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## Using Eye-Movement Modeling Examples to Improve Critical Reading of Multiple Webpages on a Conflicting Topic

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#### Abstract

Interventions to promote students' source evaluations have used various methods designed for the classroom context. In the present study, we tested an approach that is easily adaptable to online courses, based on Eye Movement Modeling Examples (EMME), that is, short videos displaying an expert student's eye gaze while s/he reads multiple pages on the Internet to learn about a conflicting topic. Using an eye-tracking methodology in a pre-post design, we analyzed how EMME changed students' attention to source information, and how this processing affected their learning. EMME increased participants' attention to the search engine results page (SERP), author information, and texts from trustworthy pages, but it did not directly improve essay quality. Increases in SERP processing times mediated the positive effect of EMME on essay quality. Finally, we discuss the potential benefits and limitations of EMME in teaching complex literacy strategies, and the importance of measuring processing data in educational research studies.

**Keywords:** eye-movement modeling examples, sourcing, eye-tracking, multiple-documents comprehension.

# Using Eye-Movement Modeling Examples to Improve Critical Reading of Multiple Webpages on a Conflicting Topic

#### Introduction

Digital technology has produced an increase in written communication. For years, the Internet has been the most widely used source of information. Teenagers and adults of all ages spend an increasing amount of time reading texts on the Internet for various reasons. The large number of easily available texts puts great pressure on the individual's reading skills, well beyond simple word decoding and literal comprehension. Due to the lack of information "gatekeeping" on the Internet, users can often access misinformation or biased information, which can spread quickly and become "viral". Thus, more than ever, in the so called "post-truth" era of "alternative facts", critical reading becomes crucial (Bråten, Braasch, & Salmerón, 2019).

First, critical readers must pay attention to source characteristics, such as the author's credentials or the institution publishing the document. Second, they must evaluate the quality of the information by judging to what extent these source characteristics suggest that the information is supported by sound evidence, or on the contrary, could potentially be biased. Finally, critical readers must consider the conclusions from their assessment of the source to qualify the information accessed, e.g. by judging the view supported by expert sources as credible, or by discarding information from potentially biased sources (Tarchi & Mason, 2019). Because this is a sequential process, failing to attend to source characteristics may limit students' ability to critically read the information. Accordingly, educational interventions to improve critical reading tend to emphasize the importance of paying attention to source characteristics (Brante, & Strømsø, 2017). In their recent systematic review, Brante &

Strømsø (2017) identified two relevant gaps in the literature of source evaluation interventions. First, few intervention studies were designed specifically to guide students to critically read on the Internet. As this scenario presents different source features than traditional paper documents, such as search engine result page (SERP), participants may need specific guidance to find and use such source features. Second, none of the existing interventions measured how students look for source features or specifically which features they attend to during reading. As such, the effectiveness of current interventions only relies on participants' off-line responses.

The present study tries to fill in those gaps by testing Eye Movement Modeling Examples (EMME) to support students' source evaluations on the Internet, while measuring changes on their visual attention to source characteristics from pre to post test. EMMEs are videos that display, by means of a moving dot, where an expert is looking while performing an activity. By visually modeling expert behavior, EMMEs are intended to guide students' visual attention while performing a particular task (Jarodzka, van Gog, Dorr, Scheiter, & Gerjets, 2013; van Gog, Jarodzka, Scheiter, Gerjets, & Paas, 2009). The present study used this innovative approach to address one of the crucial questions in contemporary research on learning and instruction, that is, how to foster students' ability to read webpages critically, starting with paying attention to source information.

#### Sourcing and Critical Reading on the Internet

In a seminal paper by Wineburg (1991), sourcing was defined as the process of using information about documents – author, genre, and publication date – to evaluate and interpret documents' content. Research has widely indicated that students do not tend to pay attention to source information, and this effect is generalized across different educational levels, including elementary school students (Kuiper, Wolman, & Terwel,

2008; Macedo-Rouet et al., 2013; Paul, Cerdán, Rouet, & Stadtler, 2018; Paul, Stadtler, & Bromme, 2019), middle school students (Mason, Ariasi, & Boldrin, 2011; Salmerón, Macedo-Rouet & Rouet, 2016; Salmerón, Agnese & Delgado, 2019; VanSledright & Kelly, 1998), high school students (Barzilai & Zohar, 2012; Macedo-Rouet et al., 2019; Paul, Macedo-Rouet, Rouet, & Stadtler, 2017; Walraven, Brand-Gruwel, & Boshuizen, 2009), and university students (Barzilai, Tzadok, & Eshet-Alkalai, 2015; Bråten, Strømsø, & Andreassen, 2016; Britt & Aglinskas, 2002; List, Du, Wang, & Lee, 2019; Salmerón, Gil, & Bråten, 2018b).

Undoubtedly, sourcing is an important part of critical reading in today's information society. Readers who are not able to identify and use source information to distinguish between trustworthy and untrustworthy sources also experience more difficulties in comprehending multiple conflicting texts on the same topic (e.g., Bråten, Ferguson, Strømsø, & Anmarkrud, 2014). In fact, sourcing skills are crucial not only to be able to follow reliable sources and rule out biased ones, but also to form an integrated and coherent representation of various texts despite their divergences.

Research has indicated that memory for sources is associated with the construction of coherent representations of documents' contents (Salmerón et al., 2018b; Strømsø, Bråten, & Britt, 2010).

According to the seminal documents model framework (Perfetti, Rouet, & Britt, 1999; Rouet & Britt, 2011), the mental representation of a set of texts requires both the comprehension of each single text, that is, the situational model of each single text based on the integration of textual information and reader's prior knowledge (Kintsch, 1989), and two additional text-representation layers, the intertext and the integrated mental models of the various situations. The intertext model is formed when readers

"tag" content to source characteristics such as author and genre. It refers to a representation of the sources of the multiple documents and their interrelationships.

The importance of tagging content and source features also emerged in the recent Discrepancy-Induced Source Comprehension (D-ISC) model (Braasch & Bråten, 2017). According to this model, readers pay more attention to "metadata" (who says what) when they are confronted with contrasting information on the same topic provided by different sources. The representation of source features also promotes the interpretation of documents' contents, contributing to the construction of an integrated mental representation of multiple documents. For example, by identifying that two authors have diverging motivations (e.g. to inform vs. to sell a product), readers can reconcile conflicting accounts about a controversial issue.

