



Entru

# Biometric data: eye-tracking applications in architecture and design.

Alexandros A. Lavdas 1,2,3

- Lurac Research, Institute for Biomedicine, Affiliated Institute of the University of Lübeck, Via Galvani 31, Bolzano 39100, Italy; alexandros.lavdas@eurac.edu
- The Human Architecture & Planning Institute, Inc., 43 Bradford St, Concord, Massachusetts 01742, USA.
- Department of Psychology, Webster University, Athens Campus, 9 Ipitou Street, Athens 10557, Greece

**Abstract:** Biometrics involves the collection, measurement and analysis of both physical and behavioral characteristics in humans. While the assessment of physical traits is typically employed for authentication purposes, the study of behavioral traits is commonly employed to observe how individuals react to their surroundings, essentially capturing quantifiable human responses. Depending on the focus of a given study, the collection of valence and arousal measurements can also be conducted to acquire emotional, cognitive, and behavioral insights, and correlate them with other response data. Biometric measurements can give architects and designers a basis for data-driven decision-making throughout the design process. In instances involving existing structures, biometric data can also be utilized for post-occupancy analysis. Here, we will focus on eye-tracking and eye-tracking simulation and discuss them in the context of our interaction with the built environment.

**Keywords:** biometrics; eye-tracking; architecture; design; virtual reality; Neuroaesthetics; Neuroarchitecture

1. History of Eye Tracking

The first documented systematic interest in eye movements can be found in Aristotle [1], with the first experimental setup attributed to Prolemy, who had devised a board for examining the range of binocular single and double vision [2]. This topic was later examined in detail by Alhazen [3], and approached systematically in the modern era first by Wells [4]. During the 19<sup>th</sup> century, interest in the systematic study of eye movements increased [5,6], and in 1879 the French ophthalmologist Louis Émile Javal noticed that readers' eyes do not smoothly scan a text while reading, but make quick movements interrupted by short pauses instead - making the first description of the motion known as *saccades* [7]. In 1901, Dodge and Cline introduced a non-invasive eye tracking technique, using light reflected from the cornea, recording eye position onto a photographic plate [8]. However, it only recorded eye positions on the horizontal plane and required the participant's head to be motionless.

A few years later, motion picture photography was first used to record eye movements in two dimensions [9], utilizing a small speck of white material that had been placed on the participants' eyes. A more intrusive approach was that of Edmund Huey in in 1908, utilizing an apparatus which could track eye movement during reading. Subjects had to wear a type of contact lens with a small opening for the pupil, attached to a pointer which changed its position following the movements of the eye[10].

The first dedicated eye-tracking laboratory was founded in 1929 by Edmund T. Rolls at the University of Cambridge, marking the recognition of eye tracking as a field of study. A number of additional advances in eye tracking systems were made during the

**Citation:** To be added by editorial staff during production.

Academic Editor: Firstname Last-

Received: date Revised: date Accepted: date Published: date



Copyright: © 2024 by the authors. Submitted for possible open access publication under the terms and conditions of the Creative Commons Attribution (CC BY) license (https://creativecommons.org/licenses/by/4.0/).

46

47

48

49

50

51

52

54

55

56

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

first half of the twentieth century, by combining corneal reflection and motion picture techniques (see [11] for a review). In one of them, in the late 1940s, motion picture cameras were used to study the movements of pilots' eyes as they used cockpit controls and instruments to land an airplane, in what was the earliest application of eye tracking to usability engineering, ie the systematic study of users interacting with products to improve product design [12]. In the early 1950s, the development of the electrooculogram (EOG) marked a new chapter in the field of eye tracking, providing a more accurate method for tracking eye movements than earlier techniques. The EOG measures the cornea-positive standing potential relative to the back of the eye. By attaching skin electrodes outside the eye near the lateral and medial canthus, the potential can be measured by having the patient move the eyes horizontally a set distance [13]. In the 1950s and 60s, Alfred Lukyanovich Yarbus pioneered the study of saccadic exploration of complex images, by recording the eye movements performed by observers while viewing natural objects and scenes [14]. An important finding was that gaze fixations can be influenced by the instructions given to an observer, demonstrating that high-level factors can overshadow low-level, stimulus-driven guidance of attention [15].

The Pupil-Center Corneal Reflection technique (PCCR) was developed in the 1970s, and became a standard method for tracking eye movements, because of its accuracy and ease of application [16]. It involves using specialized glasses that shine near-infrared light directed at the pupil, creating detectable reflections in both the pupil and cornea. An infrared camera incorporated in the glasses tracks the vector between the cornea and pupil, determining gaze direction. This technology allows researchers to observe the participants' natural gaze and attention in various environments. Other, less frequently used methods have also been developed [5].

# 2. Eye tracking and AI-simulated eye-tracking: applications and findings in Architecture and Design

#### 2.1. What determines first fixations

The initial gaze fixations are guided by pre-attentive processes in the brain: Our visual system has developed mechanisms to prioritize pertinent/salient information for determining suitable actions and regulating their execution. This selection process initiates as soon as an image reaches the retina, with the computation of low-level visual features commencing at this stage and persisting in the lateral geniculate nucleus of the thalamus and early visual cortical areas. There are neurons in the early stages of perception which are specialized to detect specific fundamental visual attributes, such as differences in brightness and contrasting colors. As processing continues downstream through the thalamus and into the visual cortex, characteristics like orientation, direction, and speed of movement are detected (as reviewed by [17]). These features of the visual scene are computed in parallel, creating an early "saliency map" [18]. This initial pre-attentive processing, lasting about 200-250 milliseconds, creates information which guides the early deployment of selective attention and, potentially, action. Approximately 10% of the retinal output follows an alternative pathway, directed towards the phylogenetically older system involving the superior colliculus, as well as the pulvinar nucleus of the thalamus. This alternative route is responsible for early responses to motion in the peripheral visual field visual field [19], as well as fear responses triggered directly from the pulvinar to the amygdala, such as when we perceive threats from potential predators [20]. It is interesting to note that primates seem to have a dedicated circuit for snake recognition in the pulvinar [21], a heritage of the early struggle of humans and their ancestors with serpents.

