

# Geometric Registration for Deformable Shapes

## 1.1 Introduction

Overview • Data Sources and Applications • Problem Statement

# Overview

# Presenters



**Will Chang**

University of California at  
San Diego, USA

[wychang@cs.ucsd.edu](mailto:wychang@cs.ucsd.edu)



**Hao Li**

ETH Zürich, EPFL Lausanne  
Switzerland

[hao@inf.ethz.ch](mailto:hao@inf.ethz.ch)



**Niloy Mitra**

KAUST, Saudi Arabia  
IIT Delhi, India

[niloy@cse.iitd.ernet.in](mailto:niloy@cse.iitd.ernet.in)



**Mark Pauly**

EPFL Lausanne  
Switzerland

[mark.pauly@epfl.ch](mailto:mark.pauly@epfl.ch)



**Michael Wand**

Saarland University,  
MPI Informatik, Germany

[mwand@mpi-inf.mpg.de](mailto:mwand@mpi-inf.mpg.de)

# Tutorial Outline

---

## Overview

- **Part I:** Introduction (1.25h)
- **Part II:** Local Registration (1.5h)
- **Part III:** Global Matching (1.75h)
- **Part IV:** Animation Reconstruction (1.25h)
- Conclusions and Wrap up (0.25h)

# Part I: Introduction

---

## Introduction (Michael)

- Problem statement and motivation
- Example data sets and applications

## Differential geometry and deformation modeling (Mark)

- Differential geometry background
- Brief introduction to deformation modeling

## Kinematic 4D surfaces (Niloy)

- Rigid motion in space-time
- Kinematic 4D surfaces

# Part II: Local Registration

## ICP and of rigid motions (Niloy)

- Rigid ICP, geometric optimization perspective
- Dynamic geometry registration (Intro)

## Deformable Registration (Michael)

- A variational model for deformable shape matching
- Variants of deformable ICP

## Subspace Deformation, Robust Registration (Hao)

- Subspace deformations / deformation graphs
- Robust local matching

# Part III: Global Matching

## Features (Will)

- Key point detection and feature descriptors

## Isometric Matching and Quadratic Assignment (Michael)

- Extrinsic vs. intrinsic geometry
- Global matching techniques with example algorithms

## Advanced Global Matching (Will)

- Global registration algorithms

## Probabilistic Techniques (Michael)

- Ransac and forward search

## Articulated Registration (Will)

- Articulated registration with graph cuts

# Part IV: Animation Reconstruction

## Dynamic Geometry Registration (Niloy)

- Multi-piece alignment

## Deformable Reconstruction (Michael)

- Basic numerical algorithm
- Urshape/Deformation Factorization

## Improved Algorithm (Hao)

- Efficient implementation
- Detail transfer

# Part V: Conclusions and Wrap-up

---

## Conclusions and Wrap-up (Mark)

- Conclusions
- Future work and open problems

## In the end:

- Q&A session with all speakers
- But feel free to ask questions at any time

# **Problem Statement and Motivation**

# Deformable Shape Matching

What is the problem?

Settings:

- We have two or more shapes
- The same object, but deformed



Data courtesy of C. Stoll, MPI Informatik

# Deformable Shape Matching

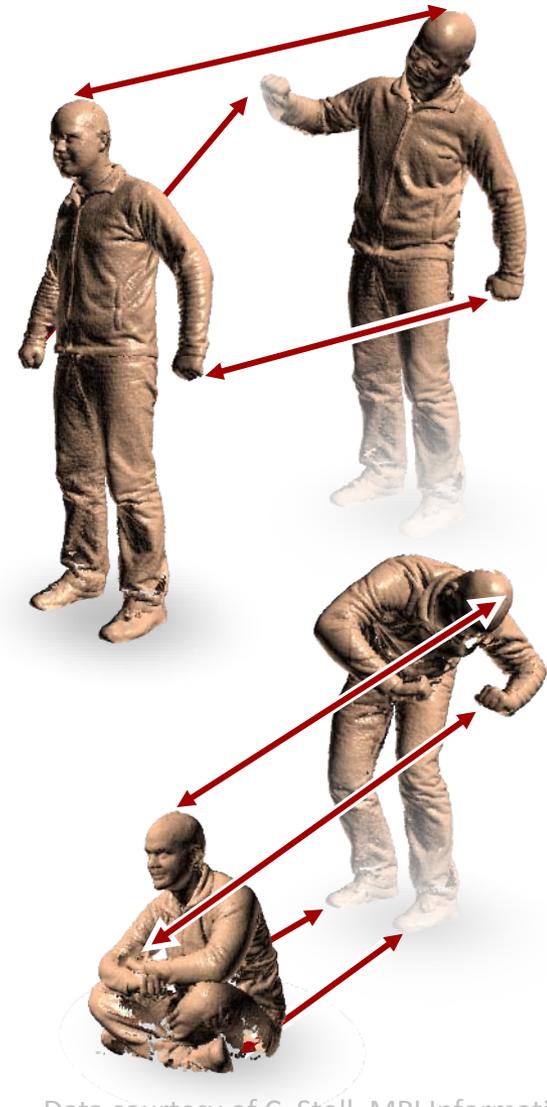
What is the problem?

