Review

Developing Embodied Conversational Agents for Coaching People in a Healthy Lifestyle: Scoping Review

Lean L Kramer^{1,2}, MSc; Silke ter Stal^{3,4}, MSc; Bob C Mulder², PhD; Emely de Vet¹, PhD, Prof Dr; Lex van Velsen³, PhD

¹Consumption and Healthy Lifestyles, Wageningen University & Research, Wageningen, Netherlands

²Strategic Communication, Wageningen University & Research, Wageningen, Netherlands

³eHealth Cluster, Roessingh Research and Development, Enschede, Netherlands

⁴Faculty of Electrical Engineering, Mathematics and Computer Science, University of Twente, Enschede, Netherlands

Corresponding Author:

Lean L Kramer, MSc Consumption and Healthy Lifestyles Wageningen University & Research PO Box 8130 Wageningen, 6700 EW Netherlands Phone: 31 17484310 Email: <u>lean.kramer@wur.nl</u>

Abstract

Background: Embodied conversational agents (ECAs) are animated computer characters that simulate face-to-face counseling. Owing to their capacity to establish and maintain an empathic relationship, they are deemed to be a promising tool for starting and maintaining a healthy lifestyle.

Objective: This review aimed to identify the current practices in designing and evaluating ECAs for coaching people in a healthy lifestyle and provide an overview of their efficacy (on behavioral, knowledge, and motivational parameters) and use (on usability, usage, and user satisfaction parameters).

Methods: We used the Arksey and O'Malley framework to conduct a scoping review. PsycINFO, Medical Literature Analysis and Retrieval System Online, and Scopus were searched with a combination of terms related to ECA and lifestyle. Initially, 1789 unique studies were identified; 20 studies were included.

Results: Most often, ECAs targeted physical activity (n=16) and had the appearance of a middle-aged African American woman (n=13). Multiple behavior change techniques (median=3) and theories or principles (median=3) were applied, but their interpretation and application were usually not reported. ECAs seemed to be designed for the end user rather than with the end user. Stakeholders were usually not involved. A total of 7 out of 15 studies reported better efficacy outcomes for the intervention group, and 5 out of 8 studies reported better use-related outcomes, as compared with the control group.

Conclusions: ECAs are a promising tool for persuasive communication in the health domain. This review provided valuable insights into the current developmental processes, and it recommends the use of human-centered, stakeholder-inclusive design approaches, along with reporting on the design activities in a systematic and comprehensive manner. The gaps in knowledge were identified on the working mechanisms of intervention components and the right timing and frequency of coaching.

(J Med Internet Res 2020;22(2):e14058) doi: 10.2196/14058

KEYWORDS

embodied conversational agent; virtual agent; lifestyle; health behavior; eHealth; chatbots

Kramer et al

Introduction

Background

Public health would substantially improve if a large number of people adopted a healthy lifestyle, encompassing among others, ample physical activity, and healthy diets [1]. To initiate or coach such change, embodied conversational agents (ECAs) can be a valuable tool. ECAs can be defined as "more or less autonomous and intelligent software entities with an embodiment used to communicate with the user" [2]. Examples include those given in Figure 1; From left to right: *Laura* [3], *Gabby* [4], and an anonymous octopus [5]. An example of an

Figure 1. Example of embodied conversational agents.

early ECA is *Laura* [3]. Laura interacts daily with users to motivate them to be more physically active. She uses several relational behaviors, such as social dialogue, feedback, humor, facial expressions, and body language. Through these behaviors, users establish and maintain a meaningful relationship [3]. What makes ECAs unique for coaching people with respect to their health is this capacity of establishing and maintaining an empathic relationship [3], a relationship characteristic proven to be the most crucial factor for successful lifestyle coaching [6]. In addition, ECAs are available 24×7. Consequently, they can offer empathic support when it matters most: immediately before or after specific behavior, which maximizes impact [7].



Despite the promising role ECAs can play in coaching people for a healthy lifestyle, literature that discusses how to develop them and demonstrates their effectiveness is scarce. A review by Provoost et al [8] provides some insight into the developmental processes and evidence base of ECAs for coaching people with mental disorders. They suggest that the more rigorous studies put little emphasis on design and that evidence on clinical effectiveness remained sparse [8]. In the educational context, Johnson and Lester [9] state that there is a significant body of experience and research findings related to pedagogical agents. However, similar to the health context, many questions remain about when pedagogical agents are most effective and how they should be designed and used to maximize effectiveness. Literature on development and effectiveness is essential to create ECAs that can have a high level of impact and uptake, a problem with which electronic health (eHealth) interventions constantly struggle [10]. The cause for this low impact and uptake is often attributed to a misfit among technological, human, and contextual factors during development [11,12]. Different authors have therefore recommended to apply human-centered and а stakeholder-inclusive design approach, as well as to incorporate persuasive design features in the technology [11,13,14].

Objectives

RenderX

This scoping review identifies the current developmental practices of ECAs for coaching people in a healthy lifestyle,

```
https://www.jmir.org/2020/2/e14058
```

and it provides an overview of their efficacy and use-related outcomes. For researchers, this review provides an overview of the potential ECAs have to change people's lifestyle and identifies the most urgent research questions related to this domain. For practitioners, the review will lead to actionable advice for devising a development trajectory for this type of ECAs.

Methods

Study Design

The Arksey and O'Malley framework for scoping reviews [15] was adopted, which distinguishes 5 different stages: (1) identifying the research question, (2) identifying relevant studies, (3) selecting studies, (4) charting the data, and (5) collating, summarizing, and reporting the results.

Identifying the Research Question

The research question was identified from a preliminary scan of the literature, which showed a lack of insight into and description of best practices regarding the current development processes. The question that will be answered is as follows: How are ECAs for coaching people in a healthy lifestyle designed and evaluated?

