



**Eurographics 2012**

Cagliari, Italy

May 13-18



33<sup>rd</sup> ANNUAL CONFERENCE OF THE EUROPEAN ASSOCIATION FOR COMPUTER GRAPHICS

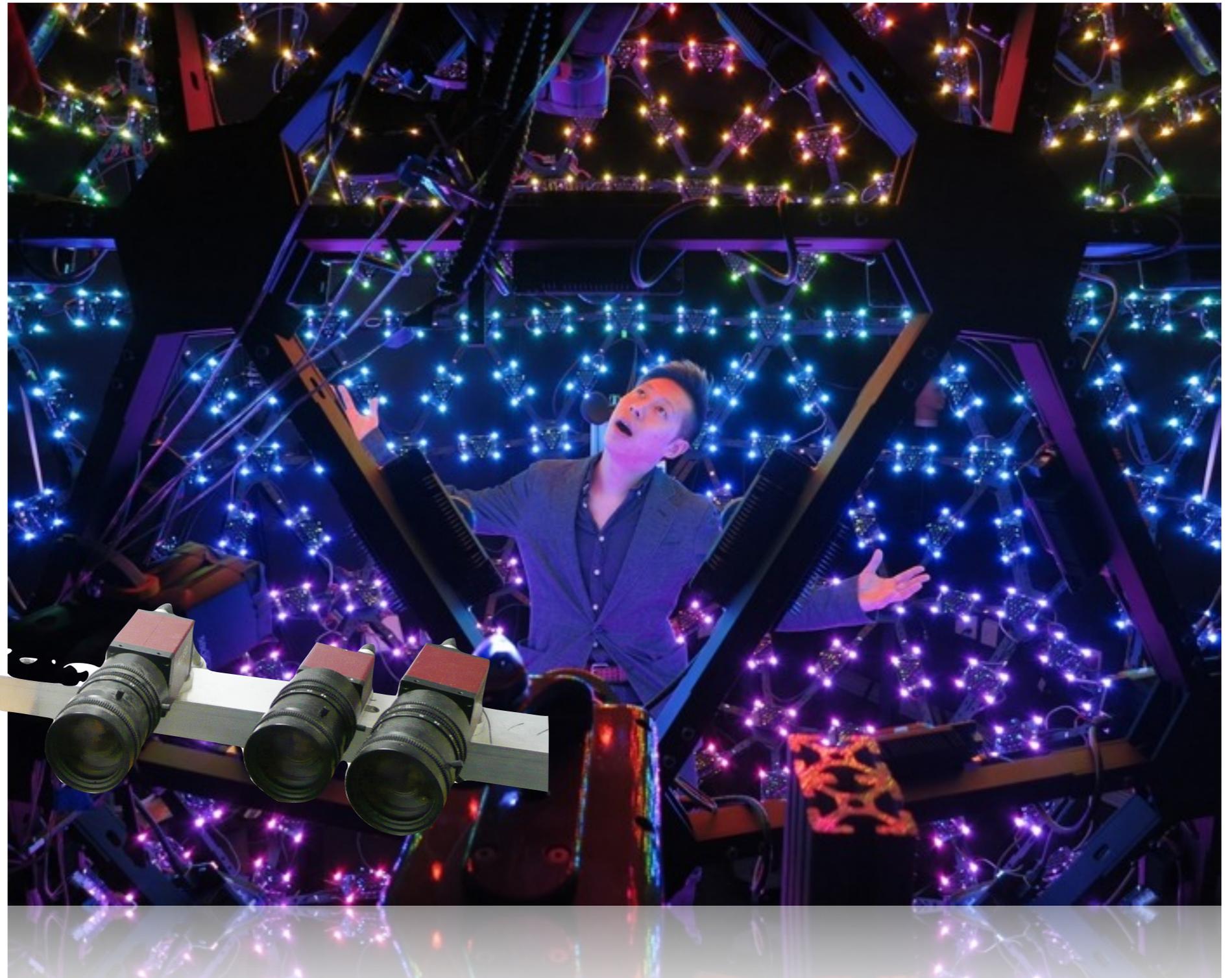
# Real-time Facial Animation

Hao Li  
ILM

Mark Pauly  
EPFL

# High-End 3D Scanning

# High-End 3D Scanning



# Low-Cost Passive Scanning (AGI soft)

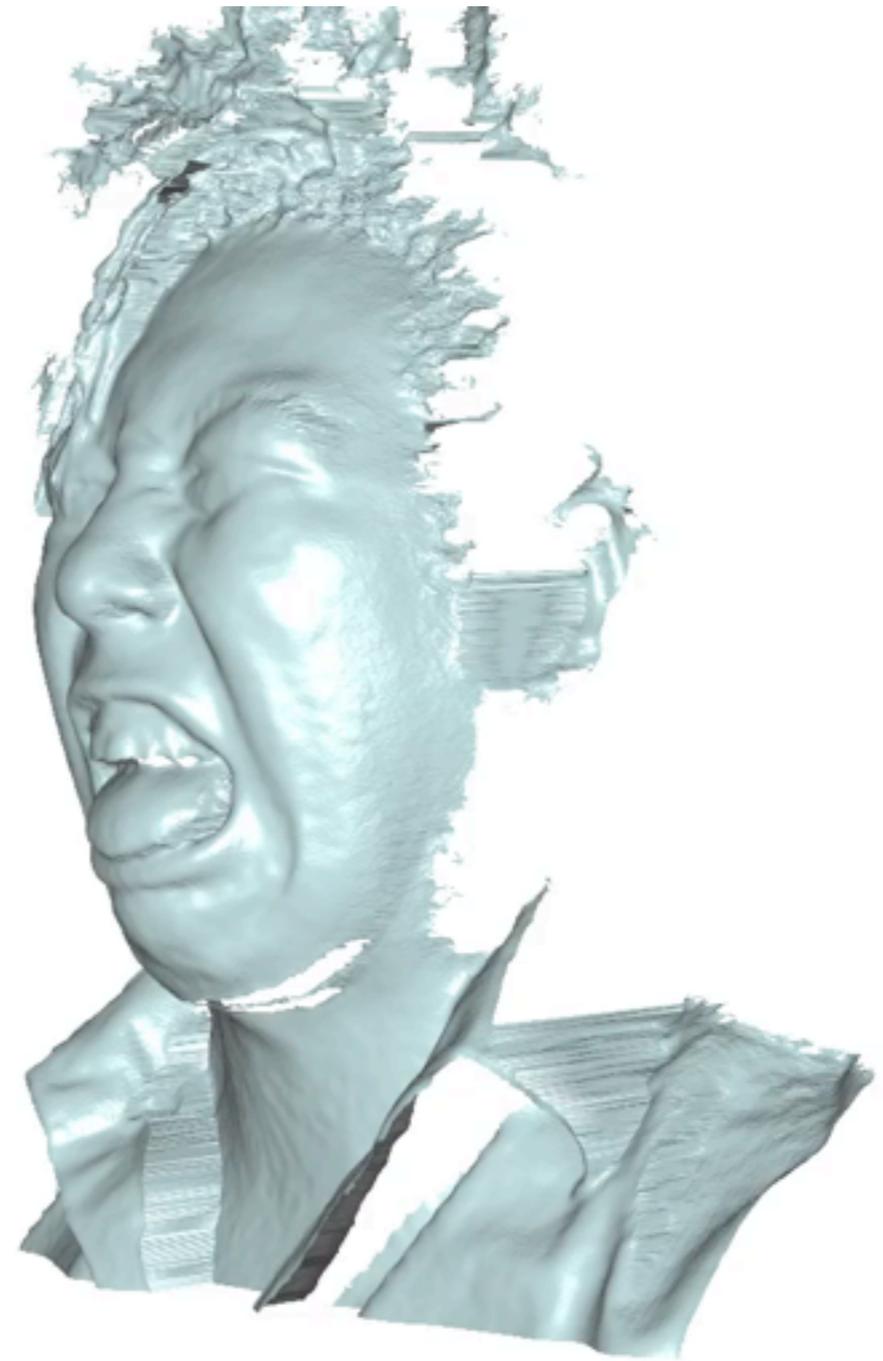


stereo pair

# Low-Cost Passive Scanning (AGI soft)



stereo pair



3D scan

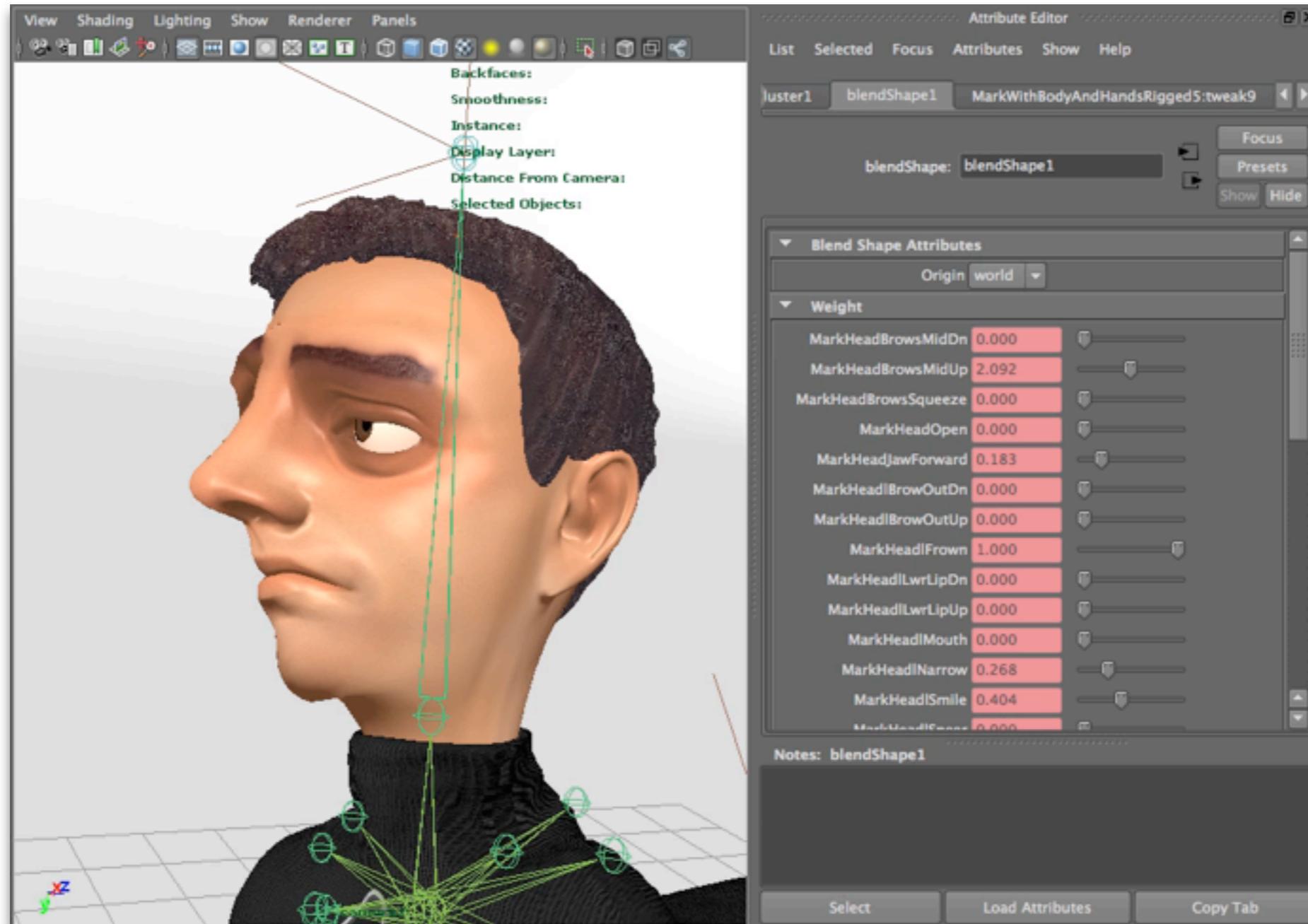
# Low-Cost Active Scanning + Temporal Upsampling



Microsoft Kinect & Kinect Fusion

# Rigging & Animation

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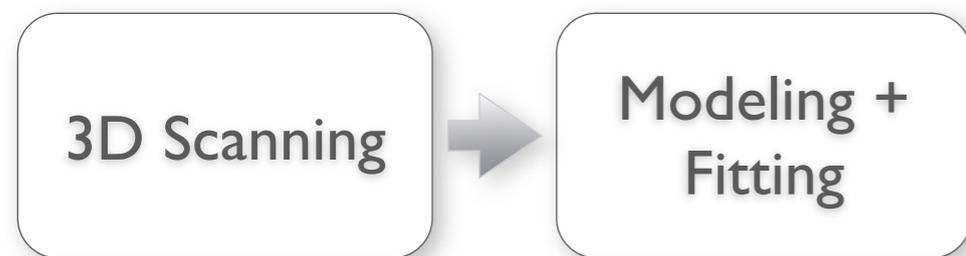


# Typical Facial Animation Workflow in Industry

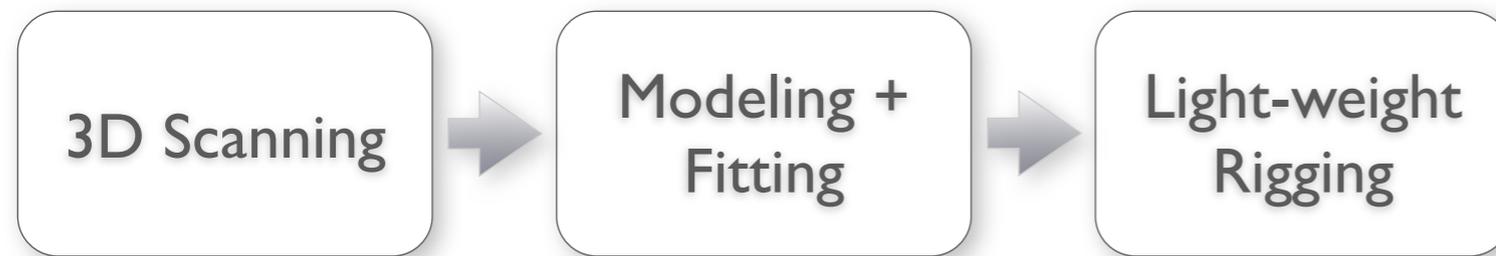
# Typical Facial Animation Workflow in Industry

3D Scanning

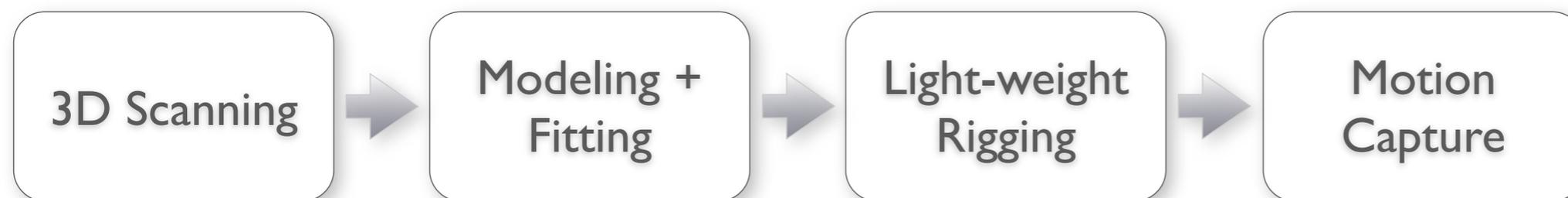
# Typical Facial Animation Workflow in Industry