Settings:

- We have two or more shapes
- The same object, but deformed

Question:

- What points correspond?



Data courtesy of C. Stoll, MPI Informatik

# Applications

---

## Why is this an interesting problem?

### Building Block:

- Correspondences are a building block for higher level geometry processing algorithms

### Example Applications:

- Scanner data registration
- Animation reconstruction & 3D video
- Statistical shape analysis (shape spaces)

# Applications

## Why is this an interesting problem?

### Building Block:

- Correspondences are a building block for higher level geometry processing algorithms

### Example Applications:

- Scanner data registration
- Animation reconstruction & 3D video
- Statistical shape analysis (shape spaces)

# Deformable Scan Registration

## Scan registration

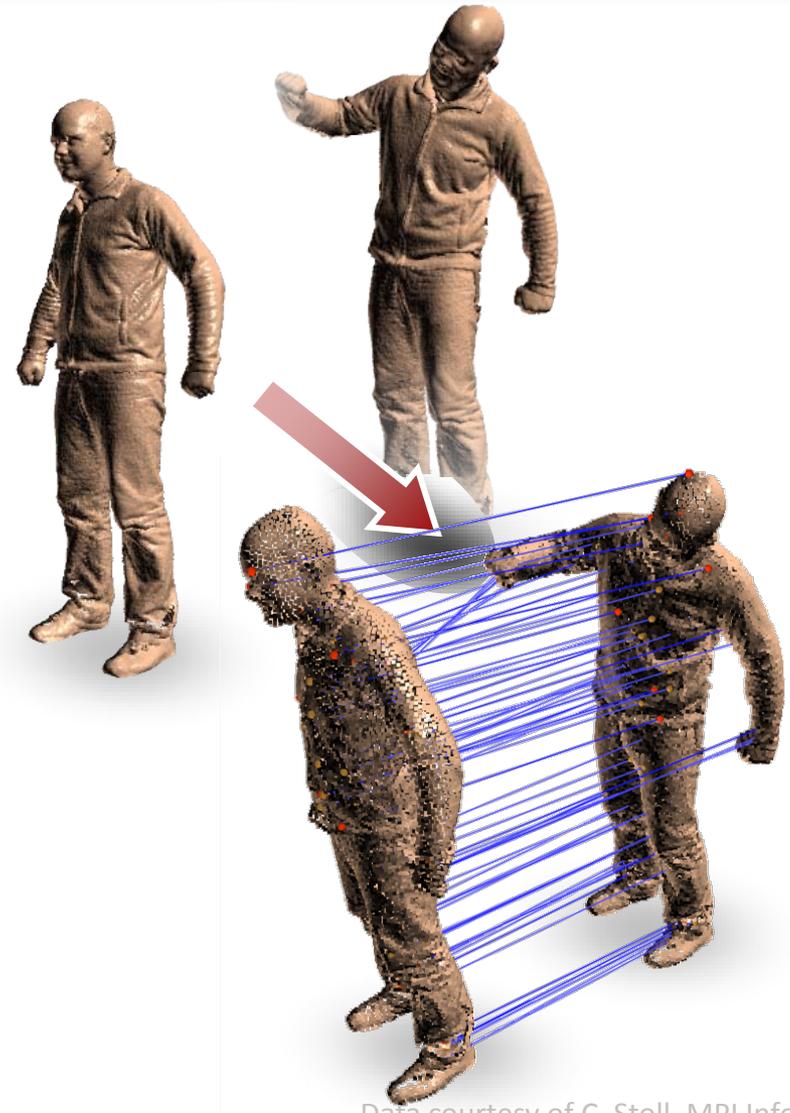
- Rigid registration is standard

## Why deformation?

- Scanner miscalibrations
  - Sometimes unavoidable, esp. for large acquisition volumes
- Scanned Object might be deformable
  - Elastic / plastic objects
- In particular: Scanning people, animals
  - Need multiple scans
  - Impossible to maintain constant pose