### 2.2. Importance

As our survival depends on our ability to quickly and accurately interpret environmental cues, any difficulties encountered in this early processing can trigger feelings of

91

92

danger and stress. In other words, environments that pose challenges in their visual processing can induce anxiety, as they lack a feeling of place or "anchoring".

So, the cohesion of visual elements plays a pivotal role in effective information processing, but whether a stimulus elicits a fear response or attraction depends on the nature of the stimulus. For example, a building with a coherent design captures visual attention, but geometric coherence can also result in fear, as observed when encountering a predator. Delays in initial information processing can defer the second evaluation stage, potentially causing stress and a sense of unease. In other words, coherence in the environment may prompt anxiety because it complicates the assessment of whether the surroundings are benign or threatening.

Through his pioneering work, Christopher Alexander [22] identified several parameters that create a connection between viewers and their surroundings. A number of studies have since demonstrated that exposure to certain fractal visual patterns, both in nature and in architecture, can have measurable physiological effects [23,24]. Of particular interest is the finding of the activation of the Default Mode Network (DMN) of the brain during the perception of fractals [25,26] which, together with findings on the role of fractals in stress reduction [23,24], data related to specific EEG responses to fractal patterns [27] and our own data from eye-tracking and eye-tracking simulation studies [28-30] supports the notion of their privileged status in terms of perceptual fluency.

While the benefits of exposure to natural scenes have been documented extensively, similar effects can result from artificial environments that mimic nature's geometrical qualities [31,32]. Importantly, these qualities are not limited to fractal properties, as pioneering work of Nikos Salingaros has shown [33,34]. Our processing system is finely tuned to the visual complexity found in the natural environment, responding positively to specific levels of organized complexity. The presence of fractals is an important aspect of this phenomenon, but it does not describe the entire range of "connecting" qualities [35]. The experience of beauty, often overlooked in modern architecture, results from a multiparametric evaluation of a visual scene, and our current understanding of these findings has started creating a new appreciation of the affective qualities of our built environment [36]. Studies have associated stress with environments that lack a specific level of organized complexity [37], an effect that has parallels with the results of sensory input deprivation [38]. There are also visual patterns that can cause discomfort directly, through mechanistic processes [39].

While eye tracking alone does not provide direct information about emotions, measurements of valence and arousal can also be collected to assess emotional, cognitive, and behavioral information [40], as discussed below.

#### 2.3. Relevance for Architecture and Design

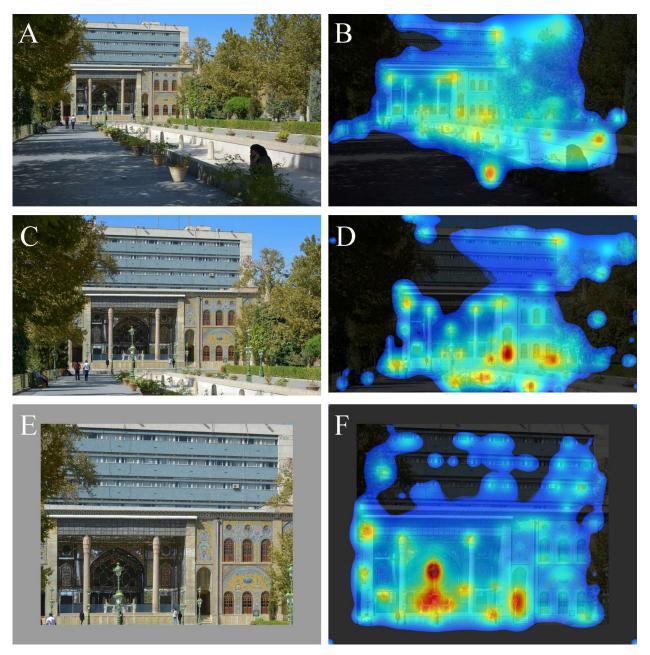
In recent years, numerous studies and experiments within the architecture, engineering, and construction sector have used eye tracking for design evaluation [30,41-44]. Various companies (for example [45-48]) offer research-grade glasses for collecting real-world eye-tracking data, including gaze, fixation, and saccade information. To comprehend participant behavior in authentic/natural settings, it is essential to move beyond the lab and bring research tools directly to those settings, and portable solutions are now offered. A good compromise that is also offered is eye-tracking at home, where a webcam can be utilized, recording eye movements in front of a calibrated monitor.

