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PERIPHERAL AUDITORY DISPLAY FOR 3D-PRINTING PROCESS MONITORING

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ABSTRACT

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When monitoring an industrial process, extreme sensory 2 40 conditions can make it difficult to rely solely on direct ob-41 3 servation. In this paper, we describe the development of an 42 4 alternative display method for the production criteria of a 43 5 wire-arc 3D-printing process using sonification. We made 6 44 7 this display mostly ambient, as it is preferable in order to 15 avoid fatigue in long-term usage. The sounds were cho-8 sen to be cognitively distinct progressive alarms so they 47 9 would be easier to identify. The evaluation consists in a $_{48}$ 10 dual-task identification trial, so as to measure the proper 49 11 communication of critical information as well as account 50 12 for the level of distraction from other tasks. The results 51 13 show that the attentional pull is rather minor and still al-14 lows for above-random criteria recognition rates. Though, 15 53 there seems to be an occasional cognitive overlap between 16 54 the sounds representing local and global overheating. The 17 droning tone for the height of the part also tends to be 18 56 drowned out in some cases. Both flaws will need to be 19 57 addressed in future iterations. 20 58

1. INTRODUCTION

Despite considerable progress in the automation of indus-22 62 trial processes, a human presence still tends to be required 23 63 to monitor the machines. This monitoring task can usually 24 64 be carried out via simple visual observation. However, in 25 65 practice, visual attention is not always guaranteed as op-26 erators may be distracted or focused on other more active 27 tasks. Additionally, an industrial working context is likely 66 28 to be too unfriendly on the senses to allow for direct obser-29 67 vation. 30

Hearing tends to be more versatile and better adapted to 31 perceiving changes over time than vision, while not requir-32 ing constant focus [1-3]. This makes it a suitable modality 33 for real-time process monitoring by users faced with visu-34 ally overwhelming working conditions [4-7], in order to 35 avoid the pitfall of inattentional blindness [8–10]. 36 Such auditory displays of data can be achieved through 37

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sonification, a data-driven, non-verbal sound [11], usually produced through algorithmic processes in a "systematic, objective and reproducible" way [12]. The use of sonification for monitoring has been a subject of research for many years, in domains as varied as surgical gestures [13, 14], vital signs [15], business processes [16-21], internet activity [22-25], algorithmic processes [26], or domestic activity [27, 28].

While developing our sonification for a manufacturing process, we want to avoid the "better safe than sorry" approach of using sudden and loud alarms, as pointed out by Patterson et al. [29] and Lazarus et al. [30]. Instead we need a continuous sound that can be relegated to the background of other activities and evolve into a notification when necessary. This type of notification system is known as a peripheral display, or an ambient information system [31].

Our goal in this paper is to construct and evaluate a peripheral sonification prototype for the monitoring of an industrial 3D-printing process. As this work is still in an early stage of development, the evaluation will be conducted in a simulated work context rather than in-situ. We start by describing the process to be sonified as well as its use context. We then analyse the existing methodology regarding the design and evaluation of peripheral displays, before describing our prototype and its dual-tasking evaluation process. From the results, we assess ways to improve the sounds used.

2. 3D-PRINTING PROCESS

The process to be monitored is a wire-arc 3D-printing process [32]. Operators for those machines need to be able to detect anomalies in five criteria: the local width, height, and temperature monitored at the position of the printing head, and the global height and temperature along the part being constructed. See also [21].

The printing takes place inside an inert atmosphere to prevent chemical reactions that may impair the material's properties. Unfortunately, this precaution gets in the way of the operator's visual inspection. The wire-arc process emits flashing lights and projections, so operators have to wear protective masks which also greatly narrow down their fields of vision. Thus it is only really convenient to visually check the production during the cooling phases

between each layer. Even then, the discrepancies to be no-58 1

ticed in the geometry are usually smaller than a few mil-59 2

limeters, and the temperature cannot be assessed visually 60 3

most of the time. 4

For these reasons, there has been an effort in the last few 62 5

years towards augmenting reality for manufacturing pro- 63 6

cesses using alternative display methods [21, 33–36] such 64 7

as, in the case of this work, sonification for wire-arc 3D-65 8 printing. 9

We notice that, to some extent, the sounds of manufac-10 turing already provide some insight into defects that may 11 be occurring during the printing process, such as the noise 12 68 grains becoming more distinct in case of a lower weld pool, 13 69 or the sound stopping entirely in case of a material short-14 70 age. However, that sound is overall loud and unpleasant, as 15 71 well as potentially dangerous for hearing upon prolonged 16 exposure. Thus operators wear noise-reducing headphones 17 73 to protect their ears. Our aim is to put those headphones to 18 74 good use by having them output an auditory display de-19 75 signed to help monitor the process. 20 76