# Example: Full Body Scanner

## Full Body Scanning



Data courtesy of C. Stoll, MPI Informatik

# Applications

## Why is this an interesting problem?

### Building Block:

- Correspondences are a building block for higher level geometry processing algorithms

### Example Applications:

- Scanner data registration
- Animation reconstruction & 3D video
- Statistical shape analysis (shape spaces)

# 3D Animation Scanner

## New technology

- 3D animation scanners
- Record 3D video
- Active research area

## Ultimate goal

- 3D movie making
- New creative perspectives



Photo: P. Jenke, WSI/GRIS Tübingen

# Structured Light Scanners



**space-time  
stereo**

courtesy of James Davis,  
UC Santa Cruz



**color-coded  
structured light**

courtesy of Phil Fong,  
Stanford University



**motion compensated  
structured light**

courtesy of Sören König,  
TU Dresden

# Passive Multi-Camera Acquisition



**segmentation &  
belief propagation**

[Zitnick et al. 2004]  
Microsoft Research



**photo-consistent  
space carving**

Christian Theobald  
MPI-Informatik

# Time-of-Flight / PMD Devices



PMD Time-of-flight camera



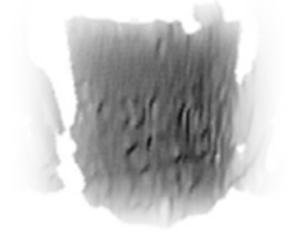
Minolta Laser Scanner (static)



# Animation Reconstruction

## Problems

- Noisy data
- Incomplete data (acquisition holes)
- No correspondences



**noise**



**holes**



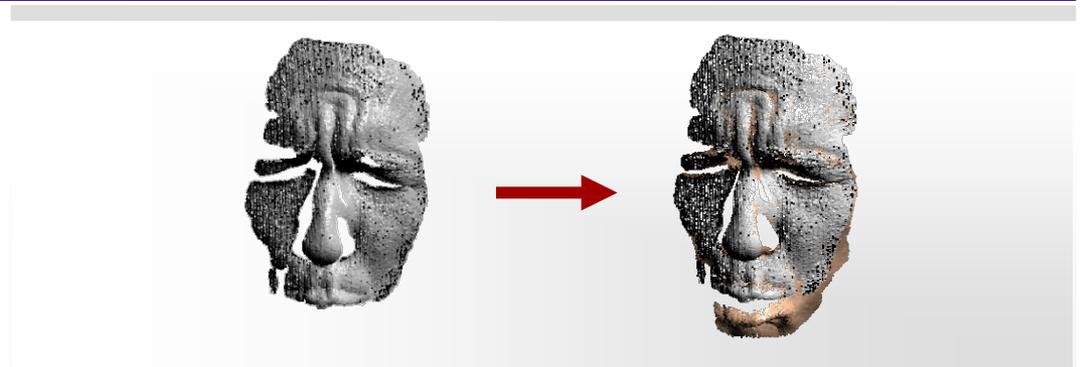
**missing correspondences**

# Animation Reconstruction

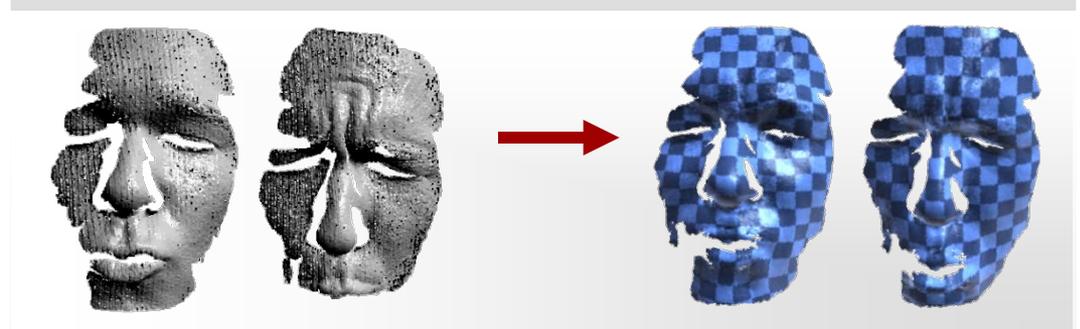
Remove noise, outliers



Fill-in holes  
(from all frames)



