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Combining user logging with eye tracking for interactive and dynamic applications
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Abstract

User evaluations of interactive and dynamic applications face various challenges due to the active nature of these displays. For example, users can often zoom and pan on digital products, interactions that cause a change in the extent and/or level of detail of the stimulus. Therefore, in eye tracking studies, when a user's gaze is at a particular screen position (gaze position) over a period of time, the information contained in this particular position may have changed. Such digital activities are commonplace in modern life, yet it has been difficult to automatically compare the changing information at the viewed position, especially between many participants. Existing solutions typically involve tedious and time-consuming manual work. This paper proposes a methodology that can overcome this problem. By combining *eye tracking* with *user logging* (mouse and keyboard actions) on cartographic products, we are able to accurately reference the screen coordinates to geographic coordinates. This referencing approach allows knowing which geographic object (location or attribute) corresponds to the gaze coordinates at all times. We test the proposed approach through three case studies and discuss the advantages and disadvantages of the applied methodology. Furthermore, the applicability of the proposed approach is discussed with respect to other fields of research that use eye tracking, namely, marketing, sports and movement sciences and experimental psychology. From these case studies and discussions, it can be concluded that combining eye tracking and user logging data is an essential step forward in efficiently studying user behavior on interactive and static stimuli in multiple research fields.

Eye Tracking and Dynamic Stimuli: the Challenges

Eye tracking has proven to be a helpful technique in user research, especially when there is a visual element to be evaluated. Using eye tracking data, where, how long and how often a user was looking at a particular area of interest as well as the length and speed of the eye movements can be discovered (Duchowski 2007; Holmqvist et al. 2011). The position of the gaze (also termed the *Point of Regard* or POR) is typically expressed using screen coordinates in pixels. From these basic screen coordinate measurements, various gaze metrics are derived in relation to what is displayed, such as fixation duration (how long), fixation count (how often) and various scan path characteristics (length and speed of eye movements). The technique is applied in a multitude of research fields such as software engineering, industrial engineering (e.g., driving, aviation) marketing (e.g., ad placement, web pages, product label design), psychology (e.g., reading, scene perception, visual search), cartography (e.g., map reading, orientation, way finding), sports and movement sciences (e.g., tactile decision making), landscape perception and design, etc. (e.g., Allopenna et al. 1998; Rayner 1998; Recarte & Nunes 2000; Brodersen et al. 2001; Nivala et al. 2001; Goldberg et al. 2002; Jacob & Karn 2003; Poole & Ball 2006; Duchowski 2007; Pieters 2008; Wedel & Pieters 2006; Rayner 2009)

During the last century, visual stimuli have evolved dramatically, from analogue and static (e.g. Buswell 1935; Fitts et al. 1950) to digital and interactive (both offline and online). Thus, it is important to gain a better understanding of how users perceive, process and react to interactive visual stimuli. Due to user interactions and/or animations, changes in a visual stimulus - such as a change in the color or in location of an object, the (dis)appearance of an object, etc. - will occur. Research on change blindness, for example, has found that some of these changes, although clearly visible, may go unnoticed by the users (Rensink 2002; Simons & Ambinder 2005; Garlandini & Fabrikant 2009). This evolution of visual stimuli and the associated problems with respect to eye tracking studies can be well illustrated in the field of cartography, whereby maps are the focus of interest.

Cartography: a Special Interactive Case

As cartographic products are visual in nature, eye tracking has been helpful in studying map users' cognitive processes while working with different map types and related products. Early studies tested static maps initially on paper (Dobson 1977; Steinke 1979; Castner & Eastman 1984, 1985; Steinke 1987), but later also on digital media (Brodersen et al. 2001). In the last decades, psychological research on cognitive processes linked with visual search has received much attention, thus resulting in new and more detailed theories regarding cognitive cartography (e.g. MacEachren 1995; Slocum et al. 2001; Harrower 2007; Hegarty et al. 2010). Perhaps as a result of this, a renewed interest in the use of eye tracking in cartographic studies has been observed (Fabrikant et al. 2008; 2009; Coltekin et al. 2009; 2010; Popelka & Brychtova 2013; Dong et al. 2014; Incoul et al. 2014).

Recent digital cartographic products – both online and offline – are typically linked with a number of interaction tools that overcome one of their most important drawbacks in comparison to paper maps, which is the limited screen size (e.g. Kraak & Brown 2001; Brewster 2002; Peterson 2003). According to Shneiderman (1992), users of information visualizations (such as maps) typically want to have an *overview* of the data first, select the appropriate region (*zoom-and-filter*) and request its details (*details-on-demand*). In accordance with Shneiderman's observation, zooming and panning tools can be found on nearly all digital cartographic products today, thus allowing for iteration between overviews and detail views (Luebbering et al. 2008; Roth 2011).

User studies that incorporate the interactive nature of digital cartographic products, however, are rare (Coltekin et al. 2009, Russo et al. 2013). Typically, the interactive nature of maps is approximated, e.g., the maps are implemented as a collection of static images or videos. These videos simulate a certain user action with the same start time, duration, and direction, e.g., the simulation of a pan operation in Ooms et al. (2012). This approximation facilitates the processing, comparing and analyzing of the obtained data. However, it also means that the users cannot freely interact. In other words, the users cannot choose when to interact, select the panning distance, identify which zoom level they deem most appropriate for a specific task with respect to increasing or decreasing the level of detail, choose to tilt or rotate the display or decide whether to use a search box. Ideally, under experimental conditions, participants should execute a task on the interactive map as they would *normally* do so without restrictions on their behaviors or on the interactivity levels of the tested display. Testing the users in situations that more closely mimic their natural work routines would increase the ecological validity of the experiment.

On the other hand, an ecologically valid approach with interactive maps would introduce severe challenges to the internal validity of the experiments and create challenges with respect to analyzing the data. For example, it is clear that each participant would start her or his interaction (e.g., pan operation) with the map at a different timestamp, which would complicate the analyses among participants. Further consideration of the panning example indicates that the panning distance (distance between mouse key down and mouse key up actions, i.e., pressing and releasing the left mouse button) will vary with each interaction, such as the direction of the pan operation. In other words, after a panning operation, the screen coordinates in the upper left corner of the screen remain fixed (e.g. at 0,0) though another geographic region is being visualized.

Partly because of the challenges of evaluating dynamic stimuli, we still know very little about how the end users actually read, interpret and process interactive maps and, similarly, other interactive applications. Various studies have shown that interaction tools surrounding the maps in digital environments may hinder effective and efficient information extraction and thus affect the usability of the systems (MacEachren & Kraak 2001; Fabrikant & Lobben 2009; Montello 2009). To this day, there are many (design) issues related to dynamic and interactive maps that are not yet well understood (Virrantaus et al. 2009; Cartwright 2012; van Elzakker &

Griffin 2013). How the changing map display affects the users' cognitive processes during a spatial task remains one of the challenges.

However, when working with cartographic products, we have an advantage as every point in the map is defined by its geographic coordinates. Ideally, eye tracking data in screen coordinates can be transformed to geographic coordinates by using a fairly simple referencing process. That is, *georeferencing the eye tracking data* would overcome the aforementioned problems regarding the evaluation of dynamic map stimuli, thus potentially allowing for more efficient analyses and comparisons than with current techniques.

In this paper, state-of-the-art methods and techniques that try to deal with the dynamic and interactive nature of stimuli in combination with eye tracking studies will be presented, including their drawbacks. Next, we describe various approaches to transform the registered screen coordinates to geographic coordinates. One of the most complete solutions will be tested in a number of case studies. Furthermore, the applicability of the concept in other research fields, namely, experimental psychology, landscape research, sports and movement sciences, and marketing, will be discussed.