3. RELATED WORKS

3.1 Peripheral Displays 22

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In 1985, Jenkins saw the potential in the hearing modal-23 81 ity for information communication in ambient contexts [3]. 24 82 The concept of ambient or peripheral displays then rose in 83 25 popularity in the late 1990s and early 2000s with the arrival 26 84 of ubiquitous computing and calm technologies announced 85 27 by Weiser & Brown in 1996 [37]. In 1998, Wisneski et al. 86 28 offered an early review on the topic, while calling for more 87 29 research into ambient information technologies [38]. 30 88

Such research took place in the 2000s in an effort to boil 89 31 down the main criteria for the design of a peripheral dis-٩n 32 play based on its goals and use context. Summarized below 33 91 are the ways those papers helped us better define the scope 92 34 of our display. 35

McCrickard et al. [39] give 3 criteria: interruption, reac-94 36 tion and comprehension. As our goal is to provide a dis-95 37 play for critical activity monitoring, the levels of priority 38 96 for these criteria should all be high. Indeed an operator 39 should be able to notice an anomaly and react accordingly 98 40 in a minimal amount of time. We note that our focus here is 99 41 on the identification of the anomalies rather than on read- 100 42 ing any actual value from the display, so comprehension 101 43 priority, although high, is perhaps not maximal. 44 102

Matthews et al.'s set of criteria relates more to the way a 103 45 notification should appear in one's field of attention [40]: 104 46 abstraction, notification level and transition. In our case, 47

information is definitely abstracted, as we want the display $_{105}$ 48

to communicate anomalous progressions in the data with 49

no need for a precise value. We also want to communi- 106 50 cate these progressions in varying degrees of urgency, as a 107 51 slight change in itself may not be detrimental to the pro- 108 52 duction, but should preemptively catch the user's attention 109 53

for the potential arrival of a bigger shift. 110 54 Pousman and Stasko [31] give 4 criteria: information ca- 111 55 pacity, notification level, representational fidelity and aes- 112 56

thetic emphasis. Our work is similar to what these authors 113 57

refer to as an "information monitor display". For this type of display, we should prioritize information capacity (display all five data dimensions) and notification level (varying degrees of urgency). The representational fidelity is of medium priority (no need for exact values) and the aesthetic emphasis is rather low. Here, part of our efforts will still be directed toward making the sound pleasant enough to not become stressful.

3.2 Evaluation Methodology

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A few different approaches can be taken to evaluate a peripheral display. Eventually, the best way is to put the display to use directly in its intended context by means of an in-situ implementation [28, 41]. Although, in early design stages, this is not always possible or suitable, either from a lack of equipment or because the display is still too experimental to be representative of what the intended audience may expect.

In a lot of situations, simply asking users to assess their experience through interviews and surveys is enough to gather information about the aesthetic value and intrusiveness of a display [42-47]. This is sufficient when the display's intended use is to be part of a relaxing augmented environment for the house, workplace, or public spaces.

Additionally, in cases where the display needs to convey more critical information, the evaluation also has to account for the intelligibility of that information. This requires more quantifiable data on users' performance when using the display, which are usually obtained by means of identification trials [21, 48, 49].

When a critical information display is intended to be part of a larger work context, a measurement of distraction is also needed. McCrickard et al. recommend a dual-task evaluation process to this end [39]. This methodology has also been researched more recently by Hausen et al. [50], Daniel [51], and it was implemented in several experiments on peripheral auditory displays [19, 25, 27, 52-55].

In the case of our work, in-situ implementation is not feasible yet, as no sensors are actually present on the printers to provide the critical data to be monitored. Still, our goal is to produce a display that will help monitor the process with no need for direct exposure. This requires us to take into account other activities that would be made possible by this newfound sensory freedom, such as for example "checking one's e-mail" or "preparing the next print". Thus, our experiment will not only account for data intelligibility, but also for attentional capture through the use of a dual-task identification trial.