On the Internet, source features are available not only in the webpages (e.g. authors' credentials, logo of the Institution that hosts the webpage), but also in SERPs. SERPs display the title of the pages, a brief summary, and the URL, usually including the source that hosts the webpage. As such, they represent a unique opportunity for students to reflect on the relevance and quality of the pages and directly compare pages. In their recent study, Wineburg & McGrew (2017) emphasized the importance of attending to SERPs in learning about conflicting topics. In their study, professional fact checkers tend to spend some time scanning the SERP before clicking on any link, a strategy that the authors coined as "click restraint". They inspected the SERP to gather source information from different pages, and used this in their subsequent navigation. On the contrary, the group of undergraduate students tended to click on the first links of the list without spending much time on the SERP (for similar results see Brand-Gruwel, Kammerer, van Meeuwen, & van Gog, 2017). The importance of SERPs has also been identified in studies that manipulated the design to support source evaluation. For

example, adapting the display of snippets to facilitate comparisons of webpages, such as presenting groups of snippets instead of a list, increased the probability of students including more trustworthy information in their essays (Kammerer & Gerjets, 2014) and receiving higher scores on an inter-textual comprehension measure (Salmerón et al., 2010). Thus, interventions aimed to improve critical reading on the Internet could benefit from directly addressing how to process SERP snippets.

To advance our knowledge about effective methods for promoting sourcing in critical reading, in the current study we adopted the approach based on EMME, aimed at modeling several strategic sourcing behaviors on the Internet: from carefully scrutinizing a SERP before selecting a trustworthy source to quickly skimming a visibly untrusworthy webpage.

#### **Eye Movement Modeling Example**

EMME combines the efficacy of video-based modeling and example-based instruction (Renkl, 2014) with the usefulness of an eye-tracking technology. Rooted in observational learning (Bandura, 1977), video-based modeling has received increasing attention in educational research as a way to foster students' performance in diverse domains, such as making collages and writing poetry (Groenendijk, Janssen, Rijlaarsdam, & van den Bergh, 2013), solving problems about electric circuits (Hoogerheide, Renkl, Fiorella, Paas, & van Gog, 2019), or solving information problems when searching the Web for information (Frerejean, van Strien, Kirschner, & Brand-Gruwel, 2018). Examples are included in video-based modeling to help students focus on an appropriate way to execute a task (Hefter, ten Hagen, Krense, Berthold, & Renkl, 2019). Thus, they should not try to perform a task by themselves, but rather they can invest mental effort in achieving optimal performance based on the example, assuming that it is well-designed.

Eye-tracking technology provides videos of gaze replays. Therefore, it is not only useful for offering unique data about perceptual and cognitive processes, but also for providing the opportunity to show recorded visual behavior in the form of a video where fixations on specific information are represented as solid dots.

In the extant literature, there is now ample evidence of the effectiveness of EMME in various areas of investigation, such as classification tasks (Jarodzka et al., 2012), problem solving (van Marlen, Wermeskerken, Jarodzka, & van Gog, 2018), medical imaging (Litchfield, Ball, Donovan, Manning, & Crawford, 2010), medical education (Jarodzka et al., 2012; Seppänen & Gegenfurtner, 2017), digital reading (Salmerón & Llorens, 2019), and multimedia learning (Mason, Pluchino, & Tornatora, 2015, 2016; Mason, Scheiter, & Tornatora, 2017). EMME has been found to be beneficial for both the processing of information – using either texts, pictures, or medical images – and learning from it, that is, in terms of both processes and outcomes related to this type of modeling.

The mechanism that explains the effectiveness of this type of video-modeling is attention guidance. EMME guides learners' attention to what the model is focusing on at that moment, and so the visual attention of the learner is guided by and synchronized with the model, as in a state of joint attention (van Marlen et al., 2018). This attention to relevant information or aspects of the performed task contributes to deeper processing during learning and better learning outcomes. For example, in Mason and colleagues' (2015, 2016, 2017) studies, students were shown an EMME of an expert who integrated text and picture while reading an illustrated text. Findings revealed that students using EMME, compared to a control group, showed a stronger integrative processing of verbal and graphical information during the reading of a similar text, and higher learning outcomes after reading.

Interventions aimed at improving students' sourcing have mostly relied on worksheets, prompts, or group discussions to sustain the complex process that is part of critical reading (Wennås Brante & Strømsø, 2017). Based on the aforementioned literature on video modeling and video modeling through the gaze replay of an expert who performs well on a given task, it is theoretically legitimate to expect that EMME can be an effective way to improve sourcing. The underlying reason is that seeing what a model is looking at has a great potential to guide novices' attention to the right location at the right time (van Gog et al., 2009). EMME provides a unique opportunity in terms of attention guidance, which is at the basis of a process like sourcing, and it is initiated by focusing on usually overlooked information such as "metadata" about source characteristics. As shown in eye-tracking studies, experts and novices differ in attention allocation; that is, compared to novices, experts pay attention to task-relevant information longer and faster, and they spend less time on task-irrelevant information (e.g., van Gog, Paas, & van Merriënboer, 2005). This difference in attention allocation may lead learners to fail to encode relevant source information while reading online digital documents (e.g., Brand-Gruwel et al., 2017). Thus, EMME represents a way to reduce this discrepancy because it shows the learner what a model is looking at while performing a task (van Marlen et al., 2018).

The link between sourcing and comprehension of multiple documents on the same topic is not only theoretically justified, as mentioned above, but it is also empirically documented in studies revealing that attention to source information is associated with better multiple-document comprehension (e.g., Anmarkrud, Bråten, & Strømsø, 2014; Salmerón et al., 2010). Therefore, if EMME supports attention to source information, we can also expect it to sustain the comprehension of conflicting information provided by various sources. It is worth noting that in some studies EMME

was also accompanied by verbal instructions, either unambiguous (e.g., van Gog et al., 2009) or ambiguous (van Marlen et al., 2019), to guide learners' attention, whereas in others, only EMME was provided, without any verbal supplement (Mason et al., 2015, 2016, 2017). Based on the latter, in the current study EMME was shown without any simultaneous verbal accompaniment in order to more clearly test its effectiveness in modeling a complex activity like sourcing. In this way, any benefit can only be attributed to the modeling itself. Moreover, redundancy between video and verbal accompaniment is avoided because it can be unfavorable to learning (van Gog et al., 2009). Furthermore, participants are not asked to attend to both visual and verbal processes at the same time, which can be difficult. In this regard, unlike other studies that used verbal accompaniments, in the present study, the sourcing task represented in the EMME video did not involve visual search of small relevant elements, which may not be perceived without verbal comments (Jarodzka et al., 2013).

Nevertheless, sourcing processes during Internet reading are complex because they involve paying attention to source information distributed across different sections (e.g., snippets in the SERP, author information on a webpage), they attend longer to information from a trustworthy source than from an untrustworthy source, and they use information from trustworthy sources to form an integrated representation of the topic. Thus, it is an open issue whether EMME, as an essentially perceptual tool, can also model a process that is far from perceptual but includes some perceptual aspects. However, findings on the effectiveness of EMME in modeling other non-perceptual processes, such as the integration of verbal and graphical information while reading an illustrated text without any verbal explanation, are encouraging (Mason et al., 2015, 2016, 2017).