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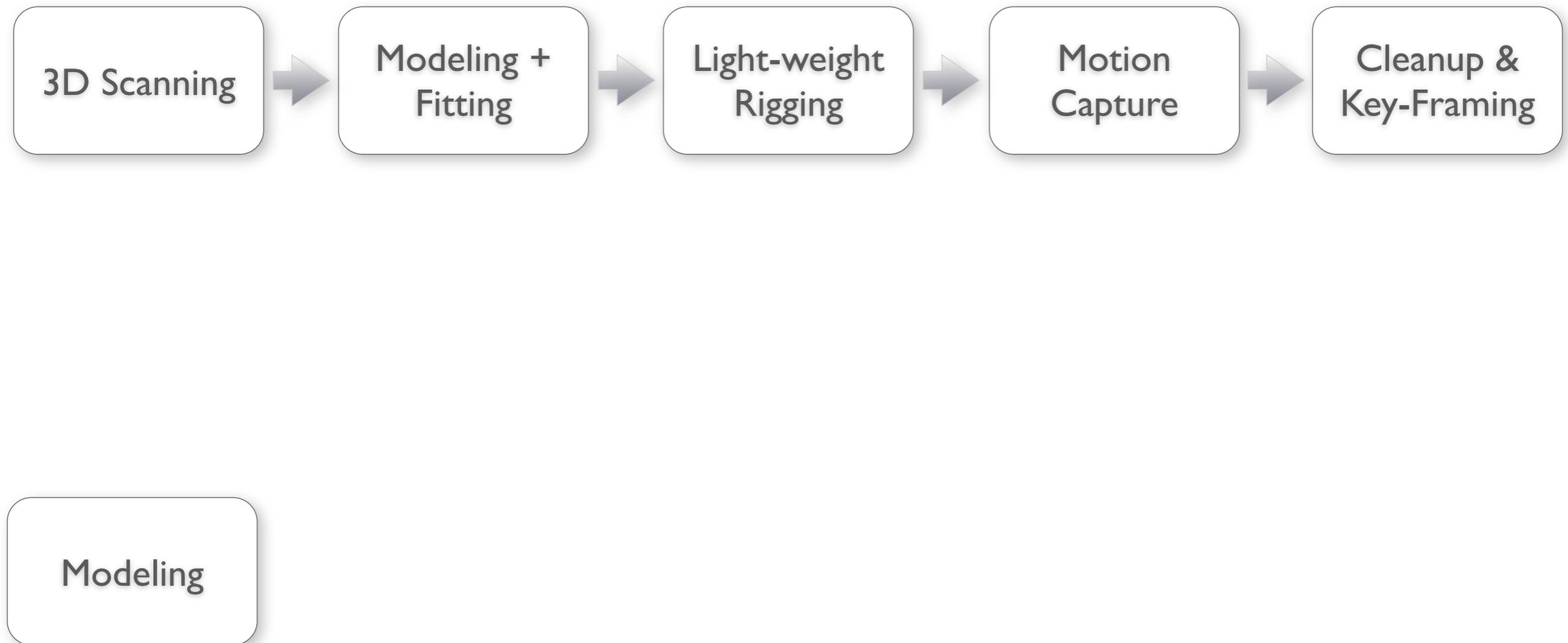
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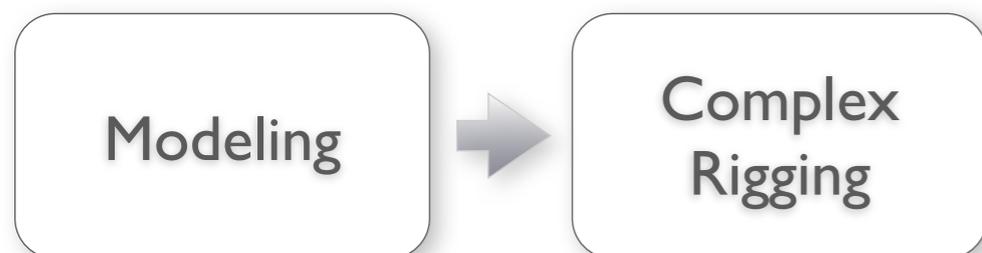
# Typical Facial Animation Workflow in Industry



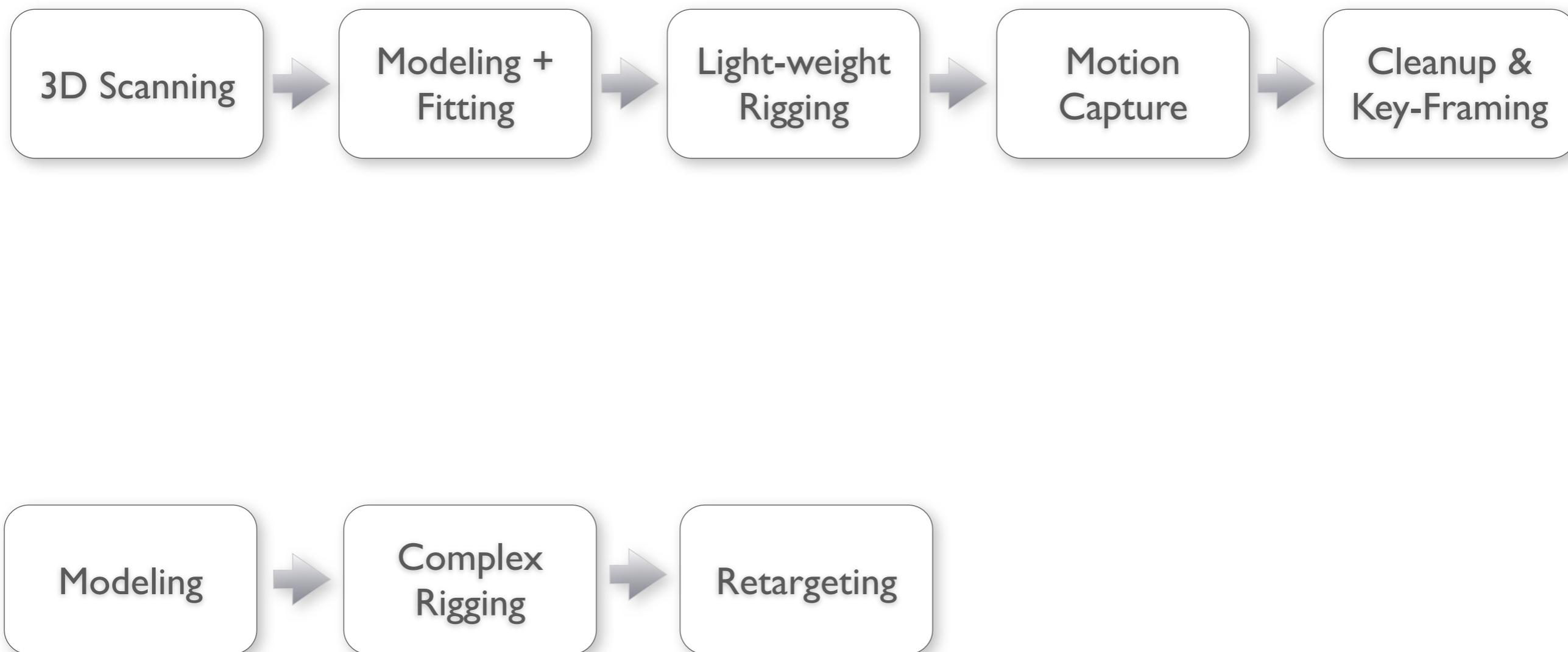
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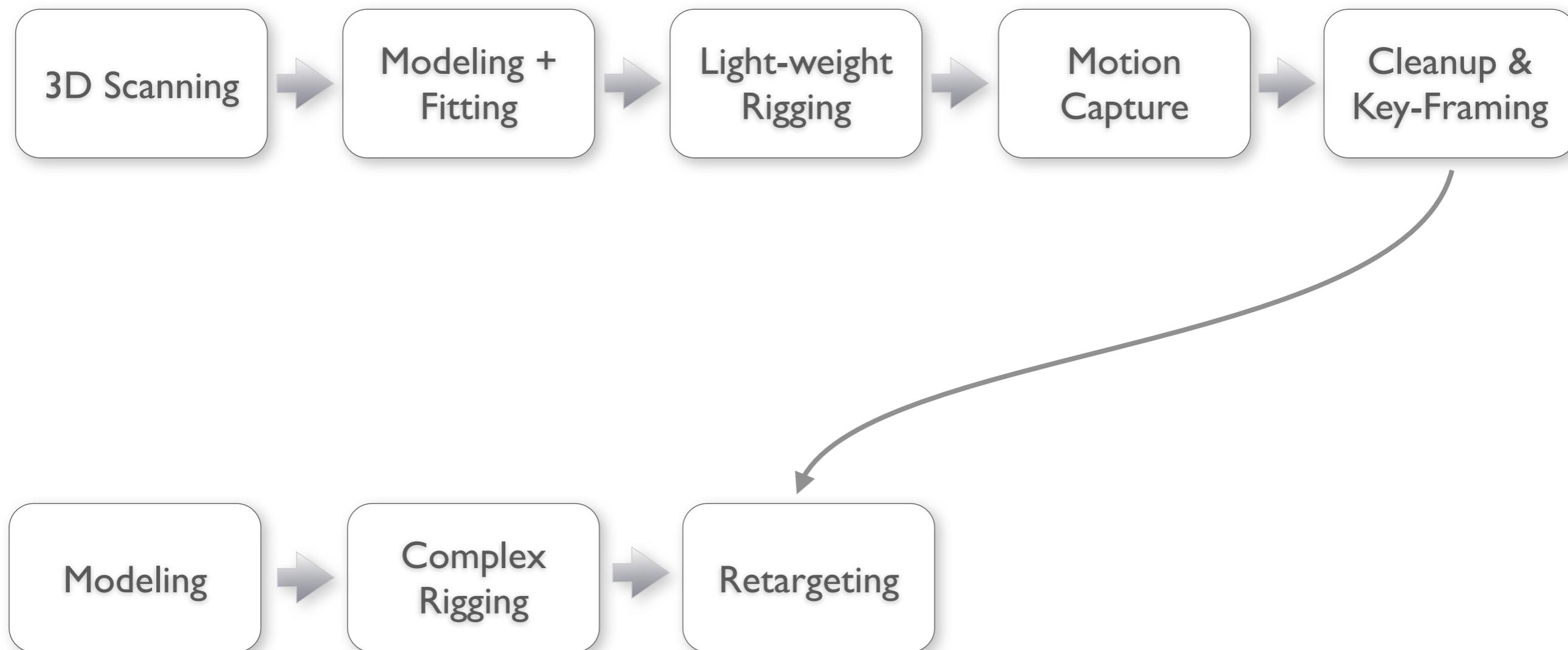
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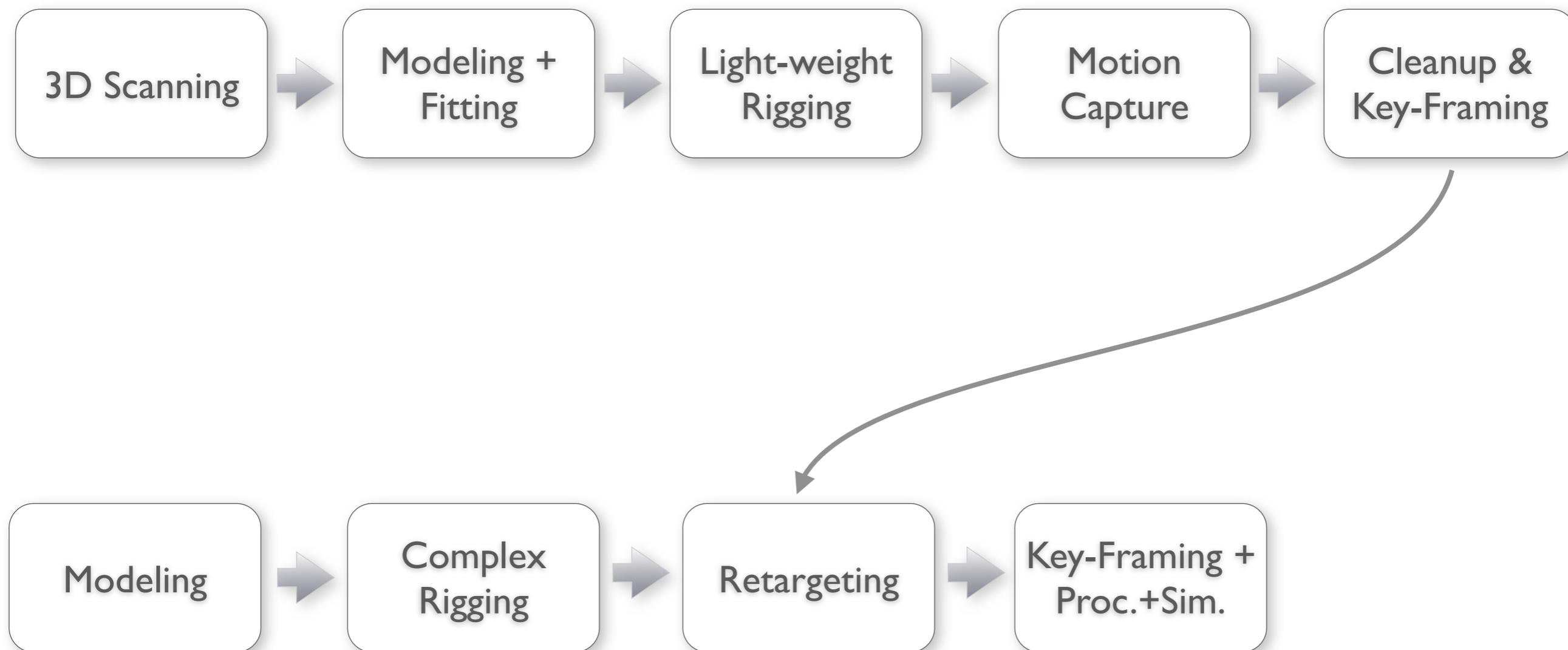
# Typical Facial Animation Workflow in Industry