4. MAPPING CHOICES

Soundscapes of several simultaneous sound streams have been shown to facilitate the identification of multidimensional data [15, 19, 54, 56, 57] so we chose to convey our data using a soundscape of four perceptually and cognitively distinct sounds streams. This consisted in selecting an array of sounds that each evokes a different soundproducing situation. Those metaphors were chosen in a way that, we expect, also facilitates the classification of sounds according to the properties of the anomalies they 60represent.

As such, the geometric criteria (part height, weld pool 3 width and weld pool height) are conveyed by continuous 61 4 streams of structured, repetitive musical notes. It is prefer-5 62 able that those notes follow western rules of musical in-6 tervals, as they are easier to identify for european listen-7 63 ers [58], and are commonly considered more pleasant to 8 64 listen to than atonal or noisy sounds. In the absence of 9 65 anomalies, those notes constitute a baseline sound confirm-10 ing that the sonification is up and running. As anomalies 11 67 arise though, their fluctuations should induce a feeling of 12 68 13 slight unease in the listeners, thus prompting reaction [59]. For the local weld pool dimensions, a lead arpeggio (L) 14 70 of 3 notes in the chord of C major keeps playing as long 15 71 as the dimensions are within bounds. The width influences 16 72 the duration of those notes (inverse polarity mapping be-17 73 tween 0.5 and 1.5 seconds). The height is conveyed by the 18 74 starting pitch of the sequence (between C5 and F6). Loud-19 75 ness is also influenced by an amplitude factor, computed as 20 76 the mean of two values respectively mapped to width and 21 height anomalies (each between 0.02 and 0.2). We expect 22 this sound to become faster, louder, and more erratic as the 23 79 dimensions diverge from the norm. 24 80 For the relative part height (difference between the ex-25 81 pected height and the current height), a continuous dron-26 82 ing synthetic tone (D) varies in pitch (notes between E2 27 83

and D3). The absolute value of the height difference is
 conveyed by an amplitude factor mapped between 0.1 and
 0.4. This way, the drone gets louder as the part height di verges while its pitch fluctuations indicate whether it is too
 tall or too short.

Meanwhile, the thermal criteria (weld pool temperature 33 and part temperature) are conveyed by noisy pre-recorded 34 ۵n natural sounds that emerge in case of anomalies but re-35 91 main silent otherwise. We elected to use the sounds of 36 92 water reacting to heat and cold as they constitute an eas-37 ily identifiable everyday metaphor for temperature in the 38 system [60, 61]. Their noisy nature makes them stand out 39 93 against the tonal background. 40

The weld pool temperature, when below its ideal value, 94 41 is conveyed by the sound of crackling ice (W-). A tem-42 perature over the ideal value is conveyed by the sound of 96 43 boiling water (W+). Straying further from the accepted 97 44 range influences an amplitude factor (computed between 98 45 0 and 0.9 and graduated as: $[0.0, 0.4] \rightarrow 0; [0.4, 0.6] \rightarrow$ 46 $0.2; [0.6, 0.9] \rightarrow 0.5$). Thus this sound stream is inaudi- ¹⁰⁰ 47 ble as long as the temperature is within bounds, and only 101 48 102 emerges as it turns into an anomaly. 49

Finally, when the global temperature of the part passes its ¹⁰³
 threshold of 600°C, the sudden sound of sizzling water (S) ¹⁰⁴
 is triggered.

The pitch, speed and loudness ranges for those sounds were chosen as a consequence of our previous work on the same project [21], which resulted in the participants requesting lower, slower and overall more distant sounds.

57 In the following sections, anomalies will be referred to

58 by the first letter of their sound elements. For instance,

⁵⁹ the combination of lead arpeggio, drone, and boiling water

anomalies will be called LDW+.

5. EXPERIMENT

5.1 Process

The primary task of our dual-task evaluation is based on the one described in [51]. It consists in copying random sequences of 'X' and 'O' symbols, whose lengths are randomly picked between 2 and 5. Participants interact with this game by clicking elements of a graphical user interface. As soon as a sequence has been copied, another one is generated and displayed, prompting the participants to copy as many sequences as they can in the duration of each level. We chose this very simple primary task because it gives an easily quantifiable assessment of the participants' performance while not relying too heavily on any one's individual abilities.

