

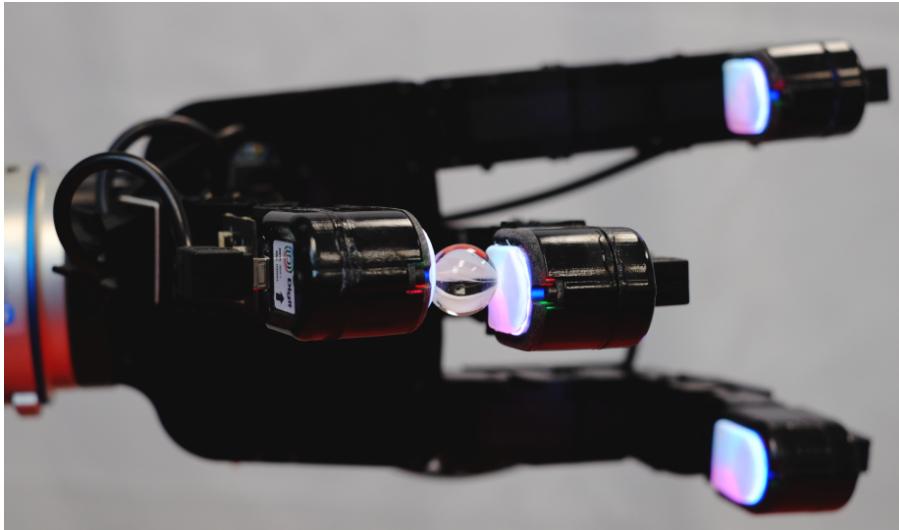
# CMSC426 Final Project: Depth and Contact Prediction

## Objective

In this project we want to use deep neural networks to predict 3D contact geometry from monocular images of a vision-based tactile sensor.

## Background

- **Tactile sensors** are devices designed to measure information arising from the physical interaction of robots with their environment. These sensors excel in detecting stimuli resulting from mechanical stimulation, temperature variations, and even pain-like responses.



However, recent sensor developments in this field, often inspired by the biological sense of cutaneous touch, have predominantly concentrated on capturing the 3D geometry of contact. In this project, we aim to extend this focus to predicting such interactions, particularly for GelSight tactile sensors. The figure below illustrates the resolution of tactile sensors when they come into contact with various objects



The papers below contain crucial information on how these sensors work, which could be helpful for success in this project

[GelSight Wedge: Measuring High-Resolution 3D Contact Geometry with a Compact Robot Finger](#)

[DIGIT: A Novel Design for a Low-Cost Compact High-Resolution Tactile Sensor with Application to In-Hand Manipulation](#)

- **Depth Prediction** is the task of measuring the distance of each pixel relative to the camera. Depth is extracted from either monocular (single) or stereo (multiple views of a scene) images. Traditional methods use multi-view geometry to find the relationship between the images. Newer methods can directly estimate depth by minimizing the regression loss, or by learning to generate a novel view from a sequence. You can also watch one of the recent works in PRG on reconstructing objects with tactile sensors on [YouTube](#).
- **Contact Prediction** is closely akin to Depth Prediction but represents a somewhat simpler task. This is because the output solely consists of a binary mask indicating the areas where the depth is positive.

## Objective

In this project, we aim to acquire the inverse sensor model to reconstruct local 3D geometry from a tactile image. The task involves training the model in a supervised manner to predict local heightmaps and contact areas from tactile images. While one potential strategy involves integrating depth and contact prediction within a stacked neural network, such as outlined in [Depth Map Prediction from a Single Image using a Multi-Scale Deep Network](#), we encourage you to propose a novel approach tailored to the specific challenges of the problem. Nevertheless, we'll provide you with a project template to guide your implementation, building upon the principles covered during semester.

### IN THIS PROJECT ALL FUNCTIONS/LIBRARIES ARE ALLOWED

## Step 1: Dataloading

Create a custom dataset to read images from the [provided dataset](#). You might need to preprocess the data as these are raw tactile readings from sensor without any normalization. For further guidance, refer to the [PyTorch tutorial](#).

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In [1]: # Download the dataset
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!unzip ayEOY
```

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--2023-12-22 03:39:37-- https://shorturl.at/ayEOY
Resolving shorturl.at (shorturl.at)... 104.26.8.129, 172.67.69.88, 104.26.9.129, ...
Connecting to shorturl.at (shorturl.at)|104.26.8.129|:443... connected.
HTTP request sent, awaiting response... 301 Moved Permanently
Location: https://www.shorturl.at/ayEOY [following]
--2023-12-22 03:39:37-- https://www.shorturl.at/ayEOY
Resolving www.shorturl.at (www.shorturl.at)... 104.26.9.129, 104.26.8.129, 172.67.69.
88, ...
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HTTP request sent, awaiting response... 200 OK
Length: 117703955 (112M) [application/zip]
Saving to: 'ayEOY'
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ayEOY          100%[=====] 112.25M 91.6MB/s    in 1.2s
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inflating: mini_depth_dataset/big_decagon/depth/80.png
inflating: mini_depth_dataset/med_decagon/depth/113.png
inflating: mini_depth_dataset/med_decagon/tactile/113.png
inflating: mini_depth_dataset/med_decagon/depth/114.png
inflating: mini_depth_dataset/ring/depth/44.png
inflating: mini_depth_dataset/med_decagon/depth/111.png
inflating: mini_depth_dataset/med_decagon/tactile/107.png
inflating: mini_depth_dataset/big_decagon/depth/78.png
```

```
inflating: mini_depth_dataset/hafez/tactile/114.png
inflating: mini_depth_dataset/big_decagon/depth/79.png
inflating: mini_depth_dataset/med_decagon/tactile/112.png
inflating: mini_depth_dataset/med_decagon/tactile/108.png
inflating: mini_depth_dataset/med_decagon/tactile/106.png
inflating: mini_depth_dataset/ring/depth/45.png
inflating: mini_depth_dataset/hafez/tactile/112.png
inflating: mini_depth_dataset/hafez/depth/130.png
inflating: mini_depth_dataset/big_decagon/depth/76.png
inflating: mini_depth_dataset/med_decagon/depth/109.png
inflating: mini_depth_dataset/ring/depth/41.png
inflating: mini_depth_dataset/big_decagon/depth/77.png
inflating: mini_depth_dataset/hafez/tactile/115.png
inflating: mini_depth_dataset/ring/depth/46.png
inflating: mini_depth_dataset/med_decagon/depth/110.png
inflating: mini_depth_dataset/med_decagon/depth/108.png
inflating: mini_depth_dataset/med_decagon/tactile/103.png
inflating: mini_depth_dataset/med_decagon/tactile/102.png
inflating: mini_depth_dataset/ring/depth/38.png
inflating: mini_depth_dataset/hafez/depth/128.png
inflating: mini_depth_dataset/med_decagon/depth/105.png
inflating: mini_depth_dataset/ring/depth/42.png
inflating: mini_depth_dataset/big_decagon/depth/73.png
inflating: mini_depth_dataset/hafez/depth/129.png
inflating: mini_depth_dataset/med_decagon/tactile/104.png
inflating: mini_depth_dataset/hafez/tactile/113.png
inflating: mini_depth_dataset/med_decagon/depth/106.png
inflating: mini_depth_dataset/big_decagon/depth/72.png
inflating: mini_depth_dataset/big_decagon/depth/74.png
inflating: mini_depth_dataset/ring/depth/39.png
inflating: mini_depth_dataset/ring/depth/40.png
inflating: mini_depth_dataset/hafez/depth/126.png
inflating: mini_depth_dataset/big_decagon/depth/71.png
inflating: mini_depth_dataset/big_decagon/depth/75.png
inflating: mini_depth_dataset/med_decagon/tactile/101.png
inflating: mini_depth_dataset/med_decagon/tactile/105.png
inflating: mini_depth_dataset/hafez/tactile/116.png
inflating: mini_depth_dataset/med_decagon/depth/123.png
inflating: mini_depth_dataset/ring/depth/36.png
inflating: mini_depth_dataset/hafez/depth/125.png
inflating: mini_depth_dataset/ring/depth/37.png
inflating: mini_depth_dataset/hafez/depth/124.png
inflating: mini_depth_dataset/med_decagon/depth/101.png
inflating: mini_depth_dataset/hafez/depth/127.png
inflating: mini_depth_dataset/hafez/depth/121.png
inflating: mini_depth_dataset/med_decagon/tactile/100.png
inflating: mini_depth_dataset/big_decagon/depth/69.png
inflating: mini_depth_dataset/big_decagon/depth/66.png
inflating: mini_depth_dataset/big_decagon/depth/93.png
inflating: mini_depth_dataset/ring/depth/33.png
inflating: mini_depth_dataset/med_decagon/depth/102.png
inflating: mini_depth_dataset/hafez/depth/120.png
inflating: mini_depth_dataset/med_decagon/depth/99.png
inflating: mini_depth_dataset/big_decagon/depth/70.png
inflating: mini_depth_dataset/ring/depth/43.png
inflating: mini_depth_dataset/med_decagon/depth/96.png
inflating: mini_depth_dataset/big_decagon/depth/65.png
inflating: mini_depth_dataset/med_decagon/depth/97.png
inflating: mini_depth_dataset/med_decagon/depth/95.png
inflating: mini_depth_dataset/med_decagon/tactile/98.png
```

```
inflating: mini_depth_dataset/med_decagon/depth/103.png
inflating: mini_depth_dataset/hafez/depth/122.png
inflating: mini_depth_dataset/hafez/depth/119.png
inflating: mini_depth_dataset/ring/depth/34.png
inflating: mini_depth_dataset/med_decagon/depth/100.png
inflating: mini_depth_dataset/med_decagon/depth/98.png
inflating: mini_depth_dataset/med_decagon/tactile/96.png
inflating: mini_depth_dataset/med_decagon/tactile/95.png
inflating: mini_depth_dataset/med_decagon/tactile/99.png
inflating: mini_depth_dataset/ring/depth/31.png
inflating: mini_depth_dataset/big_decagon/depth/63.png
inflating: mini_depth_dataset/big_decagon/depth/62.png
inflating: mini_depth_dataset/med_decagon/tactile/92.png
inflating: mini_depth_dataset/med_decagon/tactile/94.png
inflating: mini_depth_dataset/med_decagon/depth/92.png
inflating: mini_depth_dataset/med_decagon/tactile/97.png
inflating: mini_depth_dataset/ring/depth/30.png
inflating: mini_depth_dataset/hafez/depth/117.png
inflating: mini_depth_dataset/big_decagon/depth/59.png
inflating: mini_depth_dataset/med_decagon/depth/107.png
inflating: mini_depth_dataset/med_decagon/tactile/93.png
inflating: mini_depth_dataset/med_decagon/depth/93.png
inflating: mini_depth_dataset/hafez/depth/114.png
inflating: mini_depth_dataset/ring/depth/93.png
inflating: mini_depth_dataset/med_decagon/depth/91.png
inflating: mini_depth_dataset/hafez/depth/115.png
inflating: mini_depth_dataset/big_decagon/depth/61.png
inflating: mini_depth_dataset/ring/depth/35.png
inflating: mini_depth_dataset/med_decagon/depth/89.png
inflating: mini_depth_dataset/med_decagon/depth/90.png
inflating: mini_depth_dataset/hafez/depth/118.png
inflating: mini_depth_dataset/med_decagon/tactile/89.png
inflating: mini_depth_dataset/big_decagon/depth/60.png
inflating: mini_depth_dataset/big_decagon/depth/58.png
inflating: mini_depth_dataset/hafez/depth/112.png
inflating: mini_depth_dataset/big_decagon/depth/64.png
inflating: mini_depth_dataset/ring/depth/29.png
inflating: mini_depth_dataset/ring/depth/28.png
inflating: mini_depth_dataset/hafez/depth/113.png
inflating: mini_depth_dataset/med_decagon/tactile/88.png
inflating: mini_depth_dataset/med_decagon/depth/88.png
inflating: mini_depth_dataset/med_decagon/tactile/91.png
inflating: mini_depth_dataset/big_decagon/depth/56.png
inflating: mini_depth_dataset/big_decagon/depth/57.png
inflating: mini_depth_dataset/big_decagon/depth/55.png
inflating: mini_depth_dataset/med_decagon/depth/85.png
inflating: mini_depth_dataset/ring/depth/26.png
inflating: mini_depth_dataset/ring/tactile/4.png
inflating: mini_depth_dataset/hafez/tactile/111.png
inflating: mini_depth_dataset/med_decagon/tactile/86.png
inflating: mini_depth_dataset/med_decagon/tactile/84.png
inflating: mini_depth_dataset/hafez/depth/107.png
inflating: mini_depth_dataset/med_decagon/tactile/85.png
inflating: mini_depth_dataset/med_decagon/depth/94.png
inflating: mini_depth_dataset/med_decagon/depth/87.png
inflating: mini_depth_dataset/med_decagon/tactile/87.png
inflating: mini_depth_dataset/med_decagon/tactile/90.png
inflating: mini_depth_dataset/hafez/depth/110.png
inflating: mini_depth_dataset/ring/depth/27.png
inflating: mini_depth_dataset/big_decagon/depth/54.png
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```
inflating: mini_depth_dataset/hafez/depth/111.png
inflating: mini_depth_dataset/hafez/tactile/106.png
inflating: mini_depth_dataset/big_decagon/depth/67.png
inflating: mini_depth_dataset/ring/depth/25.png
inflating: mini_depth_dataset/med_decagon/depth/104.png
inflating: mini_depth_dataset/big_decagon/depth/52.png
inflating: mini_depth_dataset/ring/depth/24.png
inflating: mini_depth_dataset/big_decagon/depth/53.png
inflating: mini_depth_dataset/med_decagon/depth/84.png
inflating: mini_depth_dataset/hafez/tactile/105.png
inflating: mini_depth_dataset/ring/depth/23.png
inflating: mini_depth_dataset/med_decagon/tactile/82.png
inflating: mini_depth_dataset/hafez/tactile/104.png
inflating: mini_depth_dataset/med_decagon/depth/82.png
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inflating: mini_depth_dataset/hafez/depth/106.png
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inflating: mini_depth_dataset/hafez/depth/103.png
inflating: mini_depth_dataset/hafez/depth/116.png
inflating: mini_depth_dataset/med_decagon/depth/79.png
inflating: mini_depth_dataset/med_decagon/tactile/80.png
inflating: mini_depth_dataset/med_decagon/depth/78.png
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inflating: mini_depth_dataset/med_decagon/depth/77.png
inflating: mini_depth_dataset/big_decagon/depth/49.png
inflating: mini_depth_dataset/hafez/depth/98.png
inflating: mini_depth_dataset/hafez/tactile/102.png
inflating: mini_depth_dataset/ring/depth/22.png
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inflating: mini_depth_dataset/big_decagon/depth/45.png
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inflating: mini_depth_dataset/med_decagon/depth/76.png
inflating: mini_depth_dataset/hafez/depth/102.png
inflating: mini_depth_dataset/med_decagon/tactile/79.png
inflating: mini_depth_dataset/hafez/tactile/100.png
inflating: mini_depth_dataset/hafez/depth/104.png
inflating: mini_depth_dataset/med_decagon/tactile/77.png
inflating: mini_depth_dataset/hafez/tactile/110.png
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inflating: mini_depth_dataset/hafez/depth/101.png
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inflating: mini_depth_dataset/big_decagon/depth/42.png
inflating: mini_depth_dataset/ring/depth/19.png
inflating: mini_depth_dataset/big_decagon/depth/41.png
inflating: mini_depth_dataset/med_decagon/tactile/74.png
inflating: mini_depth_dataset/med_decagon/depth/75.png
inflating: mini_depth_dataset/hafez/depth/94.png
inflating: mini_depth_dataset/hafez/depth/96.png
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inflating: mini_depth_dataset/big_decagon/depth/40.png
inflating: mini_depth_dataset/med_decagon/tactile/72.png
inflating: mini_depth_dataset/hafez/tactile/96.png
inflating: mini_depth_dataset/med_decagon/depth/73.png
inflating: mini_depth_dataset/big_decagon/depth/39.png
inflating: mini_depth_dataset/ring/depth/15.png
inflating: mini_depth_dataset/med_decagon/depth/80.png
inflating: mini_depth_dataset/hafez/tactile/99.png
inflating: mini_depth_dataset/hafez/tactile/94.png
inflating: mini_depth_dataset/big_decagon/depth/38.png
inflating: mini_depth_dataset/med_decagon/depth/71.png
inflating: mini_depth_dataset/ring/depth/20.png
inflating: mini_depth_dataset/hafez/tactile/98.png
inflating: mini_depth_dataset/big_decagon/depth/68.png
inflating: mini_depth_dataset/hafez/tactile/95.png
inflating: mini_depth_dataset/ring/depth/13.png
inflating: mini_depth_dataset/hafez/depth/95.png
inflating: mini_depth_dataset/big_decagon/depth/46.png
inflating: mini_depth_dataset/med_decagon/tactile/70.png
inflating: mini_depth_dataset/med_decagon/tactile/71.png
inflating: mini_depth_dataset/big_decagon/depth/43.png
inflating: mini_depth_dataset/med_decagon/depth/70.png
inflating: mini_depth_dataset/big_decagon/depth/37.png
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inflating: mini_depth_dataset/hafez/depth/90.png
inflating: mini_depth_dataset/ring/depth/16.png
inflating: mini_depth_dataset/big_decagon/depth/36.png
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inflating: mini_depth_dataset/med_decagon/tactile/68.png
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inflating: mini_depth_dataset/med_decagon/tactile/69.png
inflating: mini_depth_dataset/med_decagon/depth/86.png
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inflating: mini_depth_dataset/ring/depth/57.png
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inflating: mini_depth_dataset/med_decagon/tactile/65.png
inflating: mini_depth_dataset/med_decagon/tactile/66.png
inflating: mini_depth_dataset/ring/depth/9.png
inflating: mini_depth_dataset/hafez/depth/87.png
inflating: mini_depth_dataset/hafez/tactile/88.png
inflating: mini_depth_dataset/ring/depth/10.png
inflating: mini_depth_dataset/ring/depth/11.png
inflating: mini_depth_dataset/hafez/tactile/90.png
inflating: mini_depth_dataset/med_decagon/tactile/67.png
inflating: mini_depth_dataset/med_decagon/depth/81.png
inflating: mini_depth_dataset/hafez/tactile/97.png
inflating: mini_depth_dataset/hafez/depth/89.png
inflating: mini_depth_dataset/med_decagon/depth/66.png
inflating: mini_depth_dataset/hafez/depth/88.png
inflating: mini_depth_dataset/med_decagon/depth/65.png
inflating: mini_depth_dataset/hafez/depth/86.png
```

```
inflating: mini_depth_dataset/big_decagon/depth/31.png
inflating: mini_depth_dataset/hafez/depth/91.png
inflating: mini_depth_dataset/med_decagon/depth/67.png
inflating: mini_depth_dataset/med_decagon/tactile/64.png
inflating: mini_depth_dataset/hafez/tactile/87.png
inflating: mini_depth_dataset/big_decagon/depth/30.png
inflating: mini_depth_dataset/hafez/tactile/86.png
inflating: mini_depth_dataset/med_decagon/depth/64.png
inflating: mini_depth_dataset/ring/depth/7.png
inflating: mini_depth_dataset/med_decagon/depth/63.png
inflating: mini_depth_dataset/med_decagon/tactile/60.png
inflating: mini_depth_dataset/med_decagon/tactile/61.png
inflating: mini_depth_dataset/big_decagon/depth/28.png
inflating: mini_depth_dataset/hafez/depth/83.png
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inflating: mini_depth_dataset/big_decagon/depth/32.png
inflating: mini_depth_dataset/ring/depth/6.png
inflating: mini_depth_dataset/ring/depth/8.png
inflating: mini_depth_dataset/ring/depth/5.png
inflating: mini_depth_dataset/hafez/tactile/89.png
inflating: mini_depth_dataset/big_decagon/depth/29.png
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inflating: mini_depth_dataset/ring/depth/4.png
inflating: mini_depth_dataset/med_decagon/tactile/57.png
inflating: mini_depth_dataset/hafez/tactile/82.png
inflating: mini_depth_dataset/big_decagon/depth/25.png
inflating: mini_depth_dataset/big_decagon/depth/24.png
inflating: mini_depth_dataset/med_decagon/depth/59.png
inflating: mini_depth_dataset/hafez/tactile/81.png
inflating: mini_depth_dataset/med_decagon/depth/58.png
inflating: mini_depth_dataset/hafez/depth/85.png
inflating: mini_depth_dataset/hafez/tactile/85.png
inflating: mini_depth_dataset/hafez/tactile/80.png
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inflating: mini_depth_dataset/ring/depth/3.png
inflating: mini_depth_dataset/med_decagon/tactile/56.png
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inflating: mini_depth_dataset/hafez/tactile/79.png
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inflating: mini_depth_dataset/hafez/depth/75.png
inflating: mini_depth_dataset/big_decagon/depth/16.png
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inflating: mini_depth_dataset/big_decagon/depth/20.png
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inflating: mini_depth_dataset/hafez/tactile/83.png
inflating: mini_depth_dataset/med_decagon/tactile/49.png
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inflating: mini_depth_dataset/hafez/depth/74.png
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inflating: mini_depth_dataset/med_decagon/tactile/45.png
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inflating: mini_depth_dataset/med_decagon/tactile/42.png
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inflating: mini_depth_dataset/big_decagon/depth/7.png
inflating: mini_depth_dataset/hafez/tactile/72.png
inflating: mini_depth_dataset/big_decagon/depth/11.png
inflating: mini_depth_dataset/med_decagon/tactile/43.png
inflating: mini_depth_dataset/big_decagon/depth/9.png
inflating: mini_depth_dataset/hafez/depth/66.png
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inflating: mini_depth_dataset/med_decagon/depth/45.png
inflating: mini_depth_dataset/med_decagon/depth/47.png
inflating: mini_depth_dataset/med_decagon/tactile/48.png
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inflating: mini_depth_dataset/med_decagon/tactile/39.png
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inflating: mini_depth_dataset/hafez/depth/62.png
inflating: mini_depth_dataset/med_decagon/tactile/44.png
inflating: mini_depth_dataset/hafez/tactile/66.png
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inflating: mini_depth_dataset/hafez/tactile/67.png
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inflating: mini_depth_dataset/hafez/tactile/74.png
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inflating: mini_depth_dataset/med_decagon/depth/43.png
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inflating: mini_depth_dataset/big_decagon/depth/4.png
inflating: mini_depth_dataset/big_decagon/depth/6.png
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inflating: mini_depth_dataset/big_decagon/depth/5.png
inflating: mini_depth_dataset/med_decagon/tactile/36.png
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inflating: mini_depth_dataset/med_decagon/depth/41.png
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inflating: mini_depth_dataset/hafez/tactile/52.png
inflating: mini_depth_dataset/cube/depth/130.png
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inflating: mini_depth_dataset/hafez/tactile/53.png
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inflating: mini_depth_dataset/hafez/tactile/59.png
inflating: mini_depth_dataset/hafez/tactile/51.png
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inflating: mini_depth_dataset/hafez/depth/50.png
inflating: mini_depth_dataset/cube/depth/128.png
inflating: mini_depth_dataset/cube/depth/134.png
inflating: mini_depth_dataset/cube/depth/126.png
inflating: mini_depth_dataset/med_decagon/depth/34.png
inflating: mini_depth_dataset/hafez/depth/49.png
inflating: mini_depth_dataset/cube/depth/127.png
inflating: mini_depth_dataset/hafez/tactile/50.png
inflating: mini_depth_dataset/hafez/tactile/49.png
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inflating: mini_depth_dataset/med_decagon/tactile/9.png
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inflating: mini_depth_dataset/med_decagon/depth/14.png
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inflating: mini_depth_dataset/hafez/depth/28.png
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inflating: mini_depth_dataset/cube/depth/99.png
inflating: mini_depth_dataset/hafez/tactile/23.png
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inflating: mini_depth_dataset/cube/depth/97.png
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inflating: mini_depth_dataset/hafez/tactile/25.png
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inflating: mini_depth_dataset/hafez/depth/27.png
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inflating: mini_depth_dataset/hafez/depth/23.png
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inflating: mini_depth_dataset/hafez/tactile/24.png
inflating: mini_depth_dataset/hafez/tactile/10.png
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inflating: mini_depth_dataset/hafez/tactile/9.png
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inflating: mini_depth_dataset/cube/depth/81.png
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inflating: mini_depth_dataset/cube/depth/86.png
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inflating: mini_depth_dataset/cube/depth/51.png
inflating: mini_depth_dataset/hafez/depth/5.png
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inflating: mini_depth_dataset/cube/depth/37.png
inflating: mini_depth_dataset/cube/depth/54.png
inflating: mini_depth_dataset/cube/depth/38.png
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inflating: mini_depth_dataset/cube/depth/47.png
inflating: mini_depth_dataset/cube/depth/75.png
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inflating: mini_depth_dataset/cube/depth/30.png
inflating: mini_depth_dataset/cube/depth/36.png
inflating: mini_depth_dataset/cube/depth/41.png
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inflating: mini_depth_dataset/cube/depth/25.png
inflating: mini_depth_dataset/cube/depth/44.png
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inflating: mini_depth_dataset/cube/depth/21.png
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inflating: mini_depth_dataset/med_decagon/tactile/13.png
inflating: mini_depth_dataset/cube/depth/15.png
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inflating: mini_depth_dataset/cube/depth/40.png
inflating: mini_depth_dataset/cube/depth/8.png
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inflating: mini_depth_dataset/cube/depth/17.png
inflating: mini_depth_dataset/cube/depth/24.png
inflating: mini_depth_dataset/hafez/depth/30.png
inflating: mini_depth_dataset/cube/depth/18.png
inflating: mini_depth_dataset/cube/depth/26.png
inflating: mini_depth_dataset/cube/depth/12.png
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inflating: mini_depth_dataset/cube/depth/6.png
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inflating: mini_depth_dataset/cube/depth/7.png
inflating: mini_depth_dataset/cube/tactile/131.png
inflating: mini_depth_dataset/cube/tactile/129.png
inflating: mini_depth_dataset/cube/depth/4.png
inflating: mini_depth_dataset/cube/tactile/123.png
inflating: mini_depth_dataset/cube/tactile/111.png
inflating: mini_depth_dataset/cube/tactile/118.png
inflating: mini_depth_dataset/cube/depth/10.png
inflating: mini_depth_dataset/cube/tactile/114.png
inflating: mini_depth_dataset/cube/tactile/104.png
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inflating: mini_depth_dataset/digit_mount/depth/7.png
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inflating: mini_depth_dataset/digit_mount/tactile/10.png
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```

```
In [2]: import torch
import torch.nn as nn
import torchvision
from torchvision import transforms, utils
from skimage import transform
from torch.utils.data import Dataset, DataLoader
import numpy as np
import matplotlib.pyplot as plt
from IPython.core.pylabtools import figsize
import time
import os
import re
import tqdm
import random
from imageio import imread
from pathlib import Path
from PIL import Image, ImageFile
import shutil
from sklearn.model_selection import train_test_split
from torchvision.transforms import ToTensor, Compose

class TactileDataset(Dataset):
    def __init__(self, tactile_dir, depth_dir, transform=None):
        super(TactileDataset, self).__init__()
        self.tactile_dir = tactile_dir
        self.depth_dir = depth_dir
        self.transform = transform if transform is not None else Compose([ToTensor()])

    def __len__(self):
        return len(os.listdir(self.tactile_dir))

    def __get_file_name__(self, idx):
        tactile_image_path = os.path.join(self.tactile_dir, os.listdir(self.tactile_dir)[idx])
        split_path = tactile_image_path.split('/')[-1] # Splitting by '/'
        return split_path[-1] # Return the file name

    def __getitem__(self, idx):
        # read as PIL images
        tactile_image_path = os.path.join(self.tactile_dir, os.listdir(self.tactile_dir)[idx])
        tactile_sample = Image.open(tactile_image_path)
```

```

        if idx >= len(os.listdir(self.depth_dir)):
            depth_image_path = os.path.join(self.depth_dir, os.listdir(self.depth_dir))
        else:
            depth_image_path = os.path.join(self.depth_dir, os.listdir(self.depth_dir))
            depth_sample = Image.open(depth_image_path)

            depth_array = np.array(depth_sample)
            depth_threshold = 0
            contact_mask = depth_array > depth_threshold
            contact_sample = Image.fromarray(contact_mask.astype('uint8') * 255)      # convert to torch tensor
            sample = {'tactile':tactile_sample, 'depth': depth_sample, 'contact': contact_sample}

        return sample

# Add some transformation based on your choice that suits the diversity you expect to
# you can check https://pytorch.org/vision/stable/transforms.html for existing augment
trans_train = transforms.Compose([
    # transforms.ToPILImage(),
    transforms.Resize((320, 240)),
    transforms.ToTensor(),
])

trans_test = transforms.Compose([
    # transforms.ToPILImage(),
    transforms.Resize((320, 240)), # resize to training images shape
    transforms.ToTensor(),
])

# added
# Paths to your original dataset directories
base_dir = 'mini_depth_dataset/ring'
tactile_path = os.path.join(base_dir, 'tactile')
depth_path = os.path.join(base_dir, 'depth')

# Lists of all files
tactile_files = os.listdir(tactile_path)
depth_files = os.listdir(depth_path)

# Split the dataset into training and temporary (for validation and test) sets
tactile_train, tactile_temp, depth_train, depth_temp = train_test_split(
    tactile_files, depth_files, test_size=0.3, random_state=42)

```

```

# Split the temporary set into validation and test sets
tactile_val, tactile_test, depth_val, depth_test = train_test_split(
    tactile_temp, depth_temp, test_size=0.5, random_state=42)

# Function to move files to their respective directories
def move_files(file_list, src_dir, dest_dir):
    os.makedirs(dest_dir, exist_ok=True)
    for file in file_list:
        shutil.copy(os.path.join(src_dir, file), os.path.join(dest_dir, file))

# Creating directories and moving files
train_dir = os.path.join(base_dir, 'train')
validation_dir = os.path.join(base_dir, 'validation')
test_dir = os.path.join(base_dir, 'test')

move_files(tactile_train, tactile_path, os.path.join(train_dir, 'tactile'))
move_files(depth_train, depth_path, os.path.join(train_dir, 'depth'))
move_files(tactile_val, tactile_path, os.path.join(validation_dir, 'tactile'))
move_files(depth_val, depth_path, os.path.join(validation_dir, 'depth'))
move_files(tactile_test, tactile_path, os.path.join(test_dir, 'tactile'))
move_files(depth_test, depth_path, os.path.join(test_dir, 'depth'))

data_dir_train = Path(train_dir)
data_dir_valid = Path(validation_dir)
data_dir_test = Path(test_dir)
bs = 32

dataset_train = TactileDataset(data_dir_train / 'tactile', data_dir_train / 'depth', transform=None)
dataloader_train = DataLoader(dataset_train, batch_size=bs, shuffle=True)

dataset_valid = TactileDataset(data_dir_valid / 'tactile', data_dir_valid / 'depth', transform=None)
dataloader_valid = DataLoader(dataset_valid, batch_size=bs, shuffle=True)

dataset_test = TactileDataset(data_dir_test / 'tactile', data_dir_test / 'depth', transform=None)
dataloader_test = DataLoader(dataset_test, batch_size=bs, shuffle=True)

datalen_train = len(dataset_train)
datalen_valid = len(dataset_valid)
datalen_test = len(dataset_test)

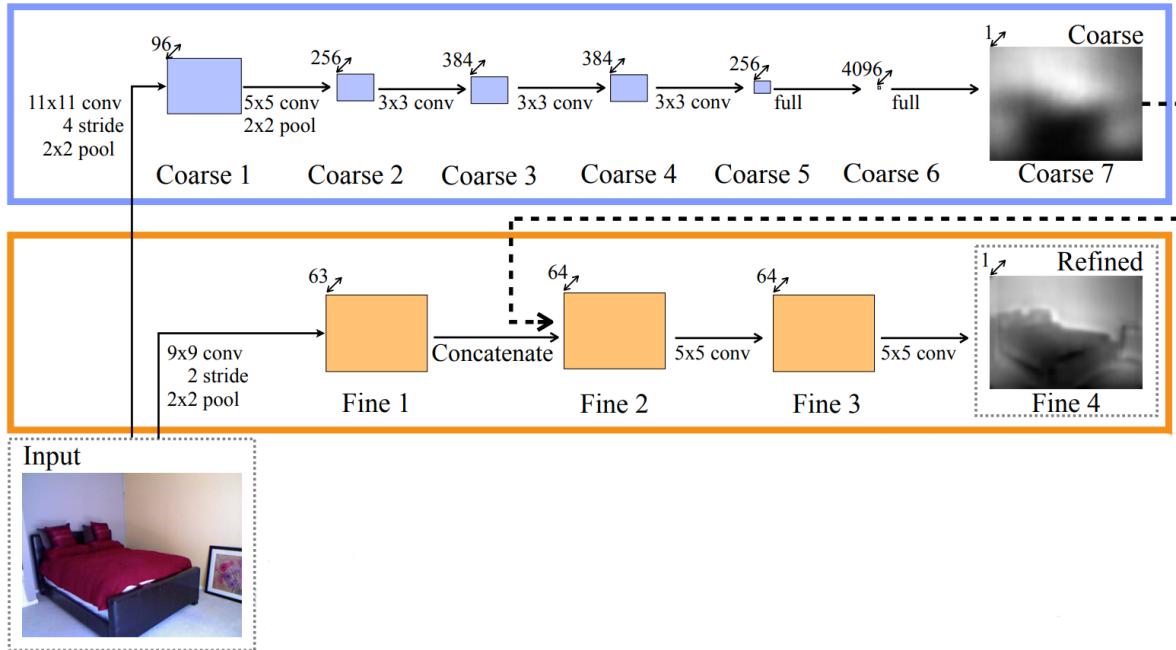
print(datalen_train, datalen_valid, datalen_test)

```

79 17 17

## Step 2: Network Design

Design the neural network, incorporating various [layers](#). Additionally, consider initializing the layer weights using predefined [PyTorch initializers](#). Inspired by [1], you may use Coarse network for contact prediction and a Fine network for depth prediction, providing higher resolution.



```
In [3]: import torch
import torch.nn as nn
import torch.nn.functional as F

class ContactNet(nn.Module):
    def __init__(self, init=True):
        super(ContactNet, self).__init__()
        # Define the network Layers for contact prediction
        self.conv1 = nn.Conv2d(3, 96, kernel_size=11, stride=4, padding=2)
        self.bn1 = nn.BatchNorm2d(96)
        self.pool1 = nn.MaxPool2d(kernel_size=2, stride=2)

        self.conv2 = nn.Conv2d(96, 256, kernel_size=5, padding=2)
        self.bn2 = nn.BatchNorm2d(256)
        self.pool2 = nn.MaxPool2d(kernel_size=2, stride=2)

        self.conv3 = nn.Conv2d(256, 384, kernel_size=3, padding=1)
        self.bn3 = nn.BatchNorm2d(384)

        self.conv4 = nn.Conv2d(384, 384, kernel_size=3, padding=1)
        self.bn4 = nn.BatchNorm2d(384)

        self.conv5 = nn.Conv2d(384, 256, kernel_size=3, padding=1)
        self.bn5 = nn.BatchNorm2d(256)

        self.fc1 = nn.Linear(68096, 4096) # Adjust the input features to match your f
        self.bn6 = nn.BatchNorm1d(4096)

        self.fc2 = nn.Linear(4096, 1 * 74 * 55) # Output size needs to be adapted bas

        if init:
            self._initialize_weights()

    def _initialize_weights(self):
        for m in self.modules():
            if isinstance(m, nn.Conv2d):
                nn.init.kaiming_normal_(m.weight, mode='fan_in', nonlinearity='relu')
                if m.bias is not None:
```

```

        nn.init.constant_(m.bias, 0)
    elif isinstance(m, nn.Linear):
        nn.init.kaiming_normal_(m.weight, mode='fan_in', nonlinearity='relu')
        nn.init.constant_(m.bias, 0)

    def forward(self, x):
        x = self.pool1(F.relu(self.bn1(self.conv1(x))))
        x = self.pool2(F.relu(self.bn2(self.conv2(x))))
        x = F.relu(self.bn3(self.conv3(x)))
        x = F.relu(self.bn4(self.conv4(x)))
        x = F.relu(self.bn5(self.conv5(x)))
        x = x.view(x.size(0), -1) # Flatten the tensor for the fully connected layer

        x = F.relu(self.bn6(self.fc1(x)))
        c = self.fc2(x)
        c = c.view(-1, 1, 74, 55)
        return c

class TactileDepthNet(nn.Module):
    def __init__(self, init=True):
        super(TactileDepthNet, self).__init__()
        # Define the network layers for depth prediction
        self.fine1 = nn.Conv2d(3, 63, kernel_size=9, stride=2, padding=2)
        self.pool1 = nn.MaxPool2d(kernel_size=2, stride=2)
        # Assuming concatenation with a 256-channel feature map of size 55x74 from ContactNet
        self.fine2 = nn.Conv2d(64, 64, kernel_size=5, padding=1)
        self.fine3 = nn.Conv2d(64, 64, kernel_size=5, padding=1)

        # Adjusting the final convolution to get the desired output size
        self.fine4 = nn.Conv2d(64, 1, kernel_size=5, padding=1)

        # Adding an adaptive pooling layer to ensure the output size
        self.adaptive_pool = nn.AdaptiveAvgPool2d((74, 55))

        if init:
            self._initialize_weights()

    def _initialize_weights(self):
        for m in self.modules():
            if isinstance(m, nn.Conv2d):
                nn.init.kaiming_normal_(m.weight, mode='fan_out', nonlinearity='relu')
                if m.bias is not None:
                    nn.init.constant_(m.bias, 0)
            elif isinstance(m, nn.Linear):
                nn.init.xavier_normal_(m.weight)
                nn.init.constant_(m.bias, 0)

    def forward(self, x, contact_output_batch):
        x = self.pool1(F.relu(self.fine1(x)))
        contact_output_batch_resized = F.interpolate(contact_output_batch, size=(x.size(2), x.size(3)))
        # Concatenate with contact output feature map
        x = torch.cat((x, contact_output_batch_resized), 1)
        x = F.relu(self.fine2(x))
        x = F.relu(self.fine3(x))
        x = self.fine4(x)

        # Upsample to desired output size
        d = F.interpolate(x, size=(240, 320), mode='bilinear', align_corners=False)

```

```

    return d

# Assuming 'device' is defined (e.g., as 'cuda' or 'cpu')
device = torch.device('cuda' if torch.cuda.is_available() else 'cpu')

# Initialize models
contact_model = ContactNet(init=True).to(device)
tactile_depth_model = TactileDepthNet(init=True).to(device)

dummy_input = torch.randn(32, 3, 320, 240)

# Test ContactNet
contact_output = contact_model(dummy_input)
print("ContactNet Output Size:", contact_output.size())

# Test TactileDepthNet
# Assuming contact_output is correctly sized and batched
tactile_output = tactile_depth_model(dummy_input, contact_output)
print("TactileDepthNet Output Size:", tactile_output.size())

```

ContactNet Output Size: torch.Size([32, 1, 74, 55])  
TactileDepthNet Output Size: torch.Size([32, 1, 240, 320])

## Step 3: Loss Function

In [4]:

```

class MSE_Loss(nn.Module):
    def __init__(self):
        super(MSE_Loss, self).__init__()

    def forward(self, pred, target):
        # Mean Squared Error Loss
        return F.mse_loss(pred, target)

# Loss Functions
contact_criterion = MSE_Loss()
tactile_depth_criterion = MSE_Loss()

# optimizer
contact_optimizer = torch.optim.Adam(contact_model.parameters(), lr=0.0001)
tactile_depth_optimizer = torch.optim.Adam(tactile_depth_model.parameters(), lr=0.0005)

# data parallel
contact_model = nn.DataParallel(contact_model)
tactile_depth_model = nn.DataParallel(tactile_depth_model)

```

In [5]:

```

def plot_losses(train_losses, valid_losses):
    plt.plot(train_losses, label='train losses')
    plt.plot(valid_losses, label='valid losses')

    plt.xlabel("Iterations")
    plt.ylabel("Losses")

    plt.legend()
    plt.title("Losses")
    plt.grid(True)

```

```
In [6]: def plot_accuracy(train_acc, valid_acc):
    plt.plot(train_acc, label='train accuracy')
    plt.plot(valid_acc, label='valid accuracy')

    plt.xlabel("Iterations")
    plt.ylabel("Accuracy")

    plt.legend()
    plt.title("Accuracy")
    plt.grid(True)
```

```
In [7]: def plot_mse(train_mse, valid_mse):
    plt.plot(train_mse, label='Train MSE')
    plt.plot(valid_mse, label='Validation MSE')
    plt.title('Mean Squared Error over Epochs')
    plt.xlabel('Epoch')
    plt.ylabel('MSE')
    plt.legend()
    plt.show()
```

## Step 4: Training Networks

```
In [8]: ## Contact Model
def dice_coefficient(output, target):
    smooth = 1.0 # Add smooth to avoid division by zero error
    iflat = output.view(-1)
    tflat = target.view(-1)
    intersection = (iflat * tflat).sum()
    return (2. * intersection + smooth) / (iflat.sum() + tflat.sum() + smooth)

contact_epochs = 15
train_losses = []
valid_losses = []
tl_b = []
train_dice_scores = []
valid_dice_scores = []
start = time.time()

for epoch in tqdm.tqdm(range(contact_epochs)):
    train_loss = 0
    train_dice = 0
    contact_model.train()

    for i, samples in enumerate(dataloader_train):
        tactiles = samples['tactile'].float().to(device)
        contacts = samples['contact'].float().to(device)
        contacts_resized = F.interpolate(contacts, size=(74, 55), mode='bilinear', align_corners=True)

        # forward pass
        output = contact_model(tactiles)

        # compute contact loss
        loss = contact_criterion(output, contacts_resized)

        # compute dice score
        dice_score = dice_coefficient(output, contacts_resized)
        train_dice += dice_score.item()
```

```

# backward pass
contact_optimizer.zero_grad()
loss.backward()

# After loss.backward()
# for name, param in contact_model.named_parameters():
#     if param.requires_grad and "conv1.weight" in name:
#         print(f"Gradients of {name}: {param.grad}")

# optimization
contact_optimizer.step()

train_loss += loss.item()
tl_b.append(loss.item())


if epoch == contact_epochs - 1:
    for j in range(tactiles.size(0)):
        tactile_image = tactiles[j].cpu().permute(1, 2, 0) # Change the order of
        true_contact = contacts_resized[j].cpu().squeeze() # Remove unnecessary c
        predicted_contact = output[j].cpu().squeeze()

        # Apply threshold to predicted contact mask to make it binary
        predicted_contact_binary = predicted_contact > 0.5

        # Plot the images
        plt.figure(figsize=(12, 4))
        plt.subplot(1, 3, 1)
        plt.imshow(tactile_image.numpy(), cmap='gray')
        plt.title(f'Tactile Image {i * dataloader_valid.batch_size + j}')
        plt.axis('off')

        plt.subplot(1, 3, 2)
        plt.imshow(true_contact.numpy(), cmap='gray')
        plt.title('True Contact Mask')
        plt.axis('off')

        plt.subplot(1, 3, 3)
        plt.imshow(predicted_contact_binary.numpy(), cmap='gray')
        plt.title('Predicted Contact Mask')
        plt.axis('off')

    plt.show()

train_losses.append(train_loss / datalen_train)
train_dice_scores.append(train_dice / len(dataloader_train))

valid_loss = 0
valid_dice = 0
contact_model.eval()

with torch.no_grad():
    for i, samples in enumerate(dataloader_valid):
        tactiles = samples['tactile'].float().to(device)
        contacts = samples['contact'].float().to(device)
        contacts_resized = F.interpolate(contacts, size=(74, 55), mode='bilinear',
                                         align_corners=True)

        # forward pass contact_model
        output = contact_model(tactiles)

```

```

# compute contact loss
loss = contact_criterion(output, contacts_resized)

valid_loss += loss.item()
dice_score = dice_coefficient(output, contacts_resized)
valid_dice += dice_score.item()

valid_losses.append(valid_loss / datalen_valid)
valid_dice_scores.append(valid_dice / len(dataloader_valid))

# save contact_model with torch.save
torch.save(contact_model.state_dict(), f"contact_model_epoch_{epoch}.pt")

elapse = time.time() - start
print('Time used (Sec): ', elapse, ' per epoch used: ', elapse / contact_epochs)
plt.figure(figsize=(10, 5))
plt.subplot(1, 2, 1)
plot_losses(train_losses, valid_losses)
plt.subplot(1, 2, 2)
plot_accuracy(train_dice_scores, valid_dice_scores)

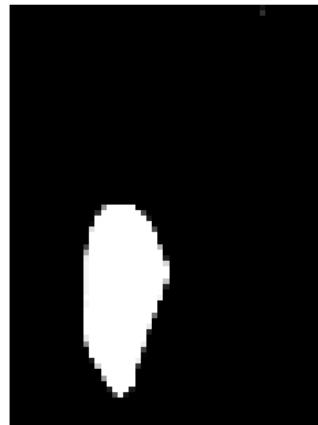
```

93%|██████████| 14/15 [10:35<00:40, 40.73s/it]

Tactile Image 64



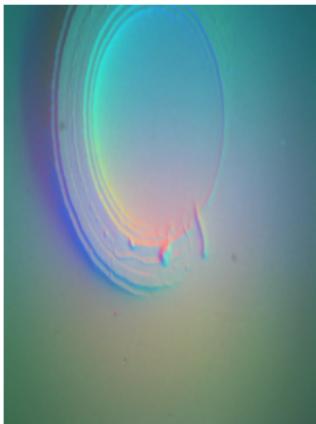
True Contact Mask



Predicted Contact Mask



Tactile Image 65



True Contact Mask



Predicted Contact Mask



Tactile Image 66



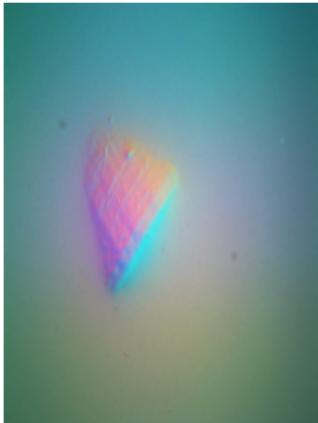
True Contact Mask



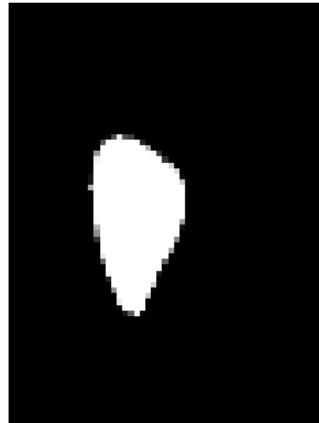
Predicted Contact Mask



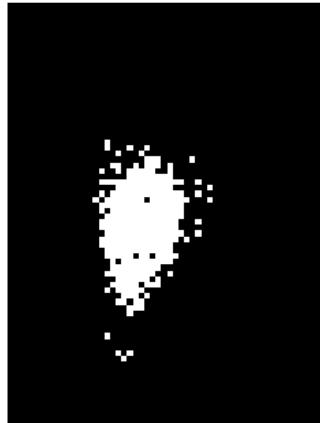
Tactile Image 67



True Contact Mask



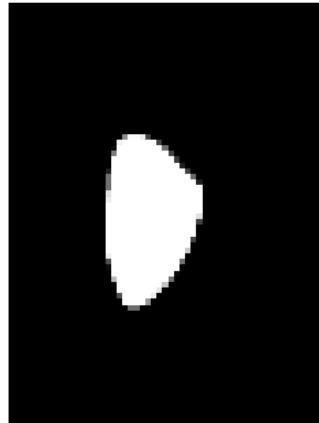
Predicted Contact Mask



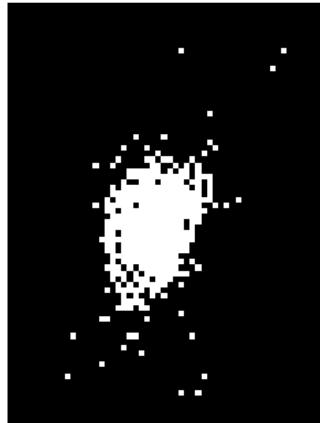
Tactile Image 68



True Contact Mask



Predicted Contact Mask



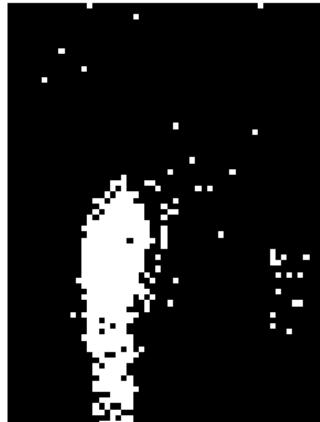
Tactile Image 69



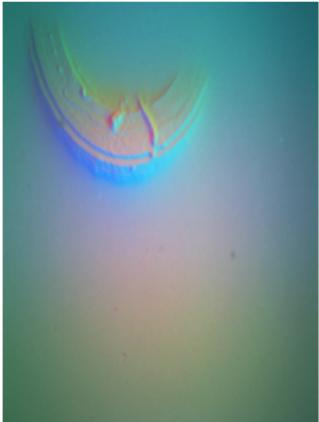
True Contact Mask



Predicted Contact Mask



Tactile Image 70



True Contact Mask



Predicted Contact Mask



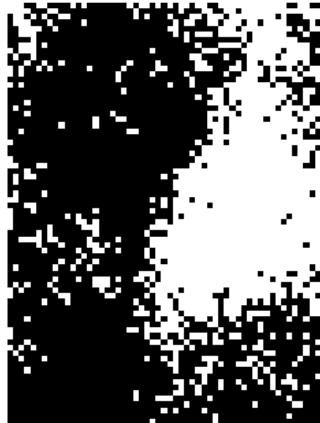
Tactile Image 71



True Contact Mask



Predicted Contact Mask



Tactile Image 72



True Contact Mask



Predicted Contact Mask



Tactile Image 73



True Contact Mask



Predicted Contact Mask



Tactile Image 74



True Contact Mask



Predicted Contact Mask



Tactile Image 75



True Contact Mask



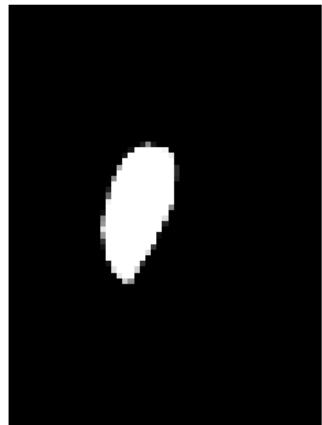
Predicted Contact Mask



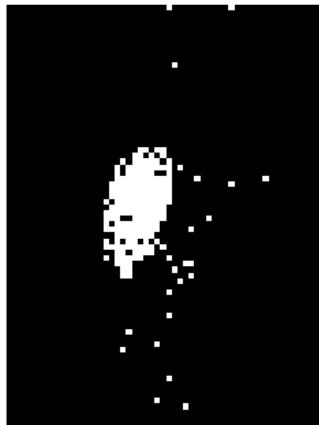
Tactile Image 76



True Contact Mask



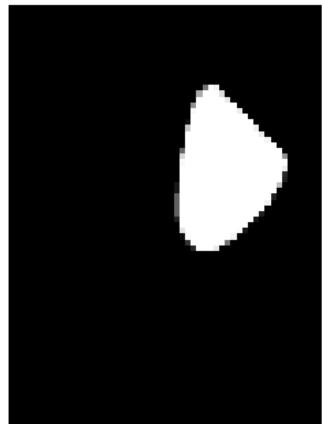
Predicted Contact Mask



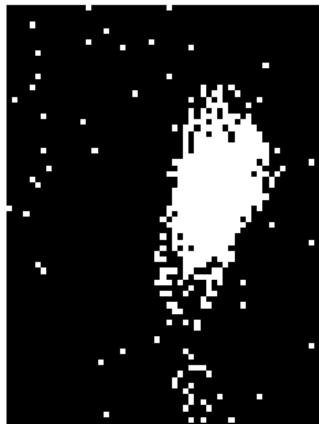
Tactile Image 77

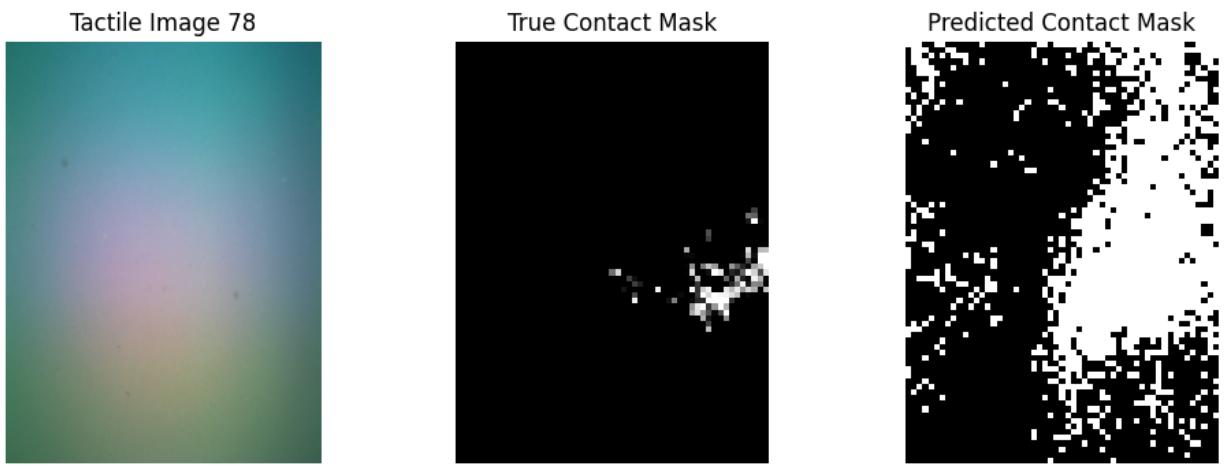


True Contact Mask

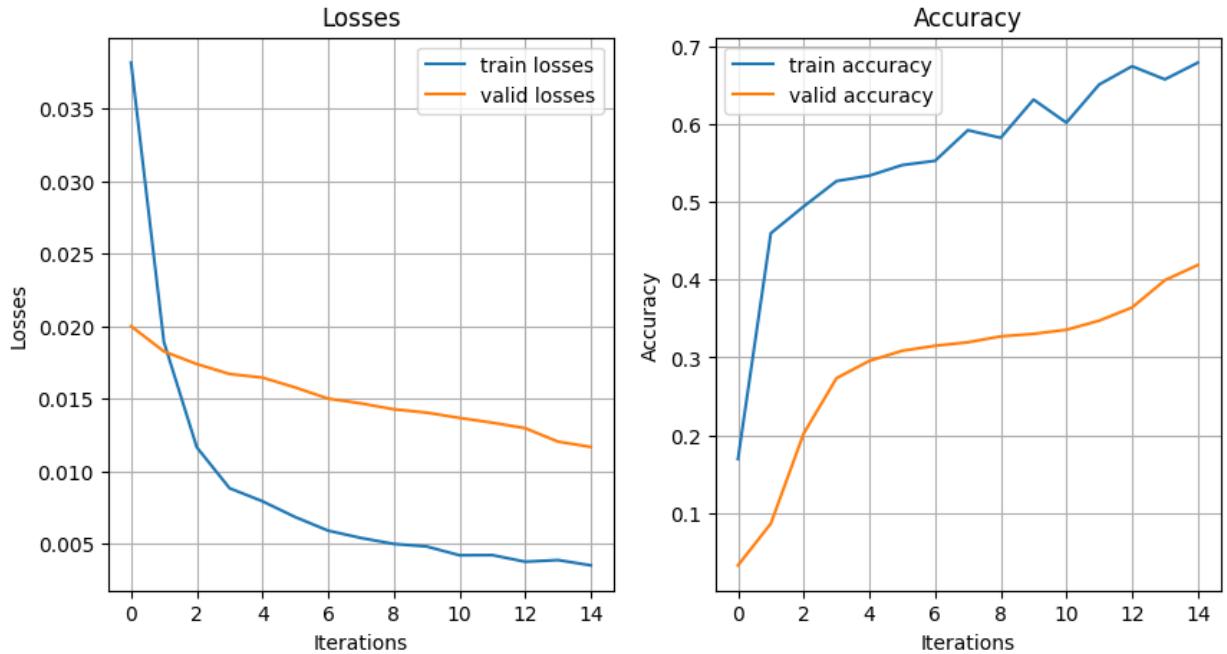


Predicted Contact Mask





100% |██████████| 15/15 [11:21<00:00, 45.44s/it]  
 Time used (Sec): 681.6220779418945 per epoch used: 45.441471862792966



```
In [9]: # Tactile Depth Model Training Loop
train_losses_, valid_losses_ = [], []
train_mse_scores = []
valid_mse_scores = []
tl_b_ = []
start = time.time()
depth_epochs = 15
mse_loss_fn = nn.MSELoss()

for epoch in range(depth_epochs):
    print('>', end=' ')
    train_loss = 0
    train_mse = 0
    tactile_depth_model.train()
    contact_model.eval() # Ensure contact_model is in evaluation mode

    for i, samples in enumerate(dataloader_train):
        tactiles = samples['tactile'].float().to(device)
        depths = samples['depth'].float().to(device)
        depths_resized = F.interpolate(depths, size=(240, 320), mode='bilinear', alignr
```

```

    with torch.no_grad():
        # Get the output from the contact model
        contact_output = contact_model(tactiles)

        # Forward pass in TactileDepthNet
        output = tactile_depth_model(tactiles, contact_output)

        # compute mse score
        mse_score = mse_loss_fn(output, depths_resized)
        train_mse += mse_score.item()

        # Compute loss
        loss = tactile_depth_criterion(output, depths_resized)
        train_loss += loss.item()
        tl_b_.append(loss.item())

        # Backward pass
        tactile_depth_optimizer.zero_grad()
        loss.backward()

        # Optimization
        tactile_depth_optimizer.step()

    if epoch == depth_epochs - 1:
        for j in range(tactiles.size(0)):
            tactile_image = tactiles[j].cpu().permute(1, 2, 0) # Change the order of
            true_depths = depths_resized[j].cpu().squeeze() # Remove unnecessary dime
            predicted_depth = output[j].cpu().squeeze()

            # Apply threshold to predicted contact mask to make it binary

            # Plot the images
            plt.figure(figsize=(12, 4))
            plt.subplot(1, 3, 1)
            plt.imshow(tactile_image.numpy(), cmap='gray')
            plt.title(f'Tactile Image {i * dataloader_valid.batch_size + j}')
            plt.axis('off')

            plt.subplot(1, 3, 2)
            plt.imshow(true_depths.numpy(), cmap='gray')
            plt.title('True Depths Mask')
            plt.axis('off')

            predicted_depth_numpy = predicted_depth.detach().cpu().numpy()
            plt.subplot(1, 3, 3)
            plt.imshow(predicted_depth_numpy, cmap='gray')
            plt.title('Predicted Depths Mask')
            plt.axis('off')

            plt.show()

        train_losses_.append(train_loss / datalen_train)
        train_mse_scores.append(train_mse / len(dataloader_train))
        valid_loss = 0
        valid_mse = 0
        tactile_depth_model.eval()

        with torch.no_grad():
            for i, samples in enumerate(dataloader_valid):
                tactiles = samples['tactile'].float().to(device)

```

```

depths = samples['depth'].float().to(device)
depths_resized = F.interpolate(depths, size=(240, 320), mode='bilinear', align_corners=True)

# Get the output from the contact model
contact_output = contact_model(tactiles)

# Forward pass in TactileDepthNet
output = tactile_depth_model(tactiles, contact_output)

# Compute Loss
loss = tactile_depth_criterion(output, depths_resized)
valid_loss += loss.item()
mse_score = mse_loss_fn(output, depths_resized)
valid_mse += mse_score.item()

valid_losses_.append(valid_loss / datalen_valid)
valid_mse_scores.append(valid_mse / len(dataloader_valid))

# Save model
torch.save(tactile_depth_model.state_dict(), f"tactile_depth_model_epoch_{epoch}.pt")

elapse = time.time() - start
print('Time used (Sec): ', elapse, ' per epoch used: ', elapse / depth_epochs)
plt.figure(figsize=(10, 5))
plt.subplot(1, 2, 1)
plot_losses(train_losses, valid_losses)
plt.subplot(1, 2, 2)
plot_accuracy(train_mse_scores, valid_mse_scores)