Identifying Relevant Studies

To identify relevant studies, a data logbook was created, comprising specific instructions, a plan, a term list, and a data-charting form. The databases used to locate the relevant literature were as follows: PsycINFO, because of its comprehensive library of psychological science; Medical Literature Analysis and Retrieval System Online, because of its wide coverage of scientific journals in the health domain; and Scopus, because of its multidisciplinary scope. The databases were searched for peer-reviewed journal articles written in English, with a combination of terms related to *ECA* and *lifestyle*. The keywords were identified based on a preliminary literature scan and in consultation with a research librarian to obtain a comprehensive list of potential sources (see Multimedia Appendix 1). In addition, we applied the snowball method.

Study Selection

Inclusion criteria were implemented by selecting different options and limits during the search (see Multimedia Appendix 1). The results of the search query were uploaded into the EndNote reference manager (Thomson Reuters) and independently assessed by 2 reviewers (LK and SS) to decide on their inclusion based on title, abstract, and full text. Conflicts between the 2 reviewers were identified after each step, independently; arguments were formulated per study and then discussed and resolved. This process was documented in the logbook. To find relevant studies that describe an intervention with an ECA in the healthy lifestyle domain, the following exclusion criteria were applied: (1) there is no report on primary data, (2) there is no intervention, (3) the intervention does not include an ECA (a "more or less autonomous and intelligent software entities with an embodiment used to communicate with the user") [2], and (4) the ECA is not used in a lifestyle health behavior context (eg, tobacco use, physical (in)activity, alcohol consumption, and diet) [4].

Charting the Data and Collating and Summarizing the Results

Data from the selected studies were charted independently by 2 reviewers (LK and BM). The following categories were a part of the data-charting form: (1) article information, (2) study information, (3) general description of an ECA, (4) information regarding the visual design and content, (5) support offered by the ECA, (6) information procedures to introduce the ECA to its user, and (7) formative evaluation. Each category could be completed by selecting the applicable predefined content, based on the study by Provoost et al [8] (see Multimedia Appendix 2 for all options). Conflicts between reviewers were identified and resolved by jointly reviewing the component and discussing the conflict, and these were documented in the logbook. When all the studies had been inventoried, we analyzed them thematically, which resulted in 3 topics. The first topic describes the different definitions and descriptions that were used for ECAs. The second topic describes the design and design

processes of the ECAs, including their embodiment and communication modalities, applied theories, principles, and behavior change techniques (BCTs). To create a uniform language among the BCTs, the BCT Taxonomy (v1) from Michie et al [16] was used. The third topic describes the procedures, evaluation processes, and the efficacy and use-related outcomes.

Results

Study Selection and Characteristics

Figure 2 charts the screening and selection process. In total, 1789 unique studies were identified in the database search. Title and abstract screening resulted in the exclusion of 1754 studies. The remaining 35 studies were screened in full. Of those, 19 studies were excluded as the studies were not an intervention or did not include an ECA. This resulted in a total of 16 studies. One of these studies [4] described both a rehospitalization and a physical activity trial. As the first is not a lifestyle behavior, only the second trial was included in the analysis. A total of 4 more studies were found through snowballing [17-20]. This resulted in a total of 20 studies that were included in this review (see Multimedia Appendix 3 for a complete overview of the study characteristics).

The first studies were published in 2005 [3,17,21]. All the studies were either performed in the United States [3,4,17-19,21-31] or in the Netherlands [5,20,32,33]. Of all the studies performed in the United States, except for 1 study [26], TW Bickmore was listed as the author. A total of 13 studies were in the pilot phase [3,4,17-19,21,24-26,28,30-32], 1 study was in the development phase [22], and 6 studies were in in the evaluation phase [20,23,27,29,31,32]. Thus, none of the studies described the implementation or had actually implemented their ECA in practice. One ECA was used in a community setting and could be accessed via a computer kiosk [29]. All other ECAs were used at home and could be accessed via a website [20,24,26,28,30-32], or software installed on a PC [3,17,19,21-23,25], tablet [4,18,27], or mobile phone [33]. Only 1 ECA was part of an overarching platform, accessible via a website and an Android app [5]. Most studies targeted physical activity [3-5,17-23,25,27,29-33]. Other lifestyle behaviors were nutrition [5,20,25,30], mindfulness [26,30], preconception care [24,28], stress [30], blood glucose monitoring [5], and sun protection [31]. Moreover, one specific study targeted healthy lifestyles among diabetes patients. Patients may differ in their needs for lifestyle support compared with healthy individuals. The diversity in focus and target groups limits the comparability among the studies, and future research could help expand the evidence base for specific ECAs. Study designs varied from a randomized controlled trial (RCT) [3,4,17,19-23,25-30,32,33] to a pretest-posttest design, either with [31] or without control a control group [5,18,30]. Sample size ranged from 9 to 958 participants (median=60.5). Study duration lasted from 4 weeks to 36 months (median=8 weeks).



Figure 2. Flowchart describing study screening and selection.



Descriptions and Definitions

Across the studies, 9 different names were used to describe an ECA, although the definitions were rather similar. A total of 6 studies used the name *embodied conversational agent* [3,4,19,26,27,30], whereas the other studies used different names: *relational agent* [3,17,21,22,31], *virtual coach* [5,23], *virtual exercise coach* [18], *virtual avatar* [32], *virtual patient advocate* [24], *conversational agent* [28], *animated conversational agent* [25], *virtual advisor* [29], *personal digital coach* [33], and *persuasive computer assistant* [20]. A total of 6 studies did not provide a definition for an ECA [5,17,20,23,25,32]. All other studies referred to earlier with TW Bickmore listed as the author used variations of "an interactive, animated computer character that simulates face-to-face counseling" [5].