Simultaneously, the secondary task consists in listening and labelling sounds in real time by checking the corresponding boxes in the interface. See Figure 1. Those boxes are labelled after the types of sounds conveying the anomalies: "Lead", "Drone", "Water" and "Sizzle". W+ and Ware fused into a single box in the interface, simply labelled "Water" as they convey the same variable whose polarity is considered secondary information for now.

Before getting to the evaluation itself, players go through a progressive training phase during which they learn to copy sequences, then to recognize sounds, and finally to carry out both tasks at the same time. This training can be redone as many times as the player deems necessary. Still, players have to get a labelling score of 90% or higher in the last phase of that training before they can start the evaluation.

This evaluation interface can still be accessed online¹, but it does not record entries anymore.

5.2 Data

We used pre-simulated data recorded in .csv files representing various printing scenarios. Our data were sonified into .way files according to the mapping choices described in Section 4 using a script written for SuperCollider². In the simulations we are working with, the only anomaly combinations encountered are the ones that are likely to occur according to the way criteria physically interact (for instance: a higher local temperature causes the weld pool to spread out more, thus becoming lower and wider). This gives us 8 possible combinations, including the regular anomaly-free behaviour. Three of those were selected for the training phase and presented in this order: LD, LDW+, and no anomaly. All other anomaly combinations available were used for the experiment in a randomized order: LDW-, D, LW+, LW-, LW+S, and five more situations with no anomaly.

¹ https://maxime-poret.emi.u-bordeaux.fr/these/eval2020/ - Accessed 3/12/21

² https://supercollider.github.io/ - Accessed 3/12/21

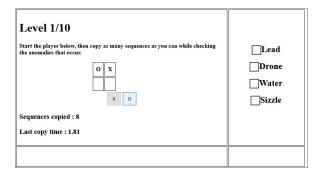


Figure 1. A screen capture of the experiment interface during a level. In the middle, the player clicks the buttons to copy the sequence displayed. Boxes on the right allow the player to point out anomalies as he or she notices them.

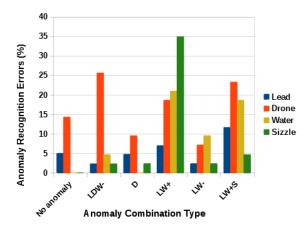


Figure 2. Mean error rate for the identification of anomalies, for each anomaly type (colors) and for each anomaly combination (horizontal sections).

1 5.3 Participants

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43 participants took part in the experiment: 20 M, 23 F,
aged from 18 to 67 (average 32). By taking part in the experiment, participants certified that their hearing was unaltered. Five of them had taken part in an earlier experiment
for the same project and were familiar with some of the
mapping choices.

6. RESULTS

We measured participants' performance at the primary task
by recording the length and time of completion of each
copied sequence. For the secondary task, we recorded the
times at which anomaly boxes were checked.

13 6.1 Anomaly identification

For each type of level, we computed the error rate for 14 anomaly identification, such that a criterion was consid-15 ered inaccurately identified when it was checked despite 16 there being no anomaly, or unchecked despite the presence 17 of an anomaly. Those results are displayed in Figure 2. 18 Our soundscape's overall performance seems to be rather 19 20 good, as all criteria were accurately identified above random chance by testers. 21

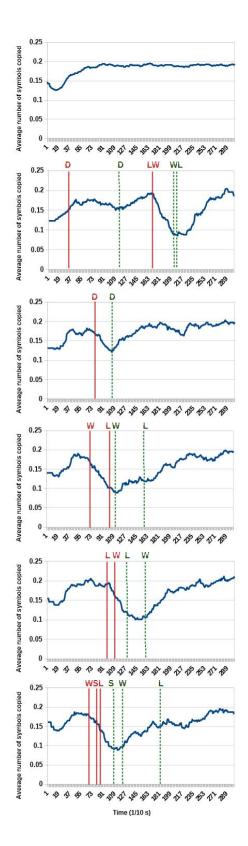


Figure 3. Attentional curves for each level type in the evaluation, computed as the average number of symbols copied for each decisecond. Red lines: onset times of the anomalies. Green dotted lines: mean annotation time. Level types from top to bottom: No Anomaly, LDW-, D, LW+, LW-, LW+S