Eye Tracking and Dynamic Stimuli: Existing Solutions

Over the years, the vendors of eye tracking software and researchers in the field have developed methods and techniques that attempt to address the dynamic and interactive nature of digital stimuli, at the level of both data acquisition and data analyses. Some of these are a consequence of evolutions in the eye tracking systems themselves, such as the increasing use of mobile eye trackers (e.g., SMI Eye Tracking Glasses¹; Tobii Glasses Eye Tracker²)(Reimer & Sodhi 2006; Kiefer et al. 2013). With these type of eye trackers, users can walk around freely while their gaze position, as well as a video of their visual field, is being recorded. During analyses, the user's gaze position is typically overlaid onto this dynamic video, which differs for each user. A similar approach is often used in the recording and analyses of eye movement data on interactive and dynamic stimuli from static eye trackers as all events on the screen are recorded in a video through screen capturing. However, all of the resulting videos overlaid with the associated eye movement data would have to be processed individually and, for the most part, manually, which is a very time consuming and potentially subjective task. Accordingly, some solutions have been developed to facilitate this process.

One possible approach is the use of *Dynamic Areas of Interest* (AOIs), which are currently implemented in the analysis software of most eye tracking vendors, in place of the traditional static AOIs (Holmqvist et al. 2011). Dynamic AOIs can be defined on dynamic stimuli, such as videos, as the result of mobile eye tracking devices or screen recordings of interactive digital stimuli. As such, dynamic AOI define the position and size (e.g., bounding box) of an object of interest in the dynamic stimuli, and as a consequence, the dynamic AOI will change in position and size over time, thus following the object in the stimulus. Papenmeier and Huff (2010)

¹ <http://www.eyetracking-glasses.com/products/eye-tracking-glasses-2-wireless/technology/>

² <http://www.tobii.com/en/eye-tracking-research/global/library/videos/tobii-glasses/tobii-glasses-2-eye-tracker/>

developed an open-source tool to define dynamic AOIs based on a 3D-model of the visual scene. They also present an overview of existing approaches of dynamic AOIs in which they differentiate between online and offline AOIs. Nevertheless, these dynamic AOIs have an important drawback that drastically diminishes their usability in the case of interactive stimuli or mobile eye tracking devices: each dynamic AOI must be created manually. Some software packages facilitate this task as the manual definition and adjustment of the AOI is only required for a number of key frames, while the software then creates estimates for the frames in between. However, in the case of recordings from interactive stimuli, the resulting video would be different for every participant, which means that these dynamic AOIs would have to be drawn separately for each of participant. This results in extremely tedious and time-consuming manual work, which is not desirable.

Most software accompanying eye tracking systems (e.g., SMI Experiment Center, Tobii Studio, SR Research Experiment Builder) allow for the defining of certain parameters that should be recorded during the experiment, such as mouse actions. These mouse actions are a vital source of information because they are the triggers for the interactions that occur on the screen (Reeder et al. 2001; Pirolli et al. 2002). Because the mouse actions and the eye tracking data would ideally be registered by the same system, no synchronization issues would arise. However, many commercial systems do not make a distinction between the mouse down and the mouse up actions, but rather they record only mouse clicks (i.e., mouse key press is recorded but user release of the key is not recorded). Consequently, mouse movements and dragging (moving the mouse while one of its keys is pressed) cannot be registered, and thus cannot be analyzed, which is essential for certain studies, such as the zooming functionality by drawing a rectangle or by panning. An exception on this is *GazeTracker*³. Various eye tracking vendors, such as Tobii⁴ and SMI⁵, offer SDKs (software development kits) that can be used for creating custom solutions based on the existing software. Similarly, some others – such as Morae⁶ – offer plugins for certain eye tracking software (e.g., Tobii), thus allowing a detailed logging of mouse actions (clicks, movements, etc.) simultaneously with eye movements. A continuous sampling of mouse movements can be obtained and has been used in, e.g., hand-eye coordination studies (Coltekin et al. 2014).

Based on recorded mouse actions (mouse clicks corresponding to user interactions), the analysis software from Tobii (Tobii Studio), for example, also allows segmenting the recorded screen videos such that every segment represents a time interval during which no interactions occur. However, when one wants to evaluate users' attentive behaviors across a large number of participants, the corresponding segments of all participants (e.g., when viewing the same image) must be manually determined, which is, again, a very time-consuming and tedious job. Furthermore, the latter solutions are vendor specific, meaning that to work with other types of eye tracking devices or data, the code would have to be adopted or re-written.

³ <http://www.eyetellect.com/gazetracker/>

⁴ <http://www.tobii.com/>

⁵ <http://www.smivision.com/en.html>

⁶ <http://www.techsmith.com/morae-plugins.html>

SMI also offers a *Video Data Aggregation Package* as an aid in the analyses of eye movement data on dynamic stimuli. With this package, one can map fixations that originally occur on an object in the video to a reference image using *SMI Semantic Gaze Mapping*. All potentially interesting objects that are visible in the video should be present in the static reference image. The analyses of the eye movement data are conducted on the static reference image rather than on the dynamic video. However, an addition to being a vendor specific solution, all fixations must be mapped manually to the reference image, which is, again, a very time consuming and tedious job.

A platform independent automated solution with a finer mouse logging behavior that includes mouse-up and mouse-down actions would introduce a significant benefit to researchers and practitioners with respect to user experience. Especially a solution based on *open source software* would provide sufficient flexibility to adapt the ‘standard’ solution to the experimenter’s needs. Using open source libraries removes dependencies on other (commercial or specialized) software as well as on vendor specific eye tracking hardware.

User logging is not a new methodology as it has been extensively used for many decades in User Centered Design (UCD) to gather quantitative data from end users who execute a certain task on a certain product (e.g. Hilbert & Redmiles 2000; Ivory & Hearst 2001; Paganelli et al. 2002; e.g. Atterer et al. 2006; Wengelin et al. 2009). Through user logging, we can discover, e.g., where users are clicking in an interface, how often certain button combinations are used, whether certain menu items can be found and when the user action occurs. These data provide insights about the usability of the evaluated product (Nielsen 1993). van Drunen et al. (2009), for example, recorded user actions as an indication of user workload while performing a web-based task. However, the recorded mouse actions were not used in the analyses of the eye movements or screen captures (videos) recorded during the experiment, but rather the number of mouse movements were compared with the number of fixations (and other measurements). The position of the mouse movements was not considered in this research, however.

A promising solution are the tools developed by Reeder et al. (2001) - *WebLogger* and *WebEyeMapper*. With the online logging tool *WebLogger*, all user actions and other interesting events are logged and saved. These logs can be loaded into *WebEyeMapper*, along with the recorded eye movements, thus creating a reconstruction of the webpages the participant was viewing that includes the locations of his/her fixations (Pirolli et al. 2002). Although very promising, the disadvantage of this solution is that it is limited to online stimuli that can only be loaded in the Internet Explorer browser.

Users also perform mouse and keyboard actions when working with interactive cartographic products. This can include mouse actions such as clicking, dragging and scrolling, which reveal when and how the user is interacting with the digital map. Logging the mouse interactions might also provide vital data for linking the screen coordinates obtained by an eye tracker to the corresponding geographic coordinates, which will be further explored in this paper. In the next sections, we focus on the selection and implementation of an appropriate method for logging mouse actions at a detailed level that can be combined with eye movement

measurements. In the selection procedure, the focus is on the applicability of the methodology on the cartographic interactive problem because of its special geographic characteristics (i.e., potential georeferencing of eye movement data). Later on, the suitability of the selected methodology in other research fields is also discussed.

