

A Vibrotactile Alarm System for Pleasant Awakening

Georgios Korres¹, Camilla Birgitte Falk Jensen, Wanjoo Park, Carsten Bartsch, and Mohamad Eid²

Abstract—There has been a vast development of personal informatics devices combining sleep monitoring with alarm systems, in order to find an optimal time to awaken a sleeping person in a pleasant way. Most of these systems implement auditory feedback as the alarm signal, which is not always pleasant and may disturb other sleepers in the same space. In this paper, we present an adaptive alarm system that detects sleeping cycles and triggers the alarm signal during shallow sleep, in order to minimize sleep inertia. Since tactile sensation is associated with positive valence, vibrotactile stimulation is investigated as a silent alarm to enhance pleasant awakening. Three modulation techniques to render the tactile stimuli for pleasant awakening are considered, namely simultaneous, continuous, and successive stimulation. Two experimental studies are conducted. Experiment 1 studied exogenous attention towards tactile stimulation in a multimodal scenario (involving visual and haptic interactions) with fully awake individuals. Results from the attention task and the subjective valence rating suggest that the vibrotactile stimulation should be based on the continuous modulation, since this not only is very perceivable but also associated with positive attention. Experiment 2 evaluated the user experience with tactile stimulation patterns during sleep. Results confirmed the findings of experiment 1. Continuous modulation was rated highest for pleasant yet arousing sleep-awake transition.

Index Terms—Vibrotactile stimulation, affective haptics, evaluation/methodology, haptic I/O, pervasive computing, health care, psychology, user-centered design

1 INTRODUCTION

WAKING up can sometimes be unpleasant. In many cases, being awoken by the alarm clock during a period of deep sleep causes a person to feel weak and/or confused, or experience a general fatigue during the day [1]. A potential solution to this problem involves determining the sleeping phase the slumberer is experiencing at the instant of supposed alarm-firing, and adapting the actual alarm firing instant accordingly. Preferably, the sleeper will be awakened during a period of light sleep. Another solution suggests using an arousing and/or pleasant stimulation. A combined approach, based on adaptive alarm clock and tactile-stimulation response, is what we are interested in exploring to enhance pleasant yet arousing awakening.

Adaptive alarm clock systems (both research efforts and commercial products) detect sleep cycles and fire an audio alarm during shallow sleep [1], [2], [3], [4], [5]. In contrast to regular alarm clocks, an adaptive alarm clock chooses an optimal time to wake the user up using contextual knowledge (such as calendar information, sleep quality,

and psychophysiology). For instance, HappyWakeUp [2] detects user movements in a bed using the microphone of the mobile phone to identify sleep stage (shallow sleep during the Rapid Eye Movement or REM stage and deep sleep during non-REM stage) and wakes the sleeper up during shallow sleep (REM stage). Sony has recently patented an alarm pillow with electrodes on the surface to come in contact with the head to read brain wave signals [6]. The system analyzes the collected EEG signals to determine when the user goes into the REM or non-REM stages and turns on a buzzer attached to the pillow as soon as the person gets out of deep sleep.

Most alarm systems use auditory modality to display the alarm signal. A potential approach for reducing sleep inertia during wake up would be to apply appropriate tactile stimulation to draw the sleeper's attention (to help wake up) in a pleasant manner. A relation exists between tactile stimulation and drawing attention [7]. Attention can be divided into endogenous and exogenous: The endogenous attention describes the voluntary direction of attention to a particular point, such as paying attention to a person at a cocktail party. In contrast, exogenous or involuntary attention is the reflexive shifts of attention to unexpected or uninformative events, such as someone calling one's name at a cocktail party, or if a fly suddenly lands on one's arm [8].

The majority of attention research has focused on single sensory modalities, such as vision, audition, touch and even olfaction and gustation (visual [9] or haptics [10]). However, in everyday life, we commonly operate across different sensory modalities to facilitate the selection of relevant information. The classic cocktail party problem, where we

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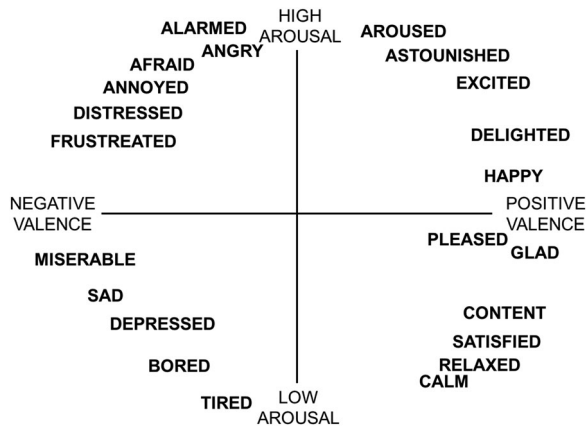


Fig. 1. Russell's model illustrates how the valence and arousal scale can be used to describe different emotions (adopted from [24]).

direct our auditory attention to one particular voice in order to have a conversation in a noisy environment is actually misleading: we often rely on many other sensory modalities such as visual information from lip-movements, facial expressions, and gestures. In addition, we often ignore irrelevant sensory inputs, such as the feel of one's clothes (tactile), the smell of someone's perfume (olfactory), and perhaps even the taste of one's drink (gustatory). Nevertheless, it is difficult to say what our attention is directed towards when we sleep, since this might depend on the sleep phase and the individual.

In this paper we take a novel approach for pleasant yet arousing awakening by utilizing tactile stimulation as an alarm response, and we validate this approach via two usability experiments. Hypothesizing that our attention is not necessarily directed towards tactile inputs, experiment 1 investigates measuring the exogenous attention towards different tactile stimuli in a multimodal scenario (visual and haptic). Experiment 2 evaluates the effects of sleeping on valence/arousal reactions by testing the alarm system with sleeping individuals. Both experiments confirmed that continuous tactile stimulation is the most pleasant (rated highest for valence reaction) yet effective in waking up (rated high for arousal which is highly correlated to shifting sleep to awake state [11]).