In addition to actual eye-tracking using volunteers, there are now commercial artificial intelligence (AI) applications which can predict initial viewer responses to images (for example, *Visual Attention Software (VAS)* from 3M [49], Eyequant [50], Attention Insight [51], Neurons [52] and Expoze [53]. These companies leverage artificial intelligence applications developed from extensive eye-tracking experimental data. Such applications generate maps displaying the likelihood of fixation points and estimating the temporal sequence of these fixation occurrences. This approach effectively unveils the subconscious processing of visual stimuli with remarkable accuracy. Initially designed for applications

such as product design, advertising, and signage, this software has now started being used also in assessing architectural and environmental design [28,29,54]. This technology is highly suitable for performing direct comparative evaluations of different structures, facilitating the assessment of both quantitative and semi-quantitative parameters.

Various researchers, including the author of this article, have carried out eye-tracking investigations using images of architecture and constructed environments. These studies have utilized both volunteers to participate in actual eye-tracking experiments [30,41,55-57] as well as 3M's artificial – intelligence based *Visual Attention Software (VAS)* [28,29,49,58,59]. The analysis of gaze sequence and gaze can be performed in either whole images or in pre-defined areas of interest. The capacity to predict a user's engagement with a building's design, particularly as experienced through its facade, is important both as a study subject and because of potential practical applications.

One notable insight coming from such studies is that initial fixation points, guided by pre-attentive processing, consistently center around the existence of humans, particularly their facial features, even within depictions of architectural or urban settings. Moreover, the gaze naturally shifts towards specific elements such as details, contrasts, and structural components that play a role in establishing a comprehensive sense of geometrical coherence [28-30,58,59]. Certain structures instantly engage the viewers' interest because of their cohesive design, while others actively discourage attention, diverting viewers' gazes away from the building's exterior. These observations indicate a strong connection between the visual processes at play and the mathematical coherence or structured complexity inherent in the design. The differences between designs which result in a fragmented gaze heatmap, that seems to disintegrate upon zooming-in to the image, and designs that possess a coherence that is detectable in the gaze heatmap, both initially and at subsequent zooming-in levels, demonstrating heatmap coverage that can be scaled through iterative zoom levels as more detail is being "discovered" on each of them [28,29,58] (Fig. 1).

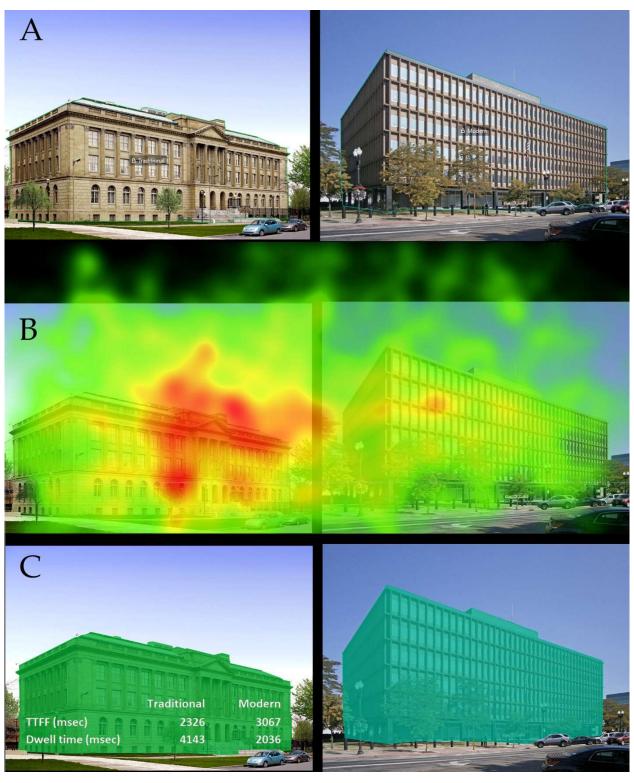


**Figure 1.** (A) The Royal Balcony with the Marble throne, from the 18<sup>th</sup> century, one of the buildings of the Golestan Palace complex in Tehran, Iran. This building is near the border of the complex, and a tall modernist-style office building can be seen from across the street behind it. (B) Eye-tracking simulation heatmap of the ensemble. (C,D) and (E,F): Zoomed-in views with their new heatmaps. (From [29]).

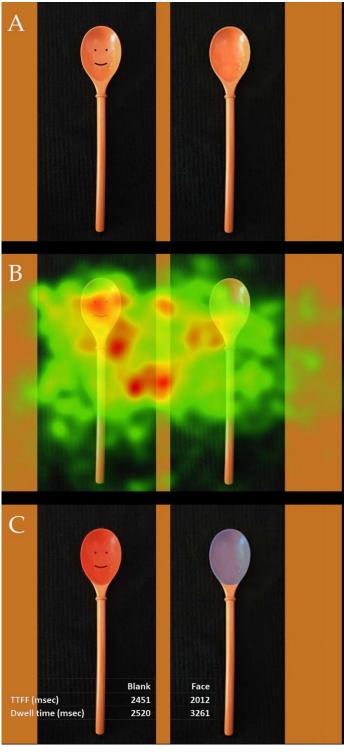
Similar findings have come from a recent eye-tracking study with volunteers [30]. In one of the categories examined in this study, *modern vs traditional*, a clear bias for the complex detail on traditional architecture over the repetitive facades of modern buildings was found. The geometric organization of traditional facades commanded the first fixation in most image pairs. The data also suggested that complexity informs the brain of stimuli worth examining more closely, hence producing significantly longer dwell times. As images in this category came from the 2020 Harris Poll [60], where Americans' conscious preference for traditional buildings was recorded, these results demonstrate the convergence of questionnaire and biometric data, acquired independently by different researchers in different population samples (Fig. 2, more discussion on this in the next section). The same study also examined other morphological features which are thought to

be inherently attractive to the gaze, such as face-like geometry. We know that infants are instantly attracted to faces, and a week after birth they tend to look longer at faces deemed attractive by adults [61], a phenomenon that generalizes across race, sex, and age by the age of 6 months [62] and eye-tracking results from this study showed an attraction to even the most rudimentary face-like pattern (Fig. 3).

