

THE PAST, PRESENT, AND PROMISE OF SONIFICATION

Bruce N. Walker

Sonification Lab, Georgia Institute of Technology, USA
ORCID: <https://orcid.org/0000-0001-8503-5621>
bruce.walker@psych.gatech.edu

PASADO, PRESENTE Y PROMESAS DE LA SONIFICACIÓN

Cómo citar este artículo/Citation: Walker, Bruce N. (2023). The Past, Present, and Promise of Sonification, 199(810): a728. <https://doi.org/10.3989/arbor.2023.810008>

Recibido: 25 enero 2023. Aceptado: 12 abril 2023.
Publicado: 18 enero 2024.

ABSTRACT: *The use of sound to systematically communicate data has been with us for a long time, and has received considerable research, albeit in a broad range of distinct fields of inquiry. Sonification is uniquely capable of conveying series and patterns, trends and outliers...and effortlessly carries affect and emotion related to those data. And sound—either by itself or in conjunction with visual, tactile, or even olfactory representations—can make data exploration more compelling and more accessible to a broader range of individuals. Nevertheless, sonification and auditory displays still occupy only a sliver of popular mindshare: most people have never thought about using non-speech sound in this manner, even though they are certainly very familiar with other intentional uses of sound to convey status, notifications, and warnings. This article provides a brief history of sonification, introduces terms, quickly surveys a range of examples, and discusses the past, present, and as-yet unrealized future promise of using sound to expand the way we can communicate about data, broaden the use of auditory displays in society, and make science more engaging and more accessible.*

KEYWORDS: Sonification; history; future; sound design

Copyright: © 2023 CSIC. This is an open-access article distributed under the terms of the Creative Commons Attribution 4.0 International (CC BY 4.0) License.

RESUMEN: El uso del sonido para comunicar datos de forma sistemática lleva mucho tiempo entre nosotros y ha sido objeto de una investigación considerable, aunque en una amplia gama de campos de investigación distintos. La sonificación tiene una capacidad única para transmitir series y patrones, tendencias y valores atípicos... y transmite sin esfuerzo el afecto y la emoción relacionados con esos datos. Asimismo, el sonido -por sí solo o junto con representaciones visuales, táctiles o incluso olfativas- puede hacer que la exploración de datos resulte más atractiva y accesible para un mayor número de personas. Sin embargo, la sonificación y las visualizaciones auditivas siguen ocupando sólo una pequeña parte de la atención popular: la mayoría de la gente nunca ha pensado en utilizar sonidos no verbales de esta manera, aunque sin duda está muy familiarizada con otros usos intencionados del sonido para transmitir estados, notificaciones y advertencias. Este artículo presenta una breve historia de la sonificación, introduce términos, repasa una serie de ejemplos y analiza el pasado, el presente y las futuras promesas del uso del sonido para ampliar la forma en que podemos comunicar datos, extender el uso de pantallas auditivas en la sociedad y hacer que la ciencia sea más atractiva y accesible.

PALABRAS CLAVE: Sonificación; historia; futuro; diseño sonoro

1. INTRODUCTION

An auditory display can be broadly defined as any display that intentionally uses sound to communicate information. Such uses of sound have clearly been with us for a very long time, and have received considerable research, albeit in a broad range of distinct fields of inquiry. Sonifications most typically have been defined as a subtype of auditory displays that use nonspeech audio to represent information. Kramer *et al.* (1999) further elaborated that «**sonification is the transformation** of data relations into perceived relations in an acoustic signal for the purposes of facilitating communication or interpretation,» and this general definition has persevered. Sonification, given its blend of science and design, is uniquely capable of conveying series and patterns, trends and outliers...and effortlessly carries affect and emotion related to those data. And sound—either by itself or in conjunction with visual, tactile, or even olfactory representations—can make data exploration more compelling and more accessible to a broader range of individuals. Nevertheless, sonification and auditory displays still occupy only a sliver of popular mindshare: most people have never thought about using non-speech sound in this manner, even though they are certainly very familiar with other intentional uses of sound to convey status, notifications, and warnings. This article provides a brief history of—and rationale for—sonification, introduces terms, quickly surveys a range of examples, and discusses the past, present, and as-yet unrealized future promise of using sound to expand the way we can communicate about data, broaden the use of auditory displays in society, and make science more engaging and more accessible.

1.1. Past: The Rationale for the Use of Sonification

The rationale and motivation for displaying information using sound (rather than a visual presentation, etc.) have been discussed extensively in the literature for a long time (e.g., Bly *et al.*, 1985; Jeon, Walker, & Barrass, 2018, 2019; Kramer, 1994; Nees & Walker, 2009; Peres *et al.*, 2008; Sanderson, 2006; Supper, 2014, 2015; Walker & Nees, 2011). Briefly, though, it has long been known that auditory displays exploit the superior ability of the human auditory system to recognize temporal changes and patterns (Bregman, 1990; Flowers, Buhman, & Turnage, 1997; Flowers & Hauer, 1995; Moore, 2013). In many instances, response times for auditory stimuli are faster than those for visual stimuli (Spence & Driver, 1997). As a result, auditory displays may be the most appropriate modality when the information being displayed has complex patterns, changes in time, includes warnings, or calls for immediate action.

Additionally, it has long been known that in practical work environments the operator is often unable to *look* at, or unable to *see*, a visual display. The visual system might be busy with another task (Fitch & Kramer, 1994; Wickens & Liu, 1988), or the perceiver might be visually impaired, either physically or as a result of environmental factors such as smoke in a burning building or line-of-sight obstructions (Fitch & Kramer, 1994; Wickens, Gordon, & Liu, 1998); or the visual system may be overtaxed with information (see Brewster, 1997; Brown, Newsome, & Glinert, 1989).

In some cases, auditory and voice modalities have been shown to be most compatible when systems require the processing or input of verbal-categorical information (Wickens & Liu, 1988). Other features of auditory perception that suggest sound as an effective data representation technique include our ability to monitor and process multiple auditory data sets (parallel listening) (Fitch & Kramer, 1994).

Finally, advances in technology for the past several decades have simultaneously expanded visual information displays toward opposite extremes in physical size. Portable devices (e.g., the latest «smart» wristwatches) continue the trend toward smaller physical dimensions, thereby leaving appreciably less space (or perhaps even no space) for a visual display (see an early recognition of this, Brewster, 2002). Fixed work stations, on the other hand, have become characterized by multiple visual displays with increasingly large physical sizes, due in part to increases not only in the affordability of displays but also in the expanded computing power to support multiple concurrent displays. This extends to modern immersive virtual reality (VR) contexts with massive pixel counts. As a result, visually intensive workstations and other multitasking situations may overburden the visual modality (see Grudin, 2001, for another early recognition of this problem). Thus, the inclusion of nonspeech audio in interfaces can promote universal design principles such as flexibility in use and perceptible information (see Connell *et al.*, 1997; McGuire, Scott, & Shaw, 2006).

1.2. A Very Brief History of (the Field of) Sonification

Although investigations of audio as an intentional¹ information display modality date back over 75 years (see Frysinger, 2005; and see Worrall, 2018 for a «pre-history»), it was the advent of digital computing technology that really enabled sonification to gain the potential for ubiquity. Near the beginning of what might be considered the *sonification era* (about 1994 onwards), Edworthy (1998) even argued that the advent of auditory displays and audio interfaces was practically inevitable given the ease and cost efficiency with which electronic devices can now produce sound. A quarter century later, we may finally be approaching that level; however, much remains to be done to truly unlock the power and potential of sonification and other auditory display technologies.

The formation of the International Community for Auditory Display (ICAD²), and the first of its now-annual conference the *International Conference on Auditory Display* (sharing the ICAD acronym) in 1992, was a seminal point in the rise of sonification as a systematic scientific tool and a flexible expressive medium (see Kramer, 1994). Members of the nascent ICAD community (many of whom are still active in the field today, more than thirty years later) produced the collaborative *Sonification Report* (Kramer *et al.*, 1999) as a starting point for a more structured discussion of the theory of sonification by identifying four issues that should be addressed in a theoretical description of sonification. These included: (1) taxonomic descriptions of sonification techniques based on psychological principles or display applications; (2) descriptions of the types of data and user tasks amenable to sonification; (3) a treatment of the mapping of data to acoustic signals; and (4) a discussion of the factors limiting the use of sonification.

Since then, research into the *where, when, and how* of sonification has blossomed, encompassing researchers from such diverse fields as audio engineering, audiology, computer science, informatics, linguistics, mathematics, music, psychology, and telecommunications, to name but a few. Sonification began to be implemented in fields as disparate as STEM education (Bonebright *et al.*, 2001), astrophysics (Candey, Schertenleib, & Diaz Merced, 2006), and rowing (Schaffert *et al.*, 2009). An array of conferences, venues, and publications have further showcased sonification in science, education, and entertainment. Sonification tools have appeared regularly (see later discussion) and design guidelines (see later discussion) have continually evolved, to support all kinds of users and sonification use cases.