The remainder of the paper is organized as follows: In Section 2 we present the literature of tactile stimulation. Section 3 summarizes the software architecture and hardware implementation of the Aegis system (used in this study) and details the sleep stage extraction algorithm. Section 4 introduces experiment 1 to evaluate exogenous attention towards different tactile stimuli in a multimodal scenario (including experimental setup, analysis, and results). In Section 5, we present experiment 2 to evaluate tactile stimulation patterns with sleeping individuals. Finally, Section 6 summarizes the paper findings and provides perspectives for future work.

2 TACTILE STIMULATION LITERATURE

The concept of tactile stimulation has been around for decades, since Geldard [12] in the 1950s studied the temporal and spatial aspects of tactile discrimination on skin and wrote: for some kinds of messages the skin offers a valuable

supplement to ears and eyes. Early research on haptic stimulation has focused on applications aiding blind or visually impaired people [13], but later developments included entertainment and gaming [14], mobile and touchscreen interaction [15], emotional and interpersonal communication [16], [17], [18], and health care (such as physical rehabilitation [19] [20]).

Tactile stimulation can display natural, intuitive, and rich information by modulating the control signal for an array of low cost vibration motors. These modulations can be modified by changing the frequency, amplitude (intensity), Burst Duration (BD), Inter-Burst Interval (IBI), spatial distribution and direction, resulting in different haptic patterns. Many studies have compared the subjective ratings of different haptic patterns using the classic 9-point valence and arousal scale (commonly used to measure emotions [21]); a literature review on affective haptics is available here [22]. The valence level indicates how positive or negative a stimulus is, whereas the arousal level indicates how calming or exciting the stimulus is. An example of how emotions can be distributed into these two scales is shown in Russell's model [23] in Fig. 1. In addition, some studies compare different patterns on additional scales such as cognitive scales of continuity [24], smoothness [25], strength and rhythm [26], or speed [27].

Due to the multiple possibilities for modulating haptic patterns, many studies choose to keep some parameters fixed, while concentrating on the effects of others, which often results in varying conclusions. However, many studies on affective haptics report continuous apparent motion being perceived as pleasant, whereas simultaneous stimuli were rated more unpleasant [27], [28]. Other studies focus more on how the different parameters contribute or affect the continuous feeling [14], [24], [29].

Raisamo et al. [28] found a correlation between continuous tactile stimulation and pleasant emotional reactions whereas simultaneous stimuli were rated more unpleasant. While others examined the effect of frequency, amplitude, duration, direction and body site on continuity and subjective preferences [14], [24], Rahal et al. showed an effect of gender, limb size and intensity [29]. Although most studies on affective haptics report preferences towards more continuous stimulation, this might not be the most suitable when used as an alarm clock (for sleeping individuals). In this case, a soothing continuous motion might not draw enough attention upon itself to cause the user to wake up. Instead it might become integrated into the users dream. On the other hand, using a very arousing and aggressive stimulation could result in an unpleasant awakening that might lead to a dislike of the product. Thus, we are interested in examining not only the subjective emotional ratings of haptic patterns but also how fast the subject's attention is shifted towards the different haptic patterns.

3 AEGIS ADAPTIVE ALARM IMPLEMENTATION

The Aegis system design is shown in Fig. 2 (a comprehensive description and preliminary testing is published in our previous work [30]). In this section, we will focus on the development of the Adaptive Alarm Subsystem which is the heart of the Aegis system. It includes the Sleep Stage Extraction component and the Alarm Response component.

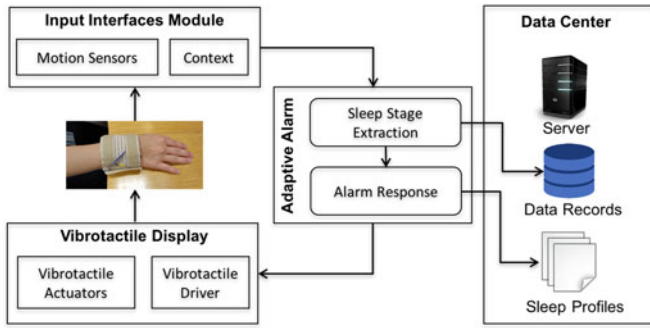


Fig. 2. Software architecture for the Aegis system.

3.1 Sleep Stage Extraction

The Sleep Stage Extraction component analyzes body movement from the accelerometer to classify sleep stages into awake, REM and non-REM. Signal artifacts, caused mostly by sleeper movements that may severely deteriorate the accelerometer readings and thus the motion estimation, are removed via a preprocessing phase. The sleep stage extraction flowchart is shown in Fig. 3.

The preprocessing phase is adopted from the work presented in [31]. The raw three-axis acceleration data are converted first into the SI units (m/s^2) by a calibration procedure. The three signals (a_x, a_y, a_z) are then passed through the following phases:

- 1) *Low Pass Filter*: The raw three-axis acceleration data are passed through a second order low-pass filter with a cutoff frequency of 18 Hz to cancel out high frequency noise [32]. The transfer function of this filter is

$$H(z) = \frac{0.0625 + 0.125z^{-1} + 0.0625z^{-2}}{1 + 1.3z^{-1} - 0.5z^{-2}}. \quad (1)$$

- 2) *Signal Derivation and Aggregation*: A second order derivative operation is applied to each of the three-axis acceleration data to remove baseline wander and gravity components. The transfer function for the derivative operation is shown in Equation (2). Next, the three axis-acceleration signals were combined into a single (axis-independent) signal by calculating the absolute sum.

