

Article

Localization of Sliding Movements Using Soft Tactile Sensing Systems with Three-axis Accelerometers

Hiep Xuan Trinh 1,* [,](https://orcid.org/0000-0002-5463-8806) Yuki Iwamoto ¹ , Van Anh Ho [2](https://orcid.org/0000-0002-4519-0448) and Koji Shibuya [1](https://orcid.org/0000-0002-4542-1779)

- ¹ Department of Mechanical and Systems Engineering, Faculty of Science and Technology, Ryukoku University, 1-5 Yokotani, Seta Oe-cho, Otsu, Shiga 520-2194, Japan; t18m026@mail.ryukoku.ac.jp (Y.I.); koji@rins.ryukoku.ac.jp (K.S.)
- ² School of Material Science, Japan Advanced Institute of Science and Technology (JAIST), 1-1 Asahidai, Nomi, Ishikawa 923-1292, Japan; van-ho@jaist.ac.jp
- ***** Correspondence: t17d501@mail.ryukoku.ac.jp; Tel.: +81-77-543-7444

Received: 5 April 2019; Accepted: 29 April 2019; Published: 30 April 2019

Abstract: This paper presents a soft tactile sensor system for the localization of sliding movements on a large contact surface using an accelerometer. The system consists of a silicone rubber base with a chamber covered by a thin silicone skin in which a three-axis accelerometer is embedded. By pressurizing the chamber, the skin inflates, changing its sensitivity to the sliding movement on the skin's surface. Based on the output responses of the accelerometer, the sensor system localizes the sliding motion. First, we present the idea, design, fabrication process, and the operation principle of our proposed sensor. Next, we created a numerical simulation model to investigate the dynamic changes of the accelerometer's posture under sliding actions. Finally, experiments were conducted with various sliding conditions. By confirming the numerical simulation, dynamic analysis, and experimental results, we determined that the sensor system can detect the sliding movements, including the sliding directions, velocity, and localization of an object. We also point out the role of pressurization in the sensing system's sensitivity under sliding movements, implying the ideal pressurization for it. We also discuss its limitations and applicability. This paper reflects our developed research in intelligent integration and soft morphological computation for soft tactile sensing systems.

Keywords: soft tactile sensing system; localization and object detecting; three-axis accelerometer

1. Introduction

Tactile sensors, according to [\[1\]](#page-18-0), are defined as devices that can detect and measure a contact's properties in a predetermined area and subsequently pre-processes the signals with the sensing elements before sending them to higher levels of perceptual interpretation. Human tactile sensing generally serves as a reference point in robotics. Human sensory psychophysics can be described by four main attributes: location, modality, intensity, and timing [\[2\]](#page-18-1). Many researchers focus on artificial tactile sensors that mimic these capabilities for applications in robotics [\[3–](#page-18-2)[5\]](#page-18-3). In terms of localization and object detection, research is currently focusing on designing and fabricating artificial tactile sensor arrays that can cover large surfaces to obtain rich contact information. For instance, Damian et al. [\[6\]](#page-18-4) presented an artificial ridged skin for detecting the position and speed of a sliding object using force sensors that were embedded in nonuniform arranged-parallel ridges. Another work [\[7\]](#page-18-5) proposed a real-time sensor fusion algorithm for estimation object position, translation, and rotation during grasping by pressure array sensing. Although these tactile sensor arrays can detect an object's localization on a large contact surface with improved accuracy and spatial resolution, they require many sensing elements, complicating integration and manufacturing.

In addition, due to the complexity of the output data, tactile sensing array normally needs a computational program with complicated algorithms for data processing [\[8\]](#page-18-6).

Recent research in morphological computation and embodied intelligence is introduced as a method to reduce the complexity of entire robotics systems by creating different sensing and actuating functions [\[9,](#page-18-7)[10\]](#page-19-0). Soft robotics is an example that utilizes embodiment to facilitate control and perception [\[11\]](#page-19-1). One crucial element of soft robotics research is soft tactile sensors, which are normally implemented by embedding sensing elements in a soft body [\[12\]](#page-19-2). The sensing elements can be such conventional sensors as strain gauges [\[13\]](#page-19-3), magnets and Hall sensors [\[14\]](#page-19-4), or pressure sensors [\[15\]](#page-19-5), which transduce physical interaction into electrical output signals through the soft body's deformation. By exploiting the soft, elastic properties of soft material, soft tactile sensors suggest the potential of using the characteristics of a biological body to reduce complexity [\[16\]](#page-19-6). Based on the idea of morphological computation to obtain rich sensory information for soft tactile sensors, we previously proposed Wrin'Tac, a soft active tactile sensor system that can change its sensitivity for different sensing tasks using a strain gauge as its only sensing element [\[17](#page-19-7)[,18\]](#page-19-8). Although Wrin'Tac can successfully change its sensitivity and the sense sliding movements on its surface, it cannot localize them because the strain gauge's output is only one dimensional, which means that we cannot detect the position of a sliding movement if the sensor provides identical output for different movements. Inspired by how a spider detects its prey, we present in this paper a tactile sensing system that is sensitive to different sliding motions in large contact areas using just a three-axis accelerometer as a sensing element. This sensing system consists of a soft base with a chamber covered by a thin silicone skin in which a three-axis accelerometer is embedded. We integrated pneumatic actuation to generate a large inflated skin's surface that easily transforms the deformation at the contact's position to the accelerometer's position. Under a sliding motion, the accelerometer's posture changes continuously, depending on the contact's location, resulting in a variation of an accelerometer's output voltages. Thus, our sensing system can detect and localize sliding motions with different directions. Several studies have utilized accelerometers for fabrication of tactile sensors [\[19](#page-19-9)[–21\]](#page-19-10). A previous work [\[19\]](#page-19-9) used a miniature accelerometer that was attached to a human finger to measure the acceleration at the radial skin to estimate the surface undulation. It was attached to several pneumatic grippers to classify the hardness of different cylinders, to estimate the pneumatic pressure, and to assess the firmness of eggplants and mangoes [\[20\]](#page-19-11). The authors of [\[21\]](#page-19-10) proposed a bio-mimetic fingertip on which they embedded three commercial accelerometers and force sensors to detect force and vibration modalities. Most accelerometer applications in tactile sensors focus on estimating physical quantities such as hardness and firmness and using measured vibrations for surface identification. In terms of detecting and localization sliding movements, there is a lack of interest in accelerometer applications in tactile sensing systems.

In this paper, to clarify this sensing system's ability, we constructed a numerical analysis model by 3D simulation and conducted experimental validations with dynamic analyses in different sliding actions. Our proposed sensing system has the following advances: easy fabrication, low cost, and simple integration to soft robotics. Our research is using intelligent embodiment to reduce the complexity of soft tactile sensor systems. The following are the main contributions of this paper:

- (1) We integrated our proposed idea, design, and fabrication of a soft tactile sensing system a pneumatic actuator and a three-axis accelerometer as a sensing element for detecting and localization sliding movements in a large contact area.
- (2) We clarified the operation principle of our sensing system and conducted a numerical simulation to study the dynamic responses of the sensing elements under a sliding motion with morphological changes.
- (3) We proposed dynamic analyses and interpolated functions based on experiment results to verify the sensing system's ability.
- (4) We elaborated the role of pressurization on the response of the sensing system under sliding movements.

2. Materials and Methods 2. Materials and Methods

2.1. Idea 2.1. Idea

Nature provides many examples of amazing touch organs with tactile sensing that have inspired Nature provides many examples of amazing touch organs with tactile sensing that have inspired robotic applications [\[22](#page-19-12)[–24\]](#page-19-13). Our study was inspired by the prey detection of spiders, which lurk at the bottom of their webs. Although spiders do not have great eyesight, and they usually use the the bottom of their webs. Although spiders do not have great eyesight, and they usually use the vibrations of the web strands to locate their prey. Spiders interpret vibrations with organs on their vibrations of the web strands to locate their prey. Spiders interpret vibrations with organs on their legs called slit sensillae, which are small, hypersensitive grooves that deform with even the slightest legs called slit sensillae, which are small, hypersensitive grooves that deform with even the slightest disturbance [\[25,](#page-19-14)[26\]](#page-19-15). disturbance [25,26].