Progressively, an understanding of the theory underlying sonification has evolved. This started with an amalgam of important insights and generalizations drawn from the convergence of these many diverse fields (e.g., Barrass, 1997; Brazil, 2010; de Campo, 2007; Frauenberger & Stockman, 2009; Hermann, 2008; Nees & Walker, 2007; Neuhoff & Heller, 2005; Walker, 2002, 2007), followed by more systematic statements of sonification principles (see, e.g., Brazil & Fernstrom, 2009; de Campo, 2007; Frauenberger, Stockman, & Bourguet, 2007; Nees & Walker, 2007). The field marked milestones with encyclopedia entries (e.g., Walker & Kramer, 2006; Nees & Walker, 2009), and with the publication of *The Sonification Handbook* (Hermann, Hunt, & Neuhoff, 2011). Interest in, and need for, periodic summaries of the theory, methods, and practices for sonification has continued to the present (see, e.g., Jeon, Walker, & Barrass, 2018, 2019; Walker, 2021; and Walker & Nees, 2011, as just some examples). Nevertheless, there remains concern about whether there is such a thing as a theory of sonification. Nees (2019) recently summarizes the weaknesses of the field of sonification, as it relates to «theory», and discusses, instead, the potential for a «design theory» of sonification. Regardless of the state of theorizing, it is still possible, and useful, to describe the state of play in sonification, as a point of departure for discussing where the field may be (or may need to be) heading. This is congruent with the recent comprehensive overview by Andreopoulou and Goudarzi (2021) of 30 years of ICAD conference papers, showing a growth in the focus on «sonification», the popularity of the concept of «design», and an increase in interest for / use of more rigorous evaluation methods in relation to sonification.

1 *Intentional* sounds are designed as an information display (see Walker & Kramer, 1996), as distinct from *incidental* sounds, which result organically from the normal operation of a system (e.g., a car engine running). Both can be informative.

2 ICAD Website: <https://www.icad.org>

2. A TAXONOMY OF SONIFICATION

To understand, discuss, research, and work with auditory displays and sonification, it is useful to have an organizational structure. Of course, such a taxonomy is not strict, and must be flexible enough to flow with the evolution of the field. One approach is based on the functions of sounds in interfaces; another is based on the way the sonification is designed.³

2.1. Functions of Auditory Displays

Alerts and notifications are sounds that indicate that something has occurred, or is about to (see seminal work by Buxton, 1989; Sanders & McCormick, 1993; Sorkin, 1987). Alerts and notifications tend to be simple and particularly overt. The message conveyed is information-poor. For example, a beep is often used to indicate that the [cooking time on a microwave oven has expired](#). There is generally little information as to the details of the event—the microwave beep merely indicates that the time has expired, not necessarily that the food is fully cooked.

Alarms and warnings are alert or notification sounds that convey the occurrence of a constrained class of events, usually adverse, that carry particular urgency in that they require immediate response or attention (Haas & Edworthy, 2006). However, the specificity of the information about the event is generally limited. Fire alarms identify an adverse event (a fire) that requires immediate action (evacuation), but the alarm does not indicate the location of the fire. More complex (and modern) kinds of alarms encode more information into the auditory signal, such as medical information (e.g., Anderson & Sanderson, 2004; Sanderson, Liu, & Jenkins, 2009; and see the development of the international standard for hospital alarms, Edworthy *et al.*, 2018).

Object, item, and status indicators. Sounds such as earcons (e.g., Blattner *et al.*, 1989; Bonebright & Nees, 2007; Brewster, Wright, & Edwards, 1993; McGookin & Brewster, 2004), auditory icons (e.g., Bonebright & Nees, 2007; Gaver, 1989; Keller & Stevens, 2004), and spearcons (Palladino & Walker, 2007; Walker, Nance, & Lindsay, 2006) provide information about the nature of the underlying action or event. These sounds are often used to facilitate user interface tasks (e.g., Brewster, Wright, & Edward, 1994; Winberg & Hellstrom, 2003). **Earcons** are abstract, artificial sounds that bear no ecological relationship to the represented process or event (e.g., beeps, chimes, abstract sound motives, etc., see Blattner *et al.*, 1989). They can, however, be designed with a hierarchical structure or grammar, thereby enhancing their communicative power (e.g., McGookin & Brewster, 2011). **Auditory icons** are more natural sounds that have some real world relationship with their referent process or event. One simple example is the sound of a camera shutter being used in a (shutter-less) digital camera to indicate when a picture has been taken (see, e.g., Gaver, 1989). As an alternative to earcons and auditory icons, **spearcons** (and their «cousins», **nearcons**⁴) use temporally compressed speech to represent objects, items, or processes with sound (Palladino & Walker, 2007; Walker *et al.*, 2006). Spearcons have been shown to outperform both earcons and auditory icons (Walker *et al.*, 2006) and may be especially useful in the design of flexible auditory menus (see Palladino & Walker, 2007) or for representing a large number of items.

Auditory menus are speech-based hierarchical lists (aka, menus) that present a set of options. Such menus can be simple (i.e., just presenting text-to-speech versions of the menu and sub-menu items), or may be more sophisticated constructions involving multiple voices, louder and softer speech, whispers, and additional elements representing scrollbars and spoken indexes. Menus may be navigated actively by the user («pull» menus) or more passively as the options are presented serially to the user («push» menus). For an overview of auditory menus see Yalla and Walker (2007), and Jeon *et al.* (2015).

Status and progress indicators convey the state of an ongoing process, such as downloading a file. In these instances, sound takes advantage of «the listener's ability to detect small changes in auditory events or the user's need to have their eyes free for other tasks» (Kramer *et al.*, 1999, p. 3). Soundscapes have been designed

³ For more taxonomic descriptions of auditory displays, see Kramer (1994), Walker and Nees (2011), and de Campo (2007).

⁴ Spearcons are created by speeding up an audio recording of a spoken word or phrase using a simultaneous overlap and add (SOLA) algorithm that preserves pitch contours, consonant/vowel ratios, etc. In contrast, **nearcons** are created by speeding up the speech rate of a text-to-speech engine, which leads to fast-talk that often truncates vowels more than consonants.

to mimic natural sounds (e.g., a thunderstorm with rain), and parameters of the soundscape are mapped to variables in a multidimensional data set (e.g., Mauney & Walker, 2004). While the listener may not necessarily act upon every change in the soundscape, the display allows for on-going monitoring and awareness of a changing situation.

Art, entertainment, sports, and leisure-based auditory displays have long been provided for simple, traditional games like the Towers of Hanoi (Winberg & Hellstrom, 2001) and Tic-Tac-Toe (Targett & Fernstrom, 2003), and more complex game genres such as arcade games (e.g., space invaders, see McCrindle & Symons, 2000) and role-playing games (Liljedahl, Papworth, & Lindberg, 2007). There are many audio-only games, too, of course (see, e.g., the *Survive the Wild* audio game⁵; and the Audio Games website⁶ currently lists over 850 titles). Auditory displays also have been used to facilitate sports «watching» (e.g., Savery *et al.*, 2019) and sports playing (e.g., soccer, Stockman *et al.*, 2007; rowing, Schaffert *et al.*, 2009; speed skating, Godbout & Boyd, 2010). Auditory displays have also been used as a means to bring some of the experience and excitement of dynamic exhibits to the visually impaired (e.g., sonified soundscapes to convey dynamic movement of fish in an «accessible aquarium», Walker *et al.*, 2006; Walker, Kim, & Pendse, 2007; and more recently to sonified planetarium exhibits, e.g., Quinton, McGregor, & Benyon, 2016; Tomlinson *et al.*, 2017).

Wayfinding and navigation can also be supported by auditory displays and sonification, often leveraging virtual spatial audio. Historical examples include the System for Wearable Audio Navigation (Wilson *et al.*, 2007; updated as SWAN2.0, see Walker & Wilson, 2021), the Personal Guidance System (PGS, Golledge *et al.*, 1991; Loomis, Golledge & Klatzky, 1993; Loomis *et al.*, 2005), and computer-vision and navigation systems by Revuelta Sanz and colleagues (Revuelta Sanz *et al.*, 2014a, 2014b, 2014c). More recently, Microsoft has developed Soundscape⁷ and XRNavigation has developed AUDIOM⁸; both are available for audio-based navigation and wayfinding.

Data exploration interfaces are what is generally meant by the term «sonification», and are usually intended to encode and convey information about an entire data set or relevant aspects of the data set. Sonifications designed for data exploration differ from status or process indicators in that they use sound to offer a more holistic portrait of the data in the system rather than condensing information to capture a momentary state such as with alerts and process indicators, though some auditory displays, like soundscapes, blend status indicator and data exploration functions. **Auditory graphs** are a common approach to basic data exploration sonifications, and most commonly use changes in auditory frequency to correspond to changes in data values along the visual Y axis, while time corresponds to the visual X axis. Nees and Walker (2007) proposed a conceptual psychological model of auditory graph comprehension. There have been auditory versions of numerous traditional display formats, including auditory scatterplots (e.g., Bonebright *et al.*, 2001; Flowers, Buhman, & Turnage, 1997), box-whisker plots (Flowers & Hauer, 1992; Peres & Lane, 2003, 2005), histograms (Flowers & Hauer, 1993), **multidimensional data sets** (see Hermann & Hunt, 2005), and tabular data (Stockman, Hind, & Frauenberger, 2005).