The Study: Research Questions and Hypotheses

Sourcing is crucial when searching for information on the Internet and learning in online environments. The ability to identify and represent source information (metadata) to interpret a document's content and judge its authoritativeness, or to use source information in referring to a document's content, is essential in order to rule out or augment the content of messages on the basis of source credibility, that is, the trustworthiness and accuracy of the content (Goldman & Scardamalia, 2013; Salmerón et al., 2018). Given the importance of this ability in our information-saturated society, this study sought to extend current research on how to improve sourcing by adopting the EMME approach, which, to the best of our knowledge, has not been used in this area of research. The following research questions (RQ) guided the study:

- (1) Would EMME increase the time spent reading (a) the SERP snippets, (b) webpage headers (i.e., the logo and the name of the institution hosting the webpage), (c) information about the text author within webpages (i.e., author's name and occupation), and (d) webpage texts?
- (2) Would EMME increase (a) source citations and (b) ideas from trustworthy pages in post-test essays?
- (3) Would the effect of EMME on post-test essays be mediated by the increased time spent on source information?

Based on the previously reviewed literature showing that EMME has positive effects on the processing of similar material by modeled learners (e.g., Jarodzka et al., 2013; Mason, 2015, 2016, 2017), for RQ1 we hypothesized that the EMME group would show more strategic processing of the online materials from pre to post-test, as reflected in attending longer to the snippets in the SERP (RQ1a), the webpage headers (RQ1b), and the authors' credentials (RQ1c). For RQ1, we also expected that students in the EMME group would selectively allocate their text processing times at post-test

based on the webpage's trustworthiness, with higher reading times for trustworthy pages and lower reading times for untrustworthy pages (RQ1d).

For RQ2, we expected that the EMME group would cite more sources in their written essays from pre- to post-test, as a consequence of paying more attention to source information and tagging source features and contents (RQ2a) (Braasch & Bråten, 2017; Bråten et al., 2014; Stang Lund, Bråten, Brandmo, Brante, & Strømsø, 2014). We also hypothesized that the EMME group would report more ideas from trustworthy pages at post-test than at pre-test, as an effect of implicit evaluation elicited by the model, who strategically looked at logos and attended to source information (RQ2b). This visual attention paid to "metadata" leads to discriminating between webpages and relying only on trustworthy online resources (Salmerón et al., 2018; Strømsø et al., 2010). The improvements in sourcing activities and products predicted for RQ 1 and 2 were not expected in the control group, which received no modeling.

Finally, for RQ3, based on the EMME literature pertinent to the current study (Mason et al., 2015, 2016, 2017), we hypothesized that crucial processing behavior would be related to the reading outcomes. More specifically, we hypothesized that the time spent on source information at post-test would, at least partially, mediate the effect of EMME on essay quality, as indicated by an increase in source citations and ideas from trustworthy pages (Brand-Gruwel et al., 2017).

#### Method

#### **Participants**

Sixty-four undergraduate students from a large Spanish university participated in the study ( $M_{\rm age} = 20.8$ , SD = 1.91; 84.1% women). Most of the students were enrolled in their third (47.6%) or fourth (38.1%) year of undergraduate psychology or education programs (52.4 and 46.0%, respectively). Students volunteered either for class credit or

for an economic compensation (10€). All participants signed an informed consent form and were debriefed after completing the study. From the original sample, we excluded 1 student due to incomplete data, which resulted in a final sample of 63 participants.

#### **Materials and Equipment**

**Webpages.** Table 1 provides an overview of the main characteristics of the webpages used. Each participant read two separate sets of four webpages on socioscientific conflicting topics. One set of webpages discussed pros and cons of the use of renewable energies as a potential solution to fight climate change (CC); the other discussed pros and cons of genetically modified food (GMF). The pages were assembled from various authentic online texts on the issue, including institutional and NGO reports, as well as diverse popular science articles. For each topic, two pages provided arguments in favor of and two against the main topic (use of renewable energies to fight climate change or genetically modified food). The level of trustworthiness of pages was manipulated by varying the degree of expertise and benevolence of the authors (Unkel & Hassel, 2017). Specifically, for pages providing a similar positive or negative view, one was authored by a trustworthy source (i.e. government agency or research institution) and another by an untrustworthy source (i.e. a company with commercial interests in the topic or laypersons writing personal blogs). Trustworthy webpages, but not untrustworthy ones, cited scientific sources in the text to support their main claims.

To ensure that the webpages were appropriate for undergraduate students, we computed readability scores for each webpage using the Flesch-Szigriszt Index (Szigriszt, 1992), which is a version of the classic Flesch Index in Spanish. The mean readability score for the CC webpages was 48.7 (SD = 6.1), and for the GMF webpages, 45.8 (SD = 0.8). According to the INFLESZ scale, values ranging between 40-55

correspond to the category "somewhat difficult", which includes popular science texts or specialized press (Barrio-Cantalejo et al., 2008). This scale distinguishes five levels of text difficulty, ranging from "very difficult" (readability < 40; e.g., undergraduate textbooks) to "very easy" (readability > 80; e.g., primary school textbooks).

#### [Insert Table 1 about here]

EMME. We constructed five EMMEs that presented a dot to represent a student's gaze on a SERP or on a particular page. Each EMME modeled a different strategy corresponding to advanced readers (see Table 2). Accordingly, participants were told that the EMMEs were from good students. Specifically, EMME 1 modeled a student who fully inspected the results from a SERP from top to the bottom by carefully reading each snippet; EMME 2 modeled a student who carefully inspected the source of information provided on a webpage, including the webpage header and information about the text author; EMME 3 modeled the strategy of deeply reading the text of a trustworthy page by slowing down his/her gaze movements and showing re-reading behavior, after attending to the source information; EMME 4 modeled the strategy of skimming the text of a less trustworthy page after attending to the source information; and EMME 5 modeled the strategy of quickly leaving a commercial page that was not topically relevant to the student's goal, after focusing on the source information.

#### [Insert Table 2 about here]

**Essays.** The average length of the essays was 235 words (SD = 65, min = 109, max = 420). Responses were analyzed in terms of sourcing and comprehension. We first divided each essay into ideas, defined as units with a main verb that expressed an event, activity, or state (Magliano, Trabasso, & Graesser, 1999). After segmentation, essays were coded to indicate whether the ideas contained an explicit reference to source information, including the author's occupation, the institution that hosted the page, and

scientific studies referenced in the webpages. Then, we identified the webpage or pages that contained that particular idea. Finally, ideas were coded to identify students' understanding of the topic. Specifically, we distinguished among three types of ideas: single idea paraphrases, intratext inferences, and intertext inferences. Single idea paraphrases included correct claims in which students expressed an idea from one of the pages in their own words. Intratext inferences combined two single-idea paraphrases that were from one page, but not connected on the page. The paraphrase was linked to some information from students' prior knowledge. Intertext inferences combined two single-idea paraphrases from two different pages.