Solution for Interactive Cartographic Products: Georeferencing Eye Movements Technical and Conceptual Description of Potentially Suitable User Logging Approaches

In general, we distinguish between *online*, (or *browser-based*), and *desktop-based* user logging approaches. Online logging tools have a disadvantage in that only online applications or applications that work within a browser can be evaluated, while this is possible for both online and offline applications running with desktop-based tools. However, as most of the interactive cartographic products are available online, it is logical to use an *online* logging system, and accordingly, a number of potential promising solutions are also identified.

Online solutions. For custom online solutions, most web-mapping providers (e.g., Google Maps, Bing Maps, etc.) provide *Application Programming Interfaces* (APIs), which are also appropriate for our purposes. However, as we propose a “stand-alone” solution independent of other software, this approach is not optimal (e.g. Roth & Ross 2012; Peterson 2014). Furthermore, these APIs cannot be used in the case of neocartographic maps or mash-up maps. With these latter two types of maps, the base map (from an online map service such as Google Maps) is overlaid with one or multiple additional layer(s) of information from other sources: current position of airplanes, data from Twitter, precipitation data, etc. (Haklay et al. 2008; Cartwright 2012; Das et al. 2012; Moseme & van Elzakker 2012). The main advantage of APIs is that they allow the possibility to obtain access to the base map by requesting the associated geographic coordinates directly without having to calculate them and overlay the data; however, it is not possible to access third-party cartographic products or layers.

In addition to the APIs, it is possible to use existing tools or libraries, such as *OpenLayers* (Hazard 2011) as these provide nearly the same possibilities as the APIs in that they combine existing base maps with additional layers, but they also present the same limitations. For example, using these specific libraries, it is not possible to log user events on neocartographic products if they are not created within that specific library. This limitation makes the use of specific tools or libraries such as OpenLayers not ideal for the stand-alone solution that we propose.

When designing websites, HTML iFrames⁷ are often used to incorporate a web page from a different source in the current one. It can be seen as a rectangle that links to another webpage through a URL. Attaching JavaScript to the main webpage, would, in theory, make it possible to log the users' actions on this page. However, the mouse actions are not registered on the iFrame itself. To be able to access this data, the domains of the parent and child pages must be the same. This problem can be solved using a proxy server, e.g., PhProxy, as is explained in (Atterer 2006;

⁷ http://www.w3schools.com/tags/tag_iframe.asp

Atterer et al. 2006; Rodden & Fu 2007). The page with the web map application is requested through the proxy, and as such, the parent and child pages can have the same domain. In this way, it is possible to log all user actions within an iFrame using JavaScript code attached to a parent page. Similarly, a proxy-server can be used to directly attach a script to log user actions to a web page, such as a web-mapping site, also without an iFrame. As this solution is open-source, it is not linked to a specific eye tracking or web mapping application, and therefore, it will be implemented and further discussed herein. However, it must be recalled that this solutions works only with online (browser-based) applications.

Desktop-based solutions. In addition to the online logging tools, it is possible to create *desktop-based logging tools*. These tools are independent of any browser as the events are logged directly on the device of the participants. Various independent (desktop) programs exist whereby mouse actions can be recorded and replayed (e.g., ReMouse⁸). However, only a few of these programs offer the possibility to actually log the recorded data in an open readable format (such as a comma-separated or tab-separated file) or to distinguish between mouse down and mouse up actions, or to record the scroll wheel, thus again limiting their suitability for this application.

We consider two different alternatives for the open source options — *JNativeHook* and *PyHook* — related, respectively, to the programming languages JAVA and Python. Both libraries request that the associated programming language be installed on the computer, with the necessary extensions able to ‘hook into’ the operating system. The combination of these building blocks — libraries, programming languages, extensions, etc. — form our *desktop user logging tool*. Based on the logged user actions, the corresponding geographic coordinates for each registered eye movement can be calculated (see next section). The code and manual for these libraries can be found on the following web pages:

- <http://sourceforge.net/apps/mediawiki/pyhook>
- <http://code.google.com/p/jnativehook/>

Based on the above considerations, we implemented and evaluated user logging tools with an SDK, a proxy-server and the two desktop based libraries. One of the desktop logging tools, which applies to the widest array of studies, is further evaluated in a number of case studies. These case studies allow us to observe how well the proposed methodology can be applied across multiple studies, including the proposed automatic georeferencing of the obtained gaze coordinates for digital maps. The next section details how to transform the screen coordinates to geographic coordinates in the case of a panning and zooming operation. These two interaction-types are considered as they are most often used (Harrower & Sheesley 2005; Wilkening & Fabrikant 2013).

Calculating Geographic Coordinates

⁸ <http://www.remouse.com/>

The two main categories of user interactions that are possible on nearly any digital map are panning and zooming, each of which triggers a different response in the displayed image. Based on a detailed registration of the users' interactions (time, distance, direction, location), the recorded eye movements can be recalculated to their associated geographic coordinates, that is, the georeferencing eye movements.

Changing the extent of the map: panning. The panning operation corresponds to moving a viewing window over the whole map image without changing the scale of the map. This *viewing window*, which corresponds to the screen on which the stimulus is presented, has its own reference system that consists of screen coordinates typically expressed in pixels and relative to the upper left corner of the screen. To define the complete interaction for the panning operation, only the screen coordinates and timestamp of the *mouse key down* (when the left mouse key is pressed) and the *mouse key up* (when the left mouse key is released) events need to be registered. Within the time window between the mouse key down (MD) and mouse key up (MU), the map image is shifted in a certain direction. This is illustrated in Figure 1a and Figure 1b for the OpenStreetMap⁹ web mapping application.

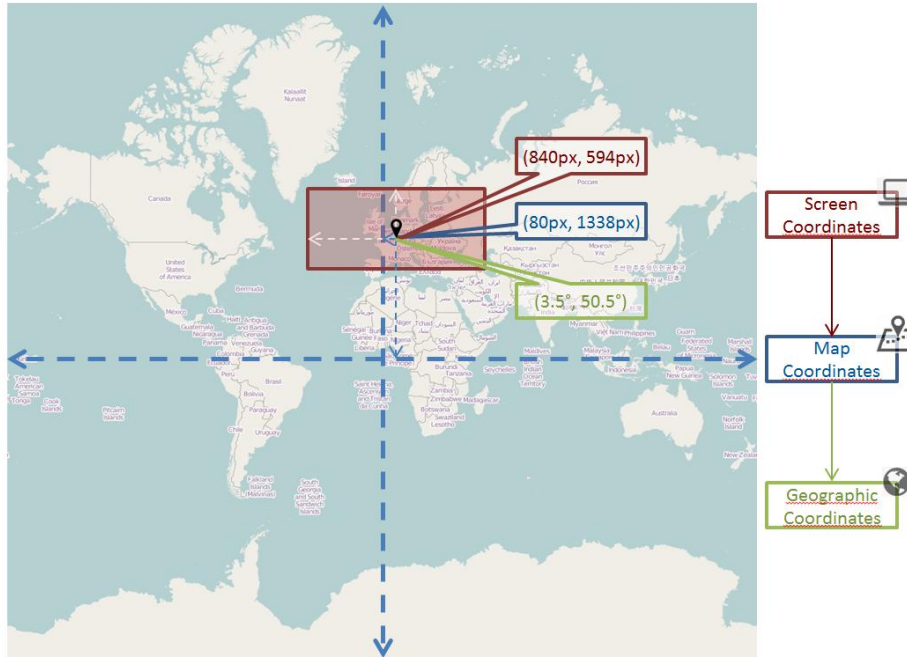


(a)



(b)

⁹ <http://www.openstreetmap.org>



(c)

Figure 1. Illustration of the panning operation and the associated coordinate systems; (a) mouse down and mouse up locations for panning; (b) new position of the viewing window after the panning operation; (c) the whole map image showing the captured coordinates in three different coordinate systems.