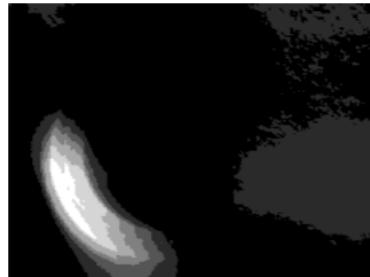
```

> > > > > > > > > > > >

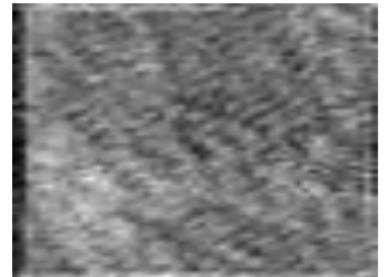
Tactile Image 64



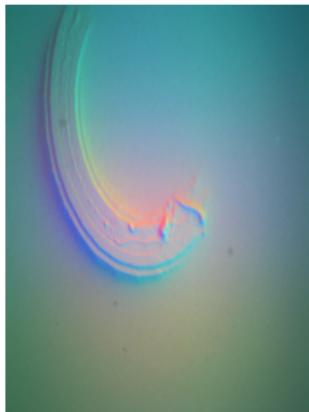
True Depths Mask



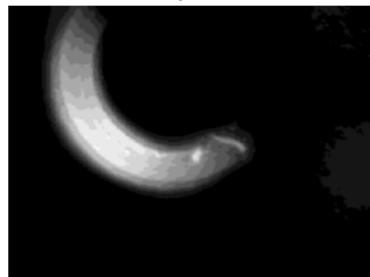
Predicted Depths Mask



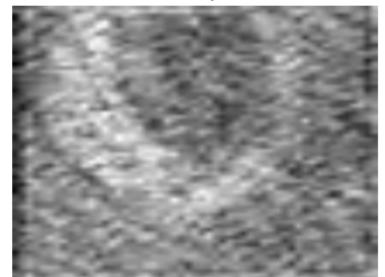
Tactile Image 65



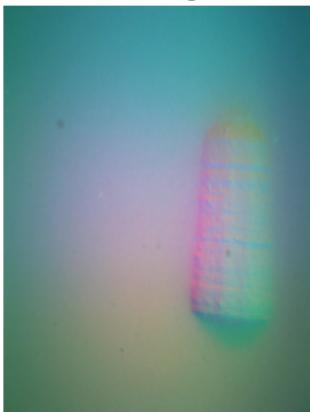
True Depths Mask



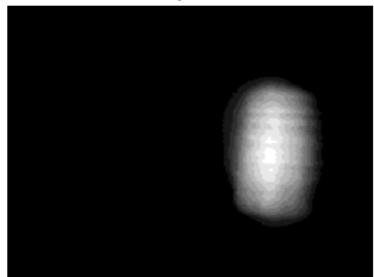
Predicted Depths Mask



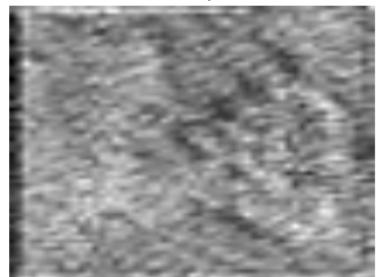
Tactile Image 66



True Depths Mask



Predicted Depths Mask



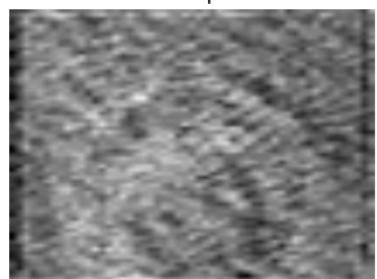
Tactile Image 67



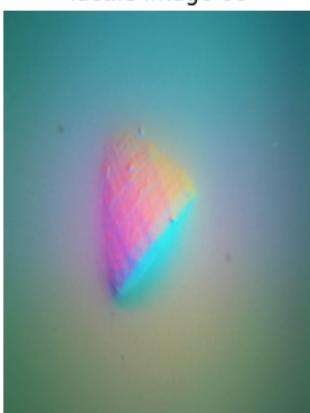
True Depths Mask



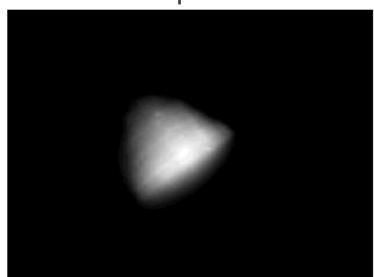
Predicted Depths Mask



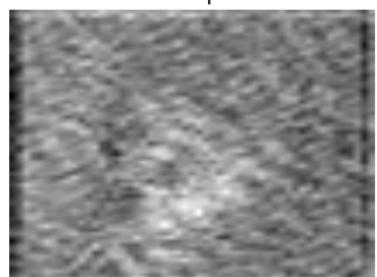
Tactile Image 68



True Depths Mask



Predicted Depths Mask



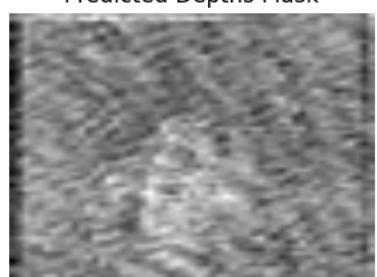
Tactile Image 69



True Depths Mask



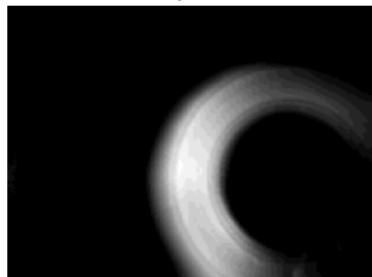
Predicted Depths Mask



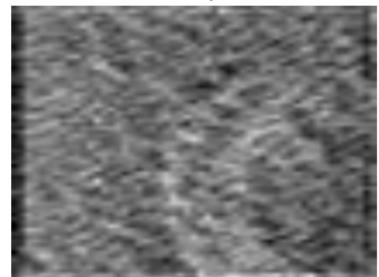
Tactile Image 70



True Depths Mask



Predicted Depths Mask



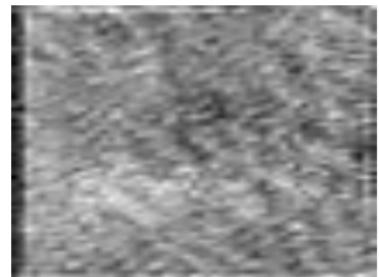
Tactile Image 71



True Depths Mask



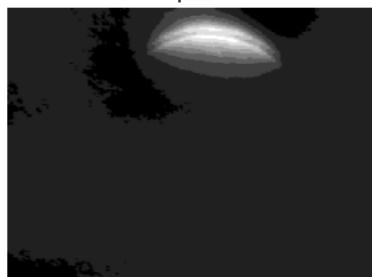
Predicted Depths Mask



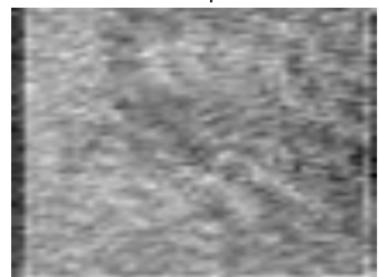
Tactile Image 72



True Depths Mask



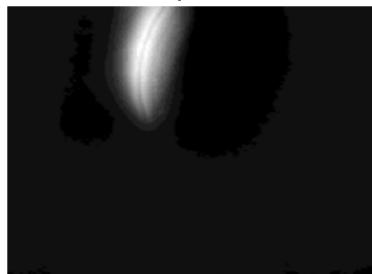
Predicted Depths Mask



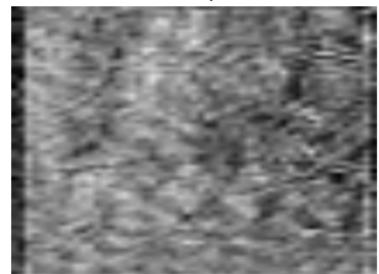
Tactile Image 73



True Depths Mask



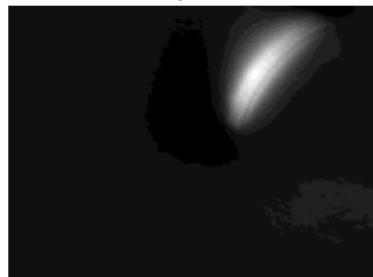
Predicted Depths Mask



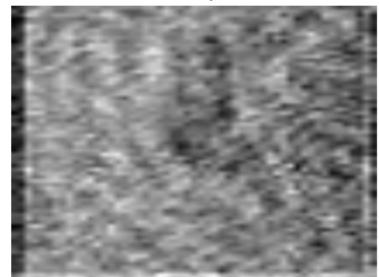
Tactile Image 74



True Depths Mask



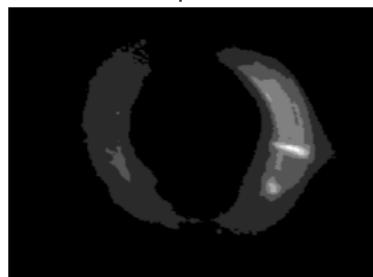
Predicted Depths Mask



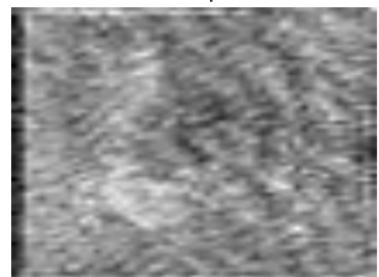
Tactile Image 75



True Depths Mask



Predicted Depths Mask



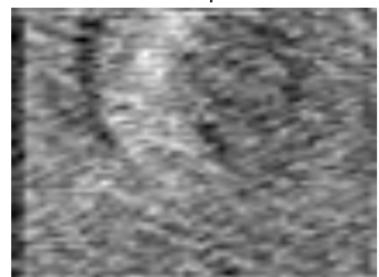
Tactile Image 76



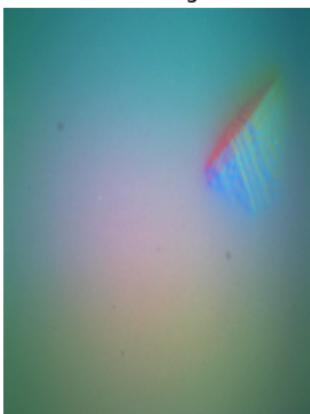
True Depths Mask



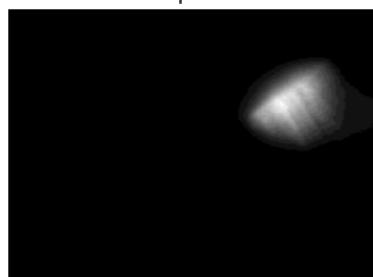
Predicted Depths Mask



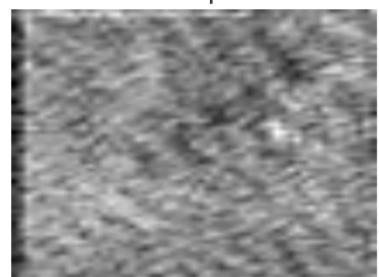
Tactile Image 77



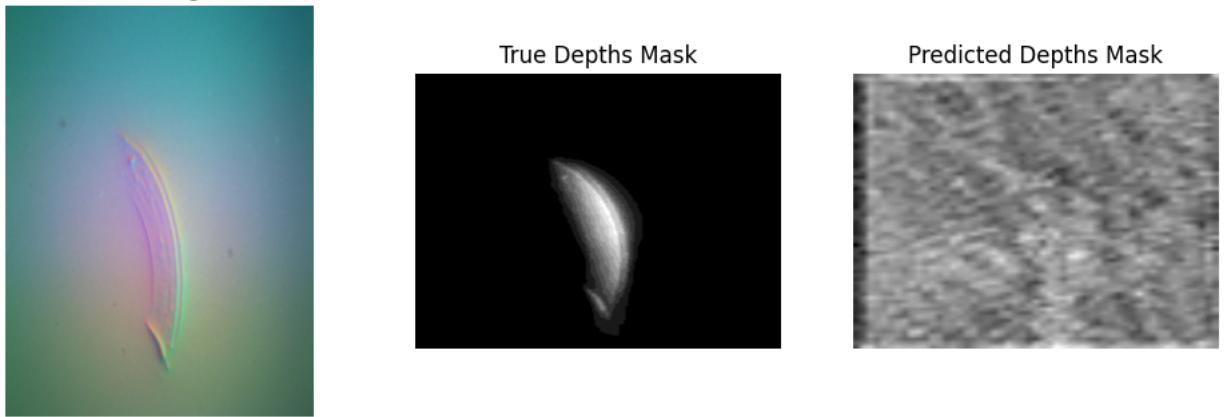
True Depths Mask



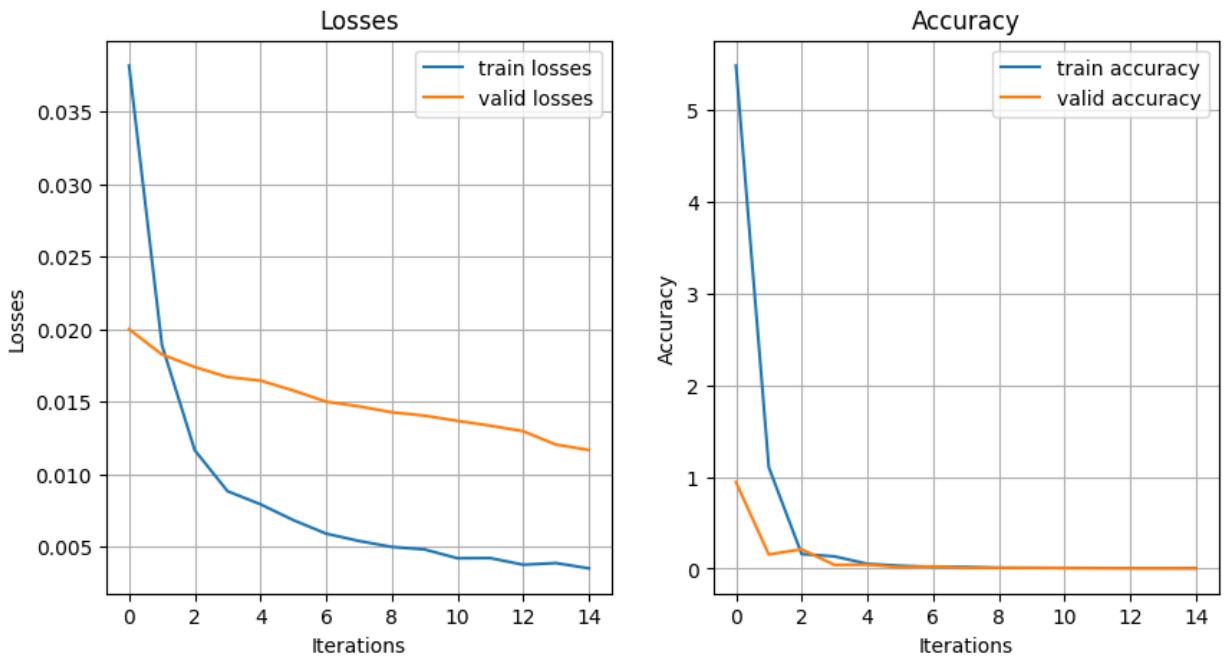
Predicted Depths Mask



Tactile Image 78



Time used (Sec): 358.2681031227112 per epoch used: 23.884540208180745



```
In [ ]: # Overfit on single batch for DEPTH
overfit_batch = next(iter(dataloader_train))
train_losses_, valid_losses_ = [], []
train_mse_scores = []
valid_mse_scores = []
tl_b_ = []
start = time.time()
num_epochs = 50
mse_loss_fn = nn.MSELoss()

for epoch in range(num_epochs):
    print('>', end=' ')
    train_loss = 0
    train_mse = 0
    tactile_depth_model.train()
    contact_model.eval() # Ensure contact_model is in evaluation mode

    tactiles = samples['tactile'].float().to(device)
    depths = samples['depth'].float().to(device)
    depths_resized = F.interpolate(depths, size=(74, 55), mode='bilinear', align_corners=True)
    contact_model(depths_resized)
```

```

with torch.no_grad():
    # Get the output from the contact model
    contact_output = contact_model(tactiles)

    # Forward pass in TactileDepthNet
    output = tactile_depth_model(tactiles, contact_output)

    # compute mse score
    mse_score = mse_loss_fn(output, depths_resized)
    train_mse += mse_score.item()

    # Compute loss
    loss = tactile_depth_criterion(output, depths_resized)
    train_loss += loss.item()
    tl_b_.append(loss.item())

    # Backward pass
    tactile_depth_optimizer.zero_grad()
    loss.backward()

    # Optimization
    tactile_depth_optimizer.step()

if epoch == num_epochs - 1:
    for j in range(tactiles.size(0)):
        tactile_image = tactiles[j].cpu().permute(1, 2, 0) # Change the order of
        true_depths = depths_resized[j].cpu().squeeze() # Remove unnecessary dime
        predicted_depth = output[j].cpu().squeeze()

        # Apply threshold to predicted contact mask to make it binary

        # Plot the images
        plt.figure(figsize=(12, 4))
        plt.subplot(1, 3, 1)
        plt.imshow(tactile_image.numpy(), cmap='gray')
        plt.title(f'Tactile Image {i * dataloader_valid.batch_size + j}')
        plt.axis('off')

        plt.subplot(1, 3, 2)
        plt.imshow(true_depths.numpy(), cmap='gray')
        plt.title('True Depths Mask')
        plt.axis('off')

        predicted_depth_numpy = predicted_depth.detach().cpu().numpy()
        plt.subplot(1, 3, 3)
        plt.imshow(predicted_depth_numpy, cmap='gray')
        plt.title('Predicted Depths Mask')
        plt.axis('off')

    plt.show()

train_losses_.append(train_loss / datalen_train)
train_mse_scores.append(train_mse / len(dataloader_train))
valid_loss = 0
valid_mse = 0
tactile_depth_model.eval()

with torch.no_grad():
    for i, samples in enumerate(dataloader_valid):
        tactiles = samples['tactile'].float().to(device)

```

```

depths = samples['depth'].float().to(device)
depths_resized = F.interpolate(depths, size=(74, 55), mode='bilinear', ali

# Get the output from the contact model
contact_output = contact_model(tactiles)

# Forward pass in TactileDepthNet
output = tactile_depth_model(tactiles, contact_output)

# Compute loss
loss = tactile_depth_criterion(output, depths_resized)
valid_loss += loss.item()
mse_score = mse_loss_fn(output, depths_resized)
valid_mse += mse_score.item()

valid_losses_.append(valid_loss / datalen_valid)
valid_mse_scores.append(valid_mse / len(dataloader_valid))

# Save model
torch.save(tactile_depth_model.state_dict(), f"tactile_depth_model_epoch_{epoch}.p

elapse = time.time() - start
print('Time used (Sec): ', elapse, ' per epoch used: ', elapse / num_epochs)
plt.figure(figsize=(10, 5))
plt.subplot(1, 2, 1)
plot_losses(train_losses, valid_losses)
plt.subplot(1, 2, 2)
plot_mse(train_mse_scores, valid_mse_scores)

```

```
-----  
KeyboardInterrupt                                Traceback (most recent call last)  
<ipython-input-10-9b22d381b6da> in <cell line: 11>()  
    26  
    27      # Forward pass in TactileDepthNet  
---> 28      output = tactile_depth_model(tactiles, contact_output)  
    29  
    30      # compute mse score  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __wrapped_call__(  
    self, *args, **kwargs)  
    1516          return self._compiled_call_impl(*args, **kwargs) # type: ignore  
[misc]  
    1517      else:  
-> 1518          return self._call_impl(*args, **kwargs)  
    1519  
    1520  def __call_impl(self, *args, **kwargs):  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __call_impl(  
    self, *args, **kwargs)  
    1525          or __global_backward_pre_hooks or __global_backward_hooks  
    1526          or __global_forward_hooks or __global_forward_pre_hooks):  
-> 1527          return forward_call(*args, **kwargs)  
    1528  
    1529      try:  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/parallel/data_parallel.py in forward  
(self, *inputs, **kwargs)  
    165          with torch.autograd.profiler.record_function("DataParallel.forward"):  
    166              if not self.device_ids:  
--> 167                  return self.module(*inputs, **kwargs)  
    168  
    169          for t in chain(self.module.parameters(), self.module.buffers()):  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __wrapped_call__(  
    self, *args, **kwargs)  
    1516          return self._compiled_call_impl(*args, **kwargs) # type: ignore  
[misc]  
    1517      else:  
-> 1518          return self._call_impl(*args, **kwargs)  
    1519  
    1520  def __call_impl(self, *args, **kwargs):  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __call_impl(  
    self, *args, **kwargs)  
    1525          or __global_backward_pre_hooks or __global_backward_hooks  
    1526          or __global_forward_hooks or __global_forward_pre_hooks):  
-> 1527          return forward_call(*args, **kwargs)  
    1528  
    1529      try:  
  
<ipython-input-3-28e947679845> in forward(self, x, contact_output_batch)  
    87  
    88      def forward(self, x, contact_output_batch):  
---> 89          x = self.pool1(F.relu(self.fine1(x)))  
    90          contact_output_batch_resized = F.interpolate(contact_output_batch, si  
ze=(x.size(2), x.size(3)), mode='bilinear', align_corners=False)  
    91          # Concatenate with contact output feature map  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __wrapped_call__(
```

```

    mpl(self, *args, **kwargs)
1516             return self._compiled_call_impl(*args, **kwargs) # type: ignore
[misc]
1517         else:
-> 1518             return self._call_impl(*args, **kwargs)
1519
1520     def _call_impl(self, *args, **kwargs):
1521
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in _call_impl(self, *args, **kwargs)
1525             or _global_backward_pre_hooks or _global_backward_hooks
1526             or _global_forward_hooks or _global_forward_pre_hooks):
-> 1527             return forward_call(*args, **kwargs)
1528
1529     try:
1530
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/conv.py in forward(self, input)
458
459     def forward(self, input: Tensor) -> Tensor:
--> 460         return self._conv_forward(input, self.weight, self.bias)
461
462 class Conv3d(_ConvNd):
463
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/conv.py in _conv_forward(self, input, weight, bias)
454             weight, bias, self.stride,
455             _pair(0), self.dilation, self.groups)
-> 456         return F.conv2d(input, weight, bias, self.stride,
457                         self.padding, self.dilation, self.groups)
458

```

`KeyboardInterrupt:`

```

In [ ]: import matplotlib.pyplot as plt
import numpy as np
import torch

# Assuming you have defined your model, dataloader, and other necessary components

# Initialize variables
lr_start = 1e-6
lr_end = 1e-1
num_iterations = 10000 # Adjust this based on your dataset size and desired granularity
lr_lambda = lambda x: np.exp(x * np.log(lr_end / lr_start) / num_iterations)
scheduler = torch.optim.lr_scheduler.LambdaLR(tactile_depth_optimizer, lr_lambda)
train_losses = []
lrs = []
dataset_train = TactileDataset(data_dir_train / 'tactile', data_dir_train / 'depth', t
dataloader_train = DataLoader(dataset_train, batch_size=bs, shuffle=True)

# Training Loop
for iteration, samples in enumerate(dataloader_train):
    if iteration >= num_iterations:
        break

    # Training step
    tactiles = samples['tactile'].float().to(device)
    depths = samples['depth'].float().to(device)
    depths_resized = F.interpolate(depths, size=(74, 55), mode='bilinear', align_corners=True)
    tactile_depth_optimizer.zero_grad()
    loss = criterion(tactiles, depths_resized)
    loss.backward()
    tactile_depth_optimizer.step()
    train_losses.append(loss.item())
    lrs.append(scheduler.get_lr())

# Plotting
plt.plot(lrs, train_losses)
plt.xscale('log')
plt.xlabel('Learning Rate')
plt.ylabel('Training Loss')
plt.title('Training Loss vs Learning Rate')
plt.show()

```

```

# Get the output from the contact model
contact_output = contact_model(tactiles)

# Forward pass in TactileDepthNet
output = tactile_depth_model(tactiles, contact_output)

# Compute loss
loss = tactile_depth_criterion(output, depths_resized)

# Backward pass and optimization
tactile_depth_optimizer.zero_grad()
loss.backward()
tactile_depth_optimizer.step()

# Update Learning rate
scheduler.step()
current_lr = scheduler.get_last_lr()[0]
lrs.append(current_lr)
train_losses.append(loss.item())

# Print all Learning rates
for i, lr in enumerate(lrs):
    print(f"Iteration {i}, Learning Rate {lr}")

# After this Loop, lrs and train_losses should have the same Length

# Plotting
plt.figure(figsize=(10, 5))
plt.plot(range(len(train_losses)), train_losses)
plt.xlabel('Iteration')
plt.ylabel('Loss')
plt.title('Loss vs. Iteration')
plt.show()

# And for Learning rate:
plt.figure(figsize=(10, 5))
plt.plot(range(len(lrs)), lrs)
plt.xlabel('Iteration')
plt.ylabel('Learning Rate')
plt.title('Learning Rate over Iterations')
plt.show()

```

```
-----  
KeyboardInterrupt                                     Traceback (most recent call last)  
<ipython-input-18-1d24d6b908ba> in <cell line: 19>()  
    27  
    28     # Get the output from the contact model  
--> 29     contact_output = contact_model(tactiles)  
    30  
    31     # Forward pass in TactileDepthNet  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __wrapped_call__(  
    self, *args, **kwargs)  
    1516         return self._compiled_call_impl(*args, **kwargs) # type: ignore  
[misc]  
    1517     else:  
-> 1518         return self._call_impl(*args, **kwargs)  
    1519  
    1520     def __call_impl(self, *args, **kwargs):  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __call__(self, *args, **kwargs)  
    1525             or __global_backward_pre_hooks or __global_backward_hooks  
    1526             or __global_forward_hooks or __global_forward_pre_hooks):  
-> 1527         return forward_call(*args, **kwargs)  
    1528  
    1529     try:  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/parallel/data_parallel.py in forward(self, *inputs, **kwargs)  
    165         with torch.autograd.profiler.record_function("DataParallel.forward"):  
    166             if not self.device_ids:  
--> 167                 return self.module(*inputs, **kwargs)  
    168  
    169             for t in chain(self.module.parameters(), self.module.buffers()):  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __wrapped_call__(  
    self, *args, **kwargs)  
    1516         return self._compiled_call_impl(*args, **kwargs) # type: ignore  
[misc]  
    1517     else:  
-> 1518         return self._call_impl(*args, **kwargs)  
    1519  
    1520     def __call__(self, *args, **kwargs):  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __call__(self, *args, **kwargs)  
    1525             or __global_backward_pre_hooks or __global_backward_hooks  
    1526             or __global_forward_hooks or __global_forward_pre_hooks):  
-> 1527         return forward_call(*args, **kwargs)  
    1528  
    1529     try:  
  
<ipython-input-4-28e947679845> in forward(self, x)  
    45     def forward(self, x):  
    46         x = self.pool1(F.relu(self.bn1(self.conv1(x))))  
--> 47         x = self.pool2(F.relu(self.bn2(self.conv2(x))))  
    48         x = F.relu(self.bn3(self.conv3(x)))  
    49         x = F.relu(self.bn4(self.conv4(x)))  
  
/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in __wrapped_call__(  
    self, *args, **kwargs)
```

```

1516             return self._compiled_call_impl(*args, **kwargs) # type: ignore
[misc]
1517         else:
-> 1518             return self._call_impl(*args, **kwargs)
1519
1520     def _call_impl(self, *args, **kwargs):

```

/usr/local/lib/python3.10/dist-packages/torch/nn/modules/module.py in `_call_impl`(self, \*args, \*\*kwargs)

```

1525             or _global_backward_pre_hooks or _global_backward_hooks
1526             or _global_forward_hooks or _global_forward_pre_hooks):
-> 1527             return forward_call(*args, **kwargs)
1528
1529     try:

```

/usr/local/lib/python3.10/dist-packages/torch/nn/modules/conv.py in `forward`(self, input)

```

458
459     def forward(self, input: Tensor) -> Tensor:
--> 460         return self._conv_forward(input, self.weight, self.bias)
461
462 class Conv3d(_ConvNd):

```

/usr/local/lib/python3.10/dist-packages/torch/nn/modules/conv.py in `_conv_forward`(self, input, weight, bias)

```

454                     weight, bias, self.stride,
455                     _pair(0), self.dilation, self.groups)
--> 456         return F.conv2d(input, weight, bias, self.stride,
457                         self.padding, self.dilation, self.groups)
458

```

`KeyboardInterrupt`:

```
In [ ]: plt.subplot(311)
plt.plot(tl_b, label='train loss')
plt.grid(True)
plt.legend()

plt.subplot(312)
plt.plot(tl_b[100:], label='train loss')
plt.grid(True)
plt.legend()

plt.subplot(313)
plt.plot(tl_b[300:], label='train loss')
fml = np.mean(tl_b[-320:])
plt.axhline(y = fml, color='r', linestyle='-', label='final mean train loss: {:.2f}'.format(fml))
plt.grid(True)
plt.legend()
```

```
In [ ]: ## Evaluation
## You should evaluate multiple error and accuracy metrics that are used for depth estimation
import numpy as np
import matplotlib.pyplot as plt

# Evaluation Metrics
def rmse(predictions, targets):
    return np.sqrt(((predictions - targets) ** 2).mean())
```

```

def scale_invariant_error(predictions, targets):
    epsilon = 1e-6 # Small constant to avoid log(0)
    predictions = np.maximum(predictions, epsilon) # Replaces negative values with epsilon

    valid_mask = targets > 0 # Create a mask for non-zero targets
    if np.sum(valid_mask) == 0:
        return np.nan # Return NaN if there are no valid targets

    predictions_valid = predictions[valid_mask]
    targets_valid = targets[valid_mask]

    log_diff = np.log(predictions_valid + epsilon) - np.log(targets_valid + epsilon)
    n = len(predictions_valid)
    return (np.square(log_diff).mean()) - (np.square(log_diff.mean()) / n)

# Initialize metric accumulators
accum_rmse = 0
accum_scale_inv_err = 0
num_samples = 0

# Load state for contact model
contact_path = f"contact_model_epoch_{contact_epochs - 1}.pt"
contact_model.load_state_dict(torch.load(contact_path, map_location=device))

# Load state for depth model
depth_path = f"tactile_depth_model_epoch_{depth_epochs - 1}.pt"
tactile_depth_model.load_state_dict(torch.load(depth_path, map_location=device))

# Evaluation Loop
for i, samples in enumerate(dataloader_train):
    tactiles = samples['tactile'].float().to(device)
    depths = samples['depth'].float().to(device)
    depths_resized = F.interpolate(depths, size=(74, 55), mode='bilinear', align_corners=True)

    contact_model.eval()
    tactile_depth_model.eval()

    with torch.no_grad():
        contact_output = contact_model(tactiles)
        tactile_depth_output = tactile_depth_model(tactiles, contact_output)
        predicted_depth = tactile_depth_output.clone() # Clone to avoid modifying the original tensor
        predicted_depth_sample = predicted_depth[i].squeeze()

# Calculate metrics
accum_rmse += rmse(tactile_depth_output.cpu().numpy(), depths_resized.cpu().numpy())
accum_scale_inv_err += scale_invariant_error(tactile_depth_output.cpu().numpy(), depths_resized.cpu().numpy())
num_samples += 1

if i < 10: # Plot first 10 samples
    plt.figure(figsize=(12, 4))
    plt.subplot(1, 3, 1)
    plt.imshow(tactiles[i].cpu().permute(1, 2, 0))
    plt.title('Tactile Image')
    plt.axis('off')

    predicted_depth_numpy = predicted_depth_sample.detach().cpu().numpy()
    plt.subplot(1, 3, 2)
    plt.imshow(predicted_depth_numpy, cmap='gray')

```

```

plt.title('Predicted Depth')
plt.axis('off')

predicted_contact_binary = contact_output[i].cpu().squeeze() > 0.5

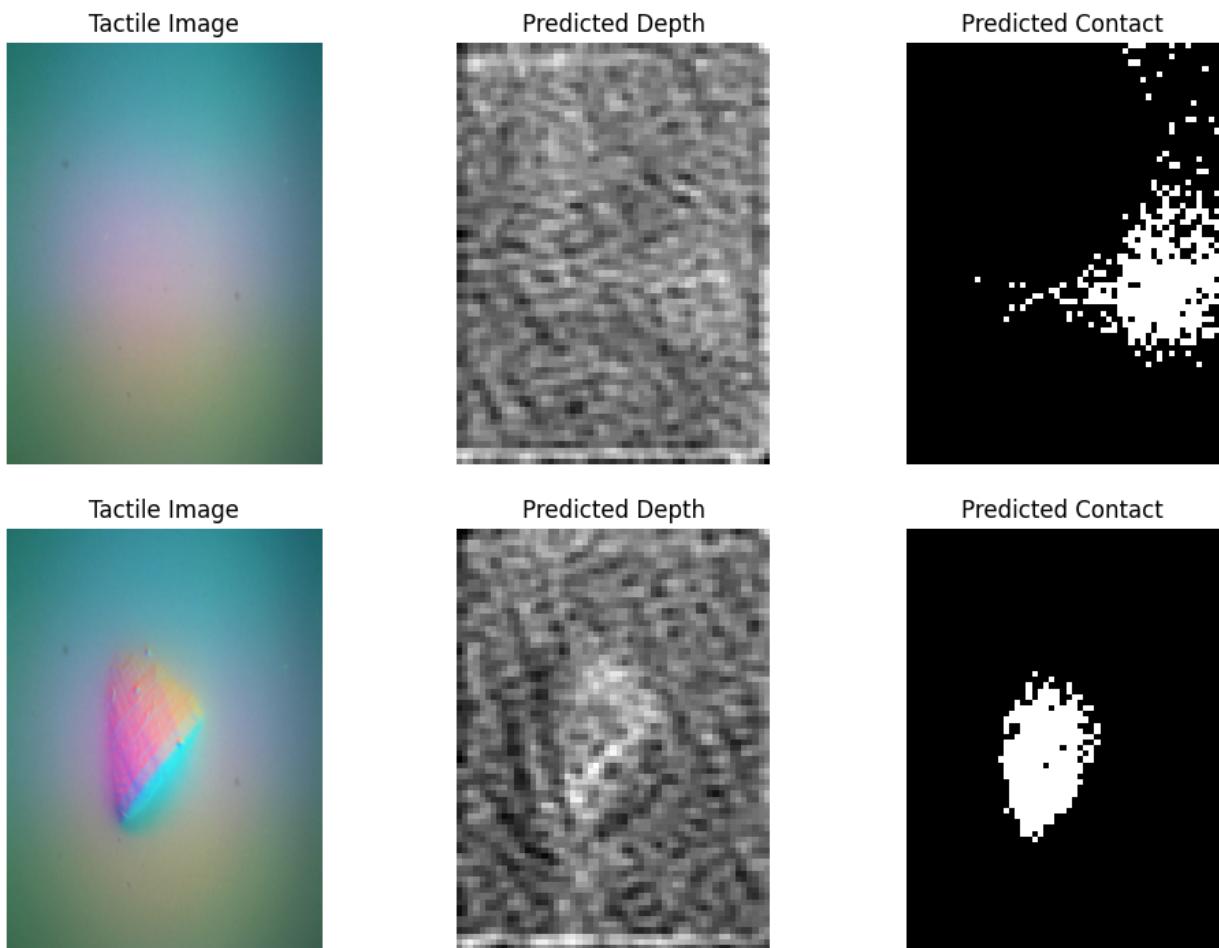
plt.subplot(1, 3, 3)
plt.imshow(predicted_contact_binary, cmap='gray')
plt.title('Predicted Contact')
plt.axis('off')

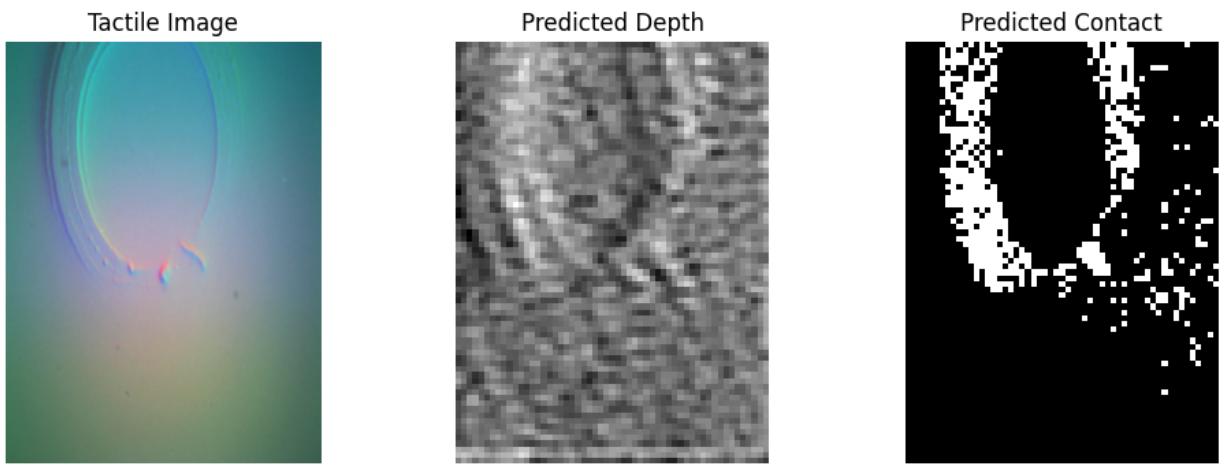
plt.show()

# Compute average metrics
avg_rmse = accum_rmse / num_samples
avg_scale_inv_err = accum_scale_inv_err / num_samples
print('Average RMSE:', avg_rmse)
print('Average Scale-Invariant Error:', avg_scale_inv_err)

# show 10 sample images (from both the train and test sets) in a subplot figure. Each

```





Average RMSE: 0.04209675143162409  
 Average Scale-Invariant Error: 21.964490924153

Define a function below that instantiates the networks again and loads the weights for new predictions. This function will be used for testing purposes.

```
In [15]: import cv2
import matplotlib.pyplot as plt
import os

def predict(dataloader, contact_model, tactile_depth_model, device, dataset_train, visualize):
    # Load state for models
    contact_path = f"contact_model_epoch_{contact_epochs - 1}.pt"
    depth_path = f"tactile_depth_model_epoch_{depth_epochs - 1}.pt"
    contact_model.load_state_dict(torch.load(contact_path, map_location=device))
    tactile_depth_model.load_state_dict(torch.load(depth_path, map_location=device))
    count = 0

    save_dir = '/content/saved_images'
    os.makedirs(save_dir, exist_ok=True)

    for i, samples in enumerate(dataloader):
        tactiles = samples['tactile'].float().to(device)

        contact_model.eval()
        tactile_depth_model.eval()

        with torch.no_grad():
            contact_output = contact_model(tactiles)
            tactile_depth_output = tactile_depth_model(tactiles, contact_output)

        for j in range(tactiles.size(0)): # Iterate through each image in the batch
            predicted_depth_sample = tactile_depth_output[j].cpu().squeeze()
            predicted_depth_numpy = predicted_depth_sample.detach().cpu().numpy()
            predicted_contact_binary = contact_output[j].cpu().squeeze() > 0.5

            if visualize:
                plt.figure(figsize=(12, 4))
                plt.subplot(1, 3, 1)
                plt.imshow(tactiles[j].cpu().permute(1, 2, 0), cmap='gray')
                plt.title(f'Tactile Image {i * dataset_train.valid.batch_size + j}')
                plt.axis('off')

                plt.subplot(1, 3, 2)
                plt.imshow(predicted_contact_binary, cmap='gray')
```

```

        plt.title('Predicted Contact')
        plt.axis('off')

        plt.subplot(1, 3, 3)
        plt.imshow(predicted_depth_sample, cmap='gray')
        plt.title('Predicted Depth')
        plt.axis('off')

        plt.show()

# plt.show()

# Construct file name and save the figure
# Normalize or convert the range of predicted_depth_numpy
if predicted_depth_numpy.dtype == np.float32 or predicted_depth_numpy.
    # Normalize float images to the range [0, 1]
    predicted_depth_norm = (predicted_depth_numpy - predicted_depth_nu
else:
    # Ensure integer images are within [0, 255]
    predicted_depth_norm = np.clip(predicted_depth_numpy, 0, 255)

plt.figure(figsize=(4, 4))
plt.imshow(predicted_depth_norm, cmap='gray')
plt.title('Predicted Depth')
plt.axis('off')

file_name = dataset_train.__get_file_name__(count)
count += 1
save_path = os.path.join(save_dir, file_name)
cv2.imwrite(save_path, predicted_depth_norm)

if visualize_3d:
    # Visualize the 3D depth map for each image
    fig = plt.figure(figsize=(14, 10))
    ax = fig.add_subplot(111, projection='3d')
    X, Y = np.meshgrid(np.arange(predicted_depth_numpy.shape[1]), np.arange(
surf = ax.plot_surface(X, Y, predicted_depth_numpy, cmap='viridis', ec
    ax.set_xlabel('X Coordinate')
    ax.set_ylabel('Y Coordinate')
    ax.set_zlabel('Depth')
    fig.colorbar(surf, shrink=0.5, aspect=5)
    plt.show()

```

In [ ]: !rm -rf /content/saved\_images

```

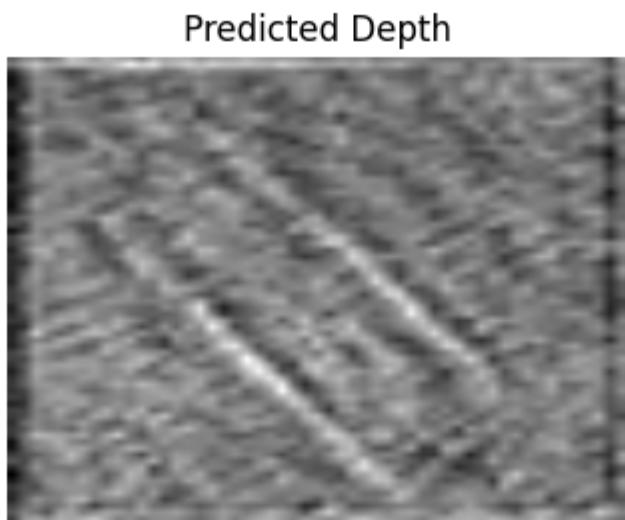
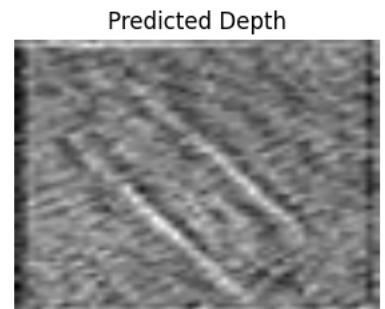
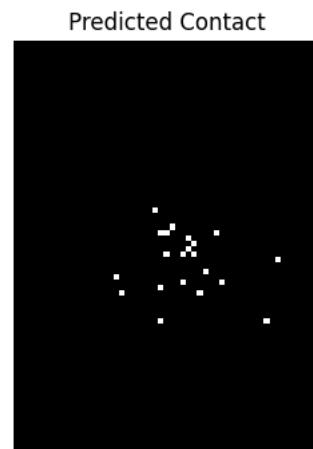
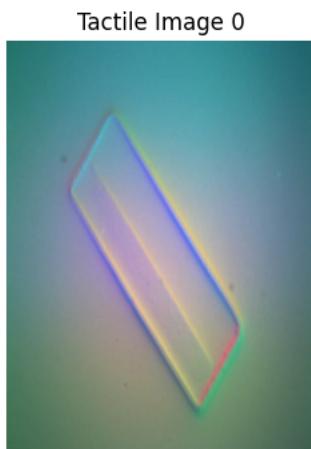
In [14]: import os
import shutil
from google.colab import files

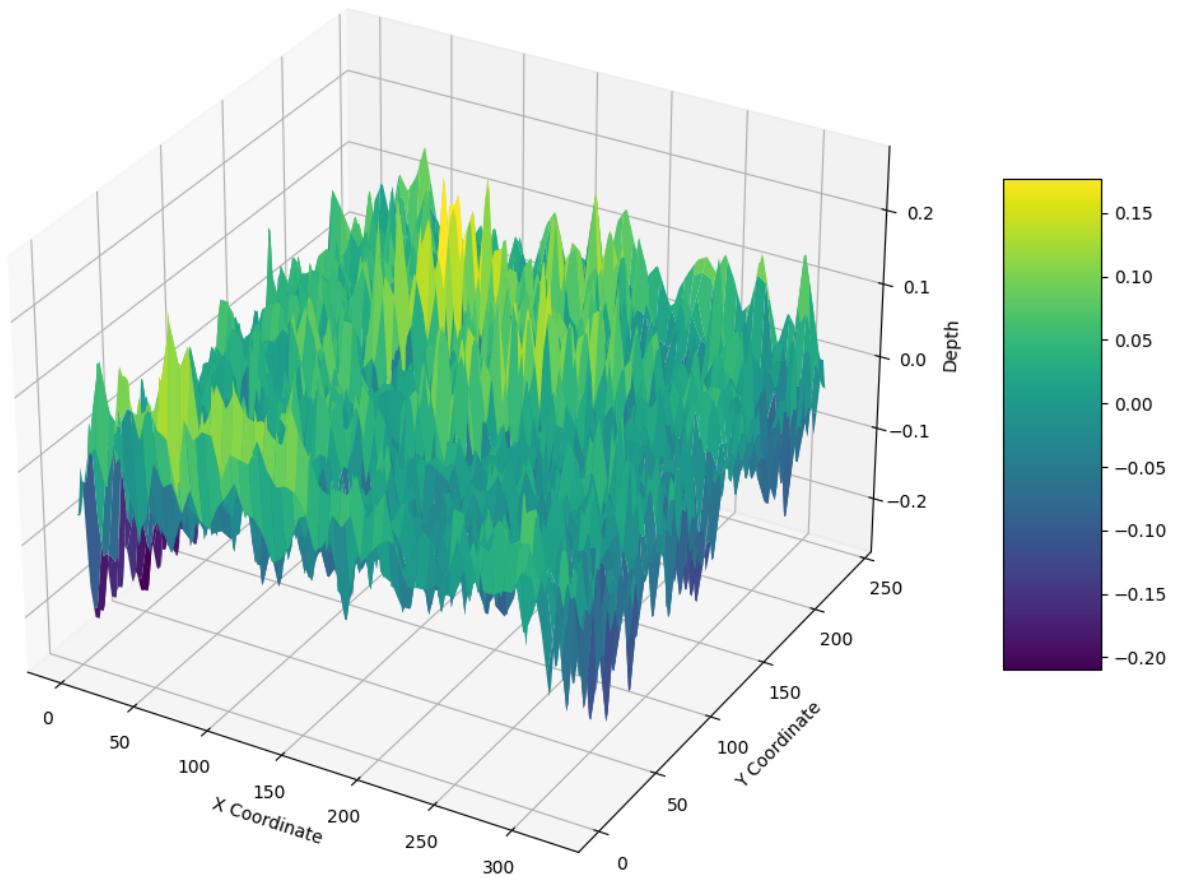
# Zip the folder
folder_path = '/content/saved_images'
zip_path = '/content/saved_images.zip'
shutil.make_archive(zip_path[:-4], 'zip', folder_path)

```

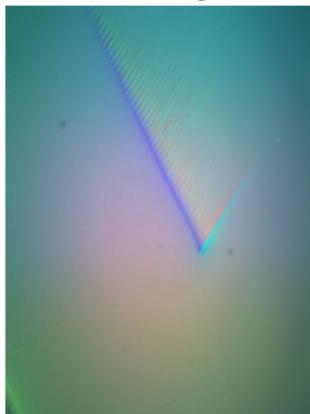
```
# Download the zipped file  
files.download(zip_path)
```

```
In [ ]:  
import torch  
from PIL import Image  
from torchvision.transforms import ToTensor  
import matplotlib.pyplot as plt  
import numpy as np  
import os  
  
trans_train = transforms.Compose([  
    # transforms.ToPILImage(),  
    transforms.Resize((320, 240)),  
    transforms.ToTensor(),  
])  
  
# Assuming 'content' and 'data_dir_train' are strings containing directory paths  
dataset_train = TactileDataset(os.path.join('/content', 'test'), os.path.join(data_dir  
dataloader_train = DataLoader(dataset_train, batch_size=bs, shuffle=True)  
dataloader = dataloader_train  
  
