inclusion/exclusion criteria for patients (for part 2); course and duration of conditions/symptoms (for part 2); other medical diagnoses; the number of patients: screened, eligible, ineligible, enrolled, randomised to the intervention, randomised



to control, excluded post randomisation, withdrawn, lost to follow-up, included in the analysis and each outcome measures; age; gender; geographic location (city/state/country); ethnicity; measures used for cognitive assessment; setting of training; adverse events. If data to be extracted are missing, incomplete or unclear, inquiries will be sent to the authors.

EFFECT MEASURES

We will report the treatment effects between the intervention and control groups as the mean difference (MD) for continuous data and risk ratio for dichotomous data with accompanying 95% CIs. For continuous data on target outcomes, a generic inverse variance random effects model will be used to pool the MD with 95% CI. It is anticipated that the units of the outcome measures used across studies may not be consistent and therefore it is likely that we will report the effects as standardised MD rather than MD. For dichotomous data, a random effects method will be used to pool the summary risk ratio with 95% CI. An overall effect size of 0.2–0.5 will be regarded as small, 0.5–0.8 as moderate and more than 0.8 as large. If means but not SD have been reported, we will attempt to calculate the SD from the information reported.

RISK OF BIAS

Two reviewers will assess the risk of bias, independently. Due to the heterogeneity of possible included studies, we cannot state beforehand if one specific tool to assess the risk of bias is sufficient. Therefore, we will retrieve and use the appropriate Joanna Briggs Institute Critical Appraisal Tool (JBICAT), from https://jbi.global/critical-appraisal-tools at the study level according to the study design. If disagreements between reviewers arise, they will be solved either through discussion or with the help of a third reviewer. Answering all questions of JBICAT will lead to a classification for each study, following the system of classification of low risk of bias (all criteria are met), moderate risk of bias (two criteria are not met or remain unclear) or high risk of bias (three or more criteria are not met or remain unclear).

DATA SYNTHESIS

For part 1 of the review, individual studies will be combined and grouped by the different stages across the healthy adult life span, which is anticipated to be young adults, middle-aged adults and the elderly. For part 2 of the review, individual studies will be combined and grouped by the neurological disorder of interest, specifically MCI, dementia, Alzheimer's, stroke, and brain tumours. All statistical tests and overall effect sizes will be conducted and estimated using Review Manager 5, Version 5.4 (The Cochrane Collaboration, 2020).

First, a narrative synthesis and descriptive statistics will be provided in the text and tables to summarise the

study characteristics and results. If further quantitative synthesis is appropriate, we will perform a meta-analysis on groups of studies with sufficiently comparable intervention and cognitive outcome, if identified, by applying the intention-to-treat principle. We will assess between study heterogeneity using the I2 statistic, which describes the percentage of variability in effect estimates due to heterogeneity rather than chance. Thresholds for I2 will be >30% for moderate heterogeneity, >50% for substantial heterogeneity and >75% for considerable heterogeneity. Sensitivity analysis will be conducted according to overall study quality which will be split into three categories of low risk of bias, some concerns and high risk of bias, by comparing random and fixed-effect models and by excluding possible outlying studies, for example, if the visual inspection of the forest plot shows poorly overlapping CIs. The possibility of publication bias will be explored by constructing funnel plots and by conducting the Egger's test²⁵ for analyses that contain more than 10 studies.

Confidence in cumulative evidence

The quality of the effect estimates for each reported outcome will be assessed using the Grading of Recommendations, Assessment, Development, and Evaluation approach²⁶ by two reviewers. Possible disagreements will be assessed by a third reviewer.

PATIENT AND PUBLIC INVOLVEMENT

None.

ETHICS AND DISSEMINATION

Ethics approval is not applicable for this study, since no original data will be collected. The results will be disseminated through peer-reviewed publications and conference presentations.

DISCUSSION

While digital game-based cognitive training interventions may be beneficial in improving outcomes in the adult population, there is a lack of investigation of such effects by age group and by neurological disorders with associated cognitive impairment. A greater understanding of the effectiveness and features of these interventions based on different subpopulations will be useful to inform developers of such interventions for specific subpopulations.

This systematic review and meta-analysis will update the existing knowledge on the effectiveness and key features of digital game-based interventions for cognitive training, with comprehensive analysis in terms of healthy adults across the phases of the adult life span and adults with cognitive impairment. In addition to contributing to the understanding of digital game-based interventions for cognitive training, this review aims to build on the methodology of earlier similar reviews ¹³ ¹⁶⁻¹⁸ while adhering



to the most recent rigorous guidelines detailed in the PRISMA 2020 statement.²⁰ This methodology can be usefully reproduced by other researchers undertaking similar reviews in other contexts.

However, our proposed review is not without limitations. For instance, while our comprehensive search strategy was developed in consultation with a university research librarian for seven relevant databases, we will limit included studies to those published in English. This language restriction may exclude relevant studies published in non-English languages, which may limit our future findings and, as such, we encourage other research teams undertaking similar reviews with relevant capabilities to consider non-English publications. Finally, while we do aim to provide a comprehensive understanding of digital game-based interventions for cognitive training, the resulting systematic review and meta-analyses may be limited in power for generalisation if only a limited number of or low-quality studies are reported either for each adult life span stage or each neurological disorder of interest. In spite of this, the overall results may impact the future development of digital game-based interventions for cognitive training for different subpopulations of adults and may encourage more robust research in understudied subpopulations.

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Contributors S-BT, JT, MNR and AR designed the protocol. S-BT, MNR and AR wrote the first draft of the protocol. S-BT, JT, MNR, BR and AR designed the search, and S-BT and JT performed the searches. All authors, S-BT, JT, MNR, JCWL, BR, AR and DH, provided critical appraisal regarding the design of the systematic review and revised the manuscript. All authors approved the final version of the protocol.

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Competing interests DH and S-BT are coinventors of previously filed pending patents on artificial intelligence-based therapy development. DH is a shareholder of KYAN Therapeutics, which has licensed intellectual property pertaining to Al-based oncology drug development and personalised medicine.

Patient and public involvement Patients and/or the public were not involved in the design, or conduct, or reporting, or dissemination plans of this research.

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