Effect of Remote Masking on Tactile Perception of Electrovibration

Milad Jamalzadeh , Cagatay Basdogan, Senior Member, IEEE, and Burak Güçlü

Abstract-Masking has been used to study human perception of tactile stimuli, including those created by electrovibration on touch screens. Earlier studies have investigated the effect of on-site masking on tactile perception of electrovibration. In this article, we investigated whether it is possible to change the absolute detection threshold and intensity difference threshold of electrovibration at the fingertip of index finger via remote masking, i.e., by applying a (mechanical) vibrotactile stimulus on the proximal phalanx of the same finger. The masking stimuli were generated by a voice coil (the Haptuator). For 16 participants, we first measured the detection thresholds for electrovibration at the fingertip and for vibrotactile stimuli at the proximal phalanx. Then, the vibrations on the skin were measured at four different locations on the index finger of subjects to investigate how the mechanical masking stimulus propagated as the masking level was varied. Later, masked absolute thresholds of eight participants were measured. Finally, for another group of eight participants, intensity difference thresholds were measured in the presence/absence of vibrotactile masking stimuli. Our results show that vibrotactile masking stimuli generated sub-threshold vibrations around the fingertip, and hence, probably did not mechanically interfere with the electrovibration stimulus. However, there was a clear psychophysical masking effect due to central neural processes. We measured the effect of masking stimuli, up to 40 dB SL, on the difference threshold at four different intensity standards of electrovibration. We proposed two models based on hypothetical neural signals for prediction of the masking effect on intensity difference thresholds for electrovibration: amplitude and energy models. The energy model was able to predict the effect of masking more accurately, especially at high intensity masking levels.

Index Terms—Electrovibration, remote masking, Weber law. intensity difference threshold, absolute detection threshold, energy model, amplitude model.

I. INTRODUCTION

TACTILE feedback is necessary to improve intuitiveness of human-machine interaction and/or as a substitution for other senses. In particular, displaying tactile feedback through touch screens is gaining importance due to its potential applications including those in consumer electronics, mobile

Manuscript received May 11, 2020; revised August 13, 2020 and September 5, 2020; accepted September 18, 2020. Date of publication September 22, 2020; date of current version March 19, 2021. This article was recommended for publication by Associate Editor Y. Tanaka and Editor-in-Chief L. Jones upon evaluation of the reviewers' comments. (Corresponding author: Burak Güçlü.)

Milad Jamalzadeh and Cagatay Basdogan are with the College of Engineering, Koc University, Istanbul 34450, Turkey (e-mail: mjamalzadeh17@ku.edu.tr; cbasdogan@ku.edu.tr).

Burak Güçlü is with the Institute of Biomedical Engineering, Boğaziçi University, Istanbul 34684, Turkey (e-mail: burak.guclu@boun.edu.tr).

Digital Object Identifier 10.1109/TOH.2020.3025772

computing, and the automotive industry [1]. Implementing tactile feedback on touch screens requires a deeper understanding of how different tactile stimuli are perceived by humans, separately or simultaneously.

Tactile perception is mediated by psychophysical tactile channels, according to the four-channel theory of vibrotactile detection for glabrous skin [2]. Each tactile channel predominantly receives inputs from its corresponding receptor system and has its own frequency characteristics measured at threshold. In other words, human vibrotactile sensitivity varies as a function of stimulus frequency. This function has a U-shape at high frequencies with the lowest threshold at about 250 Hz, but it is relatively flat at low frequencies. At suprathreshold levels, tactile perception can be quite complicated with the contributions of several psychophysical channels. Most natural stimuli excite all classes of mechanoreceptive afferents and the resulting tactile percepts are derived from multiple sub-modalities [3]. The activations of individual channels have been studied mostly with the help of psychophysical masking effects [4]. Tactile masking can be defined as the reduced ability to detect or discriminate a tactile pattern, when a second pattern is available in close temporal or spatial proximity to the first one [5]. The earlier psychophysical studies have investigated the effects of masking on absolute thresholds, difference thresholds, magnitude estimation, and localization of tactile patterns. Masking effects typically depend on the relative differences between the frequencies, intensities, spatiotemporal positions and durations of the target and the masking stimuli [6].

Different tactile masking types are usually defined based on their temporal order (see Vardar et al. for a short review [7]). As one of the most frequently applied techniques, forward masking has been shown to increase detection levels for both low and high frequency stimuli, and can be used to selectively mask psychophysical channels [8]-[11]. Forward masking can be explained by two alternative theories: persistence and neural adaption [12]. The persistence theory states that forward masking occurs because of persisting neural activity of the masking stimulus after its offset. The neural adaption theory refers to changes in the neural responses of the target stimulus due to the preceding stimulus. If the temporal order of the target and masking stimuli is reversed, one ends up with backward masking [13], [14]. Two mechanisms have been proposed for the backward masking effect: integration and interruption [15]. Integration theory assumes that the tactile stimuli presented in close temporal distance integrate into a composite representation, which

1939-1412 © 2020 IEEE. Personal use is permitted, but republication/redistribution requires IEEE permission. See https://www.ieee.org/publications/rights/index.html for more information.

obscures the perception of target stimuli [16]. Interruption theory proposes that the arrival of the second stimulus interrupts the processing of the target signal by diverting the processing resources away from the target [17]. In this study, we used pedestal masking technique in which target stimulus occurs during a continuous masking stimulus. Therefore, almost all explanations for neural mechanisms regarding forward and backward masking may be applicable for pedestal masking. Pedestal masking leads to higher threshold shifts in detection of electrovibration, compared to forward and backward masking [7]. So, we used pedestal masking to observe stronger masking effect on detection and difference threshold levels.

Masking effect highly depends on location and frequency of stimuli. The masking effect is maximized when both target and masking stimuli are activating the same channel [18], [19], and applied to the same location [20]. Verrillo et al. [20] studied the effects of locus and frequency of masking and target stimuli on thresholds. They observed shifts in threshold level for in-channel masking, when both target and masking stimuli were applied to a fingerpad. For the cross-channel case, some masking was observed when target stimulus frequency was in the range of the Pacinian channel and no effect when the target signal was stimulating non-Pacinian channels. For remote masking, if the masking stimulus was delivered to the thenar eminence and targeted to the fingerpad, the highest threshold shift was observed when both target and masking stimuli were exciting the Pacinian channel. Tanaka et al. [21] showed that a 50 Hz masking stimulus at forearm increased the threshold for detection of a 50 Hz stimulus at a fingertip, while no masking effect was observed when 200 Hz masking stimulus was used.