Because the scale of the map remains constant during a pan operation, it is possible to define every point on the map by a set of map coordinates (expressed in *pixels*) relative to the center of the whole map image (Figure 1). The screen coordinates of the center of the first viewing window in pixels (px) are (840, 594), which are expressed relative to the red rectangle, thus illustrating the position and dimensions of the screen on which the map is presented. The corresponding map coordinates (in blue, relative to the center of the whole map) are in pixels (80, 1338). Relative to the center of the viewing window, the map coordinates of all other pixels in the current window can be calculated.

In contrast to screen and map coordinates, the geographic coordinates are related to a sphere that approximates the actual shape of the Earth. Consequently, to calculate the corresponding geographic coordinates, the associated map projection formulas are necessary as they define the transformation of the coordinates from a sphere to a flat surface. Most popular mapping platforms, such as OpenStreetMap, Google Maps, Bing Maps and MapQuest use the *Spherical Mercator* projection. The forward and inverse map projection formulas for the Spherical Mercator are given in Table 1 (Snyder 1987). The x and y coordinates in these formulas correspond to the calculated map coordinates (in pixels). The value of R corresponds to the radius of a reduced sphere on which the projection is executed. Consequently, R reflects the scale of the map. To illustrate this, the calculated geographic coordinates of the center of the red

rectangle in Figure 1 are (3.5, 50.5) in *degrees*, corresponding to the geographic longitude (λ) and latitude (φ) of that position.

Table 1

Map projection formulas (forward and inverse) for the Spherical Mercator

Forward map projection formulas	Inverse map projection formulas
$x = R (\lambda - \lambda_0)$	$\lambda = \lambda_0 + \frac{x}{R}$
$y = R \ln \left[\tan \left(\frac{\pi}{4} + \frac{\varphi}{2} \right) \right]$	$\varphi = 2 \tan^{-1} \left[\exp \left(\frac{y}{R} \right) \right] - \frac{\pi}{2}$

The screen coordinates of the illustrated panning operation are $x = 1612$ and $y = 954$ pixels for the mouse down event and $x = 923$ and $y = 418$ for the mouse up event. This can be used to recalculate the map coordinates of the center of the new viewing window at (769, 802) pixels at that particular scale level. Based on these new map coordinates of the center of the viewing window, the corresponding geographic coordinates can be calculated using the Spherical Mercator formulas above.

Changing the scale: zooming. When zooming on a map image, the user changes the scale of the map. Web mapping applications typically work with a fixed set of predefined scale levels, i.e., the multi-scale map images are already rendered and stored in tiles. Every scale level represents the world at a certain size and level of detail. OpenStreetMap, for example, works with 20 levels of detail, each associated with a different value for R in the projection formulas.

Although other options (such as clicking plus or minus buttons, drawing a rectangle, etc.) are also available, the zooming operation is often controlled by the scrolling of the mouse wheel. When zooming in or out, the geographic coordinates and screen coordinates of the mouse position will remain fixed. Because the scale level has changed, the associated value for R needs to be determined. This can be derived from the *scroll wheel logging* (direction and number of ticks). Furthermore, the map coordinates of the new viewing window center must be calculated at the new scale level.

The geographic coordinates and screen coordinates of the mouse position during the scroll operation are both known and fixed and can, accordingly, be used for calculating the associated map coordinates at the new scale level (new R) using the forward map projection formula at that point. Based on the difference in screen coordinates between the mouse position and the center of the screen, the map coordinates of the viewing window center can be calculated. This makes it possible to calculate the corresponding geographic coordinates for all screen coordinates in the current viewing window and that scale level. The next section will present an overview of potential logging tool that are implemented.

Implementations of User Logging and Gaze-georeferencing

An SDK-based Solution for Spatially Referencing the Gaze Coordinates

As a vendor-specific example, Kuhn and Coltekin (2014) have implemented a solution to perform georeferenced gaze tracking based on Tobii's SDK. Main georeferencing was implemented as a C++ plugin of QuantumGIS¹⁰. The implementation is built on a two-level approach so it can work with multiple views using different projections synchronously. The first level (core part) delegates incoming gaze data to various second-level modules. The delegation (or re-direction) to the modules is based on the extent of the view (the rectangle), which every module needs to report. The program further contains a callback function that is activated when the core detects gaze data that intersects with the rectangle. This is how the program "knows" that the gaze is on this view. Once the gaze information is mapped to the currently visible screen extent, the gaze coordinates are georeferenced in real-time and stored. Gaze data can then be supported with further information if/when needed. All collected data are then logged along with the gaze data received from the eye tracker. With this modular system, it is possible to track a user's gaze while working with multiple independent or linked views side-by-side. The implementation was tested with 2D and 3D views, and in its particular form, it has various limitations, especially for 3D viewing where tilting complicates the interaction. In terms of computational performance, translating from screen coordinates to geographic coordinates is rather straightforward and thus runs smoothly in real-time on a modern computer. Certain complex typical GIS functions, such as calculating an intersection between features, can take too long for a real-time implementation depending on the data source and the available indexes. However, for a 2D map with a known setup (static set of shown layers and static symbology), it would be possible to perform such tasks in post-processing to avoid delay. Another challenge is the accuracy of the eye-tracker, which is not at pixel level, and therefore, it is not always possible to assign the current gaze to a single feature. Kuhn and Coltekin (2014), accordingly, recommend recording uncertainty parameters based on the zoom-factor along with the eye-tracker data. Thus far, though, this implementation has its limitations in 3D viewing, but it functions well in 2D with zooming and panning when using Tobii SDK and associated applications.

Online Logging Through a Proxy Server

When implementing and testing the logging options using a proxy server, we discovered that certain web mapping sites (e.g., Bing Maps, MapQuest, etc.) block the registration of the mouse down event on the map itself. The mouse up event is registered on the map while the mouse down event is registered within the iFrame, but only outside the map image. Consequently, not all web mapping sites can be tested with this setting. In addition, we found a similar problem when using a proxy server that directly loads the web-mapping site without iFrames, and attaches JavaScript code (for user logging) to it. Hence, the registration of the

¹⁰ www.qgis.org/

mouse down event is blocked, but only on the map image. Because of its limited usefulness, this approach is not considered further. In the following sections, the desktop-based user logging tools will be evaluated.

Desktop Logging with Open Source Libraries

The JNativeHook and PyHook libraries were tested in a user study (Dupont, Pihel, et al. 2013) (see Case Study 1 for further details on the test). The original code of these libraries (JNativeHook and PyHook) was adapted to the experimenter's needs (i.e., to facilitate the analyses afterwards): additional information could be requested from the experimenter (e.g., participant's ID), write the registered data in a specific structure (column headings) and format (csv) and save it in an appropriate folder. When using JNativeHook, we found that not all user events were registered correctly. More specifically, pressing the spacebar to go to the next stimulus was not always recorded by the logging tool, a problem that considerably complicated the analyses. This failure to record could be the result of a conflict with the eye tracking software that was recording the participants' eye movements at the same time at a rate of 120 Hz. However, this issue was not encountered when executing the same test using PyHook as all data were properly recorded with this system.