Based on the notion of prey detection by spiders, we propose an active tactile sensing system for Based on the notion of prey detection by spiders, we propose an active tactile sensing system for detecting and localizing sliding objects on large contact areas. Our tactile sensing system integrates a detecting and localizing sliding objects on large contact areas. Our tactile sensing system integrates a sensing element that is embedded in soft skin and actuation that can generate a curved skin's surface on a sensing system to resemble the role of spider's web (Figure [1b](#page-2-0)). We deploy a three-axis accelerometer as the sensing element and pressurized air as the actuation. Under pressurization, a curved surface was generated, and when an object contacts and slides on it, the deformation at the contact's position is conveyed to the accelerometer's location that provides information about the acceleration of the three axes (*x*, *y* and *z* axes). This information is sufficient for detecting the sliding directions and localizing the sliding movement. In our sensing system, the inflated skin's surface spreads the deformation, which mimics the role of a spider's web in a vibration's transmission. Figure [1](#page-2-0) shows schematic which mimics the role of a spider's web in a vibration's transmission. Figure 1 shows schematic drawings of our soft tactile sensing system.

Figure 1. Schematic drawing of soft tactile sensing system: One soft skin layer with embedded accelerometer covers another soft base. In this base, a chamber is cut from its surface and has a hose for input compressed air. Under pressurization inside it, soft skin is inflated, changing the accelerometer's posture. When object slides on inflated soft skin, accelerometer is sensitive to deformation at contact positions. (a) Initial state: without pressurization, soft skin is flat. (b) With pressurization, soft skin is inflated, making sensitivity of soft tactile system to sliding action on its surface.

In this paper, we focus on the localization of sliding movements in two X- and Y- directions with different distances from a sliding line to the accelerometer (Figure [1b](#page-2-0)). For simplicity, we suppose that first a sliding object slightly contacts the soft skin (outside the inflated area) and then slides over the inflated area at a constant velocity without changing the initial contact depth. The localization of the sliding object can be characterized by the sliding directions and its position coordinate (x,y) . For the X-sliding case, *y* is the distance from the sliding line to the accelerometer and $x = vt$ whereas for the Y-sliding case, *x* is the distance from the sliding line to the accelerometer and $y = vt$. Here *v* is the magnitude of sliding velocity. Thus, for localization, first we demonstrate that the sensing system can detect the sliding motion and its directions. Based on the accelerometer output, the sliding velocity's magnitudes and the distances from the sliding line to the accelerometer are estimated. Then the sliding object can be localized.

2.2. Design and Fabrication

Our tactile sensor system has two parts. The first is a soft, $64 \times 64 \times 20$ mm base with a $50 \times 50 \times$ 10 mm chamber is cut from its surface. The soft base was made from KE-1603 (Shin-Etsu, Tokyo, Japan) silicone rubber from Shin-Etsu Silicone [\[27\]](#page-19-16) and fabricated with a 3D printing mold. Then the silicone rubber in a liquid state was poured into it and cured. The second part is soft, thin $60 \times 60 \times 4$ mm skin made from EcoFlex10 (Smooth-on, Macungie, PA, USA) that completely covers the chamber's base.

To fabricate the skin, we used a small chamber to install the accelerometer using a mold. After installing an accelerometer in the small chamber, silicone rubber in liquid state EcoFlex10 part A *Sensors* **2019**, *19*, 2036 5 of 20 was mixed with EcoFlex10 part B [\[28\]](#page-19-17) at a ratio of 1:1 with a mixer for three minutes, and then the mixed liquid was poured to entirely cover the skin's surface and cured at 70 °C for 40 min. The 3 × 5 × 1 mm accelerometer used in this paper is MMA7361L by Freescale Semiconductor (Austin, TX, USA) mounted on a $10 \times 10 \times 1.7$ mm circuit board [\[29\]](#page-19-18). Next the soft skin with an embedded accelerometer was attached to the soft base with adhesive glue that is specialized for silicone rubber attachment. In the final step, a 4-mm diameter tube was put and glued for directing the compressed air in the chamber. The design and a photograph of the tactile sensing system are shown in Figure [2.](#page-3-0) rubber in a limit statistical state was pour direct for stateching the compressed and in the channel

Figure 2. Dimension and photograph of fabricated tactile sensing system. **Figure 2.** Dimension and photograph of fabricated tactile sensing system.

2.3. Operation Principle

The sensing element used in this research is a MMA7361L, a surface-micromachined integrated-circuit accelerometer by a Freescale Semiconductor, which can provide three-axis acceleration information. The device consists of a surface-micromachined capacitive sensing cell and a signal conditioning ASIC contained in a single package. ASIC uses switched capacitor techniques to measure the capacitors and provide a high-level output voltage that is ratiometric and proportional to the acceleration [\[29\]](#page-19-18). $\frac{1}{2}$

In our research, we use the ability to calculate the static acceleration based on the posture of the accelerometer. When the object contacts the inflated soft skin surface, the contact area is deformed. *2.3. Operation Principle* is also deformed, changing the accelerometer's posture. When the accelerometer's posture changes, The sensing element used in this result is a MMA₇ μ matrix of the micromachined integrated integrated the projection of the gravitational acceleration on the Ox, Oy, Oz axis. Due to the soft properties of the skin material (Ecoflex10) the skin area at the sensing element's position its *xyz* axis coordinate also rotates (Figure [3a](#page-4-0),b). With each position of the accelerometer, its output is

 ϵ Freescale Semiconductor, which can provide the Semiconductor, which can provide the axis acceleration of ϵ Let θ be the tilt angle of each axis with horizontal axis ∆ (Figure [3c](#page-4-0),d) where the positive direction of θ is clockwise (the rotational direction toward gravitational acceleration *g*). That means according to the smallest angle to coincide with *x*, *y* or *z* axis, the value of θ is positive if the rotational direction of horizontal axis Δ is clockwise and if θ has a negative value in the contrast rotational case.

Figure [3](#page-4-0) shows that for each axis the acceleration is:

$$
a = g\sin\theta. \tag{1}
$$

For the Ox, Oy, Oz axis, output acceleration a_x , a_y , a_z can be calculated:

$$
a_x = g\sin\theta_x, \ a_y = g\sin\theta_y, \ a_z = g\sin\theta_z \,. \tag{2}
$$

Output voltage V_x , V_y , V_z of the accelerometer is:

$$
V_x = ka_x, V_y = ka_y, V_z = ka_z,
$$
\n(3)

where *k* is the calibration factor.

When the object slides on the sensor's surface, the accelerometer's posture changes continuously, depending on the contact position. Angles θ_x , θ_y , θ_z are functions of time. P_{t} are functions of the contact position. Angles σ_{t} , σ_{y} , σ_{z} are functions of the

Finally, we get: Finally, we get:

$$
V_x = ka_x = kgsin\theta_x(t) = V_x(t)
$$

\n
$$
V_y = ka_y = kgsin\theta_y(t) = V_y(t)
$$

\n
$$
V_z = ka_z = kgsin\theta_z(t) = V_z(t).
$$
\n(4)

The values of output voltages V_x , V_y , V_z depend on angles $\theta_x(t)$, $\theta_y(t)$, $\theta_z(t)$. Thus, output voltages V_x , V_y , V_z depend on the contact's position of the sliding object on the sensor's surface. Based on the values of V_x , V_y , V_z , the sensing system can detect and locate the sliding movements.

Figure 3. Schematic diagram shows change of accelerometer's posture, its coordinates, and calculation **Figure 3.** Schematic diagram shows change of accelerometer's posture, its coordinates, and calculation of acceleration on each axis based on gravitational acceleration and tilt angle. (**a**) Initial position of of acceleration on each axis based on gravitational acceleration and tilt angle. (**a**) Initial position of accelerometer and its coordinate Oxyz. (b) Coordinate Ox'y'z' when accelerometer's posture changes. (c) Acceleration on axis when tilt angle $\theta > 0$. (**d**) Acceleration on axis when tilt angle $\theta < 0$.