Tactile masking has great potential for the latest technological applications utilizing electrovibration. Electrovibration is one of several methods to display tactile feedback on a surface. This method has been recently integrated to touch screens [22], [23] where tactile effects are generated by modulating the friction between the user's fingertip and the touch screen. This can be achieved by applying a voltage signal to the conductive layer of a touch screen which is capacitively coupled with fingertip skin. The electrostatic force generated by this device causes a change in friction, and thus a tactile stimulus is felt during finger sliding. So far, only two research studies have been conducted to investigate tactile masking on touch screens actuated by electrovibration [7], [24]. One was on the effect of local masking on perception of electrovibration, with masking stimuli also presented as electrovibration [7]. The other study consisted of mechanical vibrations masking electrovibration detection also locally [24]. Vardar et al. [7] studied the effect of different masking methods, where the masking stimuli were presented as electrovibration, on electrovibration threshold of target stimuli. Their results showed that the highest effect is achieved in pedestal masking technique. They also showed that sharpness perception of virtual edges displayed on touch screens depends on the haptic contrast between background and foreground stimuli similar to the way it has been observed in vision studies. They demonstrated that this contrast varies as a function of masking amplitude and activation levels of

frequency-dependent psychophysical channels. On the other hand, Ryo *et al.* [24] attached piezoelectric actuators to a touch screen and investigated the effect of mechanical vibrations generated by these actuators on absolute and intensity difference thresholds of electrovibration.

In this study, we build up on our earlier work [25] where the effect of directly applied mechanical vibrations on electrovibration absolute detection threshold was studied. We extended our research through studying the effect of similar mechanical vibration on electrovibration intensity difference threshold and explained the outcomes of experimental results using a model based on signal energies of hypothetical neural activations. We show that this approach is more effective in explaining masking effect than the existing modeling approach based on signal amplitudes [26]. In both of our works, unlike earlier studies [7], [24], we used remote vibrotactile stimuli for masking the tactile perception of electrovibration stimuli. For this purpose, we applied mechanical vibrations on the proximal phalanx of index finger via a wearable voice coil as masking, while the sliding finger was exploring an electrovibration stimulus on a touch screen.

We investigated the shift in absolute and intensity difference electrovibration thresholds as a function of masking intensity. In this regard, we first measured electrovibration and vibrotactile threshold levels of 16 subjects. Then, we investigated the masking effects on absolute detection and intensity difference thresholds relative to these thresholds. To rule out the possibility of a mechanical interaction at the fingertip, we also verified that the amplitude of mechanical vibrations caused by the remotely applied masking stimuli was small and below the detection threshold close to the location where tactile stimulus was displayed by electrovibration.

To the best of our knowledge, this is the first study proposing a model based on Weber's law, which can explain the intensity difference threshold for electrovibration in the presence and absence of masking stimuli. There are two novelties in our model. First, unlike most of the previous studies, our model considers the background noise in Weber law and is able to calculate it indirectly. Second, while most of the existing studies use the amplitude of stimuli, or magnitude of some hypothetical neural activity for Weber's law, our results show that the signal energy (i.e. squared amplitude) of the hypothetical neural activity can predict the effect of masking on intensity difference threshold with higher accuracy compared to signal amplitude, especially at high intensity masking levels.

II. EXPERIMENTS

A. Participants

Due to large number of sessions, the study was conducted with two groups (G1, G2). Both groups consisted of 5 male and 3 female participants. The average age of the participants in G1 and G2 were 29.3 ± 6.2 and 26.5 ± 5.2 years, respectively. All participants were right handed except one in G1. All participants read and signed the consent form prior to the experiments. The experiments were approved by Ethical Committee for Human Participation of Koc University.

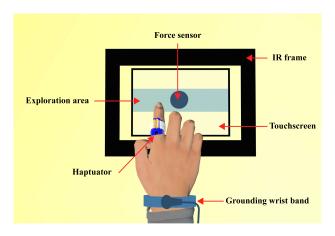


Fig. 1. An illustration of the setup used in the absolute detection and difference threshold experiments.

B. Apparatus

Fig. 1 shows the setup used for the psychophysical experiments. It consisted of two actuators: a touchscreen (SCT3250, 3 M Inc.) and a small high-bandwidth vibrotactile stimulator (Haptuator Mark II, Tactile Labs Inc.). The touchscreen was used to provide electrovibration stimuli on the fingerpad, while the vibrotactile stimulator was used to apply masking stimuli to the same finger. The input signals were generated by the analog output channels of a data-acquisition card (USB-6051, NI Inc.), and were amplified before driving the actuators. A voltage amplifier (E-314 D2, PI Inc.) and a custom-made power amplifier were used for the touchscreen and the vibrotactile stimulator, respectively. The vibrotactile stimulator was placed inside a plastic case which was manufactured by 3D printing; it allowed direct contact with skin when mounted on the index finger. The case was fastened on the proximal phalanx of the dominant index finger by Velcro tapes, as shown in Fig. 2. We followed a strict attachment protocol to maintain similar mechanical contact conditions. Using a grid paper on the plastic case, we achieved a specific amount of fastening and pressure between the Haptuator and finger for each participant in all experiments. A portable digital vibrometer, i.e. laser Doppler vibrometer (LDV), (PDV-100, Polytec Inc.) was used for measuring the mechanical vibrations generated by the vibrotactile stimulator and those propagated on the skin of the index finger. An IR-frame was placed over the touchscreen to detect finger position during movement. A force sensor (Nano17, ATI Inc.) was placed beneath the touchscreen to measure normal and tangential forces. A separate data acquisition card (PCI-6025E, NI Inc.) was used to record force data from the sensor. Throughout the experiments, participants wore a flexible wrist band for electrical grounding. They were also asked to put on noise-cancelling headphones.

C. Absolute Detection Threshold of Electrovibration and Vibrotactile Stimuli

1) Stimuli: In absolute threshold experiment for both modalities (i.e. electrovibration and vibrotactile stimulation), each trial included two intervals. The test stimulus was randomly assigned to one of the intervals while the other one

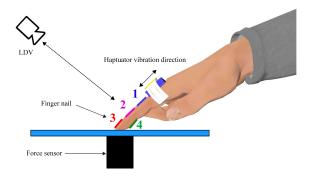


Fig. 2. Skin surface vibrations were measured at four different points on the index finger using a digital vibrometer (LDV). At each point, a reflector was attached to reflect the emitted laser beam from the device perpendicularly. The measurements were conducted while the finger was stationary on the touch screen.

contained no stimulus. In the electrovibration threshold experiment, a 125 Hz sinusoidal voltage signal was displayed as the stimulus to the sliding finger. This signal had a duration of 500 ms with additional 50 ms ramps at the beginning and at the end. In the vibrotactile threshold experiment, the mechanical stimulator was excited by a 250 Hz sinusoidal signal with similar timing parameters as those used in the electrovibration threshold experiment. The reason for using half the frequency of mechanical vibrations in the electrovibration stimuli is due to the nonlinear relation between input voltage and output force (see Vardar *et al.* [23]). Vibrotactile thresholds are lowest at approximately 250 Hz, due to the high sensitivity of the Pacinian channel.

2) Procedures: We measured the absolute detection threshold levels separately for electrovibration and vibrotactile stimuli. In both experiments, the two-alternative-forced-choice method was used. Participants were asked to decide which interval contained the tactile stimulus. In the first trial, the amplitude of the signal was chosen well above the expected threshold level. Signal amplitudes for the following trials were set according to the modified three-down/one-up adaptive staircase method. Voltage applied to the actuator (touchscreen or vibrotactile stimulator) was decreased after three correct answers, not necessarily given consecutively. Giving 1 incorrect answer resulted in an increase in voltage. The change in voltage (step size) was 5 dB until the second reversal. After the second reversal, the voltage change was in 1 dB steps. The experiment was terminated after five reversals in 2 dB range. The average of the last five reversals was taken as the threshold value. In this way, the threshold value was estimated at 75% correct probability of detection [27]. On average, each experiment lasted 15 minutes.