Dense correspondences



# Applications

## Why is this an interesting problem?

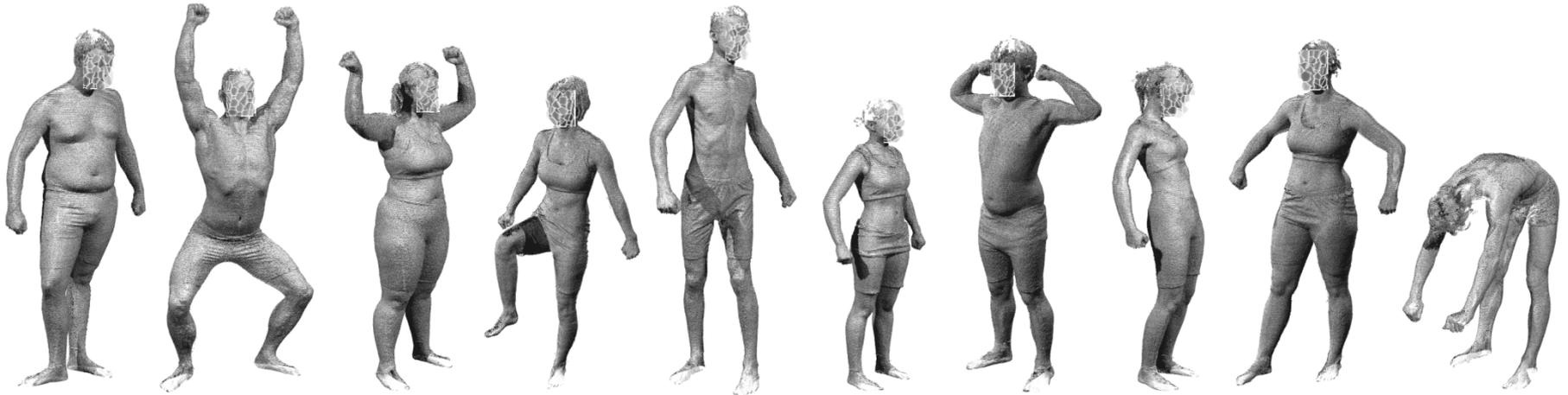
### Building Block:

- Correspondences are a building block for higher level geometry processing algorithms

### Example Applications:

- Scanner data registration
- Animation reconstruction & 3D video
- Statistical shape analysis (shape spaces)

# Statistical Shape Spaces



Courtesy of N. Hassler, MPI Informatik

## Morphable Shape Models

- Scan a large number of individuals
  - Different pose
  - Different people
- Compute correspondences
- Build shape statistics (PCA, non-linear embedding)

# Statistical Shape Spaces

## Numerous Applications:

- Fitting to ambiguous data (prior knowledge)
- Constraint-based editing
- Recognition, classification, regression



Courtesy of N. Hassler, MPI Informatik



Courtesy of N. Hassler, MPI Informatik

**Building such models  
requires correspondences**

# **Data Characteristics**

# Scanner Data – Challenges

## “Real world data” is more challenging

- 3D Scanners have artifacts

## Rules of thumb:

- The faster the worse (real time vs. static scans)
- Active techniques are more accurate  
(passive stereo is more difficult than laser triangulation)
- There is more than just “Gaussian noise” ...