These findings carry significant implications for our perception of Architecture. Contemporary buildings, particularly those featuring plain glass exteriors, often receive fleeting glances without distinct fixation points on the building itself. This stands in stark contrast to traditional structures, where the presence of organized complexity with nested hierarchies appears to direct attention to the entirety of the construction. The role of preattentive processing becomes evident in attracting individuals to certain structures while overlooking others. For example, individuals facing old buildings can swiftly identify an entrance. To foster inviting spaces, buildings should integrate elements such as fractal scaling, organized complexity, and repeating symmetries. These features guide viewers in the right direction, fostering a sense of safety, especially in outdoor environments. Eyetracking can be a practical guide in future building design, identifying all these issues at an early design stage.



**Figure 2.** At left, the U.S. Courthouse in Toledo, Ohio, paired with a modern counterpart, the Hansen Federal Building, in Ogden Utah. (B) Heatmaps of both buildings. (C) Outlined AOI. The Time To First Fixation (TTFF) was faster for the traditional building and the dwell time was longer (from [30]).



**Figure 3.** A) Paired images of a spoon with rudimentary face-like cut-outs, and a processed version without them. (B) Heatmap of the pair. (C) AOIs. The TTFF was shorter for the spoon with a face over the blank one without, and the dwell time was longer for it (from [30]).

## 2.4. Eye-tracking and stimulus valence

The intensity and, even more so, the valence of the emotions that will follow when the unconscious gaze attraction is followed by conscious perception of aa scene, cannot be assessed by eye-tracking alone. Combining eye-tracking with data from questionnaires, as in [30] is a way to fill this gap. Another way is the combination of eye-tracking with other biometric techniques. One such approach is the use of electrodermal activity, also

225

226

227

228

229

230

231

232

233

234

235

236

237

238

240

241

242

243

245

246

247

248

249

250

251

252

253

254

255

256

257

258

259

260

261

263

264

265

266

267

268

270

271

272

273

274

called galvanic skin response (GSR) [63]. GSR measures the skin's conductivity and, through it, can detect changes in sympathetic nervous system activity which reflect emotional states [64]. Stimuli that evoke a sense of danger, fear, happiness, or other emotional states can result in elevation in sweat gland activity, which can be measured by GSR. Hence, GSR can provide a measure of emotional arousal, although obviously it cannot identify the valence of the emotion being experienced, but only its impact on the periphery [65]. For a more complete understanding of the individual's reaction to the environment, combinations with other techniques can be employed. For example, in a study where eye tracking and facial electromyography (fEMG) were used to collect data on the participants' visual attention and facial expressions in response to virtual reality environments (VE) [66].

FEMG is a psychophysiological method used to detect electrical potentials generated by facial muscles [67]. This potential, in the range of microvolts, is linearly related to the amount of muscle contraction as well as the number of contracted muscles. This method allows for a better understanding not only of muscle movements and activity themselves but, importantly in the present context, also of their association with certain emotions and behavioral outcomes with which facial expressions correlate [68,69]. For example, parameters like the level of luminance in rooms, the presence or absence of natural lighting, wall color and openness of spaces, as well as the presence or absence of outside landmarks and of a visible entrance were shown to change the way people perceive a space, as assessed by the reflection of this perception on the parameters studied [66]. GSR sensor data showed that skin conductance levels were higher in a negative environment reflecting increased stress, compared to the positive environment. Moreover, heart rate variability indicated a greater emotional response in the negative space compared to baseline values and those obtained in the positive space. FEMG software can often be integrated with other data analysis tools and software platforms, including electroencephalography and eye tracking. FEMG devices can be wearable, compact and lightweight, so they can be used outside a laboratory setting, and have already been implemented, in combination with other techniques, in neuroarchitectural investigations [70,71].

In the 1970s, Ekman and Friesen [72,73] developed a technique for measuring facial behavior, the Facial Action Coding System (FACS) as a comprehensive system to distinguish all possible visible anatomically based facial movements, forming a basis for correlating muscle actions during the expression of basic emotions, with those emotions. FACS dissects all observable facial movements into 44 distinct muscle action units [74] and can be used both for real-time observations and for video-recorded interactions conducted in laboratory conditions, in conjunction with Automated Facial Coding (AFC) [75] software, which can categorize facial movements into emotional or cognitive states [76]. AFC enables the analysis of facial expressions in various contexts, where individuals are observed in their natural environment without the constraints of technical equipment, even using the participants' computers at home, the same way as eye-tracking at home is performed through calibrated webcams. Data for both eye-tracking and facial analysis can be collected at the same time, and analyzed either separately or together, with cross-correlation. The company *iMotions* offers such a solution, with its facial expression analysis module integrating the automated facial coding engines AFFDEX by Affectiva and Realeyes. Using a webcam, one can synchronize expressed facial emotions with stimuli directly in the *iMotions* software, and simply import videos and carry out the relevant analysis [77].

Tracking facial expressions can be a powerful indicator of emotional experiences and complement eye-tracking, providing insights into valence and, as part of a synthesis of multiple data streams, contributing to a better understanding of our interactions with the environment.