In the electrovibration detection threshold experiment, participants were asked to explore the touchscreen from left to right with a sliding speed of 50 ± 12.5 mm/s, while their average normal force was kept in the range of 0.1-0.5 N. In the vibrotactile detection threshold experiment, the finger was stationary on the touchscreen making a contact angle of 60 degrees, and the tactile stimuli were presented by the vibrotactile stimulator (this will be called the Haptuator from now on.). In this experiment, participants were also asked to keep

the normal force applied to the touchscreen between 0.1 and 0.5 N. The first group of participants (G1) attended the absolute detection threshold experiments three times, on different days. For each participant, the average of three measurements was taken as the threshold value. We later used these values in the absolute detection threshold experiment in the presence of masking. The second group of participants (G2) attended the absolute detection threshold experiments only once. The vibrotactile and electrovibration threshold values from G2 were later used in the difference threshold experiment.

3) Results: We measured the mean absolute detection threshold values of all 16 participants for electrovibration and vibrotactile stimuli applied at the fingertip and at the proximal phalanx as 8.96 ± 1.72 and 0.016 ± 0.009 Volts, respectively. One concern before the vibrotactile threshold experiment was if the tightening of the Haptuator case to participant's finger would effect the amplitude of the vibrotactile transmitted to the finger. A one-way repeated measures ANOVA was conducted to investigate if there is a difference between vibrotactile threshold levels among different experimental sessions. There was no significant effect of experimental session on vibrotactile threshold level (F(2,12) = 0.47, p = 0.64).

D. Vibration Propagation on Index Finger

- 1) Stimuli: A series of sinusoidal signals at a frequency of 250 Hz were applied to vibrotactile stimulator to measure the propagated vibrations on the skin surface at four different locations of the index finger of participants (Fig. 2). Duration of each signal was 2 seconds with a 2 second gap between them. The magnitude of the signals was set to 10 dB SL initially and then increased to 40 dB SL, where dB SL refers to decibels above the sensation, i.e. threshold, level. These intensity levels were adopted in the subsequent masking experiments.
- 2) Procedures: Before conducting the masking experiments, we investigated the vibration output of the Haptuator on the index finger of participants. For each participant, the skin surface vibrations were measured at four points on the index finger as the Haptuator excitation intensity was varied from 10 to 40 dB SL (Fig. 2). For each intensity, the excitation signal was applied for 2 seconds with 2 second gaps between them. These measurements were important to verify that the propagation of the vibrations from the remote masking site was significantly attenuated at the electrovibration test site. Therefore, the remote masking could be mostly attributed to central neural processes, and not to a mechanical interference at the electrovibration site.
- 3) Results: Fig. 3 plots the mean skin vibration amplitudes measured at four different locations on the index finger of participants. This measurement showed that the maximum vibration was close to the Haptuator, and the vibrations were highly attenuated near the fingerpad. Vibrations at finger nail were slightly higher than those at the tissue around it (points 2 and 4), because of the higher transmission of vibrations in stiffer structures (bones and nail) and the boundary condition at the fingertip. One other hypothesis for the vibration propagation on finger is that they travel on the surface of the skin as surface waves. Since the skin is a continuous medium and the stimulation

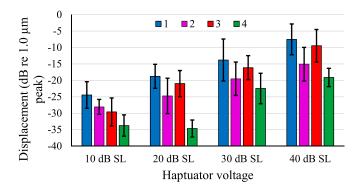


Fig. 3. Comparison of skin-surface vibration levels at four locations on the finger (points 1, 2, and 4 are located on soft tissue while point 3 is on finger nail) while the Haptuator was actuated by a 250 Hz sinusoidal burst. Measurement was obtained at 10-40 dB SL of the Haptuator control voltage. Bar heights are the mean measurements across all participants and error bars are the standard deviations.

produces a circular source of surface wave, it would not be a problem for the mechanical wave to travel to the tip of the finger, without needing to travel through the bones [28]. The minimum vibration was observed beneath the index finger, close to fingertip. For all participants at 40 dB SL, the vibration amplitude of point 4 barely reached to the average threshold level of the Pacinian channel, which is about -20 dB re $1.0~\mu m$ peak [29]. Therefore, the mechanical effect of remote masking at such a high masking intensity level is much smaller than the mechanical vibration caused by electrovibraion stimuli, 10-40 dB SL, at the fingertip for the subsequent masking experiment.

E. Absolute Detection Threshold of Electrovibration in the Presence of Vibrotactile Masking Stimuli

- 1) Stimuli: In the absolute detection threshold experiment with masking, the electrovibration excitation signal waveforms were exactly the same as those used in the electrovibration threshold experiment. However, the vibrotactile masking stimuli with equal intensity were present in both intervals and for different experiments its intensities varied between 10, 20, 30, and 40 dB SL in random order. The masking stimuli had sinusoidal waveforms with 50 ms on and off ramps and a total duration of 2 seconds including the ramps. The target signal was 0.5 seconds long and displayed in a time window overlapping the middle portion of the masking signal; both signals were centered within the interval.
- 2) Procedures: In this experiment, electrovibration threshold was measured at the fingertip, while mechanical vibrations were remotely applied by the Haptuator for masking. The protocol of this experiment was the same as the one used in the threshold experiment for electrovibration. The only difference was the presence of masking stimuli at both intervals in all trials. We conducted the masking experiment using the pedestal masking method. In each experimental session, the masking intensity was kept constant in all trials. Masking stimuli were applied at 10, 20, 30, and 40 dB SL intensities in different sessions. For each masking level, the electrovibration threshold was measured three times, on different days, and the average of three measurements was taken as the masked threshold level.

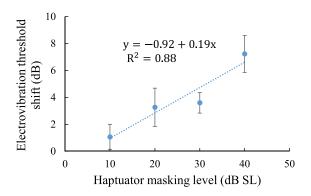


Fig. 4. Results of remote pedestal masking experiment. Mean electrovibration threshold shift (dB) is shown as a function of remote vibrotactile masking intensity. The error bars depict the standard deviations.

3) Results: Fig. 4 shows the mean threshold shift in detection threshold of electrovibration as a function of remote masking intensity. The threshold shift was calculated in dB using $20 \times \log_{10} A$, where A is the ratio of masked absolute threshold value to the unmasked one (given in excitation voltage of electrovibration). A simple linear model was used to predict the shift in electrovibration threshold for a given vibrotactile masking intensity. Considering the fact that we had only four data points, a significant regression was achieved (F(1,2)=15.37, p=0.059), with $R^2=0.88$. Hence, the shift in electrovibration threshold, in dB, was modeled by $-0.92+0.19\times V$, where V was the vibrotactile masking intensity in dB SL. According to this model, the electrovibration threshold shifted up by 0.19 dB for each dB increase in vibrotactile masking level intensity.

