Harnessing Tactile Waves to Measure Skin-to-Skin Interactions

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Abstract

Skin-to-skin touch is an essential form of tactile interaction, yet, there is no known method to quantify how we touch our own skin or someone else's skin. Skinato-skin touch is particularly challenging to measure objectively since interposing an instrumented sheet, no matter how thin and flexible, between the interacting skins is not an option. To fill this gap, we explored a technique that takes advantage of the propagation of vibrations from the locus of touch to pick up a signal that contains information about skin-to-skin tactile interactions. These "tactile waves" were measured by an accelerometer sensor placed on the touching finger. Applied pressure and speed had a direct influence on measured signal power when the target of touch was the self or another person. The measurements were insensitive to changes in the location of the sensor relative to the target. Our study suggests that this method has potential for probing behaviour during skin-to-skin tactile interactions and could be a valuable technique to study social touch, self-touch, and motor-control. The method is non-invasive, easy to commission, inexpensive, and robust.

Keywords: Tactile interaction \cdot Skin-to-skin touch \cdot Self touch \cdot Social touch

Introduction

Skin-to-skin touch has broad implications for the sense of self (Merleau-Ponty, 1962; Crucianelli et al., 2013), body representation (Schütz-Bosbach and Haggard, 2009; van Stralen et al., 2014), affective touch (McGlone et al., 2014; Cascio et al., 2019) and motor control (Blakemore et al., 2000; Bays, 2008). It is thus connected to intriguing problems across the domains of philosophy, psychology, and neuroscience. However, to date, no empirical method is capable of measuring how we touch the skin of a living person. Even a seemingly straightforward parameter such as the pressure applied during skin-to-skin touch is outside the reach of objective measurement.

When touching surfaces other than the skin, the net force applied can be directly measured by instrumenting the touched surfaces with load sensors interposed between the surface and a mechanical reference. For example, in grasping studies, hand-held objects are typically instrumented with load cells connecting grip surfaces to the object (*e.g.* Johansson and Westling, 1984). Such arrangements project the total interaction of the finger onto the tangential and normal directions of the touched surface. Motor behaviour can be inferred from this decomposition. Extensions of this technique using broadband sensors revealed the complexity of the fingers' mechanical interactions with surfaces (Wiertlewski et al., 2011; Klöcker et al., 2013; Gueorguiev et al., 2016).

When the touched surface is skin, it is not possible to measure the interaction by interposing an instrumented membrane between the skins since the properties of the skin contribute to the interaction (Morrison, Löken and Olausson, 2010; Adams et al., 2013). As far as motor behaviour is concerned, electromyography (EMG), or acoustic myography (AMG) are invaluable techniques to investigate muscle activation (Goldenberg et al., 1991; Hodges, 2019). These techniques, however, cannot provide a precise measure of the activity of an individual at the level of the fingers, even in constrained conditions highly and with sophisticated analysis techniques (Waris et al., 2018).

Here, a novel technique is introduced which is sensitive to the effects of skin-to-skin touch and which provides a signal containing information about the behaviour of the 'toucher' and the

nature of the interaction. It is adapted from previous work highlighting the propagation of mechanical energy in soft tissues far from a region of contact. The effect of digital tactile interactions can be measured in the fingertip (Bensmaïa and Hollins, 2003; Tanaka et al. 2011), the finger (Gu et al., 2019; Shi et al., 2020; Tanaka et al., 2012; Manfredi et al., 2012), the whole hand (Shao et al., 2016, 2020), at least as far as in the forearm (Delhaye et al., 2012, Laput, Xiao, Harrison and Viband, 2016). These long-range effects are likely to result from the propagation of elastic S-waves (Vexler et al., 1999) and surface Rayleigh waves (Kirkpatrick et al., 2004) in soft tissues, with a relatively low rate of attenuation over distance. These studies have used a combination of techniques, including accelerometers and optical vibrometers. So far, tactile interactions with objects and rigid surfaces have been well documented. However, no study to date has investigated a practical manner to measure skinto-skin tactile interactions.