Design and Design Processes

Design: Embodiment, Communication Modality, Content, and Communication Strategy

All studies provided a screenshot of the agent. These images show that the embodiments of all ECAs were rather similar; 13 ECAs had the appearance of a middle-aged African American woman: 3 agents had an appearance similar to *Laura* [3,17,21], 6 agents were similar to *Gabby* [4,18,24,27,28,30], and 5 agents were similar to *Carmen* [19,22,23,25,29]. Other ECAs were a white woman [26,32,33], a cat (the virtual iCat) [20], and an octopus [5]. In addition, 1 study used 4 different ECAs, using

```
https://www.jmir.org/2020/2/e14058
```

race and gender to match participants to one of the agents [31]. Thus, in total, there were 9 different agents. These agents communicated through text [5,19,20,32] or speech [3,24,31], or they allowed the user to choose between text or speech [33]. For the iCat, no information was provided [20]. Regarding the communication modalities, all but 1 agent [5] used facial and gaze expressions; in addition, only a few used hand and body gestures [3,31]. Most users communicated with the agent by choosing a single response from a fixed list of responses [3,19,24,26,32]. Some agents also offered the possibility to type an answer in a textbox [26,32]. A total of 2 studies did not provide any information on how users could communicate with the agent [20,31].

Behavioral theories or therapy-derived principles were applied in a majority of the ECAs to drive their content and communication strategy. In total, 17 different theories and principles were mentioned in the 20 studies (median=3, range 1-4; see Multimedia Appendix 3 for an overview). A total of 3 studies did not mention any theory or principle [4,22,27], whereas the remaining studies did not discuss their interpretation or application. It is therefore unclear what role theories play in the design process. The Transtheoretical Model was mentioned most often [17,19,24,25,28,29,31,33]; its application was, for example, described as "educational information based on current progress" [19]. Other theories or principles used more than once were as follows: Motivational Interviewing [20,25,28,30,32], for example, "cooperative feedback on the diary entries following the motivational interviewing concept" [20]; Social

XSL•FO RenderX

Cognitive Theory [19,23,25,29] and Behavioral Theory [17,23], for example, "the script employs behavioral and social cognitive strategies demonstrated in the literature to promote exercise behavior change" [23]; and Cognitive Behavioral Therapy [17,18], for example, "the agent (...) uses a number of additional cognitive-behavioral techniques for health behavior change" [17]. In addition to or based on the theories and principles, the content and communication strategy also comprised BCTs. In total, 24 different BCTs were mentioned in the 20 studies (median=3, range 2-10; see Multimedia Appendix 3 for an overview). Again, 3 studies did not report any techniques [3,21,22]; the remaining studies did so very briefly. Furthermore, no uniform language was used to describe BCTs; therefore, it remained unclear how the BCTs were operationalized. Goal setting was mentioned most often [4,5,17-20,23,25,27-32], and it was, for example, described as "weekly goals for exercise" [31]. Other frequently used BCTs were information about health consequences [5,17-20,23-26,28,30,32],for example, "educational content about physical activity" [17]; problem solving [17,18,23,25-28,30-32], for example, "tailored strategies that addressed related barriers" [31]; social reward [5,17,19,20,23,26,27,29,31], example, for "positive reinforcement" [23]; feedback on behavior [4,5,18-20,29,31,33], for example, "feedback about the behavior of the users" [33]; social support (practical) [5,18,27,28,30,31,33], for example, "exercise tip of the day" [18]; and self-monitoring of behavior [5,17,20,29,31,33], for example, "self-monitoring charts" [27].

Design Processes

Regarding the design processes of the embodiment and communication modalities of the 9 different ECAs, 5 studies did not provide any information [19,20,26,31,33]. There was 1 study that provided some information, although very briefly: "The design of the gamification and coaching platform adheres to basic principles of healthcare, design principles for serious gaming as well as design principles for behavior change support systems" [5]. The remaining 3 studies did provide detailed information. A total of 2 studies reported on the design and the results of a focus group with end users, which resulted in the current appearance of the agent [24,32]. The third study reported on the findings of various design methods: "Studies of interactions between human exercise trainers and their clients," a survey with end users and a literature review [3].

Regarding the design process of the content and communication strategies of the 20 ECAs, 9 studies did not provide any information [4,5,18,19,25-27,29,31]. In all, 2 studies [22,28] referred to other publications [17,24], which were also included in this review. Two studies each referred to a study, which is not part of this review, in which the design process is described: The first study [32] refers to a publication describing a pilot study on autonomous motivation and appreciation [34], and the second study [32] refers to a publication describing a survey with end users on the situation and timing of feedback [35]. A total of 3 studies provided some, very brief, information: "The ECA system for this study was adapted from the Gabby Preconception Health Care system's dialogue scripts and media" [30]; "Both the personal lifestyle goals and the feedback were evaluated and improved where necessary by a dietician" [20];

and "The 60 pages of educational content were assembled from publicly available web pages on exercise topics (...)" [3]. A total of 3 similar studies provided only some brief information, but these did include an interdisciplinary collaboration involving physicians, computer scientists, and exercise trainers to ensure adherence to best practices [17,21,23]. A final study used multiple methods and provided detailed information. It describes how they used scripts and media tools from previous studies and reports on a focus group in which they tested the content with end users [24].

Evaluation Processes and Outcomes

Evaluation Processes: Procedures and Measurement

A total of 7 studies did not provide any information regarding the procedures that were undertaken to introduce the ECA to its user [20,21,23,26,28,31,32]. The remaining studies only provided a short description. Most of the studies that did provide some information described a demonstration on how to use the system, which took place at the start of the study [3-5,17-19,22,25,27,29,30], for example, "participants were instructed on how to use the ECA system" [23]. For 1 study, participants were given "a brief group demonstration" [24]. However, another study sent "a user manual about the installation of the software" via email [33]. Another study sent instructions via email after 3 days of use [20]. Only 2 studies reported on assisting the user with user problems during the study: 1 study described contacting the user when the user stopped using the ECA [23]; the other study involved set times to check for technical issues [18].