VEs are useful for neuroscientists and psychologists as research tools, as well as for architects, designers, and stakeholders, in applications ranging from the early design phases to the real estate sector. VEs offer the advantage of facilitating experimental research in a laboratory under controlled conditions, without the compromises involved in using 2-dimensional images. VE solutions have already been used in many studies in architecture and interior and urban design, for example in manipulating ceiling height, colors, wall curvature and surface textures [78-83] and adding virtual plants [84]. VE studies can also be combined with sensors monitoring correlates of emotional responses, such as skin conductance, and heart rate [66,85-87]. However, the issue of the incompleteness inherent in virtual experiences presents a potential drawback [88,89]. For example, the lack of gravitational and accelerational sensations when navigating virtual spaces hinders multisensory integration. These factors make the VE experience palpably different from reality, and need to be taken into account when designing experiments.

3. Conclusions

Eye-tracking, either on its own or in combination with other biometric measurements and questionnaire responses, can provide architects and designers with a basis for data-driven decision-making throughout the design process. In cases involving existing structures, biometric data can also be utilized for post-occupancy analysis.

The information obtained from these studies, places the concept of Biometrics in Architecture and Design in a more practical and also human-centered perspective: surprisingly, perhaps, to the naïve observer, by systematically exploring the workings of our subjective experiences, we can establish more objective assessments of architectural forms. This stands in contrast to the ad hoc concepts that architects and designers have commonly employed over the past century.

**Author Contributions:** 

Funding:

**Conflicts of Interest:** 

References

- . Ross, W.D. The Works of Aristotle; Clarendon: Oxford, 1927; Volume 7.
- 2. Lejeune A. . L'Optique de Claude Ptolémée dans la Version Latine d'après l'Arabe de l'Émir Eugène de Sicile; Université de Louvain: Louvain, 1956.
- 3. A.I., S. The Optics of Ibn Al-Haytham; TheWarburg Institute: London, 1989.
- 4. W.C., W. An Essay upon Single Vision with two Eyes: together with Experiments and Observations on several other Subjects in Optics; Cadell: London, 1792.
- 5. Wade, N.J. Pioneers of eye movement research. *Iperception* 2010, 1, 33-68, doi:10.1068/i0389.
- 6. Jacob R.J.K, K., K.S. . Eye tracking in Human-Computer Interaction and Usability Research: Ready to Deliver the Promises. In *The Mind's Eye: Cognitive and Applied Aspects of Eye Movement Research*, Hyönä J., R.R., Deubel H., Ed.; Elsevier Science: 2003; Volume 2(3), pp. 573-605
- 7. Javal, E. Essai sur la physiologie de la lecture. *Annales d'Oculi-stique* **1878**, 97-11.
- 8. Dodge R., C.T.S. The angle velocity of eye movements. *Psychological Review* **1901**, 145-157. doi:https://doi.org/10.1037/h0076100.
- 9. Judd, C.H., McAllister, C.N., Steel, W.M. . General introduction to a series of studies of eye movements by means of kinetoscopic photographs. In *Psychological Review, Monograph Supplements*, Baldwin J.M., W.H.C., Judd C.H., Ed.; The Review Publishing Company: Baltimore, 1905; Volume 7, pp. 1-16.
- 10. Huey, E.B. *The psychology and pedagogy of reading, with a review of the history of reading and writing and of methods, texts, and hygiene in reading;* Macmillan: New York,, 1908; pp. xvi p., 1 l., 469 p.
- 11. Mackworth, J.F.; Mackworth, N.H. Eye fixations recorded on changing visual scenes by the television eye-marker. *J Opt Soc Am* **1958**, 48, 439-445, doi:10.1364/josa.48.000439.
- 12. Fitts, P.M., Jones, R.E., Milton, J.L. Eye movements of aircraft pilots during instrument-landing approaches. *Aeronautical Engineering Review* **1950**, 9.
- 13. D.J., C. The electrooculogram. In *Handbook of Clinical Neurology*, Levin K.H., C.P., Ed.; Elsevier: 2019; Volume 160, pp. 495-499.
- 14. L., Y.A. Eye Movements and Vision, translated by B Haigh; Plenum Press: New York, 1967.

, 316 

al 325

- Tatler, B.W.; Wade, N.J.; Kwan, H.; Findlay, J.M.; Velichkovsky, B.M. Yarbus, eye movements, and vision. *Iperception* 2010, 1, 7-27. doi:10.1068/j0382.
- 16. Jacob R.J.K., K.K.S. Eye tracking in human-computer interaction and usability research: Ready to deliver the promises. In *The Mind's Eye: Cognitive and Applied Aspects of Eye Movement Research*; Elsevier Science: 2003; pp. 573-605.
- 17. Itti, L.; Koch, C. Computational modelling of visual attention. Nat Rev Neurosci 2001, 2, 194-203, doi:10.1038/35058500.
- 18. Tollner, T.; Zehetleitner, M.; Gramann, K.; Muller, H.J. Stimulus saliency modulates pre-attentive processing speed in human visual cortex. *Plos One* **2011**, *6*, e16276, doi:10.1371/journal.pone.0016276.
- 19. Banich, M.T.; Compton, R.J. Cognitive Neuroscience, Cambridge University Press ed.; Cambridge, United Kingdom, 2018.
- 20. McFadyen, J. Investigating the Subcortical Route to the Amygdala Across Species and in Disordered Fear Responses. *J Exp Neurosci* **2019**, *13*, doi:Artn 1179069519846445