3. Numerical Simulation 3. Numerical Simulation

As mentioned in Sec[tion](#page-3-1) 2.3, when the object slides on the inflated skin's surface, the As mentioned in Section 2.3, when the object slides on the inflated skin's surface, the accelerometer's posture and its coordinates change, depending on the contact's localization. Therefore, to clarify the effect of the sliding action on the accelerometer's posture, first we exploited a finite element (FE) model with commercial software (Abaqus, Dassault Systemes, Johnston, IA, USA) to conduct a dynamic simulation.

Compared to the design of the soft tactile sensor system in Figure [1,](#page-2-0) we proposed a three-dimensional (3D) model (Figure [4\)](#page-5-0) that is comprised of four different parts: a soft base, a skin layer, an accelerometer inside the skin, and a hemi-spherical indenter. The sizes of the soft base, the width of the skin layer, and the accelerometer were identical to those mentioned in the sensor system's design. To reduce the computational cost, the thickness of the skin layer and the accelerometer were set smaller than their values in the design: 2-mm skin layer and 0.5-mm accelerometer in simulation compared to 4 mm and 1 mm in the design: 2-mm start any or that of man decelerometer in simulation computed to 1-mm and 1-mm.
in the sensing's design. The hemi-spherical indenter has a diameter of 6 mm. The values of the Young's compared to 4 mm and 1 mm and 1 mm in the sensing the sensing of the sensing of the hemi-spherical index of the hemimodulus of the soft base and the skin were set to 1.2 and 0.07 MPa. The indenter and the accelerometer are $\,$

expected to be rigid with a much larger Young's modulus (2000 MPa) than the skin and the base. The FE model is meshed with 47,656 linear hexahedral elements of type C3D8R. $\begin{bmatrix} 1 & 1 & 1 & 1 \\ 0 & 1 & 1 & 1 \end{bmatrix}$ $\begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 1 \end{bmatrix}$ $\begin{bmatrix} 0.0001/\sqrt{D} & 1 \\ 0 & 1 & 1 \end{bmatrix}$ pected to be rigid with a much larger Young's modulus (2000 MPa) than the skin and the base. The FE

 α , the β axis. Thus, the position of the β

in the simulation, we only consider the position, we only consider the position of two axes: O

the skin, then is forced to slide along X axis with forward and backward directions. (b) Indenter is displaced 0.5 mm toward the skin, then is forced to slide along Y axis with forward and backward directions. \mathcal{L} is displaced the skin, then is forced to slide along Y axis with forward and \mathcal{L} **Figure 4.** Dynamic simulation of soft active tactile sensing system. (**a**) Indenter is displaced 0.5 mm toward

Each simulation trial was conducted in four continuous steps: pressurization of the chamber, push (**a**) (**b**) in both the X- and Y-sliding directions (Figure [4\)](#page-5-0). Some simulation trials were also conducted with different pressurizations for comparison. Each bindiation that was conducted in our commuted steps. Pressurization of the chamber, pashindenter, forward and backward slides of the indenter. In the first step, the chamber is pressurized from 0 Pa to a particular value in 0.5 s. In the second step, the indenter is displaced 0.5 mm toward the skin for 0.25 s. The interaction between the indenter and the skin surface is modeled as normal the skin for 0.25 s. and tangential contact using the penalty formulation with a friction coefficient of 0.1. In the third step, the indenter is forced to slide horizontally right to left (forward direction) at a constant velocity of 200 mm/s in 0.25 s without changing the contact depth. In the last step, the indenter is slid back at the same velocity to its original position (backward direction). The third and last steps were conducted

In the simulation, the accelerometer was attached to local coordinate O_1 xyz, which is identical to the defined coordinate in the actual sensor system. In the O_1x , O_1y axes, nodes 1 and 2 were chosen to represent each axis ($O_1x \equiv O_1$ node 1, $O_1y \equiv O_1$ node 2) (notation \equiv indicates that they coincide). In our tactile sensing system, we used output voltages *Vx*, *V^y* for detecting the object's localization. Thus, in the simulation, we only consider the position of two axes: O_1x and O_1y .

As discussed in Section [2.3,](#page-3-1) the accelerometer output depends on the angle between O_1x , O_1y axes and horizontal axis. Thus, to investigate the position of the O₁x, O₁y axes when the accelerometer's posture changes under sliding motions, we extracted the displacements of two nodes: nodes 1 and 2.

In the xy coordinate (Figure [5\)](#page-5-1), angles θ_x , θ_y between O_1 x, O_1 y and horizontal axis ∆ depends on displacement *Dx*, *Dy* of nodes 1 and 2.

Figure 5. Relationship beween displacement of node 1 (Dy) , node 2 (Dx) with value of angle θ_x , θ_y . (a) Displacement of node 1 Dy represents position of axis O₁x and value of angle θ_x . $Dy > 0 \rightarrow \theta_x < 0$, $Dy < 0 \rightarrow \theta_x > 0$. (b) Displacement of node 2 Dx represents position of axis O₁y and value of angle θ_y . $Dx > 0 \rightarrow \theta_x < 0$, $Dx < 0 \rightarrow \theta_x > 0$.

For node 1, $\theta_x > 0$ if the displacement $Dy_{node1} > 0$ and $\theta_x < 0$ if $Dy_{node1} < 0$ (Figure [5a](#page-5-1)). For node 2, $\theta_y > 0$ if $Dx_{node2} > 0$, and $\theta_y < 0$ if $Dx_{node2} < 0$ (Figure [5b](#page-5-1)).

Thus, based on the change of displacement *Dy*, *Dx* of nodes 1 and 2, we can predict the dynamic output of our tactile sensing system.

The simulation results in Figure [4](#page-5-0) show that with pressurization, the skin layer was inflated, causing an inclination of the accelerometer's posture, which is possibly more sensitive to sliding motions. From the simulation results in Figure [6,](#page-6-0) when the chamber is pressurized, under the indenter's sliding traction, coordinate axis O_1x , O_1y of the accelerometer changes correspondingly. With the X-sliding action, displacement *Dy* (blue line) changes from positive to negative in the forward case and negative to positive in the backward case. The value of *Dx* (red line) is negative for all the times in both cases. With Y-sliding, the sign of *Dx* changes but *Dy* has a constant sign. That means with X-sliding, the sign of θ*^x* changes and θ_y has a constant sign, and with Y-sliding, the sign of θ_x is constant and θ_y has a changed sign.

Figure 6. Simulation results show displacements Dy , Dx under various pressurizations: (a) X-sliding and (**b**) Y-sliding. and (**b**) Y-sliding.

The simulation results imply that, by investigating the output acceleration of the accelemeter on the x, y axis, the tactile sensing system can detect the sliding action with forward and backward actions in both the X- sliding and Y- sliding cases.

To clarify the role of the inflated skin's morphology, we conducted simulations with various pressurizations (Figure 6), with higher pressure values, the Dx and Dy displ[ac](#page-6-0)ement increased, indicating that the sensitivity and output voltage of the sensing system was increased with higher pressurization.

all the times in both cases. With $\mathcal{L}_{\mathcal{A}}$ cases. With \mathcal{A} constant sign of \mathcal{A} constant sign. That a constant sign of \mathcal{A} constant sign. That a constant sign of \mathcal{A} ε s with ε supplies and ε changes and with ε and with ε and with ε **4. Experimental Setup**

We conducted experiments with our soft tactile system to assess the possibility of localizing sliding movements on the skin's surface. Figure 7 shows the experimental setup that consists of two linear stages (PG615-R05 AG-C, Suruga Seiki, Japan) and an indenter. The linear stages provide precise movements with 2-µm resolution. The indenter, which is a rigid spherical 6-mm-diameter ball, is attached vertically to the linear stage. The tactile sensor system was placed in a solid box fabricated by a 3D printer. The box was fixed and placed horizontally to the linear stage, which moves the sensing system back and forth. A laser sensor (Keyence-IL-030) measured the height of the inflated skin, and this value estimates the skin's deformation and the accelerometer's posture when the sensor system is not being probed.