$$H(z) = \frac{1}{T^2} [1 - z^{-1}]^2. \quad (2)$$

- 3) *Feature Extraction*: The single, axis-independent signal reduces computational effort in further processing steps and increase the amplitude resolution of the body movements. From now on, the algorithm is independent of the orientation of the accelerometer sensor at the beginning or during sleep. The data is divided into 30-second epochs. Feature extraction was based on the calculation of the body movement index [33]. For each 30-second epoch e , a body movement index was calculated using Equation (3). The body movement index is calculated as follows: two separate integration operations are applied to the axis-independent signal over a two second (I_2) and four second (I_4) window (the signals I_2 and I_4 have different response characteristics to different periods

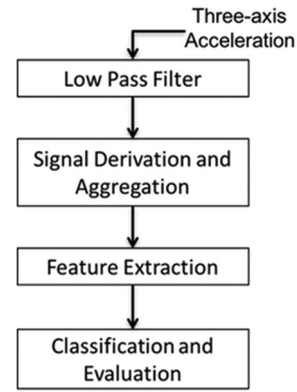


Fig. 3. Sleep stage extraction flowchart.

of movement activity). Digital integration was chosen as it is more suitable for identifying movement, compared to other methods such as zero crossing or time above threshold [34]. The body movement index is then calculated as the summation of the series of I_2 and I_4 values starting from the 4th second till the 30th second, in a step size of 2 seconds. The average over a window of 18 subsequent epochs of the body movement index is also used as another feature for classification.

$$M(e) = \sum_e \left(\frac{I_2}{I_4} \right)^2. \quad (3)$$

- 4) *Classification and Evaluation*: Naive Bayes classifiers [35] are used to distinguish awake, REM and non-REM sleep using the body movement index feature. Comparative evaluation was performed by recording data with the SOMNOWatch plus EEG 6 device [36]. Two healthy subjects (one male and one female) were recorded during seven consecutive nights. The Aegis system was placed on the subjects arm, while reference hypnograms were collected using the SOMNOWatch plus EEG 6 device.

The reference data is also divided into 30-second epochs from the accelerometer signals, and was preprocessed with the DOMINOLight software by SOMNOmedics GmbH. The body movement index feature was used together with the ground truth information recorded from the SOMNOWatch plus EEG 6 device to train the Naive Bayes classifiers extract sleep stage (awake, REM and non-REM). A snapshot comparing results we got using the Aegis system and the SOMNOWatch plus EEG 6 device for detecting awake, REM and non-REM phases over 8 hours of sleep is shown in Fig. 4.

A total of 12,550 epochs was collected from two subjects and used for training and evaluation, 18.2 percent of those epochs were REM-epochs. Results for classification of REM, non-REM, and Awake phases are given in Table 1 for each subject and over a course of seven days. The classifier has an average accuracy of 94.24 percent compared to the 97.79 percent average accuracy for the reference SOMNOWatch plus EEG 6 device.

3.2 Alarm Response

The Alarm Response component is responsible for rendering, based on the corresponding sleep stage, the vibrotactile

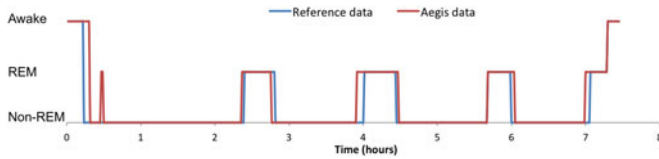


Fig. 4. Example hypnogram with the different sleep stages (Awake, REM and non-REM) over around 8 hours of sleep.

TABLE 1
Classification Accuracy (Awake, Rem and Non-Rem)

Days	Subject 1 (male)		Subject 2 (female)	
	Error	Sleep Time	Error	Sleep Time
1	6.06%	7.45 hrs	6.48%	7.90 hrs
2	5.69%	8.03 hrs	6.21%	7.69 hrs
3	5.22%	7.82 hrs	5.62%	7.21 hrs
4	5.81%	7.45 hrs	5.12%	7.68 hrs
5	6.12%	6.81 hrs	5.90%	7.10 hrs
6	5.10%	6.65 hrs	6.01%	7.32 hrs
7	5.26%	7.88 hrs	5.80%	7.22 hrs
Average	5.67%	7.37 hrs	5.84%	7.40 hrs
SD	0.42	0.53	0.37	0.25

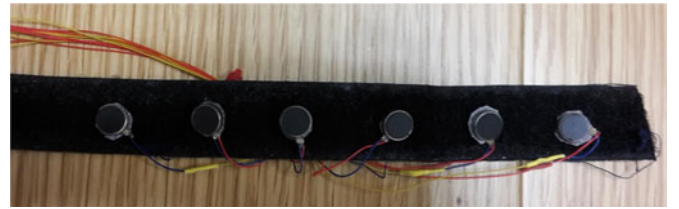


Fig. 6. Vibrotactile motors layout.

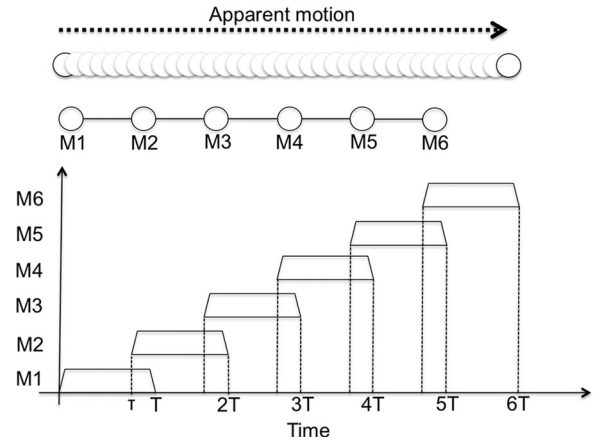


Fig. 7. Continuous tactile stimulation algorithm where α is between 0 and 1 (vertical axis represents corresponding motor).