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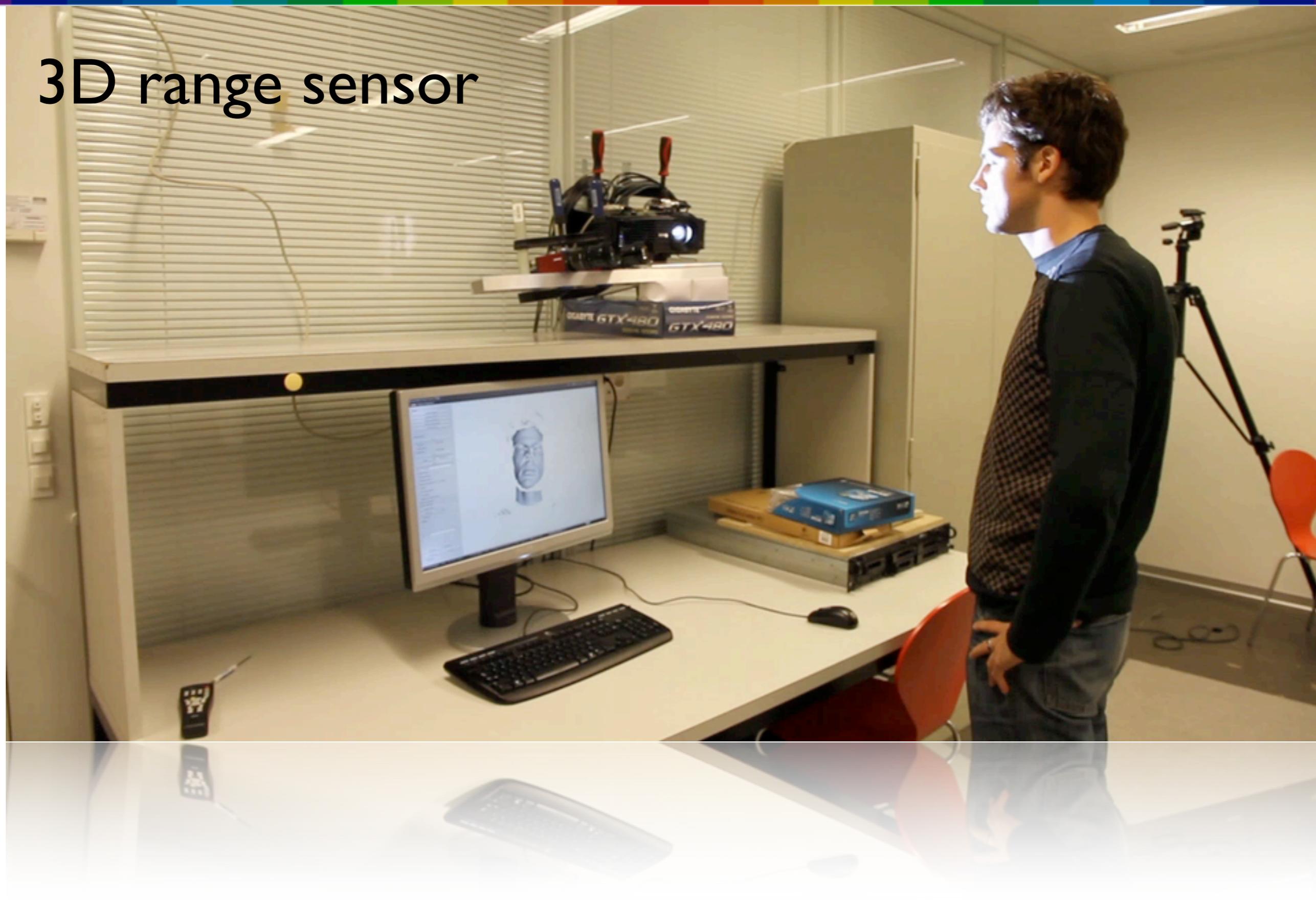
# Typical Facial Animation Workflow in Industry



# Markerless Facial Capture

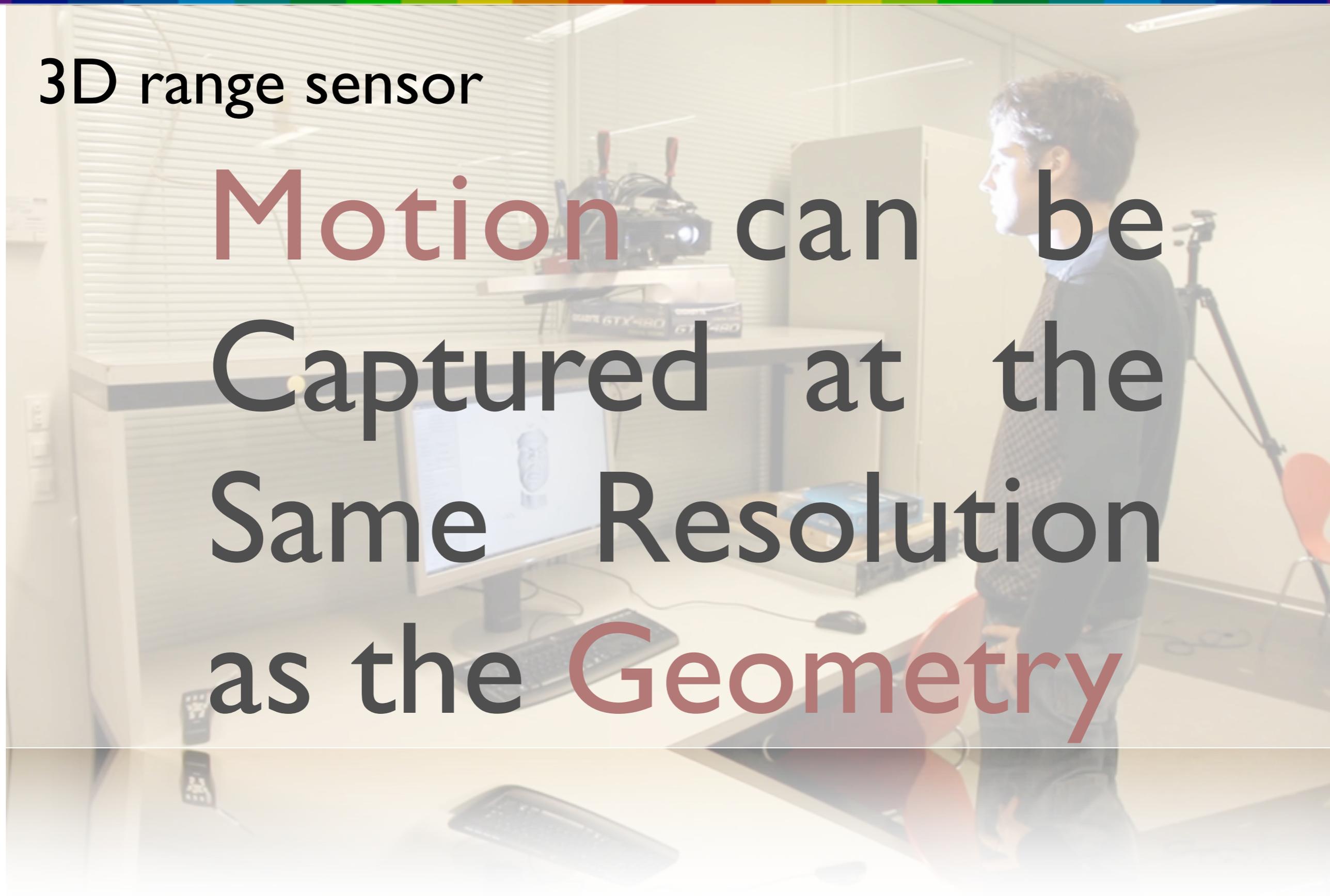
# 3D range sensor

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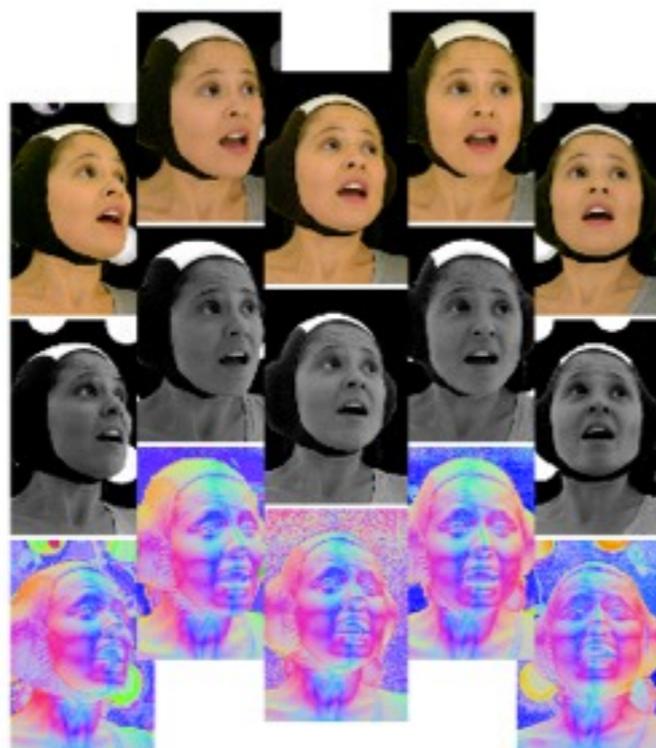


3D range sensor

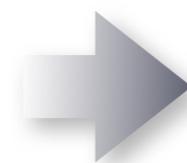
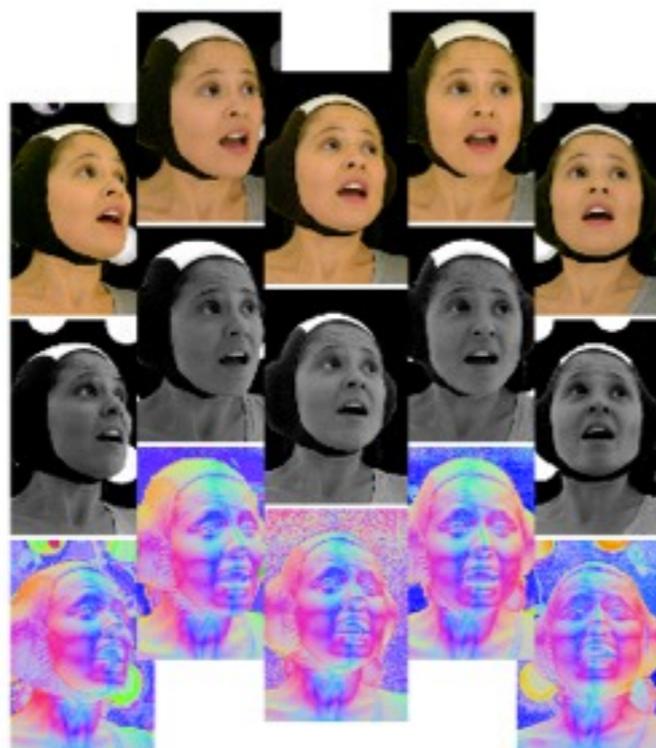
Motion can be  
Captured at the  
Same Resolution  
as the Geometry