As a bit of an aside, some organizations, such as NASA, are producing sonifications of data using many of the methods that a scientist might use to explore their data; and then releasing the sonifications to the public as a form of outreach. Recent such outreach examples come from the Chandra X-ray Observatory⁹ and the James Webb Space Telescope¹⁰. The point is that the sonifications are not, in those cases, really intended to be used for scientific discovery. Rather, many listeners simply enjoy the novel sounds as a sort of “astronomical artwork” and (hopefully) become excited about the activities of the scientists. This highlights that while one might list out a taxonomy of sonification types, the categories are really much less distinct, the boundaries less clear...and it probably matters relatively little what, exactly, a sound is called, compared to the ultimate utility it has in conveying information or achieving some other purpose.

5 <http://www.samtupy.com/games/stw/>

6 <https://www.audiogames.net>

7 <https://www.microsoft.com/en-us/research/product/soundscape/>

8 <https://xrnavigation.io>

9 <https://chandra.si.edu/sound/>

10 <https://www.nasa.gov/feature/goddard/2022/nasa-webb-s-first-full-color-images-data-are-set-to-sound>

2.2. Representational Approaches for Sonifications

Another way to organize and define sonifications is to describe them according to the sonification technique or approach. De Campo (2007) offered a sonification design map that featured three broad categorizations of sonification approaches: (1) event-based; (2) model-based; and (3) continuous.

Parameter mapping sonification represents changes in some data dimension with changes in an acoustic dimension to produce a sonification. Auditory graphs and many sonifications fall into this category. Sound has a multitude of changeable dimensions (see Kramer, 1994; Levitin, 1999) that allow for a large design space when mapping data to audio. These approaches to sonification have typically employed a somewhat passive mode of interaction, in that the sonification is «played» and the listener attempts to understand what is happening in the data set.

Model-based sonification (e.g., Hermann, 2002; Hermann & Ritter, 1999) involve a virtual model whose sonic responses to user input are derived from data. A model, then, is a virtual object or instrument with which the user can interact, and the user's input drives the sonification such that «the sonification is the reaction of the data-driven model to the actions of the user» (Hermann, 2002, p. 40). The user comes to understand the structure of the data based on the acoustic responses of the model during interactive probing of the virtual object. These types of sonifications tend to involve high data dimensionality and large numbers of data points.

Audification is the (nearly) direct conversion of data into sound: waveforms of periodic data are translated into sound (Kramer, 1994). For example, seismic data have been audified in order to facilitate the categorization of seismic events with accuracies of over 90% (see Dombois, 2002; Speeth, 1961). This approach may require that the waveforms be frequency- or time-shifted into the range of audible waveforms for humans.

3. SONIFICATION DESIGN CONSIDERATIONS

When creating any auditory display, care must be taken to ensure that the result is effective. In the particular case of sonification design, experience in the field has arrived at several specific aspects that a designer should consider.

3.1. Detection and Discrimination

An auditory display is useless if the listener cannot hear the sounds in the system's environment of operation. To ensure **detection**, a consideration of the acoustic spectra of both the sonification (the «signal») and the environmental sounds (the «noise») is critical. Considerations of detection thresholds (e.g., Hartmann, 1997) and masking theories may help (for a discussion, see Watson & Kidd, 1994). And ecologically valid evaluation is important (Brewster, 2002; also see Walker & Kramer, 2004). A second consideration is the **discriminability** of sounds with distinct meanings, with a long-standing literature of perception research available for guidance on the psychology of hearing (e.g., Moore, 2013), pitch (e.g., Stevens, Volkman, & Newman, 1937; Turnbull, 1944), loudness (e.g., Stevens, 1936), tempo (e.g., Boltz, 1998), and duration (e.g., Jeon & Fricke, 1997), to name but a few.

3.2. Annoyance / Attention

Sounds that annoy the user may be ignored or turned off, even when the sounds are beneficial. Aesthetic considerations intersect with performance concerns. Some recommend musical sounds (Brown *et al.*, 2003; Childs, 2005; Ramloll *et al.*, 2001), though that, in itself, will not guarantee a pleasant experience for all users, tasks, and environments. Clearly, developing an auditory interface is, in all regards, a design task, with all the inherent difficulties associated with design (and, as noted above, see Nees, 2019).

3.3. Mapping and Choice of Display Dimension

Data-to-display mapping refers to the attribute of sound that is used to represent changes in data. Walker has studied the appropriate acoustic dimension for a given type of data by examining mappings between numerous conceptual data dimensions (e.g., temperature, pressure, danger) and three acoustic dimensions (pitch, tempo, and spectral brightness; Walker, 2002, 2007). This is complicated by the fact that many acoustic dimensions (e.g., pitch and loudness) interact with one another (see, e.g., Moore, 2013). Nees and Walker (2007) discuss the

convention of mapping data values onto changes in pitch in auditory graphs. Sonification designers should note that not all acoustic mappings are equally effective, and best designs will arise from an awareness of both the historical literature and pilot testing of any displays.

3.4. Mapping Polarities

The **polarity** of the data-to-display relationship refers to whether increases in a given acoustic dimension (e.g., pitch, tempo, etc.) represent increases in the data represented (a positive mapping polarity, Walker, 2002, 2007), or decreases in the data (a negative polarity). Listeners might agree that increasing pitch suggests increasing temperature, yet the same group of listeners may feel that increasing pitch offers a more intuitive representation of *decreasing* size. Walker and Lane (2001; see, also, Mauney & Walker, 2010) showed early on that some polarity mappings were reversed for visually impaired as compared to sighted listeners.

3.5. Scaling

The **scaling** refers to the amount of change in an acoustic dimension that will be used to represent a unit of change in the data. Magnitude estimation has been employed to describe the intuitive slopes for scaling frequency to a number of conceptual data dimensions (Walker, 2002, 2007), and the conceptual data dimension being represented impacts the choice of scaling factor in the display. A match between the listener's preferred or intuitive internal scaling function and the display's scaling function may improve comprehension, though usability testing will help determine the best scaling for a given situation.

3.6. Concurrent presentation of multiple data streams/series

Some data analysis tasks require the comparison of values from different data streams, whereas in other cases it is preferable to fuse streams into a perceptual whole. Bregman (1990) discusses what acoustic properties support or inhibit stream segregation, with key dimensions being timbre, spatial location (or stereo panning), pitch/frequency, and onset/offset of sounds.

3.7. Context

Context refers to the purposeful addition of non-signal information to a display (Smith & Walker, 2005; Walker & Nees, 2005). Sonifications need to include contextual cues equivalent to axes, tick marks and labels, so the listener can perform the interpretation tasks. For example, adding a series of clicks to the display can help the listener keep track of the time better, which aids in their interpretation of the graph values (see, e.g., Smith & Walker, 2005).

3.8. Individual Differences

The perceptual and cognitive capabilities, limitations, and experiences of listeners, as well as transient states (like mood and level of fatigue) will all impact performance outcomes with auditory displays. By understanding ranges in individual difference variables, a designer can build a display that accommodates most users in a given context (e.g., universal design, see Iwarsson & Stahl, 2003). It is interesting to note that for many years researchers predicted and anticipated that musicians would outperform non-musicians on tasks involving sonifications. However, research has very rarely found any correlations between musical experience and performance (e.g., Lacherez, Seah, & Sanderson, 2007; Neuhoff & Wayand, 2002; Sandor & Lane, 2003). One explanation for the lack of relationship is the crude nature of oft-used self-report metrics of musical experience. Indeed, in a systematic investigation Schuett (2019) determined that a more sophisticated measure of musical sophistication, leaning largely on engagement with music, can be predictive of performance. Visual impairment also has been shown to have a potentially profound impact on the perception of sonifications. As mentioned, it has been shown (Mauney & Walker, 2010; Walker & Lane, 2001) that blind and sighted listeners can have opposing intuitions about the polarity of the pairing of some acoustic dimensions with conceptual data dimensions. Individual differences between visually-impaired and sighted listeners require more research and a careful testing of auditory displays with the intended user population.

3.9. Authoring

As Nees (2019) discusses, there have been a (long) series of largely one-off software tools to create sonifications (too many to list exhaustively, here). They have varied greatly in terms of the platform and programming language, the approach to creating sounds, the process for defining mappings, context, and other attributes. Examples range from sonification toolkits focusing on a specific domain (e.g., xSonify: Candey, Schertenleib, & Díaz Merced, 2006) to more general frameworks (e.g., SoniPy: Worrall *et al.*, 2007). The Sonification Sandbox¹¹ was, for many years, a toolkit that was intended to serve the needs of diverse STEM fields (Davison & Walker, 2007), though it still had the limitation of being optimized for basic auditory graphs, and not a broader range of sonification methods. The recently released Highcharts Sonification Studio (HSS)¹² is a re-implementation of the Sonification Sandbox as a web application, supported by the power of the Highcharts visualization engine that incorporates extensive sonification capabilities. Backed formally by a mainstream data visualization company (HighSoft), the HSS seems to represent the first corporate mainstreaming of sonification tools (Cantrell, Walker, & Moseng., 2021), and is notably built to be accessible to screen reader users.