F. Electrovibration Difference Threshold Experiment

1) Stimuli: In this experiment, the electrovibration stimuli were similar to the ones used in the absolute threshold experiment, but they were presented in both intervals with different magnitudes. These experiments were conducted in the presence and absence of vibrotactile masking stimuli. For the difference threshold experiments with masking, the masking stimuli were the same as the ones used in the absolute detection threshold experiment with masking. The vibrotactile masking stimuli with equal intensities were present in both intervals. The intensities were 20, 30, and 40 dB SL, and they were presented to the participants in random order.

2) Procedures: In this experiment, we used the two-alternative-forced-choice method to measure the just noticeable difference (JND) of electrovibration stimulus intensity. In each trial, an electrovibration stimulus with fixed intensity, called reference stimulus, was present in one interval while in the other interval an electrovibration stimulus with higher intensity displayed (test stimulus). Participants were asked to decide which interval contained the stronger electrovibration stimulus. In the first trial, the difference between the amplitude of the reference and test stimuli was chosen large enough for a clear differentiation. For the following trials, the difference was set according to modified three-down/one-up adaptive staircase method. The difference was decreased after three correct answers, not necessarily consecutively. Giving 1

incorrect answer resulted in an increase in difference. The step change in difference was 5 dB until the second reversal. After the second reversal, the step size was set to 1 dB. The experiment was terminated after 5 reversals in 2 dB range. The average of the last five reversals was taken as the JND for difference threshold experiment. In this way, the JND value was estimated at 75% correct probability of detection [27]. These experiments were conducted in the presence and absence of vibrotactile masking stimuli. Each participant of G2 performed the experiment in the presence and absence of vibrotactile stimuli separately once. On average, each experiment took 15 minutes to complete for each participant.

3) Results: Fig. 5 shows the mean difference limen of electrovibration as a function of remote masking level. Difference limens are also shown for the unmasked condition. When presenting the results, the just-noticeable difference in amplitude (δV) was converted to the just-noticeable difference in intensity (difference limen, DL) by using

$$DL = 20\log_{10}\frac{V_R + \delta V}{V_R} \tag{1}$$

where V_R is the amplitude of voltage in reference stimulus and $V_R + \delta V$ is the amplitude of voltage in the interval with higher intensity (comparison stimulus). DL, as such, was calculated in dB units.

III. MODELS

A. Modeling and Weber Fraction

According to Signal Detection Theory [30], neural activation patterns generated by tactile stimuli are perceived against the background neural noise. Although levels of neural activity cannot be directly measured by psychophysical methods, their effects can be indirectly quantified by appropriate models. In each trial of the absolute detection threshold experiment, the neural activity during the test interval includes the effects of the tactile stimulus plus the background noise, while the neural activity during the other interval only includes the background noise. In the difference threshold experiment, both intervals include the effects of tactile stimuli in the presence of the background noise. Although we studied the absolute detection threshold and difference threshold of electrovibration separately, in fact, both of them can be considered as discrimination such that participants were looking for the interval with the stronger neural activity. The results of such discrimination experiments can be modeled by using Weber's law. According to Weber's law, the just noticeable difference in intensity has a linear relation with reference intensity. If psychophysical measures and neural codes for intensity are correlated, i.e. called consistency by Johnson et al. [31], one can easily represent the psychophysical measures as hypothetical neural activations. Indeed, the earlier studies showed that sensation magnitude and neural activity due to changes in vibrotactile intensity can be estimated reliably [3], [11], [32]. Therefore, in the models below, the letter I refers to the hypothetical neural activation at the given intensity (generated by a certain driving voltage).

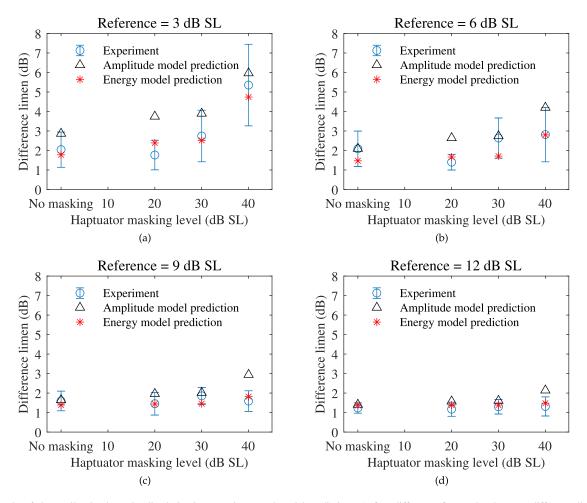


Fig. 5. Results of electrovibration intensity discrimination experiment and model predictions. At four different reference levels, mean difference limen (DL) is shown as a function of vibrotactile masking intensity. Leftmost data points are difference limens obtained without masking. The error bars depict the standard deviations. The asterisks and triangle symbols show the predictions of energy and amplitude models for the mean of difference limens, respectively.

In order to apply Weber's law to both absolute and difference threshold experiments, we need to consider the background noise level (I_{BG}) which is unknown during the experiments. In the electrovibration absolute detection threshold experiment, the reference is the background noise level while in the electrovibration difference threshold experiment, the reference is equal to the total neural activity level caused by reference electrovibration voltage (I_{ref}) and background noise I_{BG} .

In this section, we model all experimental outputs of this study by assuming a single Weber fraction K for just noticeable change in the neural activity level, for both difference and absolute detection threshold experiments, in the absence of masking stimuli [26]. In other words, I_0 (the neural activity level caused by electrovibration stimulus at threshold level) is also defined as a just noticeable change from I_{BG} :

$$K = \frac{I_V - I_{ref}}{I_{BG} + I_{ref}} \equiv \frac{I_0}{I_{BG}}$$
 (2)

where I_V is the total neural activity level resulting from reference voltage (I_{ref}) plus the just noticeable difference from the denominator $(I_{BG}+I_{ref})$. The two equalities in Equation 2 can be summarized in the following form

$$\frac{I_V}{I_0} - 1 = \frac{I_{ref}}{I_0} (1 + K) \tag{3}$$

Since the normal electrostatic force applied to a finger by electrovibration (and its frictional effect during tangential movement) is proportional to the second power of applied voltage, we assume that the neural activity levels are also related to the second power of applied voltage:

$$\frac{I_{A_1}}{I_{A_2}} \equiv \frac{V_1^2}{V_2^2} \tag{4}$$

Equation 4 refers to Weber's law applied equivalently to voltages driving the touchscreen. The signal amplitude model given above is defined based on such an equivalence, that hypothetical neural activations are linearly related to normal electrostatic forces. Another model, i.e. signal energy model, is also tested in this study. In that model, ratios of hypothetical neural activations are again assumed to be equivalent to a function of the ratios of applied voltages, however this time, Weber's law was applied to the signal energy levels of hypothetical neural activations, instead of their amplitude levels. Since the energy of a signal is proportional to the second

power of its amplitude, the energy of the hypothetical neural activations caused by electrostatic force will be proportional to second power of electrostatic force, or equivalently fourth power of applied voltage.

$$\frac{I_{E_1}}{I_{E_2}} \equiv \frac{V_1^4}{V_2^4} \tag{5}$$

It is important to note that a signal energy is not necessarily related to the physical energy stored or dissipated in the setup. It is a mathematical construct (as used in the field of signal processing) for the hypothetical neural activations. Therefore, the signal energy model is merely a mathematical abstraction from the signal amplitude model. If there is a constant Weber fraction ($K_{Amplitude}$) derived from the amplitude of hypothetical neural activations, then there will be a different constant Weber fraction (K_{Energy}) derived from the energy of hypothetical neural activations to satisfy Equation 3.