Figure 7. Experimental setup: sensing system is set on horizontal linear stage. Indenter is fixed to vertical linear stage. Skin is inflated by air regulator. Laser sensor measures inflated skin's height. Data from accelerometer are obtained through data acquisition system before being sent to computer.

accelerometer. When the indenter moves toward the right relative to the sensor system, we call the direction forward and the opposite direction is backward. With both the X- and Y-sliding directions, there were six sliding cases (Figure [8a](#page-7-1)). We defined the two sliding directions as the X- and Y-axis directions along the x and y axes of the ere sh shall general paper of 0.5 mm

Figure 8. Schematic drawing illustrates sliding cases were conducted in experiments. (**a**) Definition of six sliding directions with both X, Y axes. (**b**) Sliding movements with various contact positions: different values of *y, x* for X, Y-sliding. different values of *y*, *x* for X, Y-sliding. **Figure 8.** Schematic drawing illustrates sliding cases were conducted in experiments. (**a**) Definition

 α and the signals from the signals from the signals from the accelerometer to the signal order (Electronic area, we conducted experiments with different distances from the accelerometer to the indenter (Figure [8b](#page-7-1)).
 To investigate the sensor system's capability to detect and localize a sliding object on a large contact

- With X-sliding case: Distance value *y* increased from 0 to 25 mm or from −25 to 0 mm with pressurization with a pneumatic actuation system with a compressor (JUNair) and a regulator. The increased 2.5-mm steps.
- With Y-sliding case: Distance value *x* rose from 0 to 25 mm with increased 2.5-mm steps. At a with increased steps of 0.5 mm/s. particular distance, the sliding motions were conducted with various velocities from 0.5 to 4 mm/s

of six sliding directions with both X, Y axes. (**b**) Sliding movements with various contact positions: All the signals from the accelerometer were sent to ADC (24 bit, Kyowa Electronic Instruments Co., The ADC converter's sampling rate was set to 1000 Hz. The skin was inflated by pressurization with a pneumatic actuation system with a compressor (JUNair) and a regulator. The air pressure was regulated within a range of 0.01 to 0.06 MPa. Tokyo, Japan) before being sent to a computer where the data were recorded by commercial software.

5. Results and Discussion

5.1. Output Voltage of Accelerometer Under Static Pressurization Without Sliding Motion

As discussion in Section [2.3](#page-3-1) and the simulation results in Section [3,](#page-4-1) the skin layer was inflated under pressurization, resulting in an inclination of the accelerometer's posture. Thus, the accelerometer's output voltage has initial values that are caused by static pressure at the no-sliding cases. To investigate the output response of the sensor system just under the effect of sliding traction, this initial output voltage of the accelerometer was measured for each value of pressurization and subtracted from the acquired output of the accelerometer during sliding operations. In addition, based on the accelerometer's output, we also estimated the height of the inflated skin and compared it to the measured height from the laser sensor. measured height from the laser sensor.

Without pressurizati[on](#page-8-0), since the skin is flat, the accelerometer lies horizontally (Figure 9a). Under pressurization, the accelerometer inclined, and the angle between the accelerometer and horiz[on](#page-8-0)tal plane was $β$. $θ_x$, $θ_y$ is the angle between axis O_1x , O_1y and horizontal axis $Δ$ (Figure 9b). Output voltages V_x , V_y are shown in Figure 9c.

Figure 9. Posture of accelerometer changed and its output voltages under static pressurization. (**a**) **Figure 9.** Posture of accelerometer changed and its output voltages under static pressurization. (a) Initial posture of accelerometer without pressurization. (b) Posture of accelerometer under static pressurization. (c) Output voltages of accelerometer under static pressurization. pressurization. (c) Output voltages of accelerometer under static pressurization.

As in Section [2.3,](#page-3-1) output voltage V_x can be calculated:

$$
V_x = ka_x = kgsin\theta_x.
$$
 (5)

In Figure Ω in Ω in $\Omega = \pi \sin \theta = c$. In Figure [9b](#page-8-0), since $β + θ_x = π$, $sinθ_x = sin β$, we get the following:

$$
\beta = acsin\left(\frac{V_x}{gk}\right). \tag{6}
$$

The posture of the accelerometer can be evaluated from value β .

For an estimation of the shape of the inflated skin from output voltage V_x of the accelerometer, \mathbf{p} and accelerated from value \mathbf{p} the skin's surface shape can be approximated by the following quadratic curve (Figure [10a](#page-9-0)):

$$
y = -ax^2 + h, \quad (a > 0), \tag{7}
$$

 r and start bulgated definition the absolute value of the slope of the europents the accelerometer's position. The slope equals $\tan \beta$, and we obtain where *h* is the skin's highest height. The absolute value of the slope of the curve at x_0 is $2ax_0$, where x_0

$$
a = \frac{\tan \beta}{2x_0}.\tag{8}
$$

The distance from the y axis to the position at which the curve intersects the x axis is $\sqrt{h/a}$. If this distance is represented by *D*, the height of the inflated skin is computed:

$$
h = \frac{D^2 \tan \beta}{2x_0}.
$$
 (9)

Since the dimension of the skin is $50 \times 50 \times 4$ mm, $D = 25$ mm. β is calculated from Equation (6). The computed value of the inflated skin's height is then compared to the measured values using a laser sensor (Figure [10b](#page-9-0)) and plotted in Figure [11](#page-9-1) with error less than 12%. Thus, based on the accelerometer's output voltage we can accurately estimate the accelerometer's posture as well as the output voltage we can accurate we can accurate the accurate the accurate the accurate the inflated skin's shape. The computed value of the inflated skin's height is then compared to the measured values using sensor (Figure 10b) and plotted in Figure 11 with error less than 12%. Thus, based on the accelerometer's output voltage we can accurately estimate the accelerometer's posture as well as the

Figure 10. Schematic diagrams to calculate output voltage V_x under static pressurization (a) Skin's surface approximated by quadratic curve. (b) Schematic drawing of experimental setup for measuring inflated skin's height. inflated skin's height. inflated skin's height.

Figure 11. Comparison of calculated and measured values of inflated skin's height. **Figure 11.** Comparison of calculated and measured values of inflated skin's height.

5.2. Output Voltages of Accelerometer Under Sliding Action

5.2. Output Voltages of Accelerometer Under Sliding Action 5.2.1. Dynamic Analysis for Detecting Sliding Directions

To localize the sliding movements, first the sensing system needs to recognize the motion's directions. In this section, we propose dynamic analysis based on the accelerometer's output for detecting the sliding directions. We conducted experiments with various sliding tractions (Figure [8a](#page-7-1)) and divided them into three main cases (Figure 8b): and divided them into three main cases (Figure 8b):

- (1) X-sliding case 1: Indenter slides along the X axis with contact position $y < 0$.
- (2) X-sliding case 2: Indenter slides along the X axis with contact position $y > 0$.
- (3) Y-sliding: Indenter slides along the Y axis.

 $W₁$ indenter meyes on the sensing system posture depend on the contact's position. For analysing the accelerometer's posture and its output, we divided the contact surface into four contact zones (Figure 12a). When the indenter moves on the sensing system's surface, the accelerometer's output and its

When the indenter contacts the sensing system's surface in contact zone 1, the accelerometer tends to incline toward point 1 (Figure [12b](#page-10-0)), and its posture with the corresponding *xy* coordinate is illustrated as in Figure [13a](#page-10-1). Similarly, with contact zones 2, 3, and 4, the accelerometer inclines toward points 2, 3, and 4, and Figure [13b](#page-10-1)–d show the accelerometer's posture and its *xy* coordinate,
respectively. The englassie shown in Figure 12 supports the following: respectively. The analysis shown in Figure [13](#page-10-1) suggests the following:

- With contact zone 1: The values of angles θ*x*, θ*^y* between O1x and O1y and horizontal axis ∆ are negative, and thus output voltages V_x and V_y are negative: $\theta_x < 0$, $\theta_y < 0 \rightarrow V_x < 0$, $V_y < 0$. - With contact zone 1: The values of angles ௫, ௬ between O1x and O1y and horizontal axis With contact zone 1: The values of angles θ_x , θ_y between O1x and O1y and horizontal axis Δ are
- With contact zone 2: $\theta_x > 0$, $\theta_y < 0 \rightarrow V_x > 0$, $V_y < 0$.
- With contact zone 3: $\theta_x < 0$, $\theta_y > 0 \rightarrow V_x < 0$, $V_y > 0$.
- With contact zone 4: $\theta_x > 0$, $\theta_y > 0 \rightarrow V_x > 0$, $V_y > 0$. $T_{\rm eff}$ system with each sliding system with each sliding case are shown in Figure 14. With each sliding $T_{\rm eff}$

The output voltages of the sensing system with each sliding case are shown in Figure 14. With X-sliding case 1, when the indenter starts to make contact and slides over the inflated skin's surface in contact zone 1, measured output voltages V_x , V_y are negative, by keeping moving, the indenter slides to the other side of the skin's surface in contact zone 2, output V_x increases to a positive peak value before it returns to the initial state when the indenter moves off of the skin's surface in contact zone 2. While V_y increases from a negative value to an initial value. When the indenter slides backward, its contact with the skin's surface changes inversely from contact zone 2 to contact zone 1, and thus V_x its contact with the skin's surface changes inversely from contact zone 2 to contact zone 1, and thus V_x
changes from a positive to a negative value and V_y keeps its negative value (Figure 14a).