# Run the prediction function  
predict(dataloader, contact_model, tactile_depth_model, device, dataset_train)
```

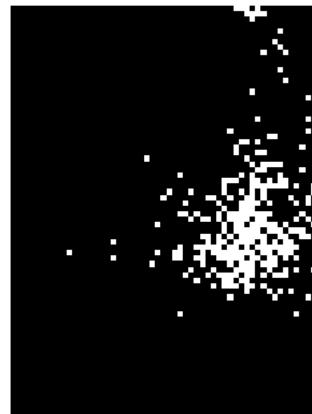




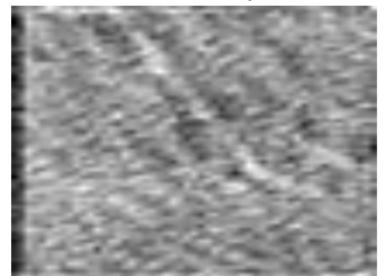
Tactile Image 1



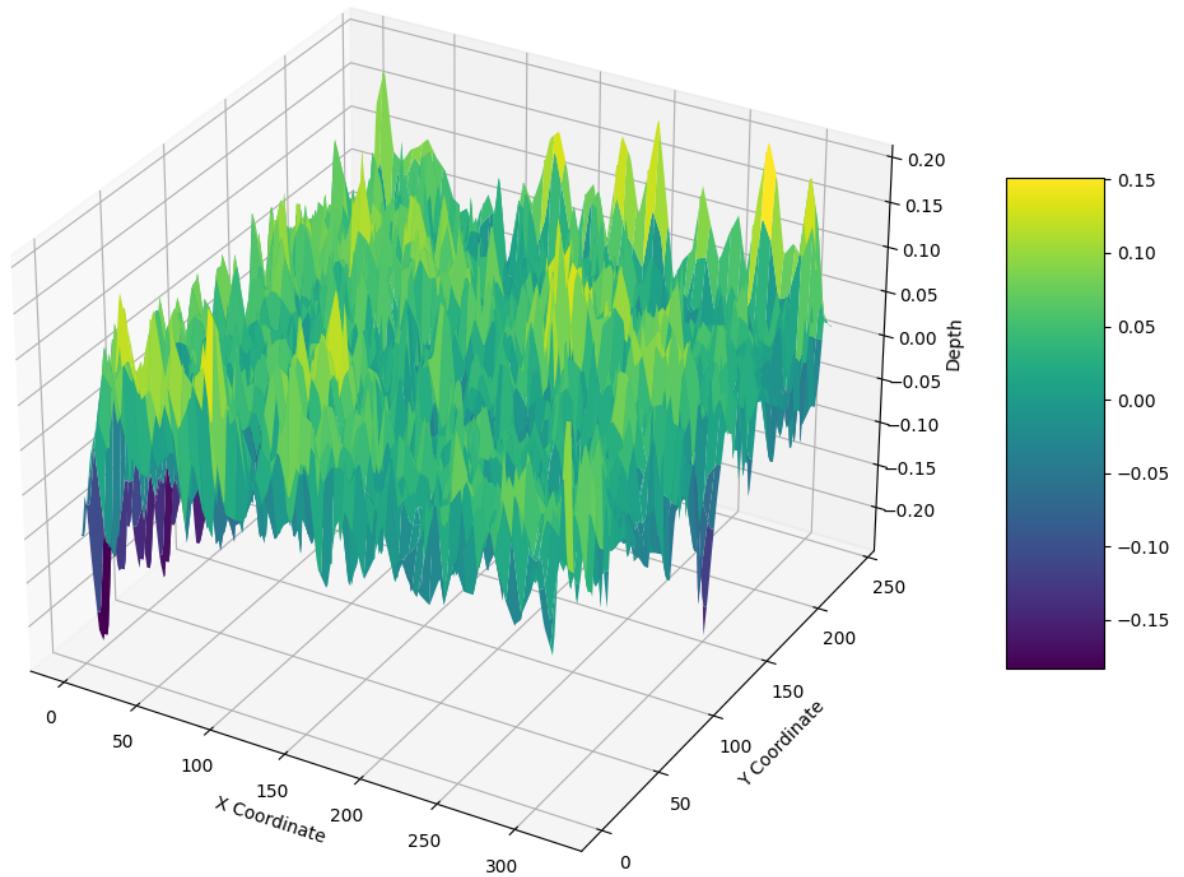
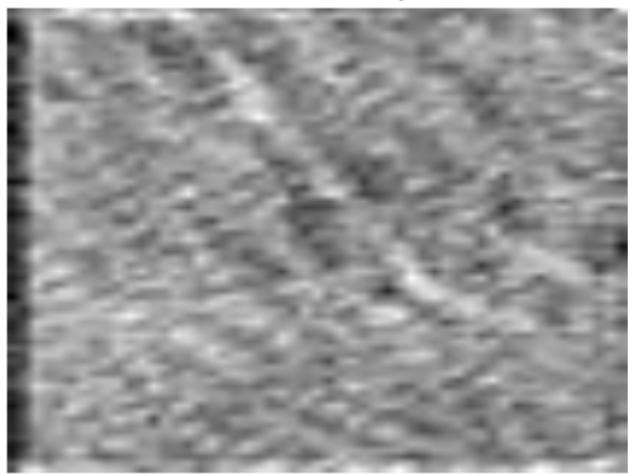
Predicted Contact



Predicted Depth



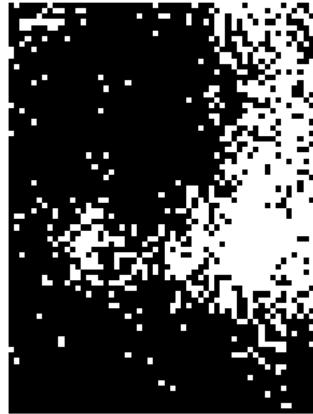
Predicted Depth



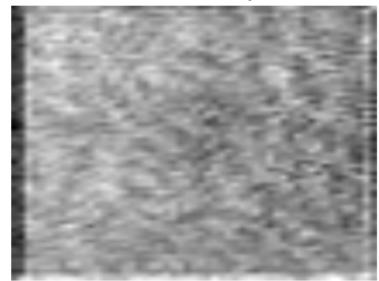
Tactile Image 2



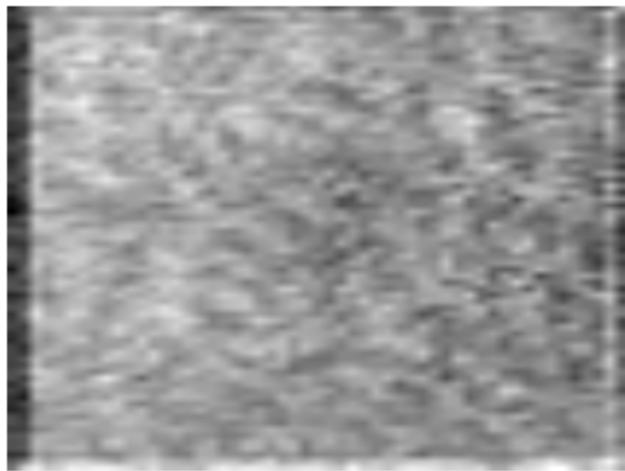
Predicted Contact

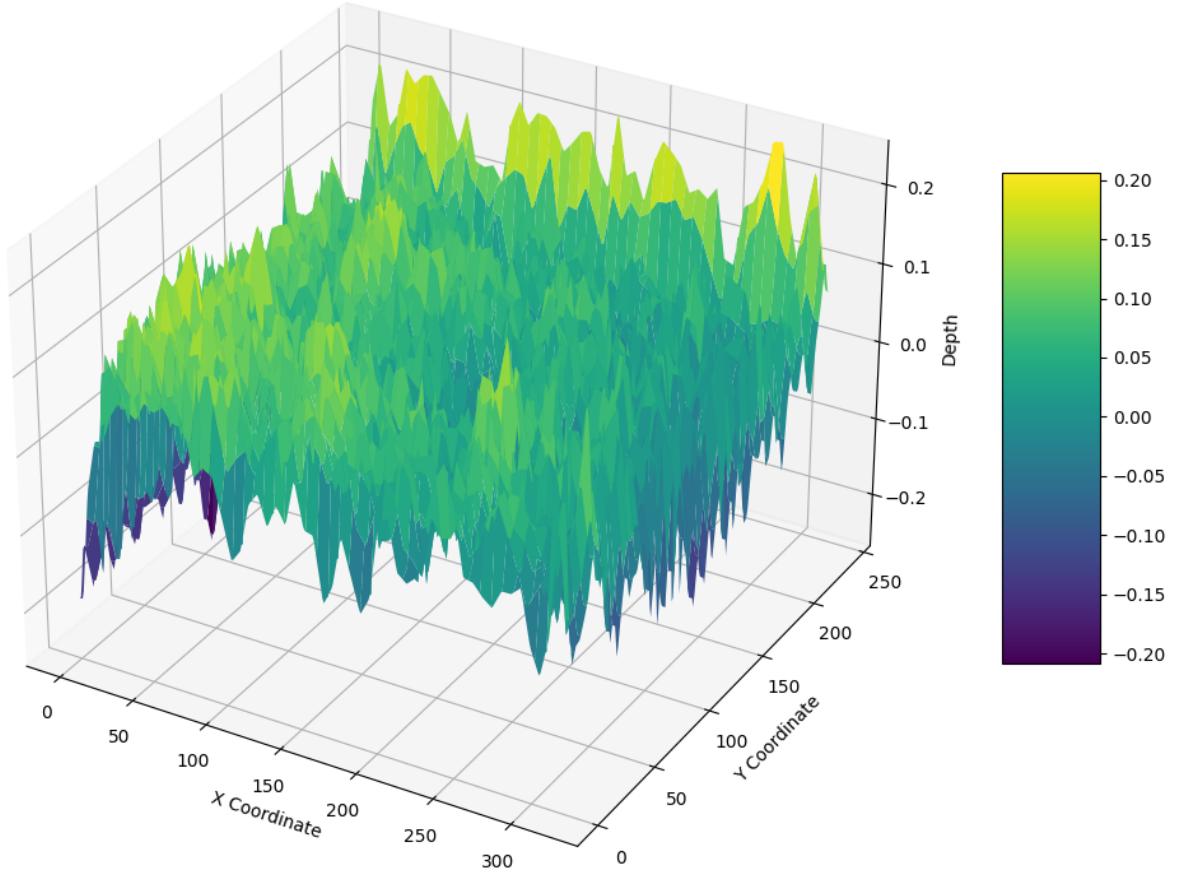


Predicted Depth



Predicted Depth





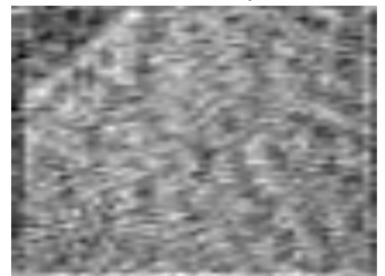
Tactile Image 3



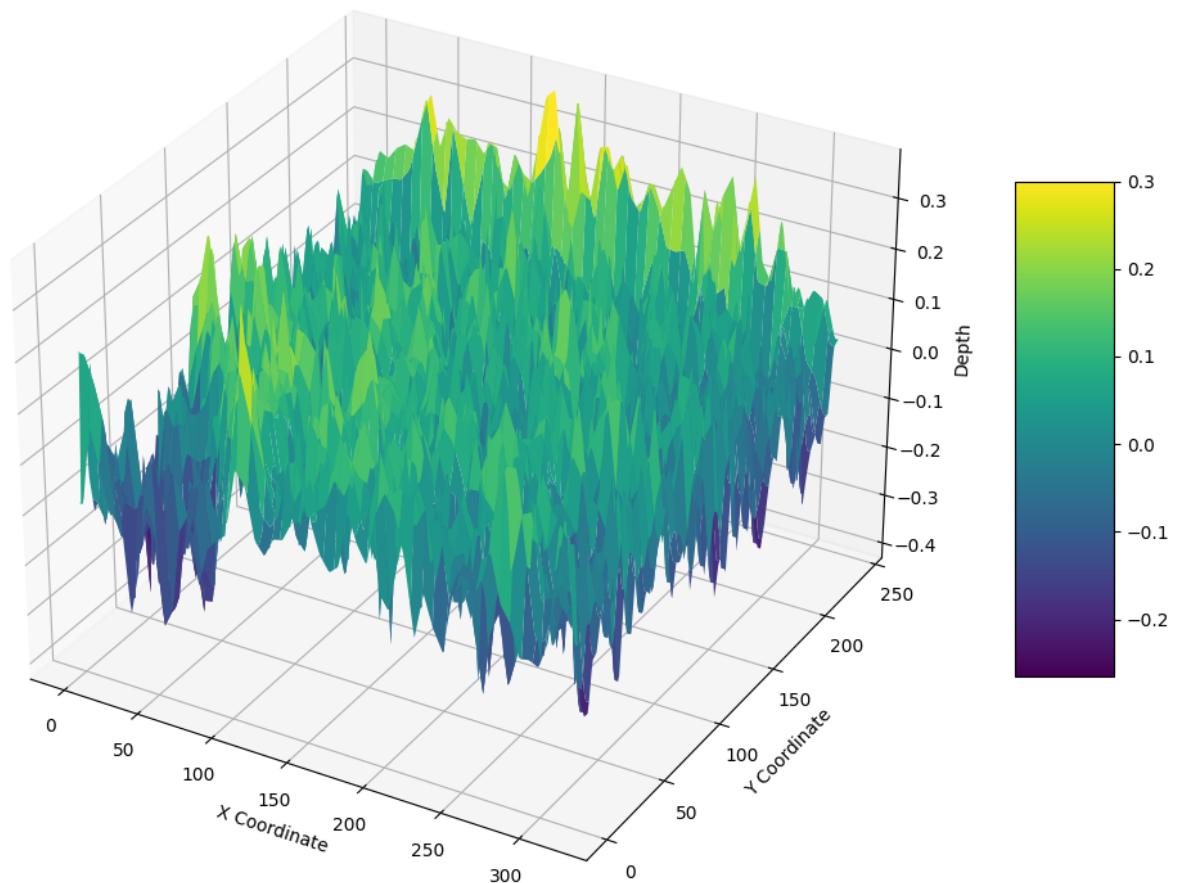
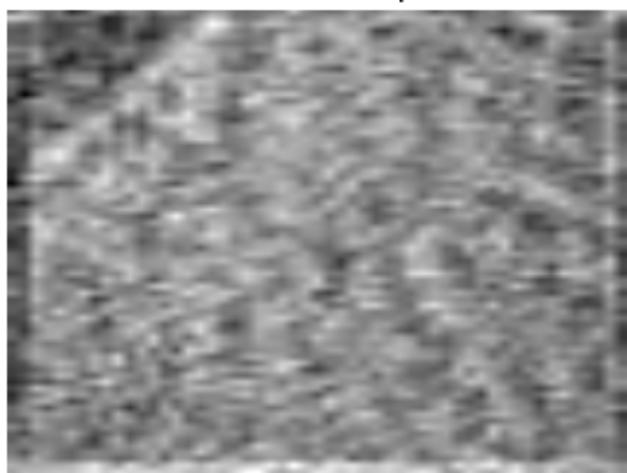
Predicted Contact



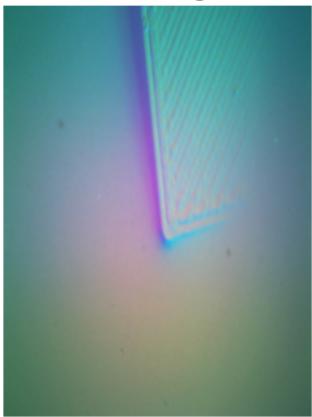
Predicted Depth



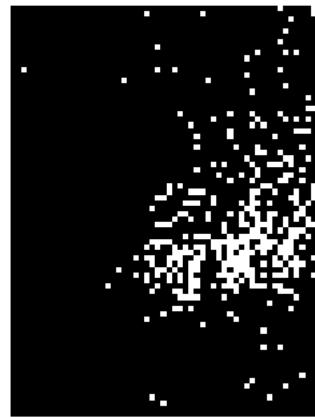
Predicted Depth



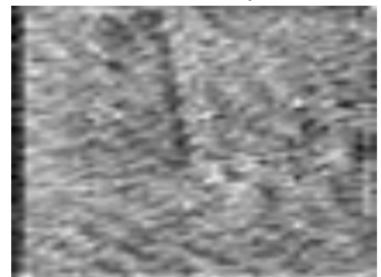
Tactile Image 4



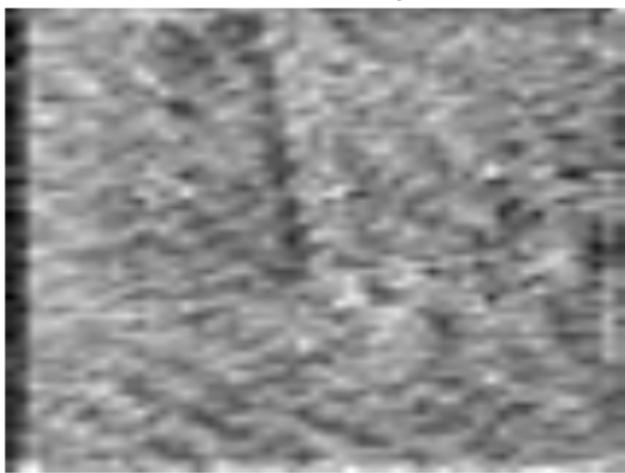
Predicted Contact

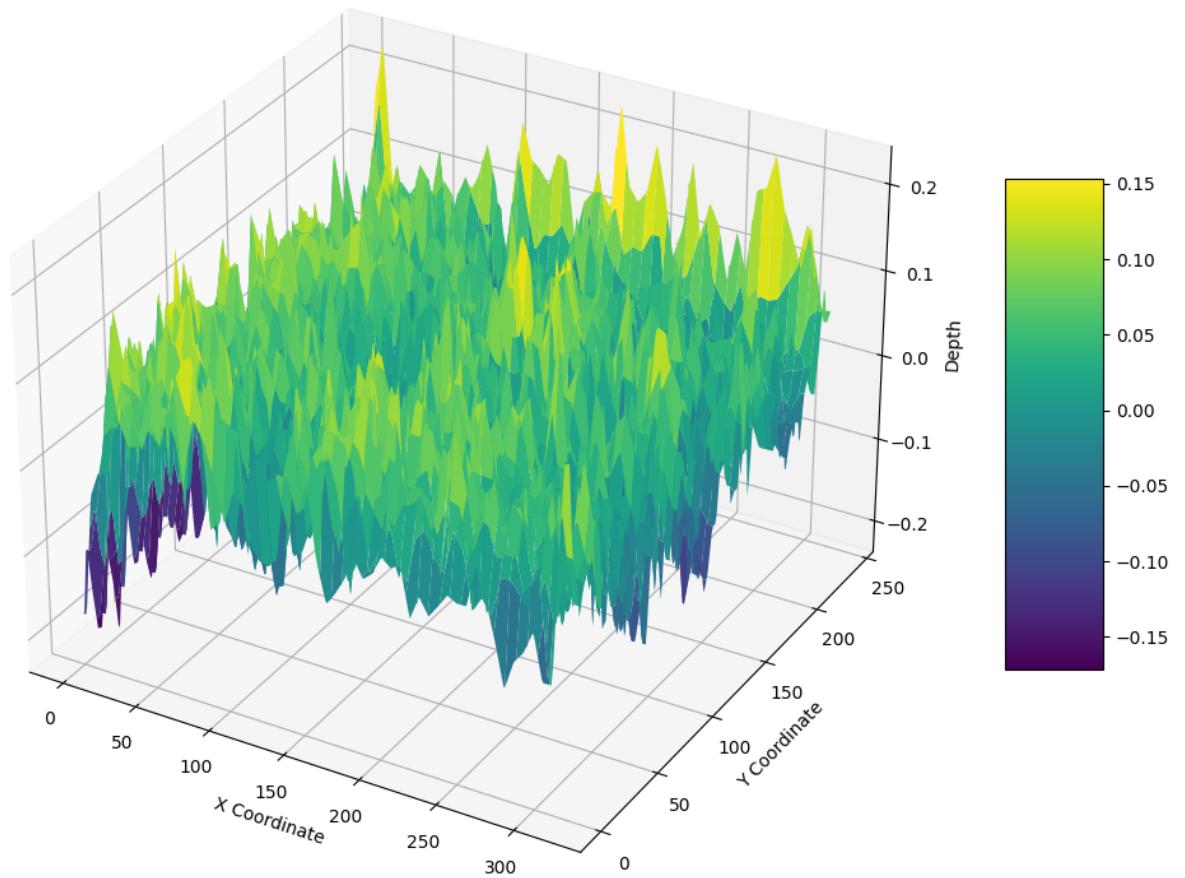


Predicted Depth



Predicted Depth

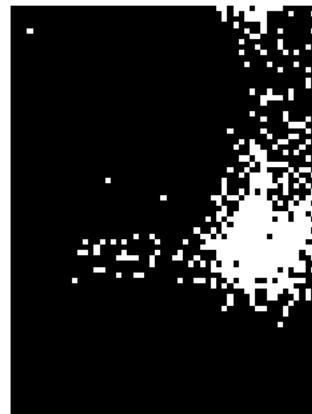




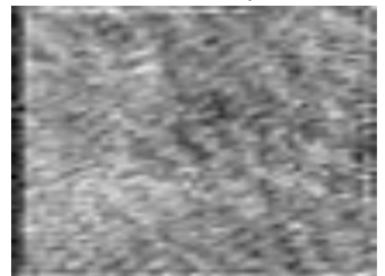
Tactile Image 5



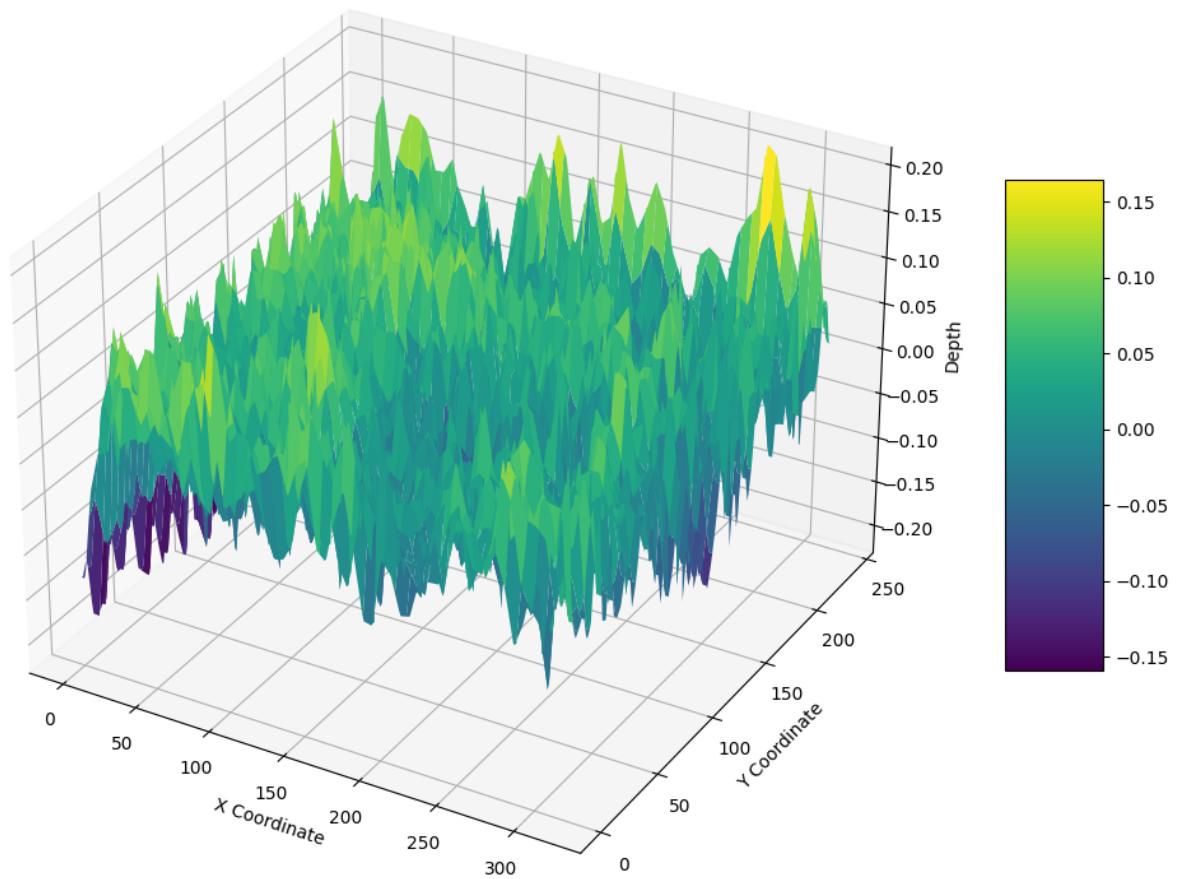
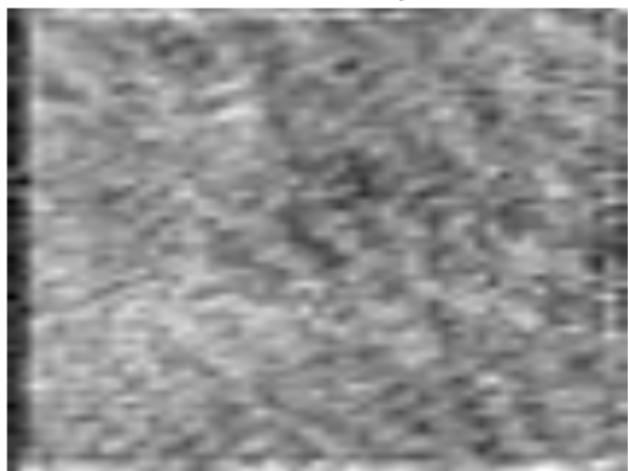
Predicted Contact



Predicted Depth



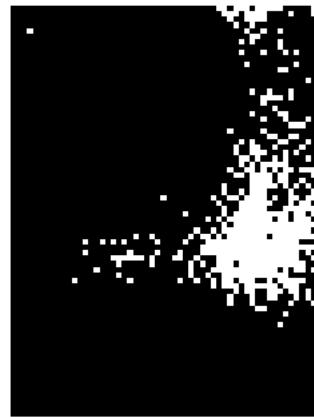
Predicted Depth



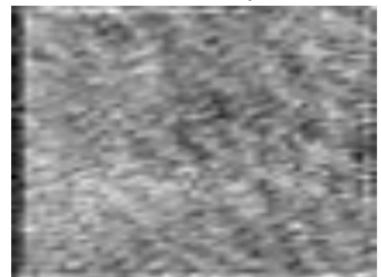
Tactile Image 6



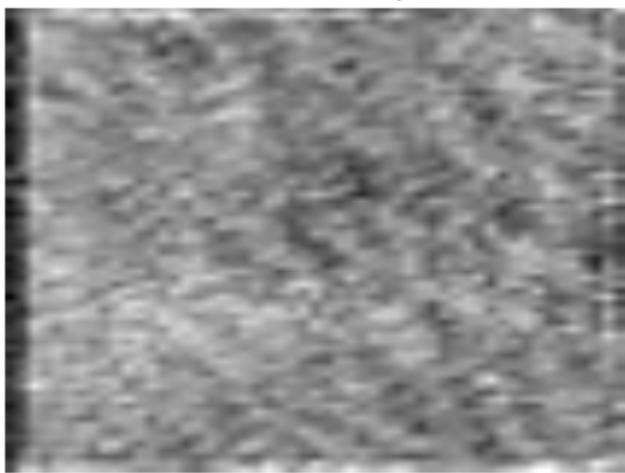
Predicted Contact

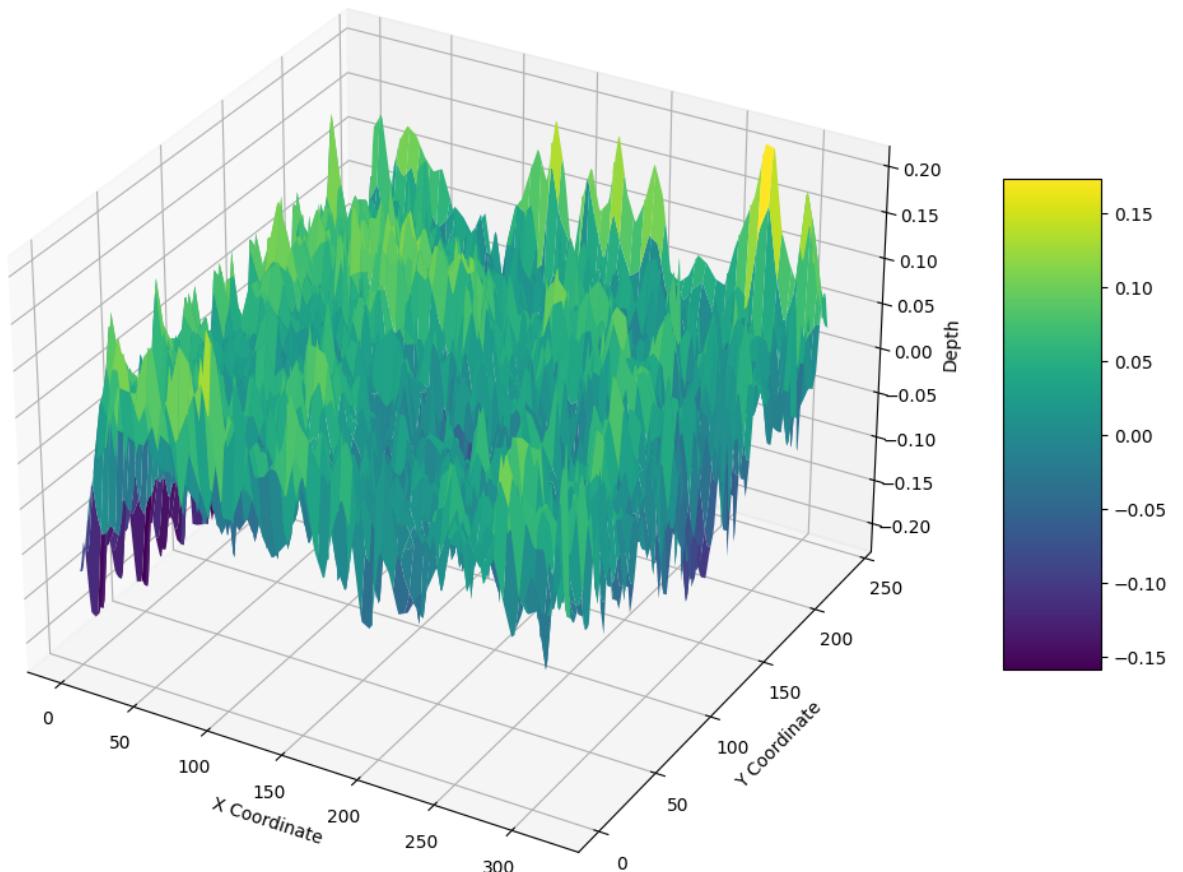


Predicted Depth



Predicted Depth

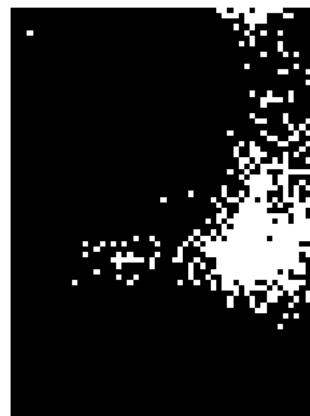




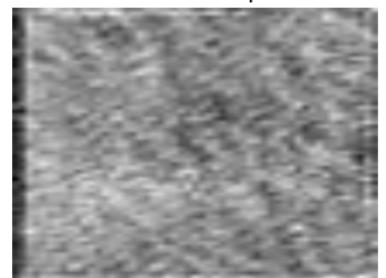
Tactile Image 7



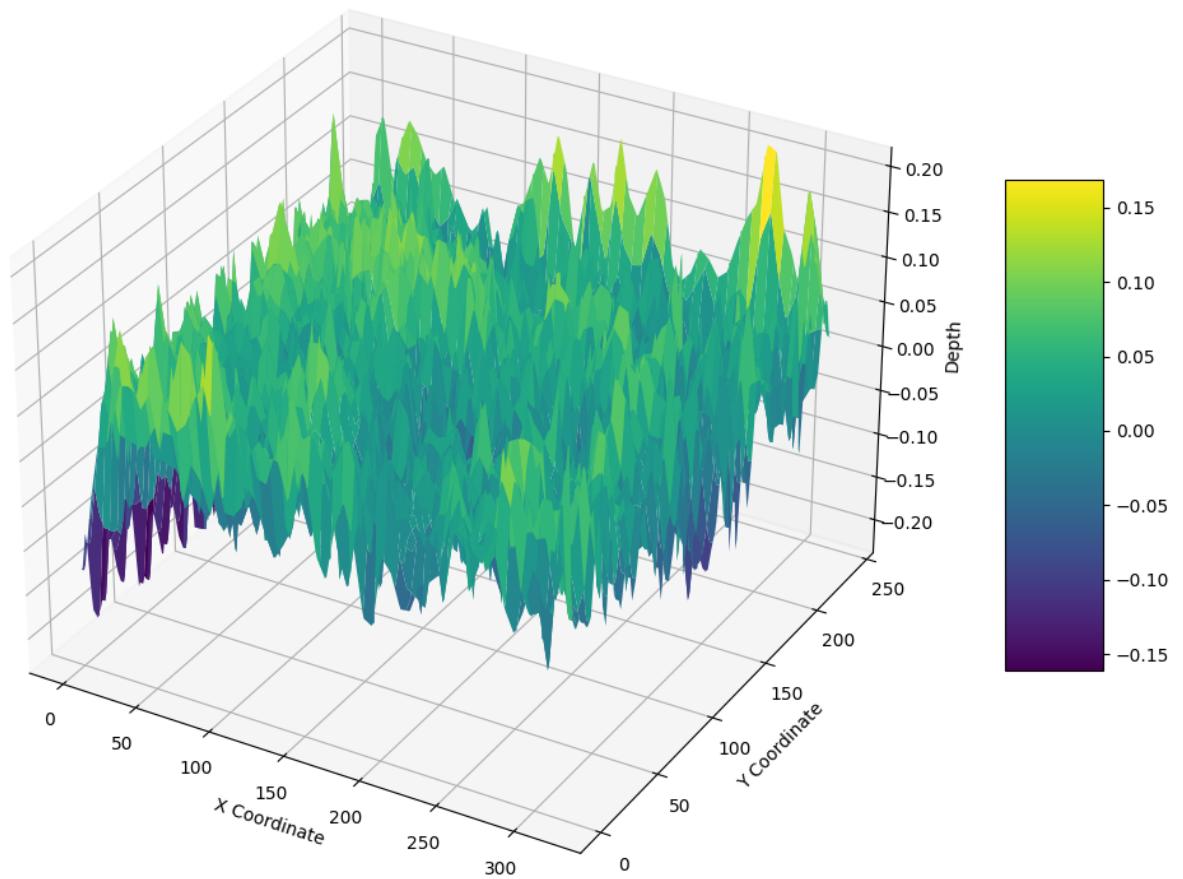
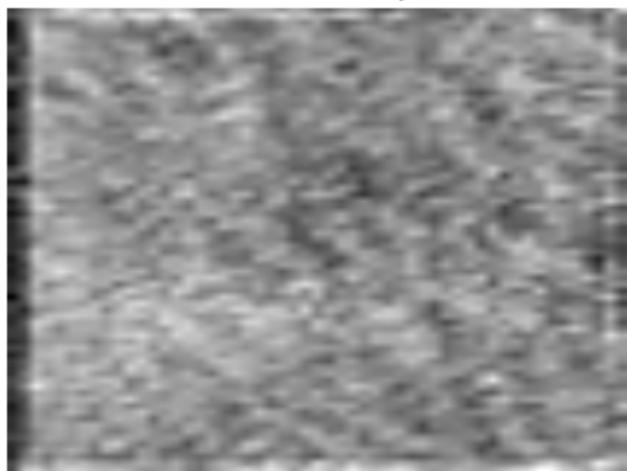
Predicted Contact



Predicted Depth



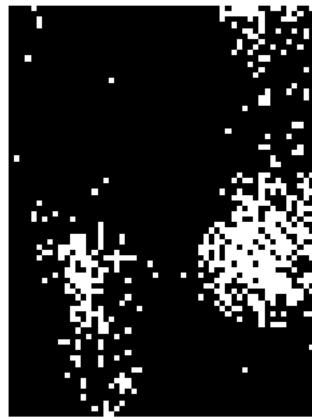
Predicted Depth



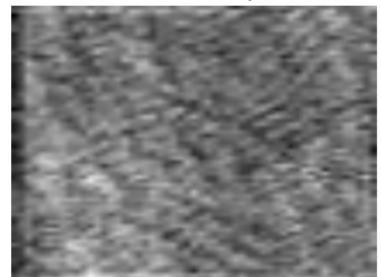
Tactile Image 8



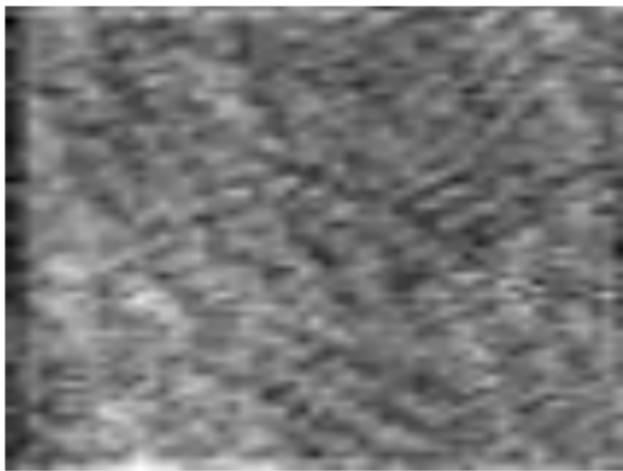
Predicted Contact

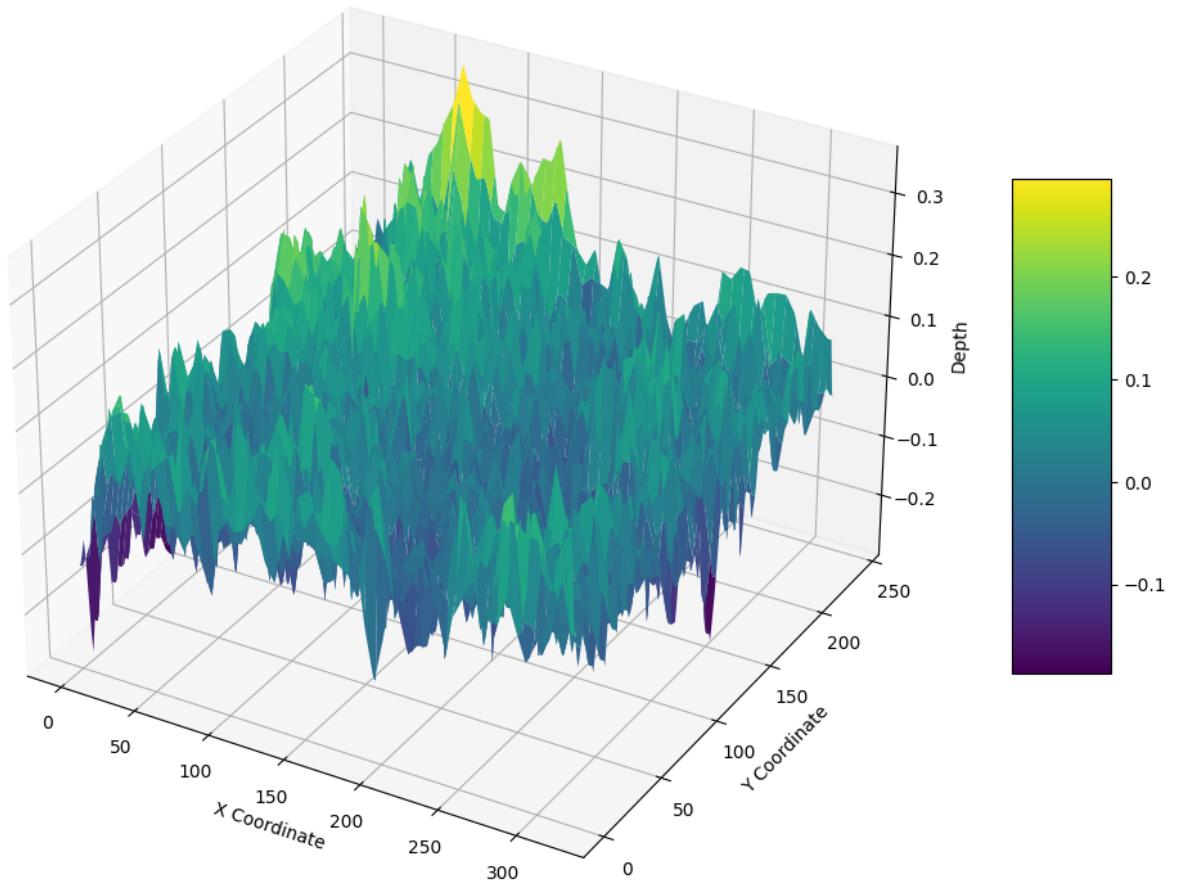


Predicted Depth



Predicted Depth





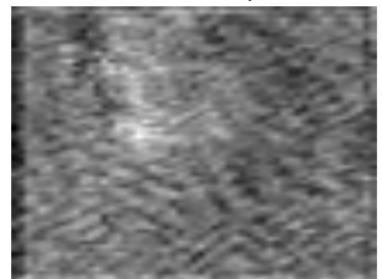
Tactile Image 9



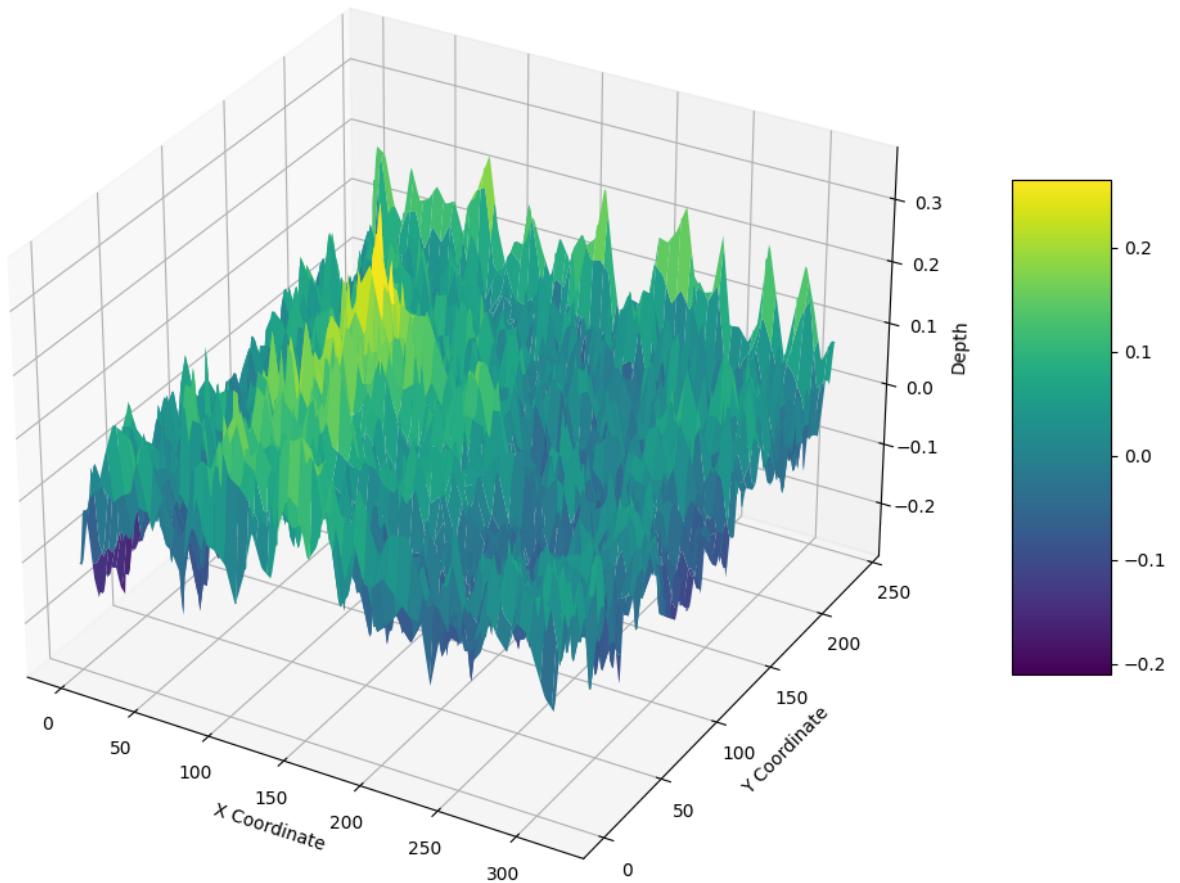
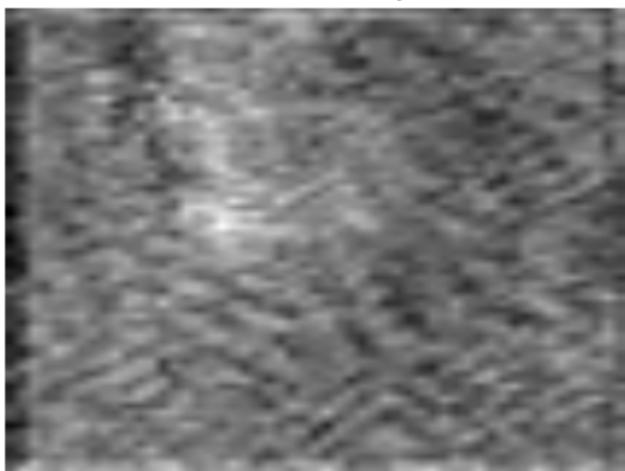
Predicted Contact



Predicted Depth



Predicted Depth



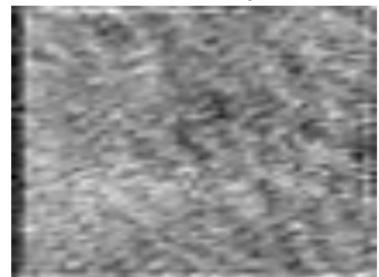
Tactile Image 10



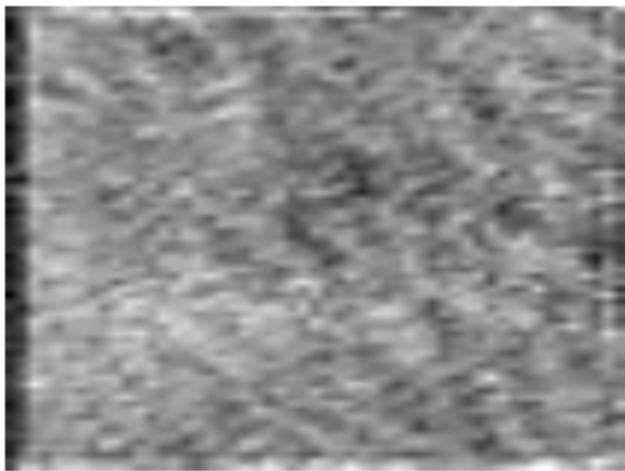
Predicted Contact

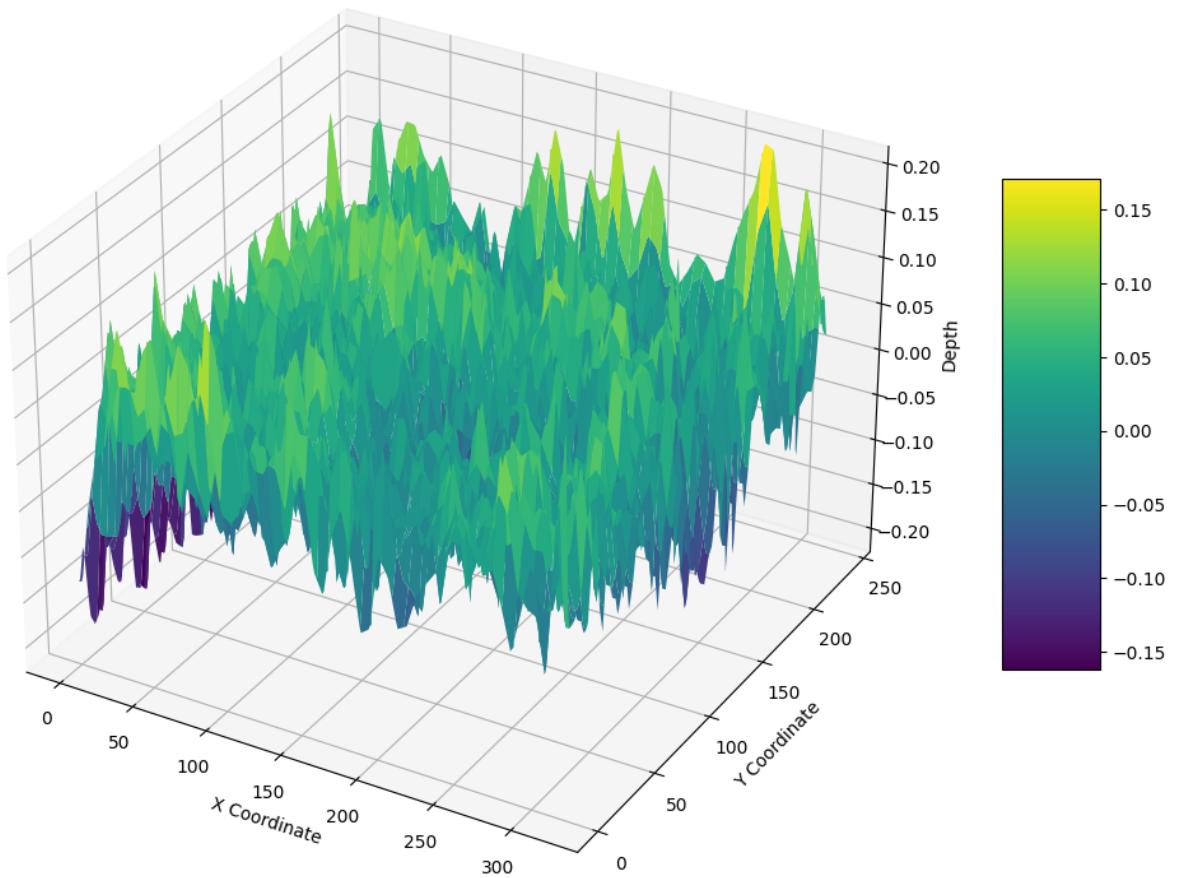


Predicted Depth



Predicted Depth

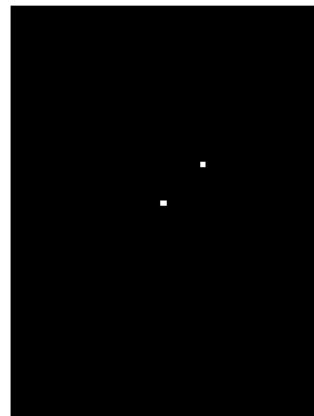




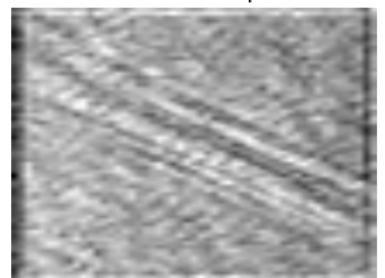
Tactile Image 11



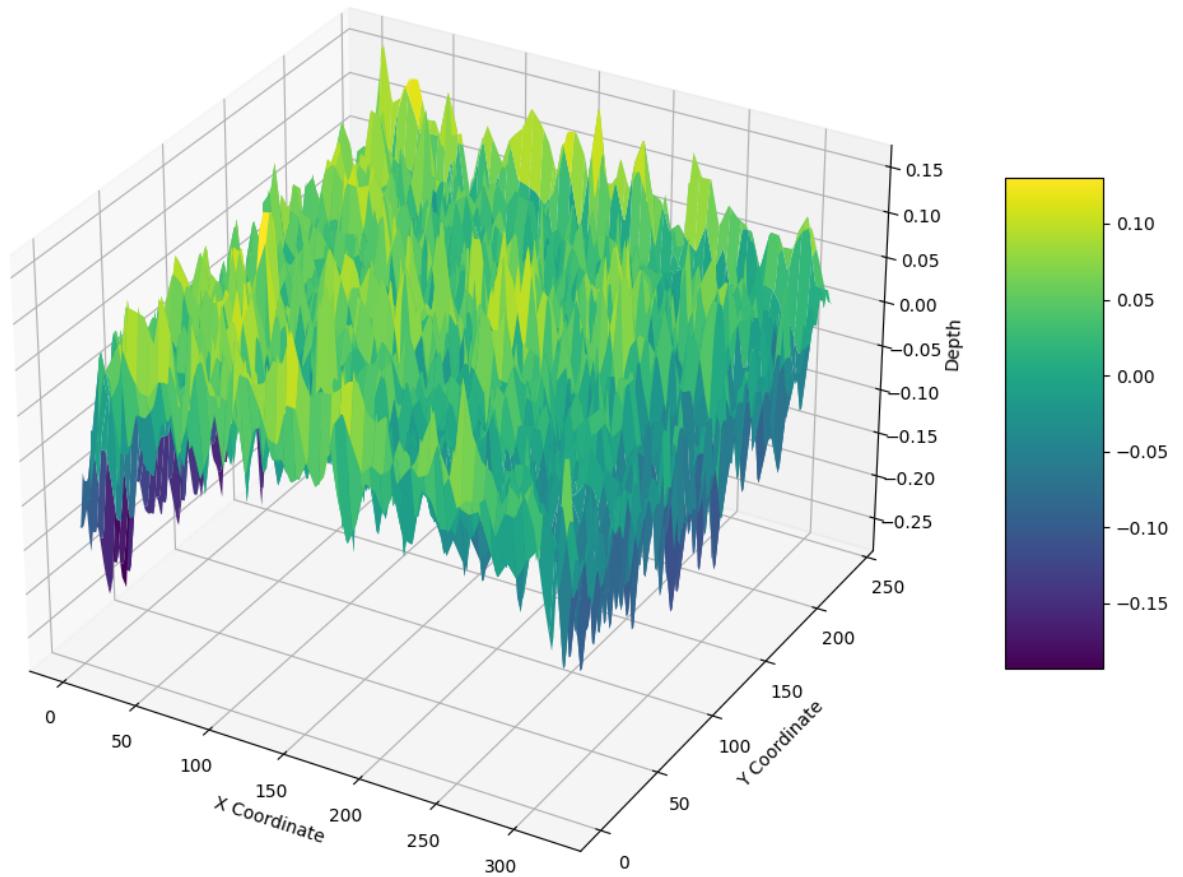
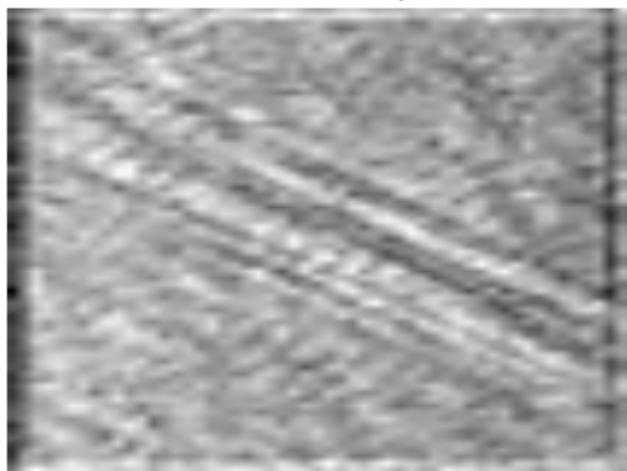
Predicted Contact



Predicted Depth



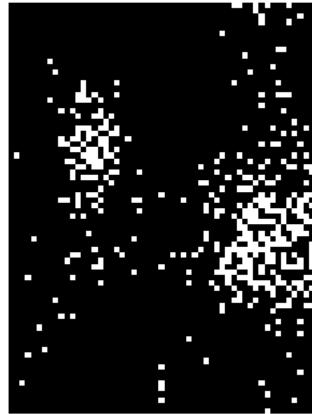
Predicted Depth



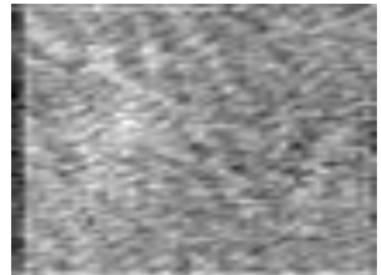
Tactile Image 12



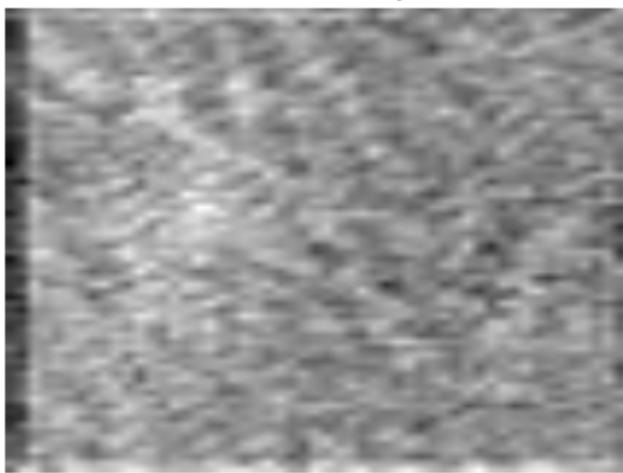
Predicted Contact

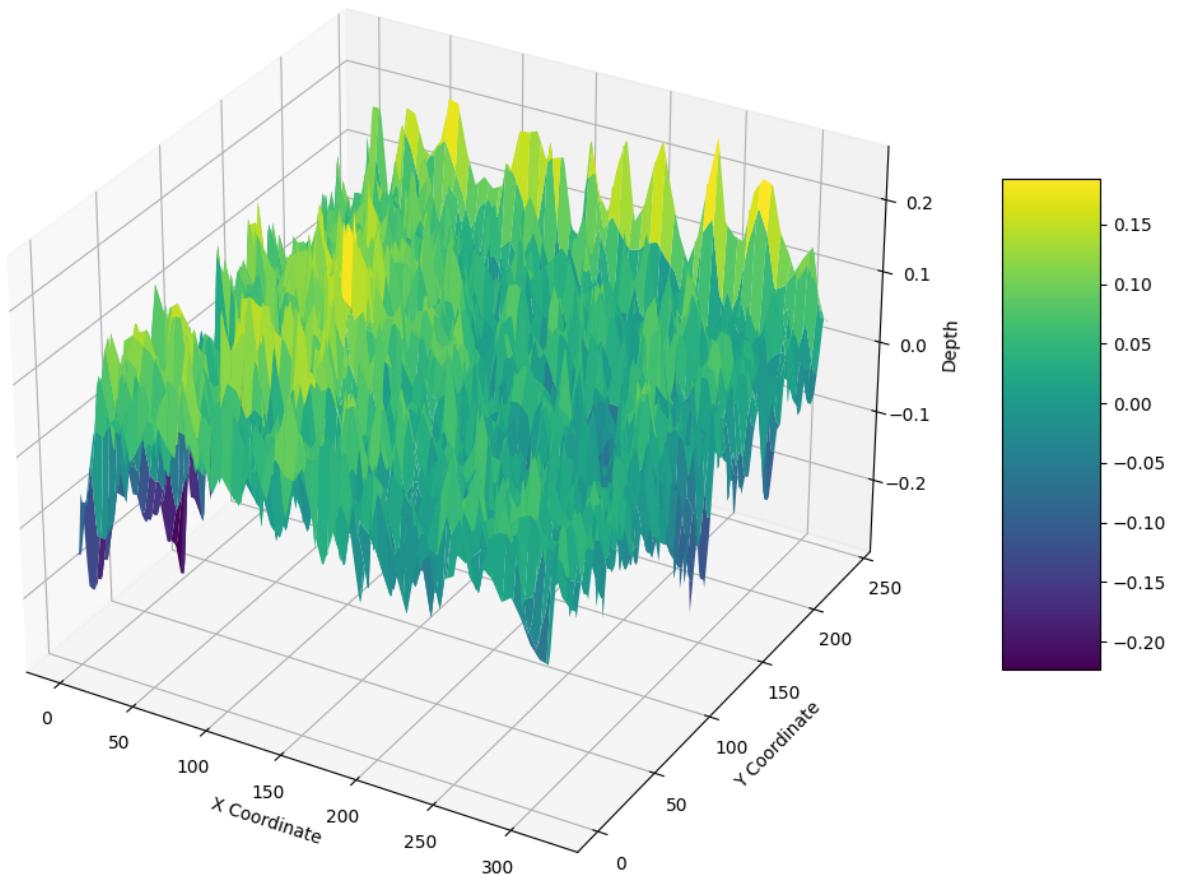


Predicted Depth



Predicted Depth

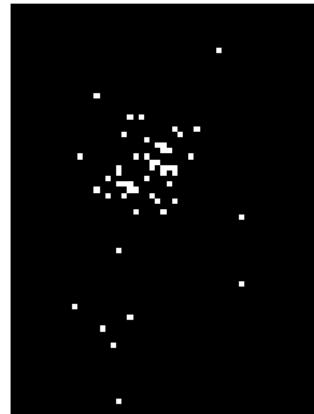




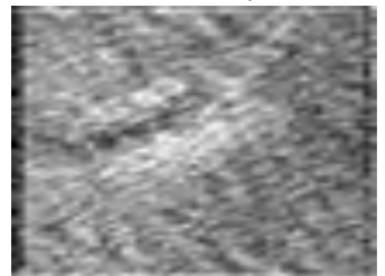
Tactile Image 13



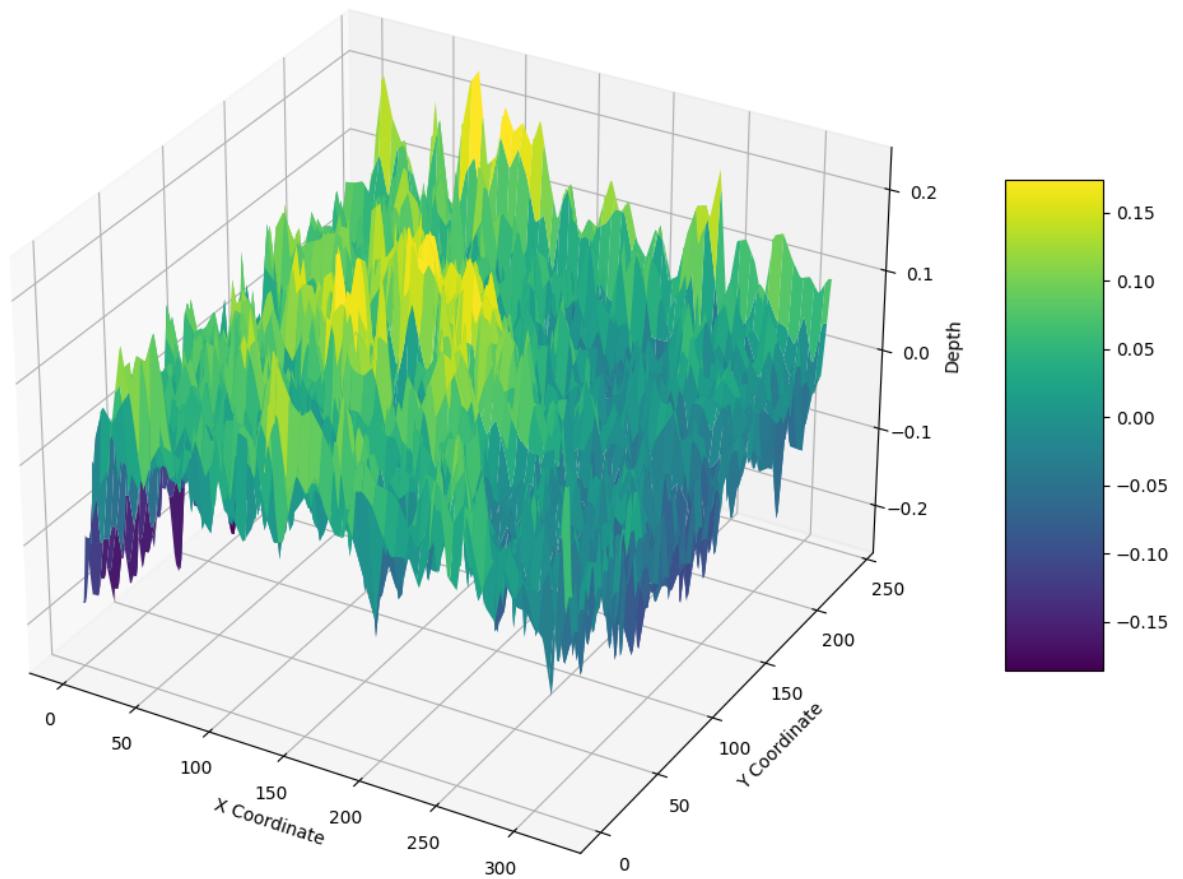
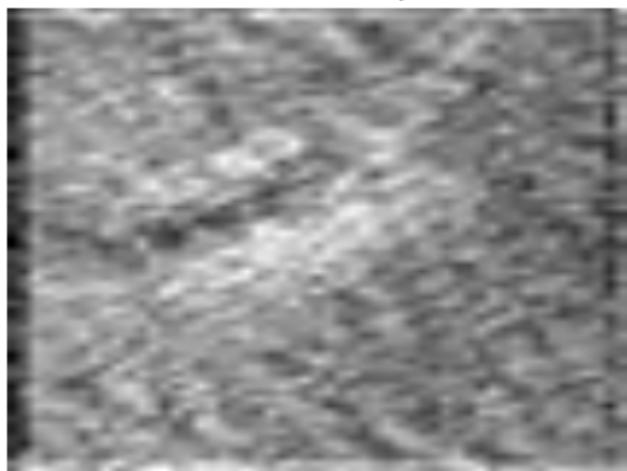
Predicted Contact



Predicted Depth



Predicted Depth



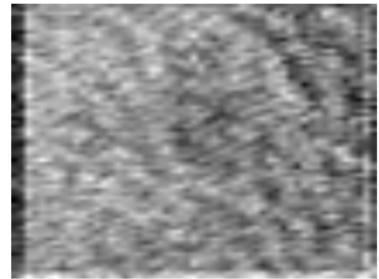
Tactile Image 14



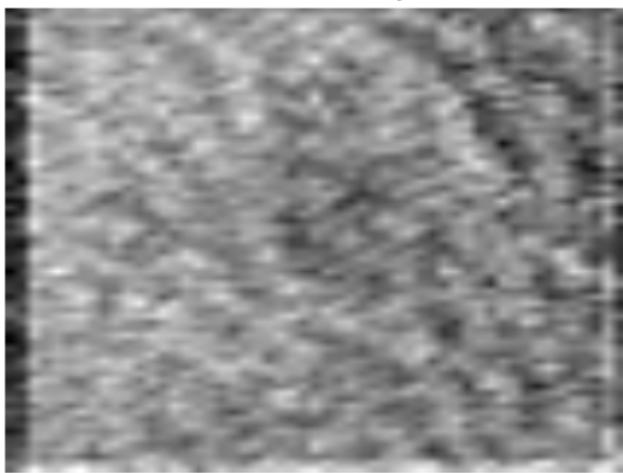
Predicted Contact

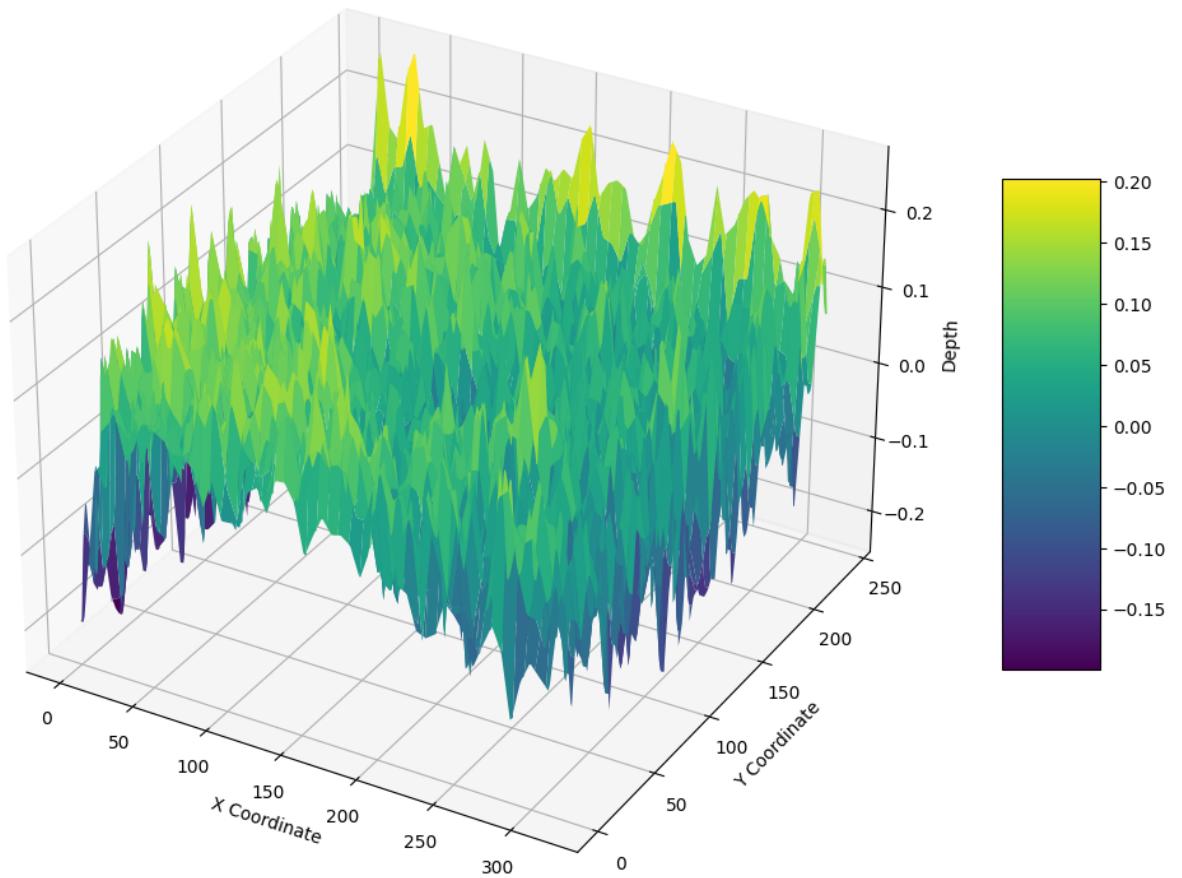


Predicted Depth



Predicted Depth

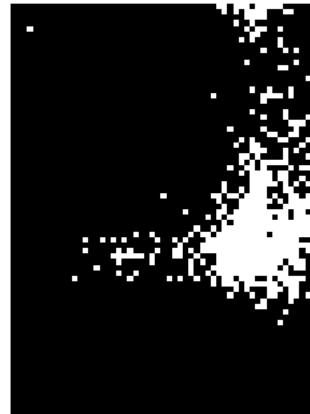




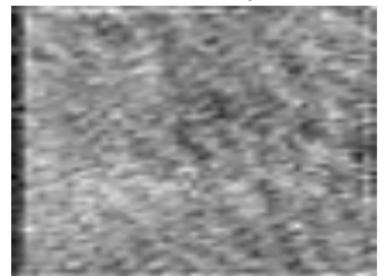