# USC ICT Light Stage 5



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# Goal



# Goal

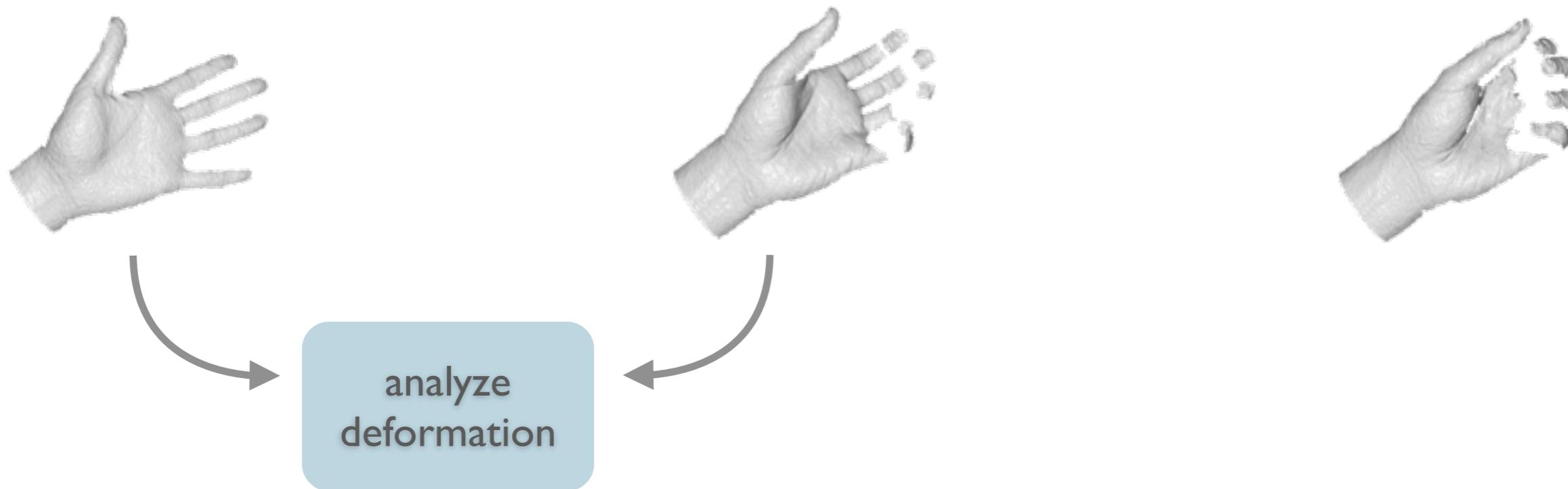


# Template-Based Tracking

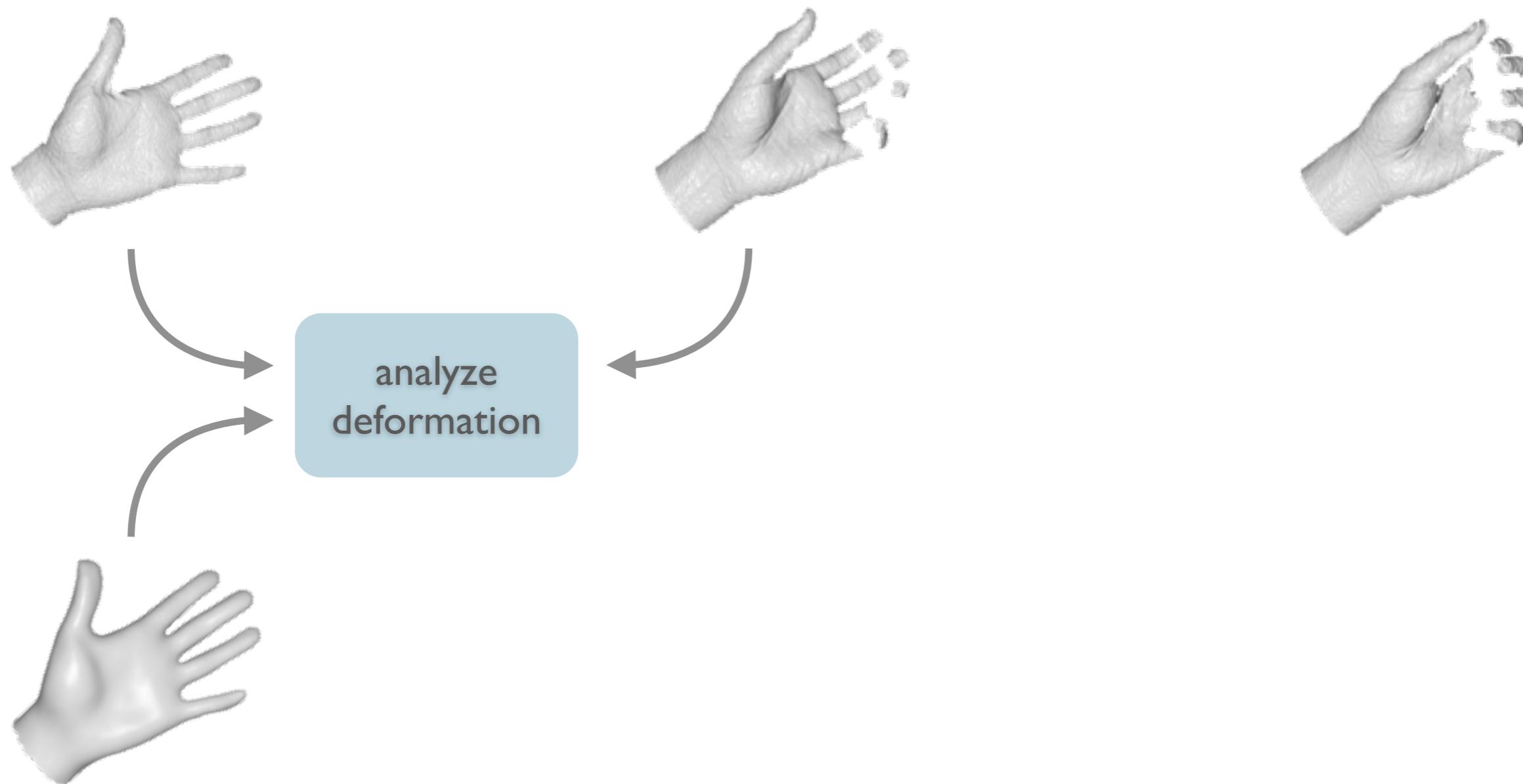
# Template-Based Tracking



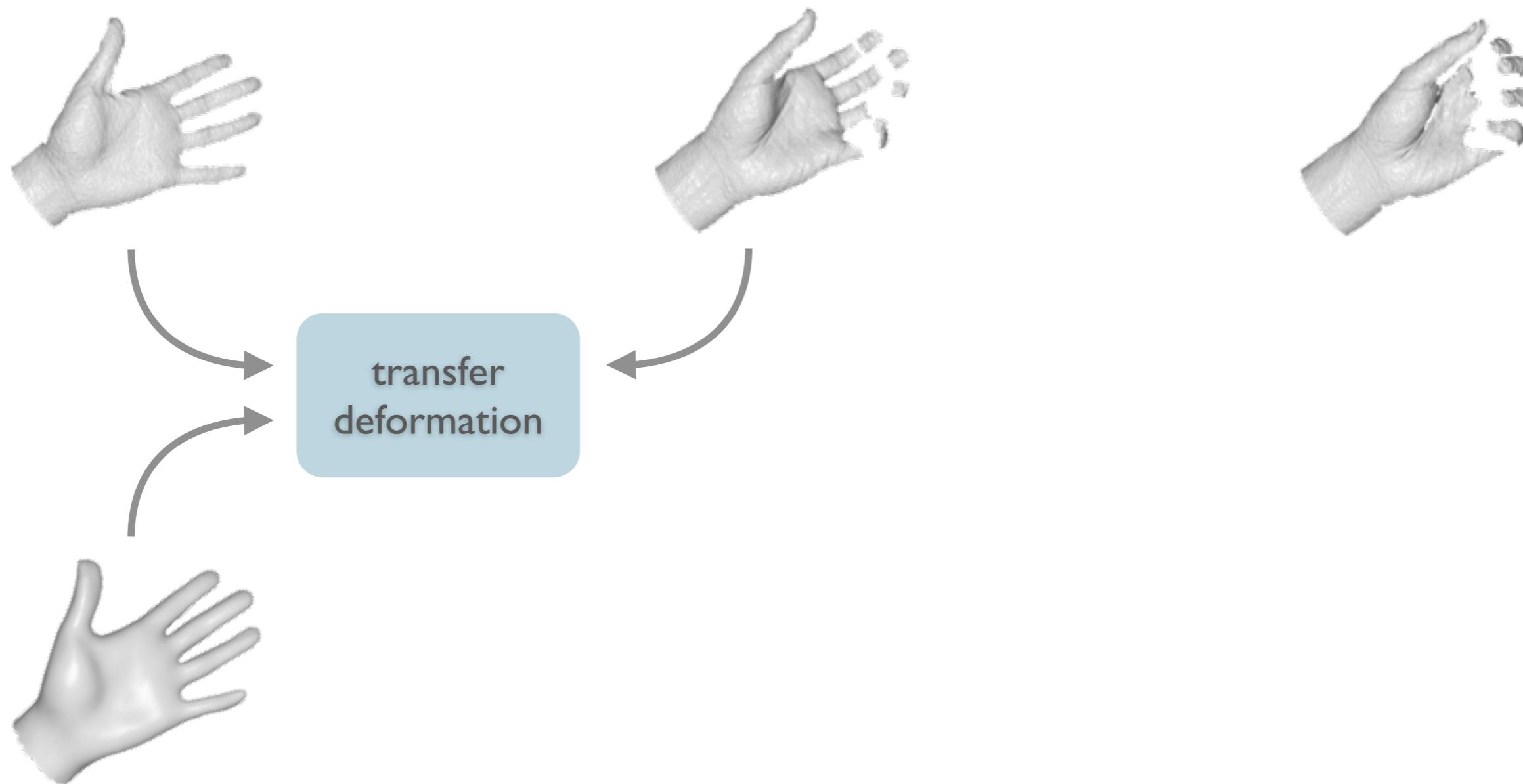
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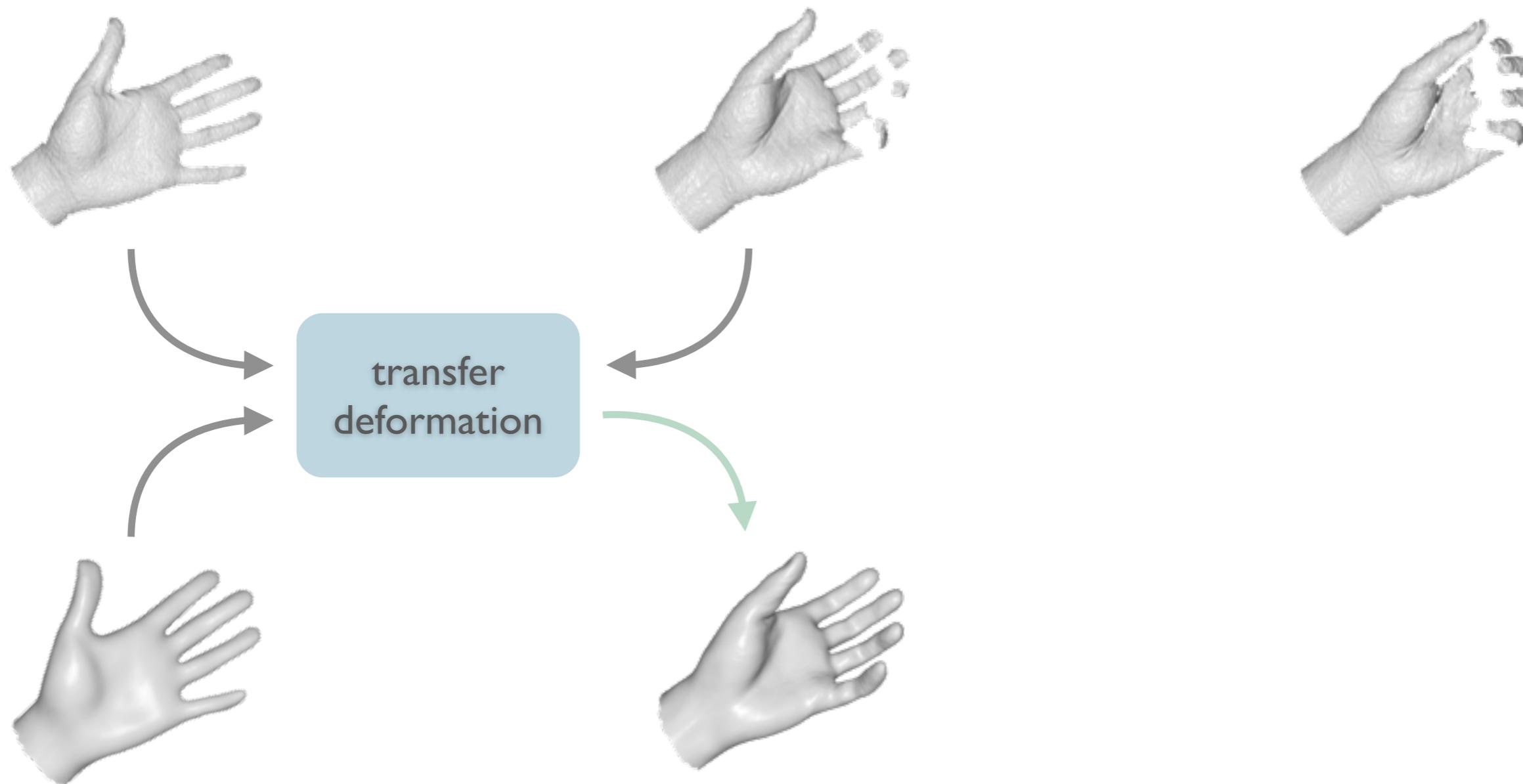
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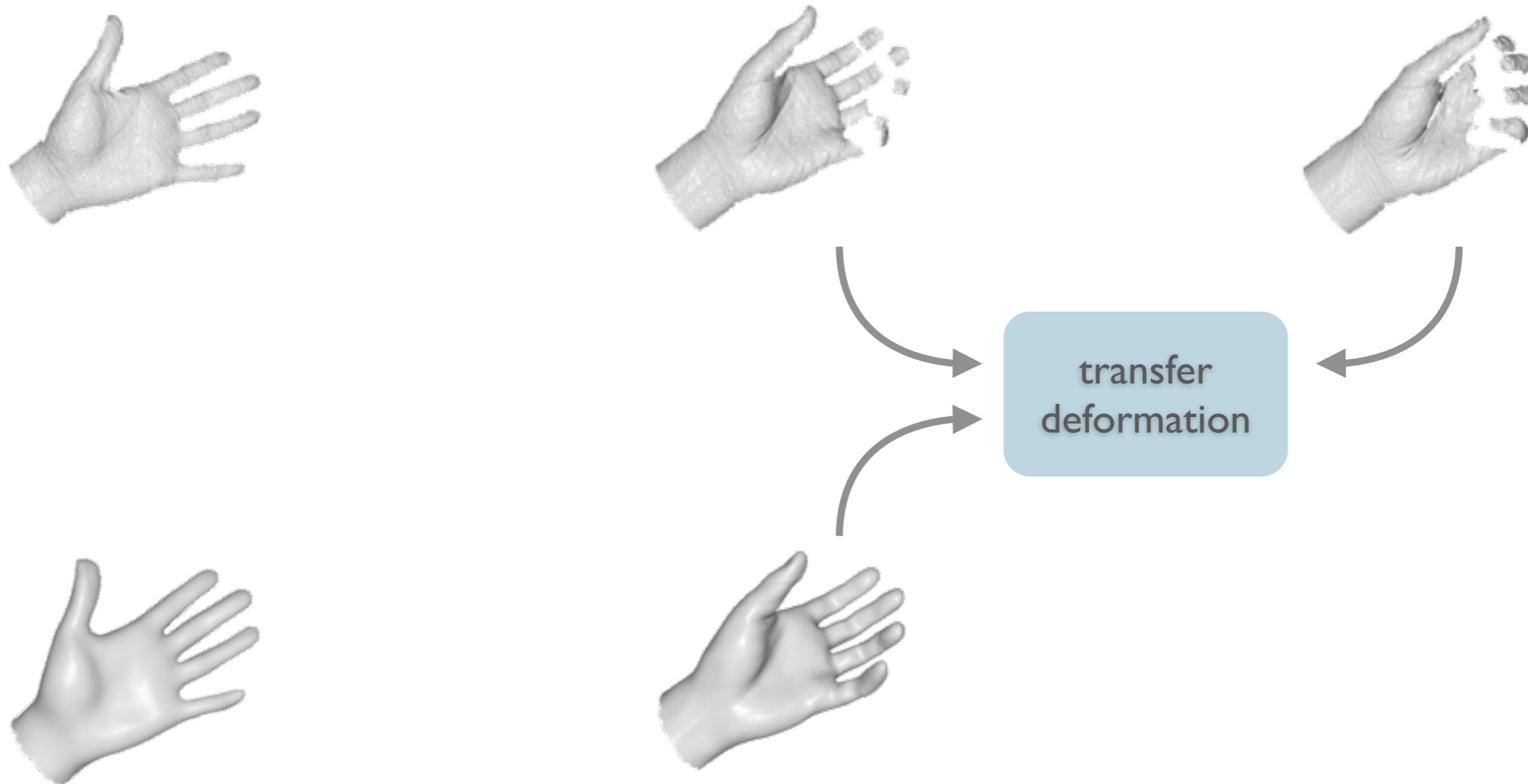
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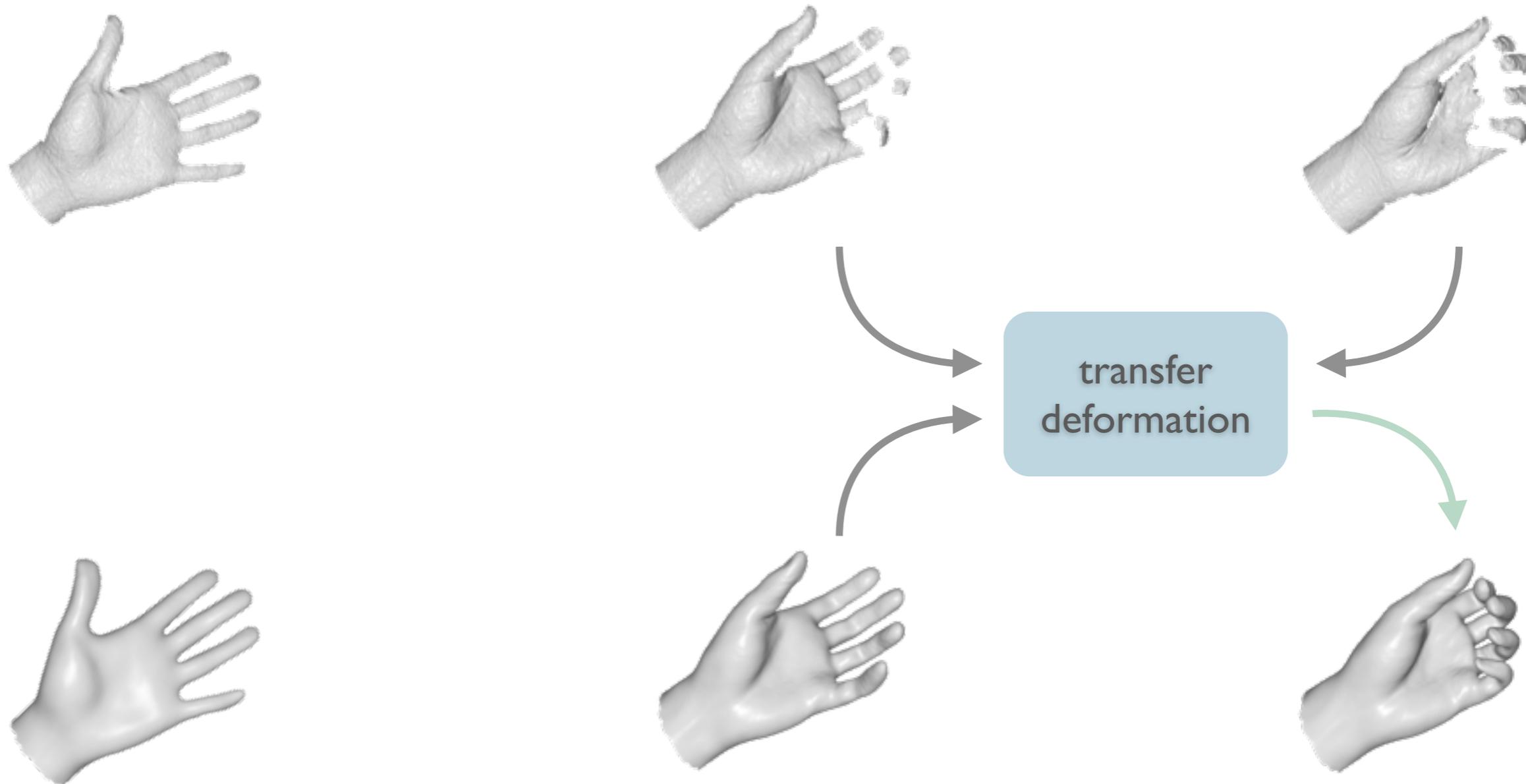
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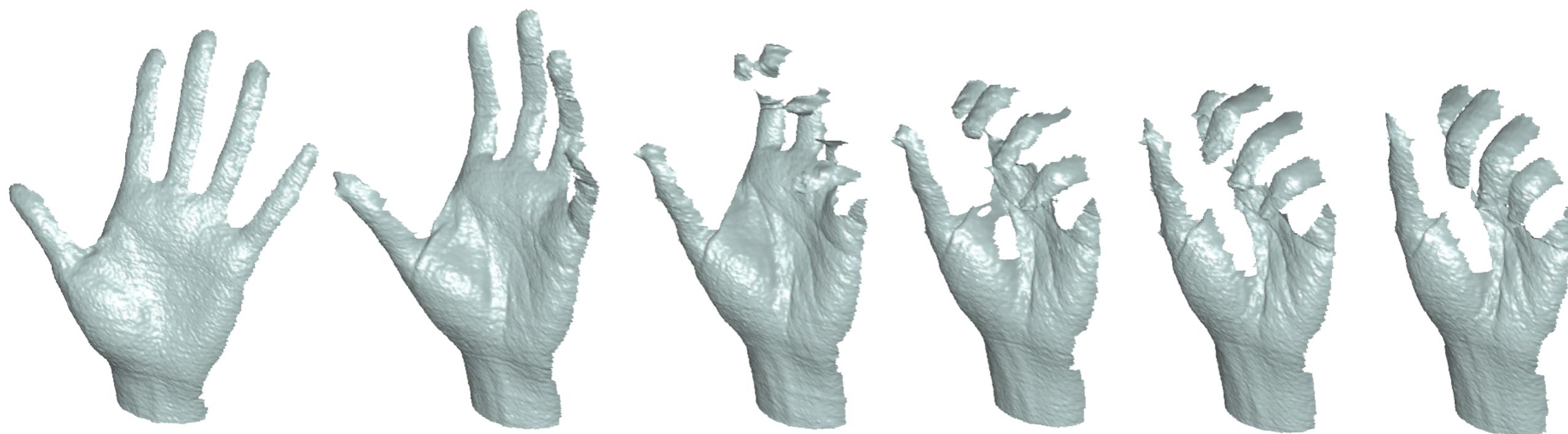