It is known that almost all mechanical sliding contacts undergo fluctuations for any speed (Akay, 2002). The fingers are no exception. When they slide on almost any surface, including skin, contact fluctuations arise from phenomena that take place at multiple length and time scales. These phenomena vary in relative importance in accordance with the material properties of the solids in contact and the relative topographies (roughness, corrugation, conformability) at molecular, mesoscopic, and macroscopic scales (Baumberger and Caroli, 2006). The friction associated with skin-to-skin touch is the result of the skin's complex material properties and intricate topography at all length scales. In fact, the sounds produced by the sliding of glabrous skin against glabrous skin (the ridged skin corresponding to the prehensile regions of the hand) are sufficiently strong to be heard and to modify perceptual behaviour (Jousmäki and Hari, 1998). These fluctuations are usually called frictional noise. For the present purpose they represent frictional signal. The role of frictioninduced fluctuations has been well documented in the rodent vibrissal system (Hipp et al., 2006; Ritt et al., 2008; Schwarz, 2016).

The intensity and spectral properties of the frictional fluctuations of skin sliding against skin depend upon numerous factors, including the

gross shape of the regions in contact, the type of skin, the relative states of hydration, the presence of lubricants, and of solid contaminants. Our study aimed to investigate how these fluctuations were linked to how we touch skin, including pressure applied and speed. To do so, a consumer-grade accelerometer chip was attached to a single location of the touching finger to measure cutaneous vibrations remotely from the region of contact, see Fig. 1. The captured signal was compared across conditions that varied the participants' instructed movements.



Fig. 1 Capture of tactile waves. Signals propagated from the fingertip during tactile interaction were picked-up by consumer-grade accelerometer placed on the proximal phalange of the right index finger. **a**: Schematic representation of the action performed in Experiments 1 and 3 and an example of the signal obtained showing the analysis window. **b**: Schematic representation of the experimental set up. The signal was acquired using a USB audio converter after 20 dB amplification ('signal conditioning').

In Experiments 1 and 2, participants were instructed to vary the pressure applied during touch (gentle or firm), or their sliding speed (fast, medium, or slow), respectively. If the signal was sensitive to these behavioural features of skin-toskin touch, then differences in signal should be observed between these conditions (e.g. higher

signal power for firm and fast compared to gentle and slow touch, respectively). In Experiment 3, the target orientation was varied such that the dorsal or ventral surface of the touched finger (i.e. the target) was facing the participant inverting the relationship of the touching fingers with the dorsal or ventral surfaces of the target. If sensor placement was critical, then the signal should depend on target orientation.

Skin-to-skin touch can be broadly divided into actions that serve to touch one's own skin or another person's skin, with key differences between these two types of touch (Verrillo et al., 2003; Ackerley et al., 2012). It is possible that the signal obtained during skin-to-skin touch depended on the target of the touch (e.g., Schütz-Bosbach and Haggard, 2009). In all three experiments, the target was varied to be either the participant's own skin, or another person's skin in order to ascertain that the method could be applied to both types of touch.

Experiment 1

The first experiment investigated whether the friction-induced vibration signal was sensitive to differences in the pressure applied by the toucher during skin-to-skin tactile interaction. Pairs of participants touched either their own or someone else's index finger, gently or firmly.

Methods

Participants. Eighteen healthy right-handed participants were recruited (ten females, mean age: 22.8 years, SD = 3.4). Participants were invited to take part in the experiment in dyads but did not know each other. Half of the dyads were gender matched. In this and in all the experiments reported here, participants were naive to the purpose of the experiment. Participants provided informed consent in accordance with the ethical standards outlined by the Declaration of Helsinki (1991). All experiments received approval from the university's ethical committee. Each experiment took approximately 30 minutes to complete and the participants received payment for their participation.

Material. The sensor, shown in Fig. 1, was a surface-mounted MEMS accelerometer (Analog Device, model ADXL-320, equiv. ADXL-325, \pm 5 G) on a 12 x 12 mm printed-circuit-board, which also bore decoupling and bandwidth-setting (to

surface-mounted 500 Hz) capacitors. The assembly was encapsulated in epoxy resin for protection against humidity. The total mass of the sensor was 0.5 g. The X and Y outputs were tied together to provide a single signal. The sensor was fixed on the finger such that one of the two axes aligned with the medial axis of the finger. This strategy was justified by the propagation of surface waves in human fingers that guarantee the presence of an axial component (Andrew et al., 2020). The signal was amplified by 20 dB with a custom-made pre-amplifier to enhance signal-tonoise ratio and was acquired using a highresolution USB audio converter (Griffin iMic USB Audio Interface). Recordings were stored as standard 16-bit audio files post-processed in Matlab to be band-passed in the range 35 to 300 Hz. Mains hum at 50 Hz was suppressed by grounding participants to the analog neutral (RS PRO Grounding Wrist Strap & Cord).