Logging Tool Selection Based on Applicability

In summary, among our implementation experiments, the tool that can be applied to the widest array of applications is *the desktop-based user logging tool with the PyHook library*. PyHook allows logging user actions on webpages, independent of the API and the source of the information, and on desktop applications. The main downside of this method is the synchronization issue with the eye tracking device. As the library is not linked with the eye tracker itself, the timestamps in the recordings do not correspond. Therefore, a synchronization point (e.g., an imposed mouse click that is registered by both systems) must be predetermined before initiating the recordings with both tools. A number of case studies are presented herein in which we test the combination of eye tracking and user logging. The study is repeated using eye tracking devices from three important vendors – SMI, Tobii and SR Research¹¹ – to check its applicability with respect to these different devices. Furthermore, georeferencing eye movement data open up new possibilities for data analyses. Next, the combined user logging and eye tracking methodology is applied in user research with static stimuli (maps and photographs). Finally, the applicability of the proposed logging methodology in other fields will be considered in the Discussion section.

Case Studies

Case Study 1: Evaluating JNativeHook and PyHook

In this case study, both desktop-based user logging tools (related to JNativeHook and PyHook) are evaluated. In a first step, only static stimuli (photographs) are included in a user

¹¹ <http://www.sr-research.com/>

study to be able to verify the suitability and accuracy of both tools. In the next case study (see Case Study 2), interactive (cartographic) stimuli are included to evaluate the georeferencing methodology.

During this initial case study, the participants' eye movements were recorded while they were looking at photographs of different landscapes. In total, 63 landscapes were presented to the participants. For each image, the participants were asked to indicate the region in the photograph they found most eye-catching by drawing a rectangle over that region. After completing this task, the spacebar was pressed to continue to a questionnaire in which the participants were asked to indicate why they found that part of the image eye-catching. After pressing OK, the next picture was presented to the participant. Before the start of the actual test and after the calibration, the participants were asked to press a button on the screen. This action synchronized the timestamps from the eye tracking device and the user logging tool. The study itself is described in more detail in a previous paper by Dupont, Pihel, et al. (2013).

The test was conducted with the SMI RED eye tracker in the Eye Tracking Laboratory of the Department of Geography at Ghent University. During the initial main test, JNativeHook was used to log the participants' mouse and keyboard actions. Yet, data analysis revealed that not all spacebar actions were recorded by this logging tool, which significantly complicated the analyses. The test was executed again, but this time the library PyHook was used to log user actions. In this case, all data were recorded properly. Figure 2 shows an extract from the logging dataset in which a clear pattern is visible: drawing a rectangle (mouse down – up in orange), pressing the space bar (in black), indicating an answer in the questionnaire and pressing OK (in green). The light colors correspond to the left mouse key down actions and the darker colors correspond to the left mouse key up actions.

Type	MsgID	MtgName	Message	Time	Injected	PosX	PosY	Wheel	Ascii	Key	KeyID	ScanCode	Ext	Alt	Transit	Wndw	WndwName	WndwRect	WndwClassName
MOUSE	1355	mouse left down	513	2156963	0	1877	394	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
MOUSE	1500	mouse left up	514	2158835	0	2606	637	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
KEY	1532	key down	256	2160177	0	None	None	None	32	Space	32	57	0	0	0	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	1871	mouse left down	513	2164966	0	1968	332	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	1872	mouse left up	514	2165075	0	1968	332	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	1949	mouse left down	513	2166027	0	1995	662	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	1950	mouse left up	514	2166136	0	1995	662	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	2195	mouse left down	513	2170332	0	2270	320	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
MOUSE	2382	mouse left up	514	2172501	0	2742	497	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
KEY	2383	key down	256	2173468	0	None	None	None	32	Space	32	57	0	0	0	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	2569	mouse left down	513	2175870	0	1965	278	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	2570	mouse left up	514	2175979	0	1965	278	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	2633	mouse left down	513	2176744	0	2021	668	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	2834	mouse left up	514	2176837	0	2021	668	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	2885	mouse left down	513	2181751	0	2050	541	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
MOUSE	3039	mouse left up	514	2183826	0	2495	682	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
KEY	3040	key down	256	2185418	0	None	None	None	32	Space	32	57	0	0	0	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3141	mouse left down	513	2187056	0	1995	272	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3142	mouse left up	514	2187165	0	1995	272	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3224	mouse left down	513	2188163	0	1997	664	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3225	mouse left up	514	2188272	0	1997	664	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3412	mouse left down	513	2192157	0	2223	844	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
MOUSE	3515	mouse left up	514	2193374	0	2501	971	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
KEY	3519	key down	256	2194029	0	None	None	None	32	Space	32	57	0	0	0	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3853	mouse left down	513	2198210	0	1968	307	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3855	mouse left up	514	2198288	0	1967	307	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3918	mouse left down	513	2199036	0	2013	667	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	3919	mouse left up	514	2199146	0	2013	667	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	4102	mouse left down	513	2202858	0	2000	612	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
MOUSE	4173	mouse left up	514	2204960	0	2084	678	0	None	None	None	None	None	None	None	852992	None	(1600, 0, 3280, 1050)	WindowsForms10.Window.8.app.0.f357c_r13_ad1
KEY	4198	key down	256	2205105	0	None	None	None	13	Space	13	42	0	0	0	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	4553	mouse left down	513	2208693	0	1959	260	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	4559	mouse left up	514	2208802	0	1959	262	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7
MOUSE	4573	mouse left down	513	2209223	0	1960	279	0	None	None	None	None	None	None	None	132134	SMI Experiment	(1600, 0, 3280, 1050)	HwndWrapper[SMI Experiment Center.exe;cbf443d7

Figure 2. Filtered output of the user logging tool (based on PyHook); rows ordered by time. The color-coded rows indicate a registered user action

The user logging data reveal that when the participant begins drawing the rectangle, this action results in a quantitative measurement that indicates how long the participants need to make a decision. In addition, the rectangle (position and size) is recorded through the screen coordinates of the mouse down and the mouse up actions. We wrote a script that can read a list of subsequent mouse down and mouse up actions in CSV-format and translate the data into an XML-file that can be imported into BeGaze, SMI's software, to analyze eye tracking data. As such, the user-generated rectangles can be used as Areas of Interest (AOIs) on which further analyses can be conducted, e.g., number of fixations, dwell time inside/outside AOI and overlap between AOIs. A resulting AOI with statistics in BeGaze and its associated XML-file are depicted in Figure 3.