Using the Equations 4 and 5, Equation 3 can be written in the following forms for the two models:

$$\frac{V^2}{V_0^2} - 1 = \frac{V_R^2}{V_0^2} (1 + K_{Amplitude}) \tag{6}$$

$$\frac{V^4}{{V_0}^4} - 1 = \frac{{V_R}^4}{{V_0}^4} (1 + K_{Energy}) \tag{7}$$

where V_R and V_0 are the reference and threshold-level electrovibration voltage amplitudes, respectively. V represents the comparison voltage (just noticeable difference in voltage plus reference voltage) estimated by the unmasked psychophysical intensity discrimination experiments presented above.

To model the masking experiments, it is assumed that the background neural activity level is increased [26] due to masking. Therefore, for the absolute threshold masking experiment, the Weber fraction can be written as:

$$K = \frac{I_{0M}}{I_{BG} + I_M} \tag{8}$$

where I_M is the increase in the background neural activity level caused by the masking stimulus. This masking effect typically increases as a function of the masking stimulus level [7], [11], [33]. $I_{0\,M}$ is the increase in neural activity level caused by the absolute threshold level of electrovibration in the presence of masking stimuli, for a particular level of masking. It is assumed that a single Weber fraction applies to both unmasked and masked threshold experiments. Furthermore, similar to Equation 1, Weber fraction is assumed to be the same for absolute and difference thresholds:

$$K = \frac{I_{VM} - I_{ref}}{I_{BG} + I_M + I_{ref}} \equiv \frac{I_{0M}}{I_{BG} + I_M}$$
(9)

Where I_{VM} is the total neural activity level resulting from reference voltage (I_{ref}) plus masked just noticeable difference from the denominator $(I_{BG} + I_M + I_{ref})$. Combining Equations 2 and 9 yields:

TABLE I PREDICTIONS OF SIGNAL AMPLITUDE AND ENERGY MODELS FOR JND EXPERIMENTS IN THE ABSENCE OF MASKING STIMULI. K is the Weber Fraction of the Related Model

| Model | slope = 1 + K | Weber fraction | R^2 |
|------------------|---------------|----------------|-------|
| Signal amplitude | 1.30 | 0.30 | 0.991 |
| Signal energy | 1.87 | 0.87 | 0.993 |

$$\frac{I_{VM}}{I_0} - \frac{I_{0M}}{I_0} = \frac{I_{ref}}{I_0} (1 + K) \tag{10}$$

Based on the modeling assumptions given above (see Equations 4 and 5), Equation 10 can be related to touchscreen driving voltages as:

$$\frac{{V_M}^2}{{V_0}^2} - \frac{{V_0}_M}^2}{{V_0}^2} = \frac{{V_R}^2}{{V_0}^2} (1 + K_{Amplitude})$$
(11)

$$\frac{{V_M}^4}{{V_0}^4} - \frac{{V_0}_M}{{V_0}^4} = \frac{{V_R}^4}{{V_0}^4} (1 + K_{Energy})$$
(12)

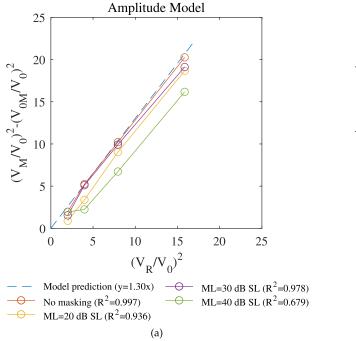
In Equations 11 and 12, V_M represents the comparison voltage (just noticeable difference in voltage plus reference voltage) estimated by the masked psychophysical intensity discrimination experiments presented above. $V_{0\,M}$ is the voltage for the masked threshold. Amplitude model implies that there is a linear relation between $(V_M^2-V_{0\,M}^2)$ and V_R^2 with a slope of $(1+K_{Amplitude})$. On the other hand, the energy model suggests that there is a linear relation between $(V_M^4-V_{0\,M}^4)$ and V_R^4 with a slope of $(1+K_{Energy})$.

B. Predictions by Amplitude and Energy Models

Table I shows the results of fitting unmasked DL data to the models described in Equations 6 and 7, using the simple linear regression method. The Weber fractions estimated by the signal amplitude and signal energy models are 0.30 and 0.87, respectively. These Weber fractions and the average shifted detection thresholds, which are shown in Fig. 4, were further used to predict DLs of electrovibration in the presence of remote vibrotactile masking, since they were assumed not to change in the masked threshold and intensity discrimination experiments.

Model parameters estimated as explained above were used to generate the plots in Fig. 5. Triangle symbols and asterisks in this figure show the DLs predicted by the signal amplitude and signal energy models, respectively. They were obtained by fitting data to Equations 11 and 12. It is important to note that the signal energy model predicts the psychophysical results better. In general, the signal amplitude model overestimated the DLs. There was especially a larger departure from experimental data as the masking level increased, e.g at 40 dB SL.

Fig. 6 shows the psychophysical data in terms of the expressions given in Equations 11 and 12 for the signal amplitude model (Fig. 6 a) and the signal energy model (Fig. 6 b). Dashed blue straight lines are the predictions of the models based on the constant slopes reported in Table I. In other words, as Fig. 5 shows how the models perform psychophysically, Fig. 6 shows



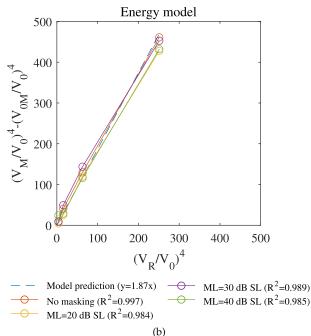


Fig. 6. Results of electrovibration intensity discrimination experiment for different vibrotactile masking levels (ML) are compared against constant slopes (1+K) for the (a) signal amplitude model and (b) signal energy model.

how experimental data conform to constant slope assumption. As seen in Fig. 6 a, constant slope assumption is especially violated by the signal amplitude model at low reference levels for 20 dB SL masking level and at high reference levels for 40 dB SL masking level. On the other hand, the experimental data align well with the constant slope in the signal energy model.