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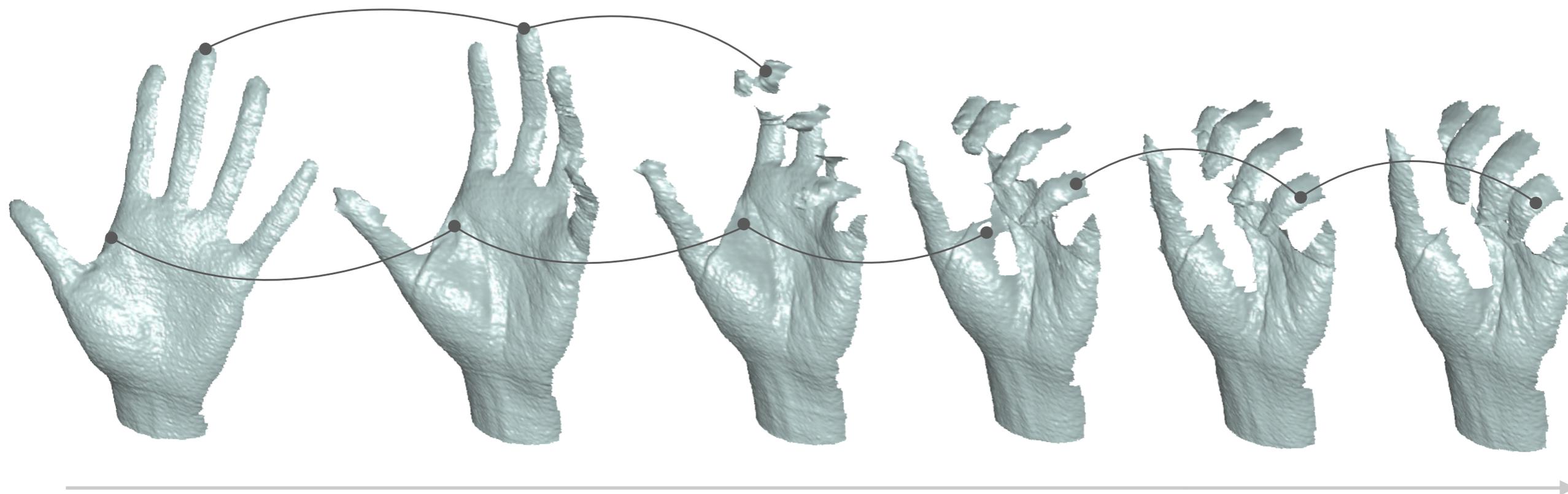


# Correspondences Problem

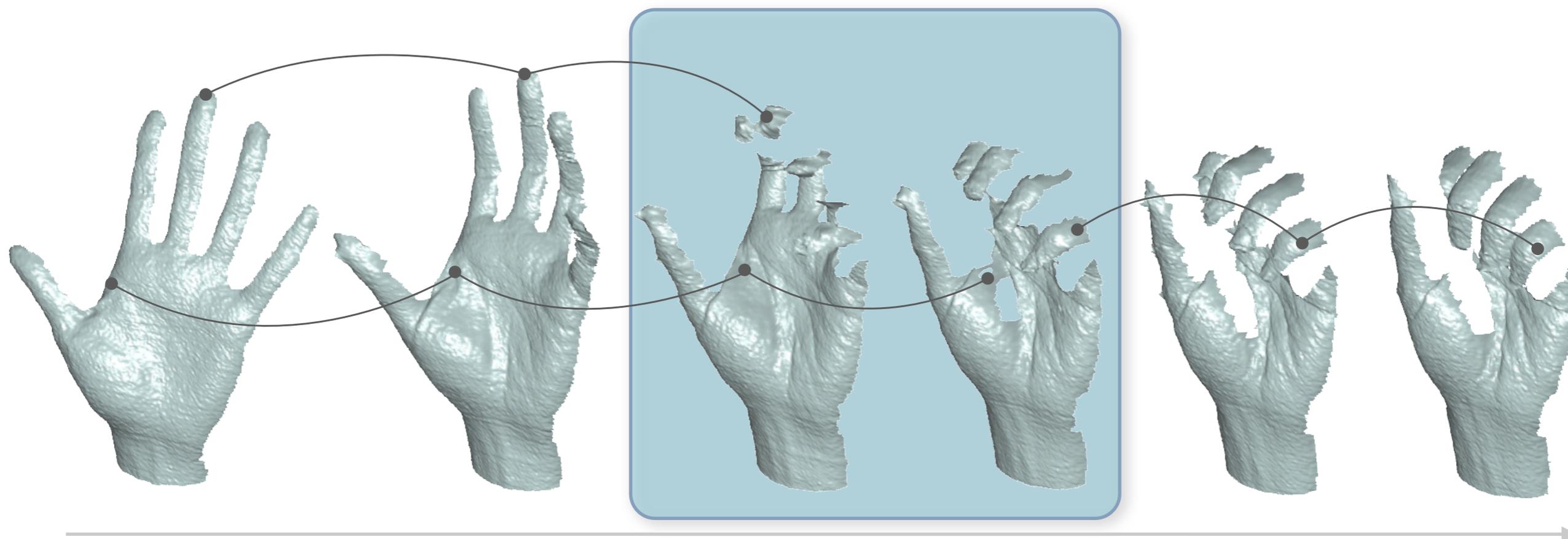
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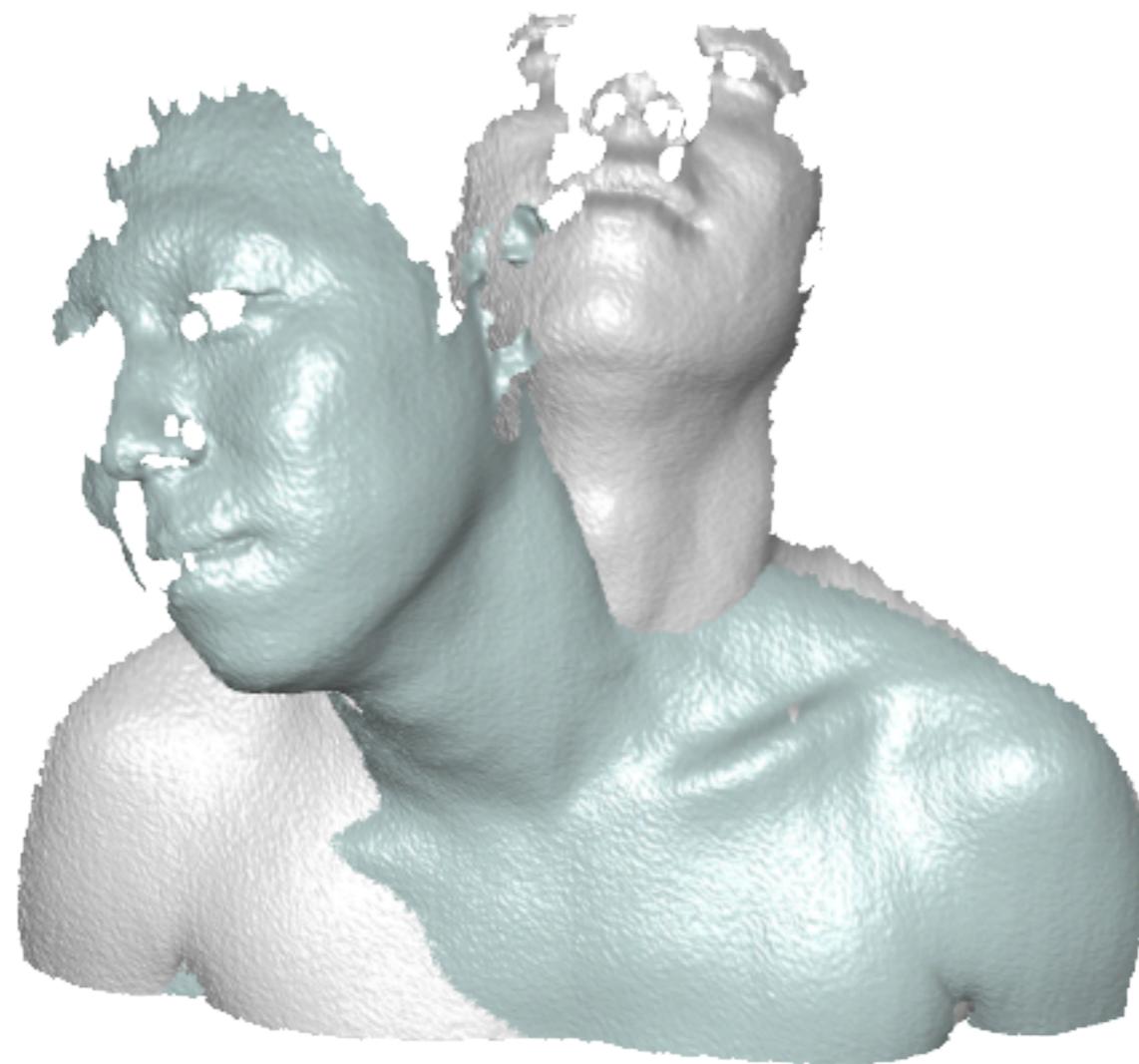


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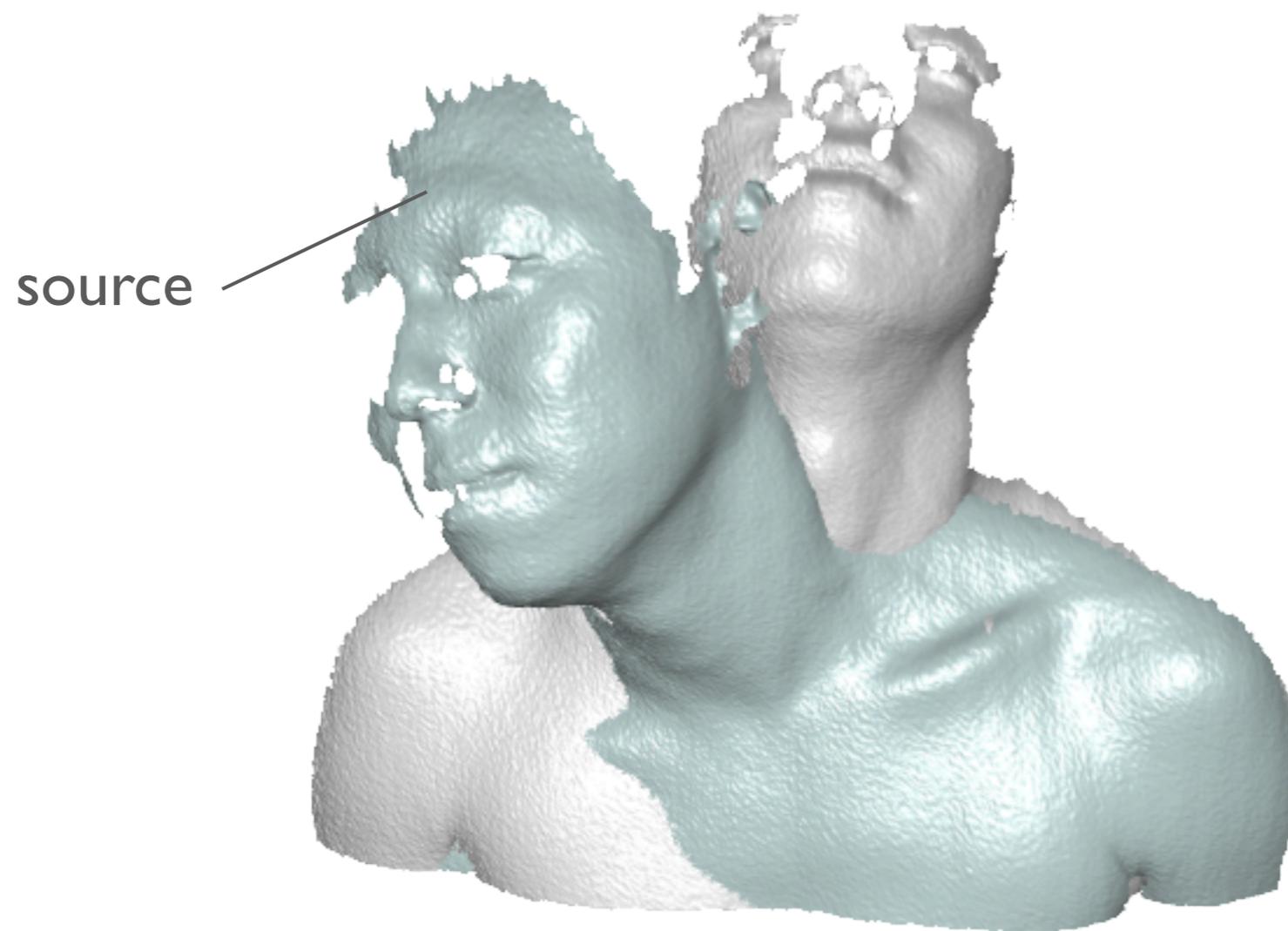