With X-sliding case 2, the contact's position changes from zone 3 to 4 with forward sliding and from zone 4 to 3 with backward sliding. The changed behaviors of V_x and V_y can be analysed as in the X-sliding case 1. V_x increases from negative to positive, and V_y remains positive for forward sliding. With backward sliding, V_x decreases from positive to negative, and the value of V_y remains positive (Figure [14b](#page-11-0)).

on location of indenter on skin's surface, contact area can be categorized into four zones. (b) Posture of on location of indenter on skin's surface, contact area can be categorized into four zones. (**b**) Posture accelerometer under static pressurization without sliding actions.
. Figure 12. Divided contact zones on skin's surface and intial posture of accelerometer. (a) Depending

Figure 13. Accelerometer's posture and its outputs with different contact zones. (a) Contact zone 2: Accelerometer is inclined toward point 2 $\theta_x > 0 \rightarrow V_x > 0$, $\theta_y < 0 \rightarrow V_y < 0$. (c) Contact zone 3: Accelerometer is inclined toward point $3 \theta_x < 0 \rightarrow V_x < 0$, $\theta_y > 0 \rightarrow V_y > 0$. (d) Contact zone 3: Accelerometer is inclined toward point $4 \times 0 \rightarrow K \times 0$, $\rightarrow V \times 0$ Accelerometer is inclined toward point $4 \theta_x > 0 \rightarrow V_x > 0$, $\theta_y > 0 \rightarrow V_y > 0$. 1: Accelerometer is inclined toward point $1 \theta_x < 0 \rightarrow V_x < 0$, $\theta_y < 0 \rightarrow V_y < 0$. (b) Contact zone

Figure 14. Output voltage V_x , V_y of accelerometer with different sliding cases. V_x , V_y values depend on contact zone between indenter and skin's surface. Based on changed behaviour of V_x , V_y , our sensing system can temporally detect sliding directions: forward and backward in both X- and Y-sliding cases. system can temporally detect sliding directions: forward and backward in both X- and Y-sliding cases. (**a**) X-sliding case 1. (**b**) X-sliding case 2. (**c**) Y-sliding. (**a**) X-sliding case 1. (**b**) X-sliding case 2. (**c**) Y-sliding.

In terms of the Y-sliding case, with the forward sliding direction, the contact zone changes from In terms of the Y-sliding case, with the forward sliding direction, the contact zone changes from 1 to 3 and $V_y < 0$ rises to $V_y > 0$. With backward sliding, V_y changes from positive to negative. The value of V_x is negative in both the forward and backward directions (Figure [14c](#page-11-0)). In other words, with X-sliding, the sign of V_x changes but V_y has a constant sign. Whereas with Y-sliding, the sign of V_x is constant and V_y has a changed sign. This resemble the discussion of the displacement's change (*Dx*, *Dy*) in the simulation results, plotted in Figure [6,](#page-6-0) Section [3.](#page-4-1) A dynamic analysis of the experimental results agrees well with the simulation results. Based on output voltages V_x , V_y of the accelerometer, we conclude that our sensing system can temporally detect the sliding action with two forward and backward directions in the X- and Y-sliding cases.

5.2.2. Estimation of Sliding's Localization. 5.2.2. Estimation of Sliding's Localization.

We presented the idea of sliding movement localization in Section [2.1](#page-2-1) and in Section [5.2.1](#page-9-2) demonstrated the idea of sliding movement localization in Section 2.1 and in Section 5.2.1 demonstrated that the sensing system can temporally detect a sliding motion and its directions. Based on the sensing system can temporally detect a sliding motion and its directions. Based on the accelerometer's output voltage, in this section we confirm that the sliding object can be localized through the distance from the sliding line to the accelerometer and the magnitude of the sliding velocity.

Because the deformation of the soft skin at the accelerometer's position depends on the distance $\frac{1}{2}$ $\frac{1}{2}$ $\frac{1}{2}$ $\frac{1}{2}$ from the object to the accelerometer, the accelerometer's outputs are a function of the object's contact
 \overline{F} point. Therefore, based on the accelerometer's output voltages, a soft tactile sensing system can estimate distances *x*, *y* between the accelerometer and the object's sliding line (Figure [8b](#page-7-1)). To clarify this capacity, we experimented with various distances *x*, *y* for both the X- and Y-sliding cases (Figure [8b](#page-7-1)).

Figures [15a](#page-12-0) and [16a](#page-12-1) show the accelerometer's output voltages V_x , V_y with different distances \tilde{F}_{in} and 1-show the cases, when the soil skill is human by pressurization $I = 0.005$ m to These figures suggest that the values of V_x , V_y generally depend on distances y and x. When distances *y*, *x* of the X- and Y-sliding cases, when the soft skin is inflated by pressurization $P = 0.035 \text{ MPa}$. *y*, *x* increase, the output voltage decreases.

 y , *x* increase, the output voltage decreases.
In Figure [15a](#page-12-0), V_x *min* and V_x *max* are the minimum and maximum values of output voltage V_x with corresponding moments t_{min} and t_{max} . In Figure [16a](#page-12-1), (V_ymin, t_{min}) and (V_ymax, t_{max}) are similarly \sum_{m} following moments v_{mn} and v_{max} . In Figure 16a, $\left(\frac{v_{j}}{m}$, v_{min} , v_{min} , v_{max} ,

Figures [15a](#page-12-0) and [16a](#page-12-1) show that V_xmin , V_xmax and V_ymin , V_ymax depend on the y and x values. Thus, based on the magnitude of the minimum and maximum voltage, the distance from the accelerometer Figures 15a and 16a show that *numerous* or the *numerous maximum verge,* are distinct non-the decederative.
to the object's sliding line can be estimated and expressed as the following interpolated functions: \mathcal{L} based on the minimum voltage, the minimum voltage, the distance from the distance from

$$
y = f_1(V_xmin); y = f_2(V_xmax) \text{ for X-sliding}
$$

$$
x = f_3(V_ymin); x = f_4(V_ymax) \text{ for Y-sliding.}
$$
 (10)

 $\mathbf{r} = \mathbf{r}$ for $\mathbf{r} = \mathbf{r}$ for $\mathbf{r} = \mathbf{r}$ for $\mathbf{r} = \mathbf{r}$ = 3(); = 4() for Y-sliding. *x*. *tmin*, *tmax* only depend on the magnitude of velocity *v* (Figures [15b](#page-12-0) and [16b](#page-12-1)).(10) Figures [15a](#page-12-0) and [16a](#page-12-1) also indicate that the *tmin* and *tmax* values are not dependent on distances *y* or The magnitude of the sliding velocity can be expressed by:

$$
v = \chi_1(t_{min}); \ v = \chi_2(t_{max})
$$
\n(11)

Figure 15. Output voltage V_x of accelerometer with X-sliding case 1 when distance y increases from 5 to 15 mm. Value of V_x *min,* V_x *max* only depends on distance *y* and t_{min} , t_{max} depends on magnitude of velocity v. Based on accelerometer's output voltage, distance y from accelerometer to sliding line and magnitude of velocity v can be estimated. (a) Output voltage V_x with different distances y (mm). (**b**) Output voltage V_x with different magnitudes of velocity v (mm/s).