Contrary to the procedures, the measurement of efficacy (behavioral, knowledge, and motivational parameters) and use (usability, usage, and user satisfaction parameters) was well described in all the studies (see Multimedia Appendix 2 for concept definitions, Multimedia Appendix 3 for an overview of all parameters, and Table 1 for a summary).

All the studies assessed a combination of multiple parameters (median=4.5, range 2-6). One study [29] only described a protocol [19]; therefore, it was not considered in this section.

Regarding the efficacy parameters, behavior was assessed in all but 5 studies [4,5,24,26,31]. An example is the number of steps assessed by either a pedometer [3,17,21-23,25,27] or activity monitor [33]. Behavior was also assessed by self-report, usually in a questionnaire format [17,19,21,23,25,28,32], for example, "the usual weekly minutes of walking over the previous 4 weeks" [19]. Furthermore, a walking test for both distance and speed was used in 1 study [18]. Knowledge of the participant was assessed in 3 studies [20,26,30], and it was operationalized as lifestyle knowledge [20], food knowledge [30], or "conceptual and practical knowledge about mindfulness meditation" [26]. Knowledge was assessed by either a questionnaire [20,26] or an interview [30]. There were 4 studies describing users' motivation to change [19,20,24,26], including stage of change [24,26], motivation to fill in diary [20], and motivation processes of change [19], which were all assessed by a questionnaire.

Table 1. Differences in total number of efficacy and use-related outcomes between intervention and control group.

Outcome variable and measure	Significant ^a	Nonsignificant ^b	No data ^c
Behavior		·	
Interview	d	1	—
Other	_	1	1
Pedometer	2	3	2
Questionnaire	3	_	—
Self-report	—	1	_
Knowledge			
Interview	—	1	—
Questionnaire	—	1	1
Motivation			
Questionnaire	2	_	2
Usability			
Not reported	—	_	1
Questionnaire	1	_	4
Usage			
Log files	4	1	11
User satisfaction			
Interview	_	_	2
Questionnaire	_	2	14

^aSignificant positive difference between intervention group with and control group without an embodied conversational agent.

^bNonsignificant difference between intervention group with and control group without an embodied conversational agent.

^cDifference not applicable or not reported.

^dAn absence of outcome measure for the outcome variable.

Regarding the use-related parameters, 6 studies assessed whether users had had trouble using the intervention [3,19,20,24,25,33] because of technical issues or lack of technical knowledge. Usability was assessed by a questionnaire [3,20,24,25,33]. One study did not report on how it assessed usability [19]. Usage was assessed in all but 3 studies [25,31,32]. All the studies assessed how and how often the intervention was used by log files. User satisfaction was assessed in all but 1 study [20]. Most often, single items were used to assess users' satisfaction with the interventions [3,4,17-19,21-28,30,32,33]. User satisfaction concerns items related to constructs such as liking, trust, and desire to continue using the ECA, for example, "How much do you trust Gabby?" [24]. Other methods used were interviews [3,5,17,25,30,31,33] and a focus group with end users [5].

Evaluation Outcomes: Efficacy and Use Related

When comparing the intervention group with an ECA with a control group without an ECA, more significant positive (n=12) than nonsignificant effects were found (n=11; see Table 1). In other words, in 12 studies, the intervention groups showed improvement compared with the control group, whereas in 11 studies, there were no differences. However, for a majority of the outcome measures, this comparison was either not applicable as there was no control group without an ECA (n=37) or the significance level was not reported (n=4). Overall, 7 out of 15

```
https://www.jmir.org/2020/2/e14058
```

studies reported better efficacy outcomes for the intervention group, and 5 out of 8 studies reported better use-related outcomes, compared with the control group.

Regarding the outcomes on behavior, it was found that participants using an ECA identified more preconception risks [28] compared with control participants only receiving an email. Both the studies on nutrition found no differences in eating patterns [30] and adherence to diet [20] between participants who had engaged with the ECA and participants who had not. In physical activity-related studies, 4 [19,23,27,32] out of 8 studies [3,17,19,21,23,27,32,33] found a positive difference in physical activity levels between participants who had engaged with the ECA and participants who had not. Regarding outcomes on knowledge, participants in the intervention arm did not score higher on lifestyle literacy, compared with control participants who had the same intervention without an ECA providing feedback [20]. Similarly, the food literacy outcomes of the participants in the intervention arm were not higher than those of the participants in the control arm, who had reviewed the same content with a research assistant once and received a CD with similar meditation recordings [30]. For motivational outcomes, the motivation to fill in a diary [20] and use of motivational behavior change strategies were higher for participants in the intervention arm [19] than for participants in the control arm.

Regarding the use-related outcomes, it was found that participants with an ECA considered the intervention as easier to use [20], compared with control participants who had the same intervention without an ECA providing feedback. Participants with an ECA also used the intervention more frequently [17,20,21,26]. However, 1 study showed the opposite and reported a nonsignificant effect for uptake on impact [23]. A total of 6 studies measured the usage over time, all showing a decrease [3,4,19,22,23,27], for example, "A typical usage pattern was daily during the first week, tapering off to once or twice a week by the end of the study period" [3]. A total of 4 studies reported the average duration of a session, ranging from 12 min [24,29] to 19 min [26,28]. The average number of sessions during the intervention period was mentioned in 6 studies [18,19,23,24,27,28], which was a median of 27.5 sessions (range 8-36). The intervention period of these studies was a median of 8.6 weeks (range 4 weeks-4 months), and this was unrelated to the number of sessions. Participants interacting with an ECA did not report higher satisfaction outcomes [23], compared with control participants who could also view graphs and set goals without interacting with an ECA. In addition, participants in the intervention arm were equally satisfied with the ECA for improving health behaviors [30].