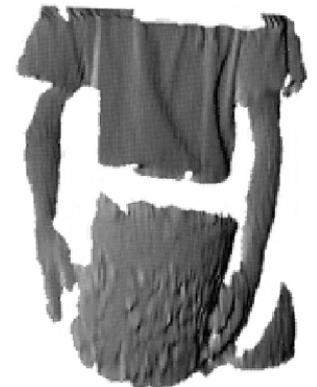
# Challenges

## “Noise”

- “Standard” noise types:
  - Gaussian noise (analog signal processing)
  - Quantization noise
- More problematic: Structured noise
  - Structured noise (spatio-temporally correlated)
  - Structured outliers
  - Reflective / transparent surfaces
- Incomplete Acquisition
  - Missing parts
  - Topological noise



Courtesy of J. Davis, UCSC

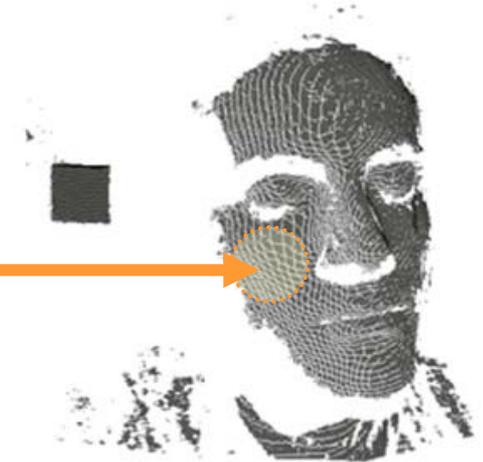


Courtesy of P. Phong, Stanford University

# Challenges

## “Noise”

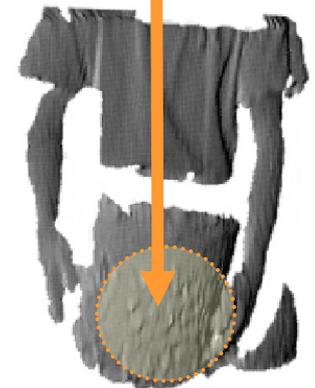
- “Standard” noise types:
  - Gaussian noise (analog signal processing)
  - Quantization noise
- More problematic: Structured noise
  - Structured noise (spatio-temporally correlated)
  - Structured outliers
  - Reflective / transparent surfaces
- Incomplete Acquisition
  - Missing parts
  - Topological noise



# Challenges

## “Noise”

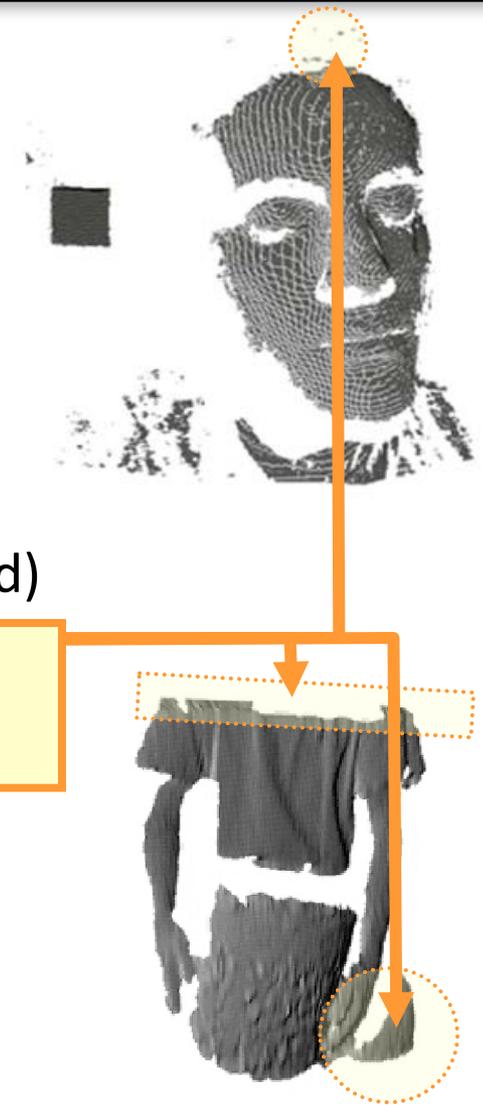
- “Standard” noise types:
  - Gaussian noise (analog signal processing)
  - Quantization noise
- More problematic
  - Structured noise (spatio-temporally correlated)
  - Structured outliers
  - Reflective / transparent surfaces
- Incomplete Acquisition
  - Missing parts
  - Topological noise