Figure 16. Output voltage V_y of accelerometer with Y-sliding when distance x increases from 10 to 22.5 mm. Values of V_ymin , V_ymax only depend on distance x and t_{min} , t_{max} depends on magnitude of velocity v. Based on accelerometer's output voltage, distance x from accelerometer to sliding line and magnitude of velocity v can be estimated. (a) Output voltage $V_y(V)$ with different distances x (mm). (b) Output voltage $V_y(V)$ with different velocities $v(mm/s)$.

 δ output voltage in the results with various values δ From active the values of the minimum, maximum output voltage, and corresponding moment t $\epsilon_{\rm{max}}$ and $\epsilon_{\rm{max}}$ the minimum of the dependence of the values maximum on the values $\mathbf{f} + \mathbf{f}$ and distances v x on $V + V + \mathbf{a}$ and linear. Thus, we chose quadratic equations and cubic functions for the interpolation of the velocities and the distances. These functions create the best cubic functions for the interpolation of the velocities and the distances. These functions create the best First chronicles y, and diverge entropy of the second data with the measurement contributions. From our experimental results with various values of distances and velocity magnitudes, t_{min} , t_{max} to assess the interpolated functions (Figures [17](#page-13-0)[–20\)](#page-14-0). These functions estimate the contact's distances *x* or *y* and velocity's magnitude *v*. The dependences of the velocity's magnitude on the values of t_{min} , t_{max} and distances y, x on V_x $_{min}$, V_y $_{min}$ are not linear. Thus, we chose quadratic equations and we extracted the values of the minimum, maximum output voltage, and corresponding moment

Based on the output voltages of the accelerometer with the interpolated functions, our tactile sensing system can estimate the magnitude of the velocity and the distance from the accelerometer to sliding lines x or y . Figures 21 and 22 present the calculated and actual values of the velocity and the distance from the accelerometer to the object's sliding line with an error bar. *Sensors* **2019**, *19*, 2036 15 of 20 *v* **= 0.008***tmax***² - 0.4331***tmax* **+ 7.4336**

Figure 17. Interpolating velocity v and distance y for case of X-sliding forward. (a) Interpolating velocity v from t_{min} , t_{max} . (b) Interpolating distance y from output voltage V_xmin .

Figure 18. Interpolating velocity v and distance y for case of X-sliding backward (a) Interpolating velocity v from t_{min} , t_{max} . (b) Interpolating distance y from output voltage V_xmin .

Figure 19. Interpolating velocity v and distance x for case of Y-sliding forward. (a) Interpolating **Figure 19.** Interpolating velocity and distance for case of Y-sliding forward. (**a**) Interpolating **Figure 19.** Interpolating velocity and distance for case of Y-sliding forward. (**a**) Interpolating velocity v from t_{min} , t_{max} . (**b**) Interpolating distance x from output voltage V_{y} *min*.

Figure 20. Interpolating velocity v (mm/s) and distance x (mm) for case of Y-sliding backward. (a) Interpolating velocity v from t_{min} , t_{max} . (b) Interpolating distance x from output voltage V_{y} min.

and actual velocity v (mm/s). (b) Comparison of calculated and actual distance y (mm). **1.** Calculated results compare to actual values with X-Figure 21. Calculated results compare to actual values with X-sliding case. (a) Comparison of calculated

calculated and actual velocity. (**b**) Comparison of calculated and actual distance x (mm). **2.** Calculated results compared to actual va Figure 22. Calculated results compared to actual values with Y-sliding case. (a) Comparison of

increases, the values of t_{min} , t_{max} decrease, and t **0 5** To estimate the velocity, the maximum errors between the calculated and actual magnitude were To estimate the velocity, the maximum errors between the calculated and actual magnitude were nan 8%. This indicates the sensing system's accuracy for the velocity's estimation. Note that when the velocity's magnitude increases, the values of t_{min} , t_{max} decrease, and thus based on experiments we acknowledged the sensing system can estimate a maximum velocity of about 13 mm/s. less than 8%. This indicates the sensing system's accuracy for the velocity's estimation. Note that less than 8%. This indicates the sensing system's accuracy for the velocity's estimation. Note that when

To estimate the distance from the accelerometer to the object's sliding line, for the X-sliding direction, Figu[re](#page-14-1) 21a shows that the maximum error is less than 15% with distance $y \ge 5$ mm. $\frac{1}{2}$ the large deformation at the accelerometer's position when the indenter is close to the accelerometer. In the surge decentration at the decedermieser of position when the independence to discusse the decedermiese.
The experimental results presented in Figures [15a](#page-12-0) and [16a](#page-12-1) also show that the output voltage decreases when the distance increases. If the minimum and maximum output voltages approach zero, the sensing when the distance increases. If the minimum and maximum output voltages approach zero, the sensing experiment are allowed the calculation to the maximum variation velocity of about 13 mm/s. System cannot detect the sliding actions. Therefore, for the X-sliding case, the tactile sensing system $T_{\rm c}$ and σ estimate the distance from the accelerometer to the objective sliding line, for the σ sliding line, for the σ sliding line, for the σ has a detectable area with distance −17.5 ≤ *y* ≤ 17.5 mm (Figure [23a](#page-15-0)), and in this area the sensing d_{total} regard 21a shows that the maximum error is less than 15% with distance $y \geq 5$ mm. Nonetheless, with distance $y = 2.5$ mm, the error is about 40% due to the effect of the nonlinearity of

system can detect the sliding direction and estimate the velocity's magnitude where the maximum error is less than 8%.

Figure 23. Schematic illustration of detectable area of tactile sensing system. In detectable area (inside red lines), sensing system can detect sliding direction and estimate velocity where maximum errors red lines), sensing system can detect sliding direction and estimate velocity where maximum errors are less than 8%, and in effective localization area (blue areas), distance from accelerometer to sliding are less than 8%, and in effective localization area (blue areas), distance from accelerometer to sliding objects can be estimated where maximum errors are less than 15%. (a) X-sliding case. (b) Y-sliding case.

Inside the detectable area, there are two effective localization areas with distances $-17.5 \le y \le 10$ −5 mm and 5 ≤ *y* ≤ 17.5 mm (blue area in Figure [23a](#page-15-0)), where the sensing system can estimate the distance from the accelerometer to the object's sliding line where the maximum error is less than 15%. Similarly, in the Y-sliding direction, the detectable area is evaluated with distance $0 \le x \le 25$ mm and the effective localization area is $10 \le x \le 22.5$ mm (Figure [23b](#page-15-0)).

In the effective localization area, based on the interpolated values of velocity magnitude v and the distance between the accelerometer and the sliding line, the sliding object can be localized through the values of its coordinates x and y. For the X-sliding case, $(x, y) = (vt, y)$, and for the Y-sliding case, $(x, y) = (x, vt)$. Figures [24](#page-15-1) and 25 illustrate the comparisons of the actual object's position and its estimated localization with various sliding cases.

Figure 24. Comparison of actual sliding position and estimated position for X-sliding cases. Actual sliding trajectory is red line, after delay time (when accelerometer's output voltage reaches extreme values), sensing system can localize sliding object's positions with errors less than 15% (localized sliding trajectory is blue line). (a) X-sliding case: forward direction. (b) X-sliding case: backward direction.

Figure 25. Comparison of actual sliding position and estimated position for Y-sliding cases. (a) Y-sliding sliding case: forward direction. (**b**) Y-sliding case: backward direction. case: forward direction. (**b**) Y-sliding case: backward direction.