The first author and a trained research assistant, both blind to the conditions, independently scored a random selection of 12.7% of the essays for each of the topics: 7 essays included 101 idea units for the CC topic, and 7 essays contained 92 idea units for the GMF topic. The coding of students' references to sources yielded a Cohen's Kappa of 1 for both the CC and GMF topics, and an understanding of the content of .73 and .72 (for CC and GMF, respectively), thus showing substantial agreement. All disagreements were resolved through discussion between the two raters, and the research assistant scored the remaining essays according to the same coding systems.

**Prior topic knowledge.** Prior knowledge about the topics of climate change (CC) and genetically modified food (GMF) was assessed with a true-false measure shortened and adapted from prior studies (e.g., Salmerón et al., 2010). Both measures included items about scientific and political or historical issues for each topic. The internal consistency reliability for participants' scores was questionable (Cronbach's  $\alpha$  = .60 and .62 for the CC (10 items) and GMF measure (9 items), respectively).

**Topic interest.** Participants' personal interest in the topics of CC and GMF was assessed by means of a questionnaire that asked them about their interest and active

involvement in the issues, using a 10-point Likert-type scale ranging from 1 (not at all true of me) to 10 (very true of me). Both measures were shortened and adapted from prior studies (e.g., Bråten, Gil, Strømsø, & Vidal-Abarca, 2009). Cronbach's  $\alpha$  for participants' answers on the CC measure (7 items) was excellent ( $\alpha$  = .91), and it was good for answers on the GMF measure (6 items) ( $\alpha$  = .84).

**Equipment**. We used a SMI REDn eye-tracker with a sample rate of 60 Hz. BeGaze software was used to extract fixations, using the low speed event detection algorithm with a minimum threshold for fixations set at 100 msec.

#### **Procedure**

Participants were tested individually in a computer lab. On arrival, they were randomly assigned to the experimental or control group. First, they completed a questionnaire on demographics and filled out the prior knowledge and interest measures. Then, they were introduced to the reading and writing task. They were told to imagine that they had a personal blog and wanted to write about the topic of CC/GMF. Specifically, they were told to read the pages to write a blog entry arguing about the pros and cons of possible solutions to fight climate change (CC topic) or genetically modified food (GMF topic). After being calibrated to the eye-tracking system (using a 9-point calibration), the Google SERP for the first topic was presented on the screen. From this SERP, they could access the four webpages. Task time was limited to 7 minutes, but participants were also free to end the task earlier. We based this time limit on pilot testing, which indicated that seven minutes would allow all the participants to read the four webpages and re-read some of them. After they finished reading the webpages, participants were given 10 minutes to write the blog entry on a laptop using a word-processing application. Next, participants in the experimental group watched a series of EMMEs for 5 minutes. They were told that the videos displayed students' eyes

while performing a multiple-document task similar to what they had been doing, and that the students were chosen because they were good performers. Participants in the control condition watched a 5-minute video about the topic they had just read and written about (either CC or GMF). Finally, all the students continued with the second topic for the post-test, undergoing the same procedure as on the pre-test. The session lasted approximately 90'.

#### Design

We used a pre-post design with experimental and control groups. To minimize the impact of topic characteristics on the pre-post design, the presentation order was counterbalanced. In addition, to minimize the order effects from the results page, we created two SERPs with different rank orders for each topic.

#### Results

#### Preliminary analyses

As a first step in data preprocessing, raw fixation data were examined to detect outliers, i.e. fixations of 2 SD above or below each student's mean. On average, outlier fixations represented 4.28% of individual fixations (SD = 0.51). They were replaced by the student's median. Next, fixations were aligned with the corresponding area of interest (AOI), which included: (a) individual snippets from the SERP page, (b) the webpage hosting the institution's logo and name, corresponding to the header of each page, (c) webpage text corresponding to the paragraphs on each page, and (d) the text authors' names and affiliations included on each page in a location clearly separated from the text. Fixation times were averaged by the number of words in the corresponding AOI with textual information, in order to control for the difference in text length across webpages.

We also checked whether the two groups differed in their prior knowledge and interest in the two topics used in the study. An ANOVA with topic (CC and GMF) and condition (EMME vs. control) and the percentage of correct responses on the prior knowledge tests revealed non-significant effects of topic, condition, or the interaction (all Fs < 1). A similar analysis with topic interest as dependent variable revealed a large significant effect of topic, F(1, 61) = 20.91, p < .001,  $\eta_p^2 = .26$ , and non-significant effects of condition (both Fs < 1). Participants showed slightly higher interest in CC (M = 7.3, SD = 1.2) than in GMF (M = 7.1, SD = 1.3). It is important that we counterbalanced the topics across time and condition because the potential effect of topic interest was blocked in our design. More critically, prior knowledge and interest in the topic did not differ between conditions.

#### **Processing of Source and Textual Information**

All the dependent variables were normally distributed, except for essay citation indices (particularly pre-test values), which were positively skewed. In these cases, logarithmic transformations were used to approximate distributions to normality.

To test the various hypotheses related to RQ1, we examined students' online processing of source information, including (a) SERP snippets, (b) webpage headers, and (c) information about the text authors. First, we performed a mixed ANOVA with condition (control and EMME) as between-participant variable, time (pre and post) as within-participant variable, and average reading time of the SERP snippets as dependent variable. Results revealed significant effects of condition, F(1, 61) = 5.67, p = .02,  $\eta_p^2 = .09$ , and time, F(1, 61) = 7.23, p < .01,  $\eta_p^2 = .11$ . These results were qualified by a significant interaction between condition and time, F(1, 61) = 14.75, p < .001,  $\eta_p^2 = .20$ . Post-hoc contrasts with Bonferroni correction indicated differences between conditions at post-test (p < .001), but not at pre-test (p = .88). Participants in the EMME group read

the SERP snippets longer than those in the control group only at post-test (see Table 3). Across time, participants in the control group did not differ (p = .42), whereas those in the EMME group increased their SERP reading times from pre to post-test (p < .001).

We further explored students' processing of source information within the webpages. First, we performed a mixed ANOVA with condition (control and EMME) as between-participant variable, time (pre- and post-test) as within-participant variable, and average time spent on the webpage header as dependent variable. Results revealed a significant effect of time, F(1, 61) = 8.04, p < .01,  $\eta_p^2 = .12$ , and a non-significant effect of condition or the interaction (both Fs < 1). Participants in both groups inspected the headers for a longer time at post-test than at pre-test.