Procedure. Participants were seated opposite each other on each sides of a table approximately one meter apart. Using micropore tape, the experimenter fixed the accelerometer ventrally to the proximal phalanx of the right index finger of one of the two participants. The 'toucher' was then instructed to stroke her or his own left index finger ('self' condition) or the finger of the other participant ('other' condition). They used a precision grip posture such that the right index finger always touched the ventral glabrous region of the left index finger held upright, as illustrated in Fig. 2a. Participants always started the stroke from the fingertip of the target finger. One stroke consisted of one back and forth movement from the fingertip to the proximal phalanx and back.

Before starting the experiment, participants completed randomised practice trials of each condition. They tried to maintain a constant pace of about one stroke per second by following a metronome (sixty beats per minutes). During the experiment, a brief sound signal (80 Hz) cued the participants to start stroking until the signal was heard again after ten seconds. Before each trial, participants were told which target to touch, their own or the other participant's index finger, and how much to press, gently or firmly. They were free to determine what for them was gentle or firm. Each condition was randomly repeated ten times for a total of forty trials. The randomisation of the order of the touches, in all three

experiments, was intended to prevent an order effect from influencing the results. Between each block, participants interchanged their places and the accelerometer was fixed to the other participant's index finger.

Data analysis. Only the high frequency content of the acceleration signal was considered for analysis since the low-frequency content arises from whole limb movements and changes of orientation with respect to gravity (Morris, 1973), thus mostly holding kinematic information. The first second of each trial was excluded from the analyses to eliminate the effect of the burst of signal at the transition from a static contact to a sliding contact (see Fig. 1). To minimise transducer noise, the signal was band-pass filtered in the range 35-300 Hz which is within the textural information frequency range (Wiertlewski et al., 2010). A discrete time estimate of the average signal power was computed for each condition by assuming that the signal window was sufficiently long, a condition largely fulfilled by the audio rate sampling of 44.1 kHz. The estimates were calculated according to,

$$\hat{P}_{\text{cond}} = \frac{1}{M} \sum_{i=1}^{M} \left[\frac{1}{N} \sum_{k=1}^{N} |a_k|^2 \right]_i,$$

where M was the number of trials per condition and N the number of samples in the analysis window. A repeated-measure ANOVA on these averages was conducted to compare the four conditions. In addition to the analysis of signal power across the 35–300 Hz range, the power spectral density of the signal was estimated using Welch's method to probe differences in the spectral content profiles across conditions. The analysis was applied to the averaged power spectral density of the signal in 20 Hz bands (35– 55, 55–75, 75–95, 95–115, 115–135, 135–155, and 155-175 Hz). Any significant interaction was followed by post-hoc t -tests. All tests were Bonferroni-corrected for multiple comparisons.

Results

A main effect of applied pressure was observed $(F(1, 17) = 32.70, p < 0.001, \eta_p^2 = 0.658)$; with higher signal power obtained when the touch was firm rather than gentle, see Fig. 2b. Thus, the measure was sensitive to differences in applied pressure. No effect of the target nor interaction with the target were found (F(1,17) = 0.009,

p=0.924 , $\eta_p^2=0.001$, F(1,17)=0.150 , p=0.703, $\eta_p^2=0.009,$ respectively). It is to note that this difference was stable over time as shown in Fig. 2c.