#### 10.1177/1179069519846445.

- 21. Van Le, Q.; Isbell, L.A.; Matsumoto, J.; Nguyen, M.; Hori, E.; Maior, R.S.; Tomaz, C.; Tran, A.H.; Ono, T.; Nishijo, H. Pulvinar neurons reveal neurobiological evidence of past selection for rapid detection of snakes. *P Natl Acad Sci USA* **2013**, *110*, 19000-19005, doi:10.1073/pnas.1312648110.
- 22. Alexander, C.; Ishikawa, S.; Silverstein, M.; Jacobson, M.; Fiksdahl King, I.; Angel, S. *A Pattern Language*; Oxford University Press: New York, 1977.
- 23. Taylor, R.P. Reduction of Physiological Stress Using Fractal Art and Architecture. Leonardo 2006, 39, 245-251.
- 24. Taylor, R.P.; Spehar, B.; Van Donkelaar, P.; Hagerhall, C.M. Perceptual and Physiological Responses to Jackson Pollock's Fractals. *Front Hum Neurosci* **2011**, *5*, 60, doi:10.3389/fnhum.2011.00060.
- 25. Fischmeister, F.P.; Martins, M.J.D.; Beisteiner, R.; Fitch, W.T. Self-similarity and recursion as default modes in human cognition. *Cortex* **2017**, 97, 183-201, doi:10.1016/j.cortex.2016.08.016.
- 26. Martins, M.J.; Fischmeister, F.P.; Puig-Waldmuller, E.; Oh, J.; Geissler, A.; Robinson, S.; Fitch, W.T.; Beisteiner, R. Fractal image perception provides novel insights into hierarchical cognition. *Neuroimage* **2014**, *96*, 300-308, doi:10.1016/j.neuroimage.2014.03.064.
- 27. Hägerhäll, C.; Laike, T.; Taylor, R.; Küller, M.; Küller, R.; Martin, T. Investigations of Human EEG Response to Viewing Fractal Patterns. *Perception* **2008**, *37*, 1488-1494, doi:10.1068/p5918.
- 28. Lavdas, A.A.; Salingaros, N.A. Architectural Beauty: Developing a Measurable and Objective Scale. *Challenges* **2022**, *13*, doi: <a href="https://doi.org/10.3390/challe13020056">https://doi.org/10.3390/challe13020056</a>
- Lavdas, A.A.; Salingaros, N.A.; Sussman, A. Visual Attention Software: A New Tool for Understanding the "Subliminal" Experience of the Built Environment. *Appl Sci-Basel* 2021, 11, doi:ARTN 6197

#### 10.3390/app11136197.

- 30. Rosas, H.J.; Sussman, A.; Sekely, A.C.; Lavdas, A.A. Using Eye Tracking to Reveal Responses to the Built Environment and Its Constituents. *Appl Sci-Basel* **2023**, *13*, doi: <a href="https://doi.org/10.3390/app132112071">https://doi.org/10.3390/app132112071</a>
- 31. Frumkin, H. Beyond toxicity: human health and the natural environment. Am J Prev Med 2001, 20, 234-240.
- 32. Joye, Y. Fractal Architecture Could Be Good for You Nexus Network Journal 2007, 9, 311-320.
- 33. Salingaros, N.A. The laws of architecture from a physicist's perspective. *Physics Essays* 1995, 8, 638-643.
- 34. Salingaros, N.A.; Mehaffy, M.W. A theory of architecture; Umbau-Verlag: Solingen, 2006; p. 278 pages.
- 35. Salingaros, N.A. *Unified architectural theory : form, language, complexity : a companion to Christopher Alexander's "The phenomenon of life: the nature of order, book 1";* Sustasis Foundation: Portland, Oregon, 2013; p. 300 pages.
- 36. Zeki, S. Beauty in Architecture: Not a Luxury Only a Necessity. *Archit. Design* **2019**, *89*, 14-19, doi: <a href="https://doi.org/10.1002/ad.2473">https://doi.org/10.1002/ad.2473</a>.
- 37. Ellard, C. Places of the Heart: The Psychogeography of Everyday Life, Perseus Books; LLC ed.; New York City, NY, USA, 2015.
- 38. Merrifield, C.; Danckert, J. Characterizing the psychophysiological signature of boredom. *Exp Brain Res* **2014**, 232, 481-491, doi:10.1007/s00221-013-3755-2.
- 39. Penacchio, O.; Otazu, X.; Wilkins, A.J.; Haigh, S.M. A mechanistic account of visual discomfort. *Front Neurosci* **2023**, *17*, 1200661, doi:10.3389/fnins.2023.1200661.
- 40. Mauss, I.B.; Robinson, M.D. Measures of emotion: A review. *Cogn Emot* **2009**, 23, 209-237, doi:10.1080/02699930802204677.
- 41. Zou, Z.; Ergan, S. Where do we look? An eye-tracking study of architectural features in building design. In *Advances in Informatics and Computing in Civil and Construction Engineering.*, Mutis, I., Hartmann, T., Ed.; Springer, Cham: 2018.
- 42. Afrooz, A.; White, D.; Neuman, M. Which visual cues are important in way-finding? Measuring the influence of travel mode on visual memory for built environments. *Assistive Technology Research Series* **2014**, *35*, doi:10.3233/978-1-61499-403-9-394.
- 43. Hollander, J.; Purdy, A.; Wiley, A.; Foster, V.; Jacob, R.; Taylor, H.; Brunyé, T. Seeing the city: using eye-tracking technology to explore cognitive responses to the built environment. *Journal of Urbanism: International Research on Placemaking and Urban Sustainability* **2018**, 12, 1-16, doi:10.1080/17549175.2018.1531908.
- 44. Lu, Z.; Pesarakli, H. Seeing Is Believing: Using Eye-Tracking Devices in Environmental Research. *HERD: Health Environments Research & Design Journal* **2023**, *16*, 15-52, doi:10.1177/19375867221130806.
- 45. Tobii. Available online: <a href="https://www.tobii.com/products/eye-trackers">https://www.tobii.com/products/eye-trackers</a> (accessed on June 14, 2024).
- 46. labs, P. Available online: https://pupil-labs.com/products/neon (accessed on June 14, 2024).
- 47. iMotions. iMotions. Available online: <a href="https://imotions.com/">https://imotions.com/</a> (accessed on October 21, 2023).