(Fig. 6). The selection of 4 cm distance between successive motors is derived from a previous perception study [37]. The device is capable of producing three types of tactile stimulation: simultaneous stimulation, successive stimulation and continuous stimulation. The three modes are explained by Equation (4). A demonstration of the continuous stimulation algorithm is shown in Fig. 7. Note that the vertical axis in Fig. 7 contains the indices of the actuators that are activated in sequence.

$$\tau = \alpha T, \text{ where } \alpha = \begin{cases} 0 & \text{simultaneous} \\ 0 \leq \alpha \leq 1 & \text{continuous} \\ \alpha \geq 1 & \text{successive} \end{cases} \quad (4)$$

Where T is the burst duration, τ is the inter-burst interval and α is the mode factor. Simultaneous stimulation involves stimulating the motors at the same time ($\alpha = 0$ or $\tau = 0$) to produce the highest sense of vibration possible where the intensity of vibration can also be controlled. Successive stimulation has one motor stimulated at a time ($\alpha > 1$ or $\tau > T$); there is no inter-burst stimulation. Continuous stimulation is based on the funneling illusion concept [38] and produces apparent tactile motion along the actuation direction.

The stimulation intensity is controlled by adjusting the duty cycle of the Pulse Width Modulation (PWM) signal that feeds the vibrotactile actuators. Increasing the duty cycle of the PWM signal would increase the effective voltage applied to the actuator and thus the vibration intensity. The change in the intensity of vibration is linear over time, and is described by Equation (5).

$$I = I_{min} + \frac{(I_{max} - I_{min})Gain}{100}, \quad (5)$$

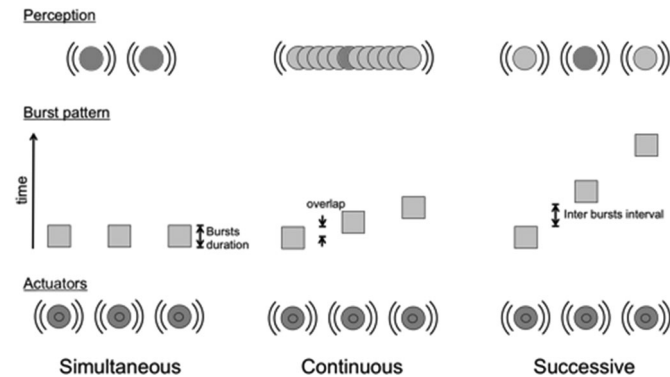


Fig. 5. The burst pattern and how this is perceived for three different modulations; simultaneous (burst duration of 100 ms and inter-burst interval of 300 ms), continuous (300 ms burst duration and overlap of 120 ms), and successive (burst duration of 150 ms and inter-burst duration of 150 ms).

stimulation pattern that must be applied to wake up the sleeper in a pleasant way. There are three types of vibrotactile stimulation patterns that we are exploring: a) simultaneous stimulation where all actuators vibrate at the same time, b) continuous stimulation which is created from an overlap of vibration from successive actuators, and c) successive stimulation where actuators vibrate separately one after the other (no two motors vibrate at the same time). Fig. 5 explains graphically the differences between the three types of stimulation patterns. As for perception of Fig. 5, dark gray actuators refer to the ones activated at a time. Note that the difference between continuous and successive stimulation is that in continuous stimulation the actuation of motors must overlap over time. Successive stimulation involves non-overlapping actuation over time.

3.3 Vibrotactile Display

The tactile armband display device is composed of 6 vibrotactile motors that are aligned 4 cm apart around the wrist

TABLE 2
Overview of the Different Patterns

Pattern	Modulation	Feature ¹	Attributes ²
1	Simultaneous	Int++	(1.25g, 0.25g, 10, 2s, 0, 0s)
2	Simultaneous	Int++, vel++	(1.25g, 0.25g, 10, 2s, 0, 0s)
3	Continuous	Int++	(1.25g, 0.25g, 10, 2s, 0.4, 0.5s)
4	Continuous	Int++, vel++	(1.25g, 0.25g, 10, 2s, 0.4, 0.1s)
5	Continuous	Int++, dir	(1.25g, 0.25g, 10, 2s, 0.4, 0.1s)
6	Successive	Int++	(1.25g, 0.25g, 10, 2s, 3, 0.1s)
7	Successive	Int++, vel++	(1.25g, 0.25g, 10, 2s, 3, 0.1s)
8	Successive	Int++, dir	(1.25g, 0.25g, 10, 2s, 3, 0.1s)

¹Int++ is Intensity increase, vel++ is Velocity increase, dir is Direction change

²Each cell is a set of (I_{max} , I_{min} , Gain, Duration, α , timeStepSize)

where I_{min} and I_{max} represent the minimum and maximum intensity respectively. The Gain variable, between 0 and 100, describes the actual intensity of vibration between I_{min} and I_{max} .

4 MOTIVATING EXPERIMENT: ATTENTION TOWARDS VIBROTACTILE STIMULATION

Although sleep and attention seem to be very different behavioral states, they are similar in that they both involve filtering out information from our awareness [39]. For example, a sleeping person is unaware of the ambient noises (unless they become very intrusive). Likewise, an awake person is able to tune into a conversation in a noisy environment by ignoring other surrounding noise (the cocktail party effect). Selective attention is the process of orienting consciousness towards, or process information from only one part of the environment with the exclusion of other parts [40]. There is evidence for attentional effects of tactile stimulation both from behavioural studies [41] and from neuronal studies [42]. Motivated by the similarity between selective attention and waking up, this experiment studies the role of vibrotactile stimulation to elicit selective attention in a multimodal scenario.