The difference between a gentle touch and a firm touch could also be clearly observed by inspection of the averaged power spectra over all trials and participants, see Fig. 2d, while a difference of target was not. An analysis by 20 Hz frequency bands revealed a significant effect of applied pressure (F(1,17) = 22.616, p < 0.001, $\eta_p^2 =$ 0.571), bands (F(1.593,27.086) = 40.391, p <0.001, $\eta_p^2 = 0.704$), and a borderline interaction between bands and pressure (F(1.537, 26.134) =2.942, p = 0.082, $\eta_p^2 = 0.148$), but no main effect of target (F(1,17) = 0.044, p = .836) $\eta_p^2 = 0.003$), nor any interaction with target. Follow-up tests showed a significant effect of pressure for all bands above 95 Hz (all p < 0.001), as well as effects for the 35-55 Hz and 75-95 Hz bands (respectively: F(1, 17) = 9.301, p = 0.007, $\eta_p^2=0.354$ and F(1,17)=8.966 , p=0.008 , $\eta_p^2=0.345$), but there was no significant differences in the 55–75 Hz band F(1, 17) =1.130, p = 0.303, $\eta_p^2 = 0.062$).



Fig. 2 Experiment 1. a: Experimental design: The applied pressure could be 'firm' or 'gentle', target could be 'self' or 'other'; resulting in four conditions (colour coded). **b:** Total signal power of frictional fluctuations per target and pressure conditions. Black dots show individual results. Error bars show standard error of the mean (SEM). **c:** Evolution of the average signal power by block number. **d:** Averaged power

spectral density (PSD) over all trials and participants for each condition.

Experiment 2

The second experiment was designed to determine whether skin-to-skin, friction-induced vibrations were sensitive to differences in the magnitude of the sliding speed. Because the forearm is smoother, more uniform, and also longer than the finger, it offered a better option for the control of movement speed. Thus a simple stroking action of the forearm was used instead of the grasping action used in Experiments 1 and 3. In order to better control the speed at which participants touched the skin surface, as well as the distance travelled, participants were instructed to stroke between two fixed points of equal length marked on the ventral surface of the forearm.

Methods

Participants. A new group of eighteen healthy right-handed individuals completed this experiment (ten females, mean age: 23.21 years, SD = 2.55). Half of the dyads were gender matched, and gender was balanced when unmatched: half of the participants were tested by a female experimenter and the other half by a male experimenter.

Procedure. Participants were seated to the right experimenter of the who placed the accelerometer on the participant's right index finger, as in Experiment 1. With a pen, the experimenter marked three spots on the ventral region of the participant's left forearm, each separated by nine centimetres (creating two sites of stimulation, site 1 and site 2; see Fig. 3a). These marks were identical to those made beforehand on the experimenter's right forearm. Participants stroked with their right index finger the skin of their own forearm or that of the experimenter; alternating between site 1 and site 2, to avoid habituation. It is to note that no skin difference was expected between sites 1 and 2, so data from these two sites was averaged in the analysis. Moreover, the forearm to be touched was always positioned on the same spot, to avoid any possible configuration difference between self- vs. other-touch. One stroke consisted of one back and forth movement between two marks. The participants synchronised their movements to a metronome set to induce three different velocities. With a 0.33 Hz beat, the average speed was low, 3.0 cm/s. At 1.0 Hz the average speed was medium, 9.0 cm/s. At 2.0 Hz, the average speed was fast, 18.0 cm/s. Each trial lasted nine seconds and each condition was repeated ten times in a randomised order, for a total of sixty trials. Participants practiced each condition for a total of six trials before data were recorded.

Results

Overall, a main effect of speed was observed (F(1.457, 24.768) = 6.350 , p = 0.011 , $\eta_p^2 =$ 0.272) with more signal power at the highest speed, a main effect of target (F(1, 18) = 12.489), p=0.003, $\eta_p^2=0.424)$, with more signal power when touching another person rather than the self. but no significant interaction (F(1.352,22.980) = 2.910 , p = 0.091 , $\eta_p^2 =$ 0.146; Fig. 3b). Differences between slow and medium speeds and between medium and fast speeds were found (t(18) = 3.042, p = 0.007;t(18) = -4.772, p < 0.001, respectively). The effect of target obtained here was likely due to an experimenter bias since additional analysis revealed an interaction between experimenter and target difference (F(1, 16) = 11.757, p =0.003, $\eta_p^2 = 0.424$) as well as a marginal main effect of target (F(1,16) = 3.583, p = 0.077) $\eta_p^2 = 0.183$); with higher power associated with one of the two experimenters (see Supplementary Fig. S1).



Fig. 3 Experiment 2. a: Experimental design: Touching was performed at three different speeds ('slow', 'medium', 'fast'), in random order between site 1 and 2; The target could be either 'self' or 'other'; resulting in six conditions (colour coded). b: Total signal power of frictional fluctuations per target and speed condition.