Second, we performed a mixed ANOVA with condition (control and EMME) as between-participant variable, time (pre and post-test) as within-participant variable, and average time spent on the webpage's information about the text author as dependent variable. Results revealed non-significant effects of time, F(1, 61) = 2.08, p = .16,  $\eta_p^2 = .03$ , and condition (F<1), and a significant interaction, F(1, 61) = 6.08, p = .02,  $\eta_p^2 = .09$ . Post-hoc analyses with Bonferroni correction indicated that, across time, the control group did not differ in the time spent attending to text author information (p = .48), whereas the EMME group increased their times from pre- to post-test (p<01). Across groups, there were no differences at pre-test (p=.13) or at post-test (p=.21). Whereas participants in the EMME group, compared to those in the control group, spent more time attending to text author information at post-test, this difference failed to reach significance levels.

Finally, for the analysis of text reading times (RQ1d), we included page trustworthiness as an additional factor because in our hypothesis we predicted that the experimental effects would be conditional on this factor related to source evaluation.

Thus, we performed a mixed ANOVA with condition (control and EMME) as between-participant variable, time (pre and post) and page trustworthiness (high or low) as within-participant variables, and average text reading time as dependent variable. Results revealed significant effects of time, F(1, 61) = 8.38, p < .01,  $\eta_p^2 = .12$ , and page trustworthiness, F(1, 61) = 19.00, p < .001,  $\eta_p^2 = .24$ , but not condition, F<1. There were also significant two-way interactions between time and page trustworthiness, F(1, 61) = 4.14, p = .04,  $\eta_p^2 = .06$ , and between page trustworthiness and condition, F(1, 61) = 4.74, p = .03,  $\eta_p^2 = .07$ , but not between time and condition, F(1, 61) = 1.97, p = .16,  $\eta_p^2 = .03$ , These effects were qualified by a three-way interaction between time, trust, and condition, F(1, 61) = 6.62, p = .01,  $\eta_p^2 = .10$ . To interpret this interaction, we conducted separated analyses for each time point. At pre-test, there was an effect of page trustworthiness, F(1, 61) = 25.67, p < .001,  $\eta_p^2 = .30$ , but not of condition or the interaction (both Fs < 1). This indicates that, regardless of the condition, at pre-test participants read trustworthy pages faster than untrustworthy pages.

At post-test, there were no significant effects of page trustworthiness, F(1, 61) = 3.16, p = .08,  $\eta_p^2 = .05$ , or condition, F < 1, but there was a significant interaction between the two variables, F(1, 61) = 9.50, p < .01,  $\eta_p^2 = .14$ . Post-hoc analyses with Bonferroni correction indicated that, at post-test, participants in the EMME group, compared to those in the control group, tended to read trustworthy pages at a slower rate (p = .06) and untrustworthy pages at a quicker rate (p = .03). Similarly, comparisons across groups indicated that participants in the control group read trustworthy pages faster than untrustworthy pages (p = .001), as at pre-test. This means that the control group did not change their reading approach to the texts at post-test. On the contrary, at post-test, participants in the EMME group read pages at a similar speed, regardless of their trustworthiness levels (p = .36). This result indicated that, at post-test, participants

in the EMME group changed their reading strategy, eliminating the increased attention devoted to untrustworthy pages shown at pre-test.

In sum, the results provided partial confirmation of our hypotheses related to RQ1a and RQ1c. From pre- to post-test, students in the EMME group, but not those in the control group, increased their processing time of SERP snippets and text author information within the webpages. No differences were observed in attention to webpage headers (RQ1b). Results for RQ1d, although less clear, partially support our hypothesis. Whereas participants in the control group did not change their text reading times based on the webpage's trustworthiness from pre- to post-test, those in the EMME group shifted from reading trustworthy pages faster than untrustworthy pages at pre-test to reading both types of pages at a similar rate at post-test. More critically, at post-test, participants in the EMME group showed the modeled strategies in reading texts depending on their level of trustworthiness. That is, compared to those in the control group, they tended to read trustworthy pages at a slower rate and untrustworthy pages at a quicker rate.

#### Source Citations and Quality of Ideas in Written Essays

To test the effects of EMME on source citations (RQ2), we ran a mixed ANOVA with condition (control or EMME) as between-participant variable, and time (pre and post) and source type (document and embedded) as within-participant variables. Results showed a close to significant effect of source type, F(1, 61) = 3.64, p = .06,  $\eta_p^2 = .06$ , indicating that participants tended to include a higher percentage of embedded sources than document sources in their essays. Non-significant effects were found for condition, F(1, 61) = 1.12, p = .29,  $\eta_p^2 = .02$ , time, F<1, two-way interactions (F<1 for both cases), or the three-way interaction, F(1, 61) = 2.15, p = .15,  $\eta_p^2 = .03$ .

In addition, to test potential effects of EMME on the quality of the ideas included in the essays (RQ3), we computed a mixed ANOVA with condition (control or EMME) as between-participant variable, and time (pre and post) and idea type (single paraphrase, intra, or inter text inferences) as within-participant variables. There were non-significant main effects of condition, F<1, time, F<1, or idea type, F(1, 61) = 1.18, p = .32,  $\eta_p^2 = .02$ . Similarly, we found non-significant interactions between condition and time, F<1, condition and idea type, F(1, 61) = 1.81, p = .17,  $\eta_p^2 = .03$ , time and idea type, F<1, or the three-way interaction, F<1. Finally, we ran a mixed ANOVA with condition (control or EMME) as between-participant variable and time (pre and post) as within-participant variable on the percentage of ideas from trustworthy pages. We found non-significant effects of condition, F<1, time, F<1, and the interaction, F(1, 61) = 2.00, p = .16,  $\eta_p^2 = .03$ .

In summary, the results did not support our hypotheses for RQ2 and RQ3 because they indicate that EMME had no direct effect on the citations and quality of ideas included in the students' post-test essays.

#### **Relations between Reading Processes and Outcomes**

To analyze the potential effects of EMME on the relationships between eyemovements and essay indices (RQ4), we first performed a series of Pearson correlations between all the dependent measures at post-test. Prior knowledge correlated positively with document source citations, whereas topic interest correlated negatively with the percentage of ideas from trustworthy pages included in the essays. In addition, time inspecting webpage headers and page author information correlated positively with the inclusion of document sources in the essays, but negatively with citations of embedded sources. Not surprisingly, time reading trustworthy pages correlated positively with the percentage of ideas from trustworthy pages included in the essay. Finally, reading times on the SERP correlated positively with the percentage of ideas from trustworthy pages and with the inclusion of document sources in the essay.