Tactile Image 15



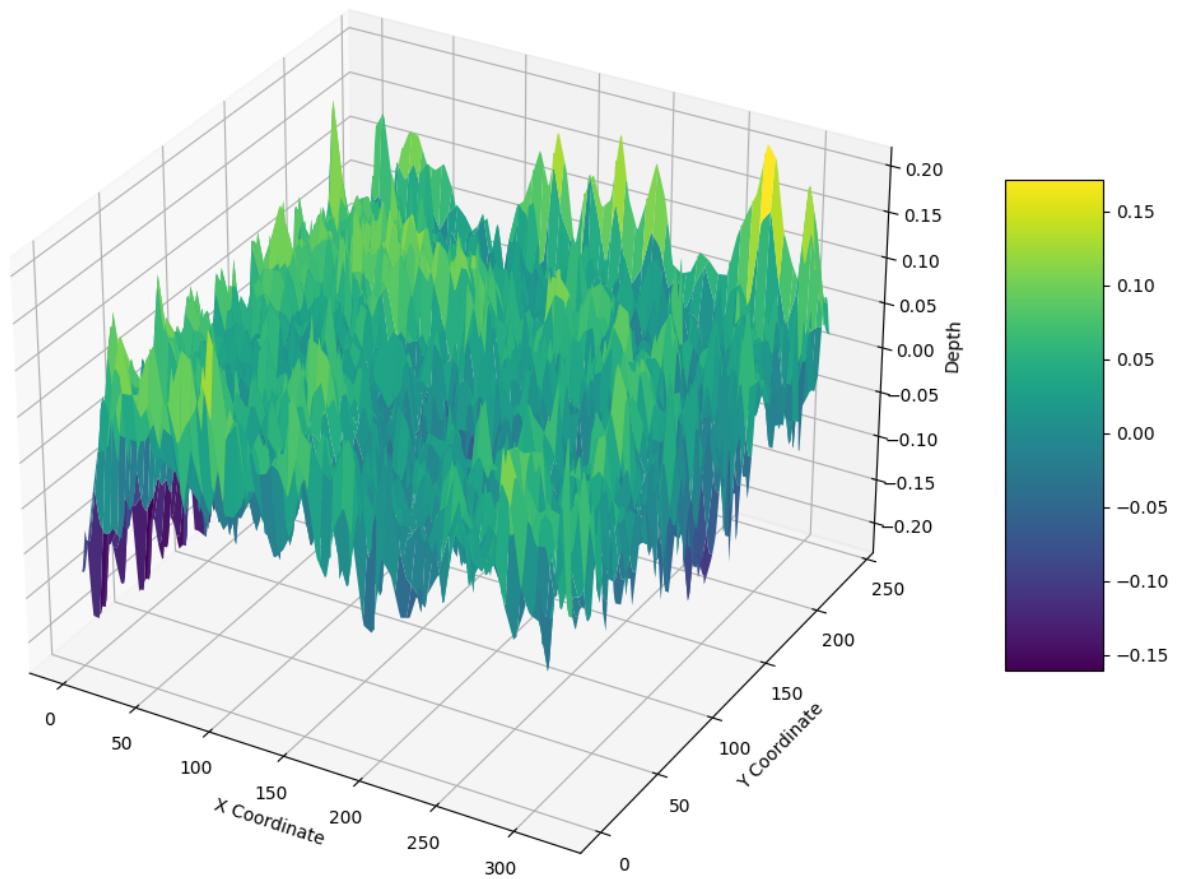
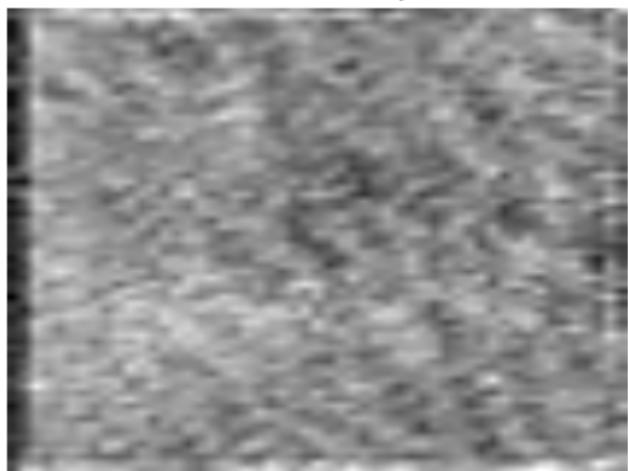
Predicted Contact



Predicted Depth



Predicted Depth



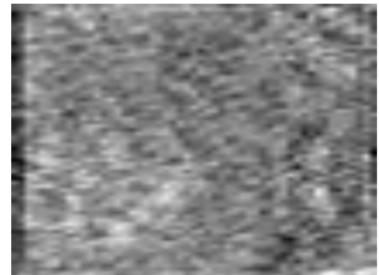
Tactile Image 16



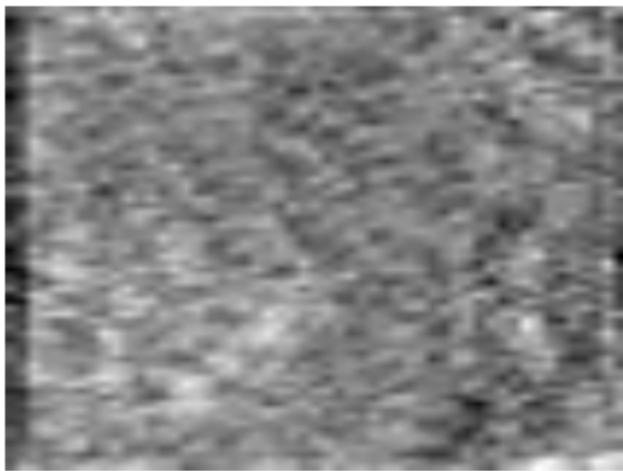
Predicted Contact

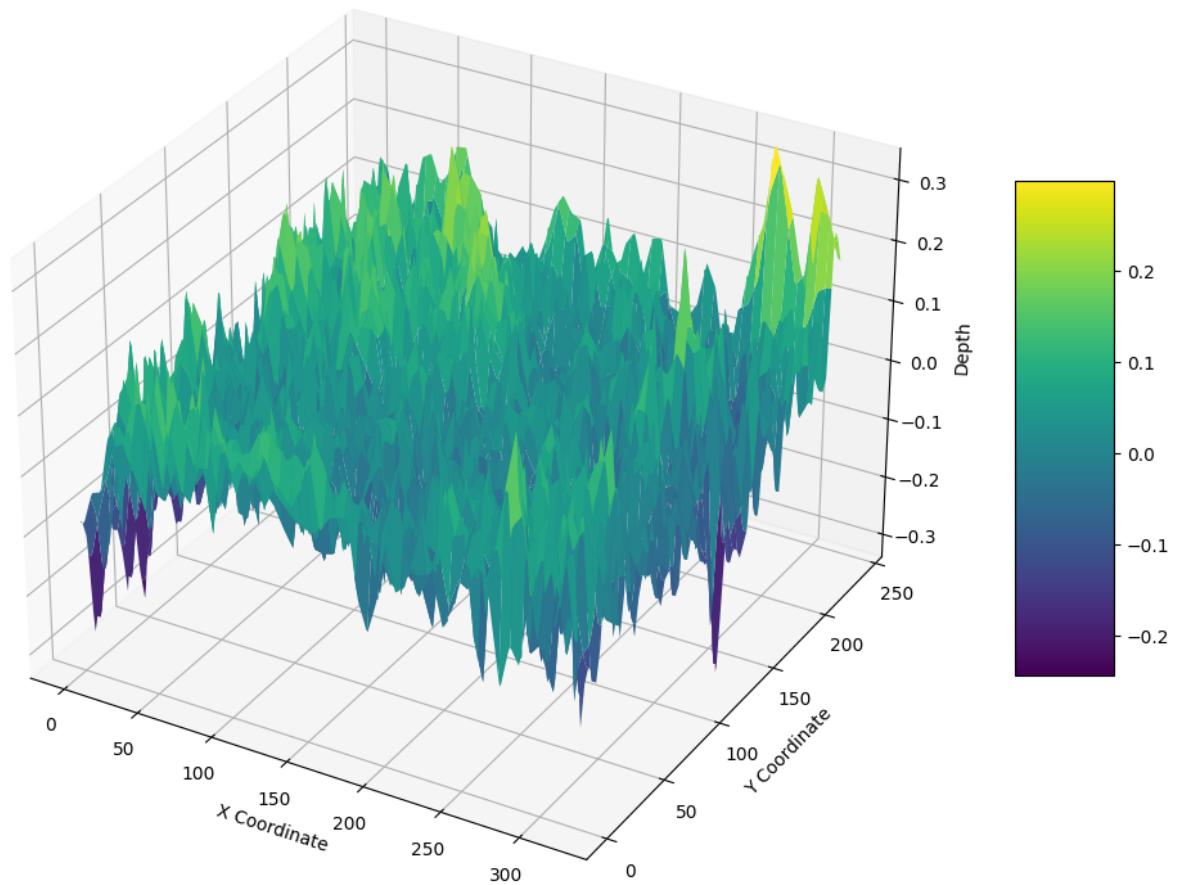


Predicted Depth

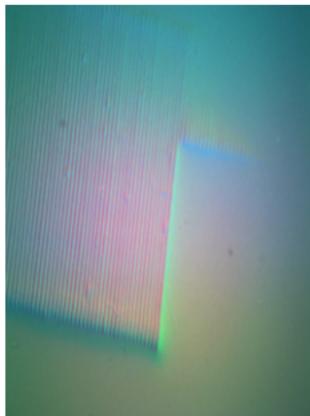


Predicted Depth





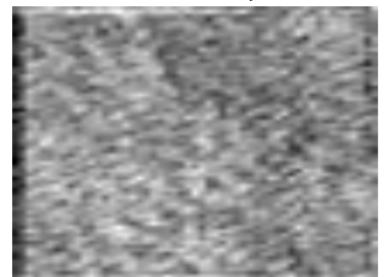
Tactile Image 17



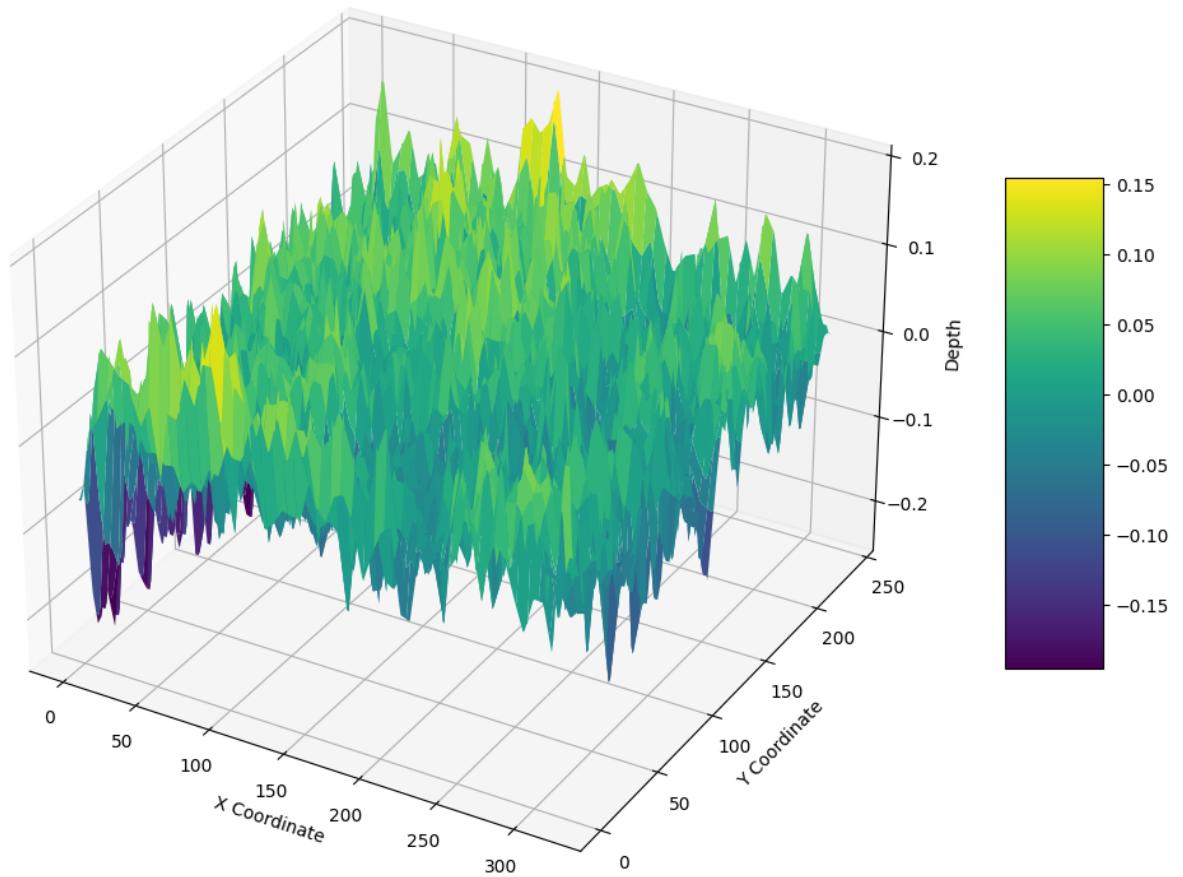
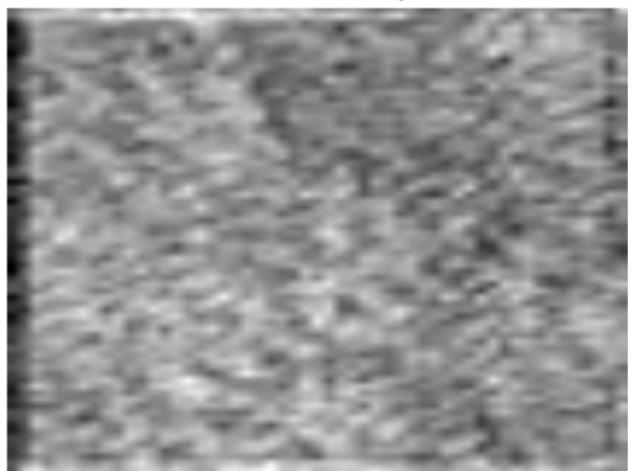
Predicted Contact



Predicted Depth



Predicted Depth



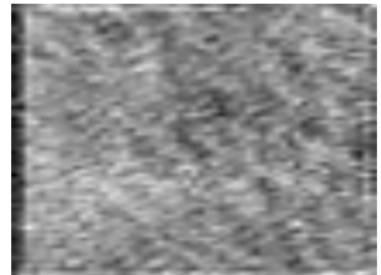
Tactile Image 18



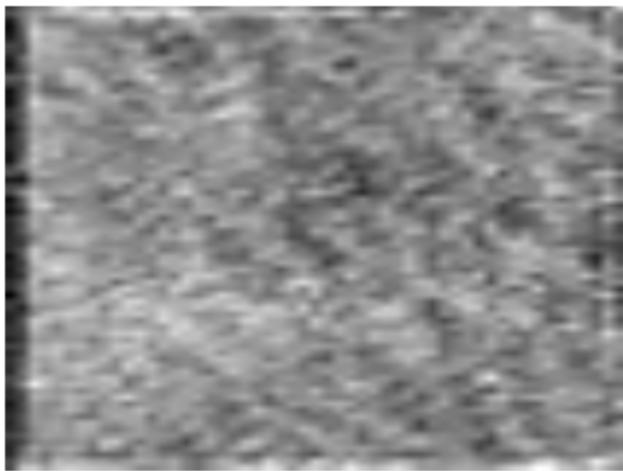
Predicted Contact

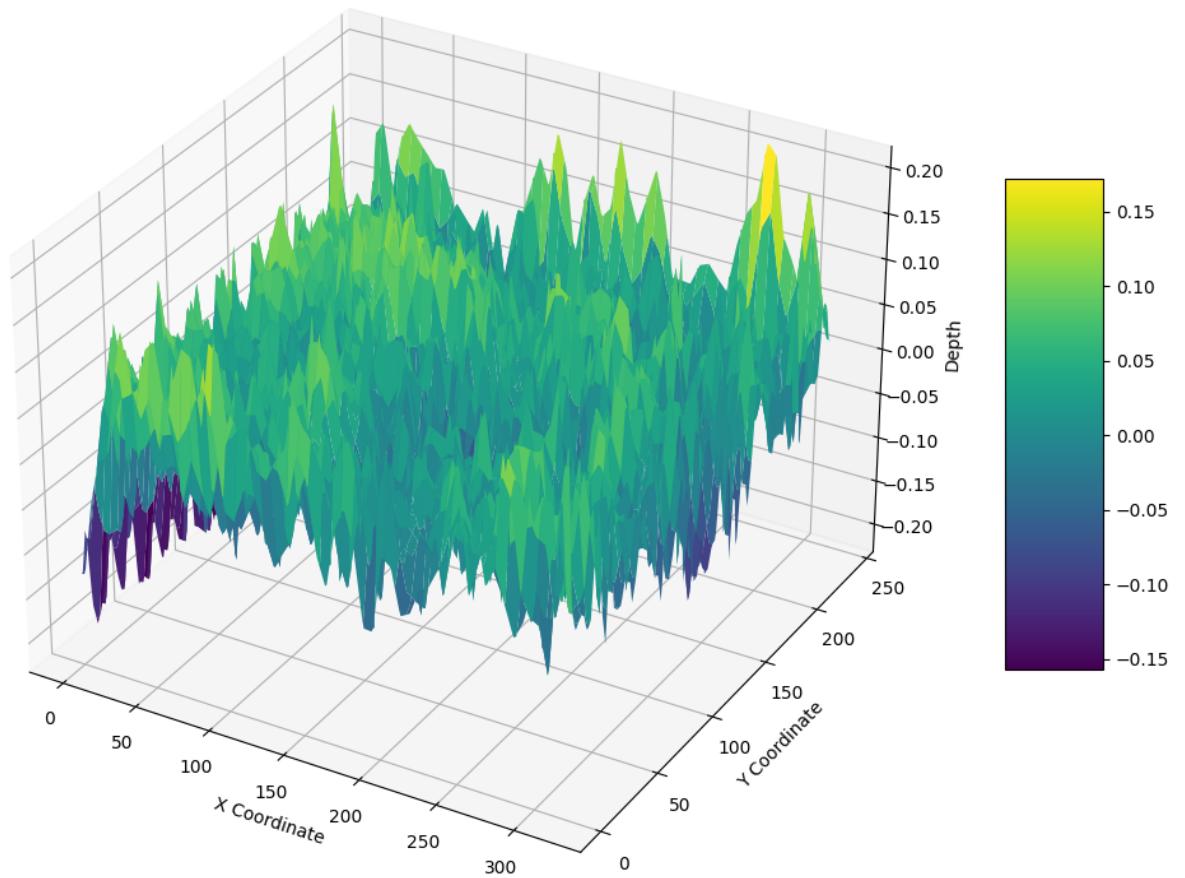


Predicted Depth



Predicted Depth

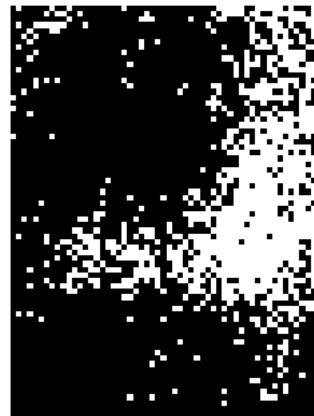




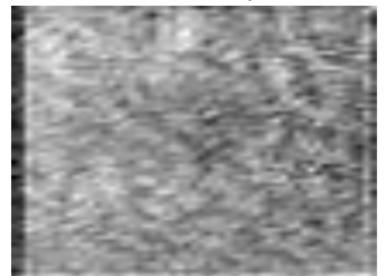
Tactile Image 19



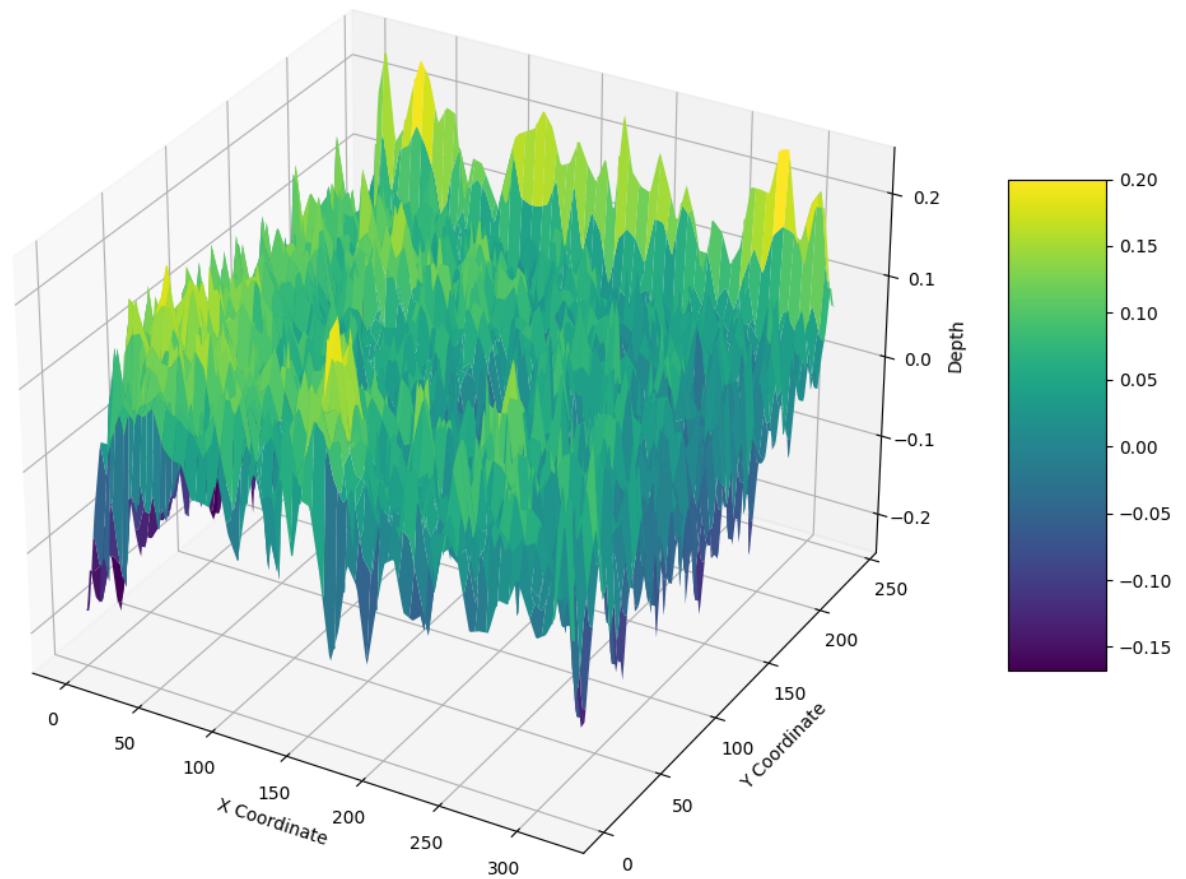
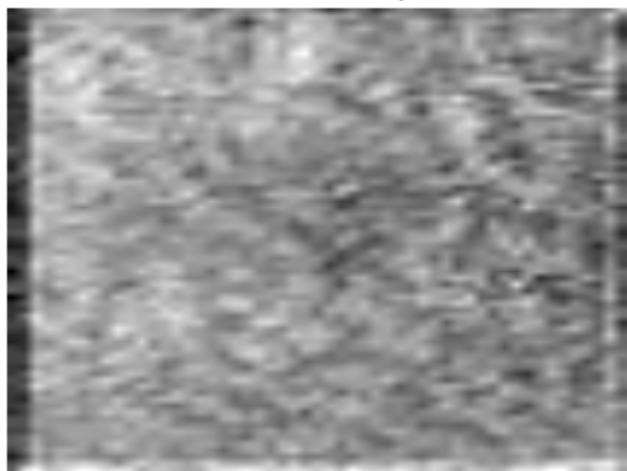
Predicted Contact



Predicted Depth



Predicted Depth



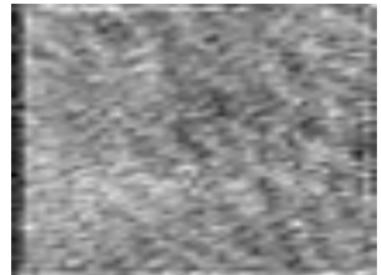
Tactile Image 20



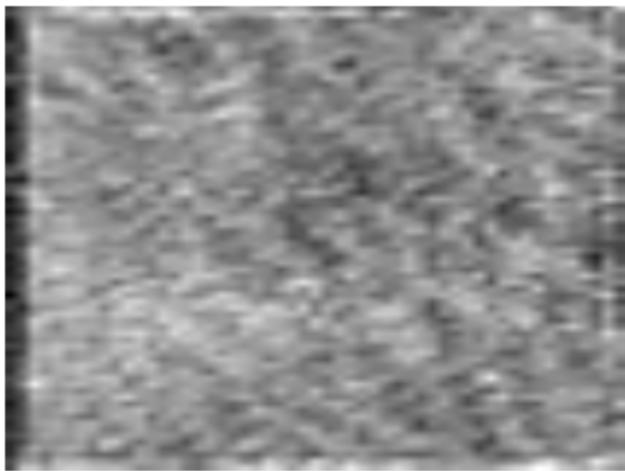
Predicted Contact

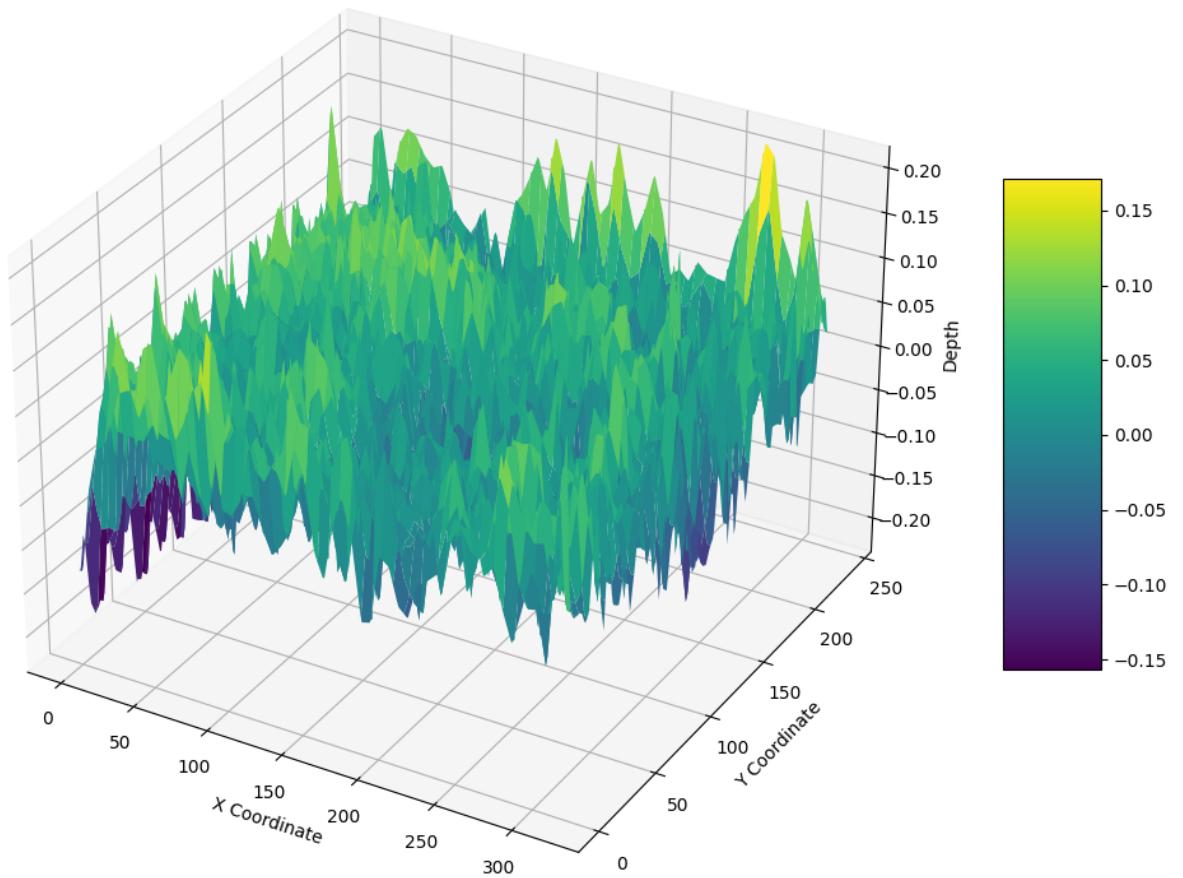


Predicted Depth

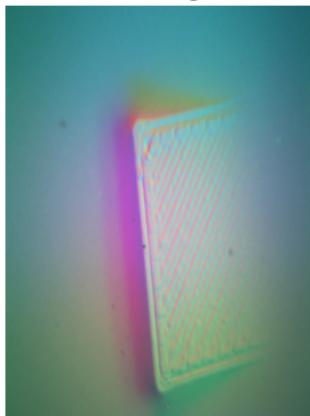


Predicted Depth

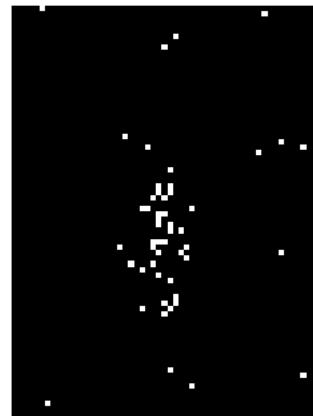




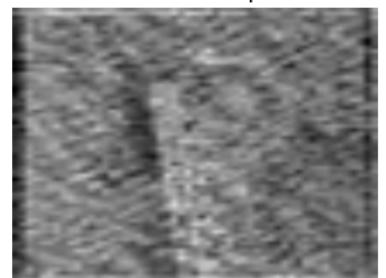
Tactile Image 21



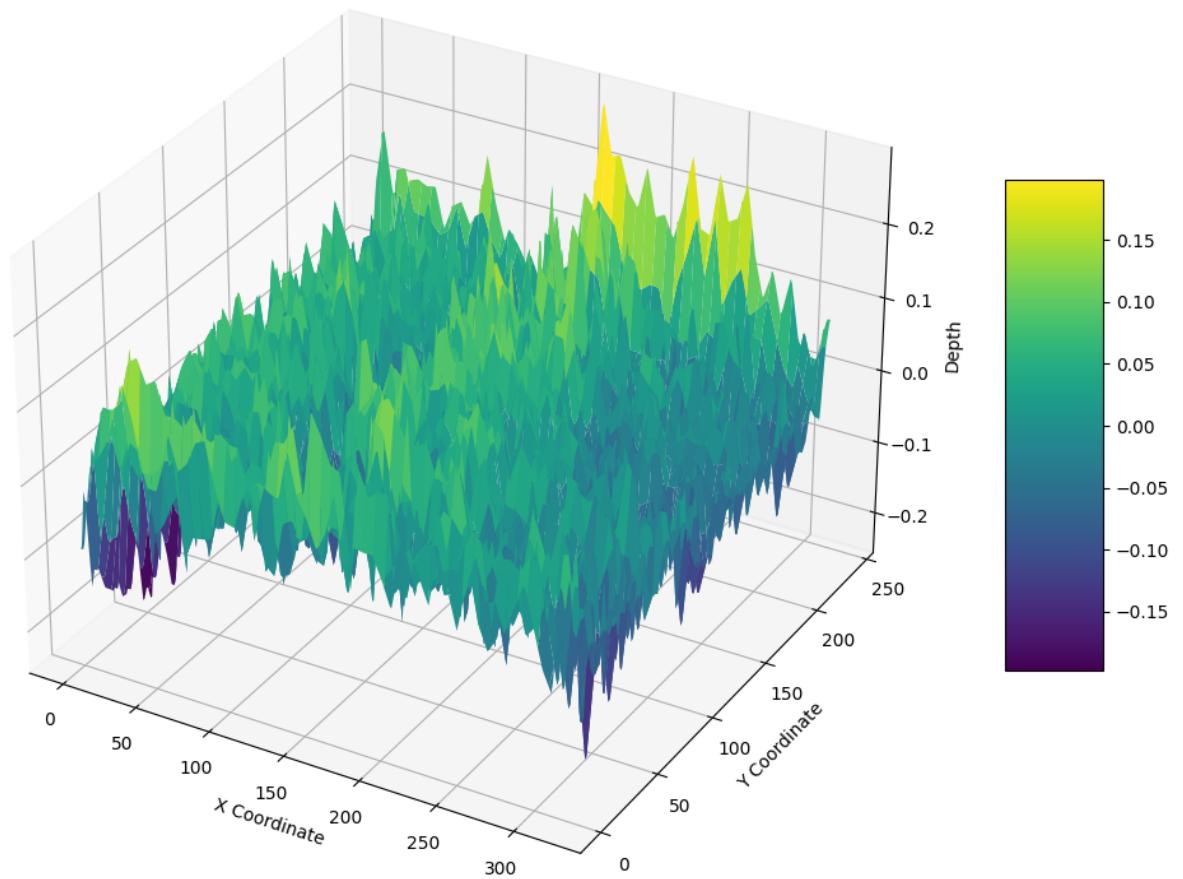
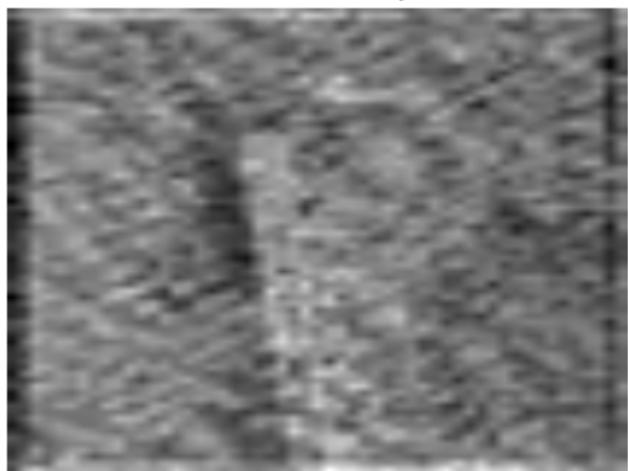
Predicted Contact



Predicted Depth



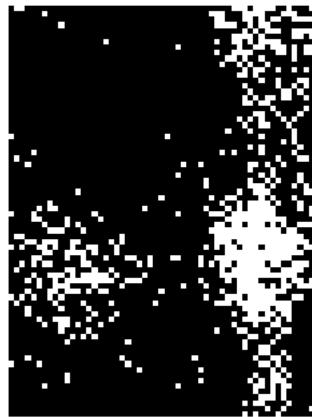
Predicted Depth



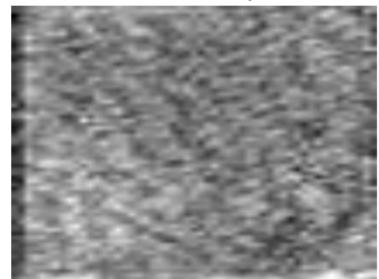
Tactile Image 22



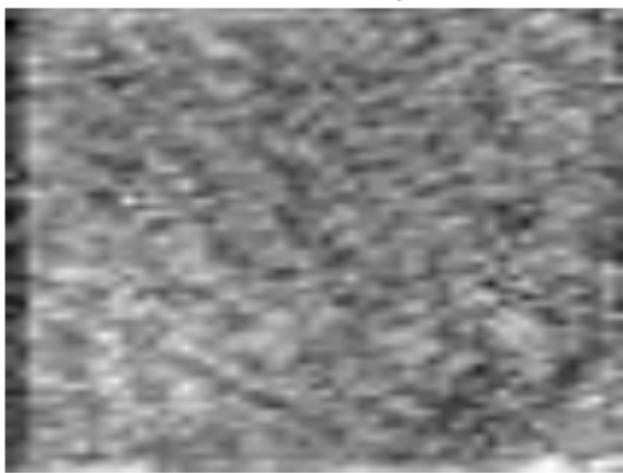
Predicted Contact

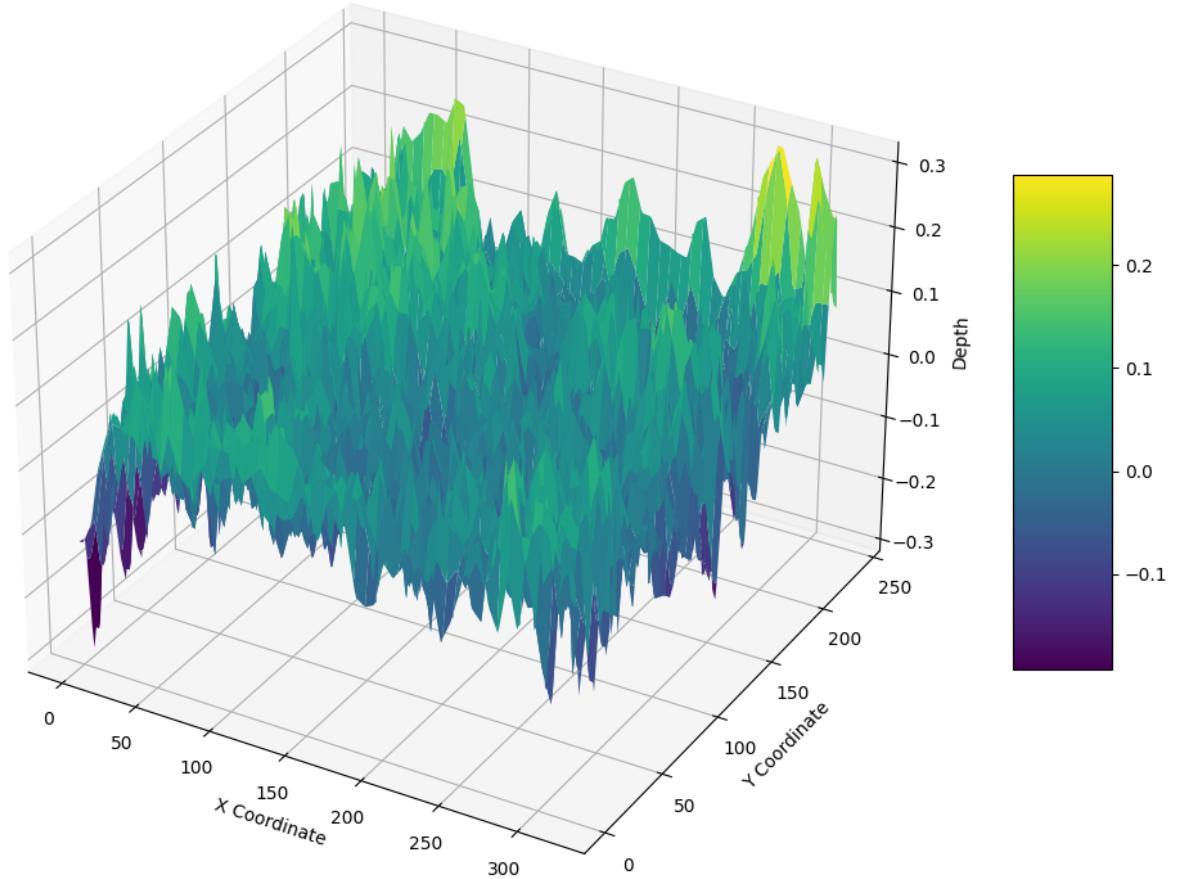


Predicted Depth



Predicted Depth

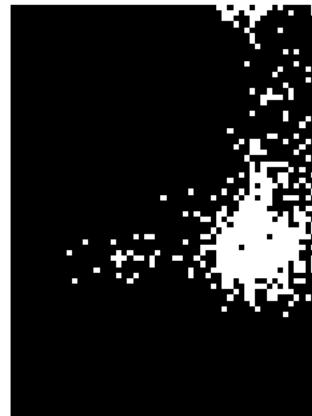




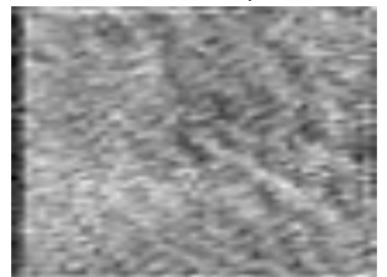
Tactile Image 23



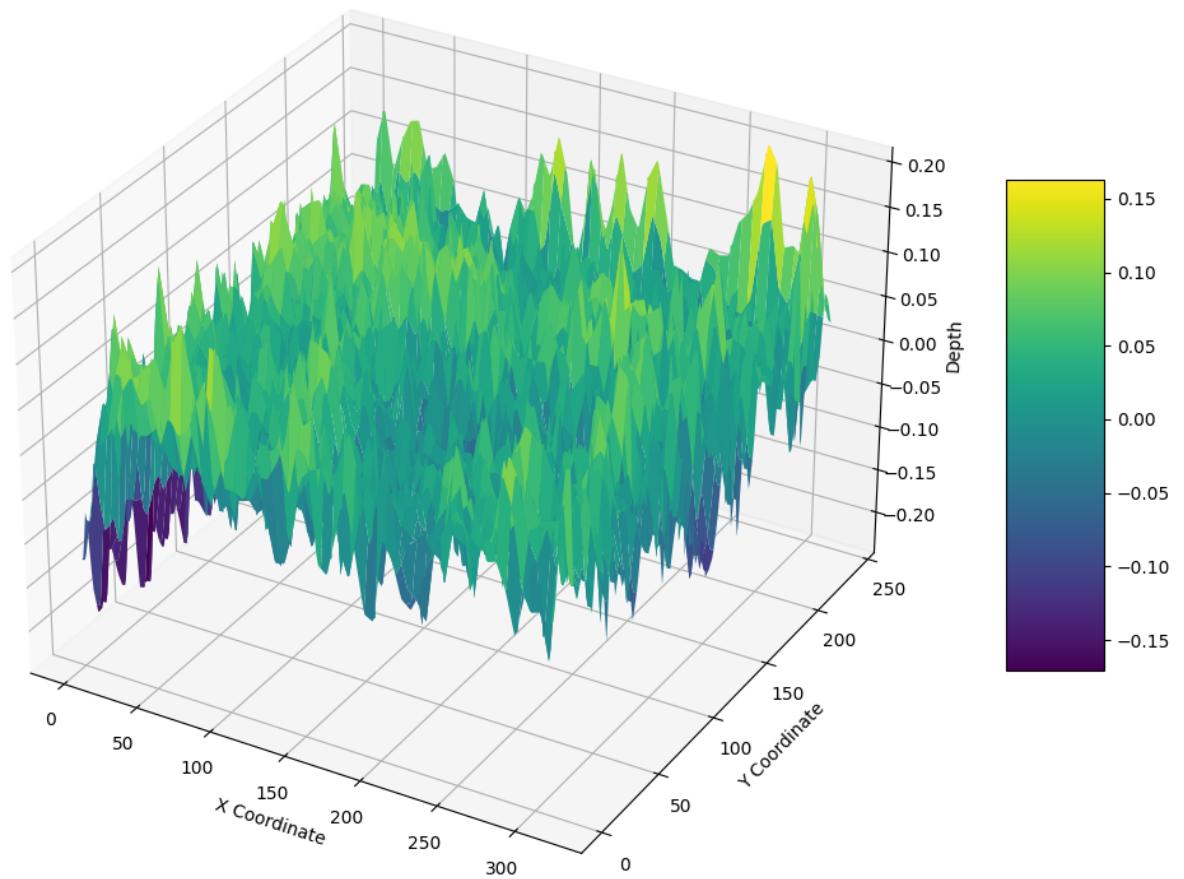
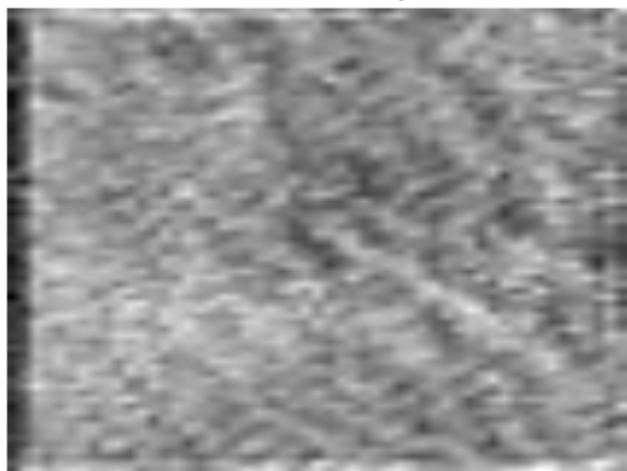
Predicted Contact



Predicted Depth



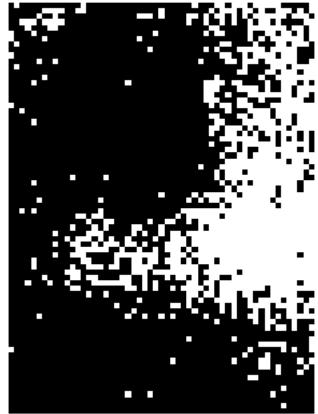
Predicted Depth



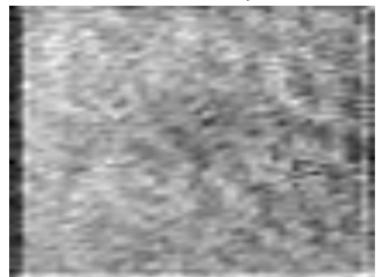
Tactile Image 24



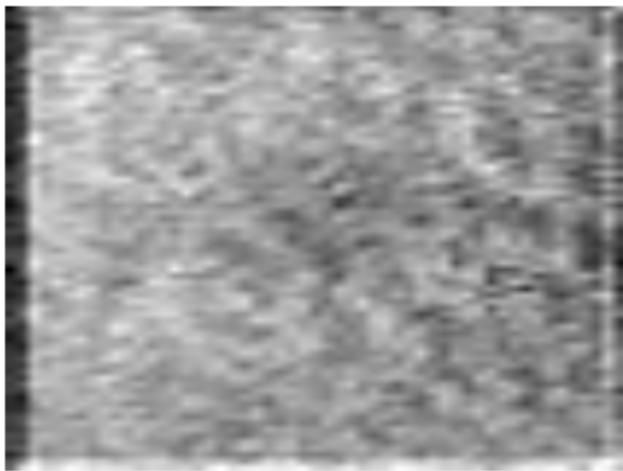
Predicted Contact

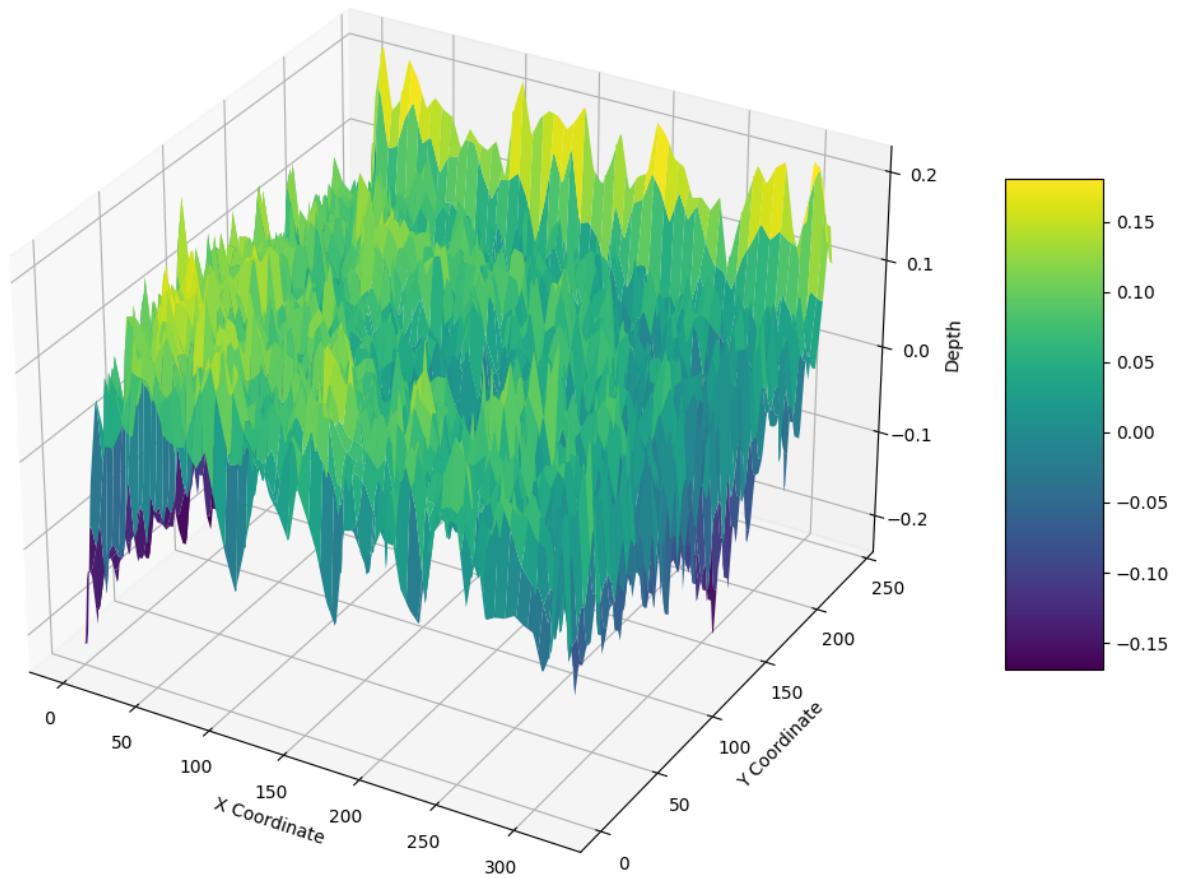


Predicted Depth



Predicted Depth

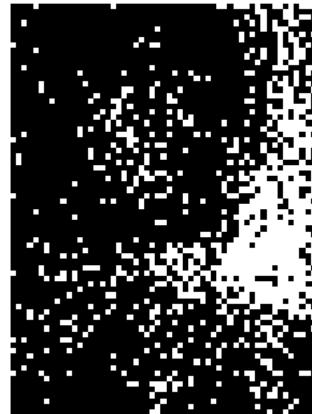




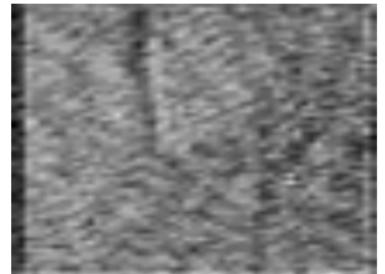
Tactile Image 25



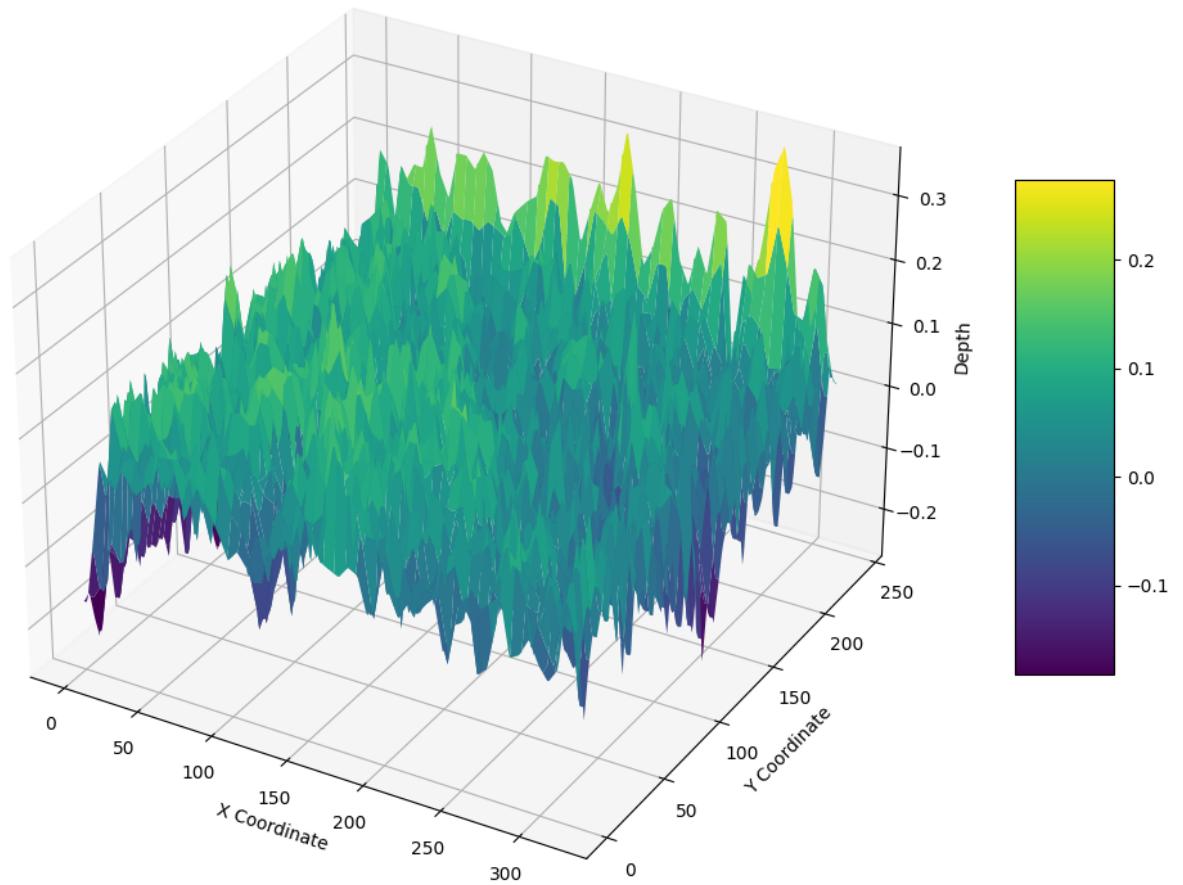
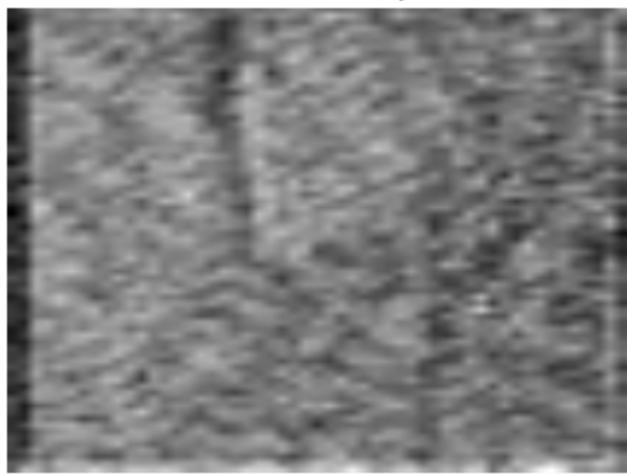
Predicted Contact



Predicted Depth



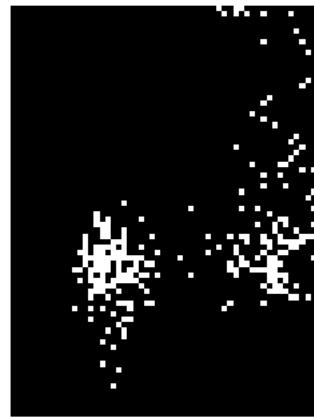
Predicted Depth



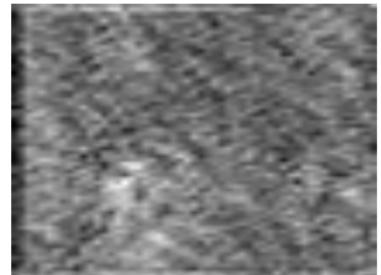
Tactile Image 26



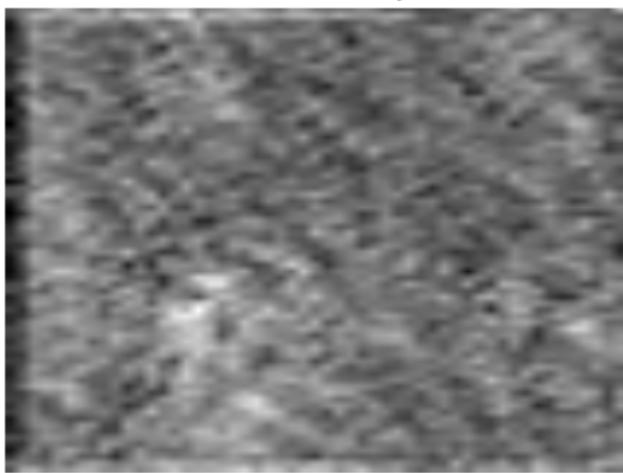
Predicted Contact

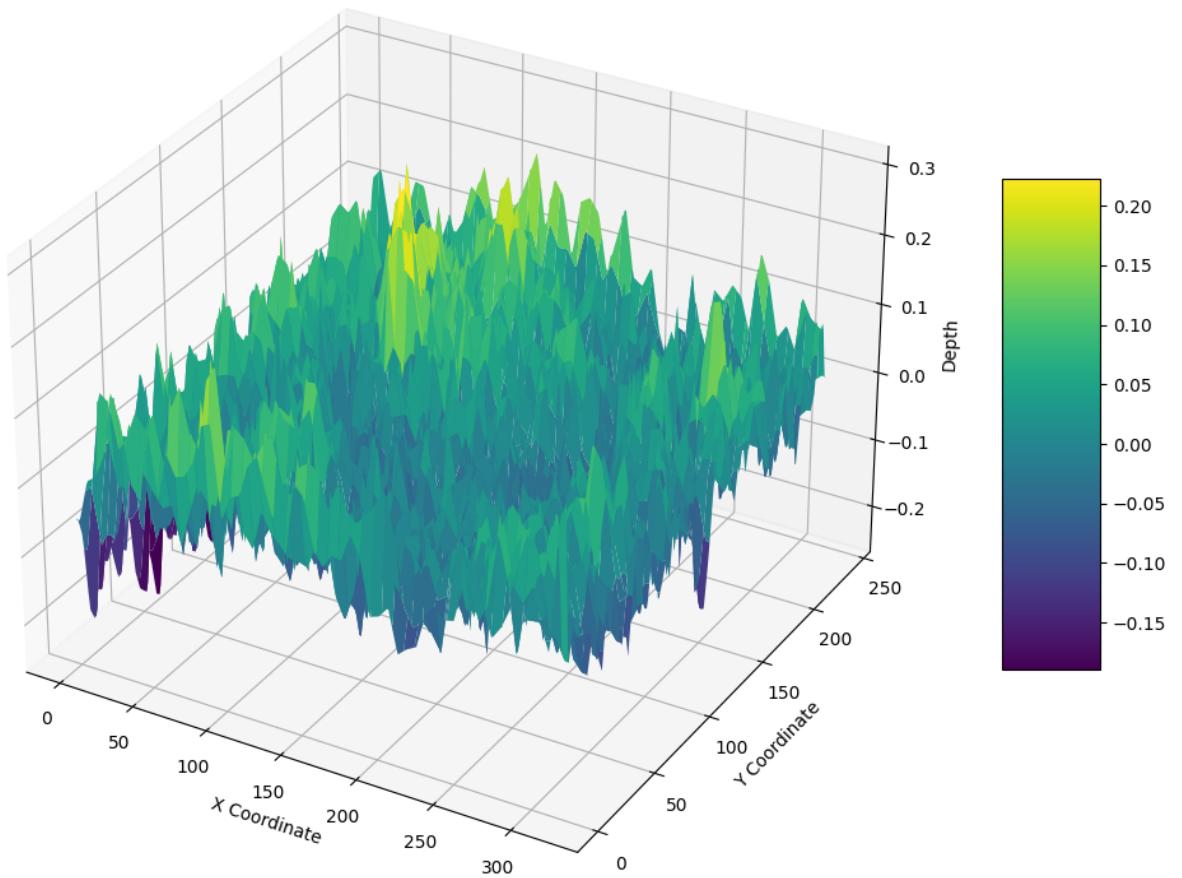


Predicted Depth



Predicted Depth

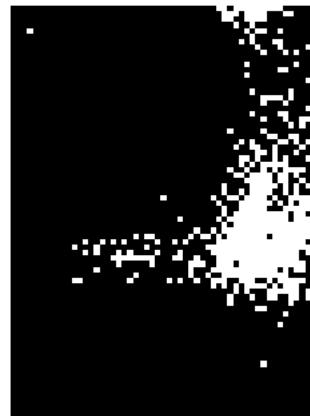




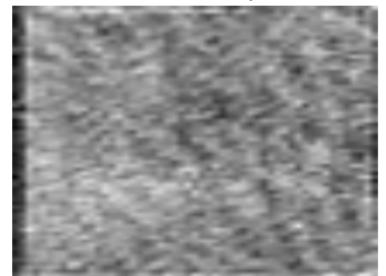
Tactile Image 27



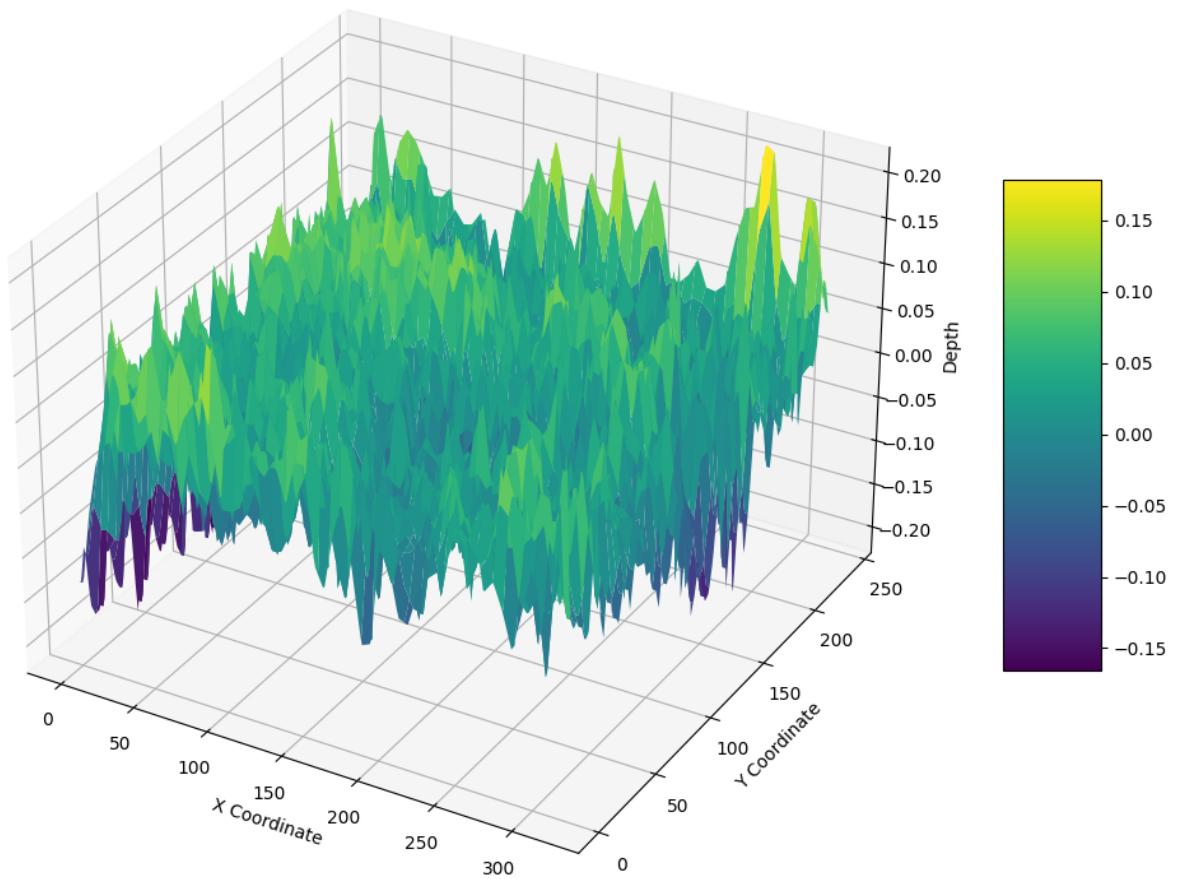
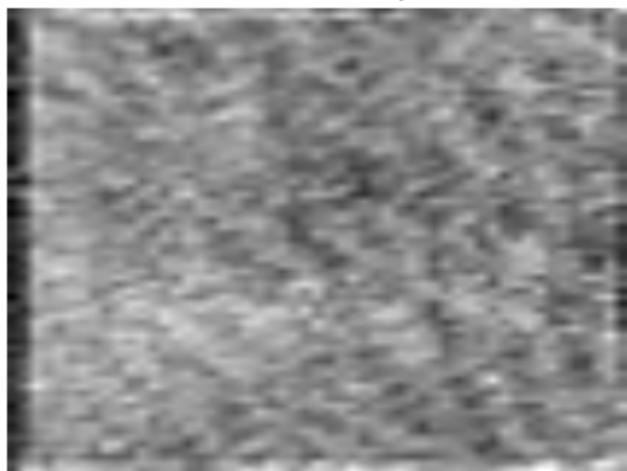
Predicted Contact



Predicted Depth



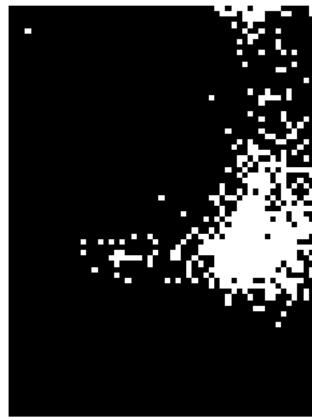
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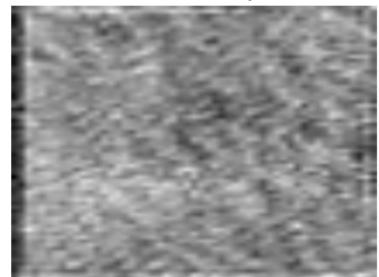
Tactile Image 28



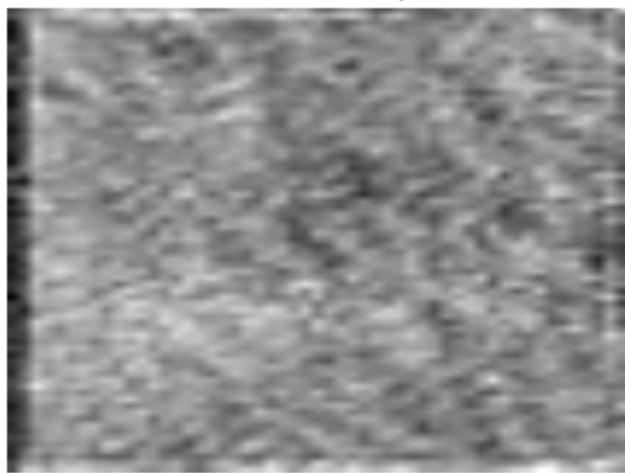
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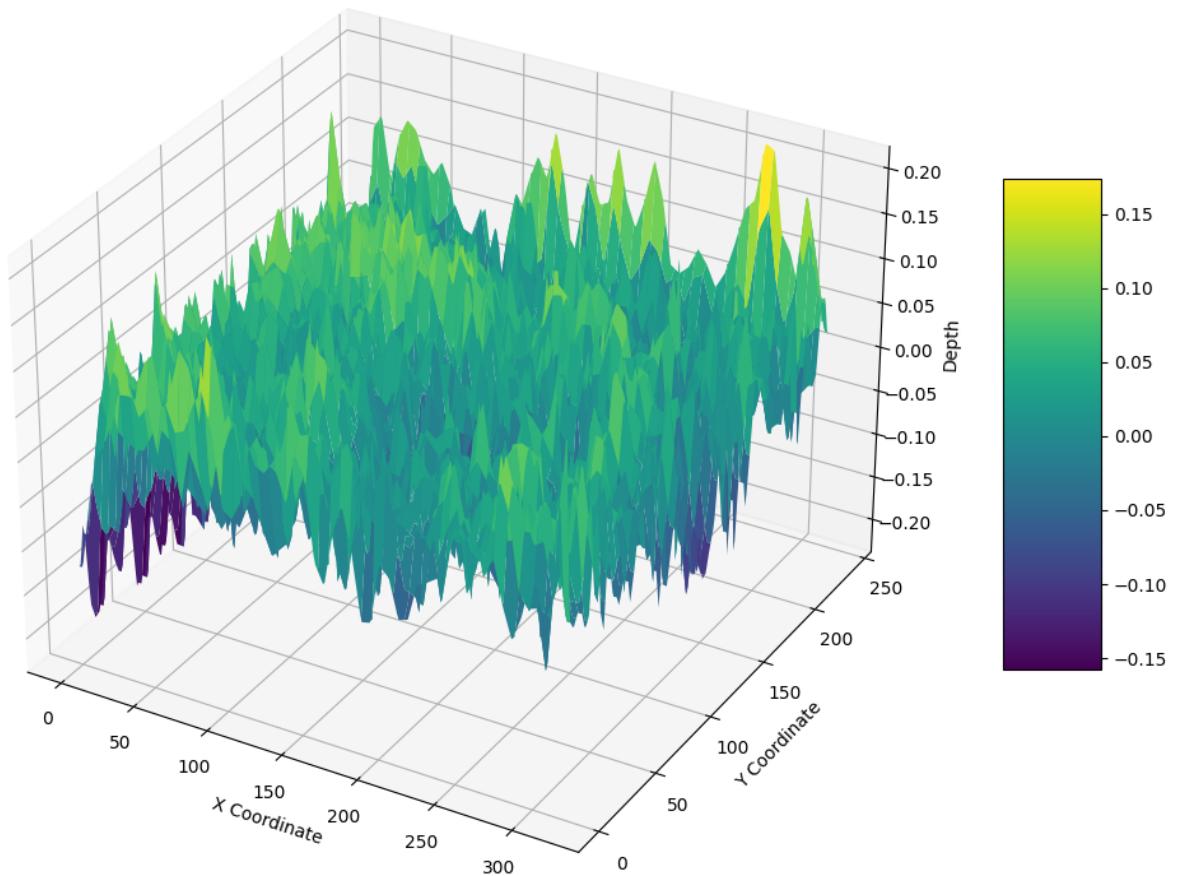


Predicted Depth

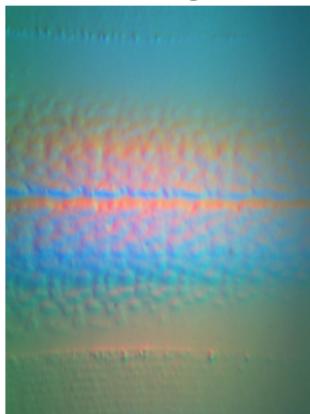


Predicted Depth

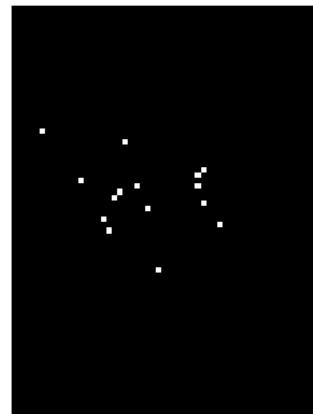




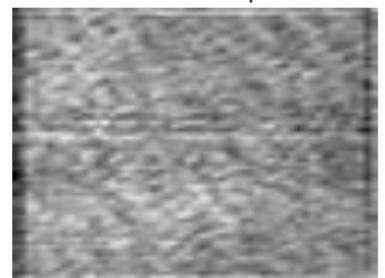
Tactile Image 29



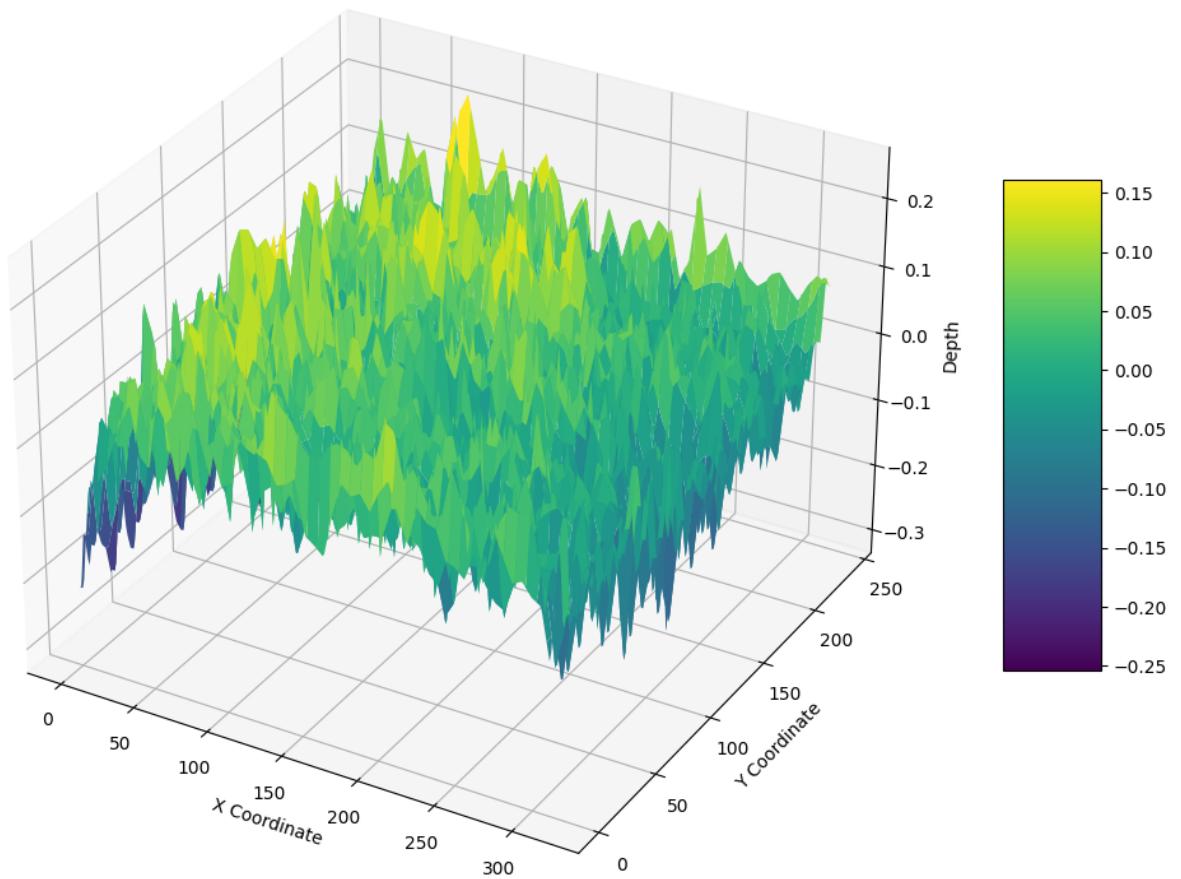