This section introduces the design, setup, and evaluation of an experiment investigating 1) the effectiveness of vibrotactile stimulation to draw the user's attention and 2) the emotional responses to different stimulation patterns. Thus we created a dual-task paradigm, where the subject is performing two tasks at once, thereby forced to divide his/her attention between the two tasks [8], [43]. The paradigm consists of a haptic detection task (where the user has to respond to a detected haptic stimulus) and a visual identification task (where the subject has to identify the correct target among different distractor stimuli).

4.1 Experimental Setup

The wristband providing the vibrotactile stimulus was constructed with six Pico Vibe 310-177, Precision Microdrives vibration motors with 700 rpm frequency at a minimum intensity of 0.25 g, and 1400 rpm at a maximum intensity of 1.75 g. The actuators were placed at a distance of 4 cm from center to center of the actuators (actuator is 10 mm diameter and 3.4 mm thickness). We created 8 patterns based on the three modulations described earlier: simultaneous, continuous and successive. A summary of the stimulation patterns is shown in Table 2. Note that the candidate patterns are



Fig. 8. The experimental setup.

derived based on a pilot study to cover all combinations of modulation attributes (three combinations for intensity, three combinations for velocity, and 2 for direction, a total of 18 combinations to start with).

Similar to other alarm clocks with increasing volume, our patterns increase in amplitude (intensity) as time passes. This was chosen partially to examine how easily the different patterns were perceived and in an attempt to make a smooth waking. Thus all of the patterns started from an intensity of 0.25 g, which is almost not perceivable and ended after 35 to 40 seconds with an intensity of 1.25g, which is easily perceived. The intensity increased linearly with time.

Three of the patterns, one from each modulation type, were altered by this intensity increase: the simultaneous stimulation had a burst duration of 100 ms and an inter-burst interval of 300 ms. The relatively short burst duration was chosen due to the effect of multiple actuators vibrating simultaneously, which intensifies the stimulation. The continuous stimulation was characterized by a burst duration of 300 ms and an overlap of 120 ms (corresponding to 40 percent of the burst duration). The successive stimulation comprised a 150 ms burst duration and an inter-burst interval of 150 ms.

In an attempt to avoid the bias that the stimulus would become integrated in the users sleep, the next patterns were created with either increasing speed or changing direction to increase variations. Three patterns (one for each modulation) were, in addition to the intensity increase, altered by an increase in velocity. This implied a change in the inter-burst interval from 500 ms to 100 ms for the simultaneous modulation.

As for the continuous stimulation, this resulted in a change in burst duration from 500 ms to 100 ms, while the overlap changed from 200 ms to 40 ms. Furthermore, the successive stimulation increased in velocity by a change in burst duration from 250 ms to 50 ms and in inter-burst interval from 250 ms to 50 ms. The last two patterns were based on continuous and successive modulation and varied in intensity and change in direction, starting from the first to the sixth actuator, and then in reversed order.

The experiment was conducted on 15 participants, all of them were students or employees of NYU Abu Dhabi; 7 were female and 8 were males. Two of the male participants were left-handed while all others were right-handed. The average age of the participants was 29.2 years ranging from 19 to 41 years. None of the participants reported any visual impairments (such as color blindness). A snapshot of this experimental setup is shown in Fig 8.

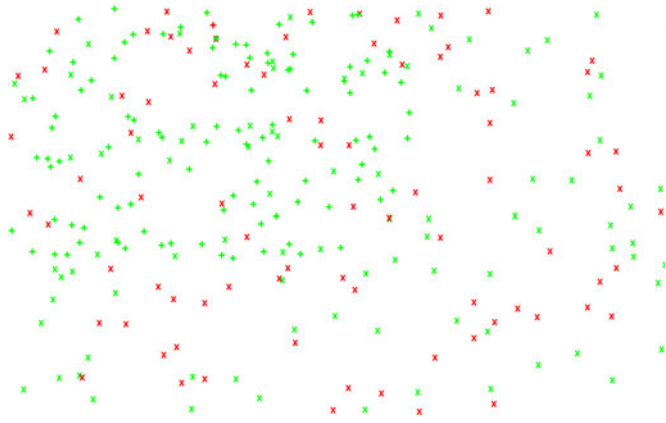


Fig. 9. The visual search task, where the subject is seeking to identify a red cross (+).

The actuators were placed on the non-dominant hand, thus if the subject was right handed, the actuators were placed around the left wrist. While the experiments took place, the subjects were listening to pink noise in order to mask any noise from the actuators.

The experiment consisted of two parts; 1) the dual-task paradigm followed by 2) subjective emotional ratings of the haptic patterns. The dual-task paradigm combined a visual (conjunction) search task [27] with a simple haptic detection task. In the visual search task, the subject searched for a target, a red plus sign “+”, among distractors that share two visual properties, color and orientation, green and red letters “x” and green plus signs “+”. An example with the target present is shown in Fig. 9. If the target was identified, the user responded by pressing “c” for cross, but if there is no target, the user should press “n” for no cross. In 40 percent of the trials the user would also be presented with a haptic stimulus, and should respond to this by pressing space. To minimize anticipation effects of simultaneous changes of visual stimuli and appearance of haptic stimuli, the haptic stimulus would start randomly within the first 3 seconds from the beginning of the trial. Each haptic pattern started with an intensity of 0.2 g, which is almost not perceivable. The intensity then increased over time until it reached 1.6 g. Meanwhile, the step size for increase in the intensity was the same across patterns. All 8 patterns were presented 3 times in random order. The experiment stopped as soon as the user detected all 8 haptic patterns, three times.

In the second part of the experiment the user was presented a haptic pattern and was asked to rate this on a 9–point valence and arousal scales (see Fig. 10). The user could repeat the stimulus by pressing “r” on the keyboard.