# Challenges

## “Noise”

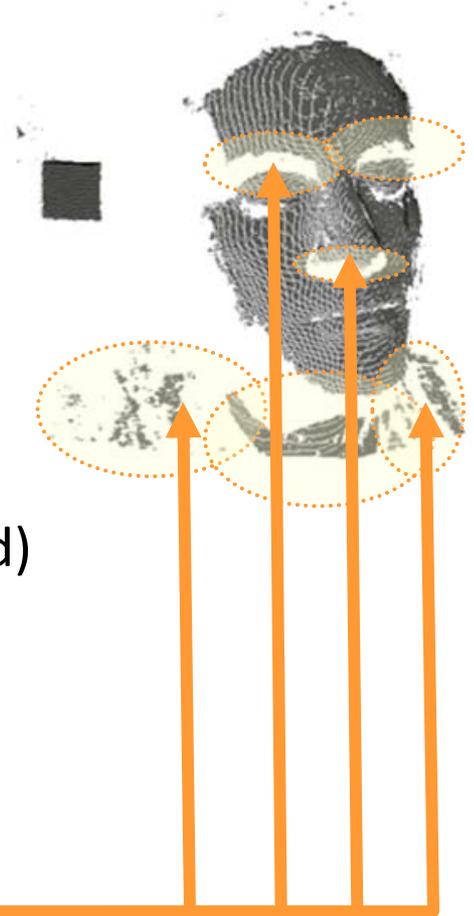
- “Standard” noise types:
  - Gaussian noise (analog signal processing)
  - Quantization noise
- More problematic
  - Structured noise (spatio-temporally correlated)
  - Structured outliers
  - Reflective / transparent surfaces
- Incomplete Acquisition
  - Missing parts
  - Topological noise



# Challenges

## “Noise”

- “Standard” noise types:
  - Gaussian noise (analog signal processing)
  - Quantization noise
- More problematic
  - Structured noise (spatio-temporally correlated)
  - Structured outliers
  - Reflective / transparent surfaces
- Incomplete Acquisition
  - Missing parts
  - Topological noise



# Outlook

# This Tutorial

## Different aspects of the problem:

- Shape deformation and matching
  - How to *quantify deformation*?
  - How to *define deformable shape matching*?
- Local matching
  - Known initialization
- Global matching
  - No initialization
- Animation Reconstruction
  - Matching temporal sequences of scans

# **Problem Statement:**

## Pairwise Deformable Matching

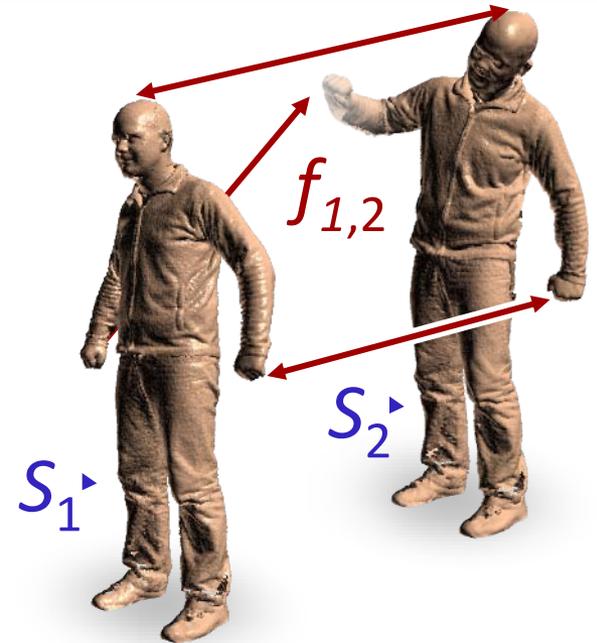
# Problem Statement

## Given:

- Two surfaces  $S_1, S_2 \subseteq \mathbb{R}^3$
- Discretization:
  - Point clouds  $S = \{s_1, \dots, s_n\}, s_i \in \mathbb{R}^3$  or
  - Triangle meshes

## We are looking for:

- A deformation function  $f_{1,2}: S_1 \rightarrow \mathbb{R}^3$  that brings  $S_1$  close to  $S_2$



# Problem Statement

## We are looking for:

- A deformation function  $f_{1,2}: S_1 \rightarrow \mathbb{R}^3$  that brings  $S_1$  close to  $S_2$

## Open Questions:

- What does “close” mean?
- What properties should  $f$  have?

## Next part:

- We will now look at these questions more in detail