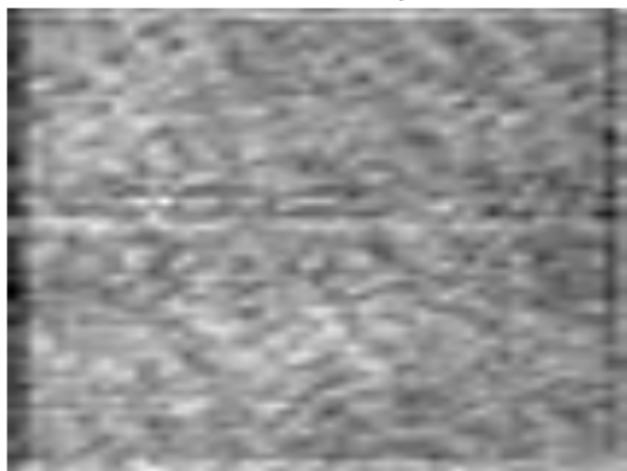
Predicted Contact



Predicted Depth



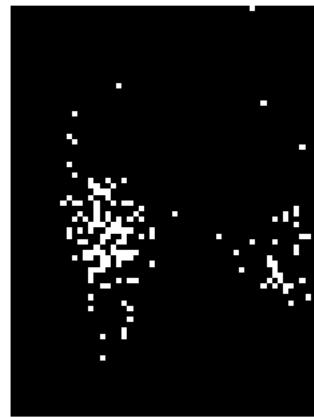
Predicted Depth



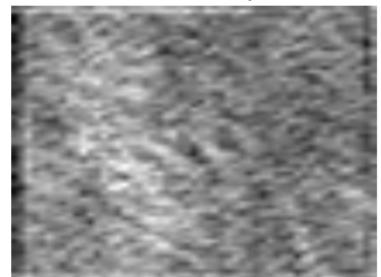
Tactile Image 30



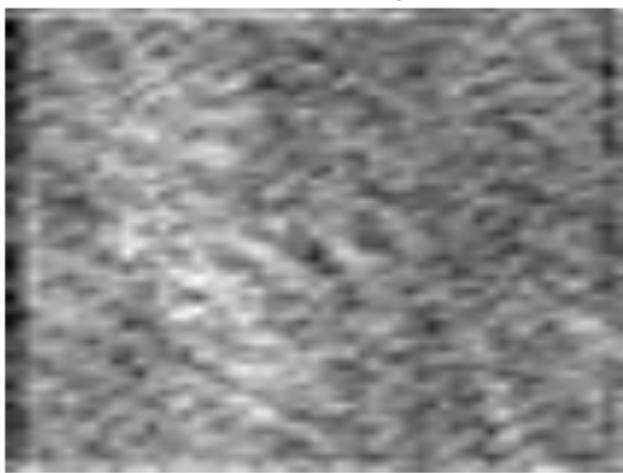
Predicted Contact

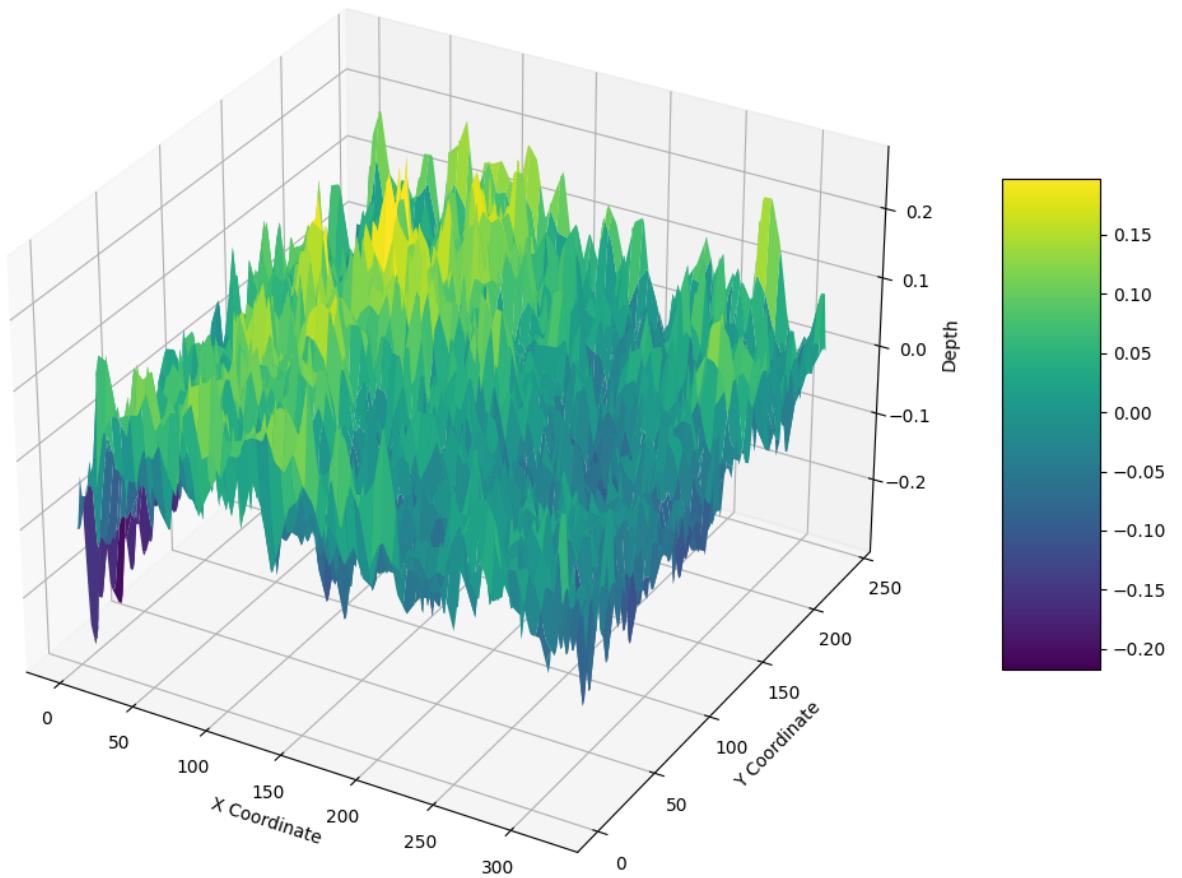


Predicted Depth

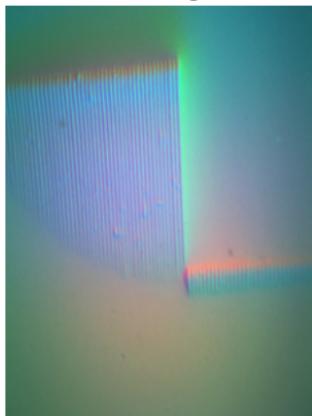


Predicted Depth

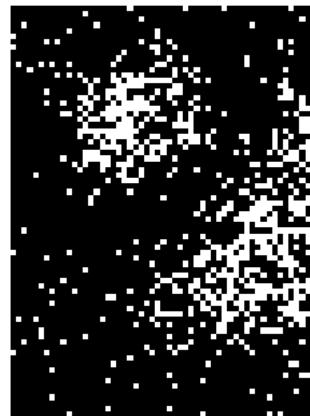




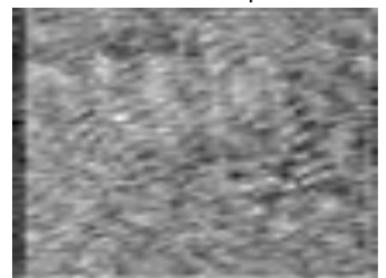
Tactile Image 31



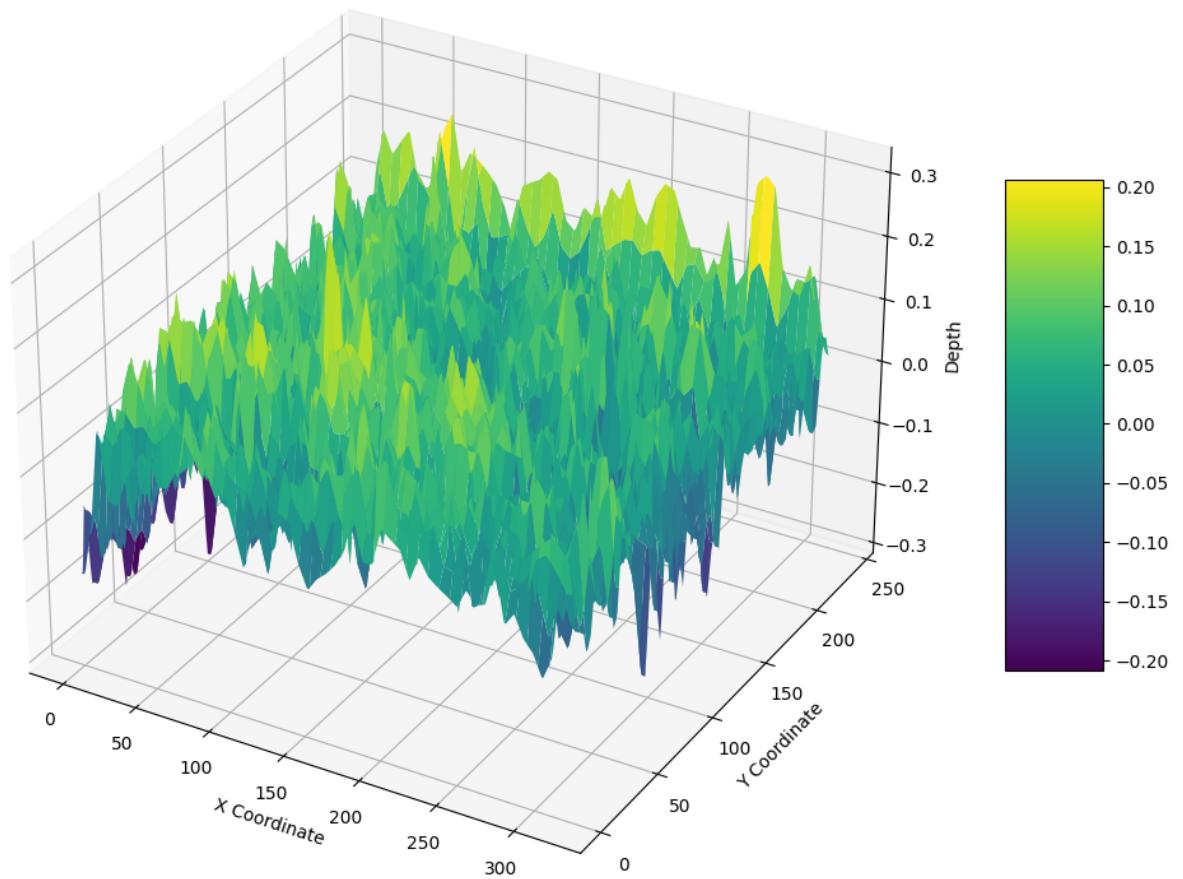
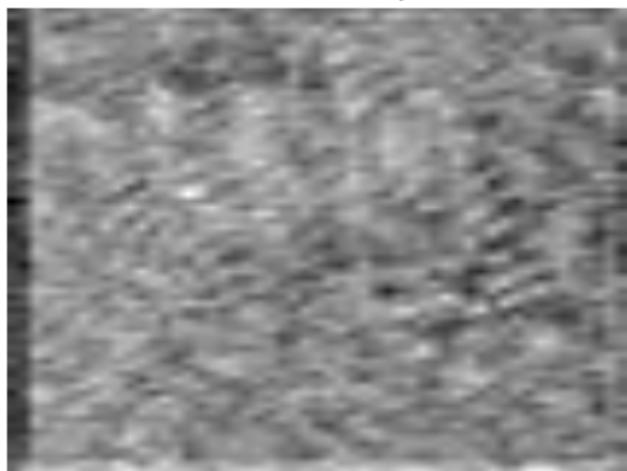
Predicted Contact



Predicted Depth



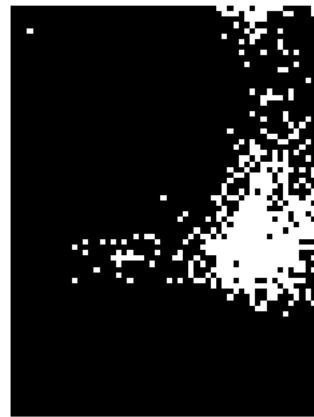
Predicted Depth



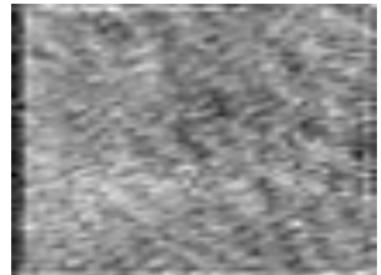
Tactile Image 32



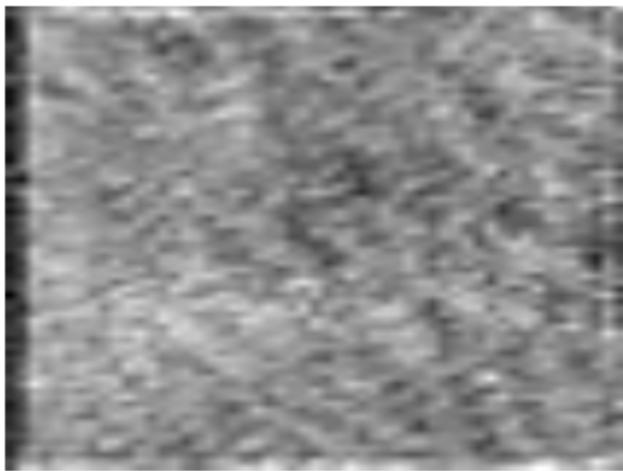
Predicted Contact

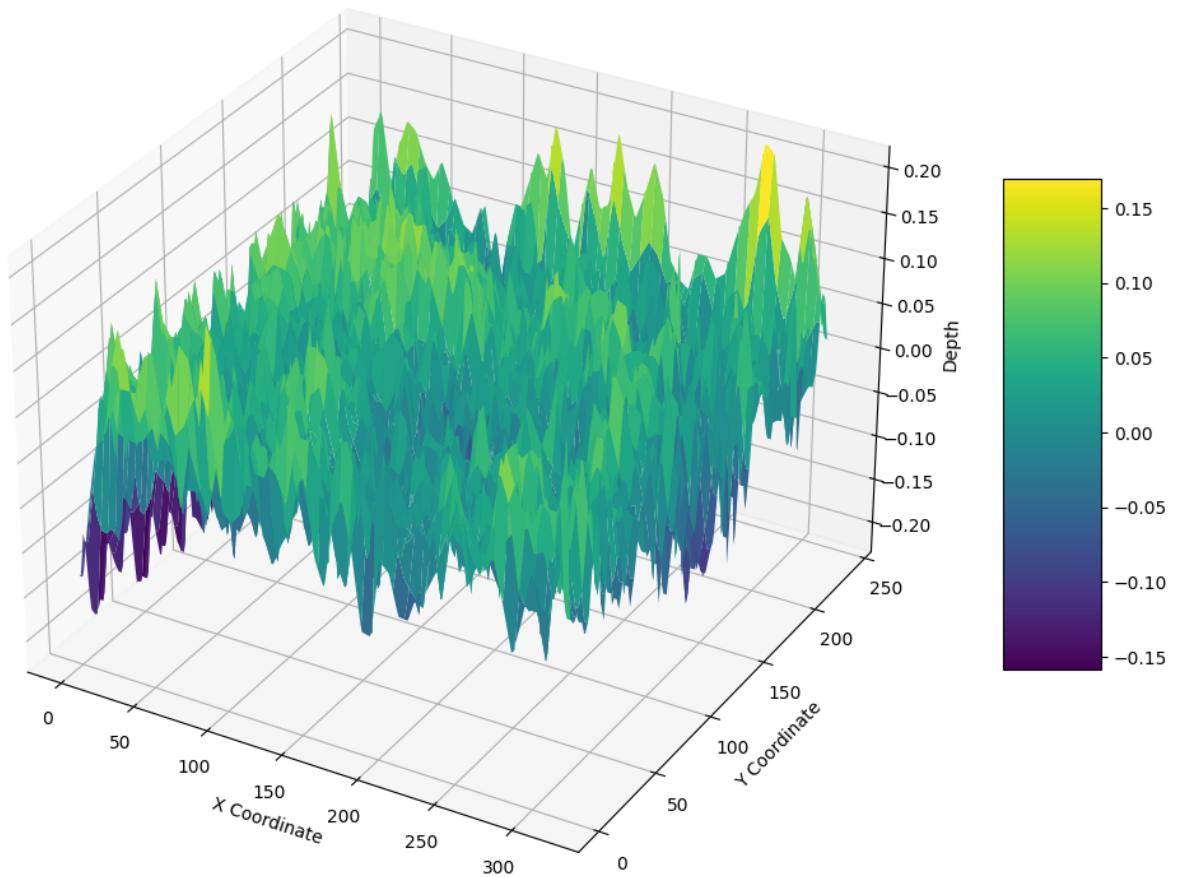


Predicted Depth

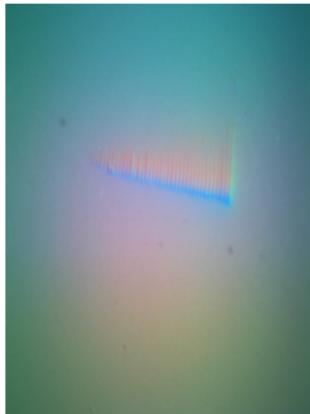


Predicted Depth





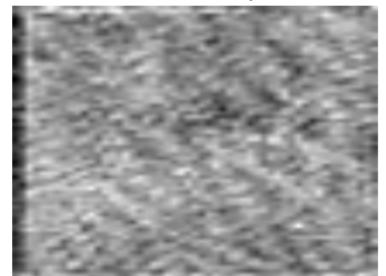
Tactile Image 33



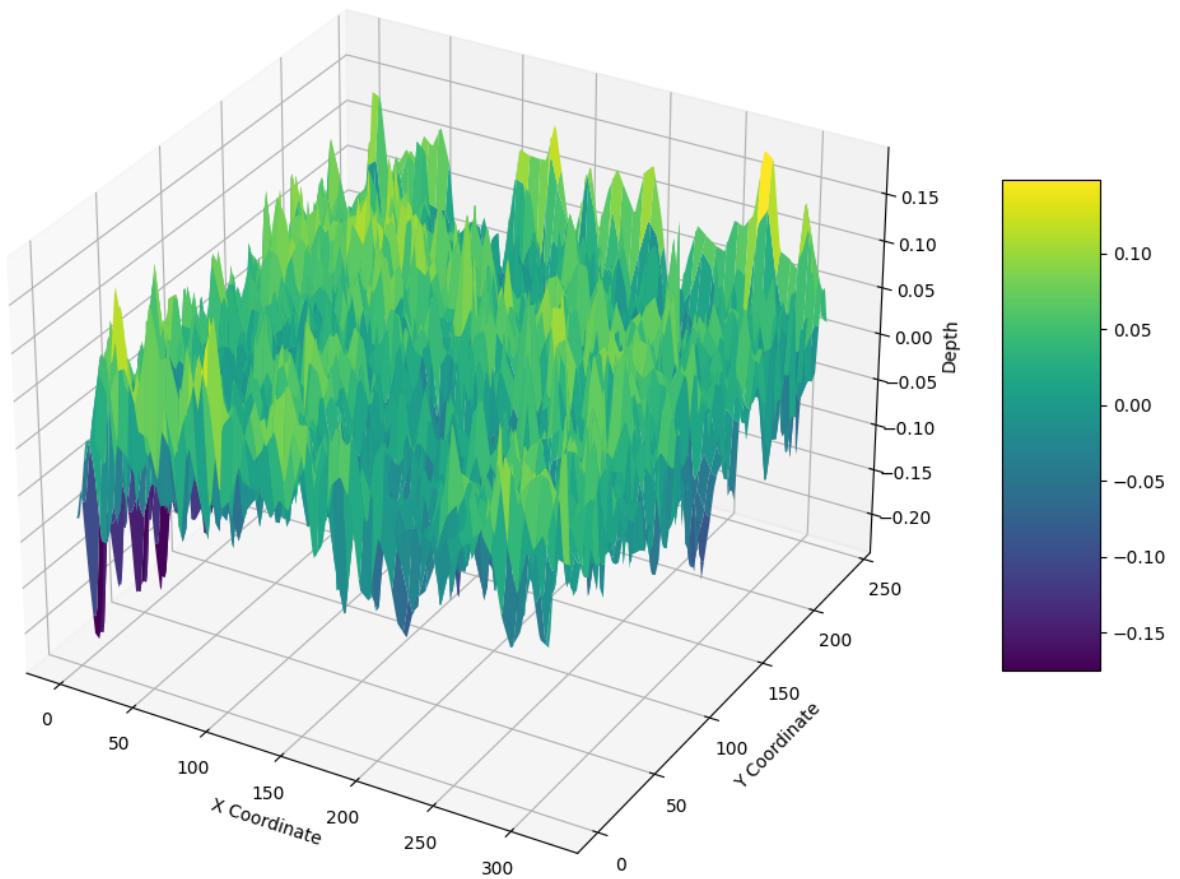
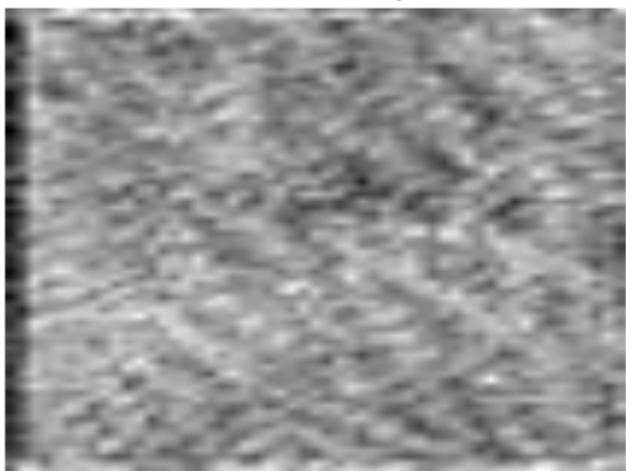
Predicted Contact



Predicted Depth



Predicted Depth



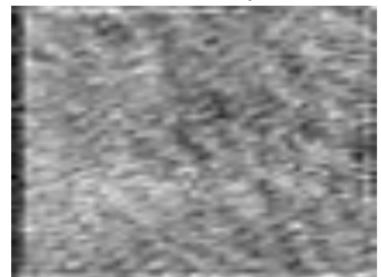
Tactile Image 34



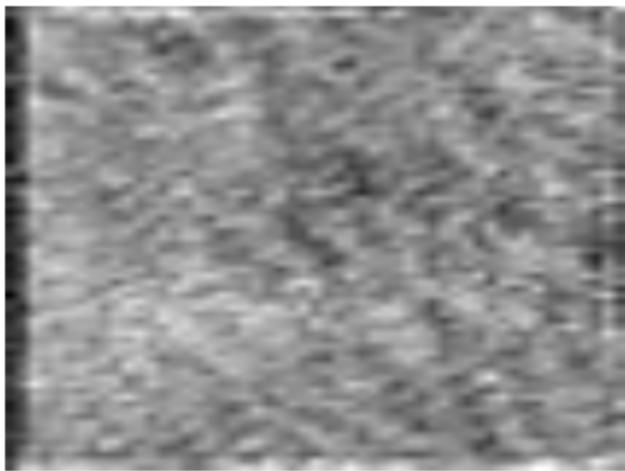
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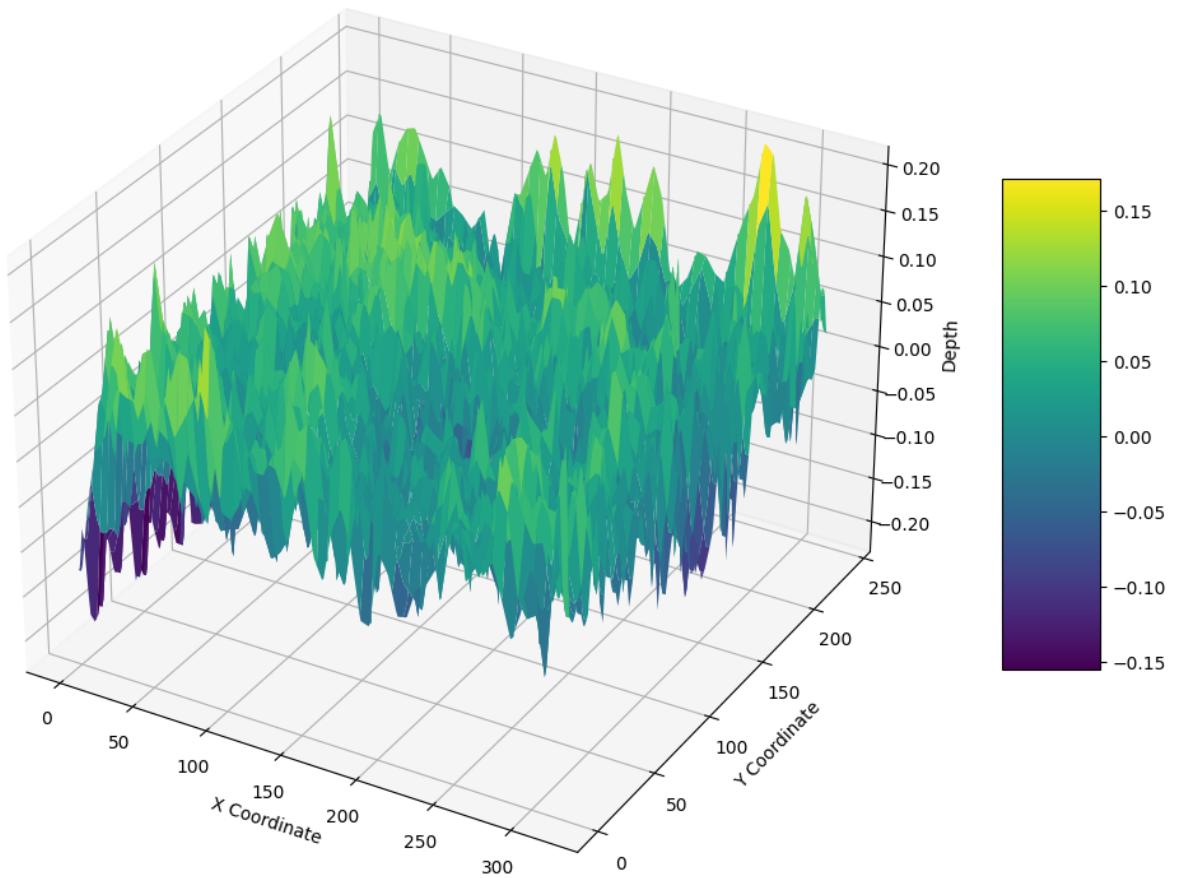


Predicted Depth



Predicted Depth

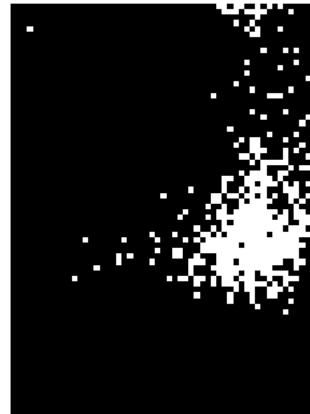




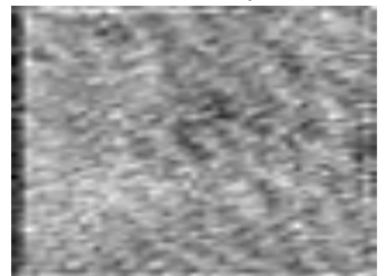
Tactile Image 35



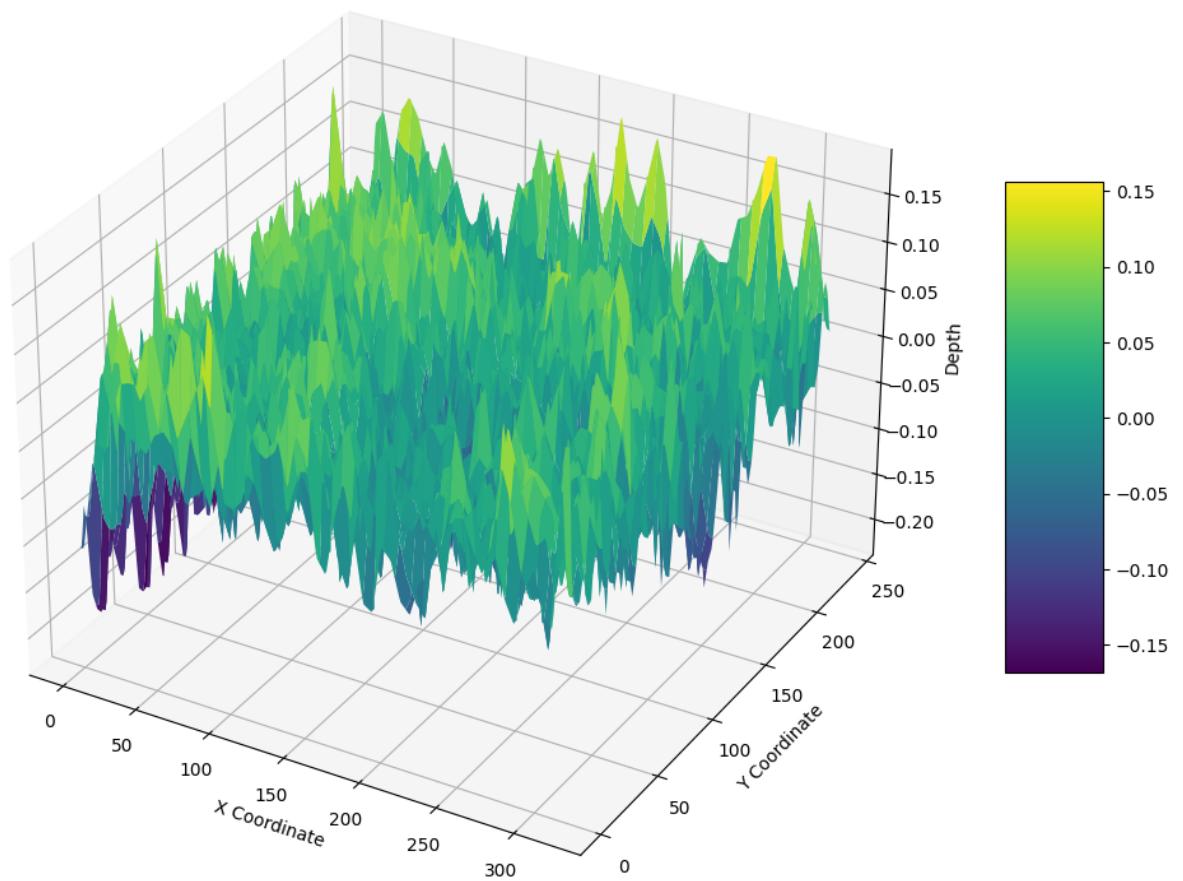
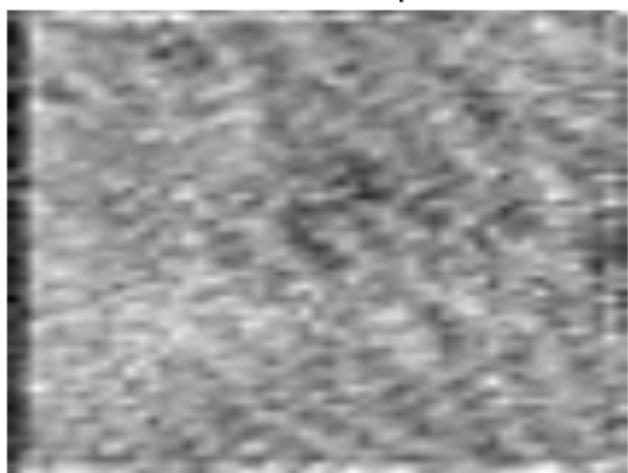
Predicted Contact



Predicted Depth



Predicted Depth



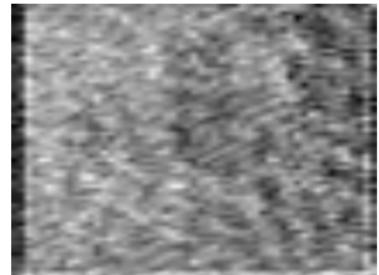
Tactile Image 36



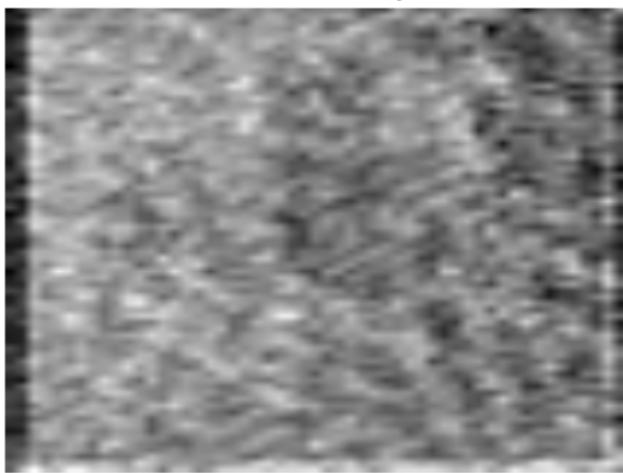
Predicted Contact

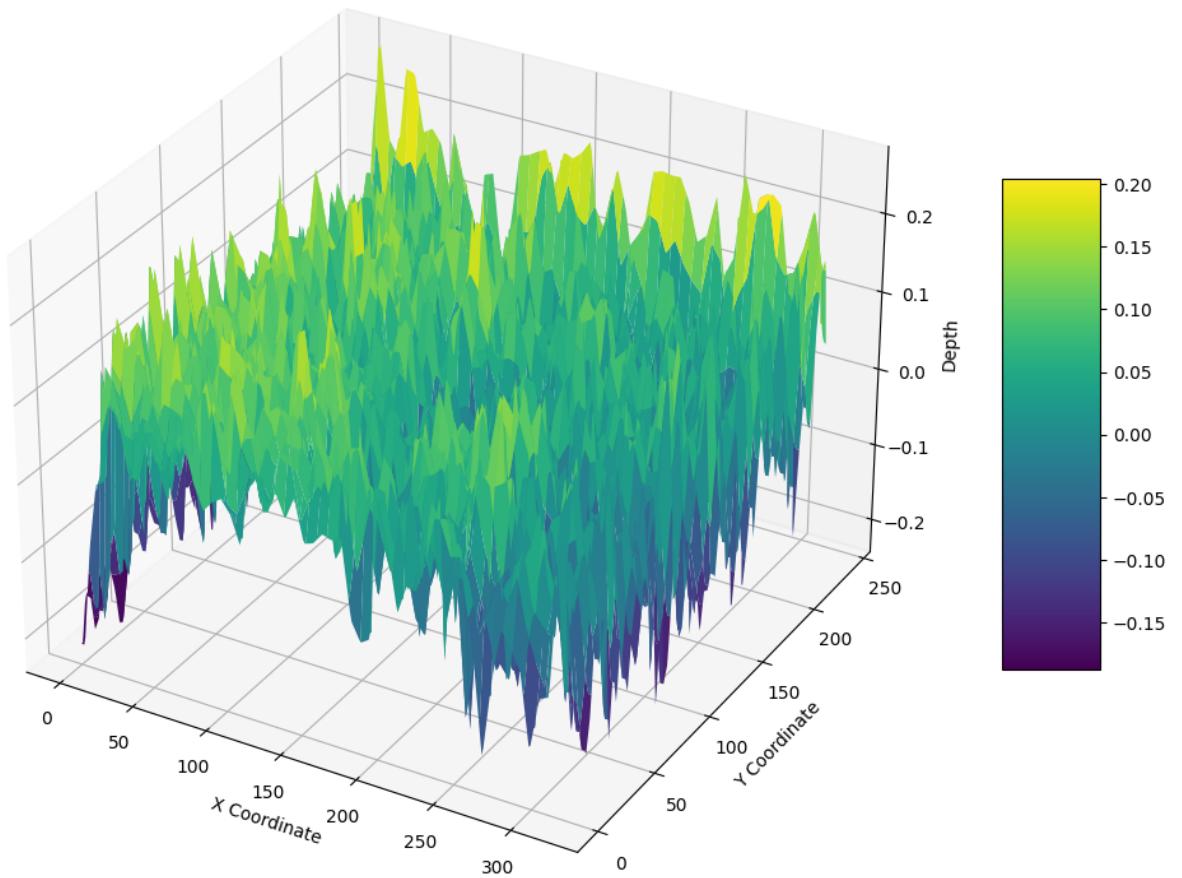


Predicted Depth



Predicted Depth

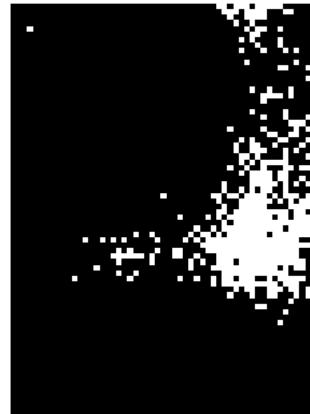




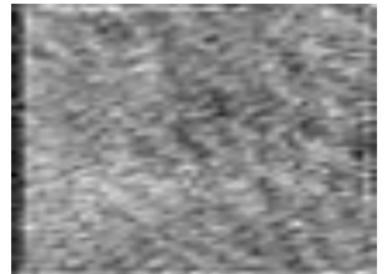
Tactile Image 37



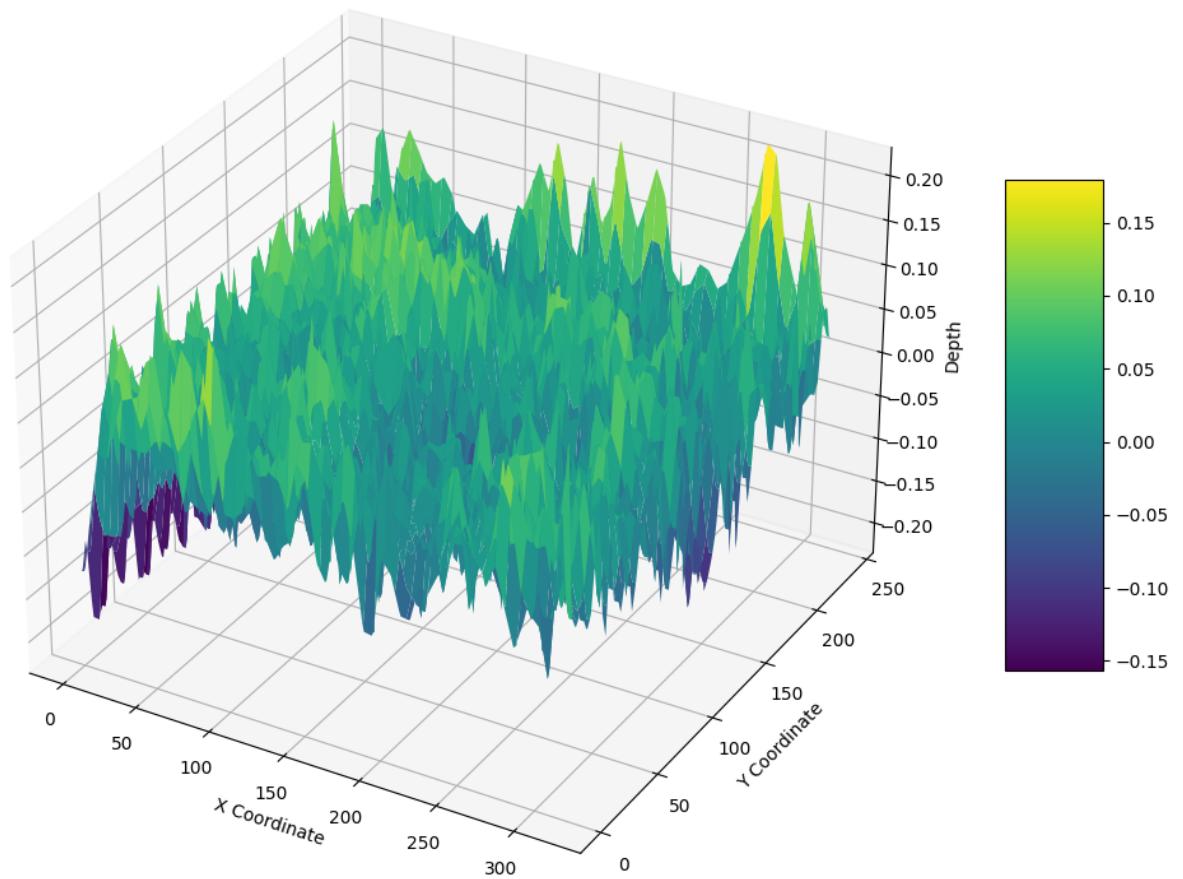
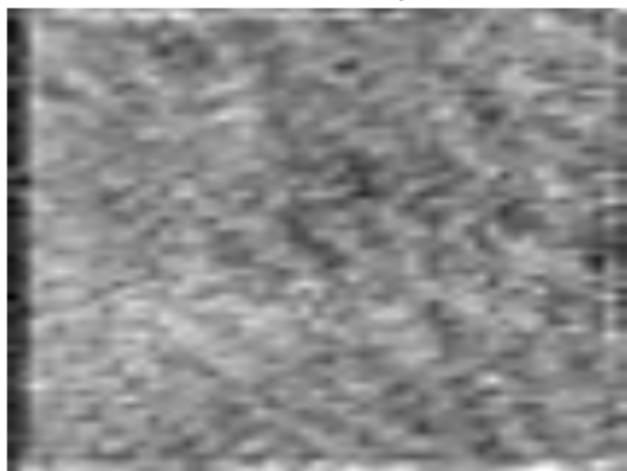
Predicted Contact



Predicted Depth



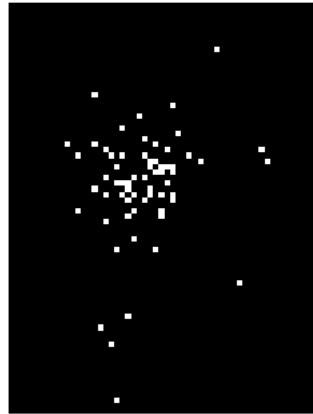
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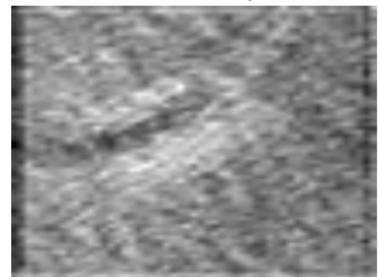
Tactile Image 38



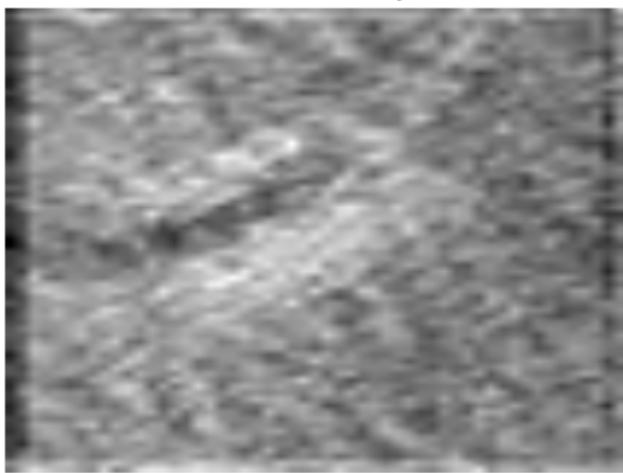
Predicted Contact

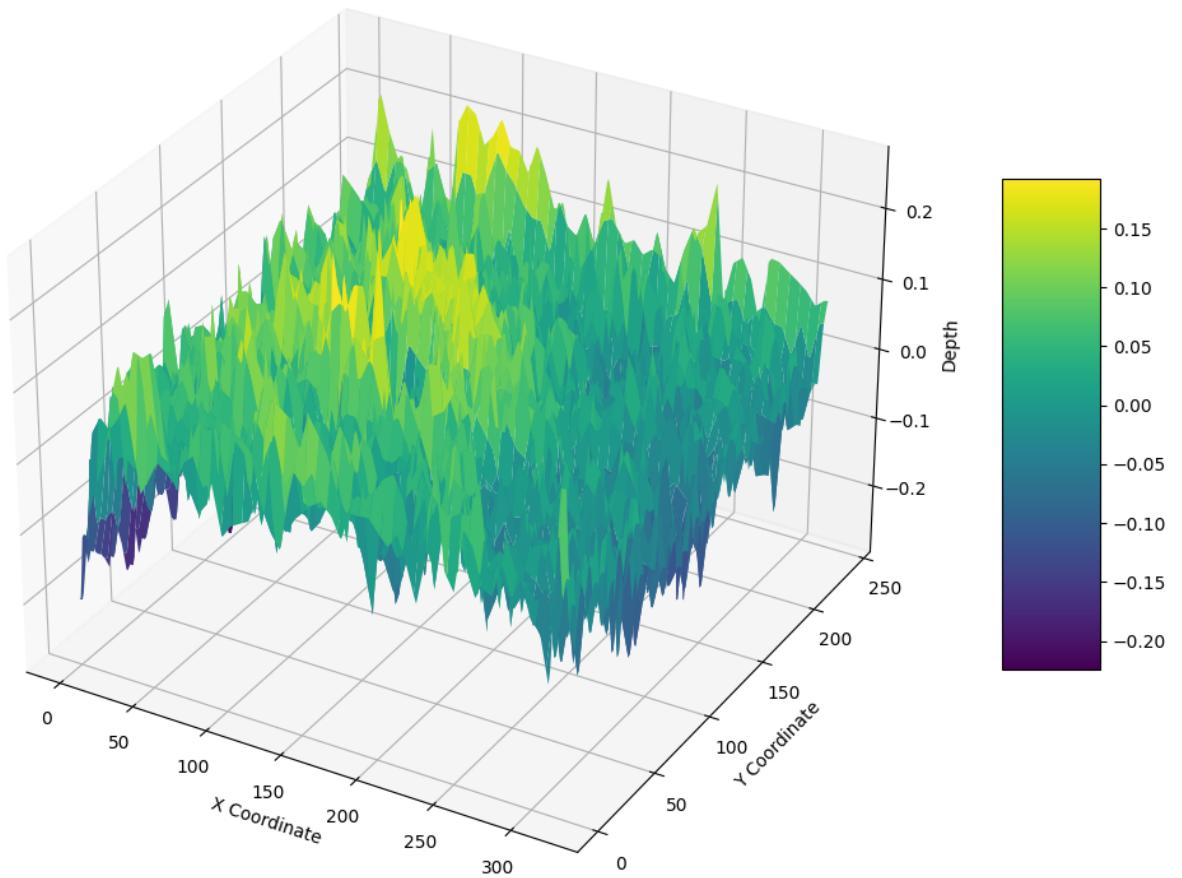


Predicted Depth

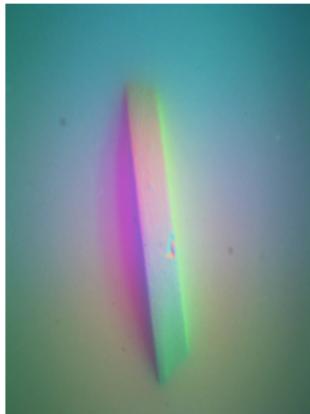


Predicted Depth

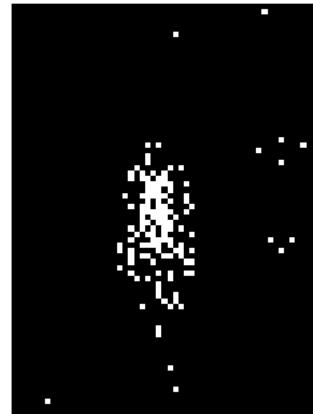




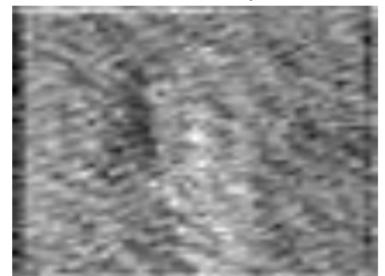
Tactile Image 39



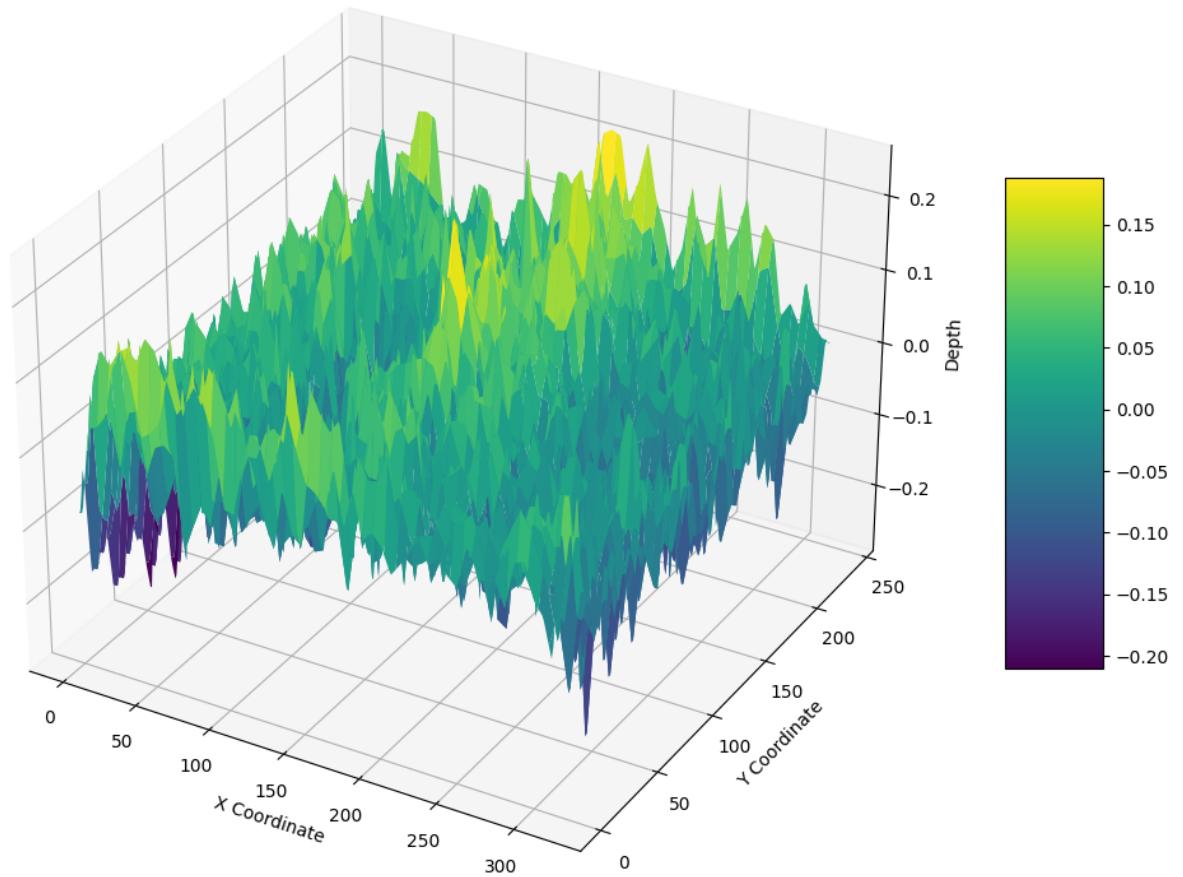
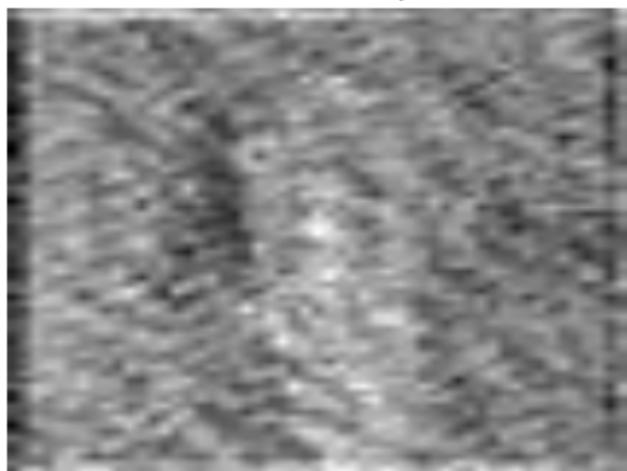
Predicted Contact



Predicted Depth



Predicted Depth



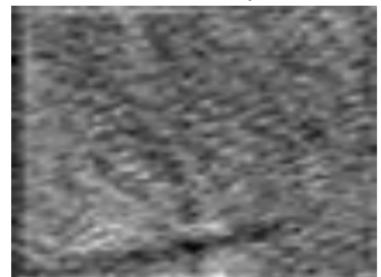
Tactile Image 40



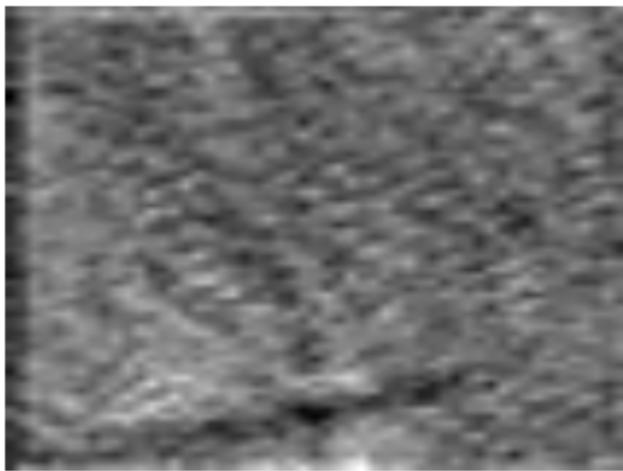
Predicted Contact

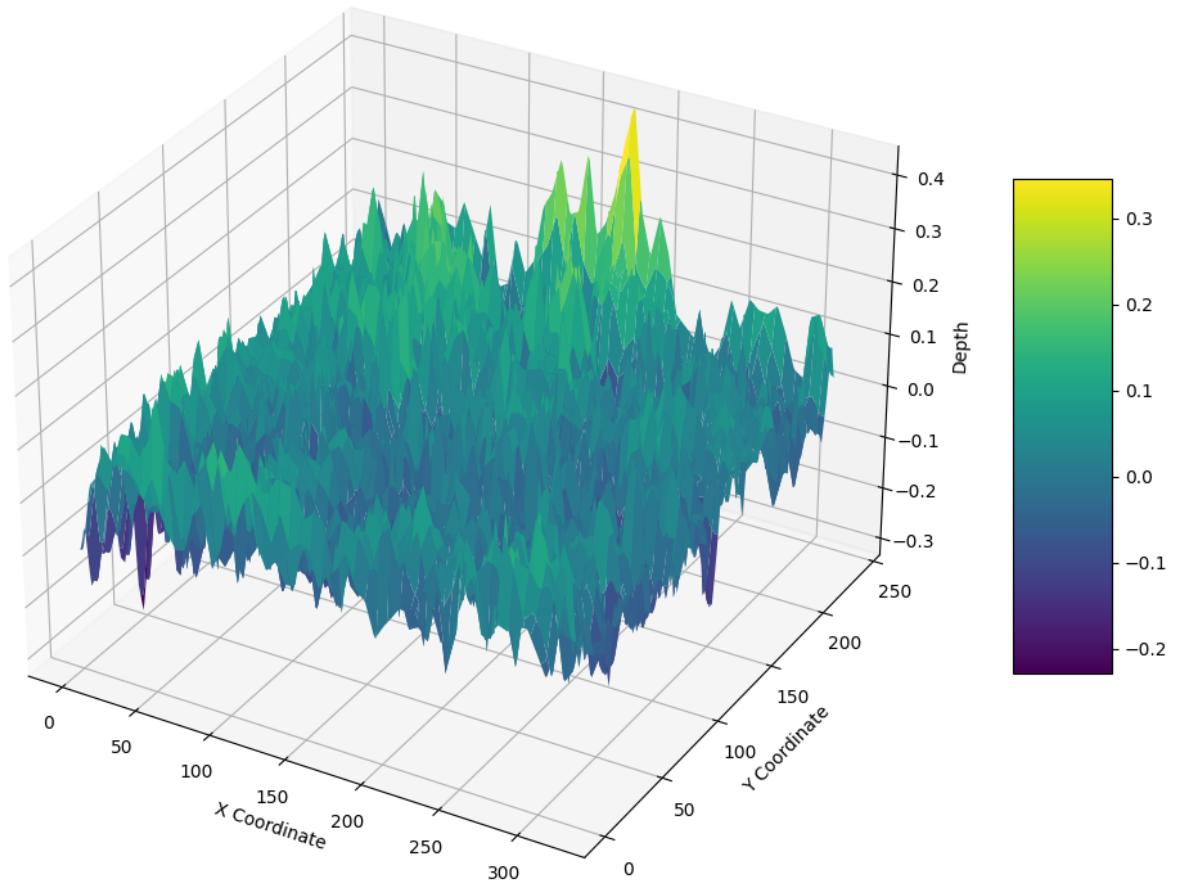


Predicted Depth



Predicted Depth

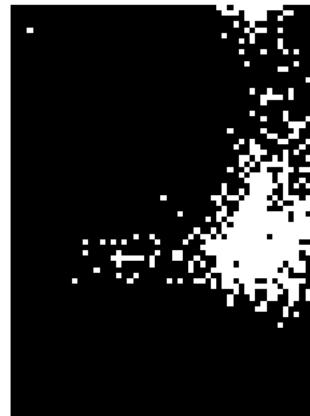




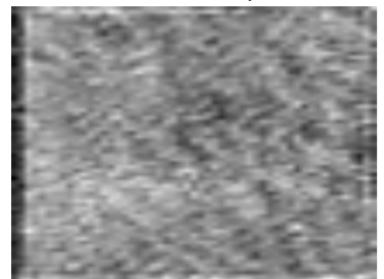
Tactile Image 41



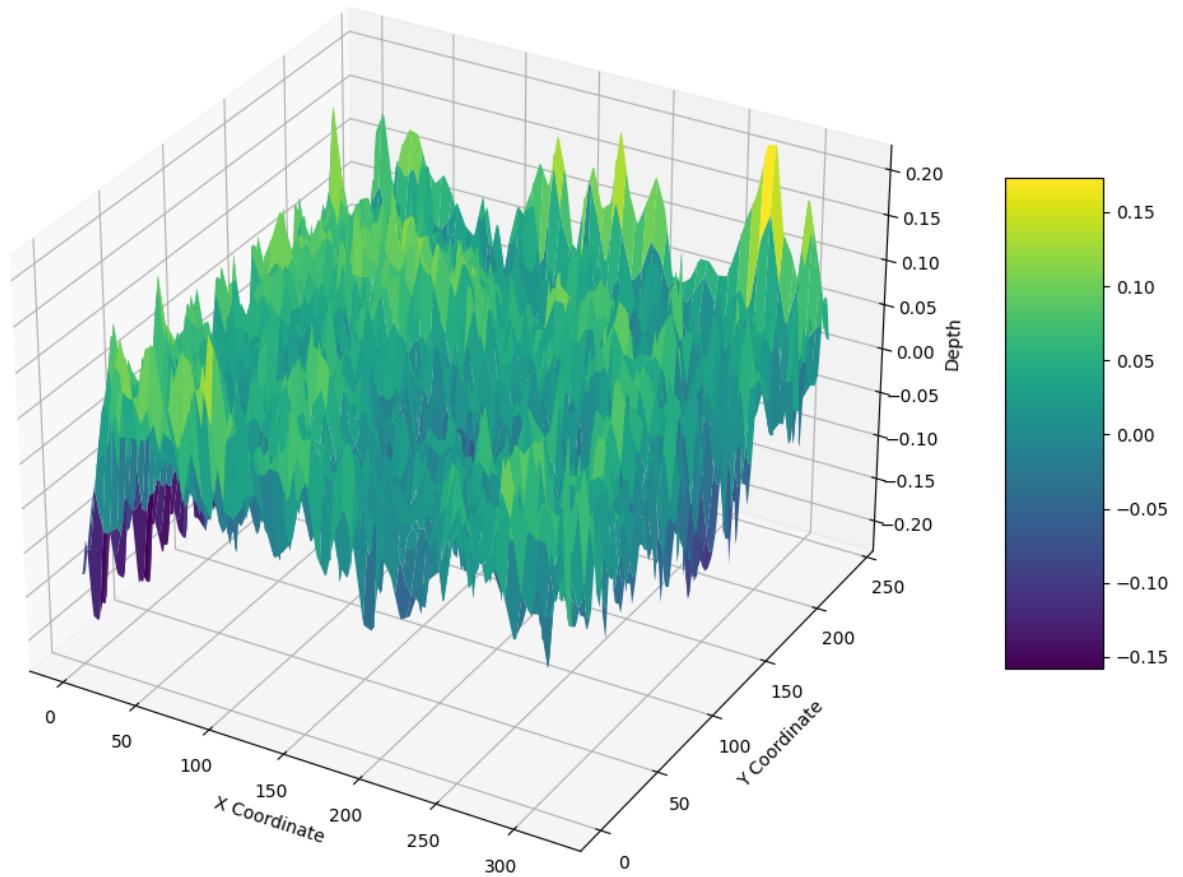
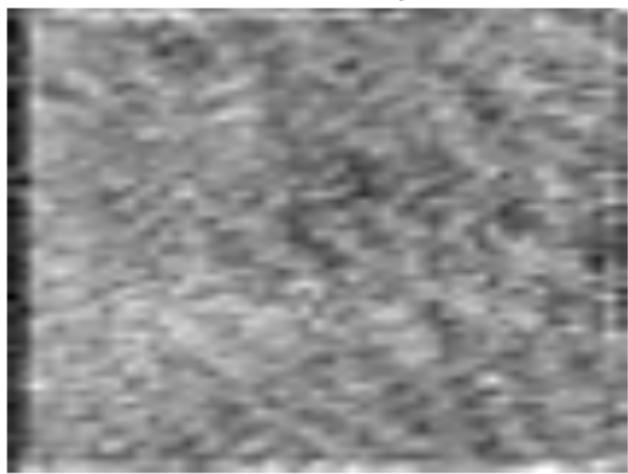
Predicted Contact



Predicted Depth



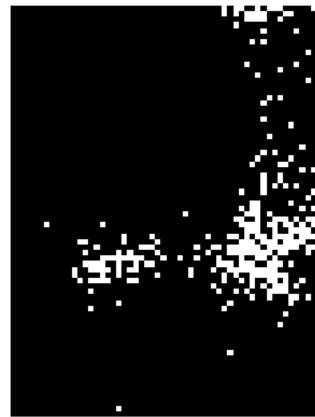
Predicted Depth



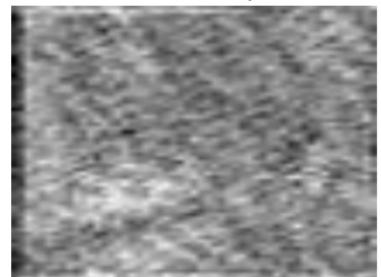
Tactile Image 42



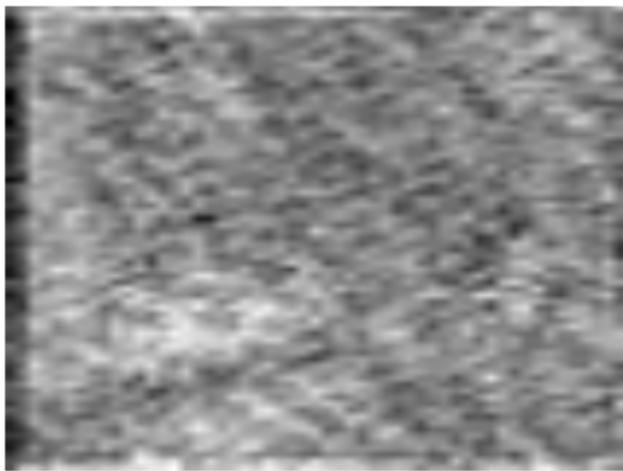
Predicted Contact

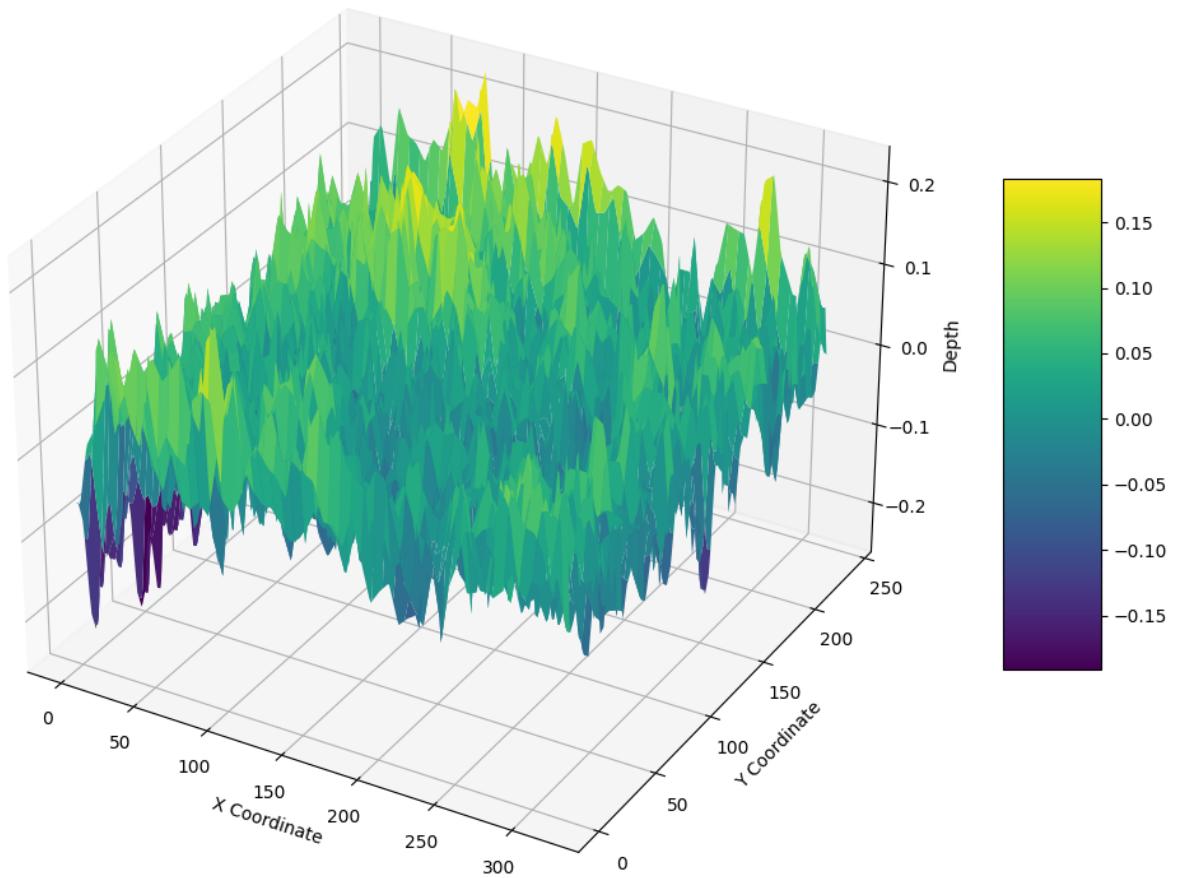


Predicted Depth



Predicted Depth

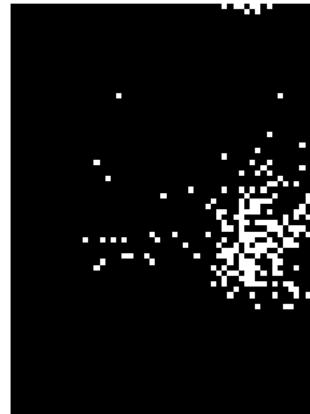




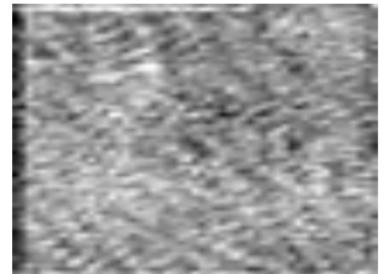
Tactile Image 43



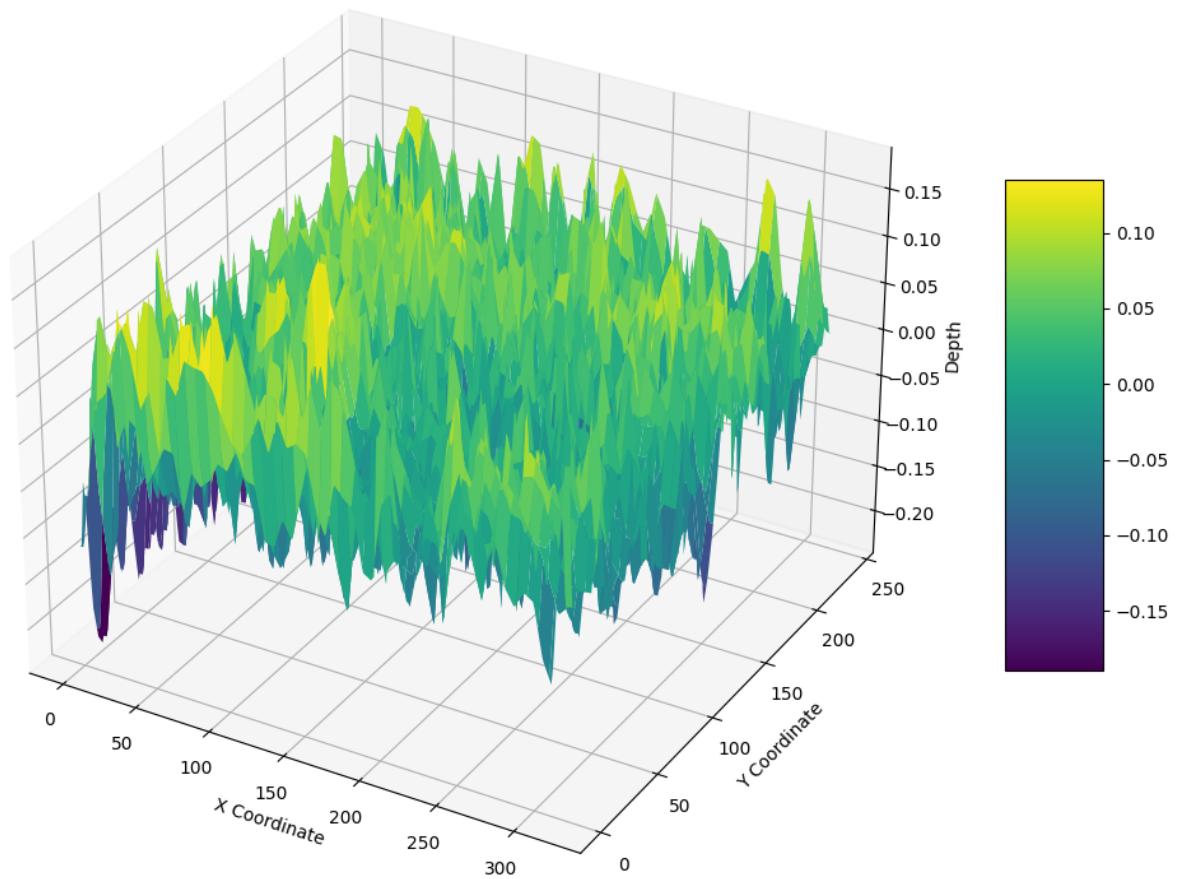
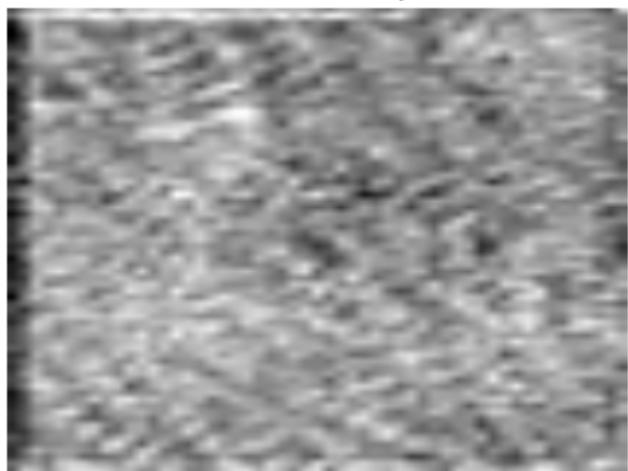