IV. DISCUSSION

A. Mechanical vs. Neural Effects of Masking

The results of the difference threshold experiment in the presence of masking stimuli showed that the mechanical vibration could travel relatively long distances and pass through the finger and reach the fingertip, similar to results reported in [28]. However, in our experiments, even at the highest magnitude of remote vibrotactile stimuli, those used for masking purpose, the amplitude of vibrations near the fingertip was below the detection threshold. Due to the technical difficulties with the digital vibrometer, we could not measure the vibrations exactly at the electrovibration site, i.e. the contact point between the finger and touchscreen. Moreover, since the vibration source was on the dorsal side of the proximal phalanx, the mechanical waves probably had to move along the finger bones and skin to reach point 4 near the fingerpad (see Fig. 3). Since the vibration amplitude at point 4 was barely reaching the average threshold of the Pacinian channel, we concluded that the vibration due to remote masking at the interface of fingerpad and touchscreen was at sub-threshold level. Jones and Sofia [34] investigated the propagation of travelling vibrotactile waves on the human skin at three sites (the palm of the hand, the forearm and the thigh) and found that the waves were attenuated by 8 mm on all the sites tested

but was still measurable at 24 mm. In our case, the distance between the Haptuator and point 4 was more than this distance (about 40 mm). Hence, we suggest that electrovibration and vibrotactile masking stimuli did not have a significant mechanical interference, and the changes in absolute and difference thresholds of electrovibration in the presence of masking stimulus were mostly due to central neural processes. These processes can be modeled by integrating the population response of afferents to construct the psychophysical response (e.g. [33] for detection, and [10] for discrimination).

The results of our experiment on absolute detection threshold of electrovibration in the presence of vibrotactile masking stimuli showed that the absolute detection threshold of a 125 Hz electrovibration stimulus on the fingerpad of the index finger increased almost linearly with increasing amplitude of a remote masking vibration at 250 Hz applied to proximal phalanx of the same finger. This behaviour is similar to the masking results reported in vibrotactile literature, which suggests a similar neural mechanism in detection and masking of electrovibration and vibrotactile stimuli. We refer readers to our earlier publication [25] for detailed comparison of our results with earlier studies and the possible reasons for the differences between the results.

B. Modeling and Weber Fraction

The results of the difference threshold experiment in absence of masking stimuli are in line with earlier studies. Like earlier vibrotactile studies [10], [26], [35], the value of difference limen is relatively higher for lower reference levels (The average DLs were 2.04 and 2.09 for 3 and 6 dB SL reference levels, 1.6 and 1.23 for 9 and 12 dB SL ones, the difference is rather

small; ~ 1 dB), which would result in higher Weber fractions. At first sight, it is tempting to attribute this deviation from Weber's law to not considering background noise during the calculation of the Weber fraction. As such, at high references, background noise would be negligible, but at low references, it may have an effect on Weber's law. However, Güçlü $et\ al.$ [10] showed that the total spike activity from a mechanoreceptive afferent population, i.e. rapidly-adapting fibers, can also generate a similar deviation from Weber's law. Since this population does not have spontaneous activity, there is no "neural noise". It can be mathematically proven that many families of response measures defined over the population activity, e.g. concave up or power law, can generate such behavior in Weber fractions.

Nevertheless, a background noise is highly likely, albeit very difficult to measure, in the central nervous system. This is indeed the main tenet of Signal Detection Theory in psychophysics. An important contribution and novelty of the current work is the simplifying assumption that there is a unique, i.e. constant, Weber fraction applicable to absolute and difference thresholds, whether they are obtained with or without masking. By using the modeling approach presented here, all the thresholds could be predicted based on ratiometric measurements of touchscreen excitation voltages. Since the hypothetical neural activations were also put in ratiometric forms, the only additional assumption was the equivalence of the ratios between neural activations and electrostatic forces in the touchscreen governed by the excitation voltages. Two different relationships were used for this purpose: signal amplitude model and signal energy model (Equations 4 and 5). With the help of these assumptions, we were able to find the unique Weber fraction to be about 0.30 in the signal amplitude model. This value is similar to the Weber fractions typically obtained in the earlier vibrotactile studies. For example, Craig found this value to be about 0.25 [26], [35] at 160 Hz. Similarly, using the figures in Gescheider et al. [36], Weber fraction can be calculated as 0.26 at 250 Hz. Both of these studies and the current study targeted the Pacinian psychophysical channel, but the current work induced tactile stimuli by electrovibration in contrast. It is important to note that the Weber fraction may vary in different channels, or if more than one channel is activated. For example, for the Non-Pacinian I channel, the Weber fraction was reported to be in the range of 0.18 - 0.38 at 40 Hz [10].

Although the signal energy model fits the data better, it yielded a Weber fraction of 0.87 which is somewhat inconsistent with the previous vibrotactile psychophysical studies. Although one may expect different Weber fractions, because of the difference in the mathematical forms of Equations 6 and 7, it would be a circular argument to calculate $K_{Amplitude}$ from K_{Energy} based on those equations. Once the equivalence is assumed with either Equation 4 or 5, a single representation should be selected. The discrepancy between the Weber fraction from the vibrotactile literature and the signal energy model presented here may be due to the modality difference of electrovibration. Unlike earlier vibrotactile studies, electrovibration requires active exploration of the stimulus. During the finger movement on touchscreen, electrovibration causes a

friction modulation which would result in combined loading on the finger and complex mechanical waveform at the mechanoreceptor level. On the other hand, the mechanical waveforms generated during vibrotactile stimulation in the earlier studies were relatively simpler. The earlier vibrotactile studies have sometimes used rigid surrounds to restrict the propagation of vibration through hand and the stimuli were applied dominantly in the normal direction, hence afferent responses can be modeled rather precisely [32], [37]. Another reason for discrepancy may be the assumption of a unique Weber fraction. In Craig's study [26], a modeling approach based on amplitude was used for simultaneous remote masking with vibrotactile stimuli. A constant proportion of the masking effect was used in the equations to show that similar Weber fraction can be obtained for various masking levels and with no masking. However, this approach only worked when background noise contribution was included in the absolute threshold data, but not in the difference threshold data.

Nevertheless, the signal energy model has an additional conceptual benefit when considering the addition of hypothetical neural activations. We avoided using these terms (neural activations caused by background noise and masking stimuli) separately and always reduced them to ratiometric forms (Equations 3 and 10) for fitting, because they cannot be measured directly. This is a powerful approach since it isolates the psychophysical theory from the physically measurable quantities, i.e. voltages, by using equivalence functions (Equations 4 and 5). However, if one considers adding hypothetical neural activities due to background noise, target stimuli, or masking stimuli; a linear summation would be valid for very specific conditions only. For example, when the signals are of different waveforms, summation of signal amplitudes would not be meaningful. However, signal energies may be summed to represent the combined effect of multiple hypothetical neural activations.

V. CONCLUSION

To the best of our knowledge, our study is the first in the literature that proposes a model to explain the differences in absolute detection and difference thresholds of electrovibration in the presence and absence of masking vibrotactile stimuli. We extended Craig's [26] model by constraining the equations to include a single Weber fraction for both absolute and difference thresholds experiments and by including the effect of background noise in the hypothetical neural activations. The link between hypothetical neural activations and touchscreen excitation voltages was established based on two alternatives. The signal amplitude model assumes that neural activation is linearly related to electrostatic force, and thus to squared voltage ratios. Signal energy model, on the other hand, assumes that this relationship is nonlinear, i.e. to the second power of electrostatic force, which yields ratios in the fourth power of excitation voltages. Therefore, in the former model, the combined effect of multiple neural activations can be considered as linear summation, and in the signal energy model as a type of nonlinear summation.