Black dots show individual results. Error bars show standard error of the mean (SEM). c: Averaged power spectral density (PSD) across all trials and participants over all targets and speeds.

A frequency band analysis indicated a main effect of bands (F(1.846,31.389) = 12.606, p < 0.001, $\eta_p^2 = 0.426$), a main effect of target (F(1,17) = 9.202, p = 0.007, $\eta_p^2 = 0.351$), a main effect of speed (F(1.407, 23.913) = 5.566, p = 0.018) $\eta_p^2 = 0.247$), an interaction between target and bands (F(2.082, 35.394) = 6.176, p = 0.005, $\eta_p^2 = 0.266$), an interaction between speed and bands (F(2.411, 40.992) = 4.232, p = 0.016) $\eta_p^2 = 0.199$) but no interaction between target and speed and no three-way interaction with bands (F(1.972, 33.521) = 1.690, p = 0.200) η_{p}^{2} =0.090, see Fig. 3c). The self-other difference was seen in the bands between 55 Hz and 155 Hz (55–75 Hz: F(1,17) = 11.197, p = 0.004, $\eta_p^2 =$ 0.397; 75–95 Hz: F(1,17) = 11.993, p = 0.003, $\eta_p^2 = 0.414$; 95-115 Hz: F(1,17) = 10.635, p =0.005, $\eta_p^2 = 0.385$). However, the effect of speed and the interaction between speed and target did not survive Bonferroni correction ($\alpha = 0.0074$) in any of the bands.

Experiment 3

Experiment 3 investigated whether the signal varied with the orientation of the target hand since the location of the sensor relative to target may have influenced the signal.

Methods

Participants. A new group of eighteen righthanded participants completed the experiment (nine females, mean age: 23.6 years, SD = 3.6). Participants were invited to take part in the experiment in dyads, but they did not know each other. As in Experiments 1 and 2 gender was balanced across dyads.

Procedure. As in Experiment 1, participants were seated opposite each other on either side of a table approximately one meter apart. The accelerometer was placed on the right index finger of one participant of the dyad, who would be the participant performing the touch. The accelerometer was fixed in the same position as in Experiments 1 and 2, thus distance between the sensor and the regions of contact varied with target orientation. Participants performed the same action as in Experiment 1 (precision grip),

with the sole difference being the orientation of the touched index finger (i.e. target orientation; see Fig 4a). In the 'outwards' condition, the palm of the target hand faced away the toucher (i.e. the active index of the toucher was in contact with the glabrous skin on the ventral side of the target finger, and the thumb with the hairy skin on the dorsal side). In the 'inwards' condition, the palm of the target hand faced towards the toucher (i.e. the reversed configuration). As in Experiment 1 and 2, the 'toucher' was instructed to stroke their own left index finger ('self' condition) or the finger of the other participant ('other' condition). No instruction was given concerning the pressure to be applied. Participants were encouraged to keep a constant speed by the same method as in Experiment 1. Each condition was repeated ten times for a total of forty randomised trials. After those trials, the two participants interchanged places and the accelerometer was attached to the new toucher.



Fig.4 Experiment 3. a: Experimental design: Target orientation could be 'outwards' or 'inwards', target could be either 'self' or 'other'; resulting in four conditions (colour coded). **b:** Total signal power of frictional fluctuations per target and target orientation; Black dots show individual results. Error bars show standard error of the mean (SEM). **c:** Averaged power spectral density across all trials for each condition.

Results

The results showed no effect of target and no effect of target orientation (target: F(1, 17) = 1.724, p = 0.207, $\eta_p^2 = 0.092$; target orientation: F(1,17) = 0.002, p = 0.969, $\eta_p^2 = 0.000$), but they showed an interaction between target and skin type (F(1,17) = 6.393, p = 0.022, $\eta_p^2 = 0.002$

0.273), see Fig. 4b. However, none of the posthoc t-test survived Bonferroni correction, suggesting no significant impact of the orientation of the target.