# Non-Rigid Registration

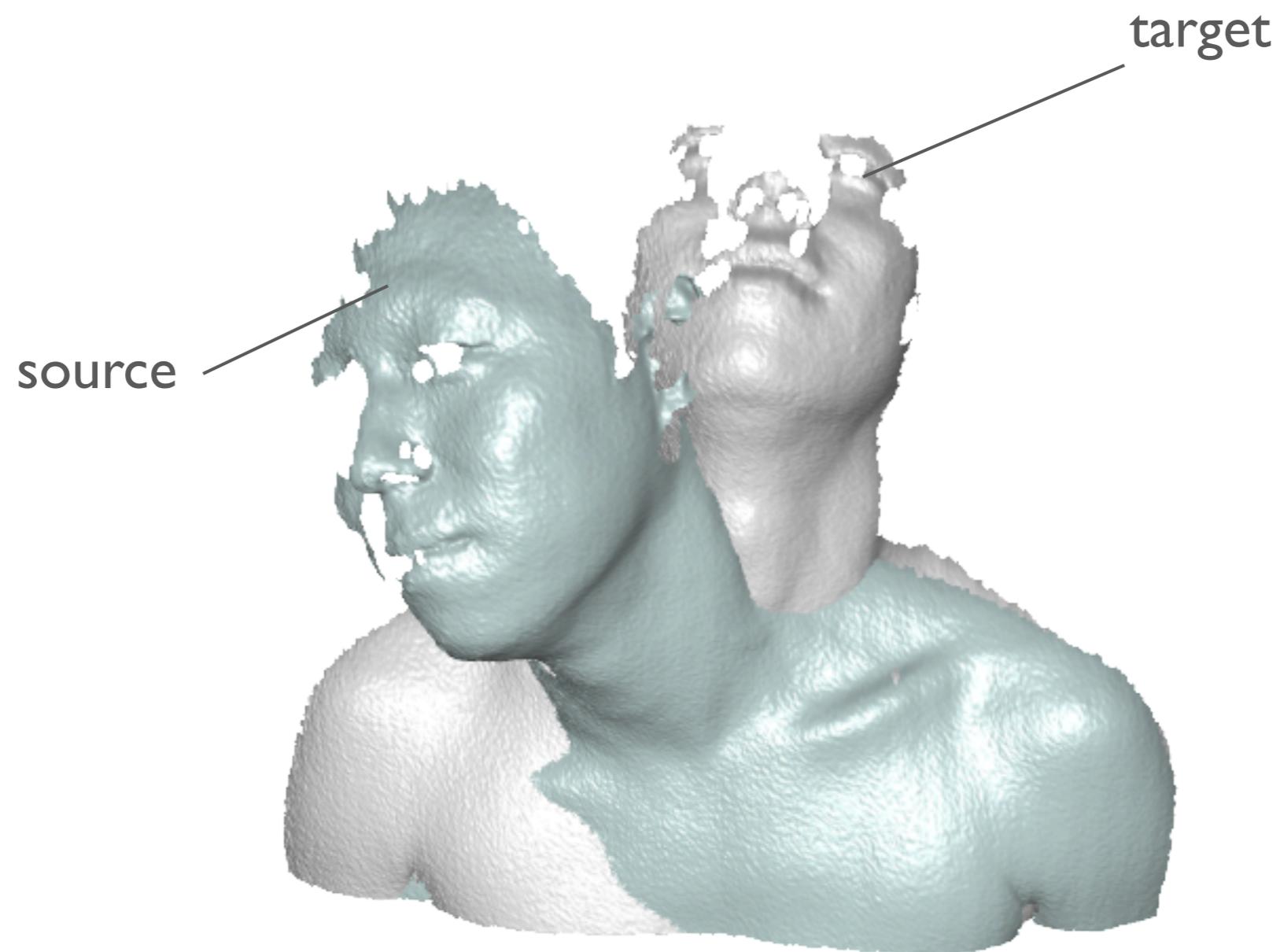
# Pair of 3D Scans



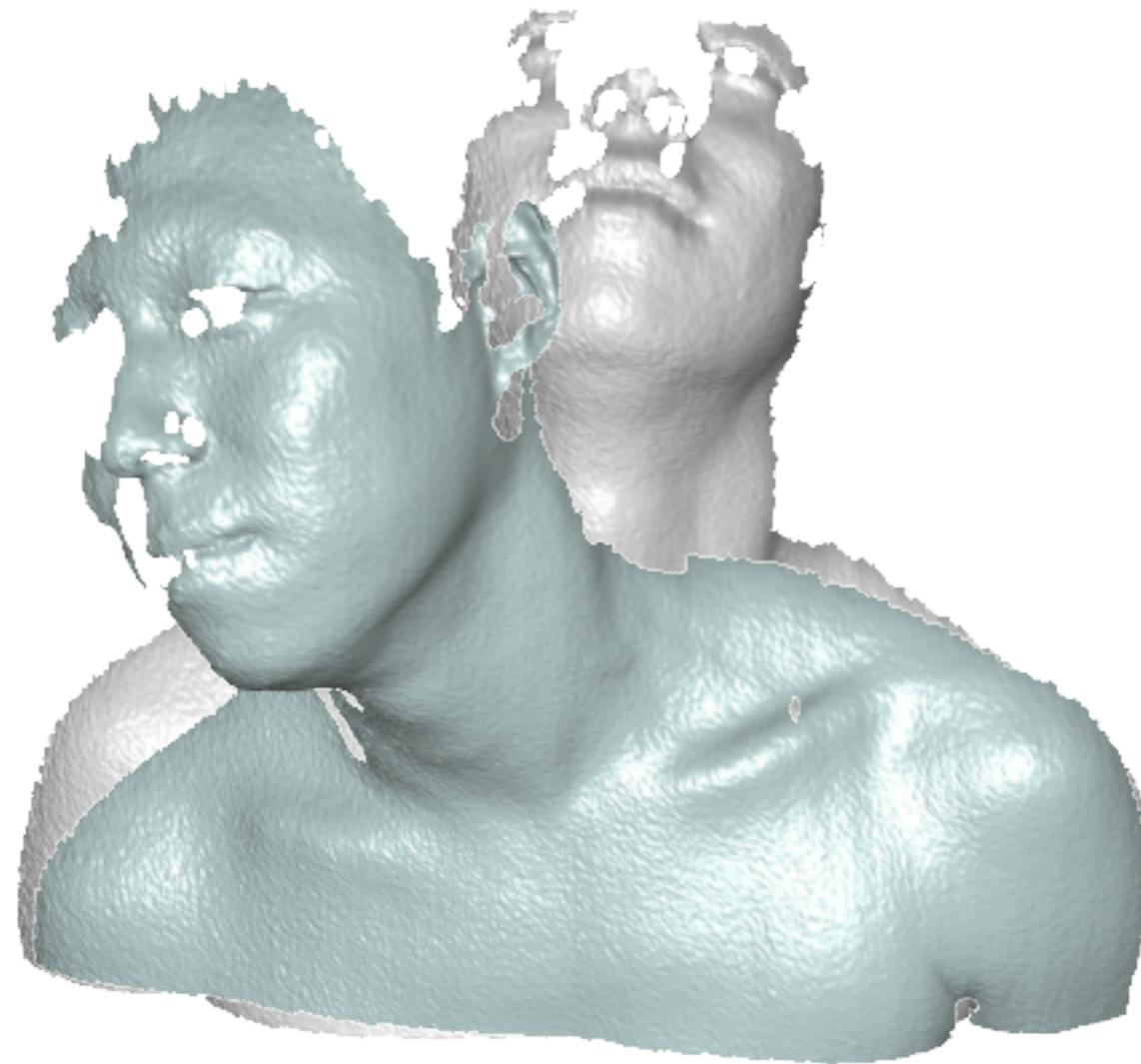
# Pair of 3D Scans



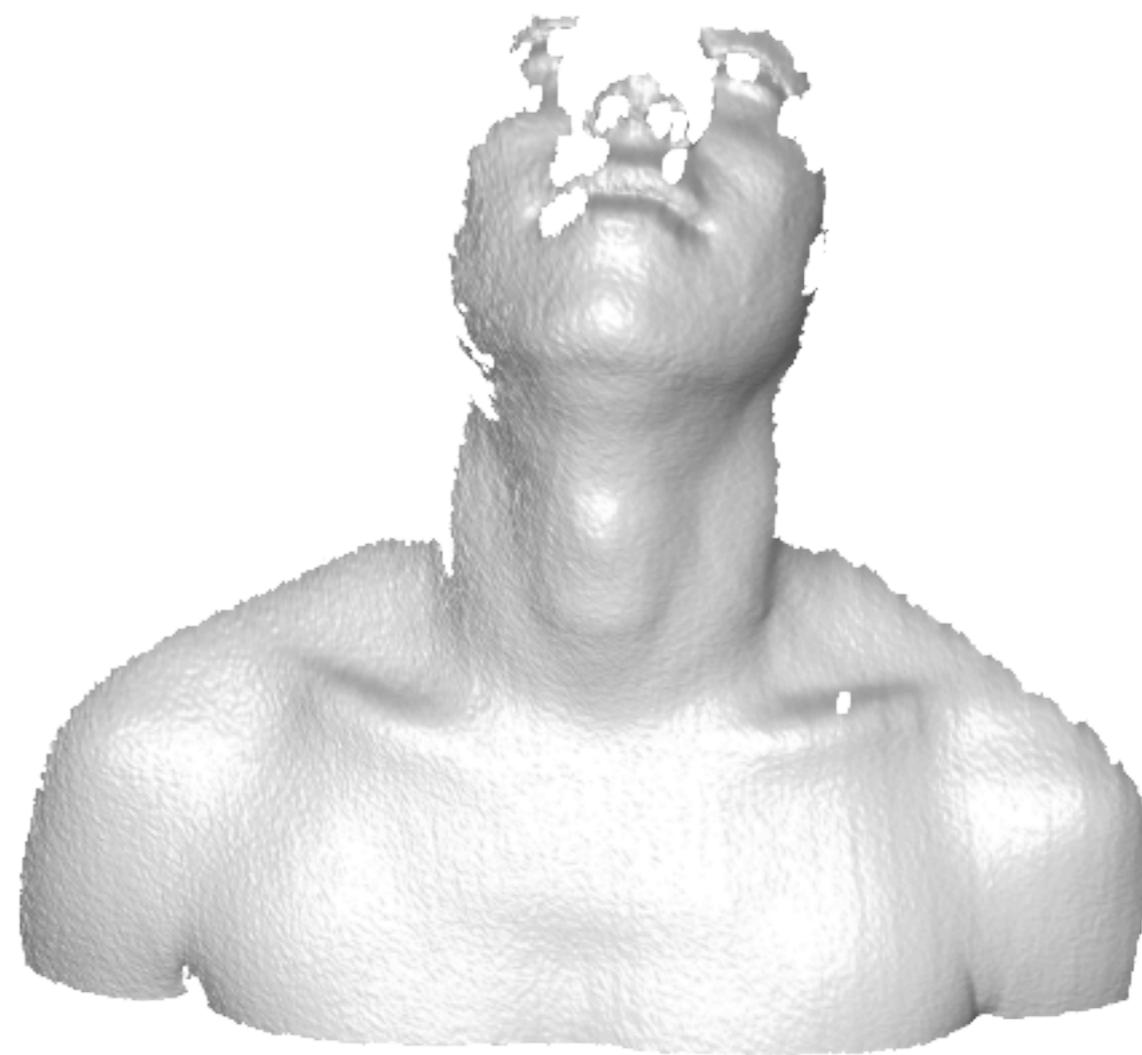
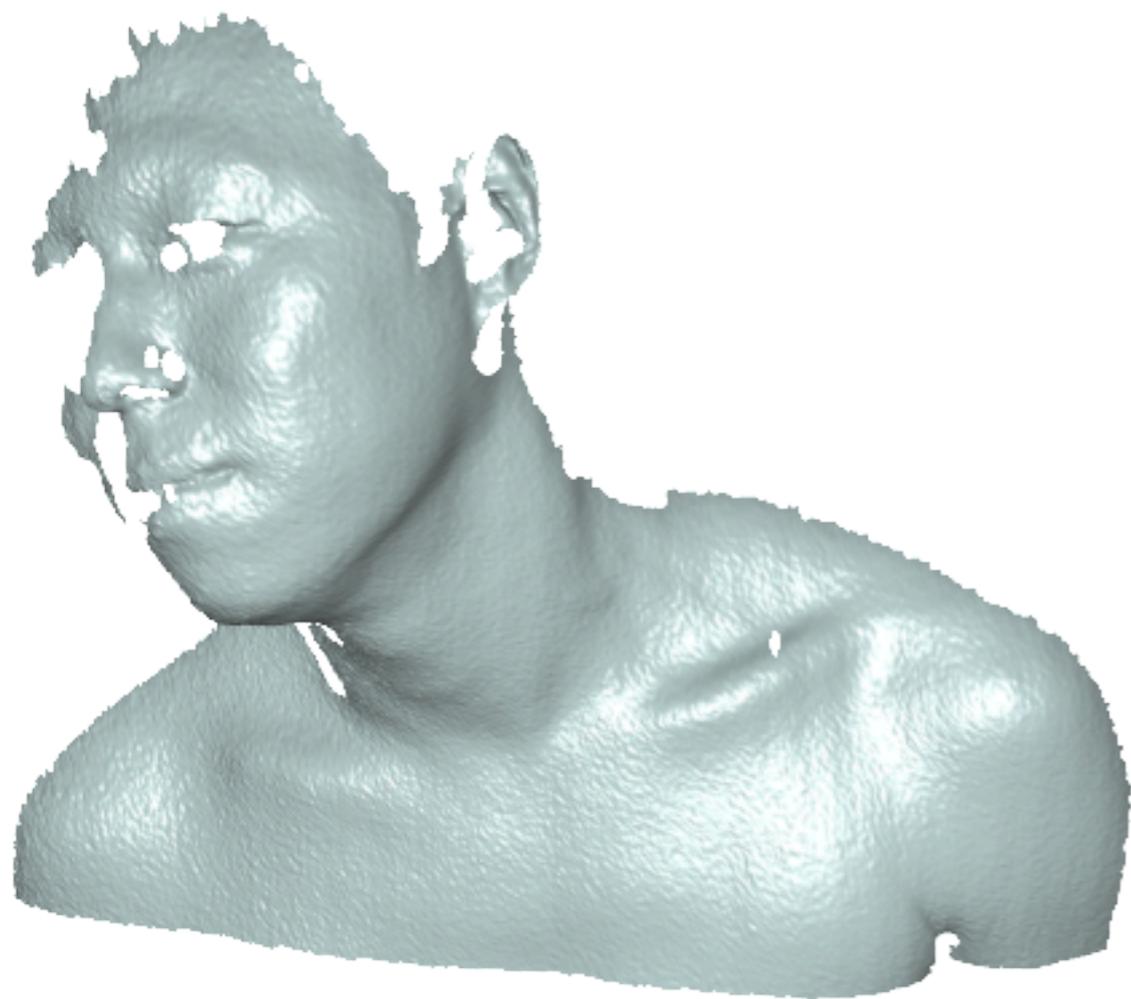
# Pair of 3D Scans