3.10. Audio Delivery Hardware

Historically, the «last mile», or the actual output of sound was often a challenge. Systems might not be able to produce sound, or if so, might need speakers or headphones as an additional piece of equipment. A sonification designer could never know what the actual listening equipment would be. Now, however, nearly all modern digital devices, from phones to tablets to laptops to smartwatches to smart speakers, are capable of producing high-fidelity sound, with most now including speakers, even if small. An output jack (e.g., audio only or HDMI) or Bluetooth capability is largely standard. As such, it is generally straightforward to play a sonification.

4. PRESENT: WHERE IS SONIFICATION BEING USED?

Sonifications are now being designed for use in a broad array of contexts and applications. A full survey is far beyond the scope of the present discussion. However, we can see recent examples of sonifications developed for both children (e.g., K-12 education; Fiedler, Walker, & Moore, 2021) and adults (e.g., Madaghie & Pauletto, 2022). A core domain for the adoption of sonification is in science, both for accessibility (e.g., Tomlinson *et al.*, 2019) and for scientific discovery. Amongst the science applications, sonification is becoming more prevalent in a variety of fields, including, for example: biology (Ngo, Sardana, Ico Bukvic, 2022); hydrology (Braun, Tfirm, & Ford, 2020); geoscience (Barth *et al.*, 2020); seismology (Apel & Johnson, 2021); computer science (Halac & Delgadino, 2021); medicine (Dascalu *et al.*, 2021); physiotherapy and rehabilitation (Kantan, Spaich, & Dahl, 2021); and astronomy and astrophysics (Garcia Riber & Serradilla Garcia, 2022). However, as Nees (2019) pointedly discusses, it is important to take a critical look at whether the sonifications and associated tools are actually actively in use, or whether they have been developed for a particular domain in some academic setting and perhaps never deployed, or/and perhaps never thoroughly evaluated and validated. There are relatively few widely-adopted sonifications, though this is continuing to change. Auditory graphs are gaining usage and deployment, for example; and the use of sonifications as part of public outreach (e.g., as mentioned with NASA telescope image sonifications) is bringing sonification more into the limelight. Finally, sonification tools (e.g., the HSS) are being deployed in schools from the USA, to Europe, to Africa.

5. REALIZING THE PROMISE OF SONIFICATION: TECHNOLOGY ADOPTION

Despite ample evidence for the benefits of sonification, the overall level of deployment and usage lags behind that of, for example, data visualizations. This is to be expected, given that the technological requirements for designing and delivering data-driven sounds is relatively nascent. To encourage the further expansion of sonification deployment, it may be helpful to consider what will encourage uptake and adoption. Considering the field of sonification through the lens of the Technology Acceptance Model (Davis, 1989) may be instructive.

11 Georgia Tech Sonification Sandbox: http://sonify.psych.gatech.edu/research/sonification_sandbox/index.html

12 Highcharts Sonification Studio: <https://sonification.highcharts.com>

5.1. Technology Acceptance Model: Utility and Usability

The Technology Acceptance Model (TAM; Davis, 1989) posits that the adoption of a technology depends largely on two main factors: perceived usefulness or perceived utility (PU) and perceived ease-of-use (PEU). In practice, these two factors are interconnected, of course. *Perceived usefulness* (PU) is defined by Davis as how much a person believes that using a particular technology or technical system would enhance performance on their task. One can extend Davis' thinking about technology acceptance to sonification by considering some of the specific contributors to usefulness, such as theoretical grounding for the use of the technology, scientific utility, scientific validity, replicability of results when using the technology, standardization of the use of a technology, educational utility, and accessibility or inclusivity for accomplishing a task.

Perceived ease-of-use (PEOU) is defined by Davis as how much a person believes that a technology would be user-friendly. Again, one can extend and update Davis' thinking by considering factors such as the availability and prevalence of the (software) tools required to use a technology, the usability of the tools, the training that is available, the standardization of the technological solution, the existence of a community of users (and support), portability of the technology, integration of the technology into the work/school/science ecosystem, and the accessibility of the system.

5.2. Where Does Sonification Stand?

With the TAM framework, and an updated consideration of sonification, it is interesting to assess the current state of sonification, and provide a bit of a "report card".

Perceived Utility «Report Card» for Sonification. In terms of *theoretical grounding*, there is a solid body of published research examining the core components of sonification, even though there may still not be an actual "theory of sonification" (and see Nees, 2019, for a discussion of *design theory* for sonification). There is, for example, a *Sonification Handbook* (Hermann, Hunt, & Neuhoff, 2011), including a chapter on the Theory of Sonification (Walker & Nees, 2011), providing a grounding for applications of sonification. There have been many findings made possible through sonification, ranging from early space science (e.g., NASA Cassini Mission¹³) to recent cancer diagnosis (Dascalu *et al.*, 2021), demonstrating *scientific utility* of sonification. The *scientific validity* has been less-thoroughly investigated, to date, with small sample sizes being typical and many generally unreplicated results. In terms of standardization, the basic concept of an auditory graph (x-y plot mapped onto time and pitch) has become a *de facto* standard, though there are many design differences amongst the countless implementations. Beyond simple auditory graphs, however, there is little standardization in sonification (in terms of the tools used, the designs, the deployment, and so on). The educational utility has started to emerge, especially as sonification is beginning to be used as part of the assistive technology used in Science, Technology, Engineering, and Mathematics (STEM) education. More needs to be done in this regard, since accessibility could be a huge area of impact for sonification.

Perceived Usability «Report Card» for Sonification. The sonification tools are quite readily *available*, with many options at various levels of sophistication, and using various underlying technology «stacks». It can be a challenge to know where to look, and there may be technical expertise required (e.g., programming in a particular programming language) in order to actually use some of the tools. The *usability* of the software tools varies greatly, from walk-up-and-use to experts-only, especially since many tools were not designed or developed for widespread deployment—they are often just built to assist a particular researcher to investigate a particular type of data. As previously discussed, more tools for sonification are becoming available with ease of use in mind (e.g., Highcharts Sonification Studio). *Training* has often not been very available for sonification tools, beyond the «readme» files that come with software packages, plus the limited details that can be gleaned from academic papers or technical reports. Recently there is an online course on the Coursera platform about the design of sonification (Moore, Tomlinson, & Walker, n.d.), and countless emerging YouTube videos and channels¹⁴ and websites to support novices in getting started with sonification. *Standardization* is minimal, as is *portability*, which makes it a

13 <https://solarsystem.nasa.gov/news/12580/sounds-of-cassini/>

14 As just one example of a YouTube "how-to" resource channel: https://www.youtube.com/@HSS_How_To

challenge to use sonification. The emergence of file formats that can be exchanged across software applications (and shared from person to person) will help with portability, but this remains a fledgling concept. Thankfully, the community of users and developers in the field of sonification has been around for a few decades, but it remains relatively small and unfortunately a bit on the margins of many other fields (education, STEM, computer science). There is little or no financial support for sustainability of the community. Since sonification is often used by researchers in another field (e.g., astronomy), the sonification tools are often *integrated into the ecosystem* of data collection and analysis, though this also remains a work in progress, across the field. In education, however, sonification tools, when available, are still largely separate from the ecosystem of other educational technology and assistive technology. This is changing as sonification tools are now being built to play nice with file formats and data transfer protocols that are common. Finally, the heterogeneity of sonification tools also means that there is a range of accessibility and compliance. It is encouraging that many of the more recent sonification tools are «born accessible», often due to the involvement on the development team of a designer or developer or scientist with a disability.

Summary «Grades» for Sonification Acceptance. Overall, it seems fair to conclude that the field of sonification is doing well on perceived utility, though with room for improvement. In terms of the perceived usability, there is more work to be done. Sonification is already seeing adoption in science, perhaps because the «proof» of utility and usefulness has been delivered; and the technical sophistication of the typical users is higher, leading to a greater tolerance of usability and ease-of-use challenges. In STEM education, the promise of sonification is likely understood (especially in the accessibility domain), but the real and perceived challenges in usability hamper further adoption. The field of sonification researchers and developers need to work closely with the end users to make the case for utility, and build usability and accessibility into any and all new tools and methods for sonification.

6. FINAL THOUGHTS

Over several decades, the use of sound to convey data has slowly grown and evolved, with many examples of how it can be done, many tools made available, and a small but growing body of evidence that sonification can be effective and beneficial. Nevertheless, there remains considerable work to be done to increase the mindshare for sonification, and indeed for all auditory displays (and see Nees, 2019, for a recent discussion of the theoretical underpinnings of the field). Considering this goal through the lens of technology acceptance may be helpful in understanding where our efforts may best be deployed, what has been successful, and what remains as a challenge for the sonification community.