An analysis by frequency bands, Fig. 4c, revealed a main effect of bands (F(1.513, 25.725) = 27.472, p < 0.001, $\eta p2 = 0.618$), an interaction between target and skin type (F(1, 17) = 5.239, p = 0.035, $\eta p2 = 0.236$), and a three-way interaction with bands (F(1.815, 30.860) = 5.221, p = 0.013, $\eta_p^2 = 0.235$). Follow-up analyses did not yield to any significant results (no main effect of target, skin nor interaction survived the Bonferroni correction).

Discussion

Skin-to-skin touch is challenging to measure objectively, yet it presents a number of intriguing problems that span neuroscience, psychology and philosophy. Here, we tested the efficacy of a measure of skin-to-skin tactile behaviour that took advantage of the frictional fluctuations propagating in soft tissues (Shao et al., 2016, 2020). Frictional fluctuations in soft tissues such as the skin have been successfully measured during tactile interactions with objects and rigid surfaces (Gu et al., 2019; Manfredi et al., 2012; Shao et al., 2016, 2020; Tanaka et al. 2011), however such methods have not been applied to skin-to-skin touch. Participants were instructed to stroke skin surfaces while an accelerometer was fixed to their touching finger. The recorded signal contained information about the vibrations elicited during touch. Participants varied the strength of their touch, their movement speed, the orientation of the target, as well as the target identity (self-touch vs. touching another's skin).

The analysis relied on the total signal power and the distribution of this power in specific frequency bands. The signal exhibited considerable variability between individuals, however this limitation is shared by most other physiological signal measurements including pupil dilation, e.g. (Einhäuser et al., 2008; Wierda et al., 2012), skin conductance, e.g. (Tronstad et al., 2010; van Dooren et al., 2012), electromyography, e.g. (Goldenberg et al., 1991), respiration, e.g. (Boiten et al., 1994; Valderas et al., 2015) and heart-rate, e.g. (Appelhans and Luecken, 2006; Garfinkel et al., 2015). Despite high inter-individual variability, useful information could be extracted from the

signal, allowing comparisons across experimental conditions.

Experiment 1 showed a clear effect of touch strength when participants were instructed to apply either gentle or firm pressure. The signal power was significantly higher during firm compared to gentle touch. This demonstrates that a consumer-grade accelerometer is able to capture tactile signals and can be used as a proxy of the force applied during skin-to-skin touch. Therefore, the method is able to detect differences in the pressure applied during skin-toskin touch.

Experiment 2 showed that the signal was sensitive to the speed with which participants touched the skin. The relationship between sliding speed and signal power was however complex. The medium speed (9 cm/s) elicited significantly lower signal power than the faster speed (18 cm/s) and the slower speed (3 cm/s). There may be several reasons why the relationship between movement speed and signal power was not monotonic. Participants probably moved less smoothly at slower speeds (Guigon et al., 2019). Jerky movements may have caused bursts of signal at the slowest speed. The observation of greater signal power at the highest speed (18 cm/s) is in line with our initial hypothesis since greater frictional energy was dissipated during the same time window. However, future research should investigate a wider range of movement speeds.

The positioning of a single sensor relative to the source of contact may have had an effect on the signal obtained, particularly with differences across experimental conditions. Experiment 3 assessed the influence of target orientation on the signal obtained during skin-to-skin touch. In Experiment 1, participants gripped the finger when it was oriented with the dorsal surface facing towards them. In Experiment 3, the target orientation was manipulated to either be the same, as in Experiments 1, or oriented with the ventral surface facing toward the toucher. The signal power did not vary systematically with target orientation, suggesting that a similar signal would have been obtained from a sensor placed on the active thumb rather than active index finger. In practice, this means that experimenters are not constrained by specific placements of the sensor on the active hand.