It is remarkable how theories on vibrotactile psychophysics could be applied to electrovibration sensation. We previously argued that the electrovibration detection at 125 Hz (electrostatic force at 250 Hz) was achieved by the Pacinian channel [23]. The current study also attempted to recruit the Pacinian channel for intensity discrimination and found a Weber fraction (by the signal amplitude model) similar to those reported in the literature. Furthermore, the effect of remote vibrotactile masking on electrovibration could be predicted based on the same theory. In other words, in-channel masking affected psychophysical sensitivity and discrimination in the given channel. It may be interesting to test the experiments and the model presented herein at different frequencies with appropriate reference amplitude levels to find out the contributions of different psychophysical channels to intensity discrimination by electrovibration.

Although remote masking leads to a less masking effect, it is a more appropriate way for studying the neural mechanism behind the tactile perception of electrovibration. Remote masking is usually not susceptible to the complex problem of how target and masking stimuli interfere with each other mechanically in the skin to activate the mechanoreceptive afferents at the target site. In vibrotactile psychophysics literature, this is usually accomplished by using forward masking instead of simultaneous or pedestal masking (e.g. see [9]). However, the pilot experiments by Vardar et al. [7] showed that threshold shifts were less with forward masking by electrovibration at the same site (unpublished results); therefore, we used pedestal masking to obtain a robust effect. On the other hand, forward masking can still be effective if it is applied vibrotactually at the same site just before electrovibration as demonstrated by Ryu et al. [24], who indeed used simultaneous vibrotactile masking of electrovibration at the same site. The effect of forward masking is yet to be tested more systematically.

It is still not known how the skin and peripheral afferents respond to complex tactile stimuli applied in both normal and tangential directions. From an application point of view, remote masking may still be more desirable because it can be applied simultaneously with the target signals in a more controlled and simple way. This would entirely decouple the mechanical and neural effects of masking. In this study, we used these advantages of remote masking to model how target and masking stimuli are processed within a sensory system without being worried about the mechanical aspects of the problem. Here, we just investigated tactile stimuli at the effective frequency of 250 Hz with a fixed duration. Further studies need to be conducted to investigate the effects of different stimulus frequencies and durations, and to verify whether standard psychophysical theories still apply.

ACKNOWLEDGMENT

The authors would like to acknowledge the technical support provided by Amirreza Aghakhani from Vibration and Acoustic Laboratory of Koc University related to the digital vibrometer measurements.

REFERENCES

- C. Basdogan, F. Giraud, V. Levesque, and S. Choi, "A review of surface haptics: Enabling tactile effects on touch surfaces," *IEEE Trans. Haptics*, vol. 13, no. 3, pp. 450-470, Jul.—Sep. 2020.
- [2] S. J. Bolanowski Jr, G. A. Gescheider, R. T. Verrillo, and C. M. Checkosky, "Four channels mediate the mechanical aspects of touch," *J. Acoustical Soc. Amer.*, vol. 84, no. 5, pp. 1680–1694, 1988.
- [3] M. A. Muniak, S. Ray, S. S. Hsiao, J. F. Dammann, and S. J. Bensmaia, "The neural coding of stimulus intensity: linking the population response of mechanoreceptive afferents with psychophysical behavior," *J. Neuro-sci.*, vol. 27, no. 43, pp. 11 687–11 699, 2007.
- [4] G. A. Gescheider, S. Bolanowski Jr, and R. T. Verrillo, "Vibrotactile masking: Effects of stimulus onset asynchrony and stimulus frequency," *J. Acoustical Soc. Amer.*, vol. 85, no. 5, pp. 2059–2064, 1989.
- [5] J. C. Craig, "Interference in localizing tactile stimuli," *Perception Psychophysics*, vol. 45, no. 4, pp. 343–355, Jul. 1989.
- [6] G. Gescheider, K. Santoro, J. C. Makous, and S. Bolanowski, "Vibrotactile forward masking: Effects of the amplitude and duration of the masking stimulus," *J. Acoustical Soc. Amer.*, vol. 98, no. 6, pp. 3188–3194, 1995.
- [7] Y. Vardar, B. Güçlü, and C. Basdogan, "Tactile masking by electrovibration," *IEEE Trans. Haptics*, vol. 11, no. 4, pp. 623–635, Oct.–Dec. 2018.
- [8] M. Z. Yıldız, İ. Toker, F. B. Özkan, and B. Güçlü, "Effects of passive and active movement on vibrotactile detection thresholds of the pacinian channel and forward masking," *Somatosensory Motor Res.*, vol. 32, no. 4, pp. 262–272, 2015.
- [9] B. Güçlü and Ç. Öztek, "Tactile sensitivity of children: Effects of frequency, masking, and the non-pacinian I psychophysical channel," J. Exp. Child Psychol., vol. 98, no. 2, pp. 113–130, 2007.
- [10] B. Güçlü, "Deviation from weber's law in the non-pacinian I tactile channel: a psychophysical and simulation study of intensity discrimination," *Neural Comput.*, vol. 19, no. 10, pp. 2638–2664, 2007.
- [11] B. Güçlü and Ş. M. Dinçer, "Neural coding in the non-pacinian I tactile channel: A psychophysical and simulation study of magnitude estimation," *Somatosensory Motor Res.*, vol. 30, no. 1, pp. 1–15, 2013.
- [12] J. J. DiGiovanni, E. E. Lynch, N. K. Nagaraj, and D. T. Ries, "Dominance of persistence over adaptation in forward masking," *Attention, Perception, Psychophysics*, vol. 80, no. 7, pp. 1863–1869, 2018.
- [13] M. Hollins, A. K. Goble, B. L. Whitsel, and M. Tommerdahl, "Time course and action spectrum of vibrotactile adaptation," *Somatosensory Motor Res.*, vol. 7, no. 2, pp. 205–221, 1990.
- [14] G. A. Gescheider and R. T. Verrillo, "Vibrotactile frequency characteristics as determined by adaptation and masking procedures," in *Sensory Functions of the Skin of Humans*. Berlin, Germany: Springer, 1979, pp. 183–205.
- [15] P. M. Evans and J. C. Craig, "Temporal integration and vibrotactile backward masking," J. Exp. Psychology: Human Perception Perform., vol. 12, no. 2, pp. 160–168, 1986.
- [16] D. W. Schultz and C. W. Eriksen, "Do noise masks terminate target processing?," *Memory Cognition*, vol. 5, no. 1, pp. 90–96, 1977.
- [17] P. M. Evans, "Vibrotactile masking: Temporal integration, persistence, and strengths of representations," *Perception Psychophysics*, vol. 42, no. 6, pp. 515–525, 1987.
- [18] E. Bystrzycka, B. Nail, and M. Rowe, "Inhibition of cuneate neurones: its afferent source and influence on dynamically sensitive tactile neurones," *J. Physiol.*, vol. 268, no. 1, pp. 251–270, 1977.
- [19] D. Ferrington, B. Nail, and M. Rowe, "Human tactile detection thresholds: Modification by inputs from specific tactile receptor classes," *J. Physiology*, vol. 272, no. 2, pp. 415–433, 1977.
- [20] R. T. Verrillo, G. A. Gescheider, B. G. Calman, and C. L. Van Doren, "Vibrotactile masking: Effects of one and two-site stimulation," *Perception Psychophysics*, vol. 33, no. 4, pp. 379–387, 1983.
- [21] Y. Tanaka, S. Matsuoka, W. M. B. Tiest, A. M. Kappers, K. Minamizawa, and A. Sano, "Frequency-specific masking effect by vibrotactile stimulation to the forearm," in *Proc. Int. Conf. Human Hap*tic Sens. Touch Enabled Comput. Appl., 2016, pp. 156–164.
- [22] O. Bau, I. Poupyrev, A. Israr, and C. Harrison, "Teslatouch: Electrovibration for touch surfaces," in *Proc. 23nd Annu. ACM Symp. User Interface Softw. Technol.*, 2010, pp. 283–292.
- [23] Y. Vardar, B. Güçlü, and C. Basdogan, "Effect of waveform on tactile perception by electrovibration displayed on touch screens," *IEEE Trans. Haptics*, vol. 10, no. 4, pp. 488–499, Oct.–Dec. 2017.
- [24] S. Ryu, D. Pyo, S.-C. Lim, and D.-S. Kwon, "Mechanical vibration influences the perception of electrovibration," *Scientific Rep.*, vol. 8, no. 1, 2018, Art. no. 4555.