REFERENCES

- Anderson, Janet y Sanderson, Penelope (2004). Designing Sonification for Effective Attentional Control in Complex Work Domains. *Proceedings of the Human Factors and Ergonomics Society Annual Meeting*, 48 (16), 1818–1822.
- Andreopoulou, Areti y Goudarzi, Visda (2021, June 25-28). Sonification First: The Role of ICAD in the Advancement of Sonification-Related Research. In *Proceedings of the 26th International Conference on Auditory Display (ICAD 2021)* (pp. 65-73). Virtual conference. <https://doi.org/10.21785/icad2021.031>
- Apel, Ted y Johnson, Jeffrey B. (2021, June 25-28). Portable real-time volcano infrasound auditory display devices. In *Proceedings of the 26th International Conference on Auditory Display (ICAD 2021)* (pp. 131-134). Virtual conference. <https://doi.org/10.21785/icad2021.012>
- Barrass, Stephen (1997). *Auditory information design*. [Unpublished doctoral dissertation]. Australian National University.
- Barth Anna; Karlstrom, Leif; Holtzman, Benjamin; Nayak, Avinash y Paté, Arthur (2020). Sonification and animation of multivariate data illuminates geyser eruption dynamics. *Computer Music Journal*, 44 (1), 35–50. https://doi.org/10.1162/comj_a_00551
- Blattner, Meera M.; Sumikawa, Denise A. y Greenberg, Robert M. (1989). Earcons and icons: Their structure and common design principles. *Human-Computer Interaction*, 4, 11-44.
- Boltz, Marilyn G. (1998). Tempo discrimination of musical patterns: Effects due to pitch and rhythmic structure. *Perception & Psychophysics*, 60 (8), 1357-1373.
- Bonebright, Terry L. y Nees, Michael A. (2007, June 26-29). Memory for auditory icons and earcons with localization cues. In *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)* (pp. 419-422). Montreal, Canada. <http://hdl.handle.net/1853/50014>
- Bonebright, Terri L.; Nees, Mike A.; Connerley, Tayla T. y McCain, Glenn R. (2001, July 29-August 1). Testing the effectiveness of sonified graphs for education: A programmatic research project. In *Proceedings of the 7th International Conference on Auditory Display (ICAD2001)* (pp. 62-66). Espoo, Finland. <http://hdl.handle.net/1853/50654>

- Braun, Robert; Tfirm, Maxwell y Ford, Rebecca (2020). Sonification and Machine Learning Contribute to a Novel Assay of Bacterial Swimming Dynamics. *Proceedings of the American Geophysical Union Fall Meeting*, Online Conference. <https://ui.adsabs.harvard.edu/abs/2020AGUFMH001...01B/abstract>
- Brazil, Eoin (2010). A review of methods and frameworks for sonic interaction design: Exploring existing approaches. *Lecture Notes in Computer Science*, 5954, 41-67. https://doi.org/10.1007/978-3-642-12439-6_3
- Brazil, Eoin y Fernström, Mikael (2009). Empirically based auditory display design. In F. Gouyon, A. Barbosa, & X. Serra (eds.). *Proceedings of the 6th Sound and Computing Conference (SMC 2009)* (pp. 7-12). Porto, Portugal. INESC.
- Bregman, Albert S. (1990). *Auditory scene analysis: The perceptual organization of sound*. Cambridge, MA: MIT Press.
- Brewster, Stephen (1997). Using non-speech sound to overcome information overload. *Displays*, 17, 179-189.
- Brewster, Stephen (2002). Overcoming the lack of screen space on mobile computers. *Personal and Ubiquitous Computing*, 6 (3), 188-205.
- Brewster, Stephen; Wright, Peter C. y Edward, Alistair D. N. (1994, April 24-28). The design and evaluation of an auditory enhanced scrollbar. In B. Adelson, S. Dumais, & J. Olson (eds.) *Proceedings of the SIGCHI Conference on Human Factors in Computing Systems (CHI 94)* (pp. 173-179). Boston, MA, Association for Computing Machinery. <https://doi.org/10.1145/191666.191733>
- Brewster, Stephen; Wright, Peter C. y Edwards, Alistair D. N. (1993, April 24-29). An evaluation of earcons for use in auditory human-computer interfaces. In B. Arnold, G. van der Veer, & T. White (eds.) *Proceedings of the INTERACT'93 and CHI'93 Conference on Human Factors in Computing Systems (CHI 93)* (pp. 222-227). Amsterdam. Association for Computing Machinery. <https://doi.org/10.1145/169059.169179>
- Brown, Lorna M.; Brewster, Stephen A.; Ramloll, Ramesh; Burton, Mike y Riedel, Beate (2003, July 6-9). Design guidelines for audio presentation of graphs and tables. In E. Brazil & B. Shinn-Cunningham (eds.) *Proceedings of the 9th International Conference on Auditory Display (ICAD2003)* (pp. 284-287). Boston, MA. <http://hdl.handle.net/1853/50454>
- Brown, M. L., Newsome, Sandra L., & Glinert, Ephraim P. (1989). An experiment into the use of auditory cues to reduce visual workload. In K. Vice & C. Lewis (eds.) *Proceedings of the SIGCHI Conference on Human Factors in Computing Systems (CHI 89)* (pp. 339-346). Association for Computing Machinery. <https://doi.org/10.1145/67449.67515>
- Buxton, William (1989). Introduction to this special issue on non-speech audio. *Human-computer Interaction*, 4, 1-9.
- Bly, Sara A.; Frysinger, Steven P.; Lunney, David; Mansur, Douglass L.; Mezrich, Joseph J. y Morrison, Robert C. (1985). Communicating with sound. In L. Borman & R. Smith (eds.) *Proceedings of the SIGCHI Conference on Human Factors in Computing Systems, San Francisco, California (CHI 85)* (pp. 115-119). Association for Computing Machinery. <https://doi.org/10.1145/317456.317477>
- Candey, Robert M.; Schertenleib, Anton M. y Diaz Merced, W. L. (2006, June 20-23). Xsonify sonification tool for space physics. *Proceedings of the 12th International Conference on Auditory Display (ICAD2006)* (pp. 289-290). London, UK. <http://hdl.handle.net/1853/50697>
- Cantrell, Stanley; Walker, Bruce N. y Moseng, Øystein (2021, June 25-28). Highcharts Sonification Studio: An online, open-source, extensible, and accessible data sonification tool. In *Proceedings of the 26th International Conference on Auditory Display (ICAD 2021)* (pp. 210-216). Virtual Conference. <http://hdl.handle.net/1853/66348>
- Childs, Edward (2005, July 6-9). Auditory graphs of real-time data. In *Proceedings of the 11th International Conference on Auditory Display (ICAD2005)* (pp. 402-405). Limerick, Ireland. <http://hdl.handle.net/1853/50086>
- Connell, Bettye Rose; Jones, Mike; Mace, Ron; Mueller, Jim; Mullick, Abir; Ostroff, Elaine (1997). *The Principles of Universal Design, Version 2.0*. NC State University, Raleigh, NC: The Center for Universal Design.
- Dascalu, A.; Walker, Bruce N.; Oron, Y. y David, E. O. (2021). Non-melanoma skin cancer diagnosis: a comparison between dermoscopic and smartphone images by unified visual and sonification deep learning algorithms. *Journal of Cancer Research and Clinical Oncology*, 148, 2497-2505. <https://doi.org/10.1007/s00432-021-03809-x>
- Davis, Fred D. (1989). Perceived usefulness, perceived ease of use, and user acceptance of information technology. *MIS Quarterly*, 13 (3), 319-340. <https://doi.org/10.2307/249008>
- Davison, Benjamin K. y Walker, Bruce N. (2007, June 26-29). Sonification Sandbox reconstruction: Software standard for auditory graphs. In *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)* (pp. 509-512). Montreal, Canada. <http://hdl.handle.net/1853/50030>
- de Campo, Alberto (2007, June 26-29). Toward a data sonification design space map. In *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)* (pp. 342-347). Montreal, Canada. <http://hdl.handle.net/1853/50042>
- Dombois, Florian (2002, July 2-5). Auditory seismology - On free oscillations, focal mechanisms, explosions, and synthetic seismograms. In *Proceedings of the 8th International Conference on Auditory Display (ICAD2002)* (pp. 27-30). Kyoto, Japan. <http://hdl.handle.net/1853/51334>
- Edworthy, Judy (1998). Does sound help us to work better with machines? A commentary on Rautenberg's paper 'About the importance of auditory alarms during the operation of a plant simulator'. *Interacting with Computers*, 10, 401-409.
- Edworthy, Judy Reed; McNeer, Richard R.; Bennett, Christopher L.; Dudaryk, Roman; McDougall, Siné J. P.; Schlesinger, Joseph J.; Bolton, Matthew L.; Edworthy, Jonathan D. Reed; Özcan, Elif; Boyd, Andrew D.; Reid, Scott K. J.; Rayo, Michael F.; Wright, Melanie C. y Osborn, David (2018). Getting Better Hospital Alarm Sounds Into a Global Standard. *Ergonomics in Design*, 26 (4), 4-13.
- Fiedler, Brett L.; Walker, Bruce N. y Moore, Emily B. (2021, June 25-28). To sonify or not to sonify? Educator perceptions of auditory