Predicted Contact



Predicted Depth



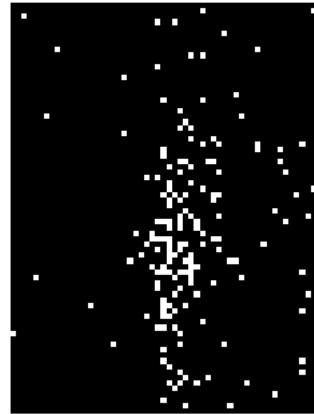
Predicted Depth



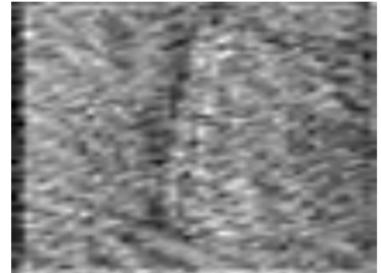
Tactile Image 44



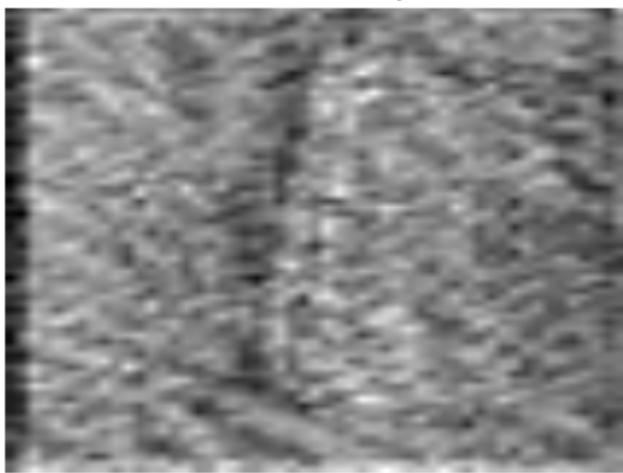
Predicted Contact

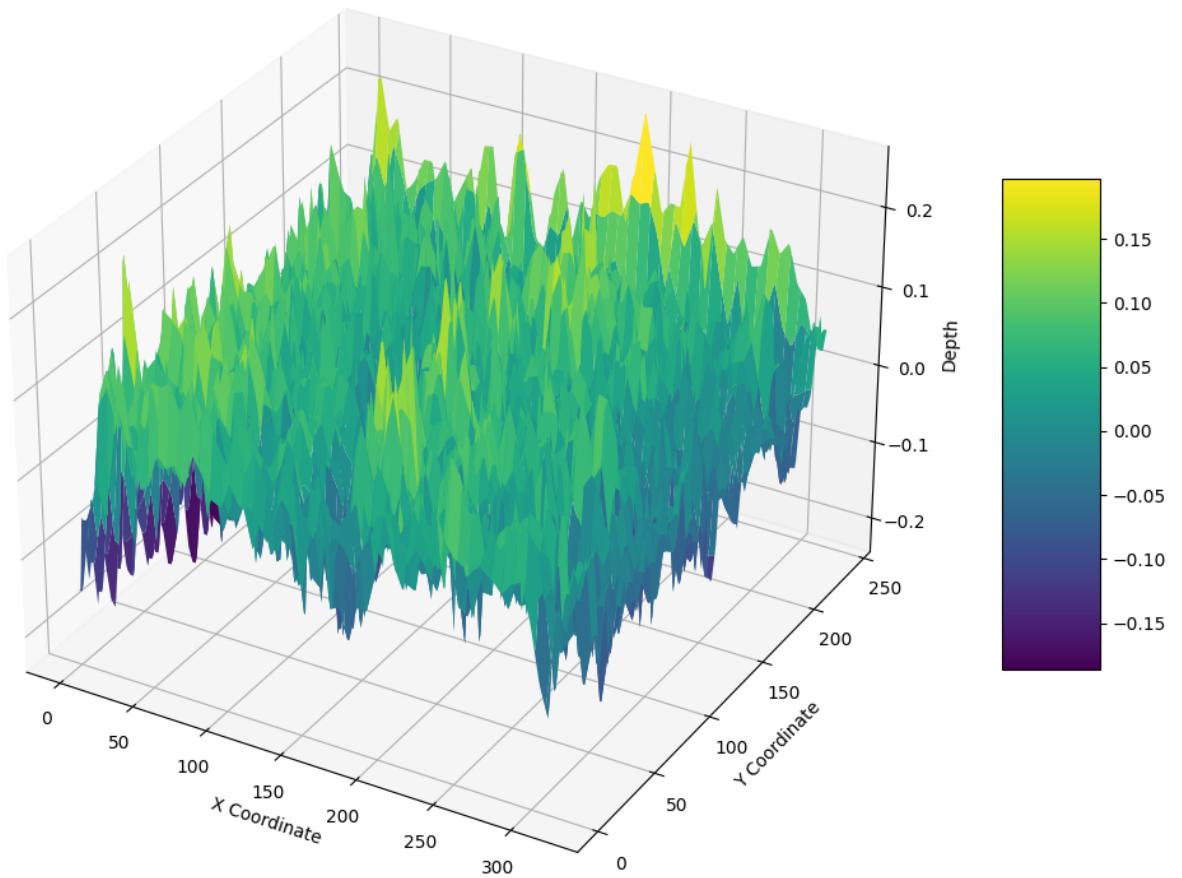


Predicted Depth



Predicted Depth

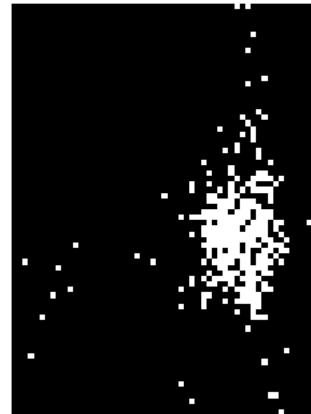




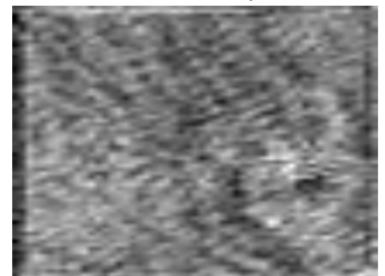
Tactile Image 45



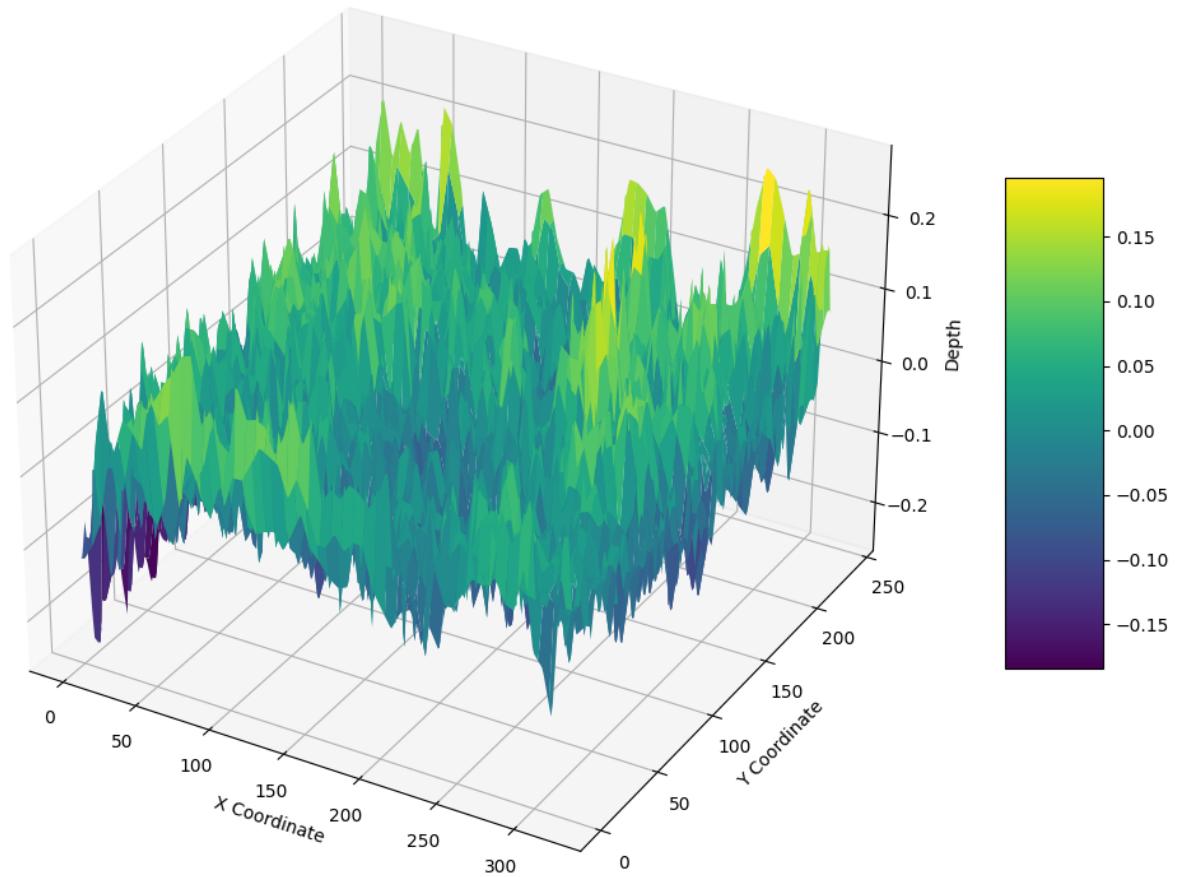
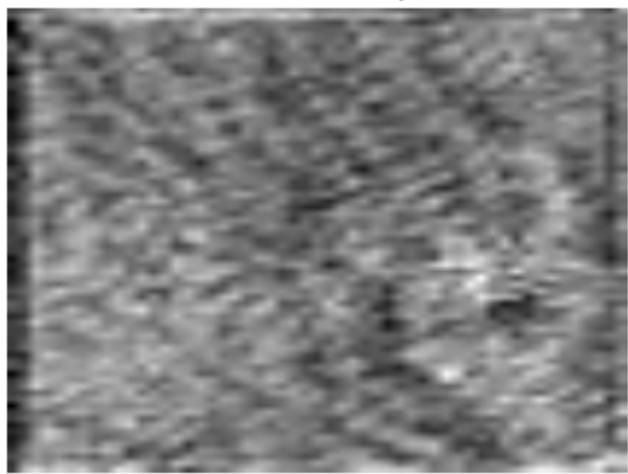
Predicted Contact



Predicted Depth



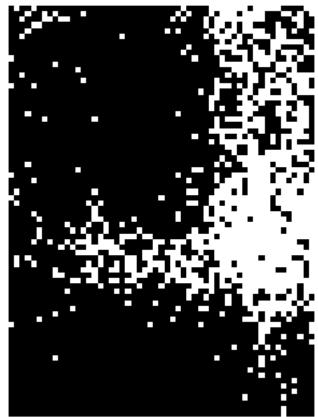
Predicted Depth



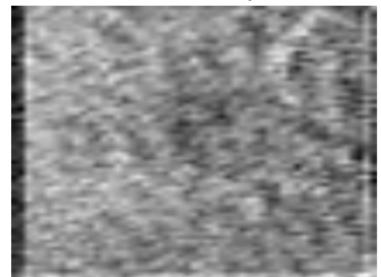
Tactile Image 46



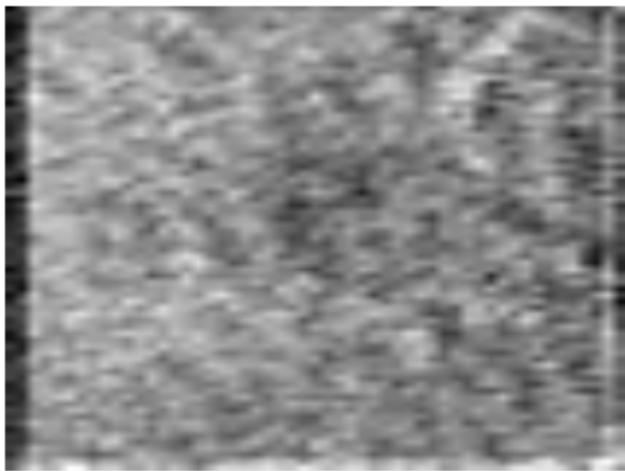
Predicted Contact

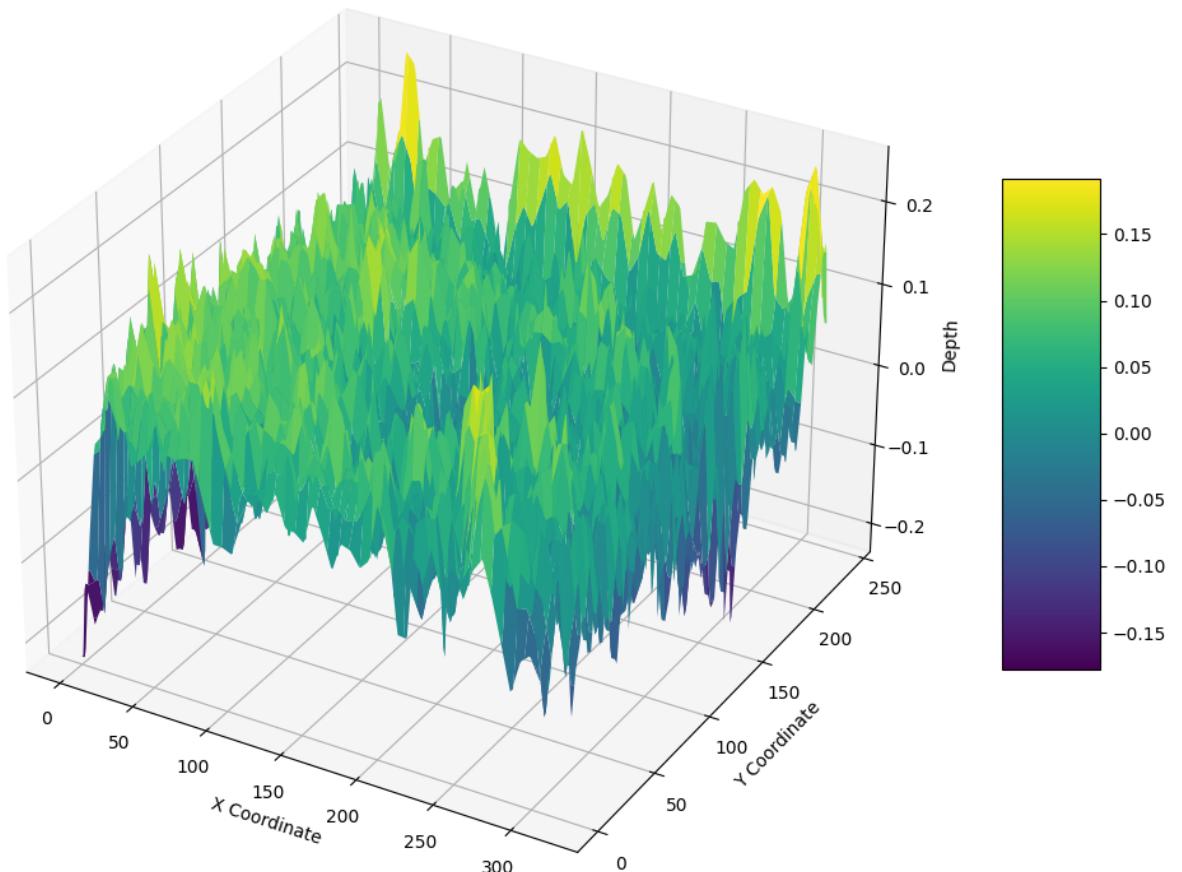


Predicted Depth



Predicted Depth

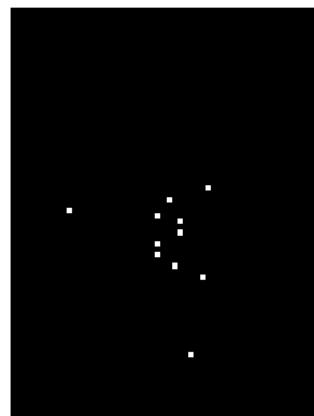




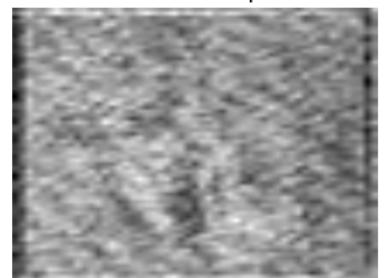
Tactile Image 47



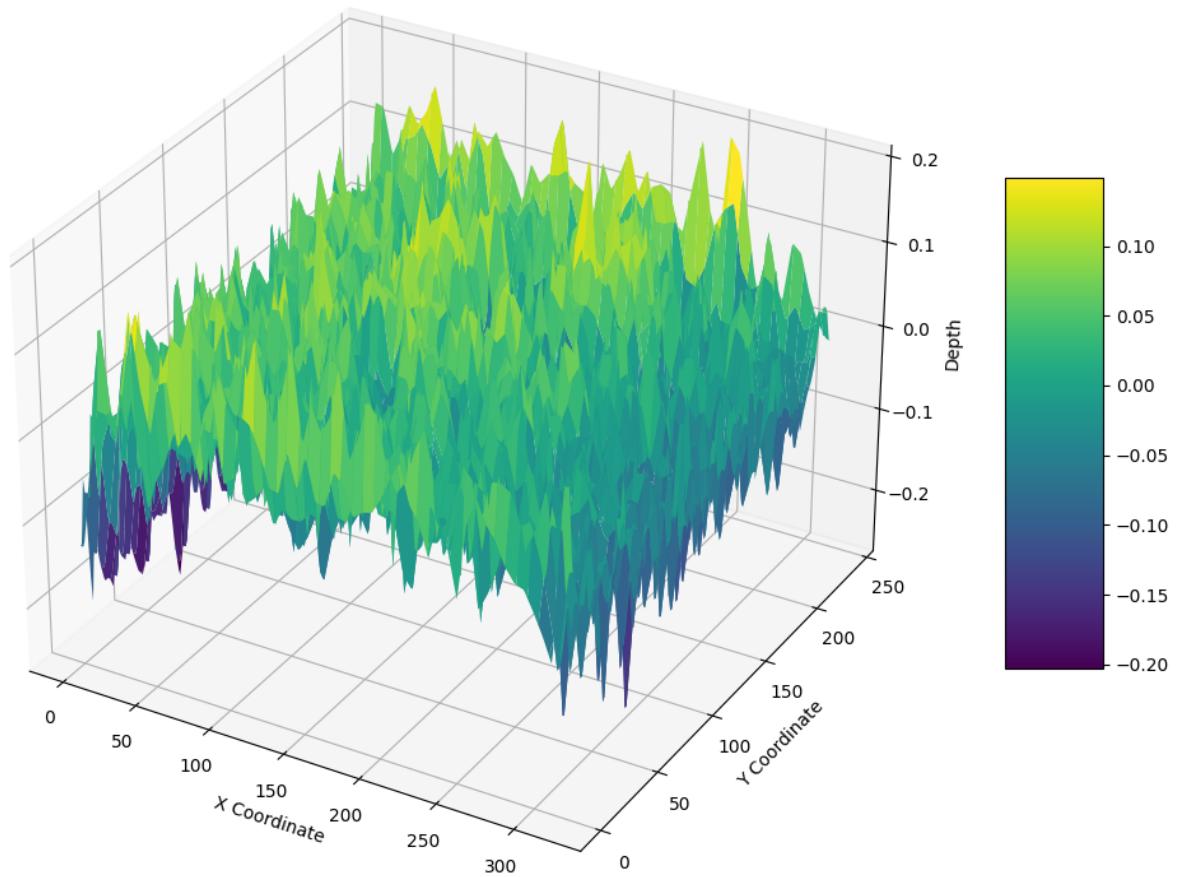
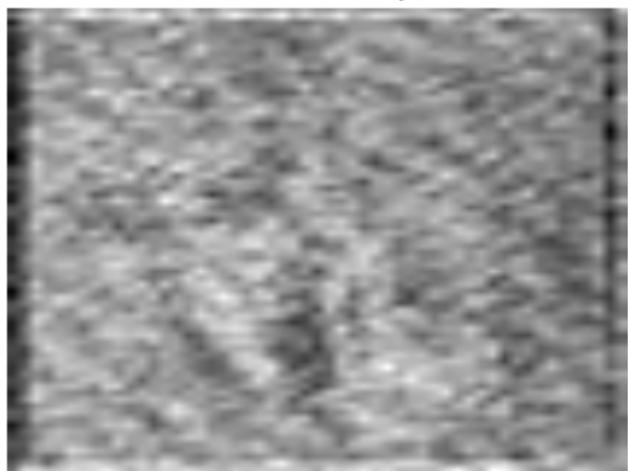
Predicted Contact



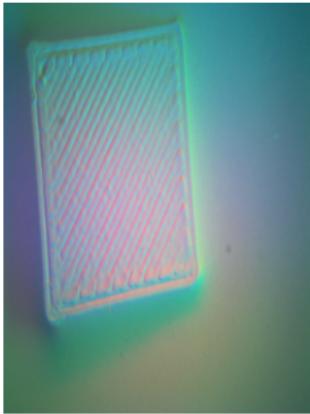
Predicted Depth



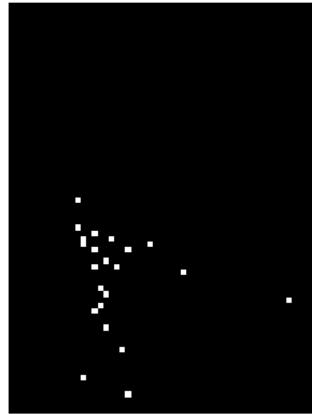
Predicted Depth



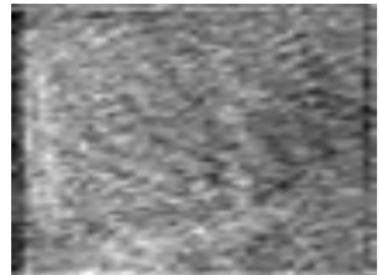
Tactile Image 48



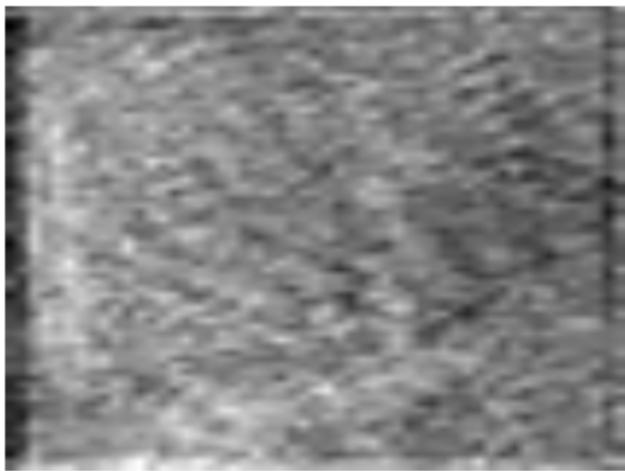
Predicted Contact

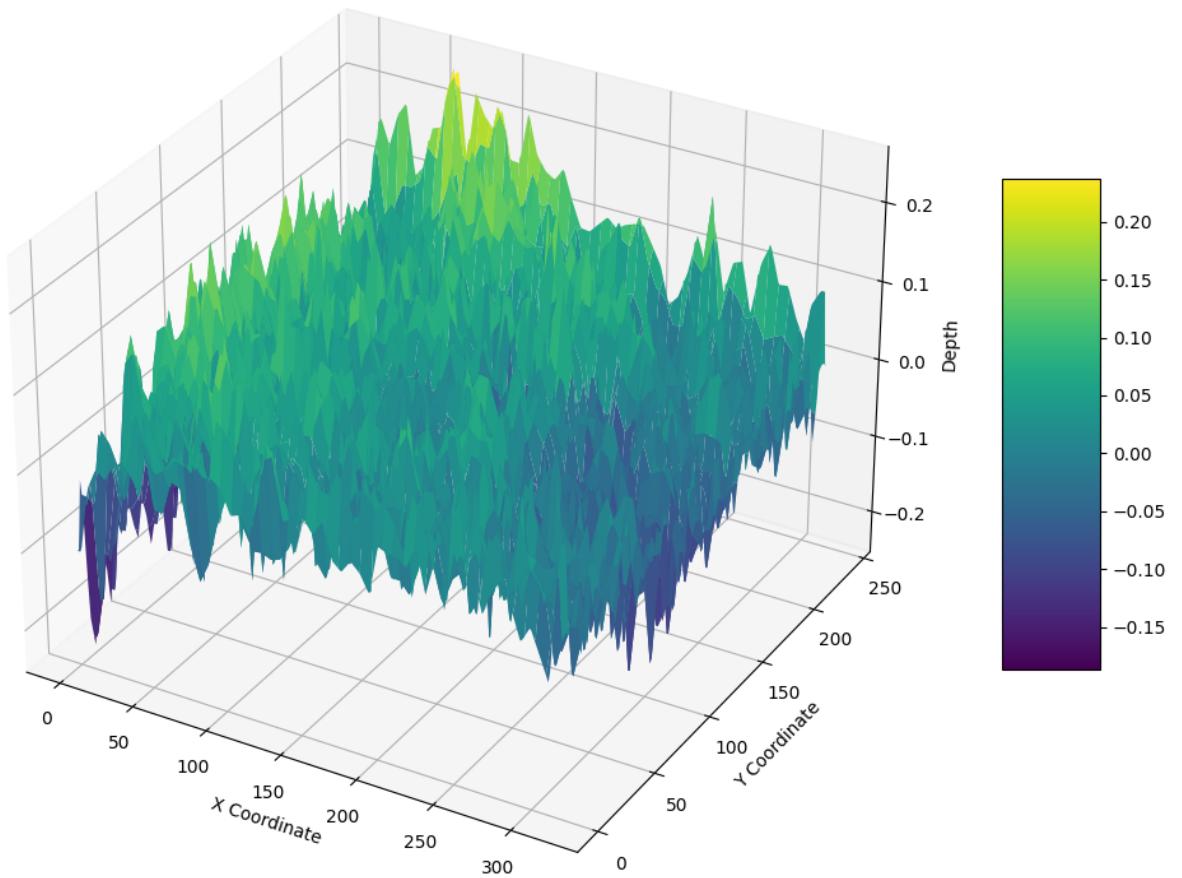


Predicted Depth



Predicted Depth





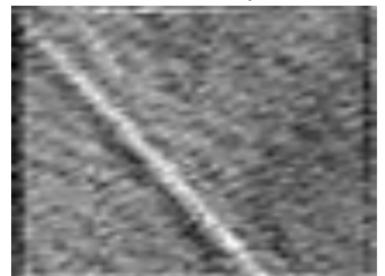
Tactile Image 49



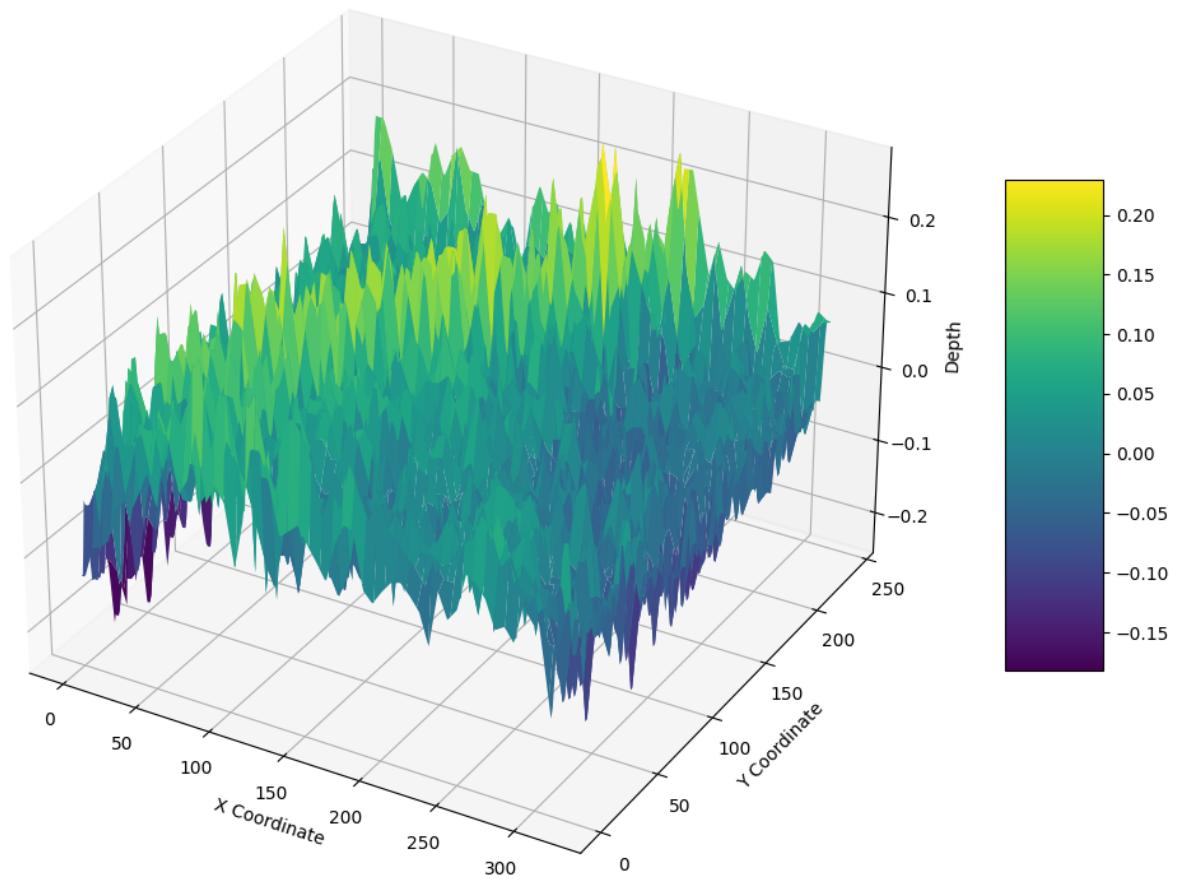
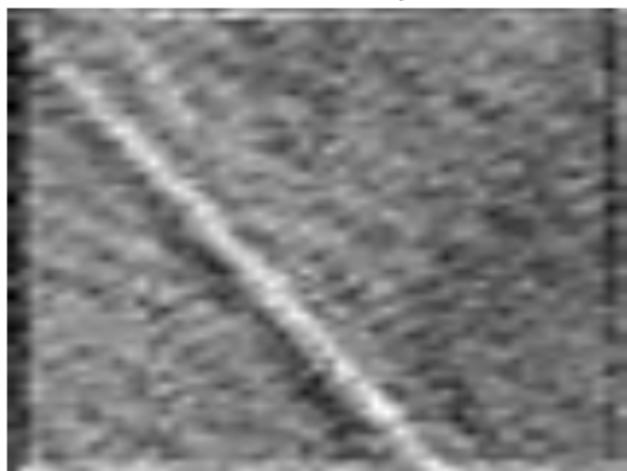
Predicted Contact



Predicted Depth



Predicted Depth



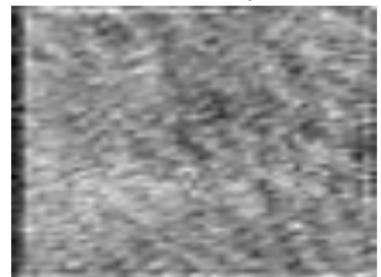
Tactile Image 50



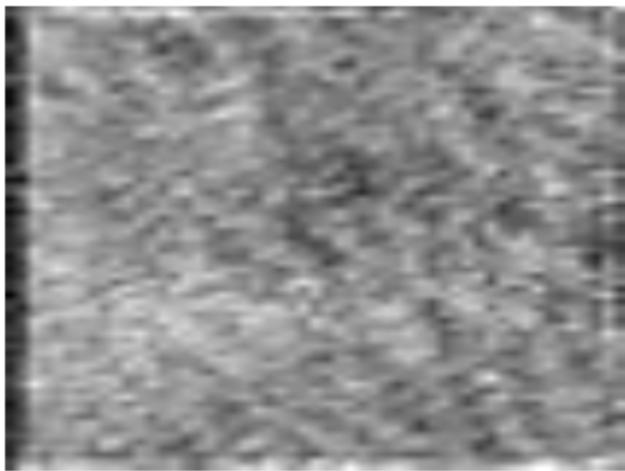
Predicted Contact

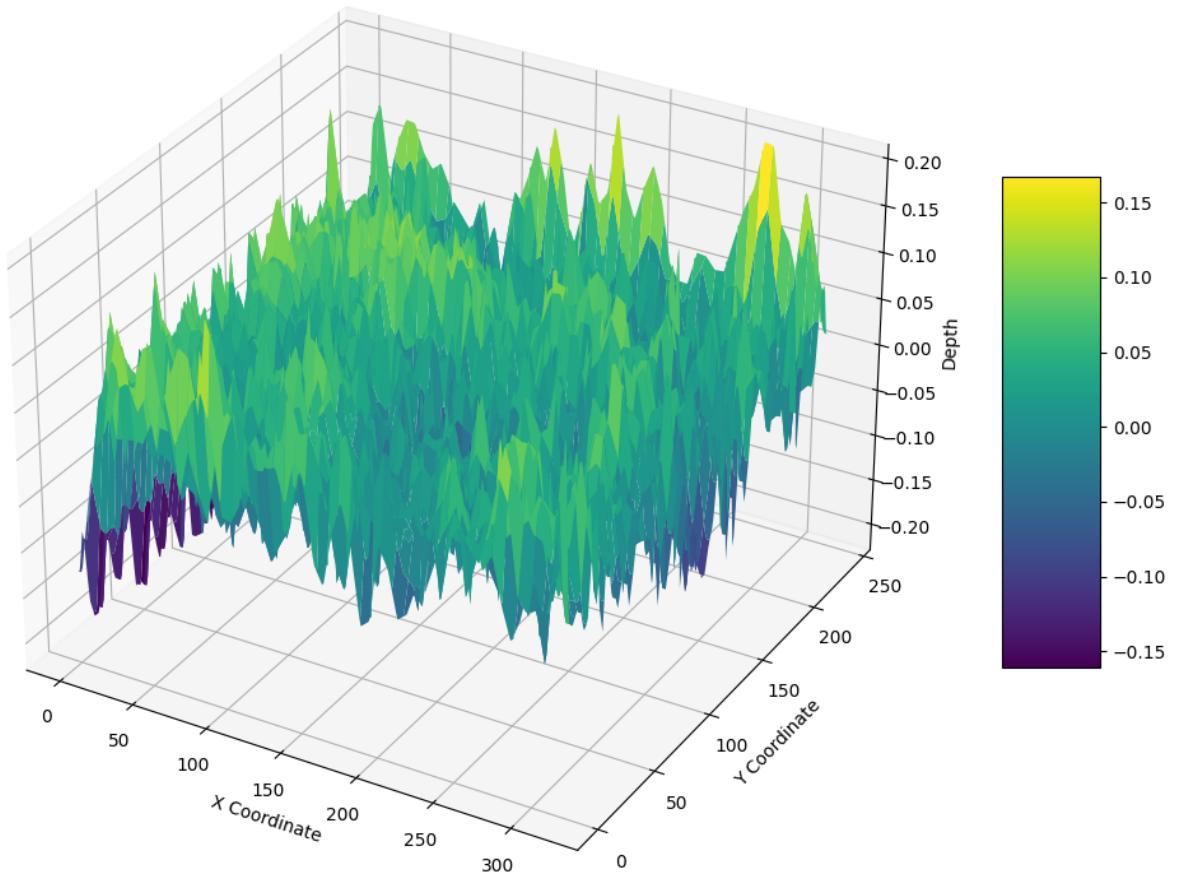


Predicted Depth



Predicted Depth

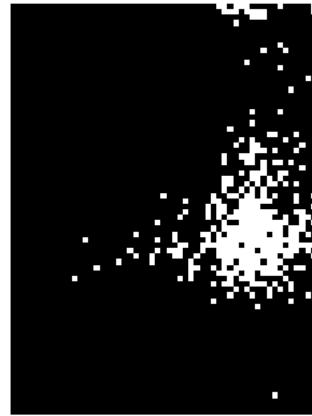




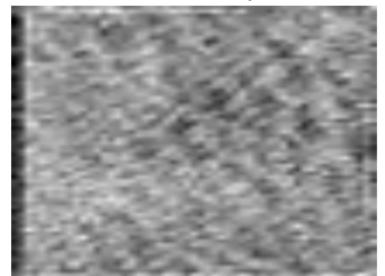
Tactile Image 51



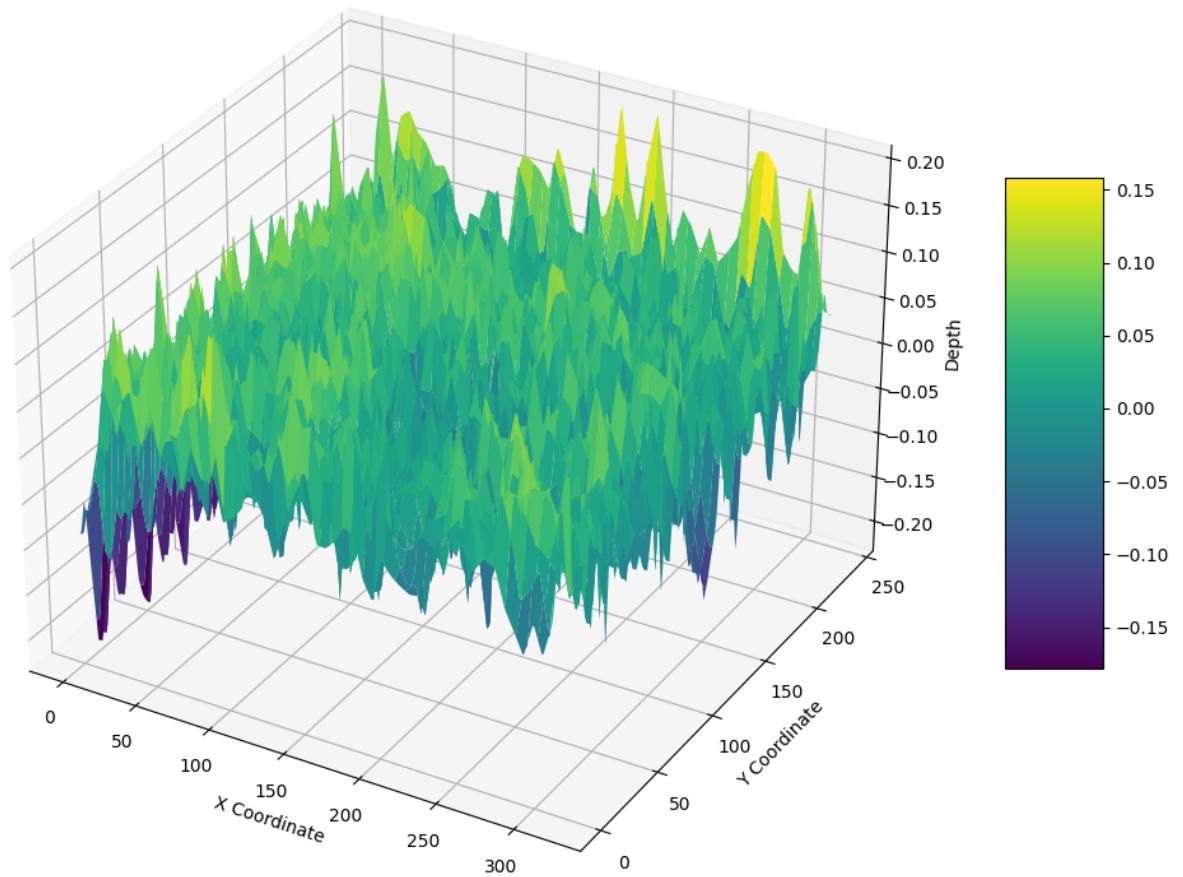
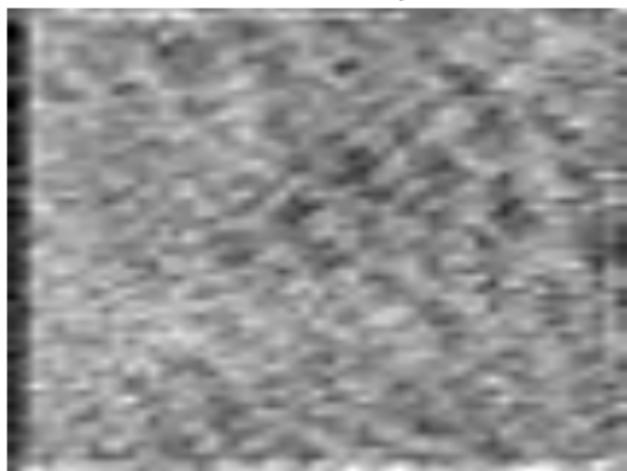
Predicted Contact



Predicted Depth



Predicted Depth



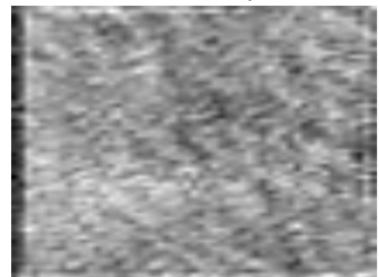
Tactile Image 52



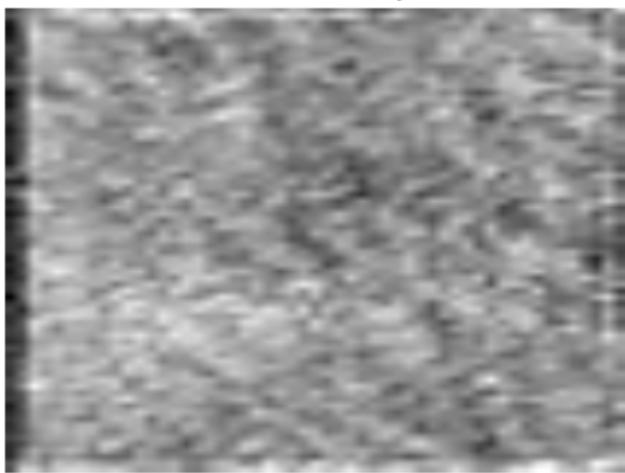
Predicted Contact

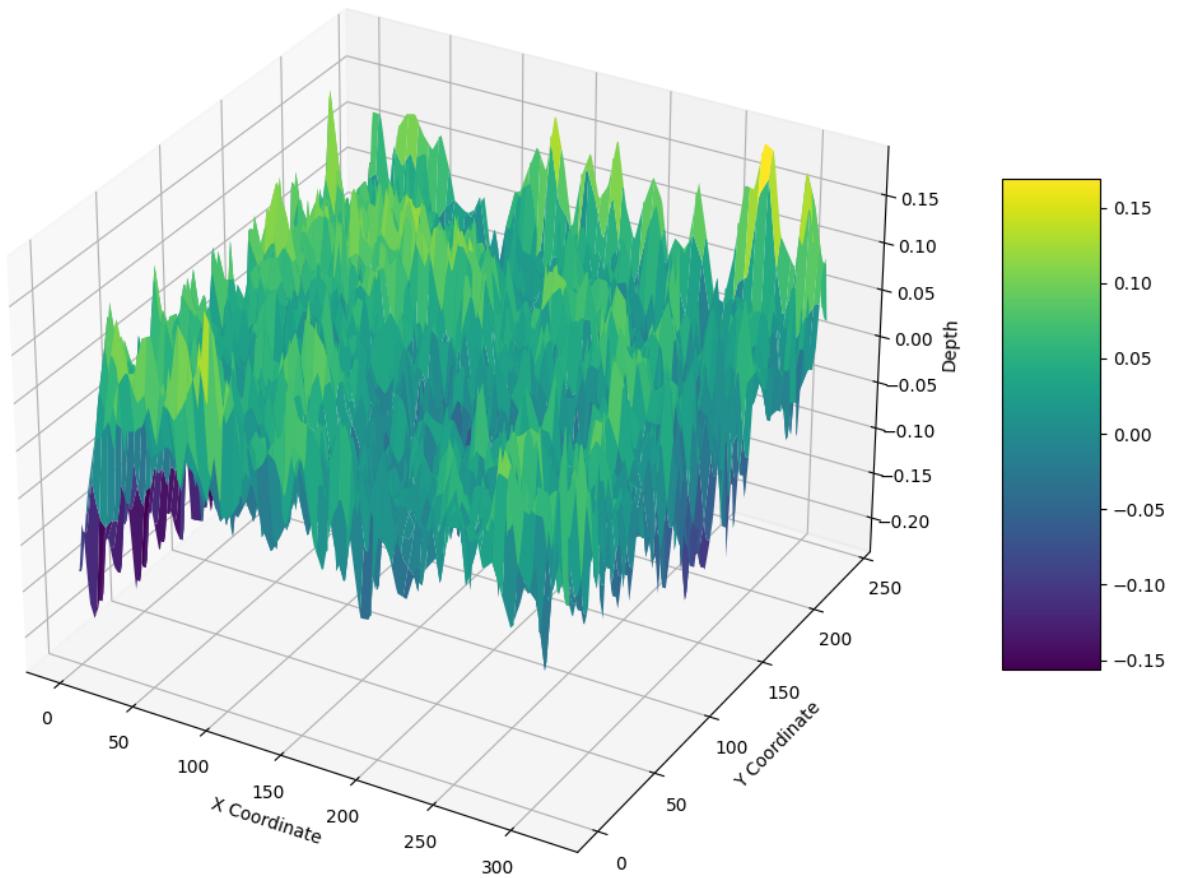


Predicted Depth

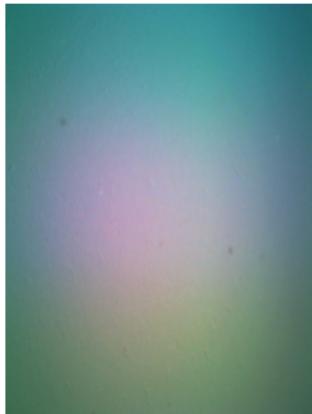


Predicted Depth

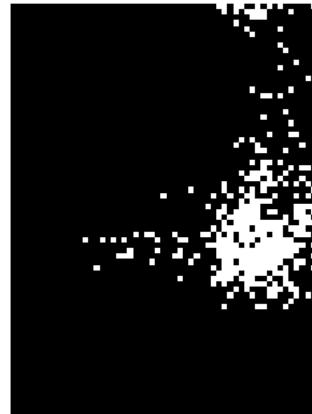




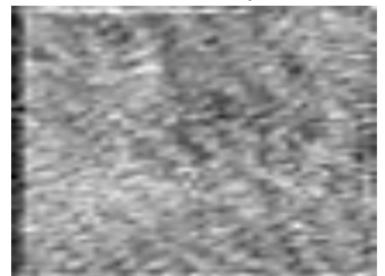
Tactile Image 53



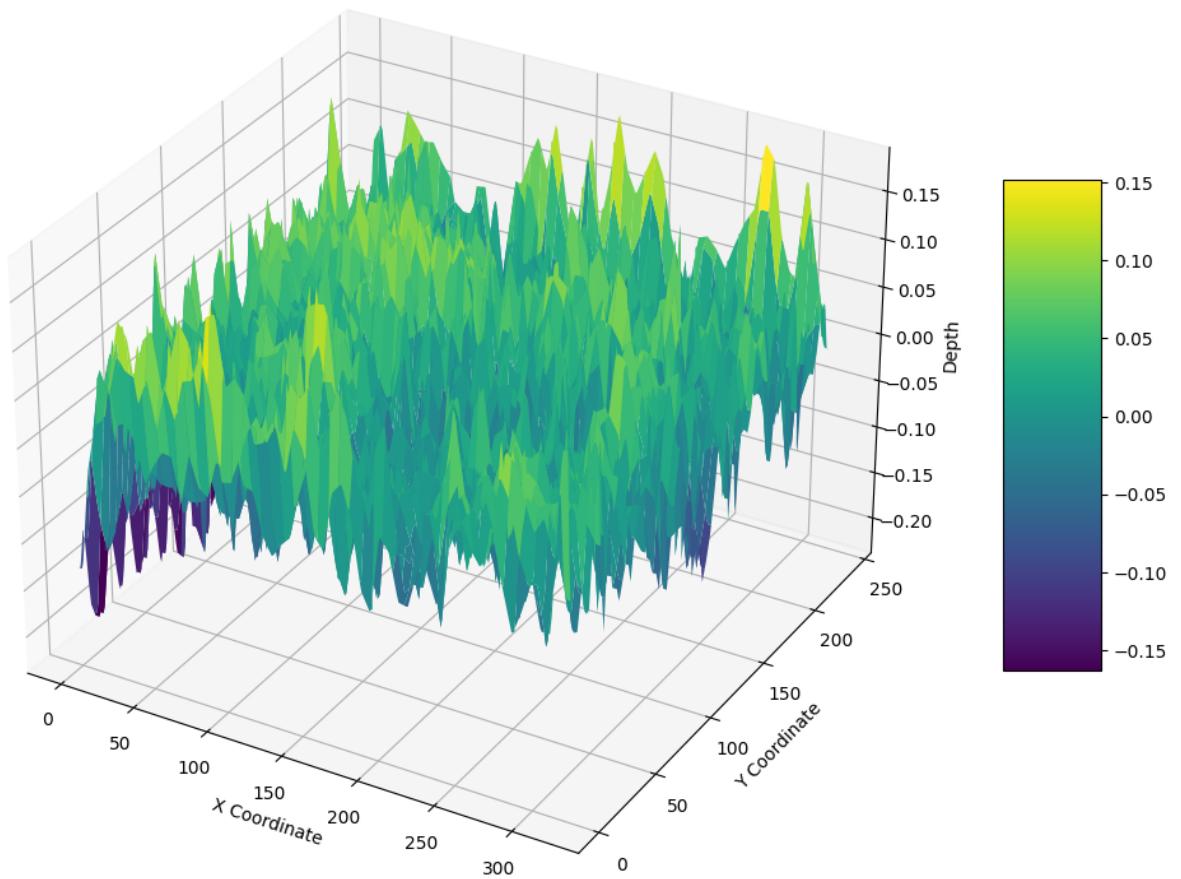
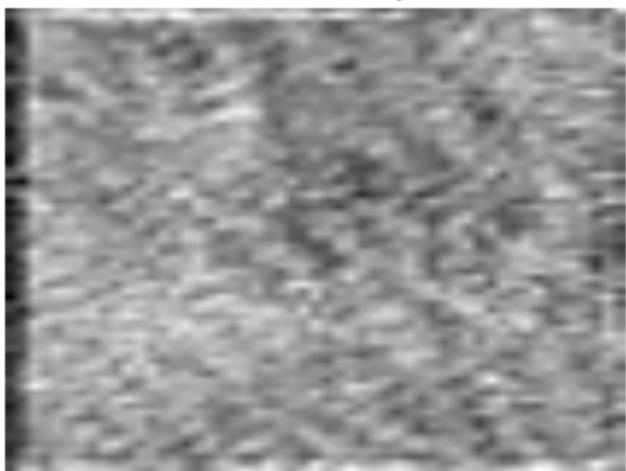
Predicted Contact



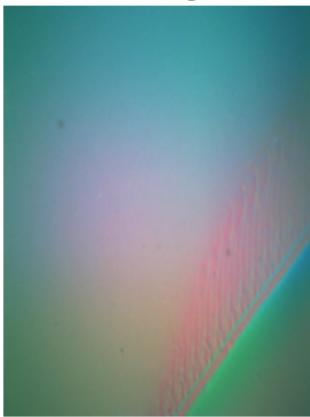
Predicted Depth



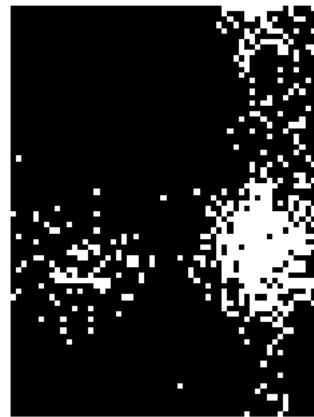
Predicted Depth



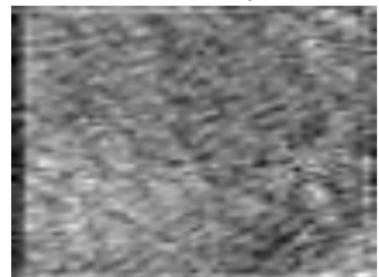
Tactile Image 54



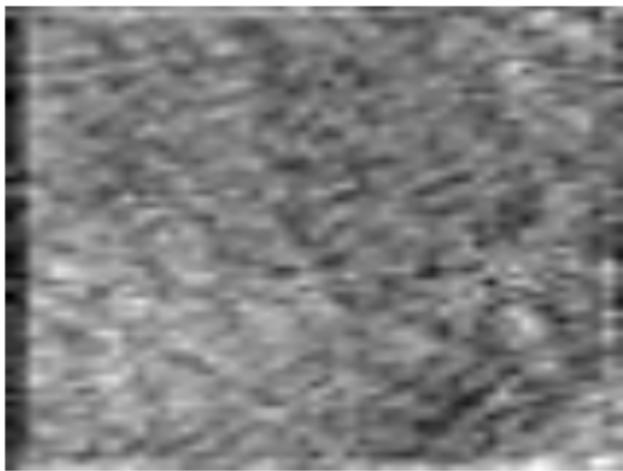
Predicted Contact

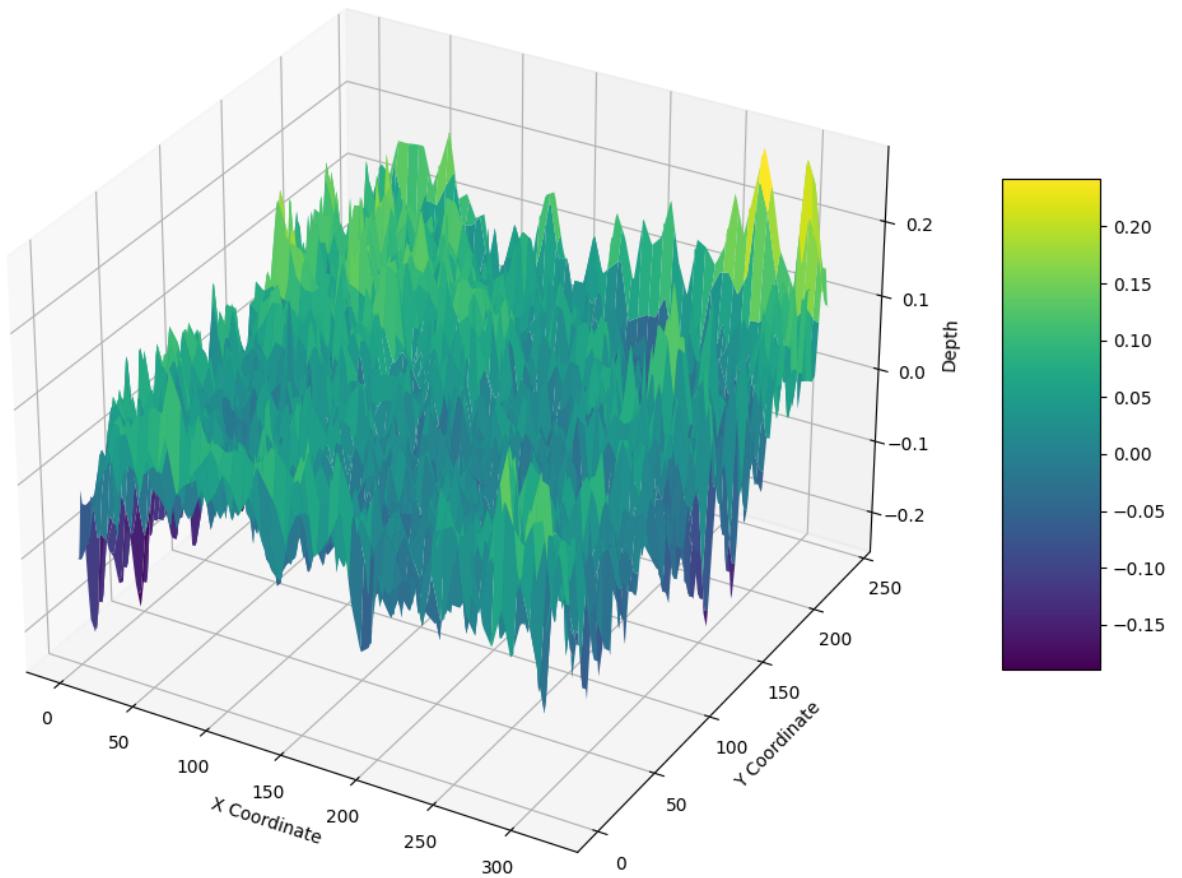


Predicted Depth

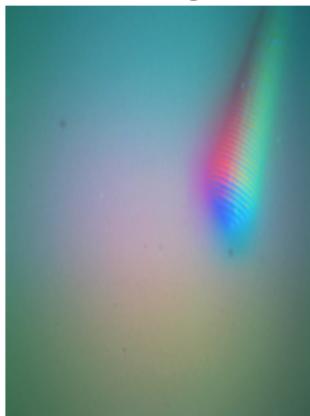


Predicted Depth

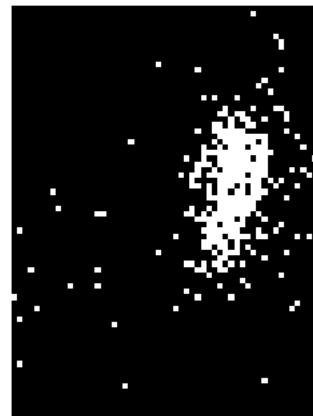




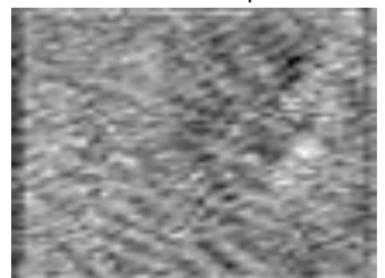
Tactile Image 55



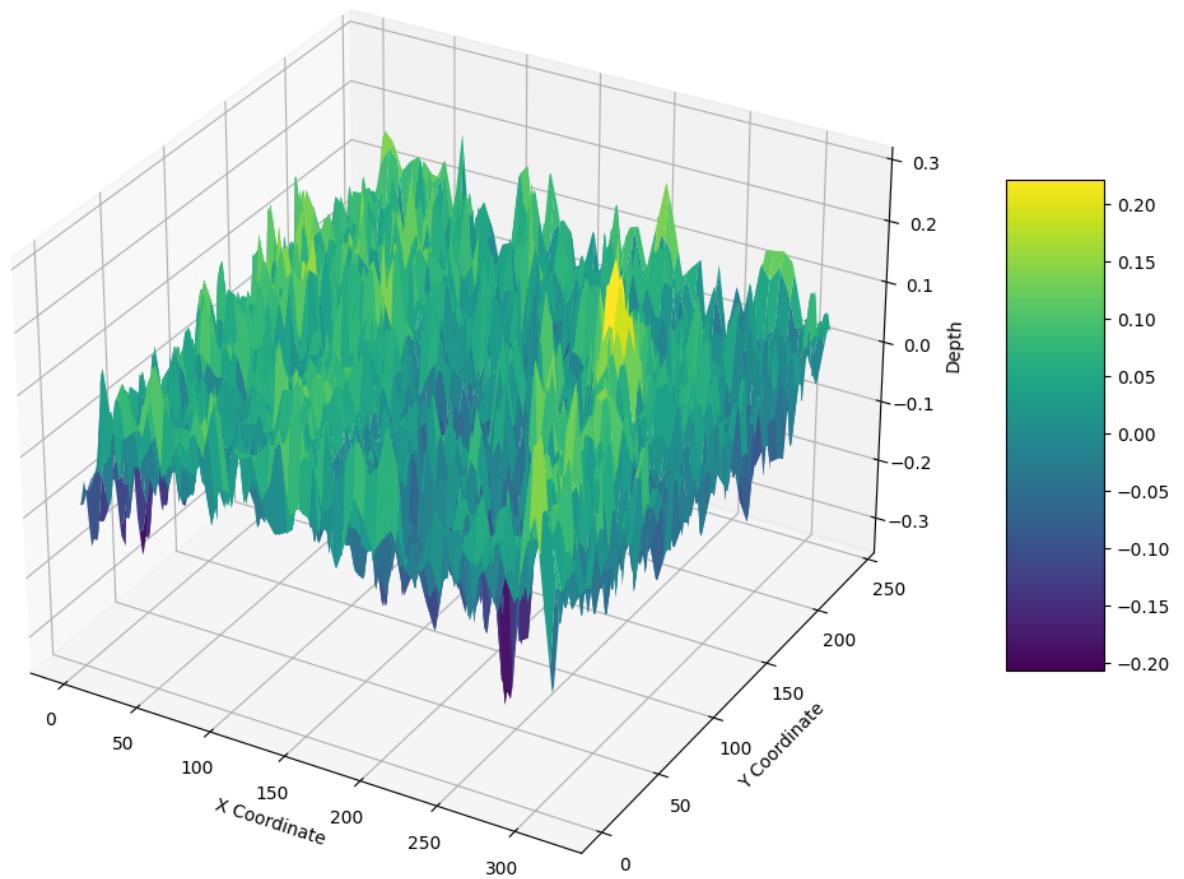
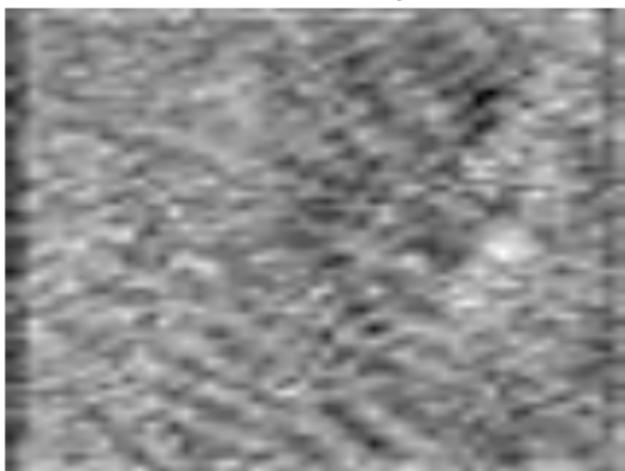
Predicted Contact



Predicted Depth



Predicted Depth



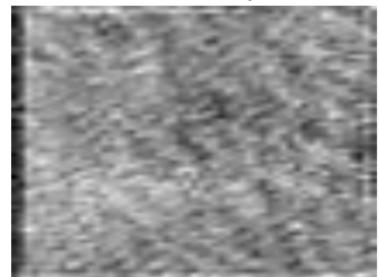
Tactile Image 56



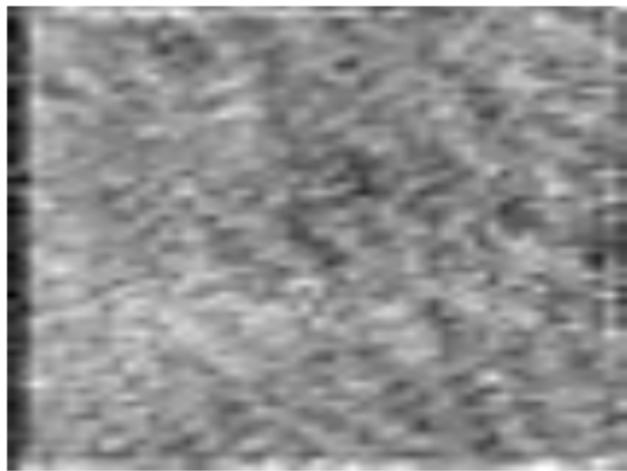
Predicted Contact

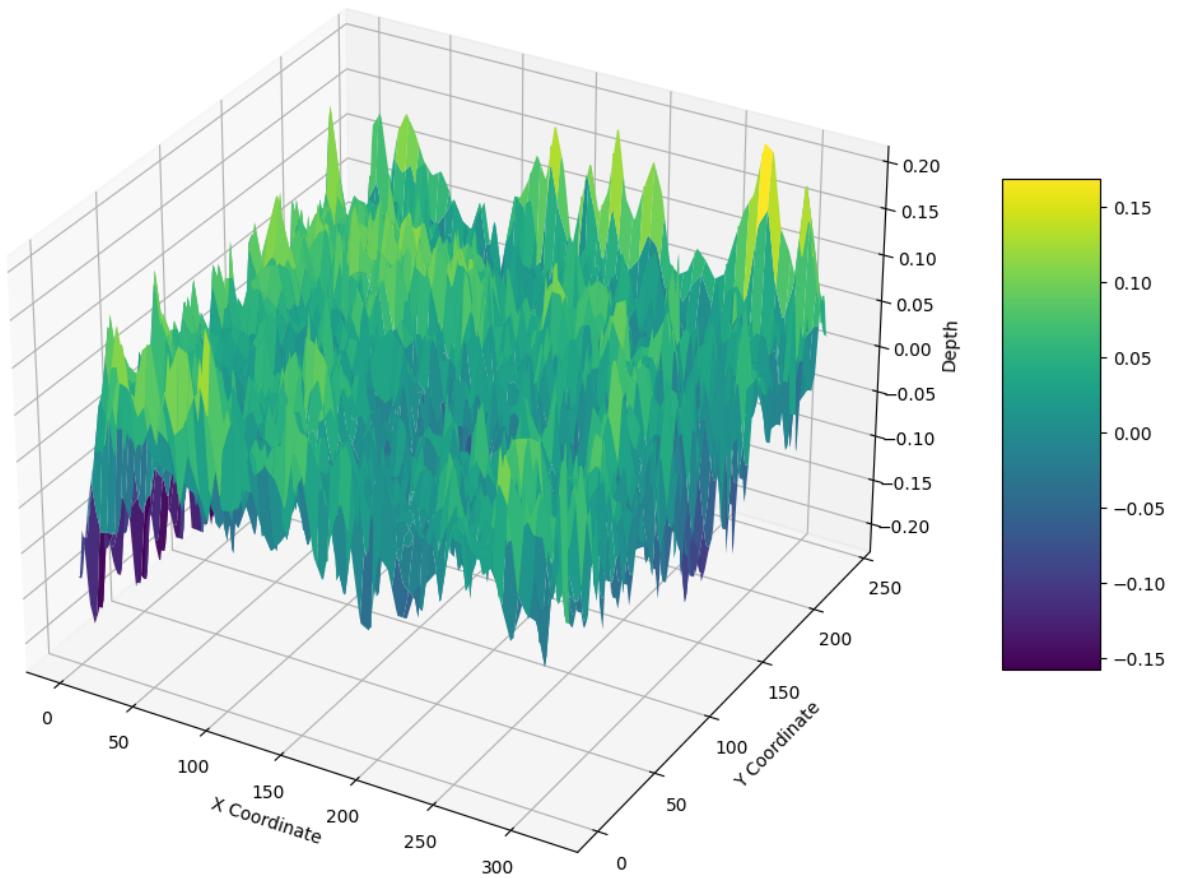


Predicted Depth



Predicted Depth





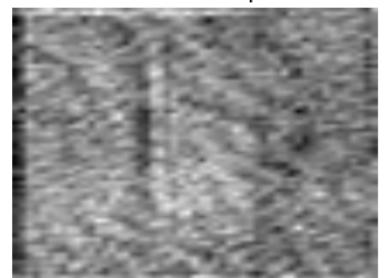
Tactile Image 57



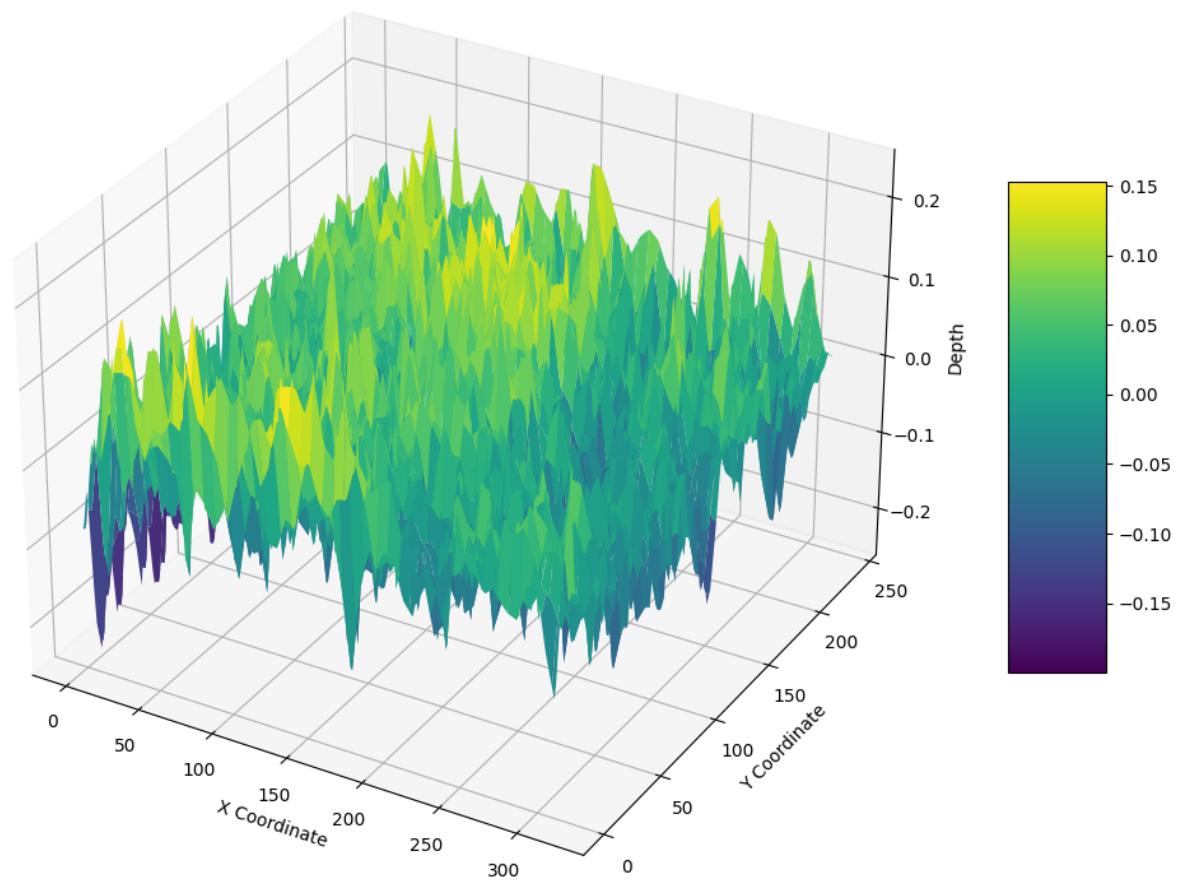
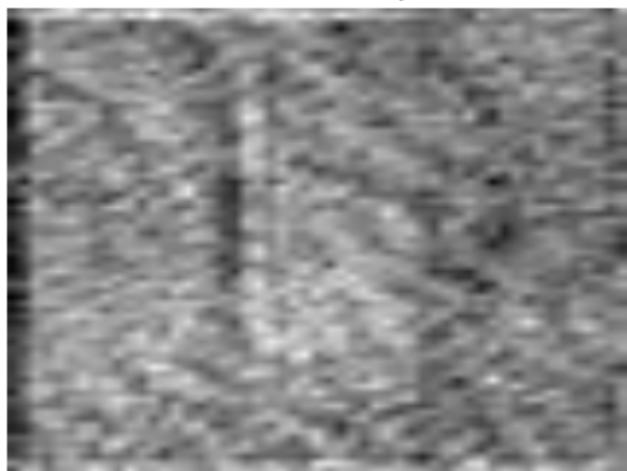
Predicted Contact



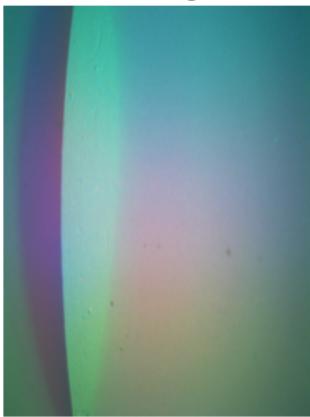
Predicted Depth



Predicted Depth