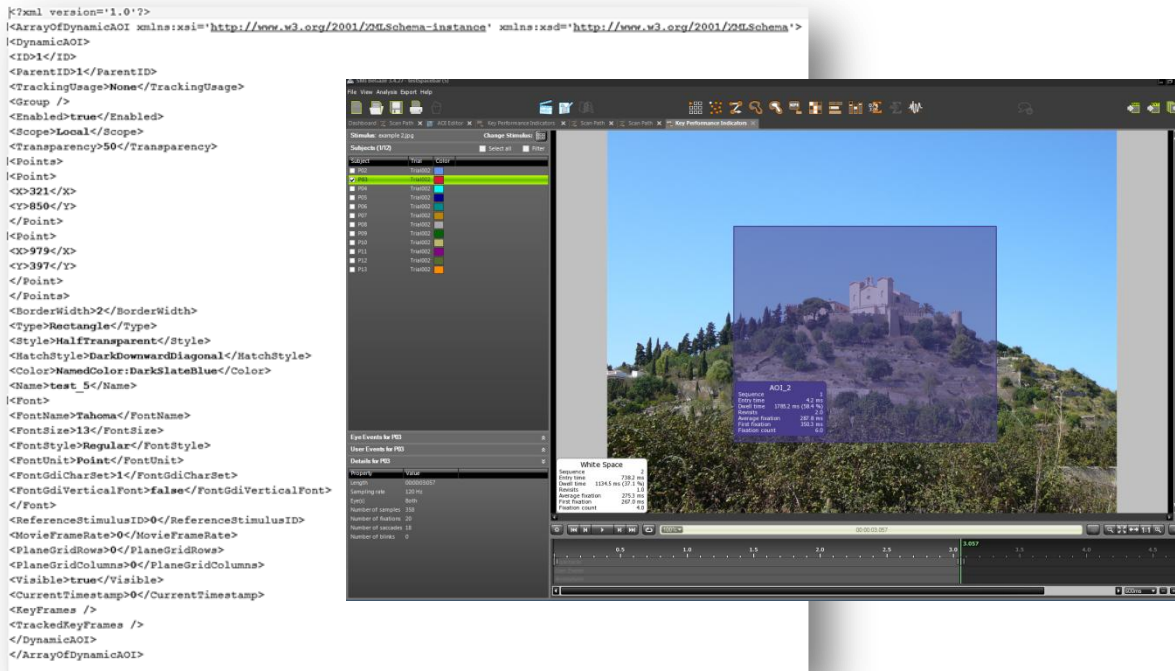


Figure 3. Conversion of rectangles to AOI – XML-file and visualization in SMI BeGaze

Case Study 2: Georeferencing with PyHook

In this first case study, the OpenStreetMap (OSM) web-mapping platform is used as a test platform in a pilot experiment. The pilot experiment is repeated using three different eye tracking devices whose main characteristics are presented in Table 2. As a consequence, three trials with eye movement and user logging data are recorded, each of which is associated with different hardware (eye tracking device). The monitors attached to the three different eye tracking systems all have a different resolution, but this does not influence the experiment itself but rather must only be taken into account during the subsequent georeferencing process. Web mapping sites, such as the OSM, typically work with a number of *zoom levels* or *scale levels*. When panning,

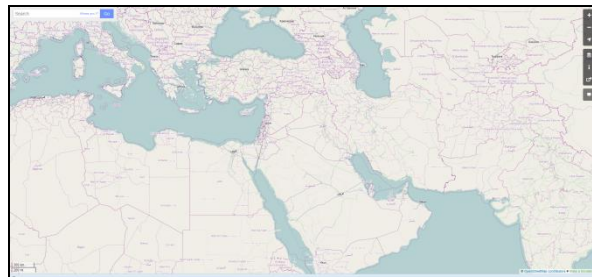
the scale level remains the same. When zooming in or out, however, the scale level changes. The OSM has 20 fixed scale levels, numbered 0 to 19.

Table 2

Characteristics of the three eye tracking devices used in case study 2

Vendor	SMI	Tobii	SRResearch
Name eye tracker	<i>RED250</i>	<i>T120</i>	<i>EyeLink1000</i>
Type	<i>Remote</i>	<i>Remote</i>	<i>Desktop mounted with chin rest</i>
Location	<i>Department of Geography, Ghent University</i>	<i>Department of Geography, University of Zurich</i>	<i>Department of Experimental Psychology, Ghent University</i>
Sampling rate	<i>60-120 Hz</i>	<i>60-120 Hz</i>	<i>1000 Hz</i>
Monitor	<i>22 inch (1680x1050 px)</i>	<i>22 inch (1920x1080 px)</i>	<i>21 inch (1024x768 px)</i>

After the calibration process, participants are asked to push a button that allows for the synchronization of the time measurements from the eye tracker and the PyHook-based logging tool. The mouse down action in the logging tool corresponds to a mouse click action in the eye tracking software. The screen recording modus is then activated (or the pop-up calibration modus for the EyeLink1000) and a URL (<http://www.openstreetmap.org/#map=5/50.000/3.500>) is loaded into the browser. This URL contains the scale level (5, which corresponds to a scale of 1:15,000,000) and geographic coordinates of the center point of the current viewing window in OpenStreetMap (50 degrees north and 3.5 degrees east). This corresponds to the first image in Figure 4 (may differ slightly due to screen resolution). The participant is then asked to pan subsequently to the depicted regions in the assignment (see Figure 4).



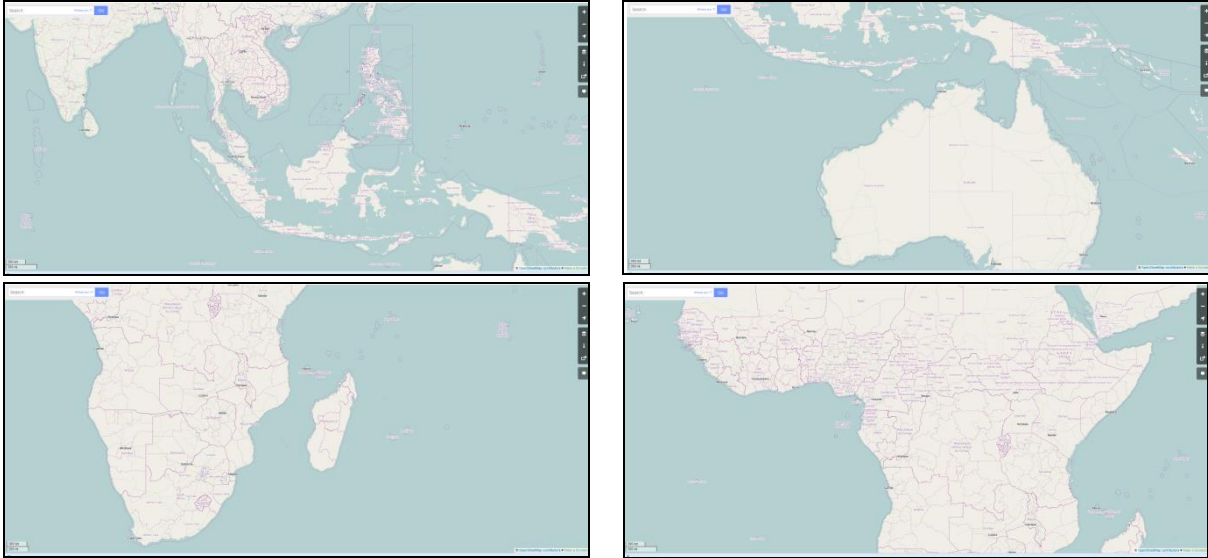


Figure 4. Participant task – the subsequent panning locations

The eye movements recorded during the three trials (on the three different eye trackers) are exported using each of the associated software packages and aggregated into fixations. Figure 5 shows the fixations of one participant who was tested with the eye tracking device from SR Research. This image presents the locations on the screen where the participant was fixating, but it cannot be derived where on the map the fixations took place. The screen coordinates that locate the fixations are transformed to map coordinates and finally to geographic coordinates according to the descriptions in the previous sections.