5.3. Role of Pressurization Because we use interpolated functions to estimate the values of sliding velocity *v* and distances *x*, *y*, output voltage to reach extreme values. The value of the delayed time depends on the magnitude's velocity and can be estimated from interpolated function $v = \chi_1(t_{min})$; $v = \chi_2(t_{max})$. for the sliding object's localization, the sensing system needs a delayed period for the accelerometer's

In the X-sliding case with forward direction, the delayed time is about $t_{delay} = \frac{18}{v}$ (s), and with higher pressure direction, it is $t_{11} = \frac{20.5}{5}$ (s). For the Y-sliding case with forward direction $t_{11} = \frac{17.5}{5}$ (s). backward direction, it is $t_{delay} = \frac{20.5}{v}$ (s). For the Y-sliding case with forward direction, $t_{delay} = \frac{17.5}{v}$ (s)
and with backward direction: $t_{xx} = \frac{21.5}{v}$ (s) compared to the total time of one sliding action on inflated skin's surface $t_{sliding} = \frac{50}{v}$ (s). This result denotes that in a sliding action, after the indenter slides about $\frac{2}{5}$ of the distance, the sensing system can localize its position with the maximum errors are ss than 15% and the output voltage increases. With higher pressure value, the output voltage increases. Thus, the output voltage increases increases. Thus, the output voltage increases increases. Thus, thus, thus, thus and with backward direction: $t_{delay} = \frac{21.5}{v}$ (s), compared to the total time of one sliding action on the less than 15%.

simulation results in Figure 6 of Section 3 and suggests the potential of numerical simulations for *5.3. Role of Pressurization*

In this proposed tactile sensing system, inflated soft skin is generated by the activation of pressurization. Pressurization plays the actuation role that creates the continued change in the presentational creativities parameter projection and experimental results, we continue the simulation and accelerometer's position under the object's sliding action. Figure [11](#page-9-1) in Section [5.1](#page-8-1) shows that with higher pressurization, the inflated skin's height increases, leading to higher deformation of the skin's height surface under identical sliding motions. Resulting in increased output voltage of the accelerometer. Thus, the pressure's value greatly affects the sensitivity of the sensing system with sliding motions.

Figure [26](#page-17-0) shows the output voltage responses of the accelerometer under sliding actions with various pressurization's conditions. With higher pressure value, the output voltage increases. Thus, sensitivity to the sliding action increases with extra pressurization. This result resembles the simulation results in Figure [6](#page-6-0) of Section [3](#page-4-1) and suggests the potential of numerical simulations for predicting the responses of our sensing system under various sliding actions, although in the numerical simulations, the pressurization was setup at a much smaller value than in experiments to save computational cost. Thus, by confirming the simulation and experimental results, we conclude that with higher pressure values, the sensing system's sensitivity increases with sliding motions.

Nonetheless, at higher pressure $(P = 0.045 \text{ MPa})$ the output voltage is not much bigger than at pressure $P = 0.035$ MPa due to the nonlinearity of the skin's deformation with high pressure. In addition, high pressurization might prevent sliding movements. With the presented configuration of the soft active tactile sensor system in this paper, the ideal pressurization is 0.035 MPa, which was used in the experimental results in Section [5.2.](#page-9-3) This result also suggests that for generating and maintaining the inflated skin's surface, the required pressurization is small (maximum, 0.035 MPa).

Figure 26. Accelerometer's output voltage with different pressurizations in Y-sliding case. With **Figure 26.** Accelerometer's output voltage with different pressurizations in Y-sliding case. With higher pressure value, sensing system is more sensitive to sliding action. Nonetheless, high pressurization is relatively ineffective. (a) Output voltage $V_x(V)$ with different pressurizations. (b) Output voltage V_y (*V*) with different pressurizations.

5.4. Limitations and Applicability of Sensing System 5.4. Limitations and Applicability of Sensing System

We analyzed our sensing system's ability on the detecting and localization of sliding movements We analyzed our sensing system's ability on the detecting and localization of sliding movements and validated it by simulations and experiments. Nonetheless, it continues to suffer from fundamental
. $f(x)$ and imitations. issues and limitations.

The accelerometer's output depends on the contact location and the contact force. We assume \tilde{c} that first the sliding object slightly contacts the soft skin outside the inflated area and slides without the soft skin outside the inflated area and slides without changing the initial contact depth. Thus, under specific pressurization, the contact force at each changing the initial contact depth. Thus, under specific pressurization, the contact force at each contact point is identical for all sliding movements. We can ignore the effect of the contact force on contact point is identical for all sliding movements. We can ignore the effect of the contact force on the accelerometer's output voltage. In the case of changing the contact depth during sliding movements,
and a second contact the contact of the contact depth during sliding movements, the effect of the force at each contact point must be considered. To solve this issue, in the next step in the next step we will propose a finite element model to estimate the deformation of the inflated soft skin's surface will propose a finite element model to estimate the deformation of the inflated soft skin's surface surface various contact forces. This model could also be used to locate the indentations on soft skill and estimate the normal contact force. In addition, the effect of acceleration due to the friction force in the state of the friction force between the sliding object and the skin's surface was not mentioned in this paper. This effect could be
 reduced by filtering, such as with a Kalman filter.
The contract of the contract o under various contact forces. This model could also be used to locate the indentations on soft skin

A sensing system can be used for specific devices and an accelerometer's output may change if A sensing system can be used for specific devices and an accelerometer's output may change if the entire device changes its posture. Thus, this effect must be investigated and eliminated. To solve this issue, it may require an algorithm that calculates the accelerometer's output based on the whole device's posture.
— These calculated values will be subtracted from the accelerometer's acquired output for sensing.

Another current limitation of our sensing system is that it can detect and localize sliding motions with two X- and Y- directions because we only deploy the accelerometer as a sensing element. In the ϵ future we will use more accelerometers, each of which will be placed at a suitable initial posture in the accelerometers, each of which will be placed at a suitable initial posture and position. Based on the output responses of all the accelerometers, we will build a method using and position. machine learning to localize the sliding motions with diagonal directions. To accomplish complicated tasks, a sensing system must be trained with training data in various conditions of sliding motions.
. After training, the acquired program can be used as the sensing system's brain that should be attached being motions. The sensing system is a should be attached to the main processing system. The processing system can help a sensing system be localized temporally with improved revolutions. We must tackle this critical issue in the future to fulfill this sensing system. In addition, we will use another accelerometer with a flexible circuit to replace the current accelerometer with a solid circuit board. For example, the previously proposed flexible one [\[21\]](#page-19-10) would be easier to embed in soft skin.

Our sensing system is anticipated for applications in soft robotics. For instance, it could be attached to a soft robotics hand's palm or other body parts of robots that frequently make contact with sliding objects. Normally, without pressurization, a soft skin surface plays the role of robotic skin and is inflated for detecting and localization sliding tasks, which are crucial for robots to make subsequent decisions. Because the pressurization for activating the inflated skin is small (maximum, 0.035 MPa), a sensing system can be activated with a small pump and a simple pneumatic controller without affecting the portability of the whole device. In addition, our sensor system is a promising device for detecting sliding objects and localizing their position in an environment with limited vision. In this paper we avoided applying our sensing system for specific applications. Instead, we set a prototype design, fabrication, and experiment with analysis to validate its ability. Thus, other researchers can exploit it to design specifically purposed structures.

6. Conclusions

We introduce a soft tactile sensing system with a three-axis accelerometer for detecting and localizing sliding motions on large contact surfaces. Our numerical simulation and experimental results show that it can detect temporally sliding directions in both X- and Y-direction sliding cases. In addition, interpolated functions were given to estimate the magnitude's sliding velocity and the distance from the accelerometer to the sliding line to localize the sliding object. The detection area also validated that the sensing system can detect and localize sliding tractions on large contact areas. Future work will investigate the sensing system's ability with various sliding cases, including diagonal directions and changing the contact depth by proposing finite element model and machine learning methods. Then we will apply our sensing system to soft robotics.

Author Contributions: H.X.T., Y.I. conceived, designed, performed the experiments. Data analysis, writing the first draft of the manuscript by H.X.T. and it was revised and substantially improved by V.A.H. and K.S. Methodology, project administration was made by K.S. and V.A.H.

Funding: This research was supported by the Joint Research Center for Science and Technology of Ryukoku University and JSPS Grant-in-aid for Scientific Research (KAKENHI) grant number 18H01406.

Conflicts of Interest: The authors declare no conflict of interest.