- 48. Biopac. Available online: https://www.biopac.com/product/eye-tracking-etv (accessed on June 14, 2024).
- 49. 3M. 3M. Visual Attention Software https://www.3m.com/3M/en\_US/visual-attention-software-us/

Available online: (accessed on accessed on 16 May 2021).

- 50. Eyequant. Available online: <a href="https://www.eyequant.com">https://www.eyequant.com</a> (accessed on 1/12/2023).
- 51. Insight, A. Available online: <a href="https://attentioninsight.com/">https://attentioninsight.com/</a> (accessed on 1/12/2023).
- 52. Neurons. Available online: <u>www.neuronsinc.com</u> (accessed on
- 53. Expoze. Available online: <a href="https://www.expoze.io">https://www.expoze.io</a> (accessed on 1/12/2023).
- 54. Sussman, A.; Ward, J. Game-Changing Eye-Tracking Studies Reveal How We Actually See Architecture. Available online: <a href="https://commonedge.org/game-changing-eye-tracking-studies-reveal-how-we-actually-see-architecture/">https://commonedge.org/game-changing-eye-tracking-studies-reveal-how-we-actually-see-architecture/</a> (accessed on November, 8

).

- 55. Sussman, A.; Ward, J. Eye-tracking Boston City Hall to better understand human perception and the architectural experience. *New Design Ideas* **2019**, *3*, 53-59.
- 56. Lisińska-Kuśnierz, M.; Krupa, M. Suitability of Eye Tracking in Assessing the Visual Perception of Architecture-A Case Study Concerning Selected Projects Located in Cologne. *Buildings* **2020**, *10*.
- 57. Suárez, L. Subjective Experience and Visual Attention to a Historic Building. Frontiers of Architectural Research 2020, 9, 774-804.
- 58. Salingaros, N.A.; Sussman, A. Biometric Pilot-Studies Reveal the Arrangement and

Shape of Windows on a Traditional Façade to be

Implicitly "Engaging", Whereas Contemporary

Façades Are Not. Urban Science 2020, 4, doi:10.3390/urbansci4020026.

- 59. Hollander, J.; Sussman, A.; Lowitt, P.; Angus, N.; Situ, M. Eye-tracking emulation software: a promising urban design tool. *Archit Sci Rev* **2021**, *64*, 1-11, doi:10.1080/00038628.2021.1929055.
- 60. NCAS. Americans' Preferred Architecture for Federal Buildings. Available online: <a href="https://www.civicart.org/americans-preferred-architecture-for-federal-buildings">https://www.civicart.org/americans-preferred-architecture-for-federal-buildings</a> (accessed on
- 61. Slater, A., ; Schulenburg, C. V. D.: Brown, E.; Badenoch, M. Newborn infants prefer attractive faces. *Infant Behavior and Development* **1998**, 345-354.
- 62. Langlois, J.H., Ritter, J. M., Roggman, L. A., Vaughn, L. S. Facial diversity and infant preferences for attractive faces. *Developmental Psychology* **1991**, 79-84.
- 63. Benedek, M.; Kaernbach, C. A continuous measure of phasic electrodermal activity. *J Neurosci Methods* **2010**, 190, 80-91, doi:10.1016/j.jneumeth.2010.04.028.
- 64. Shi, Y.; Ruiz, N.; Taib, R.; Choi, E.; Chen, F. Galvanic skin response (GSR) as an index of cognitive load; 2007; pp. 2651-2656.
- 65. Bakker, J.; Pechenizkiy, M.; Sidorova, N. What's Your Current Stress Level? Detection of Stress Patterns from GSR Sensor Data. In Proceedings of the 2011 IEEE 11th International Conference on Data Mining Workshops, 11-11 Dec. 2011, 2011; pp. 573-580.
- 66. Ergan, S.; Radwan, A.; Zou, Z.; Tseng, H.-a.; Han, X. Quantifying Human Experience in Architectural Spaces with Integrated Virtual Reality and Body Sensor Networks. *Journal of Computing in Civil Engineering* **2019**, 33, doi:10.1061/(ASCE)CP.1943-5487.0000812.
- 67. Read, G.L. Facial Electromyography (EMG). In The International Encyclopedia of Communication Research Methods; 2015; pp. 1-10.
- 68. Dimberg, U. Facial electromyography and emotional reactions. *Psychophysiology* **1990**, 27, 481-494, doi:10.1111/j.1469-8986.1990.tb01962.x.
- 69. Boxtel, A. Facial EMG as a tool for inferring affective states; 2010.
- 70. Chang, C.-Y.; Chen, P.-K. Human Response to Window Views and Indoor Plants in the Workplace. *HortScience: a publication of the American Society for Horticultural Science* **2005**, *40*, 1354-1359, doi:10.21273/HORTSCI.40.5.1354.
- 71. Balakrishnan, B.; Sundar, S.S. Capturing Affect in Architectural Visualization A Case for integrating 3-dimensional visualization and psychophysiology. Communicating Space(s) [24th eCAADe Conference Proceedings / ISBN 0-9541183-5-9] Volos (Greece) 6-9 September 2006, pp. 664-669 2023.
- 72. Ekman, P.; Friesen, W.V. Measuring facial movement. *Environmental psychology and nonverbal behavior* **1976**, *1*, 56-75, doi:10.1007/BF01115465.
- 73. Ekman P., F.W.V. Facial Action Coding System: A Technique for the Measurement of Facial Movement; Consulting Psychologists Press: Palo Alto, California, 1978.
- 74. Ekman, P.; Rosenberg, E.; Editors. What the Face Reveals: Basic and Applied Studies of Spontaneous Expression Using the Facial Action Coding System (FACS). **1997**, **2005**, doi:10.1093/acprof:oso/9780195179644.001.0001.
- 75. Valstar, M.; Mehu, M.; Jiang, B.; Pantic, M.; Scherer, K. Meta-Analysis of the First Facial Expression Recognition Challenge. *IEEE transactions on systems, man, and cybernetics. Part B, Cybernetics: a publication of the IEEE Systems, Man, and Cybernetics Society* **2012**, 42, doi:10.1109/TSMCB.2012.2200675.
- 76. Lewinski, P.; Uyl, T.; Butler, C. Automated Facial Coding: Validation of Basic Emotions and FACS AUs in FaceReader. *Journal of Neuroscience, Psychology, and Economics* **2014**, 7, 227-236, doi:10.1037/npe0000028.
- 77. iMotions. Available online: <a href="https://imotions.com/">https://imotions.com/</a> (accessed on 1/12/2023).
- 78. Elver Boz, T.; Demirkan, H.; Urgen, B. Visual perception of the built environment in virtual reality: A systematic characterization of human aesthetic experience in spaces with curved boundaries. *Psychology of Aesthetics, Creativity, and the Arts* **2022**, doi:10.1037/aca0000504.