- display in interactive simulations. In *Proceedings of the 26th International Conference on Auditory Display (ICAD 2021)* (pp. 44-52). Virtual conference. <https://doi.org/10.21785/icad2021.044>
- Fitch, W. Tecumseh y Kramer, Gregory (1994). Sonifying the body electric: Superiority of an auditory over a visual display in a complex, multivariate system. In G. Kramer (Ed.), *Auditory display: Sonification, audification, and auditory interfaces* (pp. 307-326). Reading, MA: Addison-Wesley.
- Flowers, John H. y Hauer, Terry A. (1992). The ear's versus the eye's potential to assess characteristics of numeric data: Are we too visuocentric? *Behavior Research Methods, Instruments & Computers*, 24(2), 258-264.
- Flowers, John H. y Hauer, Terry A. (1993). «Sound» alternatives to visual graphics for exploratory data analysis. *Behavior Research Methods, Instruments & Computers*, 25 (2), 242-249.
- Flowers, John H. y Hauer, Terry A. (1995). Musical versus visual graphs: Cross-modal equivalence in perception of time series data. *Human Factors*, 37 (3), 553-569.
- Flowers, John H.; Buhman, Dion C. y Turnage, Kimberly D. (1997). Cross-modal equivalence of visual and auditory scatterplots for exploring bivariate data samples. *Human Factors*, 39 (3), 341-351.
- Frauenberger, Christopher y Stockman, Tony (2009). Auditory display design: An investigation of a design pattern approach. *International Journal of Human-Computer Studies*, 67, 907-922.
- Frauenberger, Chris; Stockman, Tony y Bourguet, Marie-Luce (2007, June 26-29). Pattern design in the context space: A methodological framework for auditory display design. In *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)* (pp. 513-518). Montreal, Canada. <http://hdl.handle.net/1853/50020>
- Frynsinger, Steven P. (2005, July 6-9). A brief history of auditory data representation to the 1980s. In *Proceedings of the 11th International Conference on Auditory Display (ICAD2005)* (pp. 410-413). Limerick, Ireland. <http://hdl.handle.net/1853/50089>
- García Riber, Adrian y Serradilla García, Francisco (2022, June 24-27). Sonification of TESS data validation timeseries files. In *Proceedings of the 27th International Conference on Auditory Display (ICAD 2022)* (pp. 69-74). Virtual Conference. <https://doi.org/10.21785/icad2022.024>
- Gaver, William W. (1989). The SonicFinder: An interface that uses auditory icons. *Human-Computer Interaction*, 4 (1), 67-94.
- Godbout, Andrew y Boyd, Jeffrey E. (2010, June 9-15). Corrective sonic feedback for speed skating: A case study. In *Proceedings of the 16th International Conference on Auditory Display (ICAD2010)* (pp. 23-30). Washington, DC. <http://hdl.handle.net/1853/49865>
- Golledge, Reginald G.; Loomis, Jack M.; Klatzky, Roberta L.; Flury, Andreas y Yang, Xiao Li (1991). Designing a personal guidance system to aid navigation without sight: Progress on the eGIS component. *International Journal of Geographical Information Systems*, 5, 373-395.
- Grudin, Jonathan (2001). Partitioning digital worlds: Focal and peripheral awareness in multiple monitor use. In J. Jacko & A. Sears (eds.) *Proceedings of the 2001 SIGCHI conference on Human Factors in Computing Systems (CHI 01)* (pp. 458-465). Seattle, WA. Association for Computing Machinery. <https://doi.org/10.1145/365024.365312>
- Haas, Ellen y Edworthy, Judy (2006). An introduction to auditory warnings and alarms. In M. S. Wogalter (Ed.), *Handbook of Warnings* (pp. 189-198). Mahwah, NJ: Lawrence Erlbaum.
- Halac, Federico Nicolás Cámara y Delgado, Matías (2021, June 25-28). DreamSound: Deep activation layer sonification. In *Proceedings of the 26th International Conference on Auditory Display (ICAD 2021)* (pp. 158-163). Virtual conference. <https://doi.org/10.21785/icad2021.032>
- Hartmann, William M. (1997). *Sounds, signals, and sensation: Modern acoustics and signal processing*. New York: Springer Verlag.
- Hermann, Thomas (2002). *Sonification for exploratory data analysis*. [Unpublished PhD. thesis]. Bielefeld University.
- Hermann, Thomas (2008, June 24 - 27). Taxonomy and definitions for sonification and auditory display. In *Proceedings of the 14th International Conference on Auditory Display (ICAD2008)* (pp. 1-8). Paris, France. <http://hdl.handle.net/1853/49960>
- Hermann, Thomas y Hunt, Andy (2005). An introduction to interactive sonification. *IEEE Multimedia*, 12(2), 20-24.
- Hermann, Thomas y Ritter, Helge (1999). Listen to your data: Model-based sonification for data analysis. In G. D. Lasker (Ed.), *Advances in Intelligent Computing and Multimedia Systems* (pp. 189-194). Baden-Baden: IASSRC.
- Hermann, Thomas; Hunt, Andy y Neuhooff, John (2011). *The Sonification Handbook*. Berlin: Logos Publishing House.
- Iwarsson, Susanne y Stahl, Agneta (2003). Accessibility, usability, and universal design—positioning and definition of concepts describing person-environment relationships. *Disability and Rehabilitation*, 25 (2), 57-66.
- Jeon, Jin Y. y Fricke, Fergus R. (1997). Duration of perceived and performed sounds. *Psychology of Music*, 25 (1), 70-83.
- Jeon, Myoungsoon; Gable, Thomas M.; Davison, Benjamin K.; Nees, Michael A.; Wilson, Jeff y Walker, Bruce N. (2015). Menu navigation with in-vehicle technologies: Auditory menu cues improve dual task performance, preference, and workload. *International Journal of Human Computer Interaction*, 31, 1-16. <http://dx.doi.org/10.1080/10447318.2014.925774>
- Jeon, Myoungsoon; Walker, Bruce N. y Barrass, Stephen (2018). Introduction to the Special Issue on Sonic Information Design: Theory, Methods, and Practice, Part 1. *Ergonomics in Design*, 26 (4), 3. <https://doi.org/10.1177/1064804618797304>
- Jeon, Myoungsoon; Walker, Bruce N. y Barrass, Stephen (2019). Introduction to the Special Issue on Sonic Information Design: Theory, Methods, and Practice, Part 2. *Ergonomics in Design*, 27 (1), 4. <https://doi.org/10.1177/1064804618814232>
- Kantan, Prithvi Ravi; Spaich, Erika G. y Dahl, Sofia (2021, June 25-28). A metaphor-based technical framework for musical sonification in movement rehabilitation. In *Proceedings of the 26th International Conference on Auditory Display (ICAD 2021)* (pp. 176-183). Virtual conference. <https://doi.org/10.21785/icad2021.008>