References

- 1. Ravinder, D.; Maurizio, V. Tactile Sensing for Robotic Applications. In *Sensors: Focus on Tactile Force and Stress Sensors*; Jose, R., Senentxu, M., Eds.; I-Tech: Vienna, Austria, 2008; pp. 289–304.
- 2. Eric, K. *Principles of Neural Science*, 5th ed.; McGrraw-Hill: New York, NY, USA, 2000.
- 3. Ravinder, D.; Giorgio, M.; Maurizio, V.; Guilio, S. Tactile sensing—From Humans to Humanoids. *IEEE Trans. Rob.* **2010**, *26*, 1–20.
- 4. Kwonsik, S.; Minkyung, S.; Eunmin, C.; Hyunchul, P.; Ji, W.C.; Yuljae, C.; Jung, I.S.; Seung, N.C.; Jae, E.J. Artificial Tactile Sensor Structure for Surface Topography Through Sliding. *IEEE*/*ASME Trans. Mechatron.* **2018**, *23*, 2638–2649.
- 5. Huang, Y.; Yuan, H.; Kan, W.; Guo, X.; Liu, C.; Liu, P. A flexible three axial capacitive tactile sensor with multilayered dielectric for artificial skin applications. *Microsys. Technol.* **2007**, *23*, 1847–1852. [\[CrossRef\]](http://dx.doi.org/10.1007/s00542-016-2936-x)
- 6. Dana, D.; Taylor, N.; Rolf, P.; Allison, O. Artificial Tactile Sensing of Position and Slip Speed by Exploiting Geometrical Features. *IEEE*/*ASME Trans. Mechatron.* **2015**, *20*, 263–274.
- 7. Javier, A.; Leandro, B. Estimating Object Grasping Sliding via Pressure Array Sensing. In Proceedings of the IEEE International Conference on Robotics and Automation, Saint Paul, MN, USA, 14–18 May 2012; pp. 1740–1746.
- 8. Paolo, G.; Luigi, P.; Lucia, S.; Maurizio, V.; Rodolfo, Z. Computational Intelligence Techniques for Tactile Sensing Systems. *Sensors* **2014**, *14*, 10952–10976.
- 9. Pfeifer, R.; Lungarella, M.; Idia, F. Self-organization, embodiment and biologically inspired robotics. *Science* **2007**, *318*, 1088–1093. [\[CrossRef\]](http://dx.doi.org/10.1126/science.1145803) [\[PubMed\]](http://www.ncbi.nlm.nih.gov/pubmed/18006736)
- 10. Hauser, H.; Rudolf, M.; Kohei, N. Morphological computation-The physical body as a computational resource. Self-published. **2014**, *20*, 226–244.
- 11. Muller, V.C.; Hoffman, M. What is morphological computation? On how the body contributes to cognition and control. *Artif. Life* **2017**, *23*, 1–24. [\[CrossRef\]](http://dx.doi.org/10.1162/ARTL_a_00219) [\[PubMed\]](http://www.ncbi.nlm.nih.gov/pubmed/28140632)
- 12. Ahanat, K.; Juan, A.C.R.; Veronique, P. Tactile sensing in dexterous robot hands-Review. *Rob. Auton. Syst.* **2015**, *74*, 195–220.
- 13. Trinh, H.X.; Shibuya, K. Tactile sensing system with wrinkle's morphological change: Modeling. In Proceedings of the IEEE International Conference on Soft Robotics, Livorno, Italy, 24–28 April 2018; pp. 362–368.
- 14. Chathuranga, D.S.; Wang, Z.; Noh, Y.; Thrishantha, N.; Shinichi, H. Magnetic and mechanical modelling of a soft three-axis force sensor. *IEEE Sens. J.* **2016**, *16*, 5298–5307. [\[CrossRef\]](http://dx.doi.org/10.1109/JSEN.2016.2550605)
- 15. Mannsfeld, S.C.; Tee, B.C.; Stoltenberg, R.M.; Chen, C.V.H.; Barman, S.; Muir, B.V.; Sokolov, A.N.; Reese, C.; Bao, Z. Highly sensitive flexible pressure sensors with microstructured rubber dielectric layers. *Nat. Mater.* **2010**, *9*, 859–864. [\[CrossRef\]](http://dx.doi.org/10.1038/nmat2834) [\[PubMed\]](http://www.ncbi.nlm.nih.gov/pubmed/20835231)
- 16. Julius, E.B.; Van, A.H.; Hongbin, L. Morphological computation in haptic sensation and interaction: from nature to robotics. *Adv. Rob.* **2018**, *32*, 340–362.
- 17. Van, A.H.; Yamashita, H.; Wang, Z.; Shinichi, H.; Koji, S. Wrin'Tac: Tactile sensing system with wrinkle's morphological change. *IEEE Trans. Inf.* **2017**, *13*, 2496–2506.
- 18. Trinh, H.X.; Ho, V.A.; Shibuya, K. Computational model for tactile sensing system with wrinkle's morphological change. *Adv. Rob.* **2018**, *32*, 1135–1150.
- 19. Shunsuka, S.; Shogo, O.; Yoichiro, M.; Yoji, Y. Wearable finger pad deformation sensor for tactile textures in frequency domain by using accelerometer on finger side. *ROBOMECH J.* **2017**, *4*, 1–11.
- 20. Carlos, B.; Martin, M.; Pablo, B. Tactile sensing with accelerometers in prehensile grippers for robots. *Mechatronics* **2016**, *33*, 1–12.
- 21. Chathuranga, K.V.D.S.; Hirai, S. A bio-mimetic fingertip that detect force and vibration modalities and its application to surface identification. In Proceedings of the IEEE International Conference on Robotics and Biomimetics, Guangzhou, China, 11–14 December 2012; pp. 575–581.
- 22. Vallbo, A.B.; Johansson, R.S. Properties of cutaneous mechanoreceptors in the human hand related to touch sensation. *Hum. Neurobiol.* **1984**, *3*, 3–14.
- 23. Jackson, K.; Brooks, D.R. Do crocodiles co-opt their sense of touch to taste? a possible new type of vertebrate sensory organ. *Amphib. Reptil.* **2009**, *28*, 277–285. [\[CrossRef\]](http://dx.doi.org/10.1163/156853807780202486)
- 24. Leitch, D.B.; Catania, K.C. Structure, innervation and response properties of integumentary sensory organs in crocodilians. *J. Exp. Biol.* **2012**, *215*, 4217–4230. [\[CrossRef\]](http://dx.doi.org/10.1242/jeb.076836) [\[PubMed\]](http://www.ncbi.nlm.nih.gov/pubmed/23136155)
- 25. Fritz, V.; Paul, A.S. The role of behavior in the evolution of spiders, silks, and webs. *Annu. Rev. Ecol. Evol. Syst.* **2007**, *38*, 819–846.
- 26. Discovery. Spiders 'Listen' to Web Tones to Detect Prey. Available online: http://[blogs.discovermagazine.](http://blogs.discovermagazine.com/d-brief/2014/06/04/spiders-listen-prey/) com/d-brief/2014/06/04/[spiders-listen-prey](http://blogs.discovermagazine.com/d-brief/2014/06/04/spiders-listen-prey/)/ (accessed on 25 September 2018).
- 27. Shin-Estu Sillione. Rubber compounds. Available online: https://[www.shinetsusilicone-global.com](https://www.shinetsusilicone-global.com/products/type/rubb_comp/index.shtml)/products/ type/rubb_comp/[index.shtml](https://www.shinetsusilicone-global.com/products/type/rubb_comp/index.shtml) (accessed on 27 October 2018).
- 28. Smooth-On, Inc. Ecoflex™ 00-10. Available online: https://[www.smooth-on.com](https://www.smooth-on.com/products/ecoflex-00-10/)/products/ecoflex-00-10/ (accessed on 25 September 2018).
- 29. NXP. ±1.5g, ±6g Three Axis Low-g Micromachined Accelerometer. Available online: https://[www.nxp.com](https://www.nxp.com/files-static/sensors/doc/data_sheet/MMA7361L.pdf)/ files-static/sensors/doc/data_sheet/[MMA7361L.pdf](https://www.nxp.com/files-static/sensors/doc/data_sheet/MMA7361L.pdf) (accessed on 16 October 2018).

© 2019 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (http://[creativecommons.org](http://creativecommons.org/licenses/by/4.0/.)/licenses/by/4.0/).