# Correspondences are Lost

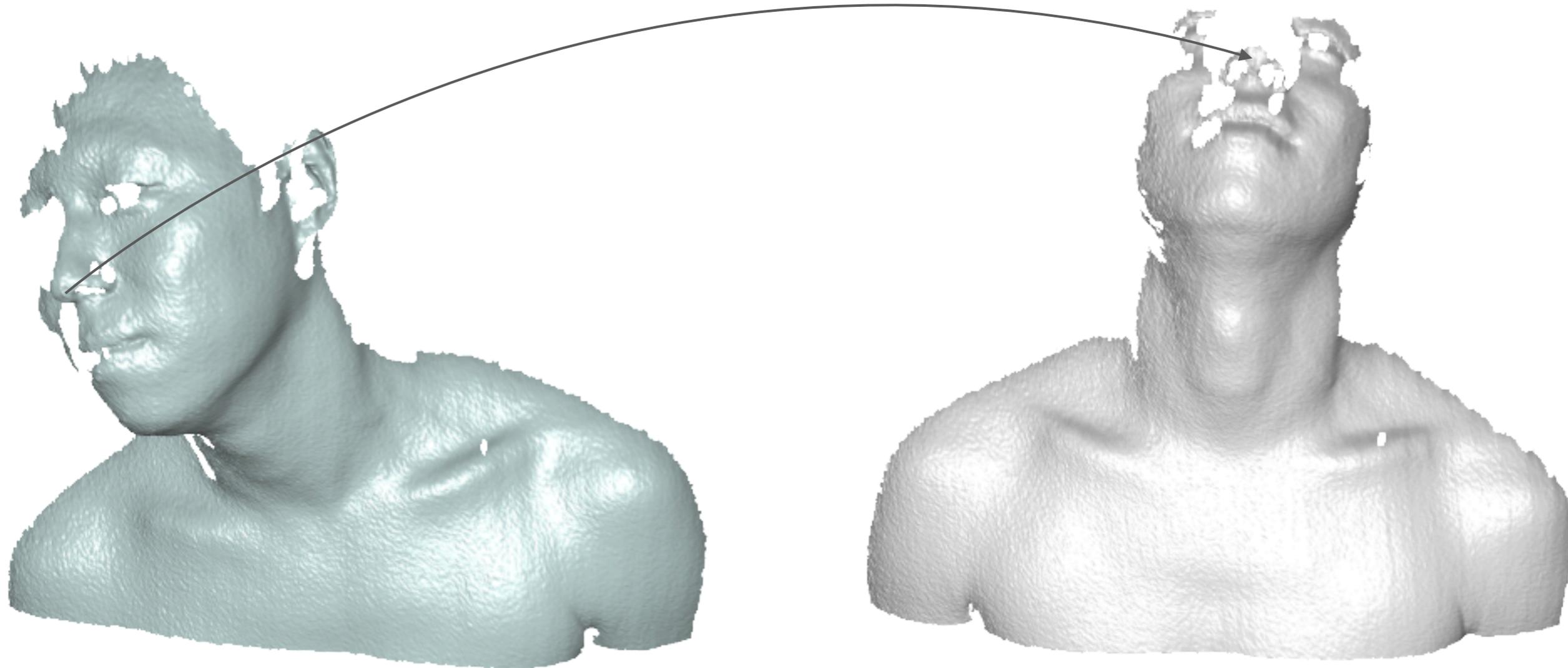
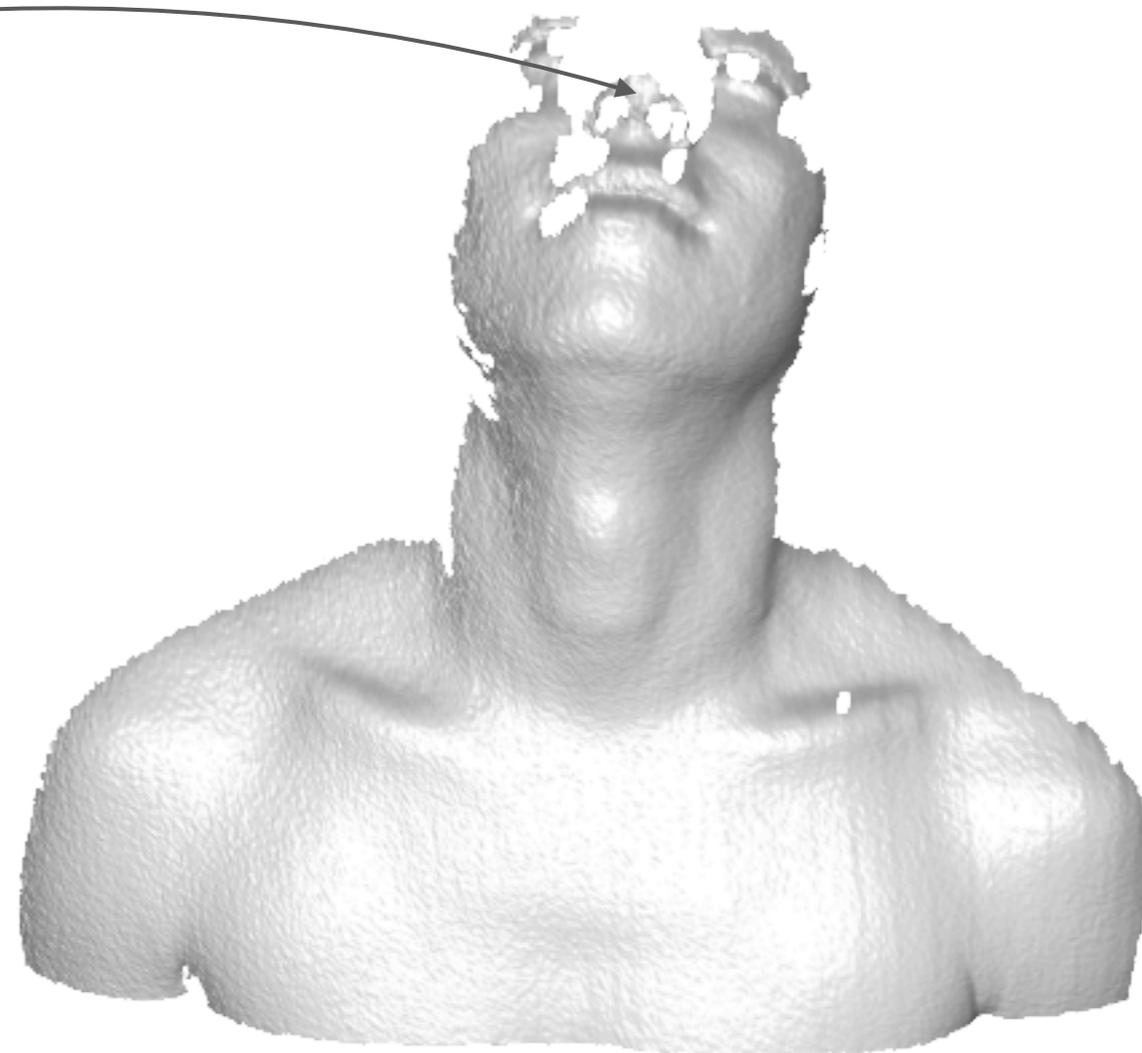
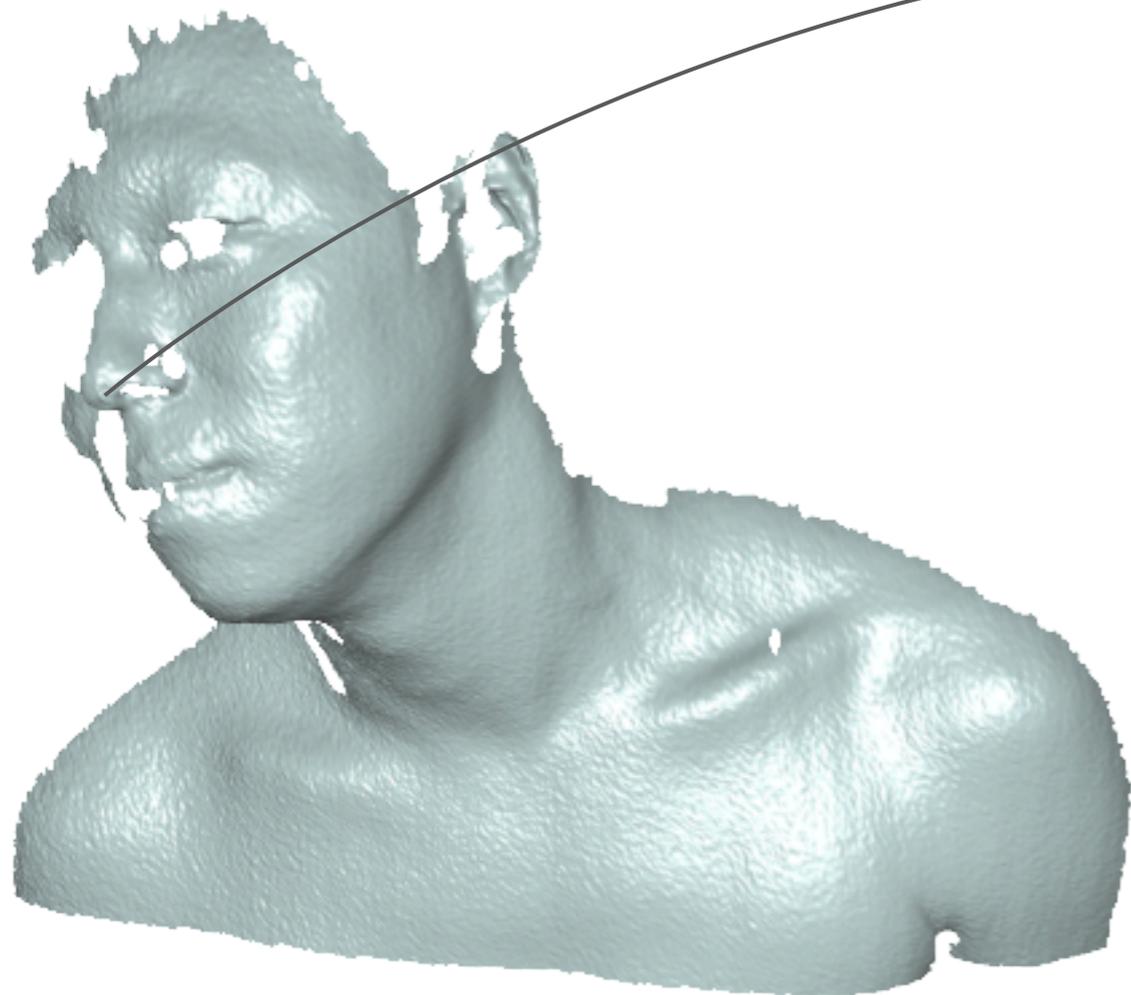