Several lines of evidence suggest that we may touch ourselves differently from others, this is the case, for example in the "touchant-touché" phenomenon (Merleau-Ponty, 1962; Husserl, 1989; Schütz-Bosbach and Haggard, 2009). The literature also suggests that self-touch is perceived to be less intense as compared to touch from another person or surface (Blakemore et al., 2000; Shergill et al., 2003; Bays, 2008, Kilteni & Ehrsson, 2017). This effect is attributed to motor control mechanisms that predict the sensory consequences of one's own actions using information from the motor command (i.e. efference copy). Self-generated somatosensory signals are therefore thought to be perceptually cancelled or reduced relative to externally generated somatosensory signals. Thus, to compensate for the perceived differences in the intensity of touch, participants may exert more pressure when touching themselves compared to person. In Experiments 1 another and 3, participants touched themselves or another person in dyads. The target had no influence on signal power. In Experiment 2, one of two experimenters was the 'other' target. Stronger signal power was found when participants touched another person. Further analyses revealed that the signal was higher with one of the two experimenters. Overall, our results did not show clear differences between touching one's own skin compared to another person's skin. This finding may seem surprising given the known differences between touch applied to one's own compared to another person's skin (Verrillo et al., 2003; Ackerley et al., 2012). However, the lack of difference may reveal the existence of a robust motor invariant that is insensitive to the target of touch, particularly under the conditions of Experiment 1. Several motor invariants related to net force applied by the fingers have been documented (Feldman, 1980; Latash et al. 2007). In Experiment 2, having only two 'other' targets may have reduced variability and introduced additional factors such as skin hydration and also possible gender effects (that were balanced in Experiment 1 and 3, as shown in Supplementary Fig. S1). This result suggests that our method could be applied to differentiate between targets. Future studies could investigate this result further and use this method to assess whether we touch ourselves differently after touching someone else, and vice-versa. Moreover, one way to quantify the

subjective force that participants apply to themselves vs. another person could be to use a force sensor and ask them to estimate how much pressure they used on themselves vs. another person. Whether or not subjective estimates of force map directly to their behaviour when actually interacting with skin surfaces is an intriguing question for future research. These future studies could also investigate the relative advantages of different stroking actions to extract specific types of information from the vibration signal.

The experiments reported here build upon previous research that investigated frictional fluctuations across the skin during tactile interactions with objects and rigid surfaces (Gu et al., 2019; Manfredi et al., 2012; Shao et al., 2016, 2020; Tanaka et al. 2011). Previous studies have shown that information about objects (Shao et al., 2016, 2020) and rigid surfaces (Gu et al., 2019; Tanaka et al., 2011) that are touched can be extracted from signals measured on the skin that reflect surface waves. Here, we show that this method can also be applied to skin-to-skin touch, which provides further avenues of promising research in the behavioural sciences.

Our results were obtained using spectral density analyses, including total signal power and power spectral density in broad frequency bands. However, in natural touch, cutaneous vibrations are almost always non-stationary signals, which means that the generating processes varies over time. In our study, power spectral density analyses were adequate for the investigated factors because the participants were instructed to repeat the same action over relatively long periods of time. Future research based on the analysis of time-varying phenomena could certainly be possible, for example, with short-time Fourier analysis.

Future research may also be aimed at estimating the source of touch, the type of action executed, or even the type of skin touched, from vibration signals measured in the hands. Aiming for example to differentiate between hairy and glabrous skin, which is additionally relevant to the nascent field of affective touch; or which body site has been touched would be a fruitful line of research. Blind source separation analysis techniques (Comon and Jutten, 2010) could be

used since the frictional fluctuations come from sources arising from phenomena associated to different length scales. Another direction would be to increase the number of accelerometer sensors across the hand as in Shao et al. (2016, 2020) who used up to forty-two sensors. Finally, an abundance of tools based on machine learning techniques are now available that are able to extract information from complex signals. Such methods could be used to decode behavioural interactions from the resulting tactile vibrations.

To conclude, the results demonstrated the direct measurement of cutaneous vibrations resulting from friction elicited by skin-to-skin contact. We showed that the signal is primarily sensitive to the pressure applied and the speed of tactile interactions. The use of one or several accelerometers, in combination with other neuroscientific tools such as fMRI, MEG and EEG, (e. g. Manini et al. 2013), has significant potential for probing behaviour during skin-to-skin tactile interactions, opening avenues for future research investigating a variety of factors underlying selftouch as well as social touch and motor control.

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Open practice statement. The data for all experiments as well as the script to filter and analyse the data are available on the OSF repository and can be accessed via this link: <u>https://osf.io/7gw5z/?view_only=7d351d4a7b6a4</u> 43392157da6bb643a90

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Supplementary Information

Half of the participants in Experiment 2 were tested with a male experimenter as target and the other half with a female experimenter. Higher signal power was observed when the participants touched the male experimenter compared to the female experimenter. Gender did not influence how they touched their own forearm.



Fig. S1 Experimenter effect in Experiment 2.