As indicated above, at post-test, participants in the EMME condition read the SERP for a longer time than those in the control condition. In turn, this pattern of findings allowed us to test the indirect effect of condition on sourcing in essays. In the current study, we opted for the bootstrapping procedure developed by Preacher and Hayes (2008), which holds no assumptions about the statistical significance of the c path (i.e., the effect of condition on the two dependent variables tested). Specifically, we tested two mediation models. First, we tested the effect of condition (EMME vs. control) on the percentage of ideas from trustworthy pages included in post-test essays, using the SERP reading times at post-test as a mediator. Scores for topic interest were used as a covariate because they significantly correlated with the dependent variable. Second, we tested a similar model with the same independent variable and mediator for the document sources (i.e., the institution hosting the webpages or the texts' authors) cited in post-test essays. Prior knowledge was included as covariate in the second model because it correlated with the dependent variable. In both analyses, condition was dummy coded (EMME = 1, control = 0), and the other variables were centered and standardized. The indirect effect was tested using a bootstrap estimation approach with 1000 samples (Preacher & Hayes, 2008).

The first model accounted for a statistically significant portion of the variance,  $R^2 = .08$ , F(3, 59) = 2.84, p < .05. According to Cohen's (1988) effect size benchmarks,  $R^2$  of .08 can be considered a small effect. The bootstrapped results showed a positive statistically significant indirect effect of condition on the percentage of ideas from trustworthy pages included in the essays via SERP reading times, yielding an estimate of 0.27 (CI<sub>95%</sub>: 0.01 - 0.88). As Figure 1 shows, the direct effect of condition on the

percentage of ideas from trustworthy pages included in post-test essays remained statistically non-significant, which is consistent with full mediation. Finally, the covariate topic interest (b = -.21, SE = .13, p = .08) was not a statistically significant predictor in this analysis.

#### [Insert Figures 1 and 2 about here]

Similarly, the second model resulted in a significant medium effect (Cohen, 1988),  $R^2 = .13$ , F(3, 59) = 4.17, p < .05. The bootstrapped results revealed a positive significant indirect effect of condition on document source citations in the post-test essays via SERP reading times, yielding an estimate of 0.27 (CI<sub>95%</sub>: 0.01 - 0.64). As Figure 2 shows, the direct effect of condition on document source citations included in post-test essays remained non-significant, which is consistent with full mediation. Finally, the effect of the covariate prior knowledge (b = .21, SE = .11, p = .08) was not significant.

To sum up, mediation analyses revealed that EMMEs exerted a positive indirect effect on the quality of students' post-test essays, as indicated by a higher percentage of ideas from trustworthy pages and a higher number of citations of document sources. Specifically, instruction with EMMEs indirectly increased approximately 27% of the standard deviation of these indicators. These effects were mediated by the increased attention given to the SERP due to the instruction with EMME.

#### **Discussion**

This study identified, for the first time, the positive effects of a short instruction based on EMME on students' critical reading of multiple webpages about a conflicting topic. Moreover, the use of eye-tracking methods allowed us to determine how EMME affected students' processing (i.e., attention to source information) and outcomes (i.e., essay quality).

By watching a series of EMME that modeled attention to source information on SERPs and webpages, undergraduate students increased their visual attention to SERP snippets and text author information within the webpages, but not to the webpages' headers. Changes in the way the SERP was processed were particularly noteworthy (medium to high effect size), indicating that participants in the EMME group showed an increased "click restraint", moving from a novice to an expert strategy (Brand-Gruwel et al., 2017; Wineburg & McGrew, 2017). Because SERPs synthesize critical source information from all the webpages in a single space, participants could have used them to reflect on the relevance and quality of the pages and directly compare them (Kammerer & Gerjets, 2014; Salmerón et al., 2010). Corroborating this assumption, our results showed that an increased processing time of SERPs associated with the use of EMME was related to an improvement in students' essays, as indicated by increases in both the percentage of ideas from trustworthy pages and the number of citations of document sources.

The effects of EMME on students' attention to text author information within the webpages are less straightforward. EMME increased students' attention to author information, but this was not related to an improvement in their essays. More surprisingly, EMME had no impact on the processing of webpage headers. In this learning context, source information was distributed across several pages (i.e. SERPs and individual webpages), and source information provided by SERPs was partially redundant with information from the webpages (particularly the information on the headers that was already partially displayed in the snippets). The high increase in SERP processing times in the EMME group could have kept students from processing further information that was redundant. However, across all participants, visual attention to author information and headers within the webpages positively correlated with post-test

essay citations of document sources, which corroborates recent findings indicating that these strategic behaviors positively support participants' inter-textual understanding of the topic (Salmerón, Gil, & Bråten, 2018a).

EMME also changed the way students read the texts, although this change had a limited impact on essay quality. Specifically, participants in the EMME group increased their reading times of texts from trustworthy webpages, but not from untrustworthy webpages. The control group did not change their text reading times. In addition, at post-test, the EMME group tended to devote more time to reading trustworthy pages and less time to untrustworthy pages than the control group. These effects are important, given the inherent difficulty of conveying a complex sequence of strategic decisions in EMME. Three videos from our study modeled selective reading in five steps, but only the first, second, and fifth steps were salient (carefully reading the SERP, looking at source information, and skipping a non-relevant webpage, respectively) because the third (deeply reading a trustworthy text) and fourth (skimming an untrustworthy text) were implicit. Specifically, in order to perform these implicit steps, students first had to observe that the model attended to source information. Second, they had to recognize whether the page was trustworthy or not. Third, they had to note that the model modified their reading pace (slow reading and rereading of trustworthy tests, and quick skimming of untrustworthy texts). Fourth, they had to infer that the model adjusted the reading pace to the level of trustworthiness of the page.

In sum, participants were able to infer the strategic processing conveyed in this complex EMME, even though they were not able to benefit from this strategic behavior, as indicated by the null effects on their essays. This result opens up two different avenues for future research. First, research could analyze how students' individual differences, for example, in reading comprehension, interact with an instruction based

on EMME, because more advanced students could profit from them to a greater extent. Second, different EMME designs can be explored, for example, by adding verbal self-explanations to model the steps that cannot be conveyed visually (Salmerón & Llorens, 2019).

Finally, across all participants, reading times of the texts from trustworthy pages correlated positively with the percentage of trustworthy ideas included in the post-test essay. This result corroborates the importance of instructing students to selectively attend to trustworthy information when learning about conflicting topics (García-Rodicio, 2015; Goldman, Braasch, Wiley, Graesser, & Brodowinska, 2012; Wiley et al., 2009).