- [25] M. Jamalzadeh, B. Güçlü, Y. Vardar, and C. Basdogan, "Effect of remote masking on detection of electrovibration," in *Proc. IEEE World Haptics Conf.*, 2019, pp. 229–234.
- [26] J. C. Craig, "Vibrotactile difference thresholds for intensity and the effect of a masking stimulus," *Perception Psychophysics*, vol. 15, no. 1, pp. 123–127, 1974.
- [27] J. J. Zwislocki and E. M. Relkin, "On a psychophysical transformed-rule up and down method converging on a 75% level of correct responses," *Proc. Nat. Academy Sci.*, vol. 98, no. 8, pp. 4811–4814, 2001.
- [28] Y. Shao, V. Hayward, and Y. Visell, "Spatial patterns of cutaneous vibration during whole-hand haptic interactions," *Proc. Nat. Academy Sci.*, vol. 113, no. 15, pp. 4188–4193, 2016.
- [29] G. A. Gescheider, S. J. Bolanowski, and R. T. Verrillo, "Some characteristics of tactile channels," *Behavioural Brain Res.*, vol. 148, no. 1-2, pp. 35–40, 2004.
- [30] G. A. Gescheider, Psychophysics: The Fundamentals. Hove, U.K.: Psychology Press, 2013.
- [31] K. O. Johnson, S. S. Hsiao, and T. Yoshioka, "Neural coding and the basic law of psychophysics," *Neuroscientist*, vol. 8, no. 2, pp. 111–121, 2002.
- [32] B. Güçlü and S. J. Bolanowski, "Modeling population responses of rapidly-adapting mechanoreceptive fibers," *J. Comput. Neurosci.*, vol. 12, no. 3, pp. 201–218, 2002.
- [33] B. Güçlü and S. J. Bolanowski, "Vibrotactile thresholds of the non-pacinian I channel: II. predicting the effects of contactor location on the phalanx," Somatosensory Motor Res., vol. 22, no. 1-2, pp. 57–68, 2005.
- [34] L. A. Jones and K. Sofia, "Measuring surface wave propagation during vibrotactile stimulation," in *Proc. IEEE Haptics Symp. (HAPTICS)*, 2012, pp. 457–461.
- [35] J. C. Craig, "Difference threshold for intensity of tactile stimuli," Perception Psychophysics, vol. 11, no. 2, pp. 150–152, 1972.
- [36] G. A. Gescheider, S. J. Bolanowski Jr, R. T. Verrillo, D. J. Arpajian, and T. F. Ryan, "Vibrotactile intensity discrimination measured by three methods," *J. Acoustical Soc. Amer.*, vol. 87, no. 1, pp. 330–338, 1990.
- [37] B. Güçlü and S. J. Bolanowski, "Tristate markov model for the firing statistics of rapidly-adapting mechanoreceptive fibers," *J. Comput. Neu*roscience, vol. 17, no. 2, pp. 107–126, 2004.



Milad Jamalzadeh received the B.Sc. degree in mechanical engineering from the Isfahan University of Technology, Isfahan, Iran, in 2017, and the M.Sc. degree in biomedical sciences and engineering, in 2019, from Koc University, Istanbul, Turkey, where he is currently working toward the Ph.D. degree in computational sciences and engineering program. His research interests include haptic interfaces, tactile perception, and psychophysics.



Cagatay Basdogan (Senior Member, IEEE) received the Ph.D. degree in mechanical engineering from Southern Methodist University, Dallas, TX, USA, in 1994. He is currently a Faculty Member of Mechanical Engineering and Computational Sciences and Engineering Programs from Koc University, Istanbul, Turkey. He is also the Director of the Robotics and Mechatronics Laboratory, Koc University. Before joining Koc University, he worked with NASAJPL/Caltech, MIT, and Northwestern University Research Park. His research interests include haptic interfaces,

robotics, mechatronics, biomechanics, medical simulation, computer graphics, and multi-modal virtual environments. He is currently the Associate Editor-in-Chief for the IEEE Transactions on Haptics and serves in the editorial boards for the IEEE Transactions on Mechatronics, *Presence: Teleoperators and Virtual Environments*, and *Computer Animation and Virtual Worlds* journals. He also chaired the IEEE World Haptics Conference, in 2011.



Burak GüÓlü received the B.S. degree in control and computer engineering from Istanbul Technical University, Istanbul, Turkey, in 1997, the M.S. degree in bioengineering from Syracuse University, Syracuse, NY, USA, in 1999, and the Ph.D. degree in neuroscience from Syracuse University, Syracuse, NY, in 2003. During the postdoctoral degree, he studied species-specific vocalizations and recorded from the prefrontal cortex of awake-behaving macaque monkeys with the Medical School of University of Rochester. He has been with the Institute of Biomedical Engi-

neering, Bogaziçi University, Istanbul, Turkey, since 2004. He is currently the Director of Tactile Research Laboratory at the Institute and has founded the University Vivarium in Center for Life Sciences and Technologies Research. He worked as a Teaching Assistant for Biocontrol Systems and Bioinstrumentation Laboratory. He recorded from tactile nerve fibers of cats with Institute for Sensory Research (ISR), Syracuse, New York. In 1999-2000, he attended the University of Michigan in Ann Arbor and studied sensory systems of insects at Advanced Technology Laboratories, and of guinea pigs at Kresge Hearing Research Institute using multi-electrodes. Then, he returned to ISR and worked on mathematical modeling of the sense of touch. He performed psychophysical experiments on human subjects and tested computational models. His research interests include the transformation of tactile information from the periphery to the cortex, and it involves spike recordings from rat cortical neurons in the hindlimb area. He has recently completed a project to develop cortical neuroprostheses for tactile feedback, and is associated with an EU consortium on graphene electrodes for novel neural interfaces.