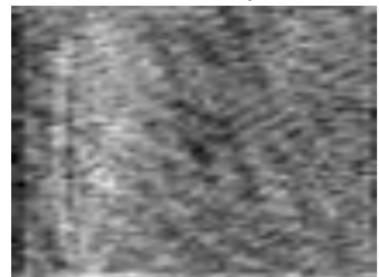
Tactile Image 58



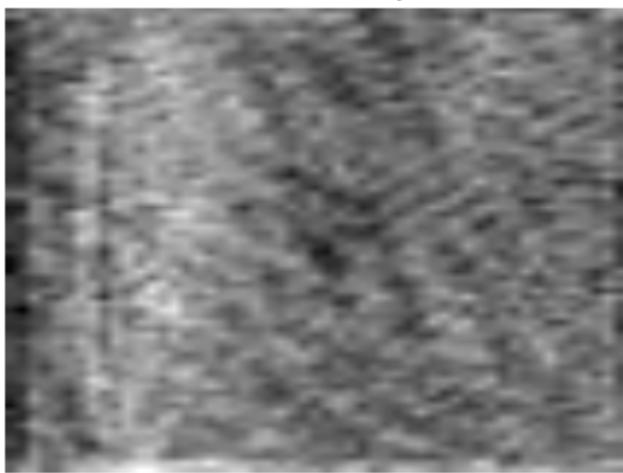
Predicted Contact

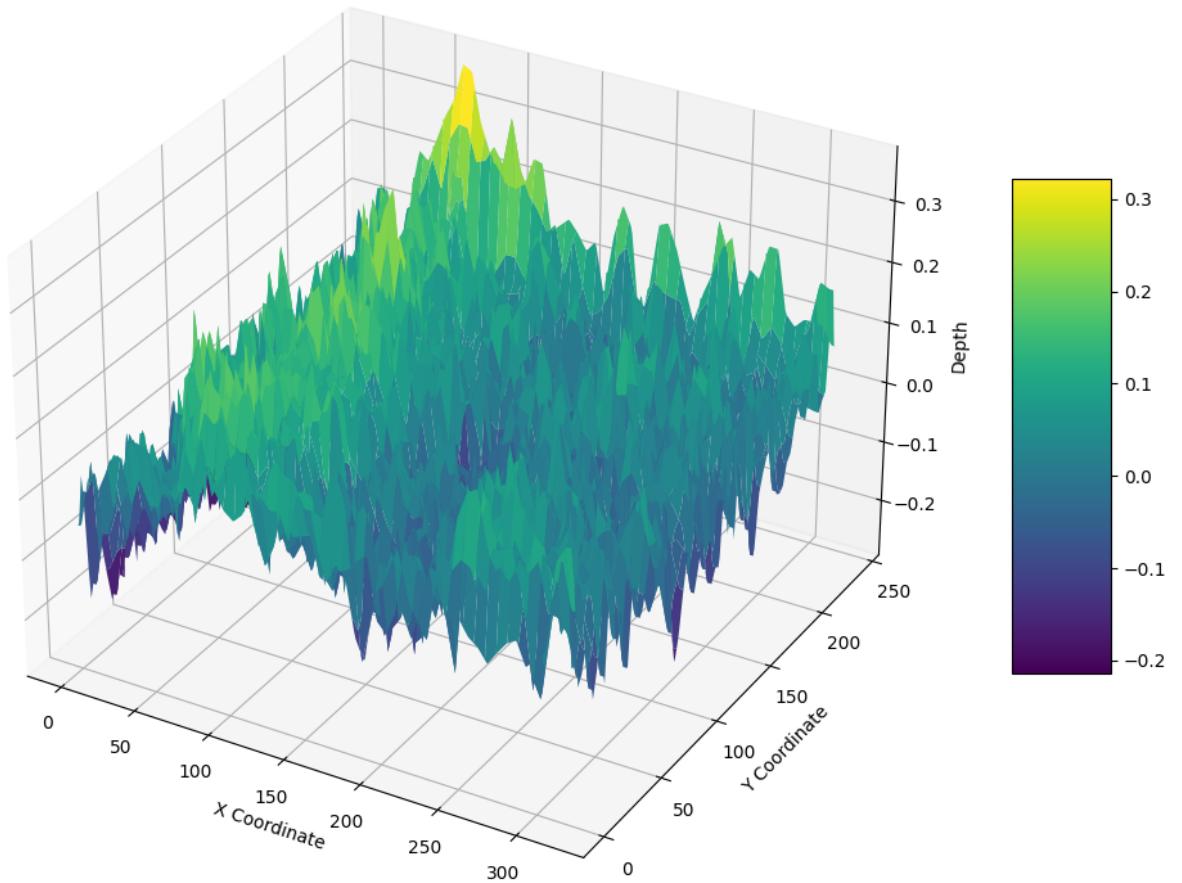


Predicted Depth



Predicted Depth

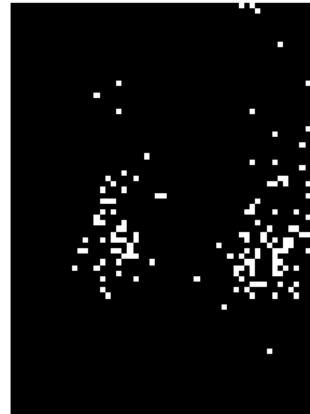




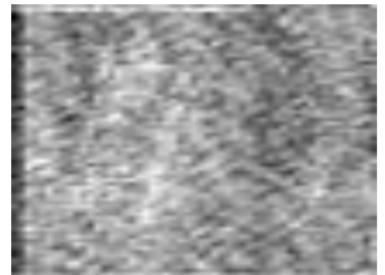
Tactile Image 59



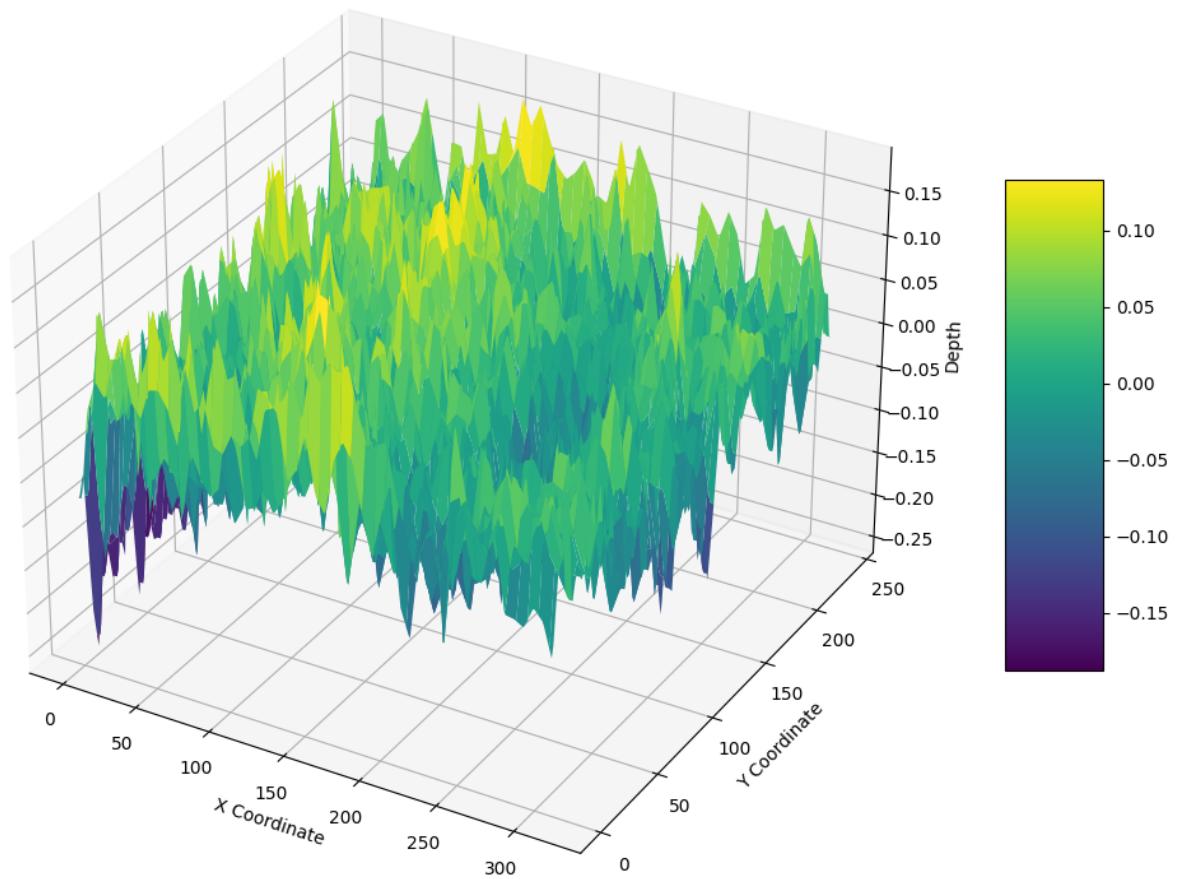
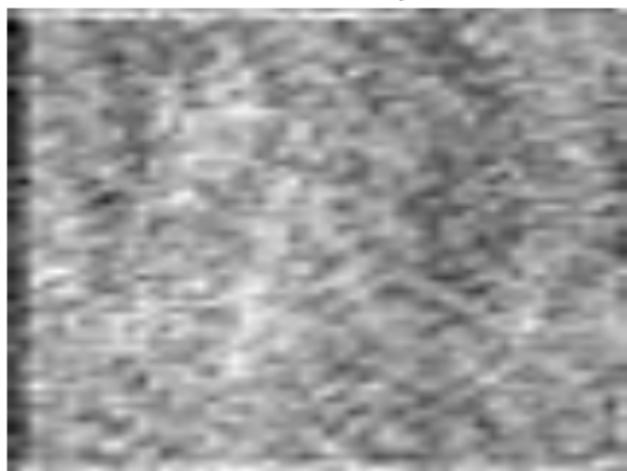
Predicted Contact



Predicted Depth



Predicted Depth



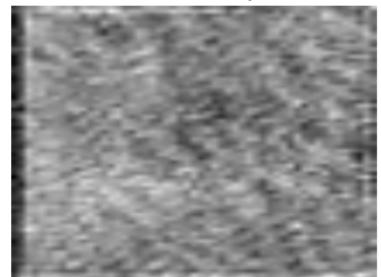
Tactile Image 60



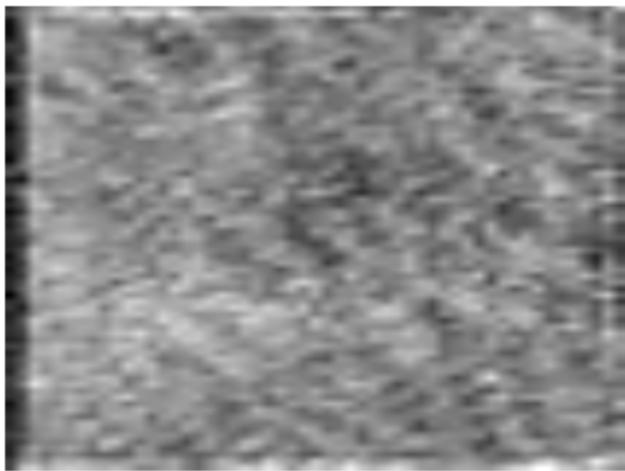
Predicted Contact

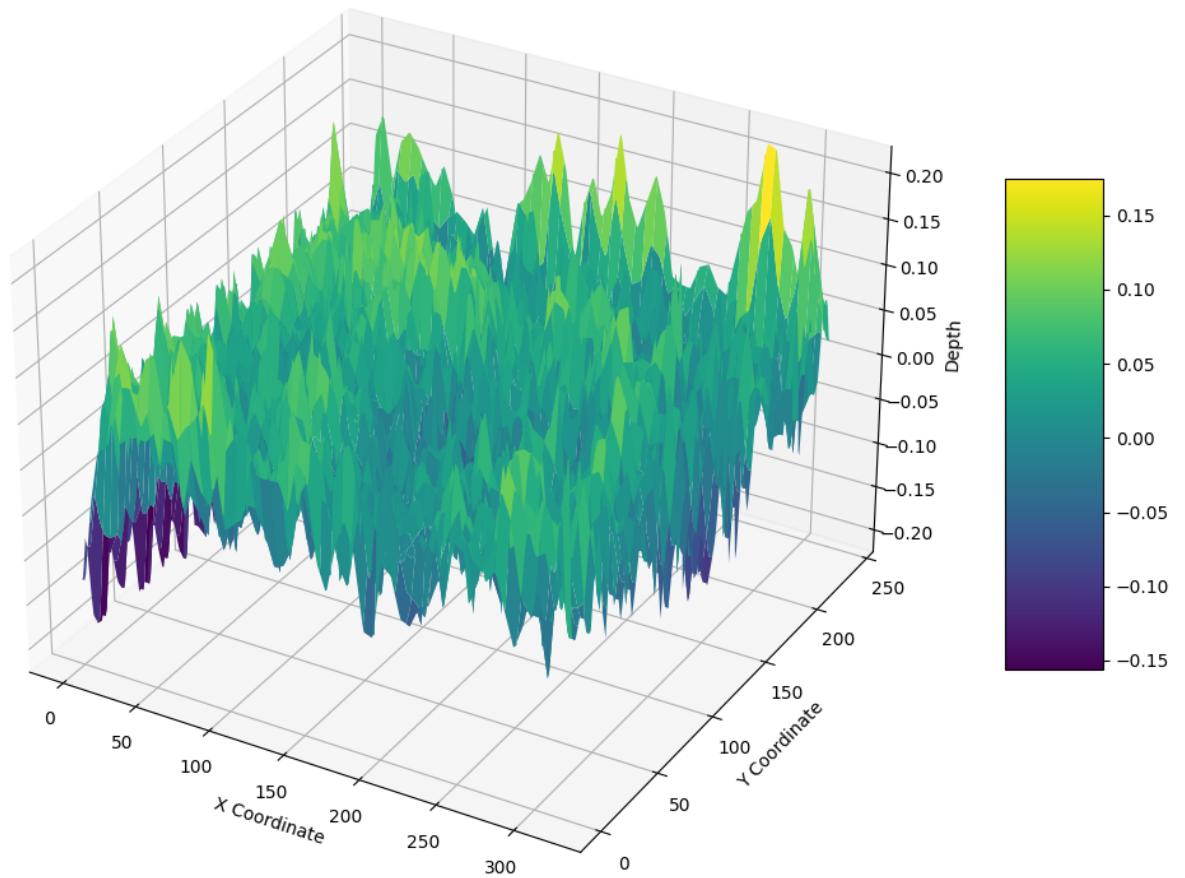


Predicted Depth



Predicted Depth

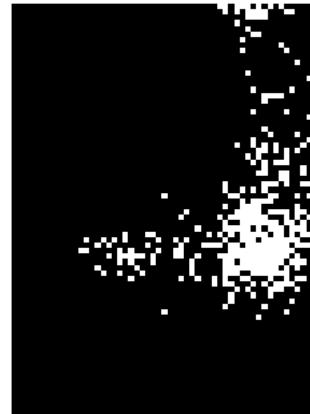




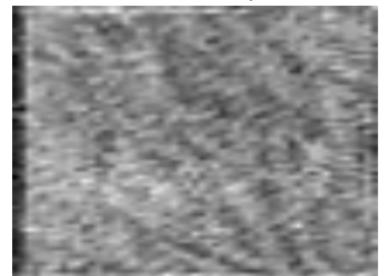
Tactile Image 61



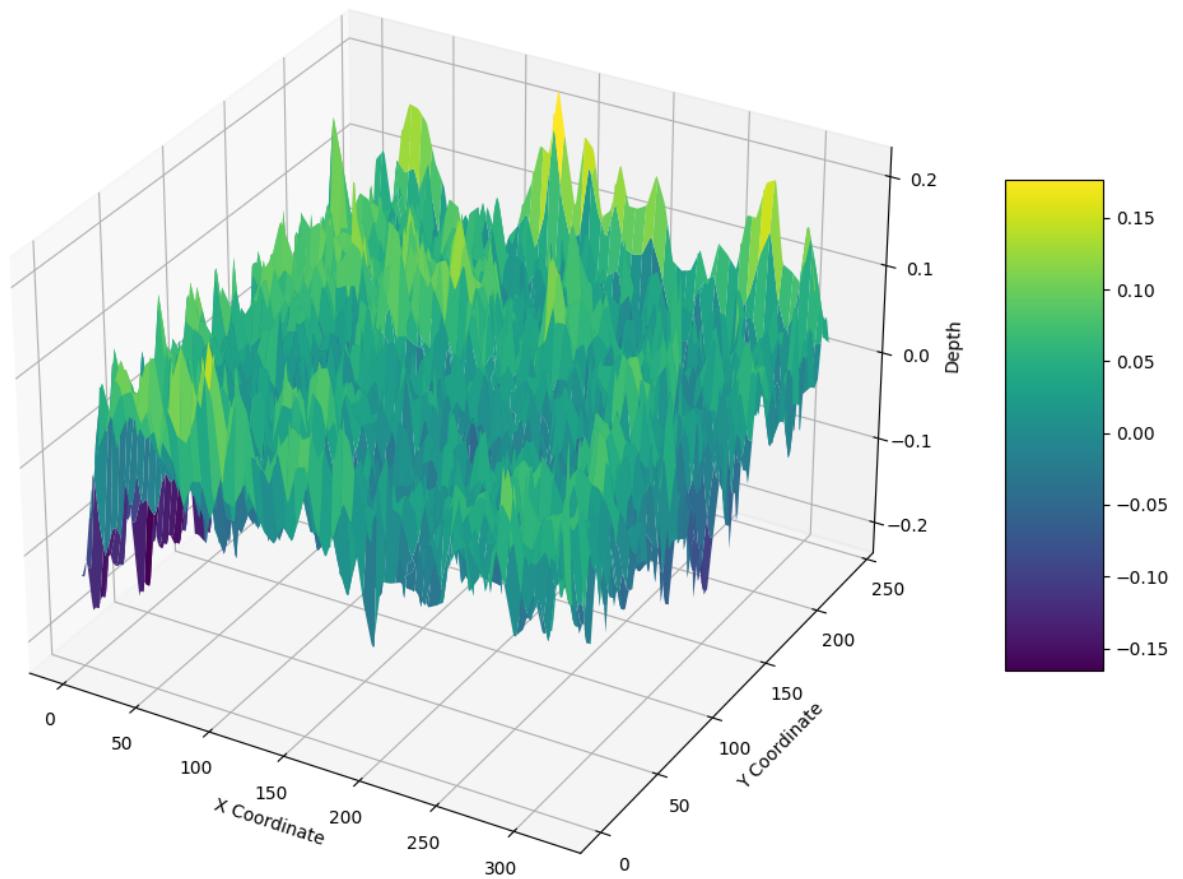
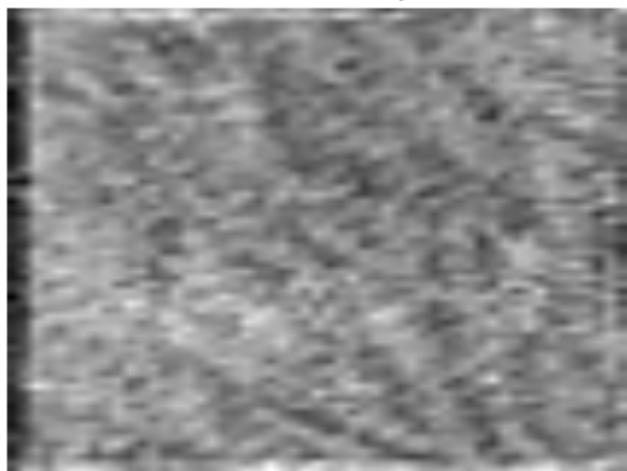
Predicted Contact



Predicted Depth



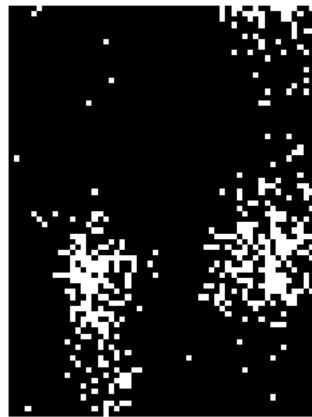
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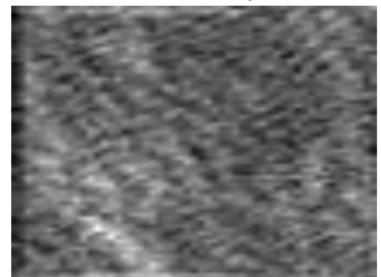
Tactile Image 62



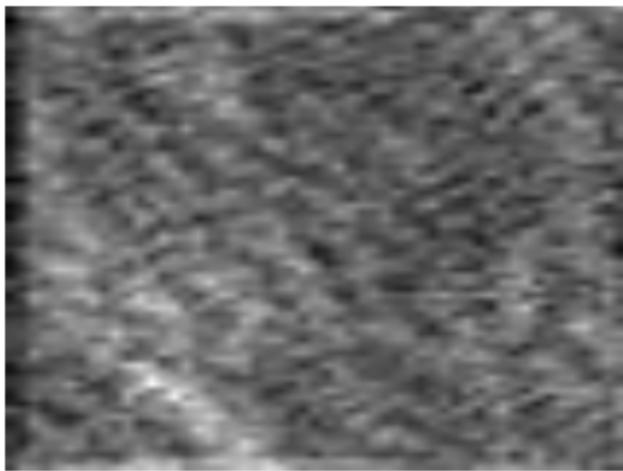
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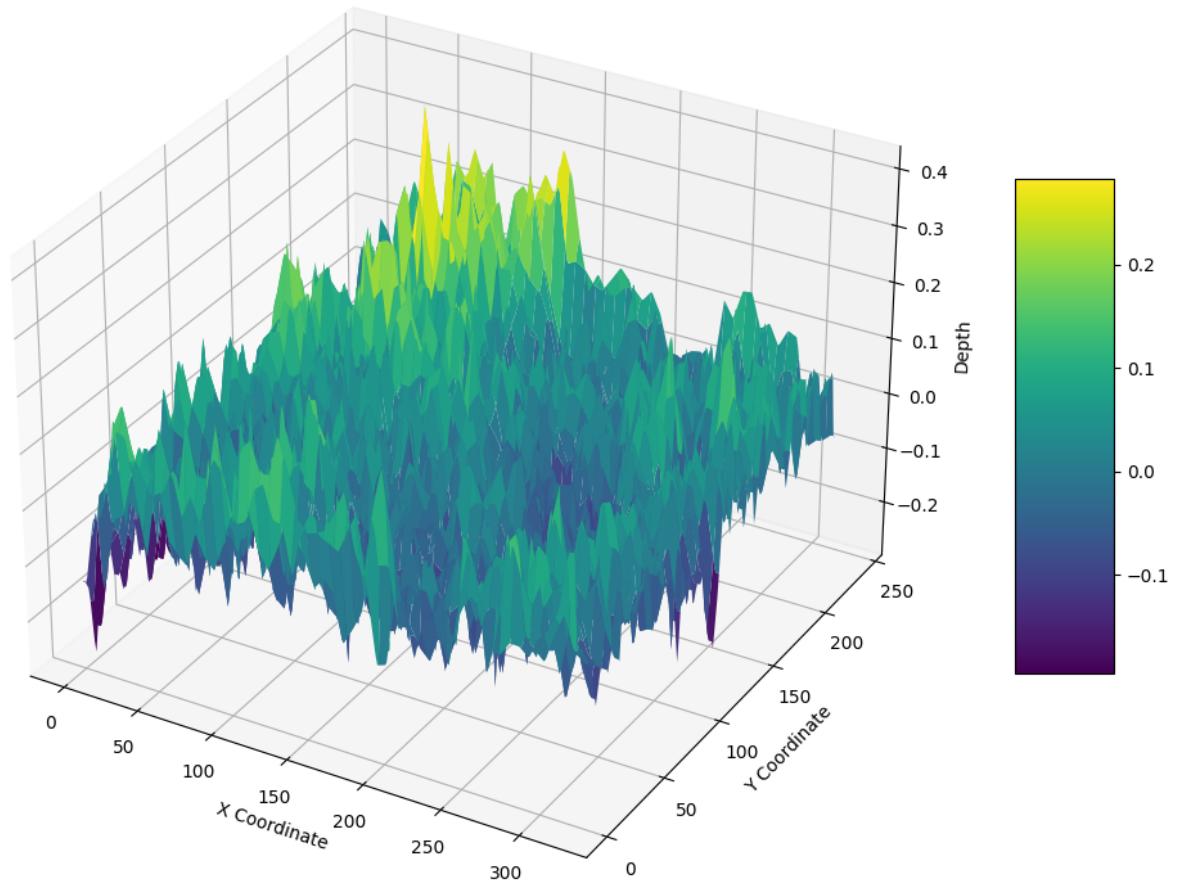


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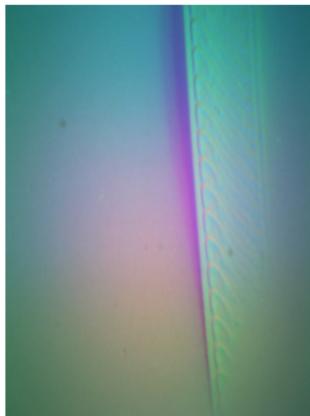


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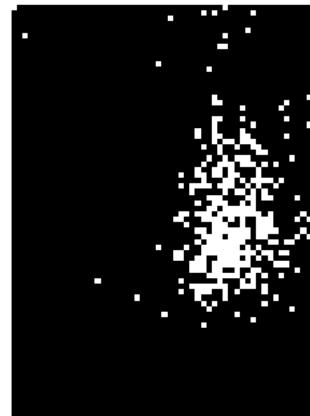




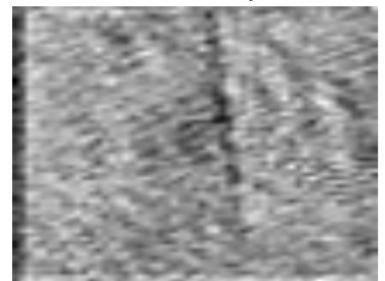
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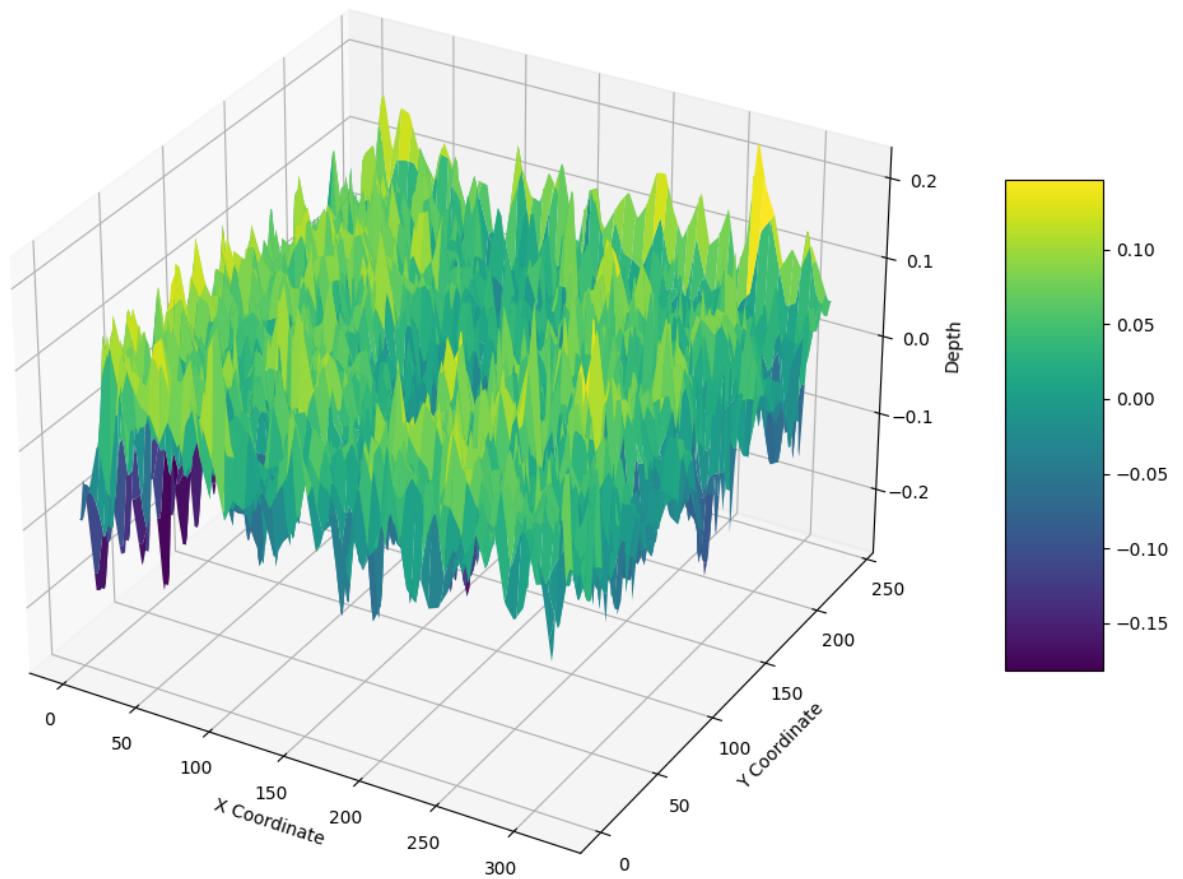
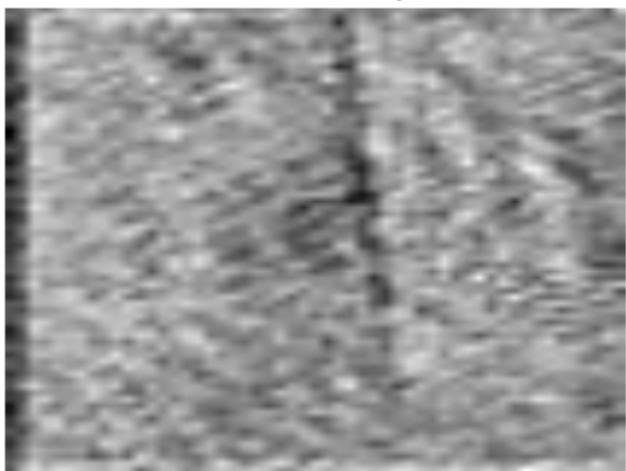
Predicted Contact



Predicted Depth



Predicted Depth



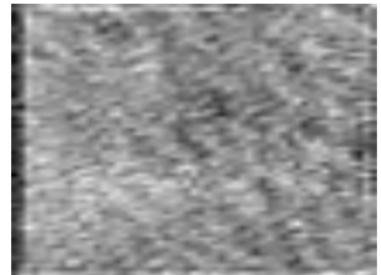
Tactile Image 64



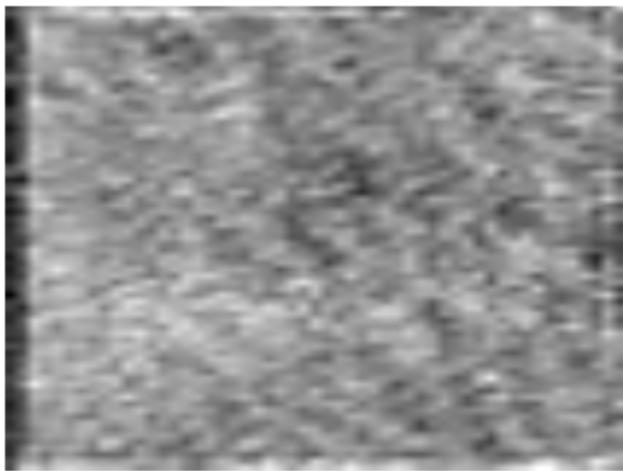
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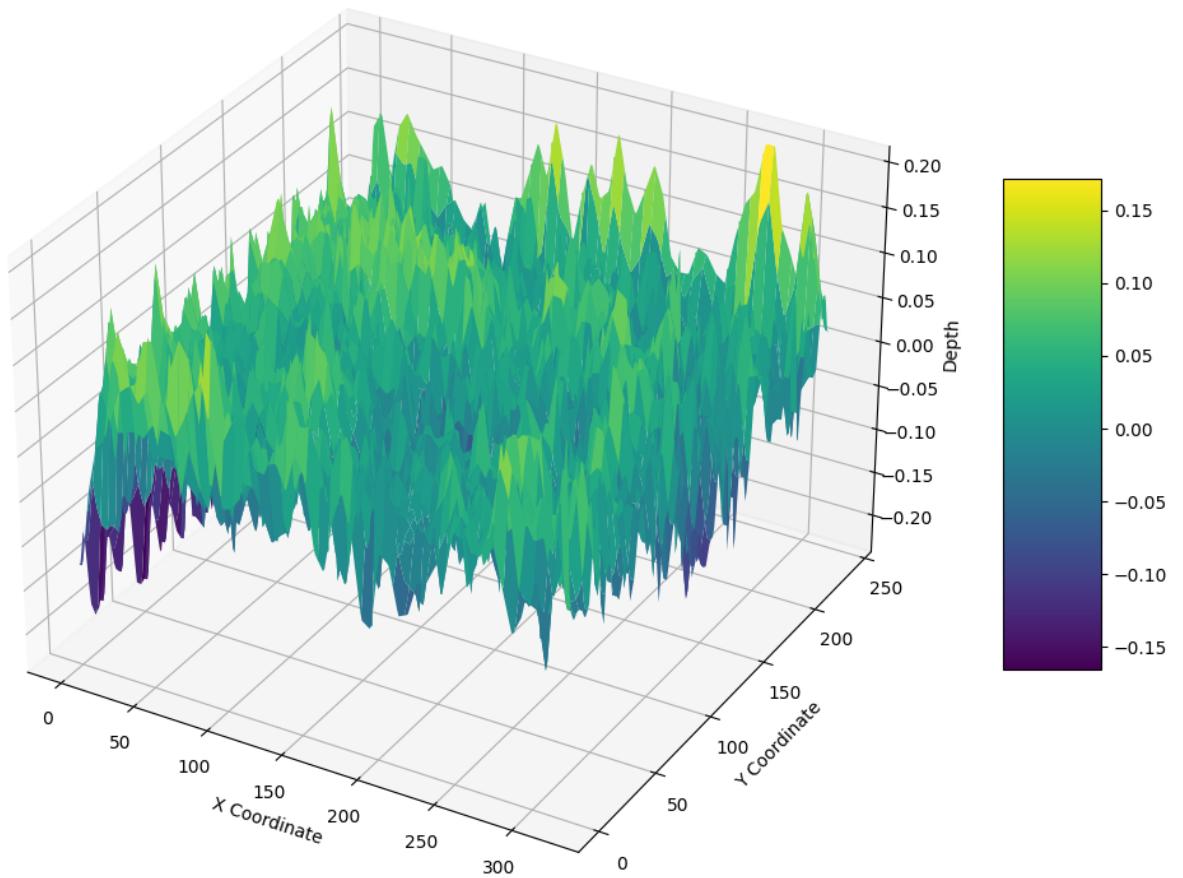


Predicted Depth



Predicted Depth

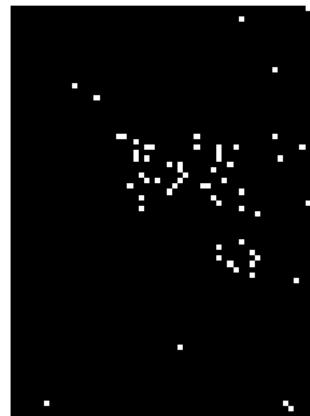




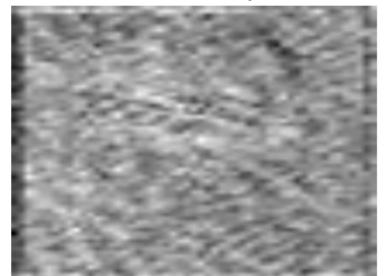
Tactile Image 65



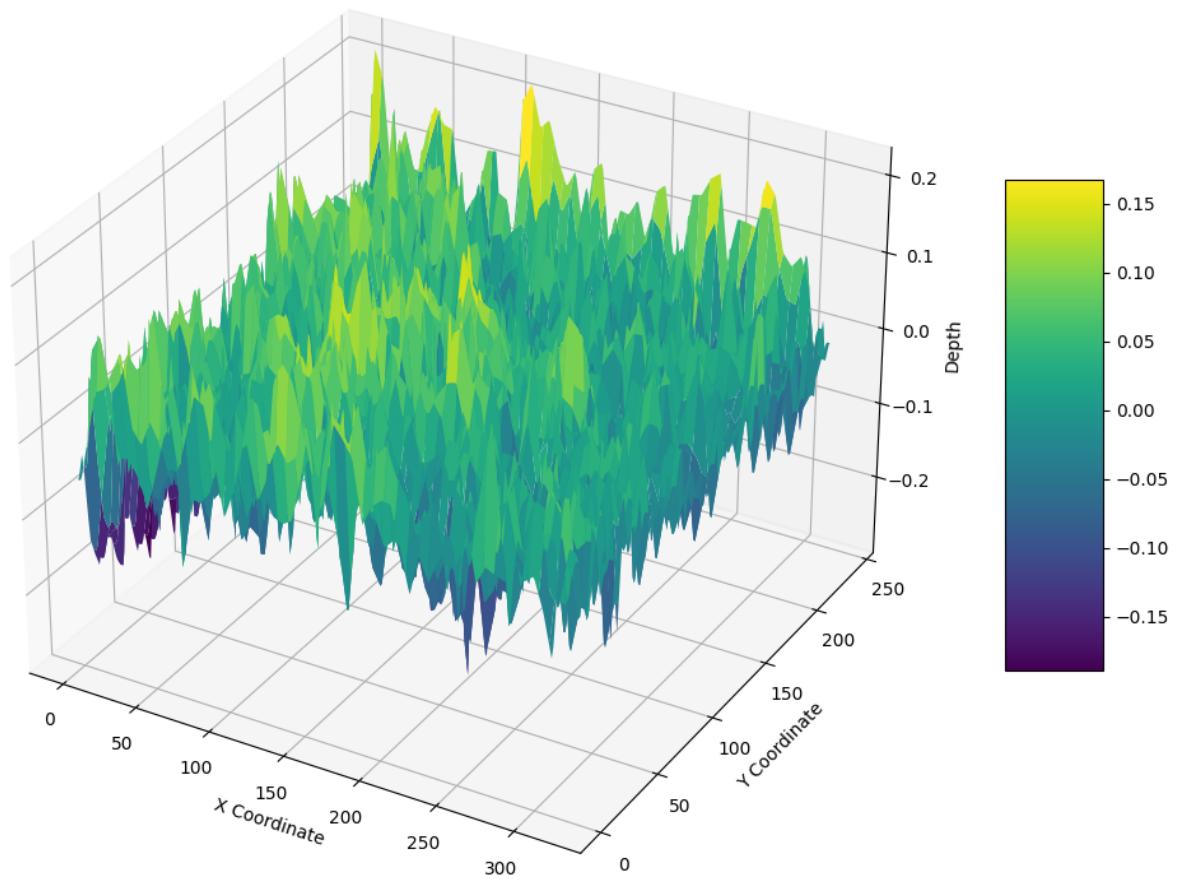
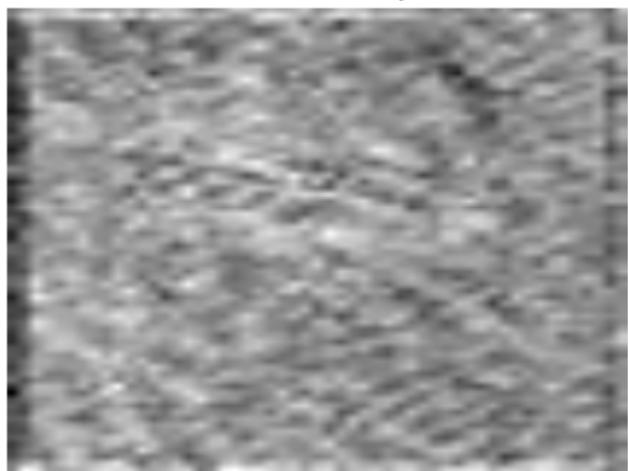
Predicted Contact



Predicted Depth



Predicted Depth



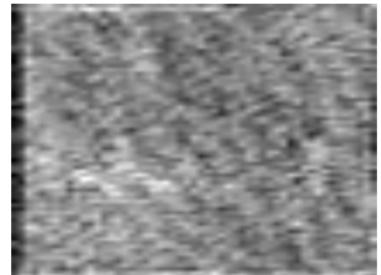
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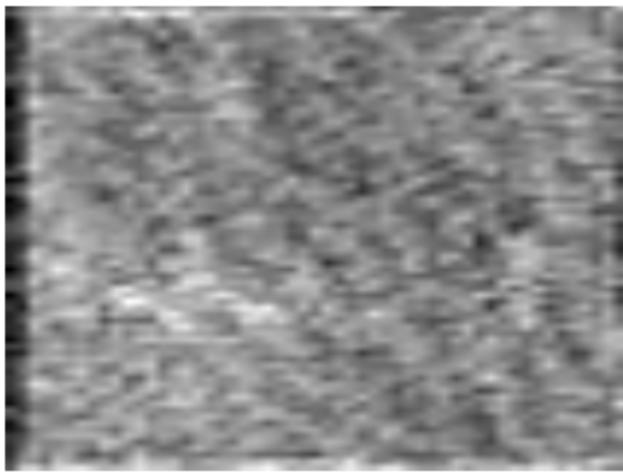
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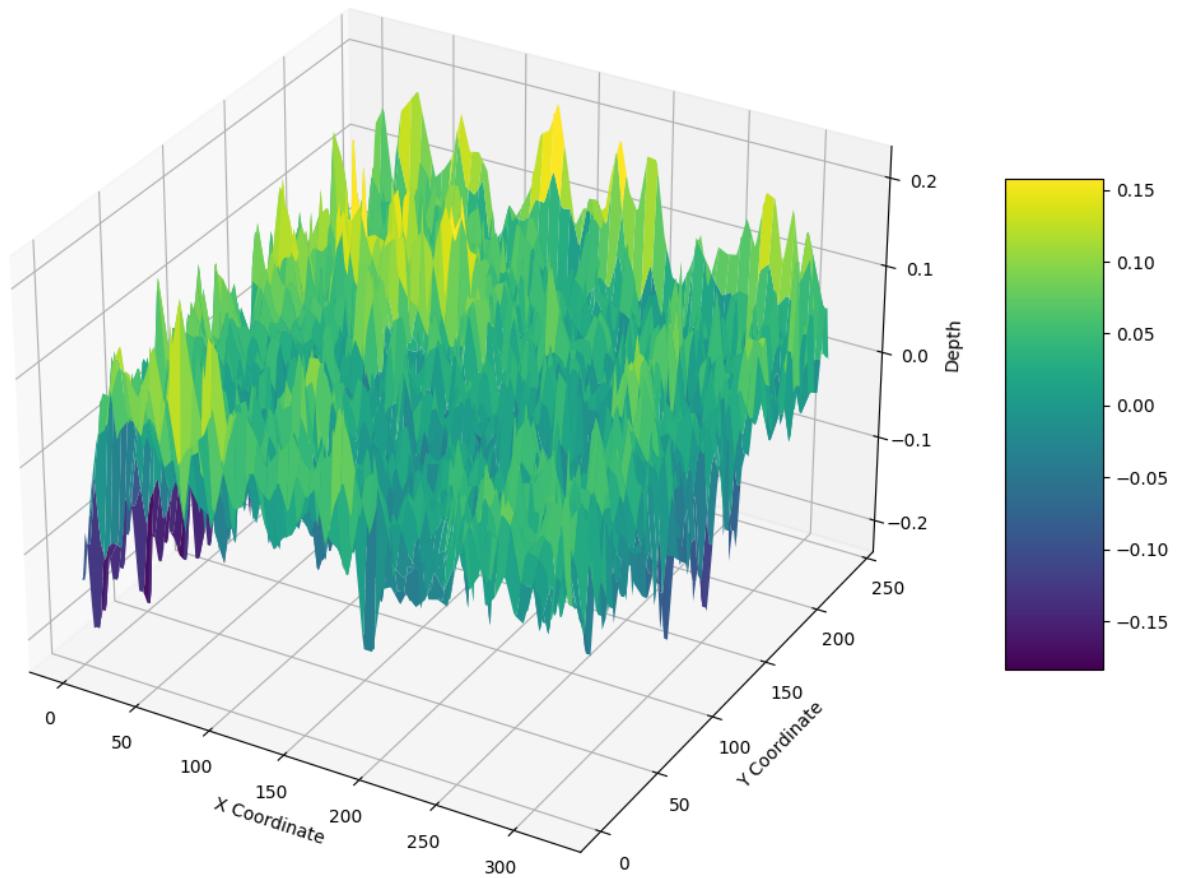


Predicted Depth



Predicted Depth

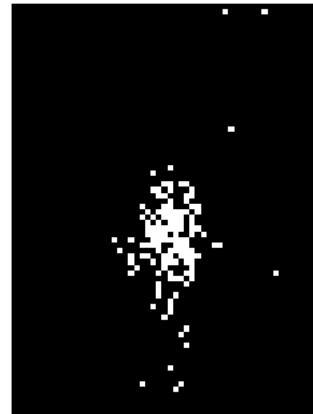




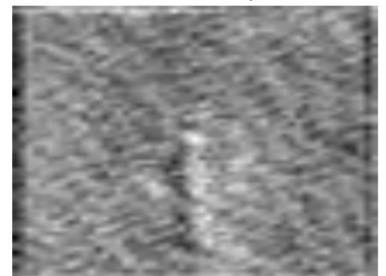
Tactile Image 67



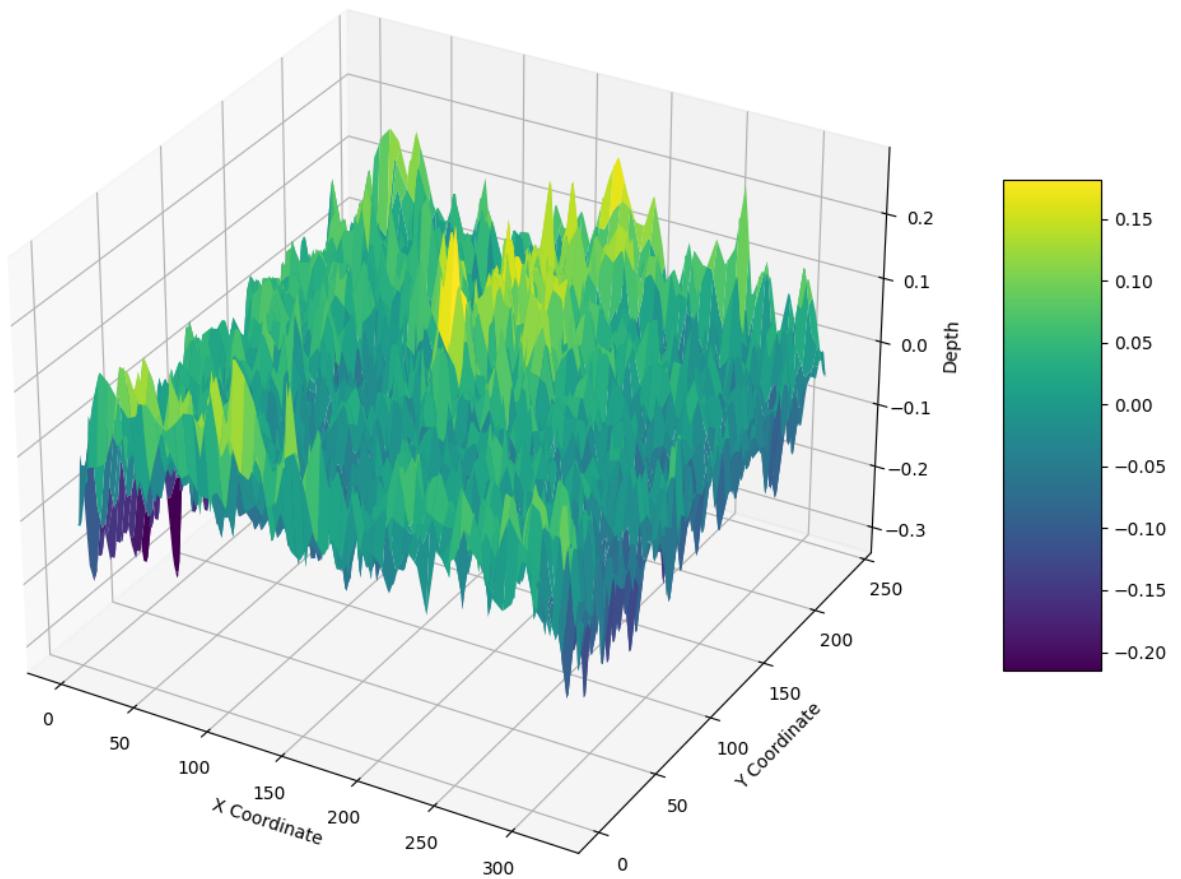
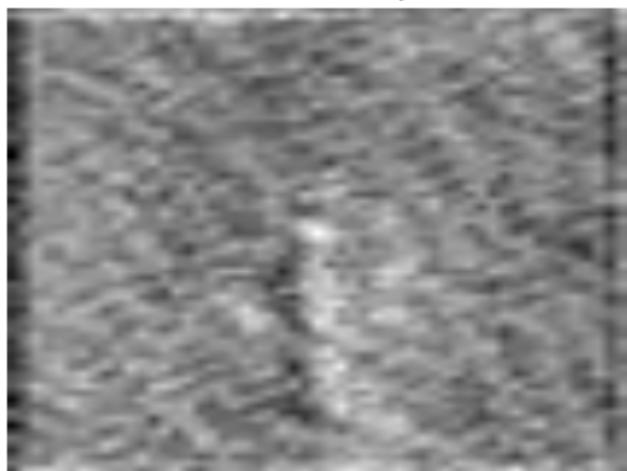
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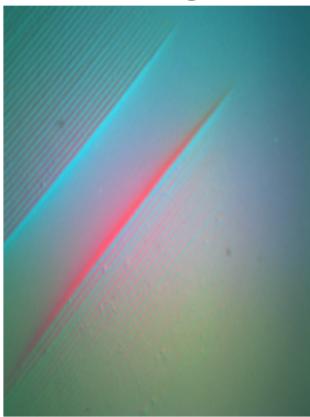
Predicted Depth



Predicted Depth



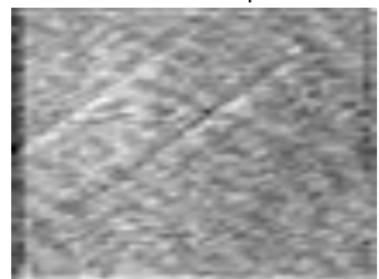
Tactile Image 68



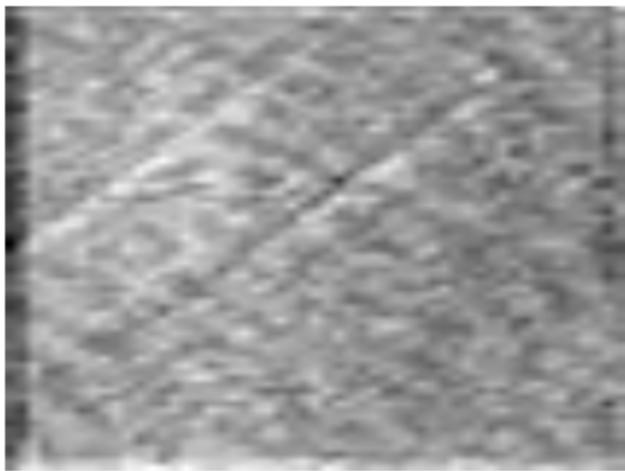
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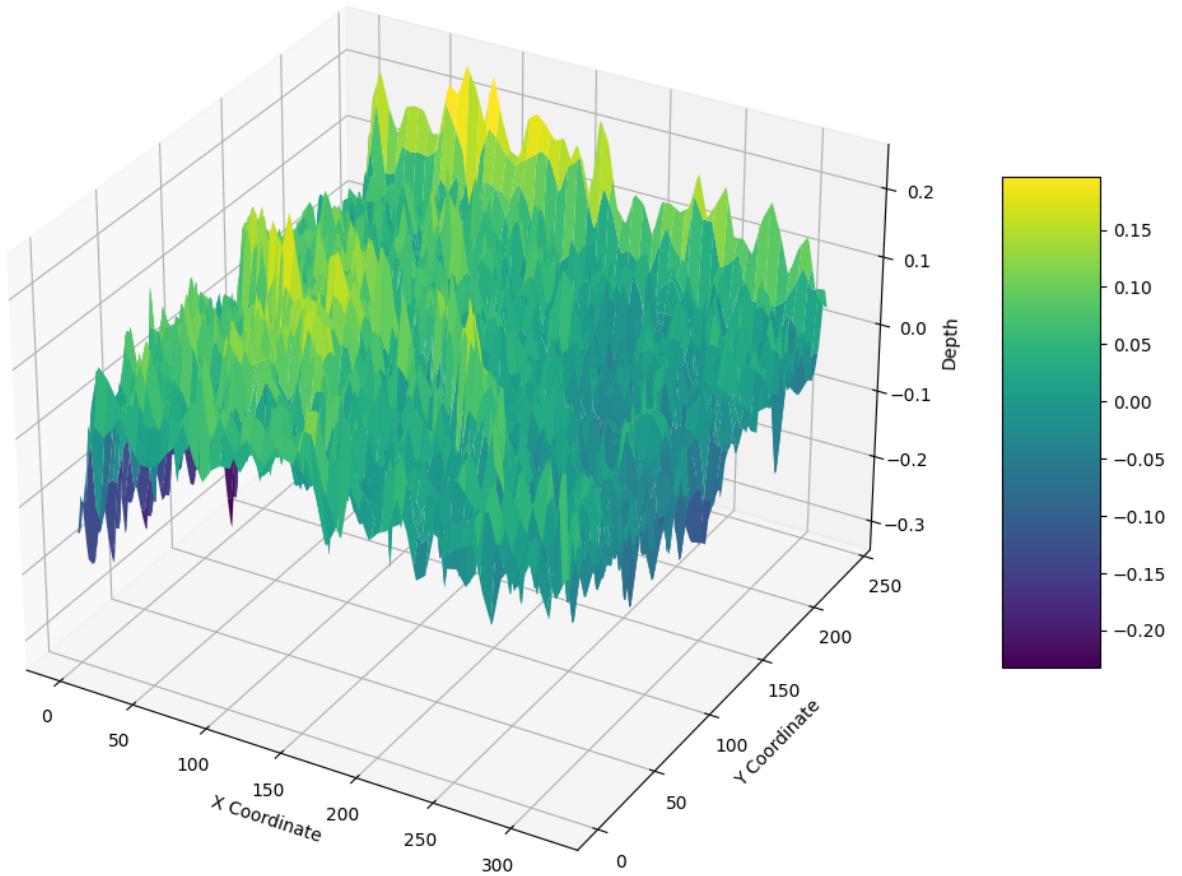


Predicted Depth



Predicted Depth

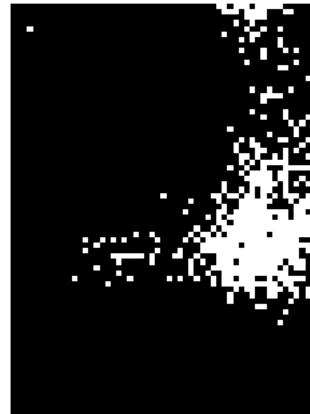




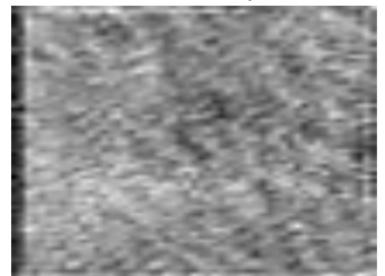
Tactile Image 69



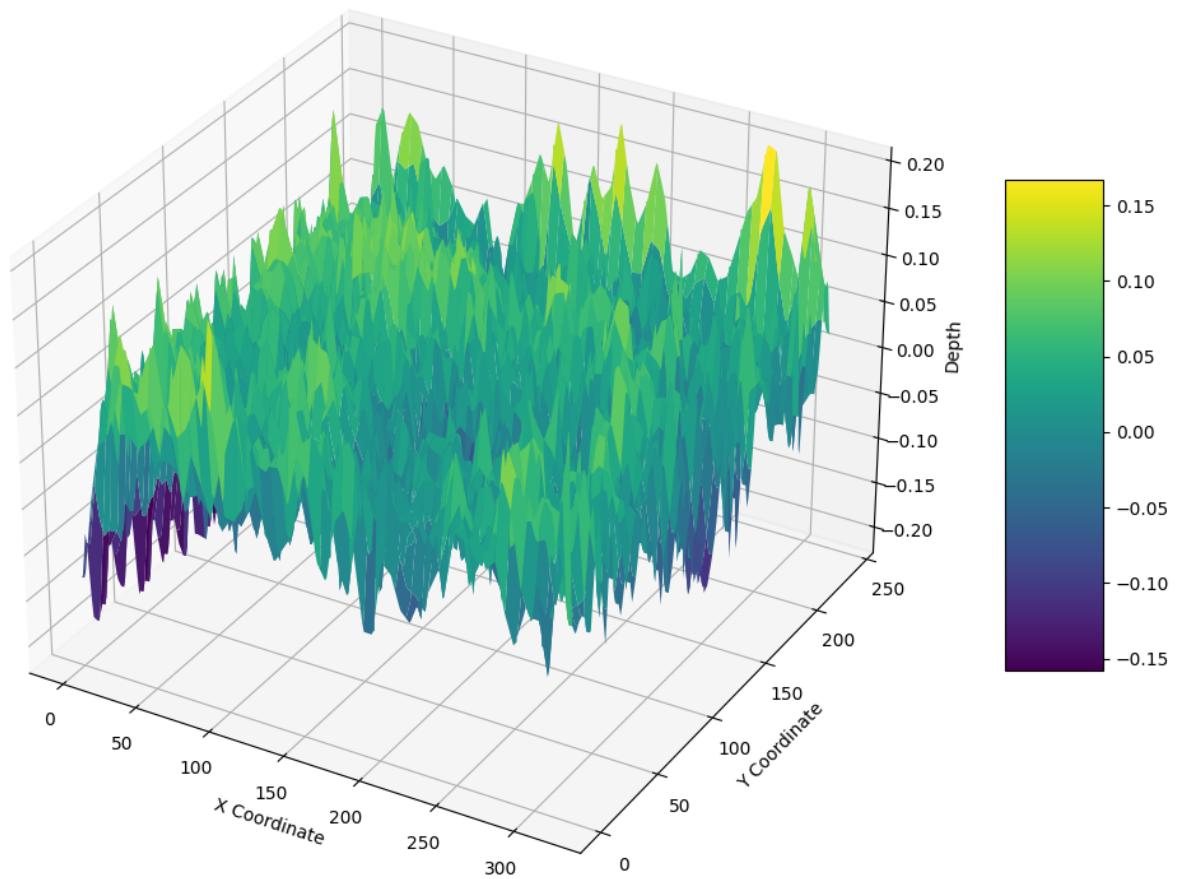
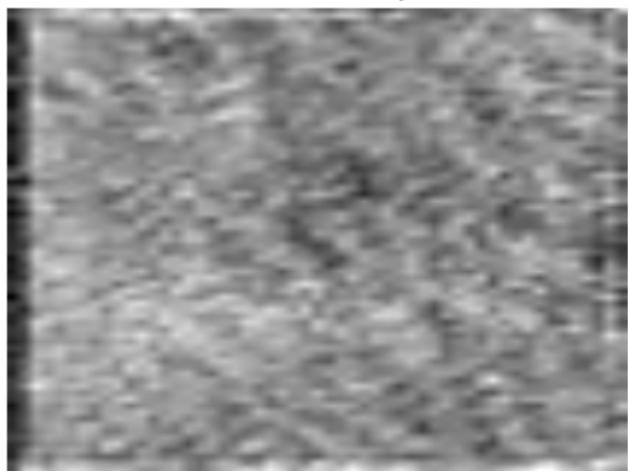
Predicted Contact



Predicted Depth



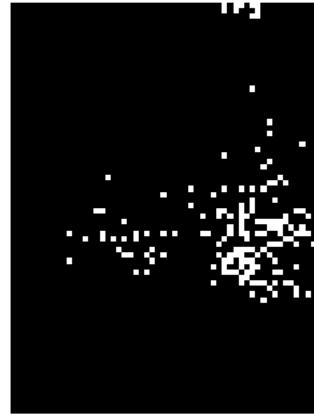
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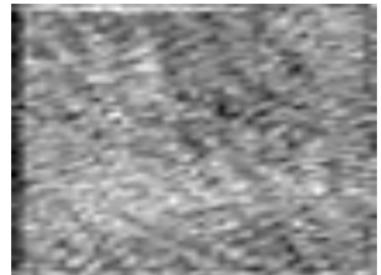
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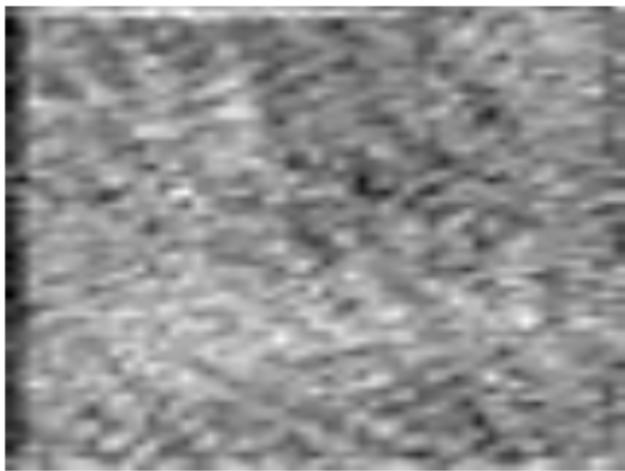
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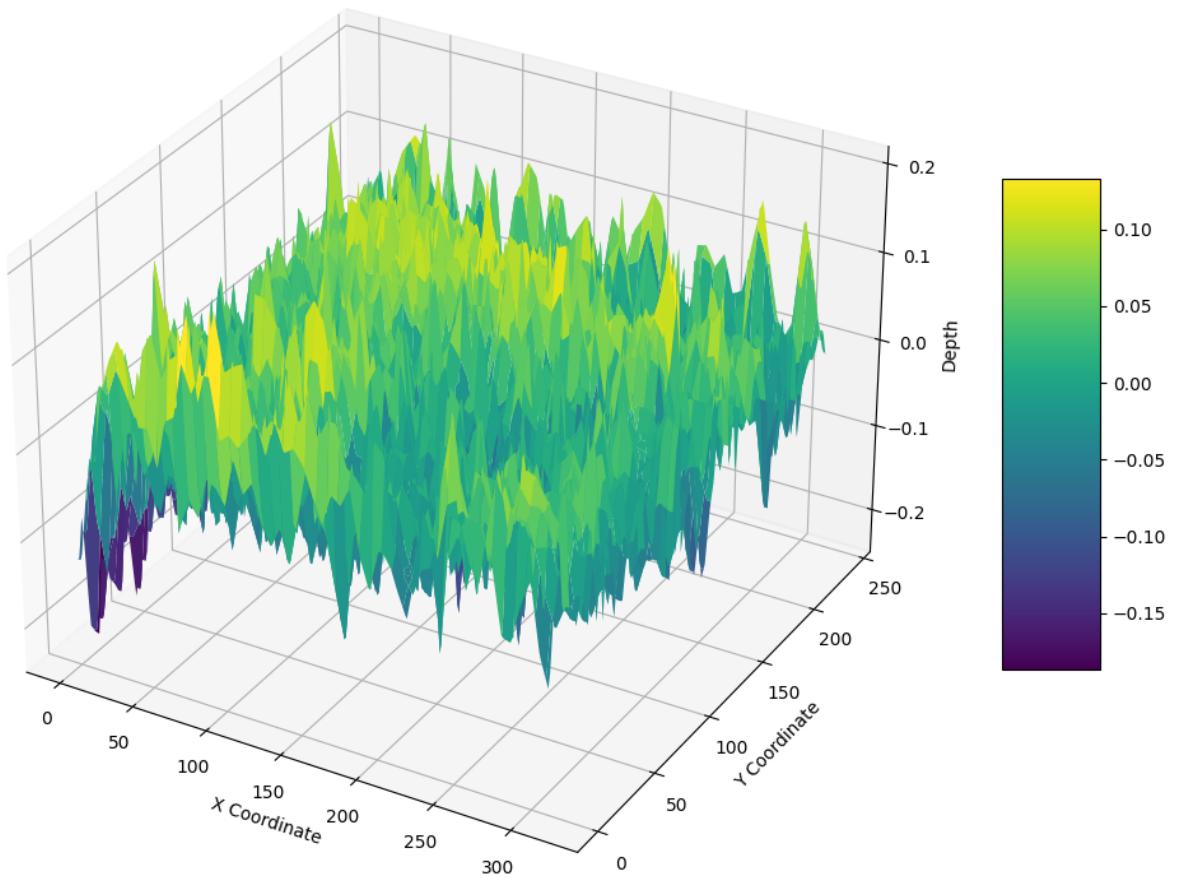


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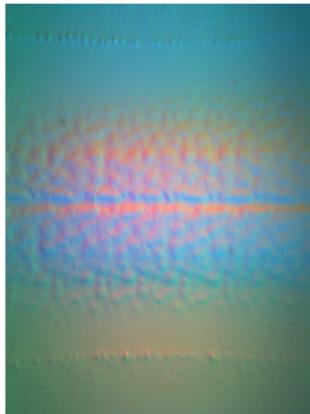