Together, our results support the need to go beyond outcome measures in educational research and identify process measures as essential components in order to fully understand complex educational scenarios, such as reading multiple webpages on the Internet. A common argument in favor of process measures is that they allow researchers to understand how students learn, and not just what they learn (Harteis, Kok, & Jarodzka, 2018). However, our study exemplifies a different and probably more critical argument in favor of process data. Our instructional manipulation had no direct effect on essay quality, but it did have an indirect effect via SERP processing. If we had not used eye-tracking measures to analyze how participants processed source information, we would have erroneously concluded that EMME had no effect on essay quality. This is partly due to the fact that participants show great variability in terms of the strategic processes being taught. Preexisting processing differences within and between groups could hide the effects of a manipulation on the learning output if they are not considered in the analyses. Thus, combining process and outcome measures in

statistical models, as in the path analyses used in this study, helps researchers to avoid committing type II errors.

#### **Educational Implications**

As pointed out in previous investigations, the eye movement modeling example is not only a research tool but also an instructional tool because it can be used in classrooms to model the use of effective strategies for successful performance on complex tasks and activities (Mason et al., 2016). Once the videos are prepared, they can easily be used by teachers and instructors when introducing a new strategy or sequence of strategies. These videos can emphasize the importance of paying attention to specific elements, explaining that through appropriate visual behavior, students perform better. Teachers and instructors can also highlight that, even for complex reading tasks that require far more than perceptual processes, the latter are at the basis of information processing. In other words, EMME can contribute to refining students' metacognitive awareness of the various steps into which a complex process can be divided, and the specific strategies that are powerful in completing a task or activity in a learning context.

Paying attention to relevant elements through perceptual cues – like gaze replays – for appropriate encoding of information is the first step in moving toward successful performance on complex and demanding tasks (Jarodtzka et al, 2013; van Marlen et al., 2018). Source evaluation for critical reading is one of these tasks that require visual attention to particular information in order to discriminate between trustworthy and untrustworthy sources. Even short videos showing the visual behavior of a successful performer seem to be effective, at least to some extent, for both the processes and outcomes when reading conflicting documents on the same topic. Therefore, EMME can be implemented in a relatively short time.

Moreover, EMMEs can represent a starting point of tutorials, particularly in blended and online learning environments, and they can also take advantage of learning at one's own time and pace (e.g., Rienties, Tempelaar, Nguyen, & Littlejohn, 2019). Through attentional guidance, EMME contributes to making some essential aspects salient to students in order to increase their online and offline performance, as revealed by process and outcome measures. Even tasks that involve higher-order thinking processes, such as critical reading, are based on appropriate encoding of relevant information during effective processing of text content.

#### Limitations

This study has some limitations. The first is that the design included only two conditions. Eye-tracking studies with complex learning materials are laborious, and practical constraints do not always allow optimal research designs. However, a stronger investigation on the potential of EMME to enhance source evaluations should add more conditions, for example, the use of a different control condition with more traditional video-modeling, or a condition with EMME and the generation of observers' self-explanations.

The second limitation is the use of only four webpages (one text each) for each topic. In the future, more complex designs should also include a set of documents from sources that vary in trustworthiness to a more subtle degree, so that it becomes more challenging to differentiate among the sources. Related to this, the third limitation is that we assumed the trustworthiness of the four webpages on the basis of the sources' characteristics, but we do not know whether the participants perceived the sources' characteristics in the same way. However, we are inclined to assume that university students are able to distinguish between a webpage of the World Health Organization (WHO) and a webpage of a company like Monsanto, or a page of the United Nations

Environment Program (UNEP) and a personal blog, when they encode source information. Nevertheless, future investigations will benefit from a manipulation check regarding webpages' trustworthiness.

The fourth limitation is that we considered only textual information. However, when we search the Internet for information, we face multimedia materials that introduce static or dynamic visualizations. It seems worthwhile to investigate attentional guidance in relation to both types of representations, as well as the integration of verbal and graphic information on pages with different levels of trustworthiness.

#### **Conclusions**

Despite these limitations, this study is the first to indicate that a short EMME can be used to foster important aspects of source evaluation processes for critical reading of documents on debated issues. Attention to the results that appear on a SERP after a search, and to source information within the accessed pages, can be increased through EMME. Moreover, the study also provides evidence that EMME play a role in post-reading essays about the contents read online – in terms of the percentage of ideas from trustworthy pages and the document sources cited – through the mediating variable of the time spent on the SERP. The more time the participants spent carefully reading the snippets of SERP in the EMME condition, the more they reported ideas from trustworthy pages and document sources in their written essays. Thus, EMME are to some extent effective in enhancing, either directly or indirectly, the processing of the reading material, which then has beneficial consequences in terms of the ideas that readers recall from trustworthy sources when engaging in critical reading.

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Table 1

Overview of the webpages for the two topics.

Topic	Webpage	Author	Content	Number of words		
	World Health Organization (WHO)	Director of Environmental Health of WHO	Argues in favor of GMF. States that GMF contain more vitamins and minerals and can be better conserved. The text cites a scientific study to support this view.	272		
GMF	Monsanto (Global Agriculture Company)	Director of department of risk management from Monsanto	Argues in favor of GMF. Outlines higher resistance to insects or diseases of GM crops and higher productivity.	271		
	Food and Agriculture Organization of the United Nations (FAO)	Spanish representative of FAO	Argues against GMF. Discusses ecological risks of GM crops for surrounding soil and plants. The text cites a scientific study to support this view.	265		
	Personal blog	Economist	Argues against GMF. State potential toxicity of GM proteins.	279		
	Iberdrola (Spanish multinational electric utility company)	Iberdrola's project director	The company sector addressed with renewable energy business. Argues in favor of solutions to CC. States the advantages of wind, solar, and hydroelectric power.	252		
CC	United Nations Environment Program (UNEP)	Director of UNEP	Argues in favor of using renewable energies as a solution to CC. Discusses reduction of carbon dioxide emissions by using biodiesel. The text cites a scientific study to support this view.	271		
	Personal blog	Undergraduate student in History	Argues against using renewable energies. Outlines that biofuels make CC worse.	269		
	I2C2 (Spanish climate change research institute)	Communication director of Research Institute	Argues against using renewable energies. Discusses great economic costs and little success of renewable energies. The text cites a scientist from Harvard university to support the claims raised.	296		

*Note*. GMF = Genetically Modified Food; CC = Climate Change

Table 2

Overview of the EMMEs used.