- 79. Coburn, A.; Vartanian, O.; Kenett, Y.; Nadal, M.; Hartung, F.; Hayn-Leichsenring, G.; Navarrete, G.; González-Mora, J.; Chatterjee, A. Psychological and neural responses to architectural interiors. *Cortex* **2020**, *126*, doi:10.1016/j.cortex.2020.01.009.
- 80. Lee, K.; Park, C.-H.; Kim, J.H. Examination of User Emotions and Task Performance in Indoor Space Design Using Mixed-Reality. *Buildings* **2023**, *13*, 1483, doi:10.3390/buildings13061483.
- 81. Tawil, N.; Ascone, L.; Kühn, S. The contour effect: Differences in the aesthetic preference and stress response to photo-realistic living environments. **2022**, doi:10.3389/fpsyg.2022.933344.
- 82. Zou, Z.; Yu, X.; Ergan, S. Integrating Biometric Sensors, VR, and Machine Learning to Classify EEG Signals in Alternative Architecture Designs. *Computing in Civil Engineering* 2019 **2019**.
- 83. Banaei, M.; Ahmadi, A.; Gramann, K.; Hatami, J. Emotional evaluation of architectural interior forms based on personality differences using virtual reality. *Frontiers of Architectural Research* **2019**, *9*, doi:10.1016/j.foar.2019.07.005.
- 84. Mostajeran, F.; Steinicke, F.; Reinhart, S.; Stuerzlinger, W.; Riecke, B.; Kühn, S. Adding virtual plants leads to higher cognitive performance and psychological well-being in virtual reality. *Sci Rep-Uk* **2023**, *13*, doi:10.1038/s41598-023-34718-3.
- 85. Fich, L.B.J., P.; Kirkegaard, P.H.; Wallergård, M.; Garde, A.H.; Hansen, Å. . Can architectural design alter the physiological reaction to psychosocial stress? A virtual TSST experiment. *Physiology & Behavior* **2014**, *135*, 91-97, doi:https://doi.org/10.1016/j.physbeh.2014.05.034.
- 86. Vecchiato, G.; Tieri, G.; Jelic, A.; De Matteis, F.; Maglione, A.; Babiloni, F. Electroencephalographic Correlates of Sensorimotor Integration and Embodiment during the Appreciation of Virtual Architectural Environments. *Frontiers in Psychology* **2015**, *6*, doi:10.3389/fpsyg.2015.01944.
- 87. Higuera Trujillo, J.L.; Llinares, C.; Montañana, A.; Rojas, J.-C. Multisensory stress reduction: a neuro-architecture study of paediatric waiting rooms. *Building Research and Information* **2019**, *48*, doi:10.1080/09613218.2019.1612228.
- 88. Valentine, C. Health Implications of Virtual Architecture: An Interdisciplinary Exploration of the Transferability of Findings from Neuroarchitecture. *Int J Environ Res Public Health* **2023**, *20*, doi:10.3390/ijerph20032735.
- 89. Kalantari, S.; Neo, J.R.J. Virtual Environments for Design Research: Lessons Learned From Use of Fully Immersive Virtual Reality in Interior Design Research. *Journal of Interior Design* **2020**, 45, doi:10.1111/joid.12171.