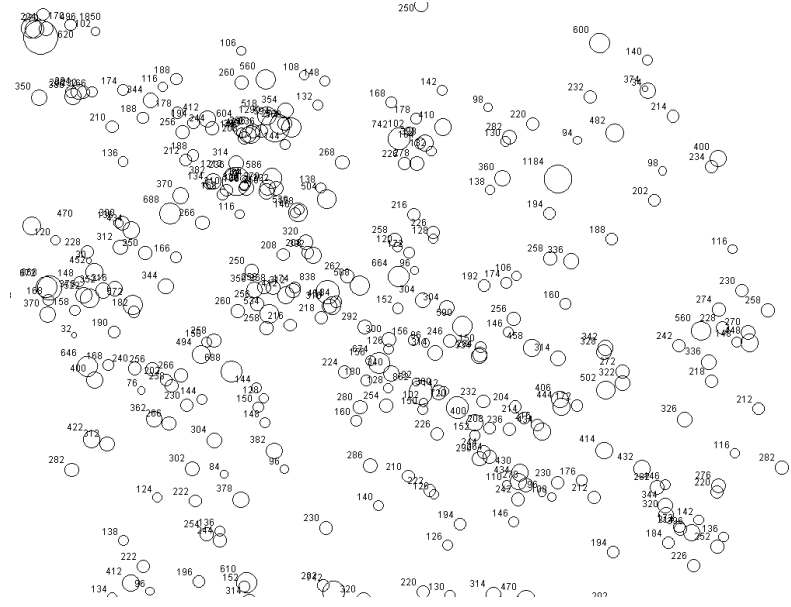


Figure 5. A sample fixation plot of one participant recorded with the SR Research eye tracker based on screen coordinates

The resulting georeferenced fixations can be imported into a Geographical Information System software (i.e., ArcGIS) and placed on top of a dataset that depicts the world's continents (see Figures 6 and 7). Hence, all tools and functions available in a GIS can be applied to the imported fixations and thus used to analyse these fixations. The picture depicted in Figure 6 shows, for example, all imported fixations reprojected in the Spherical Plate Carrée map projection. In Figure 7, the Spherical Mercator projection, which is also used in OSM, is applied (Snyder 1987). Reprojecting the data might yield useful insight into how the eye movements are influenced by distortions in the map image due to different projection systems. Figure 7a shows a *buffer* operation (a typical GIS operation) whereby a polygon is drawn around the fixations (only from SMI in this case). All points in this polygon are within 500 km of the fixation points. This operation is repeated for the fixations of the three trials. With the *intersect* operation (see Figure 7b), the overlapping zones among the three polygons are calculated and added as a new layer to the dataset. The resulting polygons (in beige) correspond to the world regions to which the participants were instructed to pan (see Figure 4).

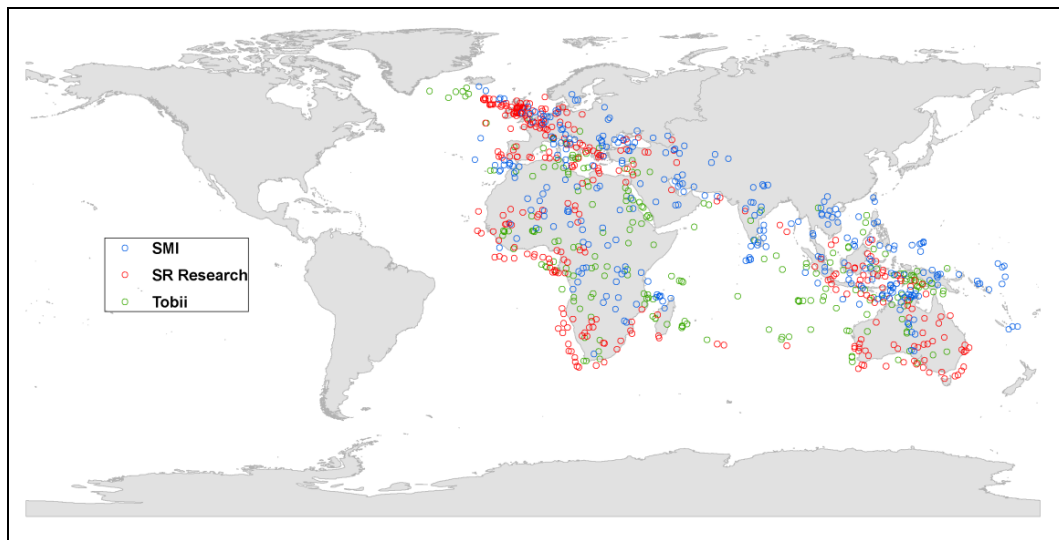


Figure 6. Fixation data in a GIS software displayed with the Spherical Plate Carrée map projection

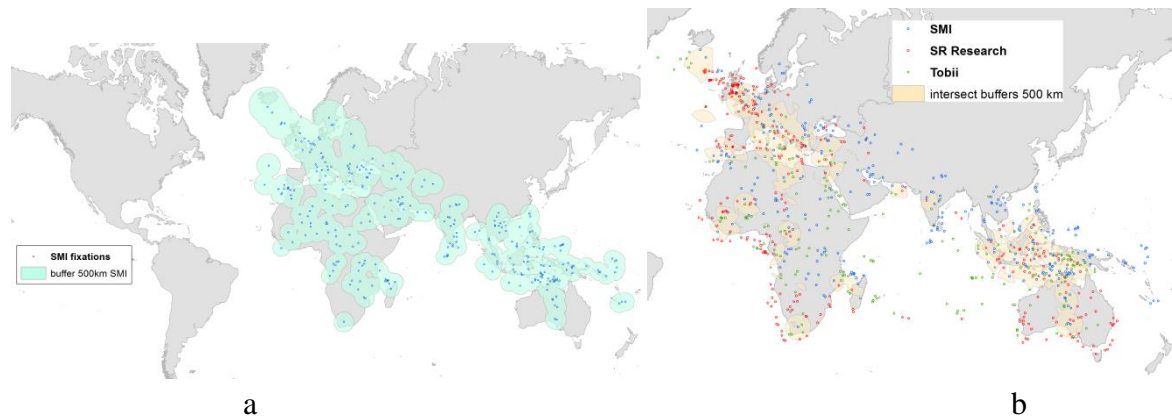


Figure 7. Fixation data in a GIS software displayed with the Spherical Mercator projection and a buffer (500 km, left) and intersect operation (right)

When studying the time measurements from the eye tracker and the logging tool, we discovered that small deviations between the two exist. As these are not unidirectional, they are associated with the actual time registration mechanisms for both. However, a maximal deviation of 10 ms was registered, which is acceptable taking into account the sampling rate of the eye tracking devices from SMI and Tobii (120 Hz or every 8.33 ms for both).

Discussion

The pilot experiments suggest that the methodology we proposed can be used consistently across various eye tracker hardware and software setups to transform recorded gaze coordinates, expressed in screen coordinates, automatically into geographic coordinates. Our suggested approach is based on freely available and open software and therefore can be used independent of the type of eye tracker and can also be used with static stimuli (case studies 1 and 2). The synchronization issue between the time recordings of the logging tool and the eye tracker is a minor issue and can be overcome, for example, by including a key press action at the start of the study that is recorded both by the eye tracker and the logging tool. Accordingly, it serves as a reference point in time. Our approach and the associated validation studies, the presented case studies, offer efficient analyses and comparisons for other user studies wherein static and dynamic stimuli are evaluated.

The recordings from the user logging tool and subsequent conversion of the screen coordinates to geographic coordinates are a vital aid in analyzing data without much manual interference. The obtained data can be automatically queried based on a number of criteria which are explained below:

- Query the eye tracking data based on *screen coordinates*: as such, it can be determined where on the screen the users focus their attention (e.g., more on one side of the screen than the other). This is, however, standard practice for which the additional logging tool is not required. However, for interactive applications, this level of querying may not suffice.
- Query the eye tracking data based on *map coordinates*: this takes the distortions introduced by map projections into account. These coordinates (in pixels), however, are dependent on the scale

level. While this works for panning operations, when working across multiple zoom levels, additional calculations are necessary. This practice is not novel, though it is only rarely applied. Nevertheless, the proposed logging tool could facilitate the automatic calculations and thus increase its usability.