- Keller, Peter y Stevens, Catherine (2004). Meaning from environmental sounds: Types of signal-referent relations and their effect on recognizing auditory icons. *Journal of Experimental Psychology: Applied*, 10 (1), 3-12.
- Kramer, Gregory (1994). An introduction to auditory display. In G. Kramer (Ed.), *Auditory Display: Sonification, Audification, and Auditory Interfaces* (pp. 1-78). Reading, MA: Addison Wesley.
- Kramer, Gregory; Walker, Bruce N.; Bonebright, Terri; Cook, Perry; Flowers, John; Miner, Nadine (1999). The Sonification Report: Status of the Field and Research Agenda. Report prepared for the National Science Foundation by members of the International Community for Auditory Display. Santa Fe, NM: International Community for Auditory Display (ICAD). <https://digitalcommons.unl.edu/psychfacpub/444>
- Lacherez, Philippe; Seah, Eunice L. y Sanderson, Penelope M. (2007). Overlapping melodic alarms are almost indiscriminable. *Human Factors*, 49 (4), 637-645.
- Levitin, Daniel J. (1999). Memory for musical attributes. In P. Cook (Ed.), *Music, Cognition, and Computerized Sound: An Introduction to Psychoacoustics* (pp. 209-227). Cambridge, MA: MIT Press.
- Liljedahl, Mats; Papworth, Nigel y Lindberg, Stefan (2007, June 26-29). Beowulf: A game experience built on sound effects. *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)* (pp. 102-106). Montreal, Canada. <http://hdl.handle.net/1853/49983>
- Loomis, Jack M.; Gollidge, Reginald G. y Klatzky, Roberta L. (1993). Personal guidance system for the visually impaired using GPS, GIS, and VR technologies. In *Proceedings of the First Annual International Conference, Virtual Reality and Persons with Disabilities* (pp. 71-74). Center for Disabilities, California State University, Northridge, CA.
- Loomis, Jack M.; Marston, James R.; Gollidge, Reginald G. y Klatzky, Roberta L. (2005). Personal guidance system for people with visual impairment: A comparison of spatial displays for route guidance. *Journal of Visual Impairment & Blindness*, 99, 219-232.
- Madaghiele, Vincenzo y Pauletto, Sandra (2022, June 24-27). The sonic carpet: Real-time feedback of energy consumption and emission data through sonic interaction design. In *Proceedings of the 27th International Conference on Auditory Display (ICAD 2022)* (pp. 55-63). Virtual conference. <https://doi.org/10.21785/icad2022.020>
- Mauney, Bradley S. y Walker, Bruce N. (2004, July 6-9). Creating functional and livable soundscapes for peripheral monitoring of dynamic data. *Proceedings of the 10th International Conference on Auditory Display (ICAD2004)*. Sydney, Australia. <http://hdl.handle.net/1853/50847>
- Mauney, Lisa M. y Walker, Bruce N. (2010). Universal design of auditory graphs: A comparison of sonification mappings for visually impaired and sighted listeners. *ACM Transactions on Accessible Computing*, 2 (3), Article 12.
- McCrindle, Rachel J. y Symons, David (2000). Audio space invaders. In P. Sharkey, A. Cesarani, L. Pugnetti & A. Rizzo (Eds.), *Proceedings of the 3rd International Conference on Disability, Virtual Reality, & Associated Technologies* (pp. 59-65). Alghero, Italy. The University of Reading. https://www.icdvrat.com/2000/P/2000_09.pdf
- McGookin, David K. y Brewster, Stephen A. (2004). Understanding concurrent earcons: Applying auditory scene analysis principles to concurrent earcon recognition. *ACM Transactions on Applied Perception*, 1, 130-150.
- McGookin, David K. y Brewster, Stephen A. (2011). Earcons. In T. Hermann, A. Hunt, & J. Neuhoff, *The Sonification Handbook*. Berlin: Logos Publishing. <https://sonification.de/handbook/>
- McGuire, Joan M.; Scott, Sally S. y Shaw, Stan F. (2006). Universal design and its applications in educational environments. *Remedial and Special Education*, 3, 166-175.
- Moore, Brian C. J. (2013). *An Introduction to the Psychology of Hearing* (6th ed.). Leiden, NL: Brill.
- Moore, Emily; Tomlinson, Brianna J. y Walker, Bruce N. (n.d.). *Sound and Sonification Design for Interactive Learning Tools*. Online course on the Coursera platform. <https://www.coursera.org/learn/sound-and-sonification-for-learning>
- Nees, Michael A. (2019, June 23-27). Eight components of a design theory of sonification. *Proceedings of the 25th International Conference on Auditory Display (ICAD2019)* (pp. 176-183). Newcastle, UK. <https://doi.org/10.21785/icad2019.048>
- Nees, Michael A. y Walker, Bruce N. (2007, June 26-29). Listener, task, and auditory graph: Toward a conceptual model of auditory graph comprehension. In *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)* (pp. 266-273). Montreal, Canada. <http://hdl.handle.net/1853/50010>
- Nees, Michael A. y Walker, Bruce N. (2009). Auditory Interfaces and Sonification. In Constantine Stephanidis (Ed.), *The Universal Access Handbook* (pp. 507-521). New York: CRC Press Taylor & Francis.
- Neuhoff, John G. y Heller, Laurie M. (2005, July 6-9). One small step: Sound sources and events as the basis for auditory graphs. *Proceedings of the 11th International Conference on Auditory Display (ICAD2005)* (pp. 417-419). Limerick, Ireland. <http://hdl.handle.net/1853/50174>
- Neuhoff, John G.; Knight, Rebecca y Wayand, Joseph (2002, July 2-5). Pitch change, sonification, and musical expertise: Which way is up? *Proceedings of the 8th International Conference on Auditory Display (ICAD2002)* (pp. 351-356). Kyoto, Japan. <http://hdl.handle.net/1853/51370>
- Ngo, Angela; Sardana, Disha y Ico Bukvic, Ivica (2022, June 24-27). Sonifying 2D cellular behavior using cellular stethoscope. *Proceedings of the 27th International Conference on Auditory Display (ICAD 2022)* (pp. 31-38). Virtual conference. <https://doi.org/10.21785/icad2022.015>
- Palladino, Dianne y Walker, Bruce N. (2007, June 26-29). Learning rates for auditory menus enhanced with spearcons versus earcons. In *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)* (pp. 274-279). Montreal, Canada. <http://hdl.handle.net/1853/50011>
- Peres, S. Camille y Lane, David M. (2003, July 6-9). Sonification of statistical graphs. *Proceedings of the International Conference on Auditory Display (ICAD2003)* (pp. 157-160). Boston, MA. <http://hdl.handle.net/1853/50486>

- Peres, S. Camille y Lane, David M. (2005, July 6-9). Auditory graphs: The effects of redundant dimensions and divided attention. *Proceedings of the 11th International Conference on Auditory Display (ICAD2005)* (pp. 169-174). Limerick, Ireland. <http://hdl.handle.net/1853/50093>
- Peres, S. Camille; Best, Virginia; Brock, Derek; Shinn-Cunningham, Barbara; Frauenberger, Christopher; Hermann, Thomas, *et al.* (2008). Auditory Interfaces. In P. Kortum (Ed.), *HCI Beyond the GUI: Design for Haptic, Speech, Olfactory and Other Nontraditional Interfaces* (pp. 147-196). Burlington, MA: Morgan Kaufmann.
- Quinton, Michael; McGregor, Iain y Benyon, David (2016, July 2-8). Sonifying the Solar System. In *Proceedings of the 22nd International Conference on Auditory Display (ICAD 2016)*. Canberra, Australia. <https://doi.org/10.21785/icad2016.003>
- Ramloll, Rameshsharma; Brewster, Stephen; Yu, Wai y Riedel, Beate (2001). Using non-speech audio sounds to improve access to 2D tabular numerical information for visually impaired users. *Proceedings of the IHM-HCI 2001* (pp. 515-530). Lille, France.
- Revuelta Sanz, Pablo; Ruiz Mezcuca, Belén; Sánchez Pena, José Manuel y Walker, Bruce N. (2014a). Scenes into sounds: A taxonomy of image sonification methods for mobility applications. *Journal of the Audio Engineering Society*, 62 (3), 161-171.
- Revuelta Sanz, Pablo; Ruiz Mezcuca, Belén; Sánchez Pena, José Manuel y Walker, Bruce N. (2014b). Evaluation of the Sonification Protocol of an Artificial Vision System for the Visually Impaired. *International Journal of Computer and Information Technology*, 3 (3), 469-481.
- Revuelta Sanz, Pablo; Ruiz Mezcuca, Belén; Sánchez Pena, José Manuel y Walker, Bruce N. (2014c). Evaluation of a New Mobility Assistive Product for the Visually Impaired. *International Journal of Computers and Technology* 13 (2), 4191-4205.
- Sanders, Mark S. y McCormick, Ernest J. (1993). *Human Factors in Engineering and Design* (7th ed.). New York: McGraw-Hill.
- Sanderson, Penelope M. (2006). The multimodal world of medical monitoring displays. *Applied Ergonomics*, 37, 501-512.
- Sanderson, Penelope M.; Liu, David y Jenkins, Simon A. (2009). Auditory displays in anesthesiology. *Current Opinion in Anesthesiology*, 22, 788-795.
- Sandor, Aniko y Lane, David M. (2003, July 6-9). Sonification of absolute values with single and multiple dimensions. In *Proceedings of the 2003 International Conference on Auditory Display (ICAD2003)* (pp. 243-246). Boston, MA. <http://hdl.handle.net/1853/50487>
- Savery, Richard; Ayyagari, Madhukesh; May, Keenan R. y Walker, Bruce N. (2019, June 23-27). Soccer Sonification: Enhancing Viewer Experience. In *Proceedings of the 25th International Conference on Auditory Display (ICAD 2019)* (pp. 207-213). Newcastle-upon-Tyne, UK. <https://doi.org/10.21785/icad2019.037>
- Schaffert, Nina; Mattes, Klaus; Barrass, Stephen y Effenberg, Alfred O. (2009, December 3-4). Exploring function and aesthetics in sonifications for elite sports. *Proceedings of the Second International Conference on Music Communication Science*, Sydney, Australia. https://www.academia.edu/308233/Exploring_Function_and_Aesthetics_In_Sonifications_for_Elite_Sports
- Schuett, Jonathan Henry (2019). *Measuring the effects of display design and individual differences on the utilization of multi-stream sonifications*. [Unpublished PhD Dissertation]. Georgia Institute of Technology, Atlanta, USA. <http://hdl.handle.net/1853/61808>
- Smith, Daniel R. y Walker, Bruce N. (2005). Effects of auditory context cues and training on performance of a point estimation sonification task. *Applied Cognitive Psychology*, 19 (8), 1065-1087.
- Sorkin, Robert D. (1987). Design of auditory and tactile displays. In G. Salvendy (Ed.), *Handbook of human factors* (pp. 549-576). New York: Wiley & Sons.
- Speeth, Sheridan Dauster (1961). Seismometer sounds. *Journal of the Acoustical Society of America*, 33, 909-916.
- Spence, Charles y Driver, Jon (1997). Audiovisual links in attention: Implications for interface design. In D. Harris (Ed.), *Engineering Psychology and Cognitive Ergonomics* Vol. 2: Job Design and Product Design (pp. 185-192). Hampshire: Ashgate Publishing.
- Stevens, Stanley S. (1936). A scale for the measurement of a psychological magnitude: Loudness. *Psychological Review*, 43, 405-416.
- Stevens, Stanley S.; Volkman, John, y Newman, Edwin B. (1937). A Scale for the Measurement of the Psychological Magnitude Pitch. *Journal of the Acoustical Society of America*, 8, 185.
- Stockman, Tony; Hind, Greg y Frauenberger, Christopher (2005, July 6-9). Interactive sonification of spreadsheets. In *Proceedings of the 11th International Conference on Auditory Display (ICAD2005)* (pp. 134-139). Limerick, Ireland. <http://hdl.handle.net/1853/50166>
- Stockman, Tony; Rajgor, Neil; Metatla, Oussama y Harrar, Lila (2007, June 26-29). The design of interactive audio soccer. In *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)* (pp. 526-529). Montreal, Canada. <http://hdl.handle.net/1853/50045>
- Supper, Alexandra (2014). Sublime frequencies: The construction of sublime listening experiences in the sonification of scientific data. *Social Studies of Science*, 44 (1), 34-58.
- Supper, Alexandra (2015). Sound information: Sonification in the age of complex data and digital audio. *Information & Culture*, 50 (4), 441-464.
- Targett, Sue y Fernstrom, Mikael (2003, July 6-9). Audio games: Fun for all? All for fun? In *Proceedings of the 2003 International Conference on Auditory Display (ICAD2003)* (pp. 216-219). Boston, MA. <http://hdl.handle.net/1853/50444>
- Tomlinson, Brianna; Kaini, Prakriti; Harden, E. Lynn; Walker, Bruce N. y Moore, Emily B. (2019). Design and evaluation of a multi-modal physics simulation. *Journal on Technology and Persons with Disabilities*, 7, 88-102.
- Tomlinson, Brianna J.; Winters, R. Michael; Latina, Christopher; Bhat, Smruthi; Rane, Milap y Walker, Bruce N. (2017, June 20-23). Solar System Sonification: Exploring Earth and its Neighbors Through Sound. In *Proceedings of the International Conference on Auditory Display (ICAD 2017)* (pp. 128-134). State College, PA, USA. <https://doi.org/10.21785/icad2017.027>