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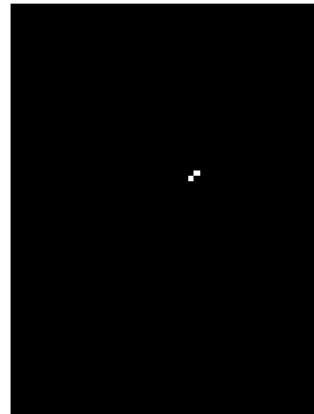




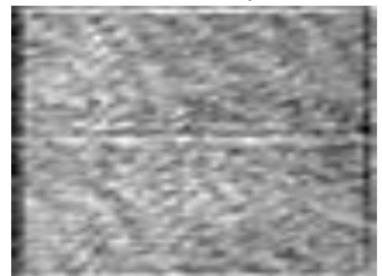
Tactile Image 71



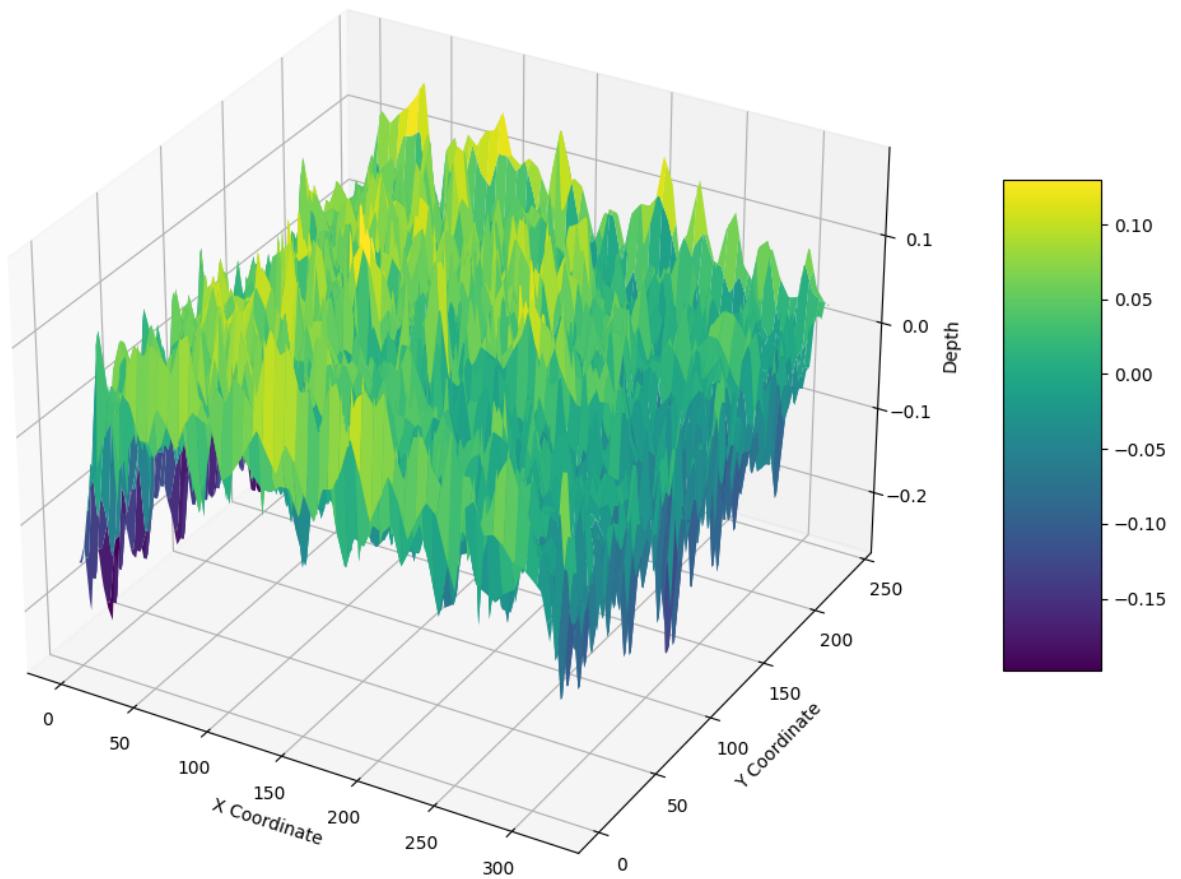
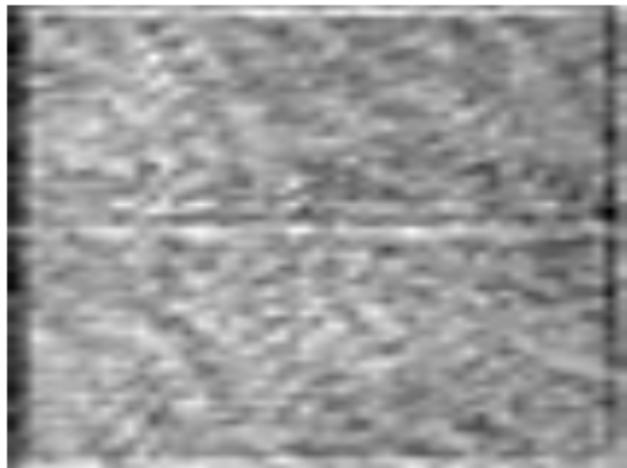
Predicted Contact



Predicted Depth



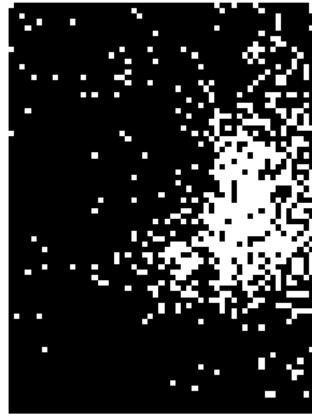
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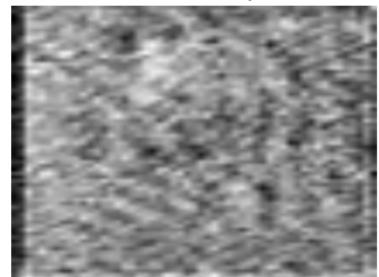
Tactile Image 72



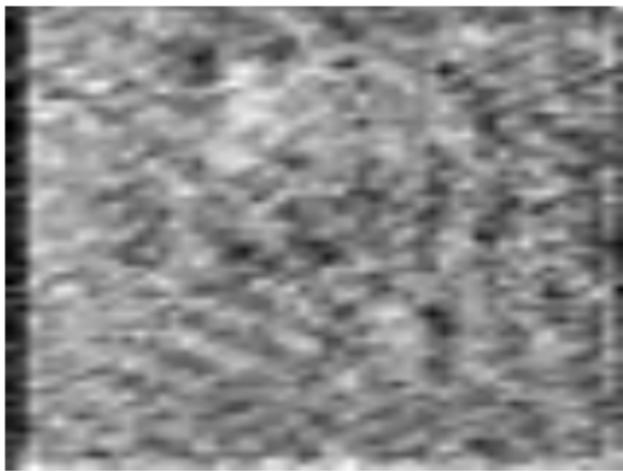
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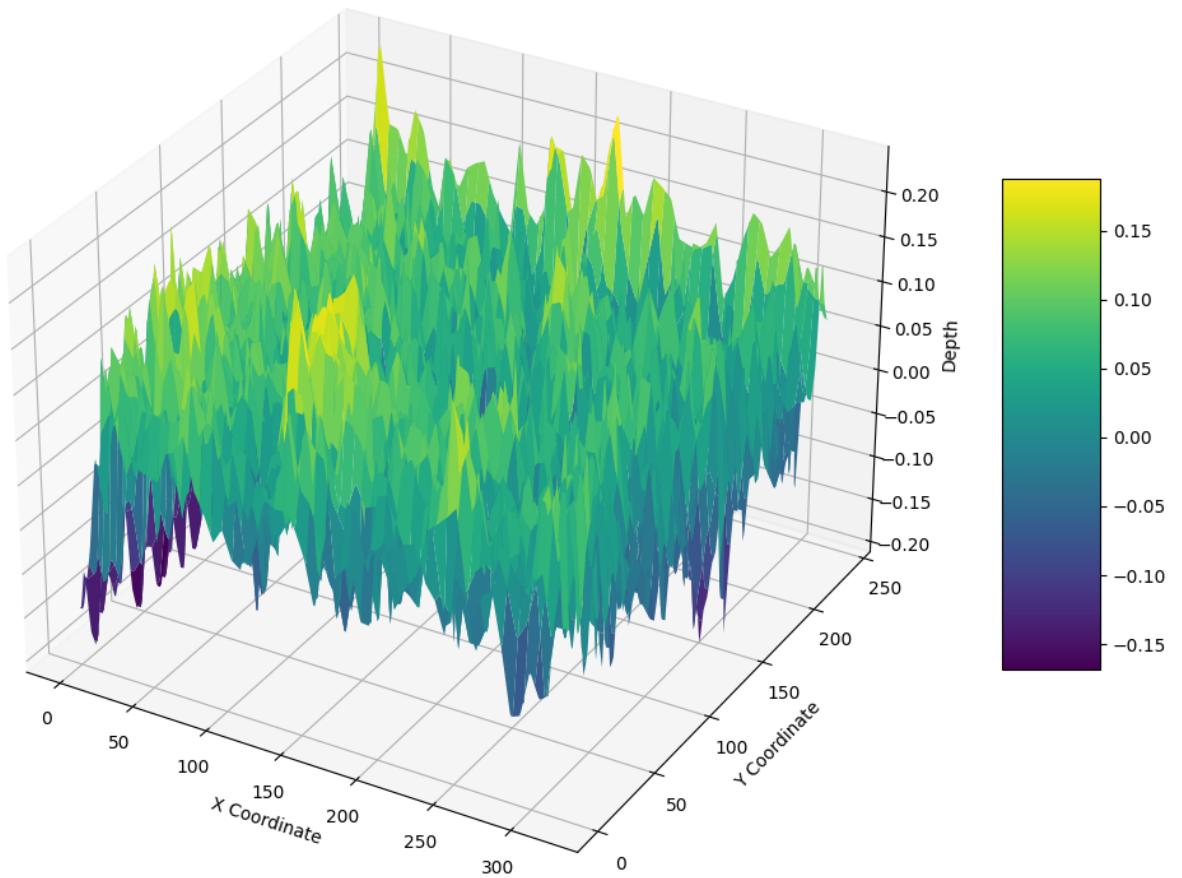


Predicted Depth



Predicted Depth

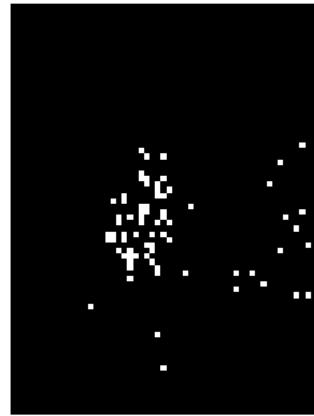




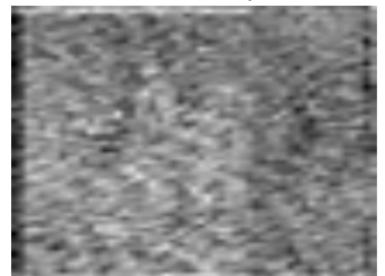
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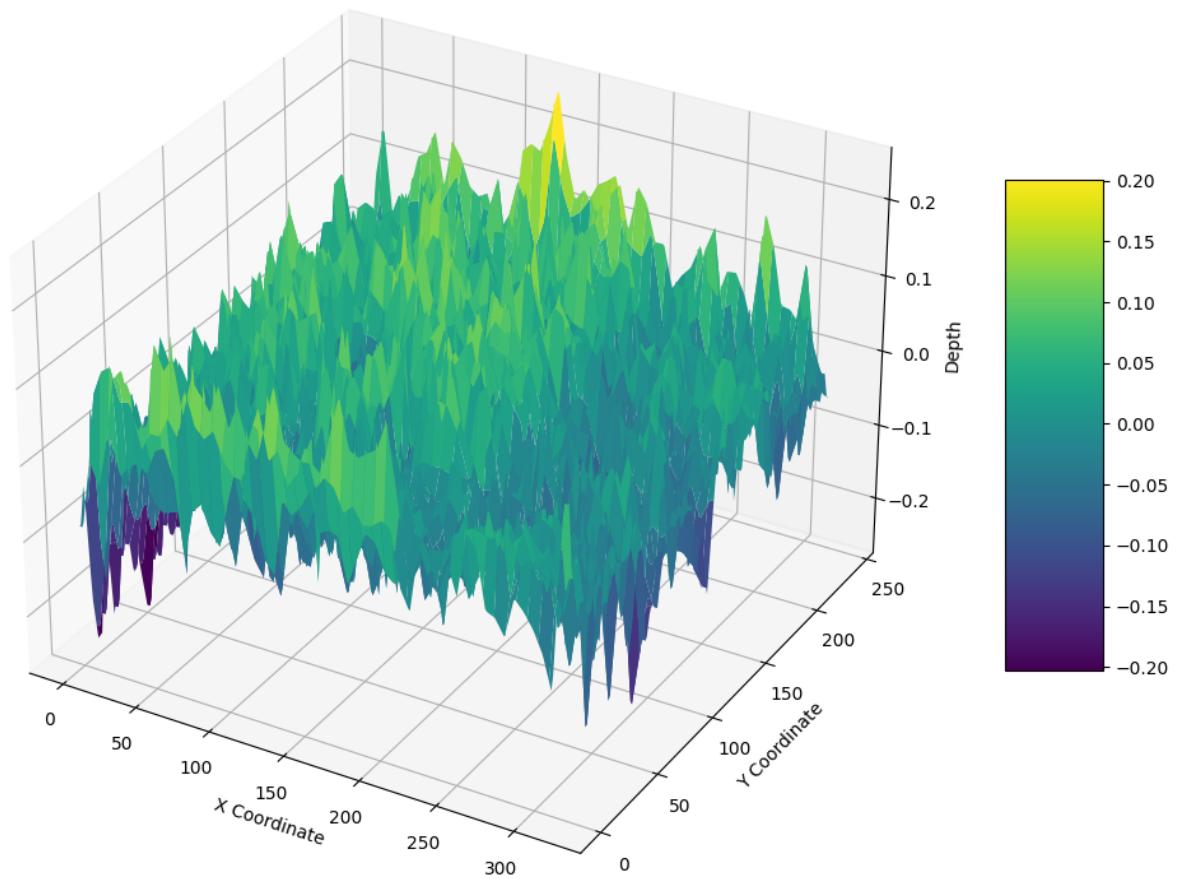
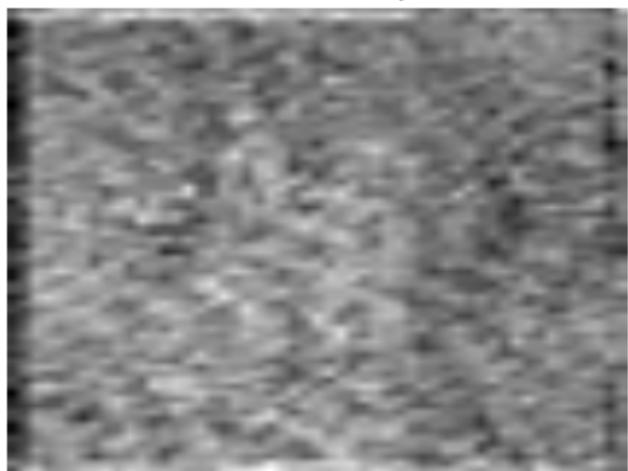
Predicted Contact



Predicted Depth



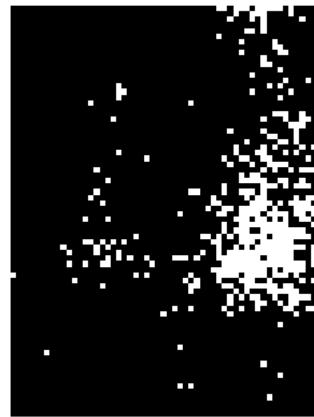
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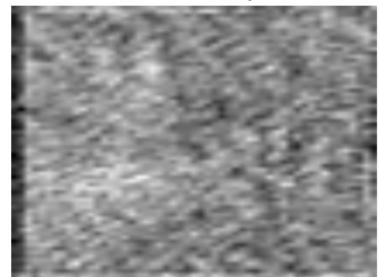
Tactile Image 74



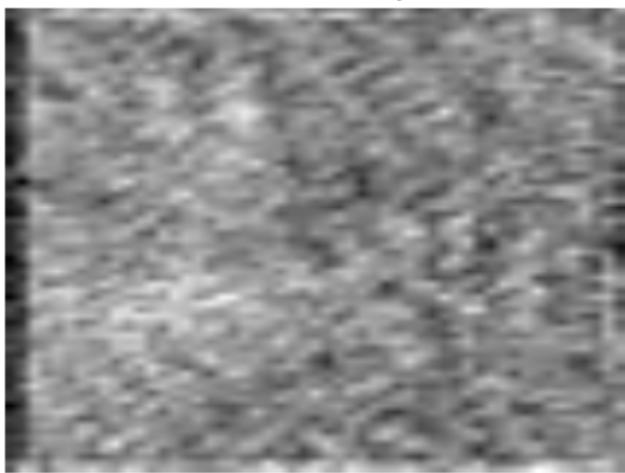
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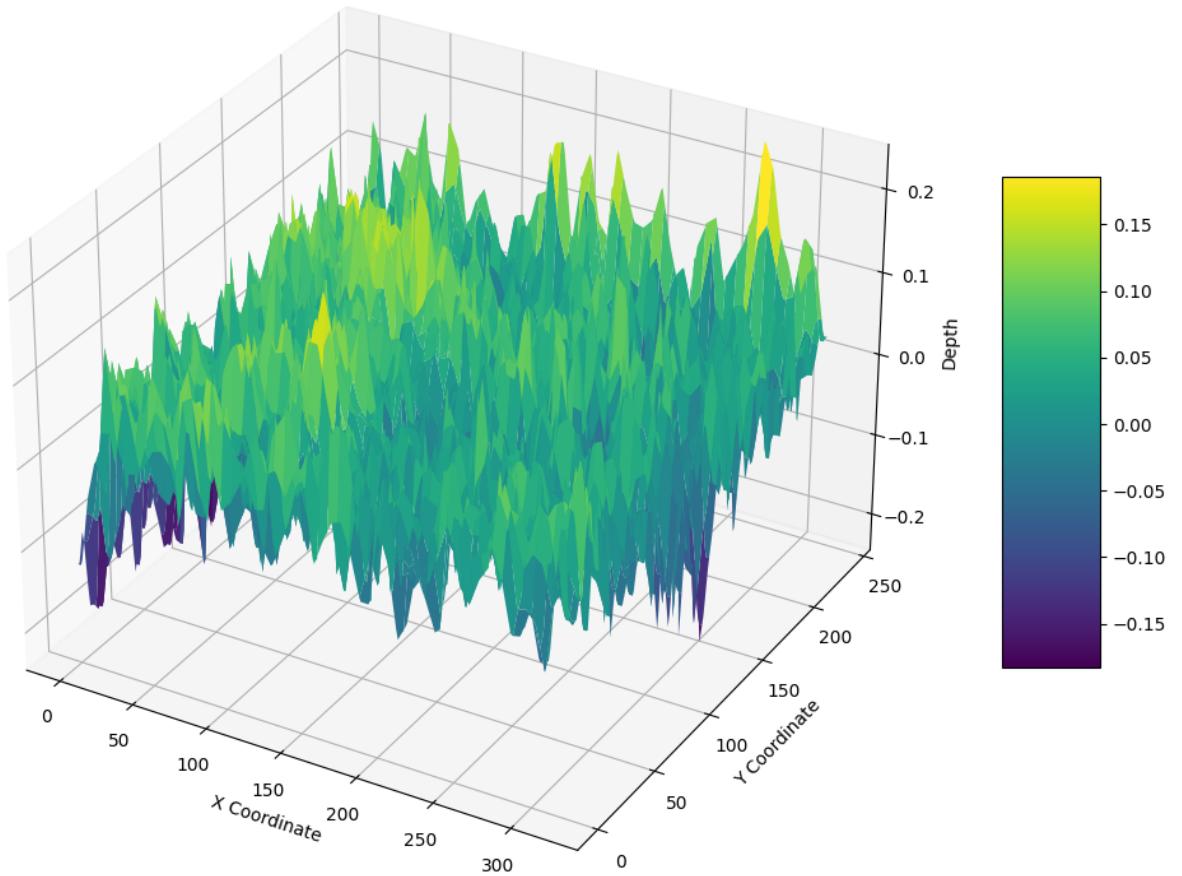


Predicted Depth



Predicted Depth

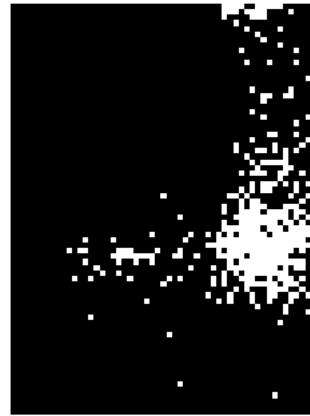




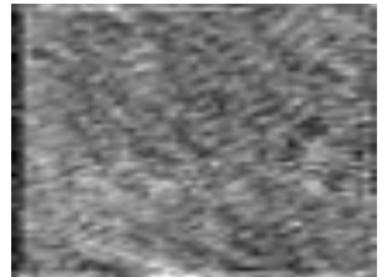
Tactile Image 75



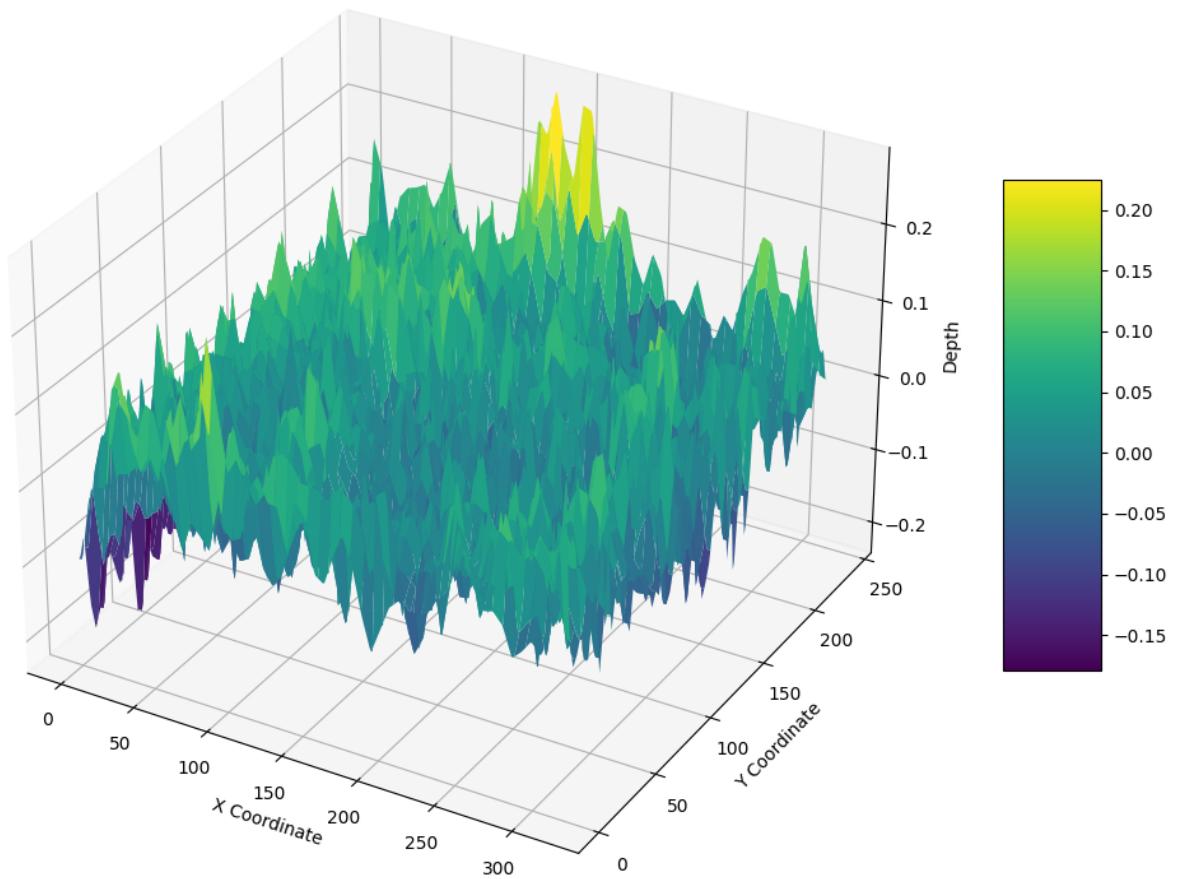
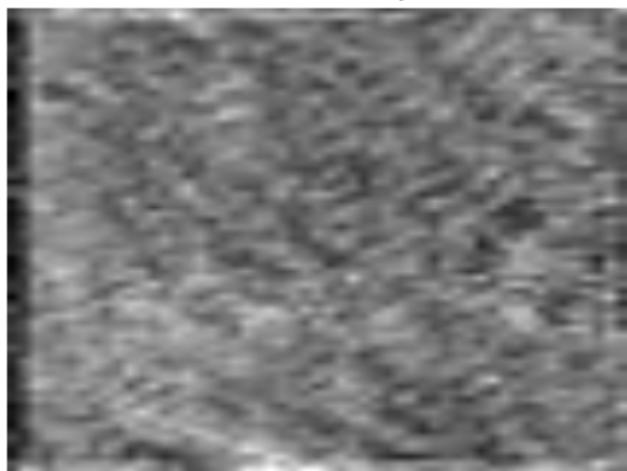
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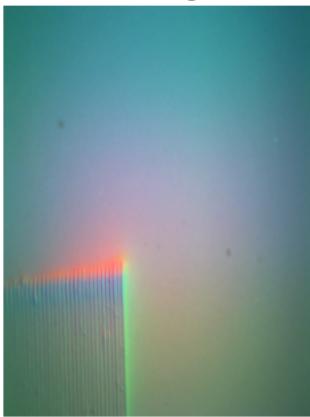
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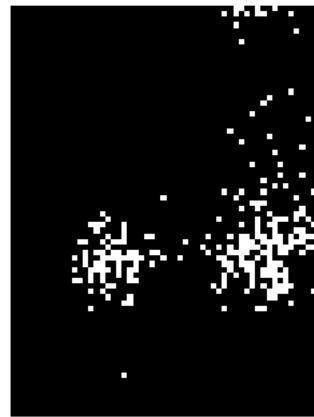
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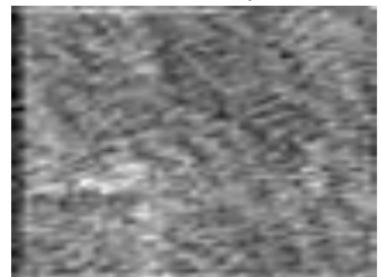
Tactile Image 76



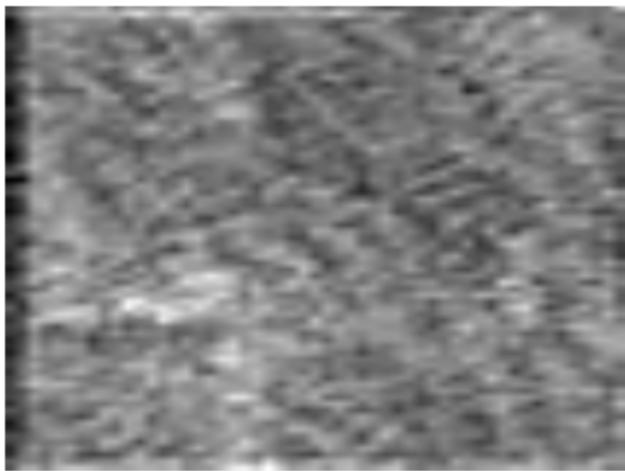
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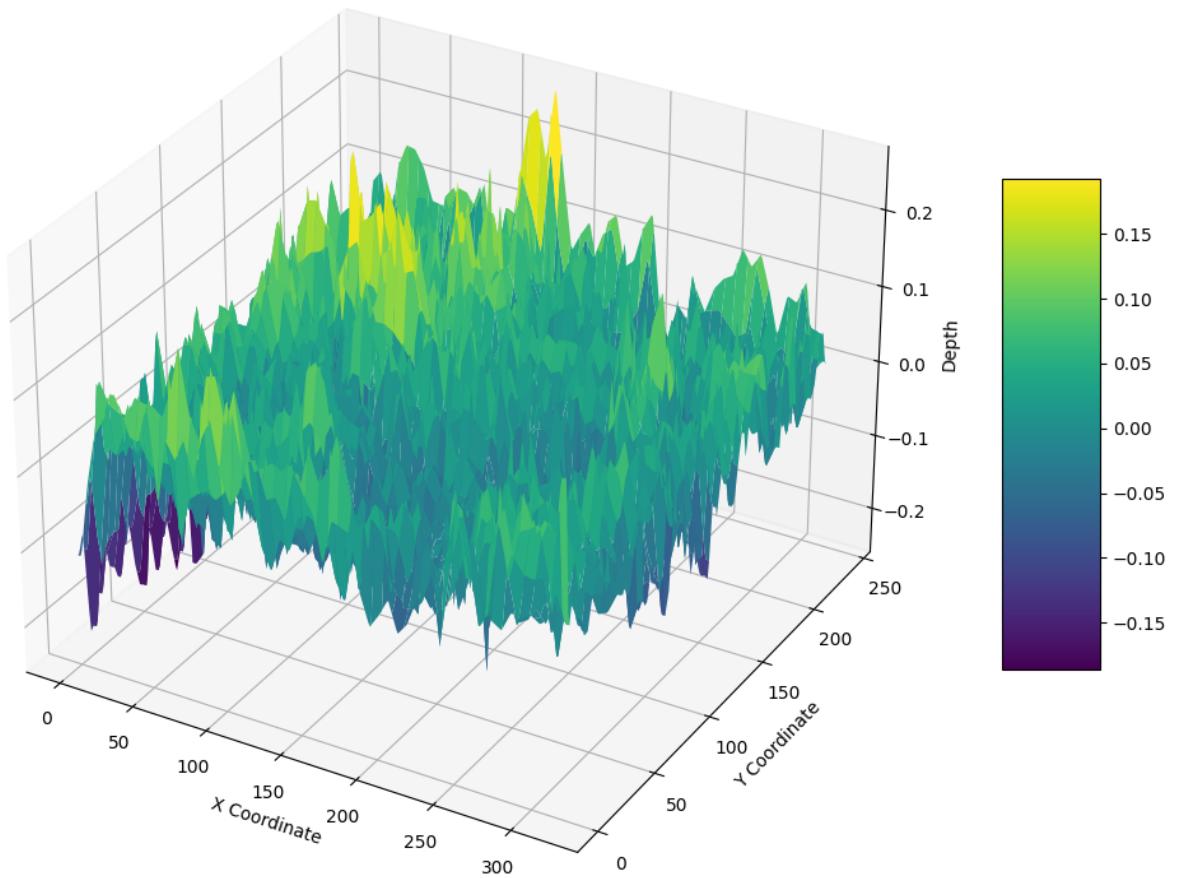


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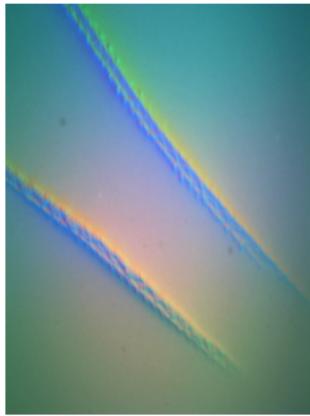


Predicted Depth

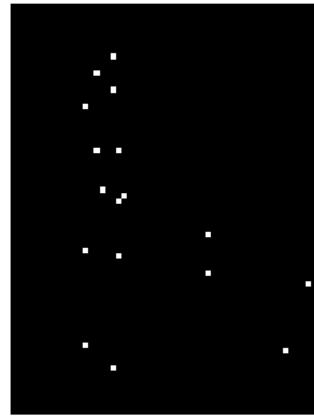




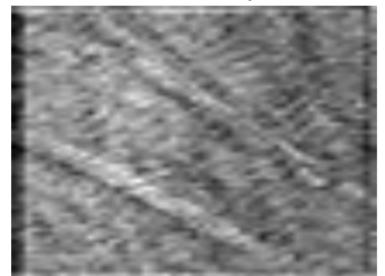
Tactile Image 77



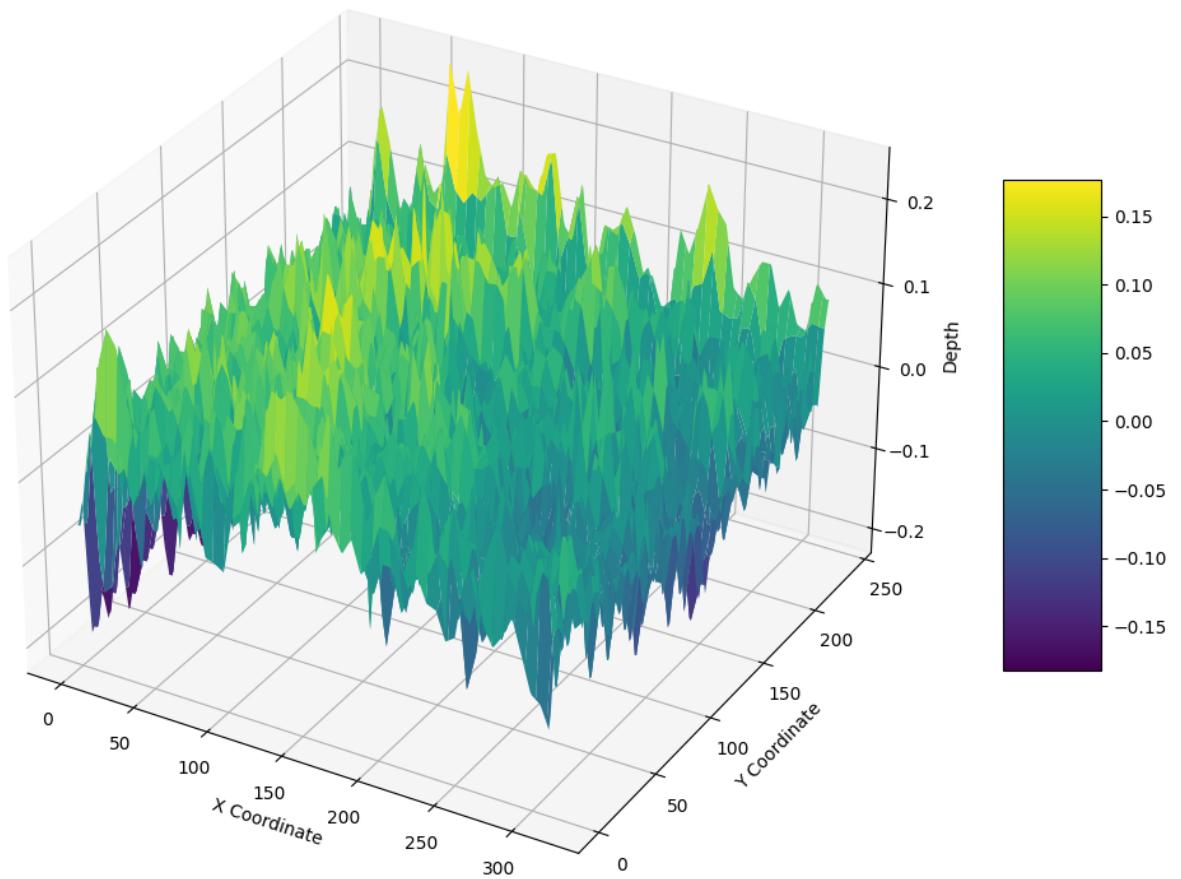
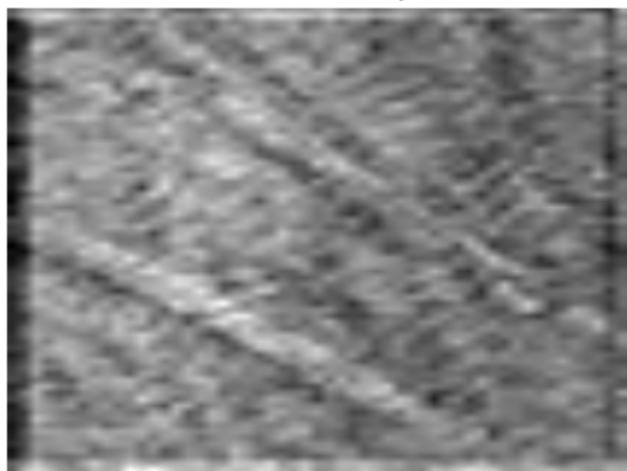
Predicted Contact



Predicted Depth



Predicted Depth



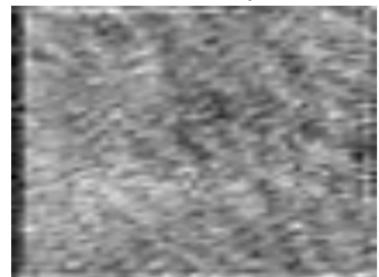
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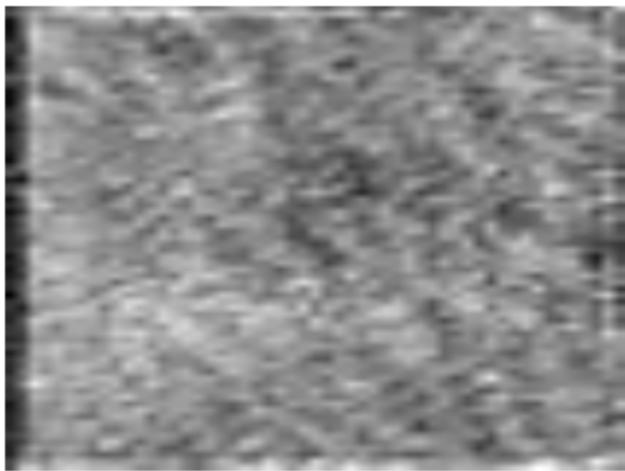
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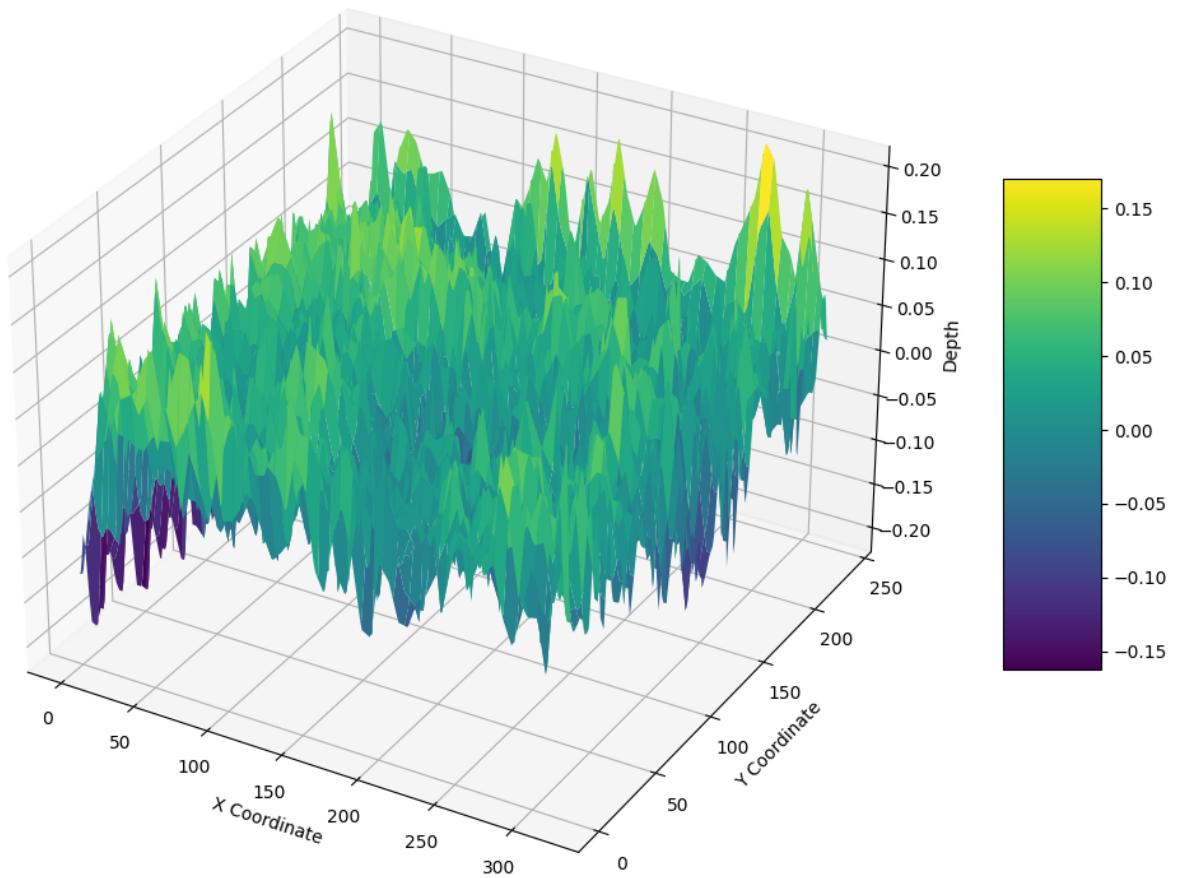


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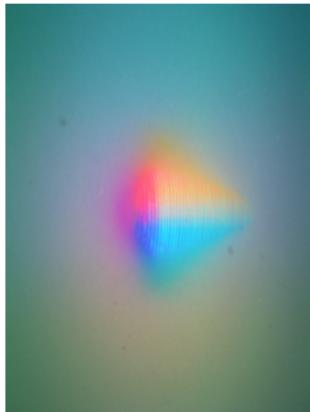


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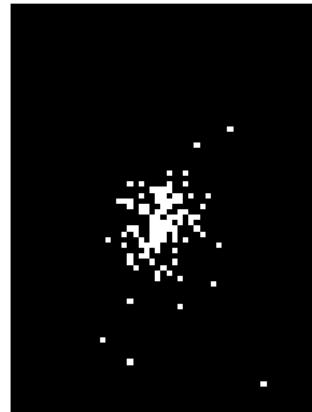




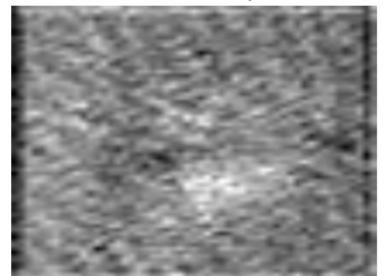
Tactile Image 79



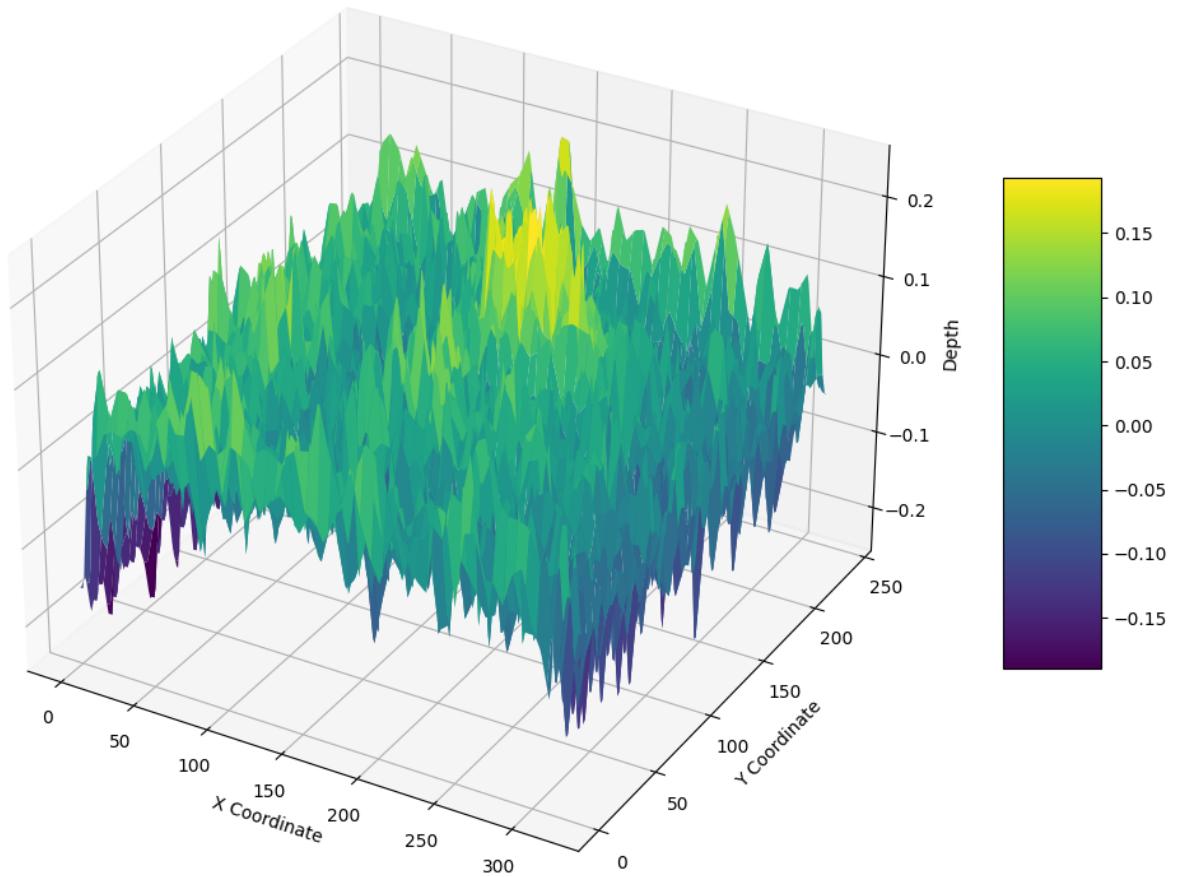
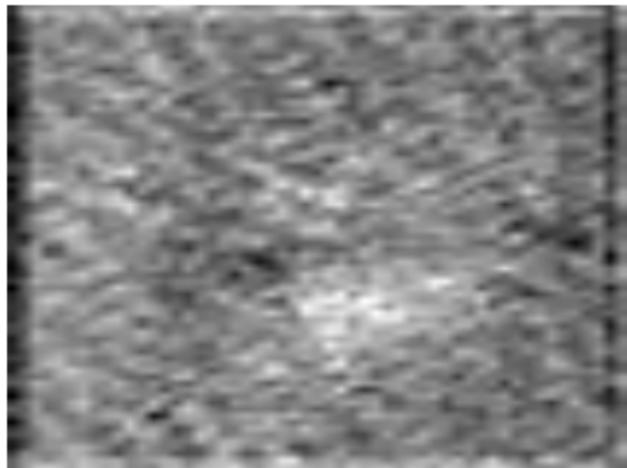
Predicted Contact



Predicted Depth



## Predicted Depth



### Grading Criteria:

Every group is required to present(in 10 mins) their project in a video pesentation. Grading will be based on the performance on [unseen data](#). Therefore, your choice of data augmentations, network design, loss function etc., will be crucial aspects to focus on. You should also upload a LaTeX report about the experiments you had in [this](#) template. Please read about the leaderboard on [piazza](#).

References:

- [1] [Depth Map Prediction from a Single Image using a Multi-Scale Deep Network](#)
- [2] [MidasTouch: Monte-Carlo inference over distributions across sliding touch](#)
- [3] [depth-eigen](#)