Discussion

Principal Findings

This scoping review charted the design and evaluation field of ECAs for coaching people in a healthy lifestyle. In total, 20 relevant studies were identified and analyzed. One could argue that the lack of diversity in research teams limits the external validity of the scoping review. However, although the work in this field is dominated by 1 research group, a careful comparison between research groups showed no differences in design and evaluation processes, as well as in outcomes (see Multimedia Appendix 3). We therefore conclude that the developmental processes described in this review are a realistic reflection of the field. Regarding the design, we found that studies often applied multiple theories or principles, but they did not report on their interpretation and application. Human-centered and stakeholder-inclusive design approaches tended to be unused. Regarding the evaluation, a combination of efficacy and use-related outcomes was assessed, usually in an RCT. However, rather than evaluating specific components, the intervention was evaluated as a whole. Overall, the studies included suggest that ECAs for coaching people in a healthy lifestyle can make an intervention more engaging, although evidence on their effectiveness remains inconclusive.

Myriad theories and therapy-derived principles were applied for creating ECAs' content and communication strategy. As it is difficult to determine what theory or principle best fits a specific context and as it is reasonable to assume that different contexts require the use of different theories and principles, we do not consider this diversity a problematic issue. However, what we do see as problematic is the lack of detail with which the incorporation of these theories and principles into functional or content design of an ECA is reported. If how exactly an ECA works remains unclear, it will be difficult to learn from others' efforts or interpret the outcomes of evaluations performed with an ECA. This prevents knowledge accumulation about ECAs in general, as well as specific knowledge accumulation about which theories and principles are most appropriate in which contexts. A similar conclusion can be drawn with respect to the design process of ECAs. The design of an ECA can have a major effect on both impact and uptake. On the basis of empirical results of different studies on the appearance of ECAs, Baylor concludes that different appearances lead to different outcomes in terms of motivation and behavior change [36]. Unfortunately, reporting on the design activities and their results is generally incomplete or missing, thereby limiting the options for replication and learning from others' work. It is therefore recommended that future ECA work should not only present results on the efficacy of the ECA but also on the process leading to the design and content of the ECA.

With respect to the evaluation of ECAs for coaching people in a healthy lifestyle, we made a distinction between the results in ECAs' efficacy and use-related parameters. ECA outcome efficacy shows a nonconclusive picture, operationalized as, for example, physical activity measured by an activity monitor, knowledge about mindfulness meditation as assessed via a survey, or diabetes-related emotional distress. About half of the evaluation outcomes show a significantly positive result for using an ECA, whereas the other half of the outcomes do not provide positive evidence. With regard to use-related outcomes, the evaluations do show a positive picture, where the majority of the studies indicate that the use of an ECA leads to higher ratings of usability or a higher degree of use. With regard to the efficacy-related outcomes, motivation to change had successfully improved in a majority of the studies, whereas health behavior and health literacy had not. On the basis of the existent evaluations, we can therefore state that ECAs do not necessarily lead to improved health outcomes; however, the intervention will at least be more engaging. This is in accordance with Provoost et al, based on their review of ECAs in clinical psychology and their evidence base [8].

Beyond the State of the Art

We found that end users are normally not involved with the visual design and content of the ECA. Rather, the ECAs were designed by professionals behind a desk. This practice contradicts human-centered or collaborative design approaches that are assumed to lead to technology appealing to and fitting the perspectives of the end users [37]. This consequently maximizes the chance of successful uptake of the technology [10]. In the literature, several practical approaches for human-centered design for eHealth are provided, such as the Centre for eHealth and Wellbeing roadmap [11] or Integrate, Design, Assess, and Share [38], as well as a rich collection of case studies in which these approaches have been used [39,40]. The field of developing and evaluating ECAs for eHealth would highly benefit from the reporting of similar case studies in diverse contexts.

We found that the evidence for using ECAs for coaching people in a healthy lifestyle remains inconclusive and that it is unclear which (combination of) components caused a (lack of) behavior change. However, this problem is neither new nor exclusive to

```
XSL•FO
```

the field of ECAs; this so-called black box phenomenon has been acknowledged for eHealth interventions in general [32,41]. Rather than evaluating an eHealth technology or ECAs for health purposes as a whole, an evaluation should focus on gaining insight into the effectiveness of the technology's or ECA's main or constituent components. A more fine-grained evaluation can be achieved by means of a factorial design, as this allows researchers to deliver specific intervention components to different groups of users [42]. Another strategy is to collect log files on usage time and patterns to identify the technology components that affect (non)use [37].

The studies in our review suggest that ECAs can make an eHealth intervention, aimed at improving people's lifestyle, more engaging. This is possibly because of the capacity of ECAs to establish and maintain an empathic relationship [3]. However, one can wonder how lasting this engagement is. Providing an ECA may have a novelty effect; thus, the engaging effect may wear off over time, resulting in decreased adherence, which is common for eHealth interventions [10]. Studying the use, effectiveness, and user experience of working with an ECA for coaching people in a healthy lifestyle for a prolonged period and in a realistic setting would provide inputs for answering these questions. Both researchers and eHealth developers need to find these answers to identify the persuasive goals that ECAs can serve best and to know how such ECAs should be developed to create engagement and a lasting effect.

Recommendations for Future Design and Research

On the basis of the findings of this review, we formulate several recommendations for future design and research. With respect to the development of ECAs for coaching people in a healthy lifestyle, we recommend the use of human-centered, stakeholder-inclusive design approaches, as well as reporting on the design activities in a systematic and comprehensive manner. This will allow others to learn from previous efforts. With respect to evaluation, there is a need to open the black box that is now pervasive among studies that delve into the efficacy of ECAs in improving health-related lifestyle. This means that evaluation reports need to specify which features are considered the main components of the eHealth intervention with an ECA and what theoretical foundation lies beneath these features, the ECA, and its persuasive tactic. Thereafter, during the data analysis phase of an evaluation, these features should be linked to measures of efficacy, use, and the user experience, to grasp whether the ECA works and why (not). Only in this way, a single evaluation can become valuable, both within and beyond its specific context.