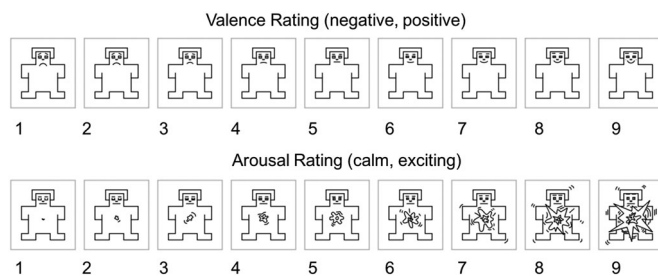


Fig. 10. The 9-point arousal/valence scales used to rate the emotional reactions [45].

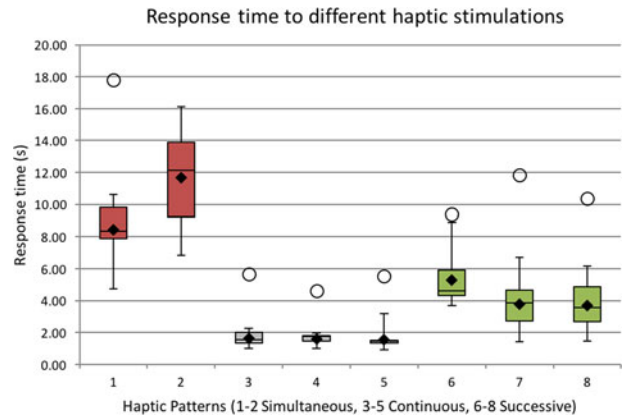


Fig. 11. The response time of 8 different haptic patterns, with diamond representing the mean and circles the outliers (consisting data from only one subject).

Before the experiment, the valence and arousal scales were explained to the user and three practice trials were performed, so the subject was familiarized with the scales. The stimulus presented in the practice trials was not used in the actual experiment. One subject did not complete the second part of the experiment and was therefore excluded from the analysis of the emotional ratings.

4.2 Analysis and Results

The average response time of the three trials for each haptic pattern and for every subject was calculated. The data is plotted in a standard box plot (see Fig. 11); showing the mean as black diamonds and the median, upper and lower quartile in boxes while the whiskers represent the maximum and minimum values. The numbers on the x-axis correspond to the pattern numbers in Table 2. The outliers are marked as circles, all of which came from the same subject. Indicating that this subject had a different perceptual threshold for tactile stimulation. A larger response time for the patterns based on the simultaneous modulation is clearly observed from Fig. 11, which is supported by the following statistical tests. Conducting one-way ANOVA analysis, both with and without outliers, showed no influence of outliers on the results. Thus we included the outliers in our analysis, and the results showed a significant effect of the patterns $F(7,88)=25.61$, $p < 0.001$. To test for interaction effects two two-way ANOVA tests were conducted. One was testing two modulations (continuous and successive) with three features (intensity, intensity+velocity, intensity+direction). The other was testing three modulations (simultaneous, continuous, and successive) with two features (intensity and intensity+velocity). The first ANOVA test showed only a significant effect of modulation $F(1,71)=42.249$, $p < 0.001$, suggesting that perception of patterns based on the continuous pattern are significantly different from patterns based on the successive pattern. The second ANOVA likewise showed a significant effect of modulation $F(2,71)=80.33$, $p < 0.001$. However, it also revealed an interaction effect between modulations and features $F(2,71)=3.79$, $p=0.028$. To examine the interaction effect, a permutation test with paired t-test (and 10,000 repetitions) and a Bonferroni correction of the significance level ($\alpha=0.05/15$) is conducted. The results revealed significant difference with

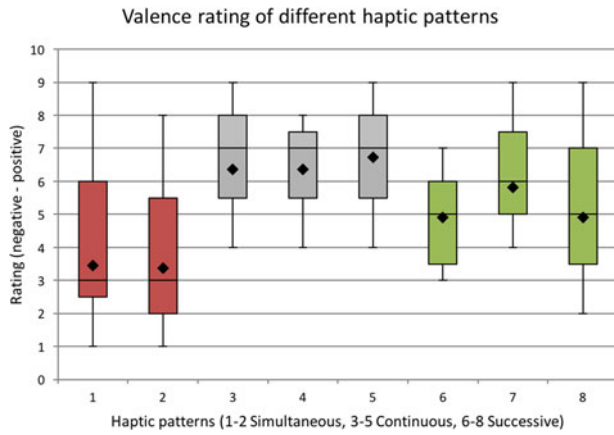


Fig. 12. The subjective valence (negative-positive) ratings of 8 different haptic stimulations, with diamond representing the mean.

$p < 0.007$ on all levels except from the tests where modulation was the same while the features were different. This indicates that the features have different effects depending on the modulation, however, not as significant as with the effect of feature.

The results of the emotional ratings on valence and arousal are shown in the box plots below, Figs. 12 and 13. The boxes represent the median, upper and lower quartile; the black diamonds represent the mean; and the whiskers represent the maximum and minimum values. The valence data shows a large individual difference amongst subjects, which in most cases are larger compared to the arousal ratings.