EMME #	Strategy modeled	Description	Screenshot	Time				
1	Full SERP inspection	A student inspects a SERP page from top to bottom, reading at a normal pace all the page titles and some further information from the snippets. The student ends up clicking on a relevant page at the bottom of SERP after a review of the SERP titles.	The professional part of the professional part					
2	Identification of source information	A student looks at the webpage logo, reads the text once at normal pace, and finally reads the author information provided below the text.	Sigue una dieta sana con agua mineral natural  El agua mineral natura is entirella sana con agua mineral natural  El agua mineral natura is entirella sana con agua mineral natural  El agua mineral natura is entirella sana dan sa sala de la funte con mucho culdedi para que el agua no pineda suo casacterididos. El se huma que no labo que henvila gara gragar los liberores de fos labels. Alemné, en determinada zonos de l'agua no para que que henvila que para para para los liberores de fos labels. Alemné, en determinada zonos de l'agua no de para de forte en una basic de regulada por la para certifició de productos quintess ser se emplean para convertir les populals, mentras que el agua embordis de est moy bene. En resuren, el agua mineral natural embordisda es más sana que la del gefe para belen y xidenda es ficil de suas. Es dela para una detas sana.  Esta Farter - Director a Col <sup>o</sup> eccial	52"				
3	Deep reading of trustworthy and relevant pages	A student looks at the webpage logo (institutional page), reads the text twice at normal pace, and finally reads the author information provided below the text.	Disputemental Thomage. D = C	77"				
4	Skim less trustworthy and irrelevant pages	A student looks at the web page logo (popular forum) and user's information located at the left of the text, and quickly skims the text.	© X  © Comparison (Contract Contract C	29"				
5	Quickly abandon topically unrelated pages	A student looks at the webpage logo (commercial service unrelated to the task) and abandons the page without reading the text.	Disputement/OMMA 1 Surger, P - C   Disputement/OMMA 1 K.	18"				

Table 3

Means and standard deviation (in brackets) for measured variables.

	Contro	ol	EMME	Ξ		
	Pre-test	Post-test	Pre-test	Post-test		
Eye-movements indices						
SERP reading times	145.2 (84.5)	132.3 (59.7)	148.4 (84.9)	221.9 (117.4)		
Page header dwell times	700.2 (418.3)	1072.6 (772.2)	789.9 (467.1)	1079.9 (834.1)		
Page author information	1486.4 (1122.0	6) 1342.0 (886.4)	1105.0 (800.7)	1656.0 (1106.0)		
dwell times						
Trustworthy pages	267.5 (45.8)	258.3 (36.6)	271.1 (55.7)	285.1 (55.7)		
reading times						
Untrustworthy pages	312.7 (61.2)	310.6 (57.2)	317.7 (65.3)	271.1 (80.6)		
reading times						
Essay indices						
Single paraphrases	0.7 (1.0)	0.8 (1.5)	0.7 (1.0)	0.8 (1.5)		
Intra-text inference	0.7 (0.8)	0.8 (1.0)	1.1 (1.1)	1.0 (0.9)		
Inter-text inference	1.1 (0.9)	1.1 (0.8)	0.8 (0.8)	0.9 (0.8)		
Percentage of ideas	14.5 (9.7)	13.9 (6.4)	13.4 (8.0)	16.2 (10.8)		
from trustworthy pages						
Document sources	0.3 (0.6)	0.3 (0.7)	0.5 (1.1)	0.7 (0.9)		
Embedded sources	0.5 (1.0)	0.8 (1.0)	0.7 (0.9)	0.6 (0.8)		

Table 4

Zero-order correlations between condition and measured variables at post-test

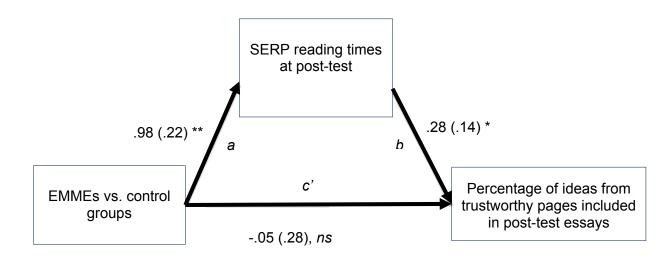
Variable	1	2	3	4	5	6	7	8	9	10	11	12	13	14
1. Condition														
2. Prior knowledge	.08	-												
3. Topic interest	09	.06	-											
4. SERP reading times	.44**	.13	.03	-										
5. Page header dwell times	.01	.24	.11	.44**	-									
6. Page author information dwell times	.16	.13	01	.43**	.66**	-								
7. Trustworthy pages reading times	.24	19	03	.09	.14	.12	-							
8. Untrustworthy pages reading times	28*	25*	06	22	24	22	.03	-						
9. Single idea paraphrase	.02	22	12	13	10	03	.12	.21	-					
10. Intra-text inference	.14	10	19	.12	21	10	.03	.14	.16	-				
11. Inter-text inference	12	.04	.02	03	.09	.03	.08	.07	24	50**	· _			
12. % ideas from trustworthy pages	.13	07	27*	.26*	05	08	.25*	.01	.21	.15	.24	-		
13. Document source citations	.23	.26*	09	.35*	.28*	.30*	09	05	27*	04	.32*	.17	-	
14. Embedded source citations	12	05	04	08	27*	22	.02	.17	.21	.01	.35**	.20	09	

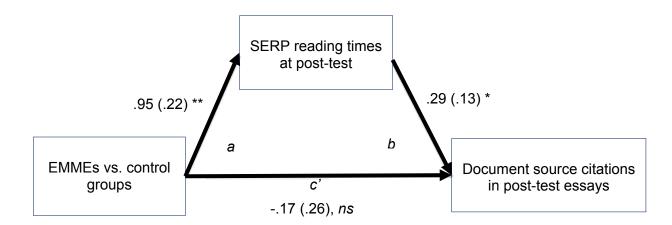
*Note.* \*p < .05, \*\*p < .01.

#### Figure Caption

**Figure 1.** Mediation model for the indirect effect of condition (dummy coded 1 = EMME, 0 = control) on percentage of ideas from trustworthy pages included in post-test essays with SERP reading times at post-test as a mediator (standardized coefficients).

**Figure 2.** Mediation model for the indirect effect of condition (dummy coded 1 = EMMEs, 0 = control) on document source citations in post-test essays with SERP reading times at post-test as a mediator (standardized coefficients).





#### **Practitioner Notes**

## What is already known about this topic

- Critical reading implies sourcing.
- Sourcing is the process of using information about documents in evaluating and interpreting documents' content.
- Sourcing is related to comprehension of multiple texts on the same topic.
- Interventions have been implemented to improve students' critical reading on the Internet through sourcing.
- Eye movement modeling examples (EMME) can be used to guide students' visual attention while performing a task.

# What this paper adds

- EMME increased students' attention to search engine results page (SERP).
- EMME increased students' attention to author information and texts in trustworthy webpages.
- SERP processing time mediated the effects of EMME on the quality of students' post-test essays.
- More ideas from trustworthy pages and citations of document sources featured students' essays in EMME condition.

### Implications for practice and/or policy

- Videos with experts' gaze replays can be included in tutorials for blended and online learning environments.
- These videos can emphasize the importance of paying attention to specific elements when performing a task or activity.
- These videos can contribute to refine students' metacognitive awareness of the various steps involved in a complex process.