Besides these general recommendations, we have also identified several specific research questions. As we mentioned in the introduction, the 24×7 availability of an ECA and its potential

Kramer et al

or after specific behavior) make it a potentially valuable addition to the persuasive tool kit that eHealth developers have at hand. However, none of the included studies focused on identifying the exact right timing for a specific type of content. Should we always try to prevent negative behavior, thereby running the risk that the ECA may become annoying? Should we always acknowledge positive behavior, thereby running the risk that the ECA loses credibility? Finding the answers to these questions related to timing and frequency of use will allow us to create persuasive tactics for ECAs, which are in line with the tolerance levels and needs of end users. Furthermore, to fully understand the novelty effect that the introduction of an ECA may bring and to grasp the development of behavior change over time, longitudinal studies need to be performed. Ideally, these studies are (partly) in depth and qualitative to generate hypotheses for a novel field that can then be confirmed in large-scale quantitative studies afterward.

Limitations

The first limitation is that we might have missed relevant studies. The applied search strategy might have influenced our findings, as it is plausible that ongoing studies are only published in conference proceedings. The applied search string might also have influenced our findings. During the stage of identifying relevant keywords, we already found a variety of terms used to describe (comparable) ECAs. With the help of a librarian, we therefore tried to mitigate this risk by setting up a comprehensive list based on an initial search. In the end, we identified 9 different terms in the studies included, although the definitions were rather similar. As a recommendation for future work, we propose to use the term ECAs as the uniform term for "more or less autonomous and intelligent software entities with an embodiment used to communicate with the user" [2].

The second limitation relates to the identification of BCTs. They were rather difficult to identify as they were often mentioned summarily in the text or within images, and no uniform language was used, for example, we could only code Tailored strategies that addressed related barriers [31] as problem solving, according to the BCT Taxonomy (v1) from the study by Michie et al [16]. Further descriptions were usually not provided.

Conclusions

ECAs are a promising tool for persuasive communication in the health domain. This scoping review provided valuable insight into the current development processes and evaluation outcomes. On the basis of these results, we offer multiple recommendations for future research agendas. We hope that the lessons from this review will further shape the novel field of using ECAs within the eHealth context.

Acknowledgments

This study is the first step in an overarching project (PACO) that aims to gain fundamental insights into the acceptance, working mechanisms, and persuasiveness of ECAs in the context of health behavior change. PACO is funded by The Netherlands Association for Health Research and Development (ZonMw): ZonMw Create Health program grant number 40-44300-98-110.



Conflicts of Interest

None declared.

Multimedia Appendix 1

Search string and database search. [DOCX File, 15 KB-Multimedia Appendix 1]

Multimedia Appendix 2

Term list data-charting form. [DOCX File, 17 KB-Multimedia Appendix 2]

Multimedia Appendix 3

Overview of studies. [DOCX File, 29 KB-Multimedia Appendix 3]

References

- GBD 2016 Disease and Injury Incidence and Prevalence Collaborators. Global, regional, and national incidence, prevalence, and years lived with disability for 328 diseases and injuries for 195 countries, 1990-2016: a systematic analysis for the Global Burden of Disease Study 2016. Lancet 2017 Sep 16;390(10100):1211-1259 [FREE Full text] [doi: 10.1016/S0140-6736(17)32154-2] [Medline: 28919117]
- 2. Ruttkay Z, Pelachaud C. From Brows To Trust: Evaluating Embodied Conversational Agents. Dordrecht: Springer Science & Business Media; 2006.
- 3. Bickmore TW, Caruso L, Clough-Gorr K, Heeren T. 'It's just like you talk to a friend' relational agents for older adults. Interact Comput 2005;17(6):711-735. [doi: 10.1016/j.intcom.2005.09.002]
- Bickmore TW, Pfeifer LM, Byron D, Forsythe S, Henault LE, Jack BW, et al. Usability of conversational agents by patients with inadequate health literacy: evidence from two clinical trials. J Health Commun 2010;15(Suppl 2):197-210. [doi: 10.1080/10810730.2010.499991] [Medline: 20845204]
- Klaassen R, Bul KCM, op den Akker R, van der Burg GJ, Kato PM, di Bitonto P. Design and evaluation of a pervasive coaching and gamification platform for young diabetes patients. Sensors (Basel) 2018 Jan 30;18(2):pii: E402 [FREE Full text] [doi: 10.3390/s18020402] [Medline: 29385750]
- Brandt CJ, Søgaard GI, Clemensen J, Søndergaard J, Nielsen JB. Determinants of successful eHealth coaching for consumer lifestyle changes: qualitative interview study among health care professionals. J Med Internet Res 2018 Jul 5;20(7):e237 [FREE Full text] [doi: 10.2196/jmir.9791] [Medline: 29980496]
- Brinkman WP. Virtual Health Agents for Behavior Change: Research Perspectives and Directions. In: Proceedings of the Workshop on Graphical and Robotic Embodied Agents for Therapeutic Systems. 2016 Presented at: GREATS'16; September 20, 2016; Los Angeles URL: <u>http://www.macs.hw.ac.uk/~ruth/greats16/GREATS-16_paper_1.pdf</u>
- Provoost S, Lau HM, Ruwaard J, Riper H. Embodied conversational agents in clinical psychology: a scoping review. J Med Internet Res 2017 May 9;19(5):e151 [FREE Full text] [doi: 10.2196/jmir.6553] [Medline: 28487267]
- 9. Johnson WL, Lester JC. Face-to-face interaction with pedagogical agents, twenty years later. Int J Artif Intell Educ 2016 Sep 24;26(2016):25-36. [doi: 10.1007/s40593-015-0065-9]
- 10. Kohl LF, Crutzen R, de Vries NK. Online prevention aimed at lifestyle behaviors: a systematic review of reviews. J Med Internet Res 2013 Jul 16;15(7):e146 [FREE Full text] [doi: 10.2196/jmir.2665] [Medline: 23859884]
- van Gemert-Pijnen JEWC, Nijland N, van Limburg M, Ossebaard HC, Kelders SM, Eysenbach G, et al. A holistic framework to improve the uptake and impact of eHealth technologies. J Med Internet Res 2011 Dec 5;13(4):e111 [FREE Full text] [doi: 10.2196/jmir.1672] [Medline: 22155738]
- 12. World Health Organization. Medical Devices: Managing the Mismatch: an Outcome of the Priority Medical Devices Project. Geneva: World Health Organization; 2010.
- van Velsen L, Wentzel J, van Gemert-Pijnen JEWC. Designing eHealth that matters via a multidisciplinary requirements development approach. JMIR Res Protoc 2013 Jun 24;2(1):e21 [FREE Full text] [doi: 10.2196/resprot.2547] [Medline: 23796508]
- 14. Harte R, Glynn L, Rodríguez-Molinero A, Baker PM, Scharf T, Quinlan LR, et al. A human-centered design methodology to enhance the usability, human factors, and user experience of connected health systems: a three-phase methodology. JMIR Hum Factors 2017 Mar 16;4(1):e8 [FREE Full text] [doi: 10.2196/humanfactors.5443] [Medline: 28302594]
- Arksey H, O'Malley L. Scoping studies: towards a methodological framework. Int J Soc Res Methodol 2005;8(1):19-32. [doi: 10.1080/1364557032000119616]