Still, D seems to be the most difficult anomaly to label as 57 1 its error rate is the highest in 4 levels out of 6. For levels 58 2 LW+, LW-, LW+S, and no anomaly, false positives may 59 3 be due to the fact that people start expecting D for every 60 4 anomaly combination, as it is often linked to others and is 61 5 present in most of the training levels. In levels LDW- and 62 6 D, false negatives may be due to the fact that the drone is 63 7 more subtle than the other sounds, and can be more easily 64 8 tuned out or drowned out. Both false positives and false 65 9 negatives seem to indicate that the drone sound is not no-66 10 ticeable enough for some testers, who instead choose to 67 11 respond seemingly "at random". 12 68 69

We also notice that, in the level LW+, the sound of boil-13 ing water was sometimes mistaken for the sizzle, which re-14 70 sulted in 35% of testers checking that box. During LW+S, 71 15 the sizzle was mostly recognized but some participants ne-72 16 glected the L and W+ anomalies also occuring at the same 73 17 time. 18

6.2 Attentional curves 19

We computed the attentional curves for each type of level 20 as the average symbol-copying speed of participants over 21 79 the course of a level. On the same time scale, we also 22 plotted the anomaly onsets and average labelling times as 23 an indicator of the attentional capture of the participants. 24 See Figure 3. 25

In levels with no anomaly, users get gradually more ef-26 ficient at the primary task as their copying speed reaches 27 85 a limit of 0.2 symbols per decisecond after 8 seconds. A 28 86 similar dynamic can be observed at the start of the other 29 87 types of levels, but with an efficiency drop of approxi-30 mately 0.1 symbols per decisecond when an anomaly is 31 89 32 triggered. Participants do not seem to have issues recovering once they have reacted, since by the end of each level 33 91 the average copying speed returns to the limit of 0.2 ob-34 92 served in levels with no anomaly. Recovery appears to take 35 more or less time depending on the number of onsets, their 36 distribution in time and their durations. 37

94 In the LDW- level, the anomaly onset for D did not af-38 fect participants' performance as much as the anomalies in 39 96 most levels (about 0.03 symbols per decisecond instead of 40 97 0.1). Although it was still noticed on average before L and 41 98 W- started playing, it took longer to be labelled than most 42 of the anomalies. This may be due to the fact that, in that 43 100 level, the drone's pitch starts slowly lowering before any 44 other anomaly is triggered, which may be more difficult to 45 perceive than faster changes, or a rising pitch. 46 101 In the LW+S level, although W+, S and L were triggered 47 102 in this order with delays of 1 second between each, S was 48

103 the first one to be attended to on average, possibly due to 49 104 its more startling nature and its relative rareness in the ex-50 105 periment. 51 106

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7. CONCLUSION

108 We produced an auditory display for an industrial process 109 53

that does not allow for direct monitoring. This display is 110 54

intended to be minimally-intrusive and aesthetically pleas-55

ing. The sound streams were chosen in a way that should 111 56

make them easily identifiable and relatable to the criteria they represent. We evaluated this display with a focus on the attentional pull and the intelligibility of the information.

Our experiment shows that there is an overlap between the sounds of sizzle and boiling water that makes it more difficult for users to distinguish them when they are presented separately. In expected use scenarios, though, the sizzle sound is mostly intended as a last resort alert. Indeed, it should not occur very often and the sound of boiling should have already been playing for a good amount of time when the sizzle happens. We find it encouraging that, although both sounds were not perfectly discriminated, most testers definitely recognized overheating alerts. We also find that when the drone's pitch goes downward too slowly, it is harder to notice as an anomaly, so the choice of a linear mapping of relative height to pitch may not be the most suitable. Predictably, most anomaly onsets cause the attention for the primary task to drop, but participants are still able to recover rather quickly.

Sound ecology is an important aspect of auditory monitoring [2] that we wish could have been more thoroughly taken into account in both the design and evaluation of the display. Indeed, despite the use of noise-reducing headphones, it is unlikely that the noise of production will be entirely suppressed, which may get in the way of some of the sounds we chose. Also, due to the sanitary conditions at the time of testing, the evaluation was presented as a webpage sent out to participants, who all played it at home on their own setups and using their own sound gear. For those reasons, we look forward to experimenting in better standardized conditions in the future.

Further experimentation on integrating this sonification into an augmented work context is intended to take place, putting operators in simulated printing sessions where the criteria are displayed through both sound and touch.

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