

CLUSTERING

Machine Learning for Autonomous Robots

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Recap Questions

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- ▶ What are the advantages and drawbacks of k-means, GMM and DBSCAN?
- ▶ What are applications of clustering?

Implementation Task

Task

Download the Jupyter notebook from StudIP and solve the tasks described there:
implement k-means.

Exploratory Data Analysis: Grasp Stability Estimation

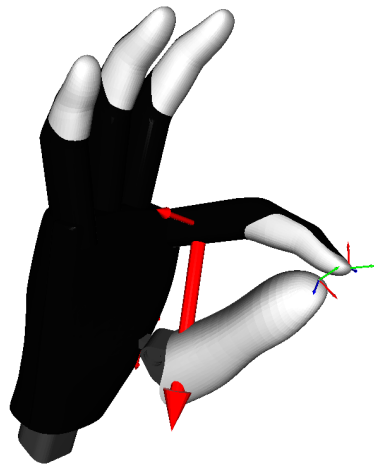
Clustering for Exploratory Data Analysis

Task: Grasp Stability Estimation

Grasp Stability Estimation

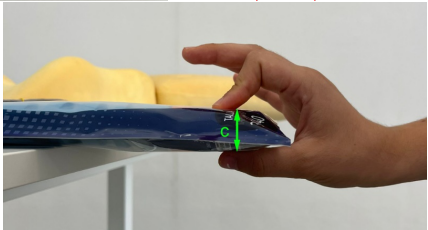
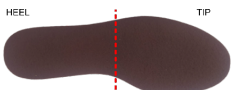
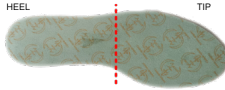
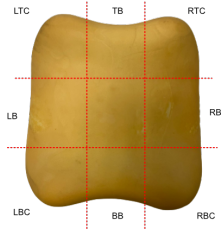
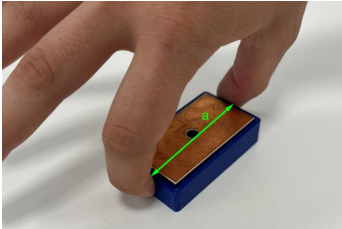
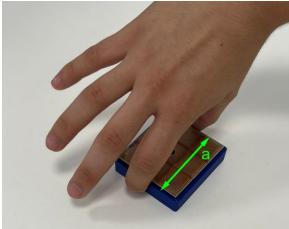
Available sensor data:

- ▶ Force measurements (normal and lateral force) in index finger, middle finger, and thumb
- ▶ Distances between tip of index finger and thumb, and between tip of middle finger and thumb
- ▶ ... as time series



Grasp Stability Estimation

Other objects:



Grasp Stability Estimation

Questions:

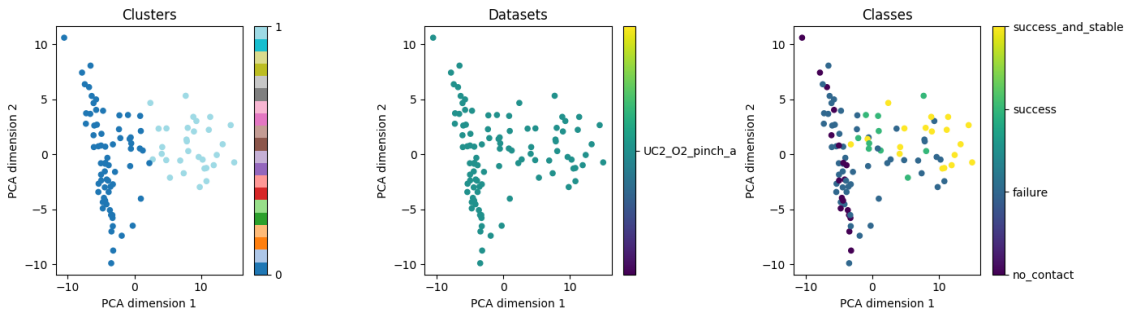
- ▶ Are there any natural groups (clusters) in the dataset?
- ▶ Would we be able to distinguish between stable and unstable grasps?
- ▶ Would we be able to distinguish between objects?

Problem:

- ▶ Data is high-dimensional (80D) and not easy to visualize.
- ▶ We can use dimensionality reduction (e.g., principal component analysis) for visualization, but we will lose information.

Grasp Stability Estimation

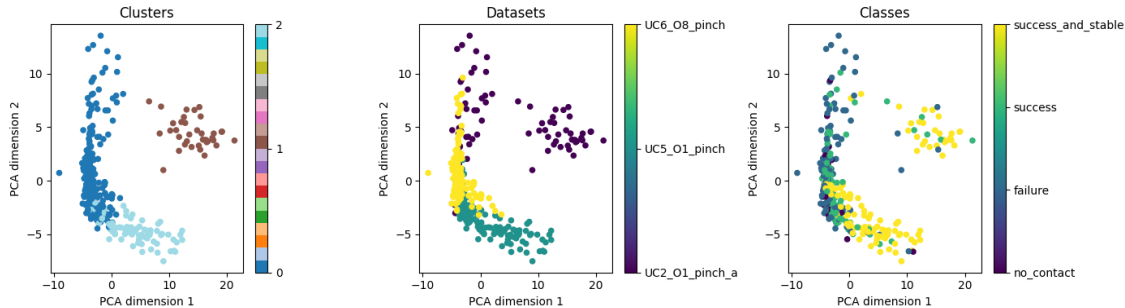
k-means (k=2) before PCA to 2D, dataset visualized as scatter plot



What do you observe?

Grasp Stability Estimation

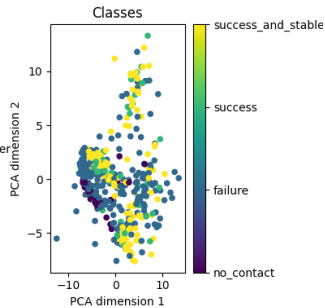
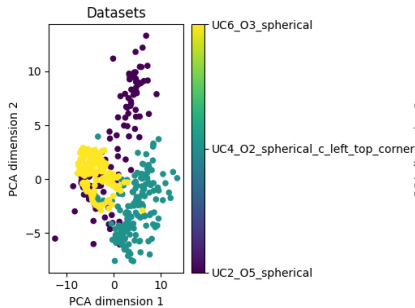
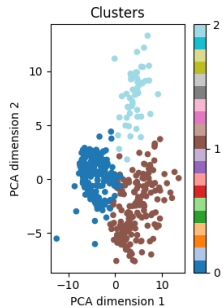
GMM (3 Gaussians)



What do you observe?

Grasp Stability Estimation

k-means (k=3)



What do you observe?

Implementation Task

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Download the Jupyter notebook from StudIP and solve the tasks described there: use k-means for document clustering.