- Query the eye tracking data based on *geographic coordinates*: the calculated geographic coordinates are independent of the scale level. As such, how users visualize or perceive the different parts of the world (or rather, their associated visualization) can be explored. This is rarely if ever used because it is technically complex, which is facilitated by the proposed approach.
- Query the eye tracking data based on the scale level: this is associated with the zooming action. Consequently, users' attentive behaviors and how they vary across a number of scale levels can be evaluated. This query can be executed without georeferencing the eye movement data; that is, only the scale level has to be determined.
- Query the eye tracking data based on other interactions: this can be used to compare the eye movement metrics before, after and during an interaction (how do participants process the information). As previously discussed, certain eye tracking software packages from commercial vendors make it possible to register these interaction, though often not on a detailed level (e.g., distinction between mouse up and mouse down event). However, these solutions are vendor specific, which limits their applicability in comparison to the proposed solution.

Furthermore, the queried or filtered data can be imported into a GIS based on the geographic coordinates, which means that they can be included in the analyses that are typically available in a GIS, such as buffer analyses, cluster analyses, among others (similarly to e.g. Coltekin et al. 2009; Li et al. 2010).

Georeferenced gaze coordinates offer incremental yet important progress in the current analysis of eye movement and the analysis of interactive and dynamic map stimuli. In current analysis routines, most often, the interactions must be located manually based on a video recording of the screen. Next, the data must then be (manually) segmented and labeled (i.e., scale level, geographic region). This allows for an analysis and comparison of the data, but the exact geographical position of the gaze coordinates (points of regard) remain unknown. The geographic coordinates facilitate the comparison of the participants' eye movements on a certain geographic location, visited at a different timestamp because of the interaction tools. Furthermore, Geographic coordinates can be imported in a GIS, in which a wide array of functions is available for further analyses. Similar issues arise when using existing solutions such as *Dynamic AOIs* or *Semantic Gaze Mapping*. Analyses are often executed either on a qualitative level where eye movements are described for each participant separately and compared as such or on an analytical level whereby the analyst must engage in large amounts of laborious, manual work, which could be avoided through an automated process such as the one proposed herein. In the next paragraphs, the applicability of the selected user logging method (based on PyHook) is discussed.

Applications in Other Research Fields

In most cases, possible interactions in a user study can be classified into two types of behavior, as illustrated by the case studies in this paper:

1. The participant can interact freely with a given system: clicking, dragging, zooming, etc. These actions cause some reaction (e.g., open a menu, zoom in on a region, go to a new web page) that can be reconstructed and queried when logging the mouse and keyboard actions.
2. The participants may be asked to indicate a region of interest. This can be more complex than clicking, such as drawing a rectangle around an area. This shape (e.g., the rectangle) can be translated into an *Area of Interest* (AOI), which can then be analyzed or be used in an analysis of eye movements.

The methodological problems that arise from these interactions also occur in other research fields where eye tracking is used with interactive applications, such as experimental psychology (e.g. Allopenna et al. 1998; Rayner 2009; Reichle et al. 2009; Van Assche et al. 2011; Van der Haegen et al. 2013), marketing research (Pieters & Wedel 2004; Pieters 2008; Wedel & Pieters 2006; e.g. Chandon et al. 2009; Cian et al. 2013; Townsend & Kahn 2014), sports and movement sciences (e.g. Lenoir et al. 2000; Vaeyens et al. 2007; Vansteenkiste, Cardon, et al. 2013), etc. Therefore, the user logging methodology that is proposed in this paper can also be beneficial in these research fields, especially when spatial referencing is possible, which, in most cases, it is.

In the field of traffic science, for example, the logging tool could be used to analyze data from hazard perception tests. In a hazard perception test (Crundall et al. 2003; Vansteenkiste, Zeuwts, et al. 2013), participants usually have to click with the mouse on potential hazards in videos of traffic situations. When this is combined with eye tracking, the logging tool would allow a detailed registration of the user actions, making it possible to link it to the eye tracking data. Similarly, the tool could be useful in linking eye movements and steering behaviors while driving in a simulator. In sports sciences, the logging tool, in combination with eye tracking, could be used in a tactical decision-making task (Vansteenkiste et al.) or in an error analysis task. For example, when judging a video of a gymnastic performance, the actions of a judge, such as the replaying of a video, zooming and panning on an image, indicating zones of interest on an image, etc.) can all be registered.

A similar application also exists in marketing. For example, in digital promotion folders, it is possible to flip to the next page, zoom in on a specific item on a page, pan across the detail image, zoom out again, etc. While very few research reports are available regarding these new marketing tools, such research can be facilitated using the methodology described in this paper. Online maps (e.g., Google, Bing) can, in this context, also be used as a marketing tool as millions of consumers around the world already use Google Maps when searching for the perfect restaurant, checking out the best hotels or finding the nearest ATM. Google Maps is becoming a virtual market place as business owners can easily list themselves on Google Maps and display useful information about their businesses and their services.

With respect to work and organizational psychology, the logging tool can be applied in a number of test cases. For instance, researchers at the career matching company *TheLadders* tested how a CV or letter of application is scanned to search for information on a certain candidate (e.g., on the web) (TheLadders 2012). This could be extended with the logging tool,

enabling participants to indicate what they find to be of interest to them. Finally, the proposed tool could be used to collect eye movement data while the subject's cognitive performance is being assessed. For example, eye movement research on text comprehension can be enriched with information when students highlight important keywords or sentences in a textbook passage (e.g. Ponce et al. 2012). In the visuo-spatial abilities domain, the methodology can facilitate investigating ocular information while subjects navigate through a virtual maze environment (e.g. Akinlofa et al. 2014).

Conclusion & Future Work

This paper describes a methodological framework that can be used to efficiently and systematically evaluate interactive applications that can be spatially referenced to real world coordinate systems (such as in cartography) by applying a combination of eye tracking and user logging. By logging the users' actions in detail, the output of the eye tracker – gaze position or *Point of Regard* expressed in screen coordinates – can be transformed to geographic coordinates. This facilitates the analyses of the data, which, as such, can then be largely automated. Allowing the bypassing of tedious, and often manual, selection and structuring of the data, a more automatized approach of the analyses is made possible. In addition, this methodology appears to be potentially beneficial for a number of other research fields.

Nevertheless, the methodology should be further optimized. First, it is still difficult to derive the current scale level after a zooming action, as the number of scroll 'clicks' does not correspond to the number of scale levels traversed. Thus, further research is needed to determine the number of scroll 'clicks' that causes the scale level to change in relation to the speed with which this action is performed. Second, it should also be possible to evaluate other digital cartographic applications, such as Google Earth. This means that the correct projection formulas must be determined, taking into account that the projection can also be rotated in all directions by the user. This can be extended to other applications that may not visualize a part of the earth. An interesting example is the evaluation of the usability of the space-time cube, as described by Kveladze et al. (2013). The space-time cube is often visualized as a 3D interactive system with which the users can interact. That is, the users can rotate, zoom in or out, change the layers that are visualized, change the time filters etc. Logging these user actions in combination with the participants' eye movements would yield critical information with respect to the use of this application.

As a follow-up to this project, the proposed methodological framework will be implemented in user studies whose goal is to evaluate the interactive digital cartographic products, such as web mapping sites (e.g., OSM, Google Maps, or more complex mashup maps), and to assess the impact of the interaction tools on the (different types of) map users' cognitive processes.

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