By conducting a repeated measures one-way ANOVA test, we found a significant difference between the valence ratings of the patterns with $F(7,81)=7.39, p < 0.001$. However, we found no significant difference for the arousal ratings. To examine the valence data further, two two-way ANOVA tests were conducted: one testing two modulations (continuous and successive) for three features (intensity, intensity+velocity, intensity+direction), the other testing the three modulations (simultaneous, continuous, and successive) with two features (intensity and intensity+velocity). The first ANOVA showed no significant effect of modulation and feature. There was no significant difference between any of the patterns based on the continuous or successive patterns. The second ANOVA showed only a significant effect of modulation $F(2,65)=20.29, p < 0.001$. Post hoc t-

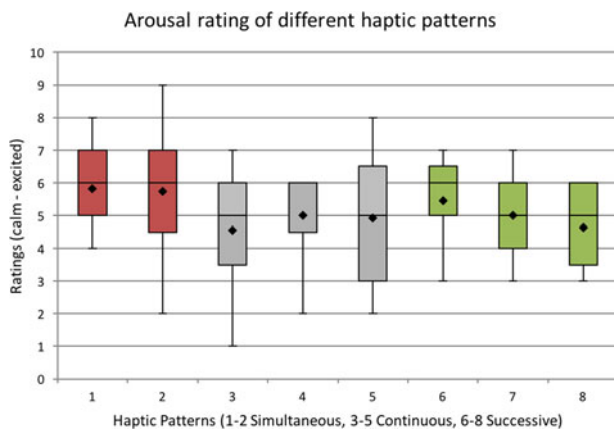


Fig. 13. The subjective arousal (calm-energetic) ratings of 8 different haptic stimuli, with diamond representing the mean.



Fig. 14. The wristband device used in experiment 2 (Note that the vibrotactile motors are embedded in the wristband).

test with Bonferroni correction ($\alpha=0.05/3$) revealed patterns based on the simultaneous modulations were significantly different from those based on both continuous ($t=6.16, p < 0.001$) and successive ($t=3.96, p < 0.001$).

To sum up, the results on response time showed a clear effect of modulation, with the subjects responding quickest to the continuous patterns and slowest to the simultaneous ones. However, the slow reaction times for the simultaneous patterns (especially pattern 2) might be explained by the long inter-burst interval (of 500 ms). It is also surprising to see how fast and similar the response times of the continuous patterns (pattern 3, 4, and 5) across subjects are. The results from the emotional ratings show greater variations amongst subjects than variations in the response times, suggesting that there might be personal preferences towards different haptic patterns. Similar to earlier reports on valence ratings, we also see higher ratings towards patterns with more continuous motions, suggesting that these are preferred over discrete motions. However, we do not see any significant effect of the arousal data and no correlations between arousal and valence data. Therefore, in order to create an effective haptic alarm, which is not only effective but also smooth and pleasant for waking up a person, our results suggest utilizing the continuous modulation.

5 A STUDY OF THE EFFECTS OF TACTILE STIMULATION DURING SLEEP

After testing the functionality of the system with fully awake people in experiment 1, the objective of experiment 2 is to investigate emotional reactions (valence and arousal) of various tactile stimulation patterns during sleep. High valence would result in pleasant awakening whereas high arousal facilitates shifting the sleeping person to the awake state. To the best of the authors knowledge, this is the first study to explore tactile stimulation during sleep.

The best-rated patterns from each modulation type are considered in this experiment: pattern 1 for simultaneous, pattern 5 for continuous, and pattern 6 for successive (based on self-reporting user study about which of the 8 patterns are best perceived as continuous, discrete, and simultaneous). To enhance the usability of the system during sleep, the hardware is attached to a wristband as shown in Fig. 14.

5.1 Experimental Setup and Procedure

Another group of ten subjects (5 males and 5 females) participated in this experiment, with age ranging from 20 to 38 years

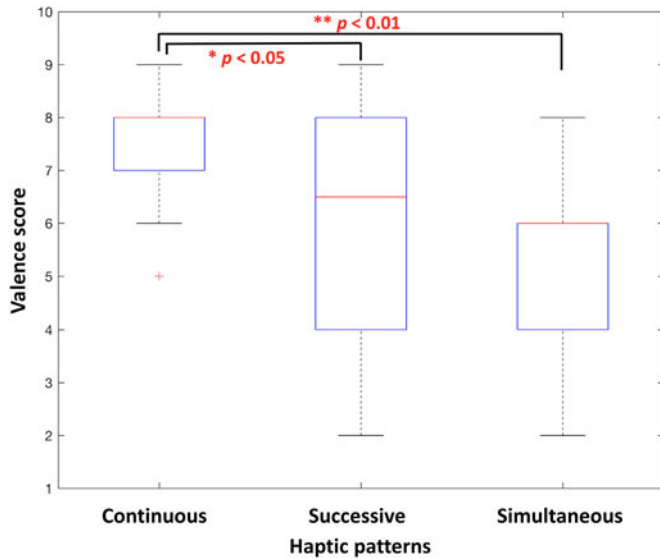


Fig. 15. The subjective valence ratings of three stimulation patterns with sleeping individuals. *Repeated measures one-way ANOVA, ** $p < 0.01$, * $p < 0.05$.*

old. None of the participants reported any sleep disorders. The participants were asked to put on the wristband during regular night sleep and use the three vibration patterns as an alarm to wake up for six (6) consecutive nights, two nights per modulation pattern. For instance, participants could start for two nights with continuous stimulation, followed by two nights with successive, and finally two nights with simultaneous. The order of testing the patterns was random. The participants were instructed to complete a daily questionnaire about their quality of experience and emotional reactions to the alarm system immediately after waking up. All participants reported completing the questionnaire within 10 minutes after waking up. The questionnaire included rating valence and arousal using a 9-points Likert scale. Arousal is particularly interesting here since previous studies (such as [11]) demonstrated that high arousal may enhance waking up whereas valence measures how pleasant the experience of waking up with tactile stimulation.

5.2 Results

The median and distribution of valence are plotted in Fig. 15. It is clear from Fig. 15 that continuous tactile stimulation resulted in the highest scores for valence compared to successive (next best) and simultaneous (least positive). This is consistent with the results we found in experiment 1 that continuous tactile stimulation has induced the most pleasant experience for awake individuals. It seems that this is also true during sleep.