RenderX

- 16. Michie S, Richardson M, Johnston M, Abraham C, Francis J, Hardeman W, et al. The behavior change technique taxonomy (v1) of 93 hierarchically clustered techniques: building an international consensus for the reporting of behavior change interventions. Ann Behav Med 2013 Aug;46(1):81-95. [doi: 10.1007/s12160-013-9486-6] [Medline: 23512568]
- 17. Bickmore T, Gruber A, Picard R. Establishing the computer-patient working alliance in automated health behavior change interventions. Patient Educ Couns 2005 Oct;59(1):21-30. [doi: <u>10.1016/j.pec.2004.09.008</u>] [Medline: <u>16198215</u>]
- Ellis T, Latham NK, DeAngelis TR, Thomas CA, Saint-Hilaire M, Bickmore TW. Feasibility of a virtual exercise coach to promote walking in community-dwelling persons with Parkinson disease. Am J Phys Med Rehabil 2013 Jun;92(6):472-81; quiz 482 [FREE Full text] [doi: 10.1097/PHM.0b013e31828cd466] [Medline: 23552335]
- King AC, Bickmore TW, Campero MI, Pruitt LA, Yin JL. Employing virtual advisors in preventive care for underserved communities: results from the COMPASS study. J Health Commun 2013;18(12):1449-1464. [doi: 10.1080/10810730.2013.798374] [Medline: 23941610]
- 20. Blanson Henkemans OA, van der Boog PJ, Lindenberg J, van der Mast CA, Neerincx MA, Zwetsloot-Schonk BJ. An online lifestyle diary with a persuasive computer assistant providing feedback on self-management. Technol Health Care 2009;17(3):253-267. [doi: 10.3233/THC-2009-0545] [Medline: 19641261]
- 21. Bickmore TW, Picard RW. Establishing and maintaining long-term human-computer relationships. ACM Trans Comput-Hum Interact 2005;12(2):293-327 [FREE Full text] [doi: 10.1145/1067860.1067867]
- 22. Bickmore TW, Schulman D, Yin L. Maintaining engagement in long-term interventions with relational agents. Appl Artif Intell 2010 Jul 1;24(6):648-666 [FREE Full text] [doi: 10.1080/08839514.2010.492259] [Medline: 21318052]
- 23. Watson A, Bickmore T, Cange A, Kulshreshtha A, Kvedar J. An internet-based virtual coach to promote physical activity adherence in overweight adults: randomized controlled trial. J Med Internet Res 2012 Jan 26;14(1):e1 [FREE Full text] [doi: 10.2196/jmir.1629] [Medline: 22281837]
- 24. Gardiner P, Hempstead MB, Ring L, Bickmore T, Yinusa-Nyahkoon L, Tran H, et al. Reaching women through health information technology: the Gabby preconception care system. Am J Health Promot 2013;27(3 Suppl):eS11-eS20 [FREE Full text] [doi: 10.4278/ajhp.1200113-QUAN-18] [Medline: 23286652]
- 25. Bickmore TW, Schulman D, Sidner C. Automated interventions for multiple health behaviors using conversational agents. Patient Educ Couns 2013 Aug;92(2):142-148 [FREE Full text] [doi: 10.1016/j.pec.2013.05.011] [Medline: 23763983]
- 26. Hudlicka E. Virtual training and coaching of health behavior: example from mindfulness meditation training. Patient Educ Couns 2013 Aug;92(2):160-166 [FREE Full text] [doi: 10.1016/j.pec.2013.05.007] [Medline: 23809167]
- 27. Bickmore TW, Silliman RA, Nelson K, Cheng DM, Winter M, Henault L, et al. A randomized controlled trial of an automated exercise coach for older adults. J Am Geriatr Soc 2013 Oct;61(10):1676-1683. [doi: 10.1111/jgs.12449] [Medline: 24001030]
- Jack B, Bickmore T, Hempstead M, Yinusa-Nyahkoon L, Sadikova E, Mitchell S, et al. Reducing preconception risks among African American women with conversational agent technology. J Am Board Fam Med 2015;28(4):441-451 [FREE Full text] [doi: 10.3122/jabfm.2015.04.140327] [Medline: 26152434]
- 29. King AC, Campero I, Sheats JL, Sweet CM, Garcia D, Chazaro A, et al. Testing the comparative effects of physical activity advice by humans vs computers in underserved populations: the COMPASS trial design, methods, and baseline characteristics. Contemp Clin Trials 2017 Oct;61:115-125 [FREE Full text] [doi: 10.1016/j.cct.2017.07.020] [Medline: 28739541]
- 30. Gardiner PM, McCue KD, Negash LM, Cheng T, White LF, Yinusa-Nyahkoon L, et al. Engaging women with an embodied conversational agent to deliver mindfulness and lifestyle recommendations: a feasibility randomized control trial. Patient Educ Couns 2017 Sep;100(9):1720-1729 [FREE Full text] [doi: 10.1016/j.pec.2017.04.015] [Medline: 28495391]
- 31. Sillice MA, Morokoff PJ, Ferszt G, Bickmore T, Bock BC, Lantini R, et al. Using relational agents to promote exercise and sun protection: assessment of participants' experiences with two interventions. J Med Internet Res 2018 Feb 7;20(2):e48 [FREE Full text] [doi: 10.2196/jmir.7640] [Medline: 29415873]
- 32. Friederichs S, Bolman C, Oenema A, Guyaux J, Lechner L. Motivational interviewing in a web-based physical activity intervention with an avatar: randomized controlled trial. J Med Internet Res 2014 Feb 13;16(2):e48 [FREE Full text] [doi: 10.2196/jmir.2974] [Medline: 24550153]
- 33. op den Akker HJA, Klaassen R, Nijholt A. Virtual coaches for healthy lifestyle. In: Esposito A, Jain L, editors. Toward Robotic Socially Believable Behaving Systems Volume II. Cham: Springer; 2016:121-149.
- Friederichs SA, Oenema A, Bolman C, Guyaux J, van Keulen HM, Lechner L. Motivational interviewing in a web-based physical activity intervention: questions and reflections. Health Promot Int 2015 Sep;30(3):803-815. [doi: 10.1093/heapro/dat069] [Medline: 24101160]
- 35. Klaassen R, op den Akker R, Lavrysen T, van Wissen S. User preferences for multi-device context-aware feedback in a digital coaching system. J Multimodal User Interfaces 2013;7(3):247-267 [FREE Full text] [doi: 10.1007/s12193-013-0125-0]
- 36. Baylor AL. Promoting motivation with virtual agents and avatars: role of visual presence and appearance. Philos Trans R Soc Lond B Biol Sci 2009 Dec 12;364(1535):3559-3565 [FREE Full text] [doi: 10.1098/rstb.2009.0148] [Medline: 19884150]
- 37. van Gemert-Pijnen L, Kelders SM, Kip H, Sanderman R. eHealth Research, Theory and Development: A Multi-Disciplinary Approach. Abingdon: Routledge; 2018.