- Turnbull, William W. (1944). Pitch discrimination as a function of tonal duration. *Journal of Experimental Psychology*, 34, 302-316.
- Walker, Bruce N. (2002). Magnitude estimation of conceptual data dimensions for use in sonification. *Journal of Experimental Psychology: Applied*, 8, 211-221. <https://doi.org/10.1037/1076-898X.8.4.211>
- Walker, Bruce N. (2007). Consistency of magnitude estimations with conceptual data dimensions used for sonification. *Applied Cognitive Psychology*, 21, 579-599.
- Walker, Bruce N. (2021). Sonification. In Charles LaPierre (Ed.), *DI-AGRAM Reports 2017-2020* (pp. 554-582). Palo Alto, CA: Bene-tech. <https://www.bookshare.org/browse/book/3800695/DI-GRAM%20Reports%202017%20-%202020>
- Walker, Bruce N. y Kramer, Gregory (1996). Mappings and metaphors in auditory displays: An experimental assessment. In S. Frynsinger & G. Kramer (Eds.), *Proceedings of the Third International Conference on Auditory Display, ICAD '96* (71-74). ICAD, Palo Alto, California.
- Walker, Bruce N. y Kramer, Gregory (2004). Ecological psychoacoustics and auditory displays: Hearing, grouping, and meaning making. In J. Neuhoff (Ed.), *Ecological psychoacoustics* (pp. 150-175). New York: Academic Press.
- Walker, Bruce N. y Kramer, Gregory (2006). Sonification. In W. Karwowski (Ed.), *International Encyclopedia of Ergonomics and Human Factors* (2nd ed.) (pp. 1254-1256). New York: CRC Press. <https://www.taylorfrancis.com/chapters/edit/10.1201/9780849375477-272/sonification>
- Walker, Bruce N. y Lane, David M. (2001, July 29-August 1). Psycho-physical scaling of sonification mappings: A comparison of visually impaired and sighted listeners. In *Proceedings of the 7th International Conference on Auditory Display (ICAD2001)* (pp. 90-94). Espoo, Finland. <http://hdl.handle.net/1853/50630>
- Walker, Bruce N. y Nees, Michael A. (2005, July 6-9). An agenda for research and development of multimodal graphs. In *Proceedings of the 11th International Conference on Auditory Display (ICAD2005)* (pp. 428-432). Limerick, Ireland. <http://hdl.handle.net/1853/50098>
- Walker, Bruce N. y Nees, Michael A. (2011). Theory of Sonification. In T. Hermann, A. Hunt, & J. Neuhoff (Eds.), *The Sonification Handbook* (pp. 9-39). Berlin, Germany: Logos Publishing House. <http://sonification.de/handbook/download/TheSonificationHandbook-chapter2.pdf>
- Walker, Bruce N. y Wilson, Jeff (2021, March 23-24). SWAN 2.0: Research and Development on a New System for Wearable Audio Navigation. In *Proceedings of the WirelessRERC State of the Technology Forum 2021*. Virtual conference. http://www.wirelessrerc.gatech.edu/sites/default/files/publications/walker_swan2-wirelessrerc-sot2021-proceedings-v16-withalltext.pdf
- Walker, Bruce N.; Godfrey, Mark T.; Orlosky, Jason E.; Bruce, Carrie y Sanford, Jon (2006, June 20-23). Aquarium sonification: Soundscapes for accessible dynamic informal learning environments. *Proceedings of the 12th International Conference on Auditory Display (ICAD2006)* (pp. 238-241). London, UK. <http://hdl.handle.net/1853/50426>
- Walker, Bruce N.; Kim, Jonathan y Pendse, Anandi (2007). Musical soundscapes for an accessible aquarium: Bringing dynamic exhibits to the visually impaired. In *Proceedings of the International Computer Music Conference (ICMC 2007)* (pp. 268-275). Copenhagen, Denmark. <http://hdl.handle.net/2027/spo.bbp2372.2007.164>
- Walker, Bruce N.; Nance, Amanda y Lindsay, Jeffrey (2006, June 20-23). Spearcons: Speech-based earcons improve navigation performance in auditory menus. In *Proceedings of the 12th International Conference on Auditory Display (ICAD2006)* (pp. 63-68). London, UK. <http://hdl.handle.net/1853/50642>
- Watson, Charles S. y Kidd, Gary R. (1994, November 7-9). Factors in the design of effective auditory displays. In *Proceedings of the 2nd International Conference on Auditory Display (ICAD1994)* (pp. 293-303). Sante Fe, NM. <http://hdl.handle.net/1853/50864>
- Wickens, Christopher D. y Liu, Yili (1988). Codes and modalities in multiple resources: A success and a qualification. *Human Factors*, 30 (5), 599-616.
- Wickens, Christopher D.; Gordon, Sallie E. y Liu, Yili (1998). *An introduction to human factors engineering*. New York: Longman.
- Wilson, Jeff; Walker, Bruce N.; Lindsay, Jeffrey; Cambias, Craig y Del-laert, Frank (2007). SWAN: System for wearable audio navigation. *Proceedings of the 11th International Symposium on Wearable Computers (ISWC 2007)* (pp. 91-98). Boston, MA. <https://doi.org/10.1109/ISWC.2007.4373786>
- Winberg, Fredrik y Hellstrom, Sten Olof (2001, July 29-August 1). Qualitative aspects of auditory direct manipulation: A case study of the Towers of Hanoi. *Proceedings of the 7th International Conference on Auditory Display (ICAD2001)* (pp. 16-20). Espoo, Finland. <http://hdl.handle.net/1853/50633>
- Winberg, Fredrik y Hellstrom, Sten Olof (2003, November 10-11). Designing accessible auditory drag and drop. *Proceedings of the 2003 Conference on Universal Usability (CUU2003)*. Vancouver, Canada. <https://cid.nada.kth.se/pdf/CID-242.pdf>
- Worrall, David (2018). Sonification: A prehistory. In *Proceedings of the 24th International Conference on Auditory Display (ICAD2018)* (pp. 177-182). Michigan, USA. <http://doi.org/10.21785/icad2018.019>
- Worrall, David; Bylstra, Michael; Barrass, Stephen y Dean, Roger (2007, June 26-29). SoniPy: The design of an extendable software framework for sonification research and auditory display. In *Proceedings of the 13th International Conference on Auditory Display (ICAD2007)*. Montreal, Canada.
- Yalla, Pavani y Walker, Bruce N. (2007). *Advanced Auditory Menus*. Georgia Institute of Technology GVU Center Technical Report # GIT-GVU-07-12. October. <http://hdl.handle.net/1853/26170>