Existing research demonstrated the ability of arousal to shift in sleep states, and in particular to the awake state [11]. Therefore, the median and distribution of arousal are evaluated and plotted in Fig. 16. Continuous tactile stimulation resulted in the highest scores for arousal (slightly higher than simultaneous stimulation whereas successive stimulation was the least arousing). Furthermore, compared to previous results from experiment 1 with awake individuals, it seems that continuous tactile stimulation induced slightly higher arousal during sleep and thus is arousing enough to wake up the participant. Both results of valence and arousal confirm

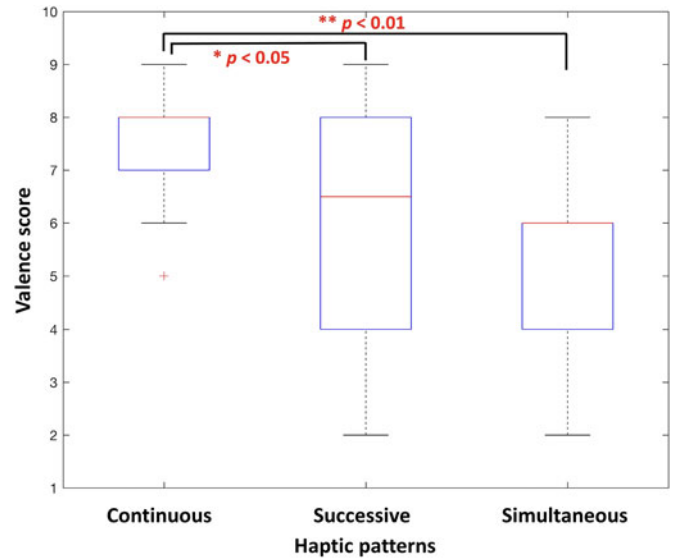


Fig. 16. The subjective arousal ratings of three stimulation patterns with sleeping individuals. *Repeated measures one-way ANOVA, * $p < 0.05$.*

that continuous tactile stimulation creates the most pleasant yet arousing experience to wake up sleeping individuals.

In order to statistically verify differences between the three modulation techniques, repeated measures one-way ANOVA analysis is conducted. There is a significant difference between the three stimulation patterns. The valence scores of continuous stimulation pattern are higher than other stimulation patterns (repeated measures one-way ANOVA, $p < 0.01$ and $p < 0.05$). These results are again in agreement with previous results for both awake and sleeping individuals. In the case of arousal ratings, the scores of continuous stimulation pattern are higher than successive stimulation pattern (repeated measures one-way ANOVA, $p < 0.05$).

At the end of the entire experiment, participants were asked to rank their favorite stimulation pattern. Seven participants indicated that continuous tactile stimulation is their favorite, two participants selected successive and one selected simultaneous (some favor arousal over valence or vice versa). This is probably due to individual differences between humans when it comes to tactile experiences. Therefore, individual differences must be taken into consideration when designing vibrotactile alarm systems where users may be allowed to compose/author the alarm signal that works best for them in order to create a personalized experience.

One participant suggested that on the first day, the tactile stimulation was new experience and somehow alien and thus she woke up immediately. On the second day on, her body got used to it and thus felt more comforting. The three stimulation patterns were successful to wake her up, continuous stimulation seemed to have the most pleasant effect though. Another participant reported that after a few days his body was able to adapt to the intensity of tactile stimulation and could not wake up at one night. He suggested to vary the tactile stimulation patterns (such as direction, speed, and/or intensity of tactile stimulation) over time so that users will always find them arousing in order to wake up while keeping their properties associated with positive valence. All these comments suggest that a personalized tactile stimulation pattern(s) would be more effective for

individual users. All participants though agreed that they would use the system on daily basis if available as a commercial product at reasonable cost.

One explanation of preference of continuous tactile stimulation over simultaneous/successive is that continuous stimulation resembles best the experience of affective touch. Affective touch is continuous in nature, and tends to stimulate the C-fiber of the hairy skin, which in turn makes the person feel better (positive valence) [45], [46]. As for the arousing effect, affective touch is not only (neurally) represented in the somatosensory cortex but also in the limbic system [47], which plays a key role in the formation of emotions and sleep-wake transition.

6 CONCLUSION AND DISCUSSION

This paper presents a study to investigate vibrotactile stimulation as an alarm signal to effectively wake a user up a sleeping person. Experimental results demonstrate that vibrotactile stimulation induces high arousal (which helps a sleeping person wake up) and positive valence (which makes waking up a pleasant experience). More specifically, the results from experiment 1 suggest that the haptic-base response should be based on continuous modulation, since this not only is very perceivable but also rated as more positive. In Experiment 2, participants preferred the continuous stimulation pattern, with the highest scores in valence and arousal ratings.

However, as the prototype evolves, further improvements can be made to the system. The hardware could be optimized in terms of size (for example, the circuit should move to a smaller microprocessor board for even more compact assembly), and sensory data may be saved in internal non-volatile memory. A mobile device application may also be developed to provide a convenient interface to configure the system (rather than using a hand watch for now). In addition, more usability studies could be performed over longer time intervals (particularly with sleeping individuals) to further analyze the system and derive a more robust and personalized performance. One can imagine that the haptic patterns could provide the user with more information than the alarm onset. For example different patterns could indicate how close the systems alarm onset is to the users preset alarm time, thereby indicating how fast one needs to get ready. This is similar to Lylykanga's examination of patterns representing information on motion (e.g., decelerate, accelerate or keep speed constant) [27].

For future research it would be interesting to test the effectiveness of the different patterns during sleep with a larger number of participants, and over a large time interval (a few months). The tactile patterns could also be used to influence a users sleep phase, e.g., moving them from deep sleep to light sleep before waking the user. In this case it might be useful to create patterns based on simultaneous modulation, which are not that easily perceived but highly arousing. Another interesting future direction is to conduct a comprehensive study to compare tactile-based and auditory-based alarm systems.

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