RenderX

- 38. Mummah SA, Robinson TN, King AC, Gardner CD, Sutton S. IDEAS (Integrate, Design, Assess, and Share): a framework and toolkit of strategies for the development of more effective digital interventions to change health behavior. J Med Internet Res 2016 Dec 16;18(12):e317 [FREE Full text] [doi: 10.2196/jmir.5927] [Medline: 27986647]
- van Velsen L, Beaujean DJ, Wentzel J, van Steenbergen JE, van Gemert-Pijnen JEWC. Developing requirements for a mobile app to support citizens in dealing with ticks and tick bites via end-user profiling. Health Informatics J 2015 Mar;21(1):24-35. [doi: 10.1177/1460458213496419] [Medline: 24282189]
- Kazemi DM, Borsari B, Levine MJ, Lamberson KA, Dooley B. REMIT: Development of a mHealth theory-based intervention to decrease heavy episodic drinking among college students. Addict Res Theory 2018;26(5):377-385. [doi: 10.1080/16066359.2017.1420783]
- 41. Sieverink F, Kelders S, Poel M, van Gemert-Pijnen L. Opening the black box of electronic health: collecting, analyzing, and interpreting log data. JMIR Res Protoc 2017 Aug 7;6(8):e156 [FREE Full text] [doi: 10.2196/resprot.6452] [Medline: 28784592]
- 42. Collins LM, Dziak JJ, Kugler KC, Trail JB. Factorial experiments: efficient tools for evaluation of intervention components. Am J Prev Med 2014 Oct;47(4):498-504 [FREE Full text] [doi: 10.1016/j.amepre.2014.06.021] [Medline: 25092122]

Abbreviations

BCT: behavior change technique ECA: embodied conversational agent eHealth: electronic health RCT: randomized controlled trial ZonMw: The Netherlands Association for Health Research and Development

Edited by P Bamidis; submitted 19.03.19; peer-reviewed by R Klaassen, S Konstantinidis; comments to author 10.06.19; revised version received 12.07.19; accepted 25.10.19; published 05.02.20

Please cite as:

Kramer LL, ter Stal S, Mulder BC, de Vet E, van Velsen L Developing Embodied Conversational Agents for Coaching People in a Healthy Lifestyle: Scoping Review J Med Internet Res 2020;22(2):e14058 URL: <u>https://www.jmir.org/2020/2/e14058</u> doi: <u>10.2196/14058</u> PMID:

©Lean L Kramer, Silke ter Stal, Bob C Mulder, Emely de Vet, Lex van Velsen. Originally published in the Journal of Medical Internet Research (http://www.jmir.org), 05.02.2020. This is an open-access article distributed under the terms of the Creative Commons Attribution License (https://creativecommons.org/licenses/by/4.0/), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work, first published in the Journal of Medical Internet Research, is properly cited. The complete bibliographic information, a link to the original publication on http://www.jmir.org/, as well as this copyright and license information must be included.