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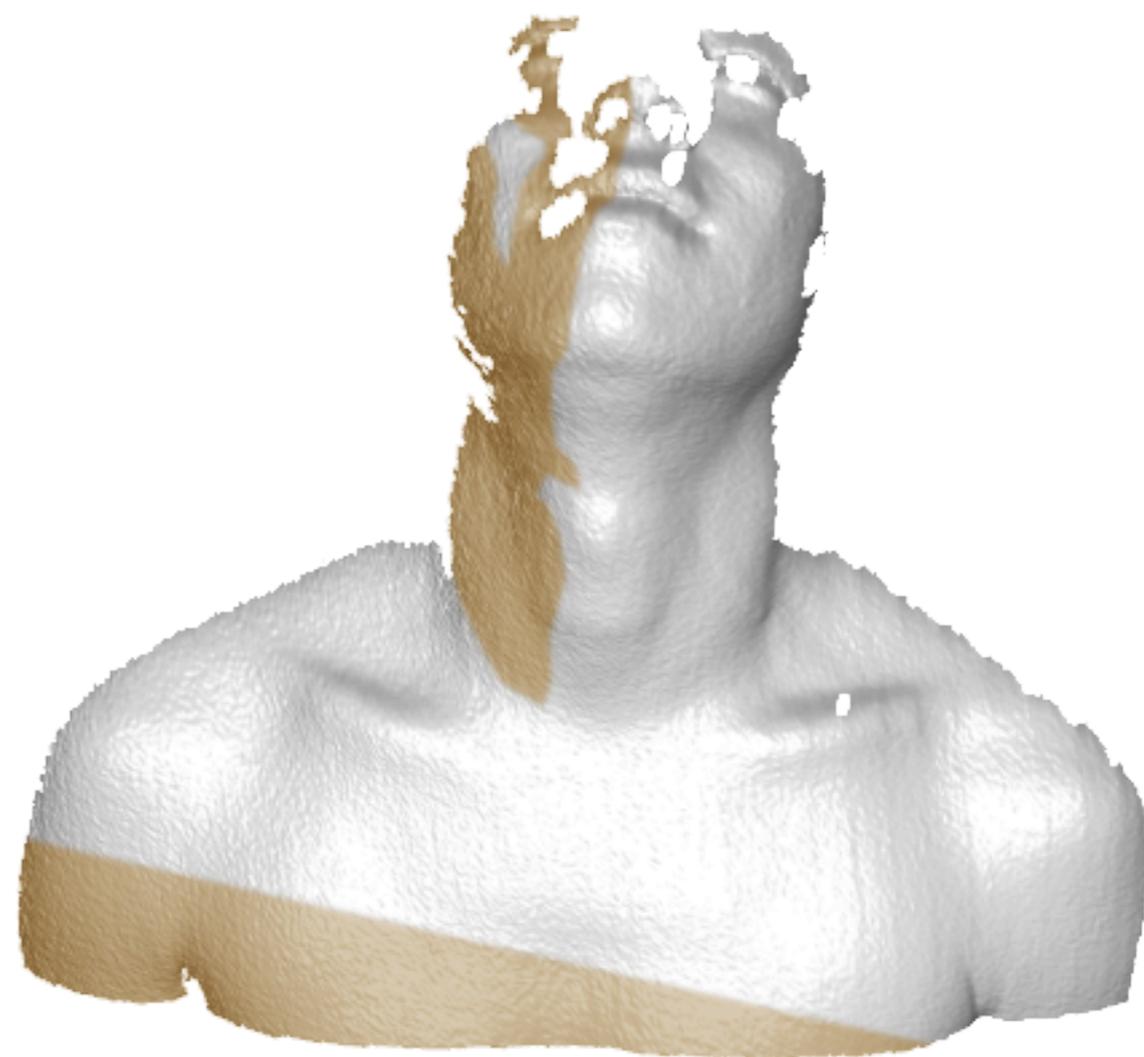
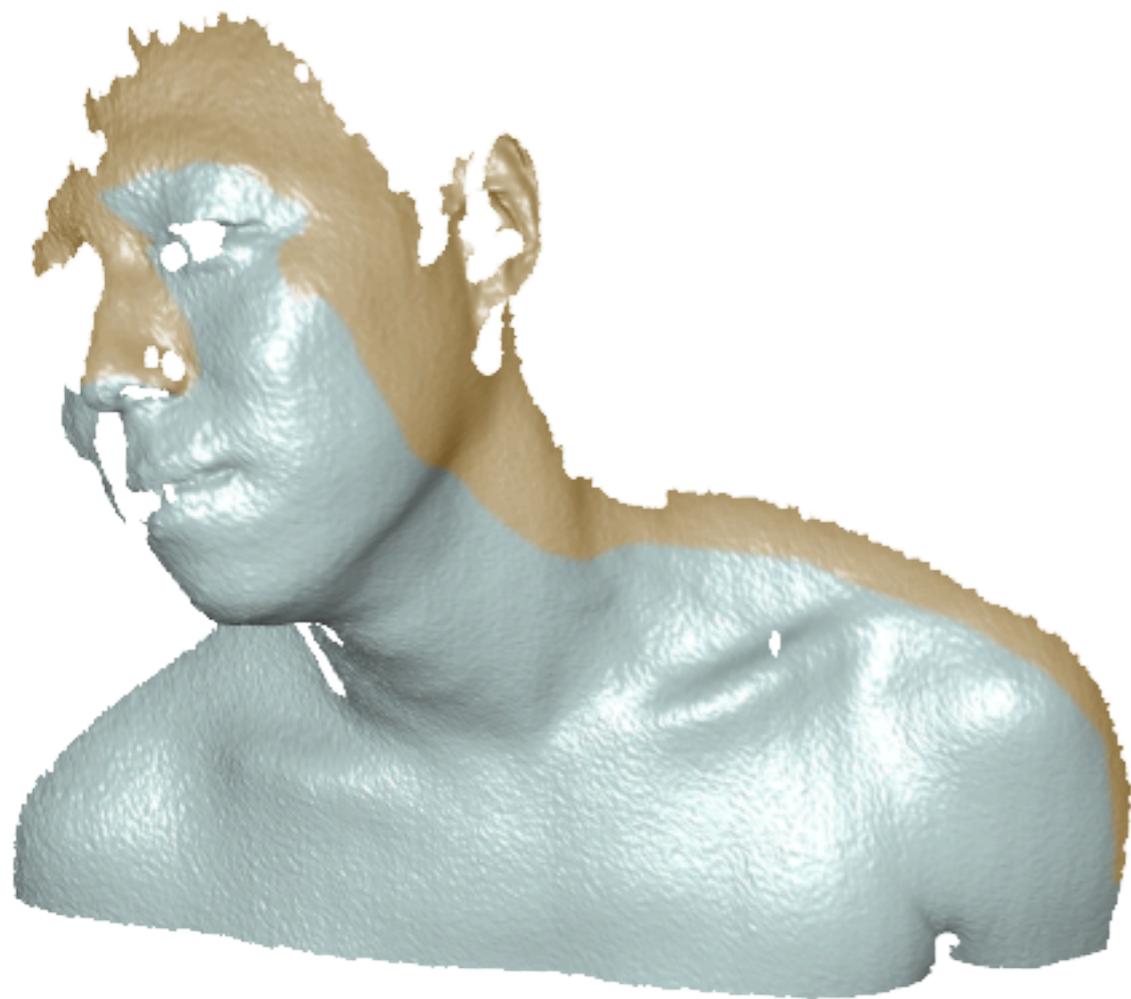


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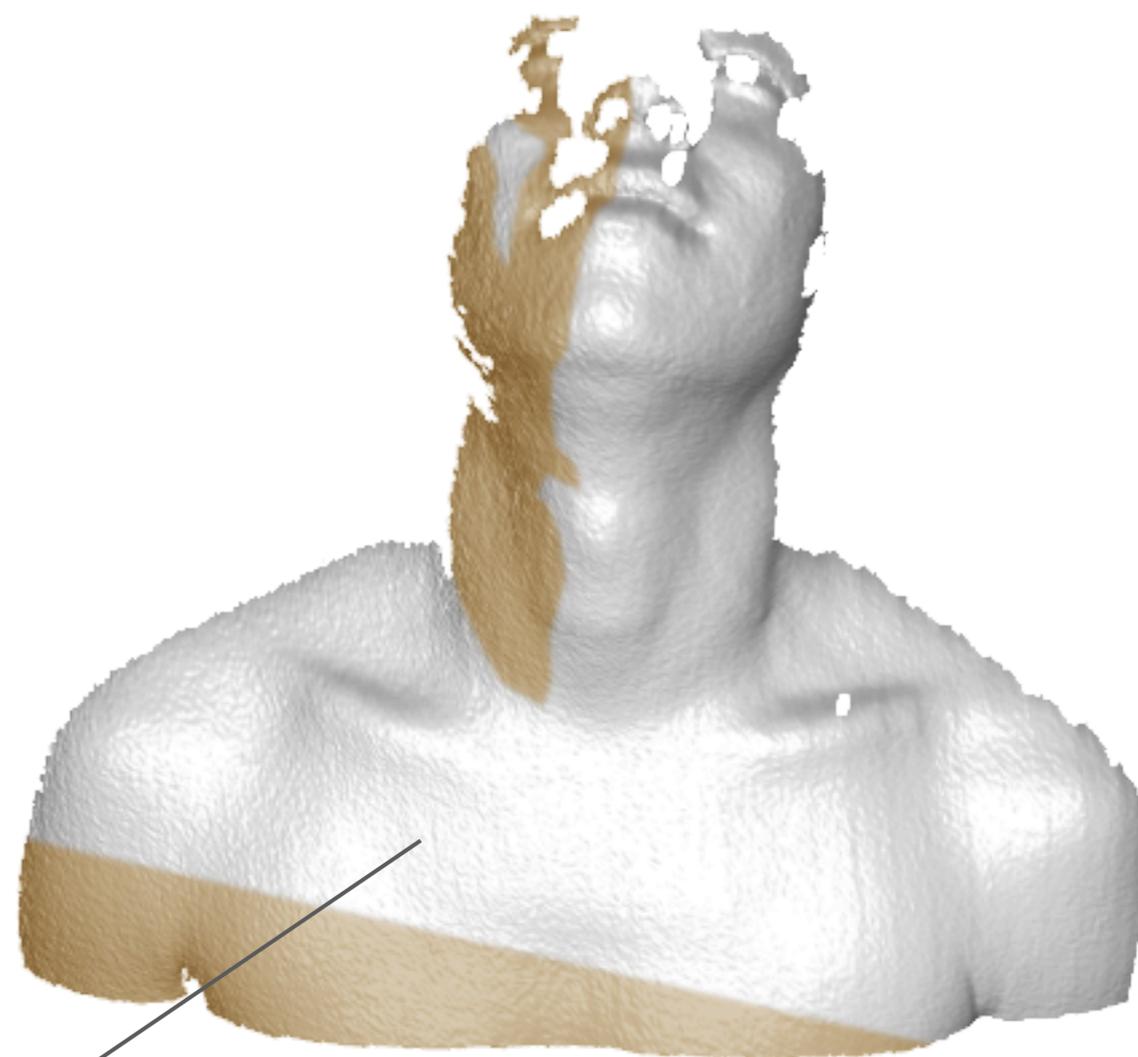
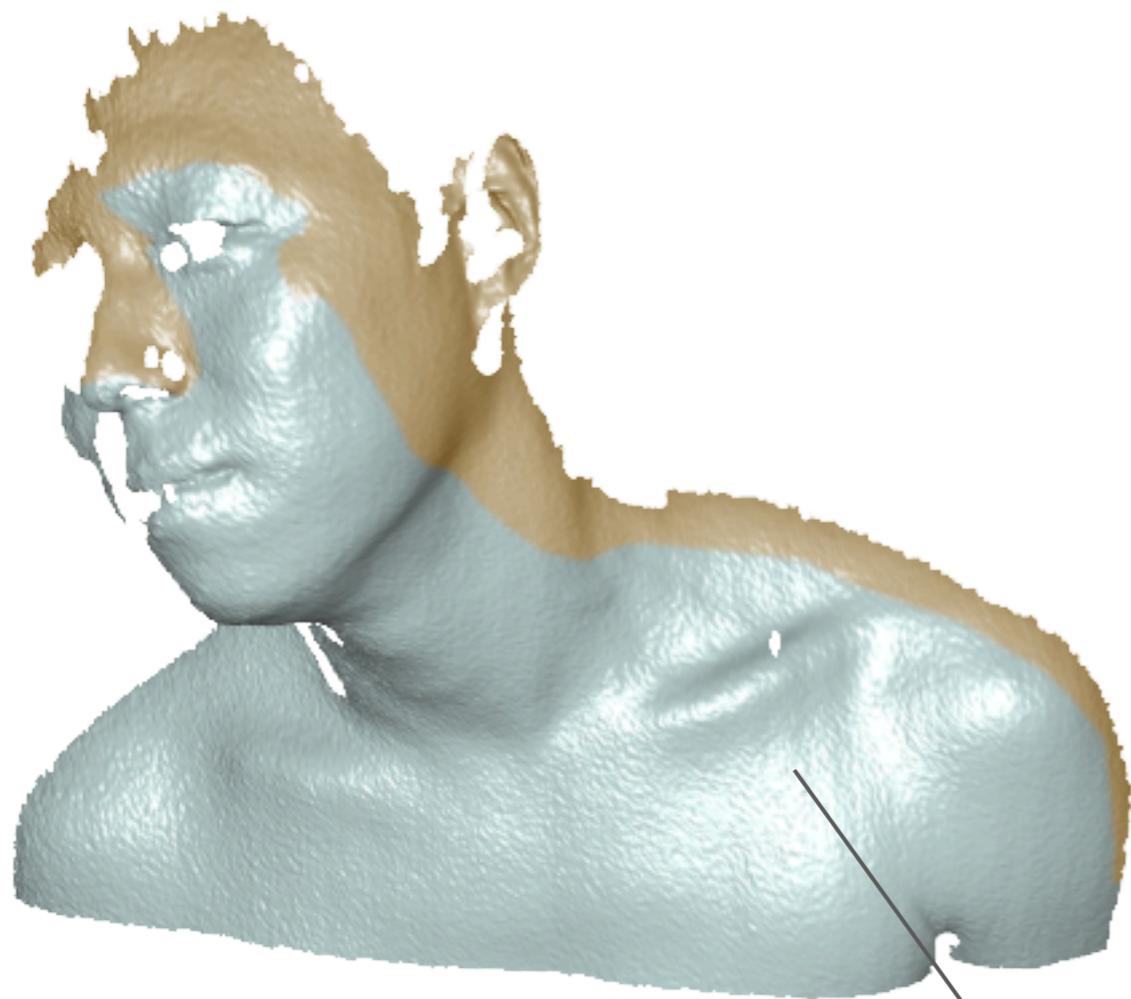
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# Overlapping Regions are Lost

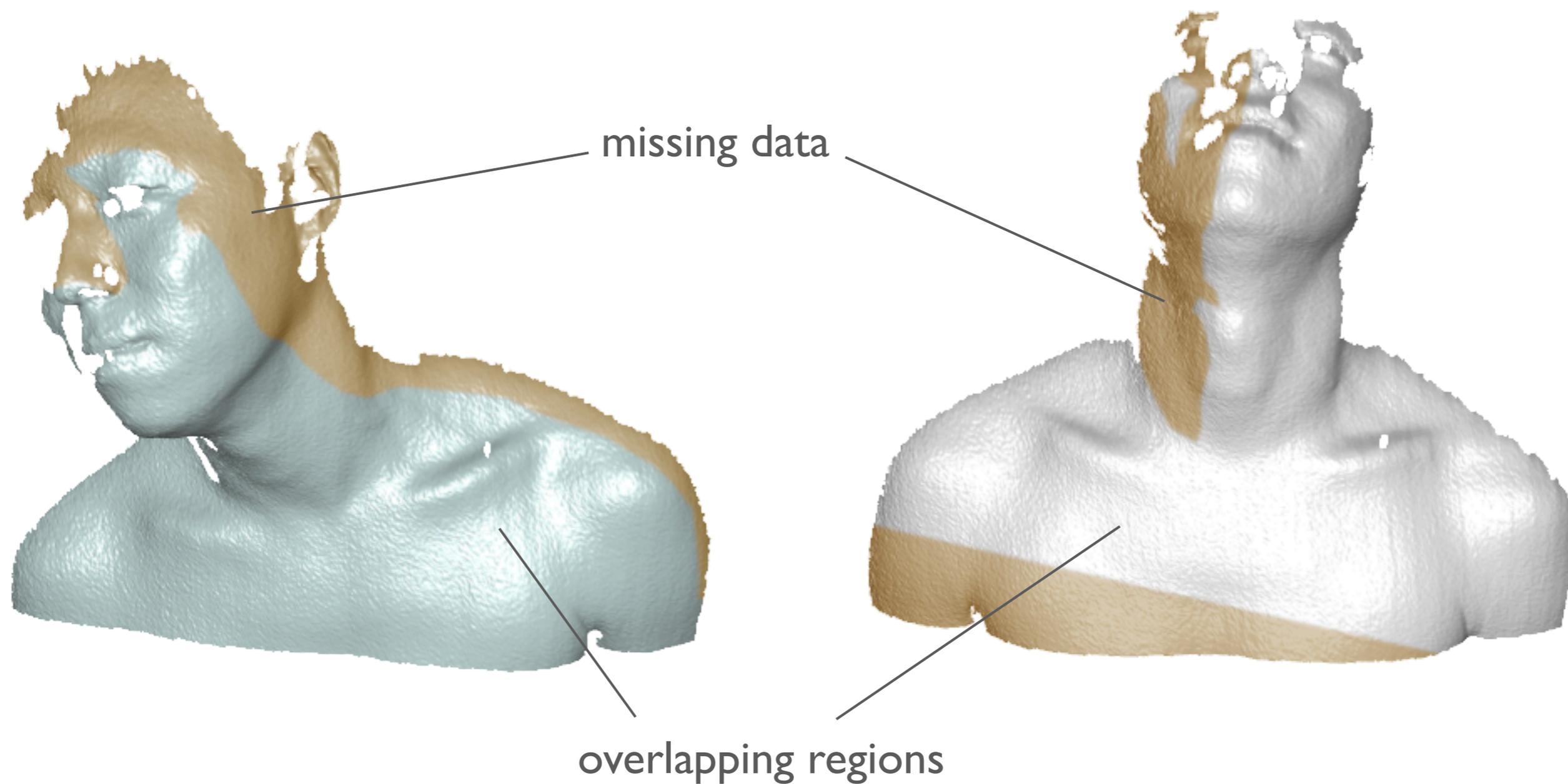


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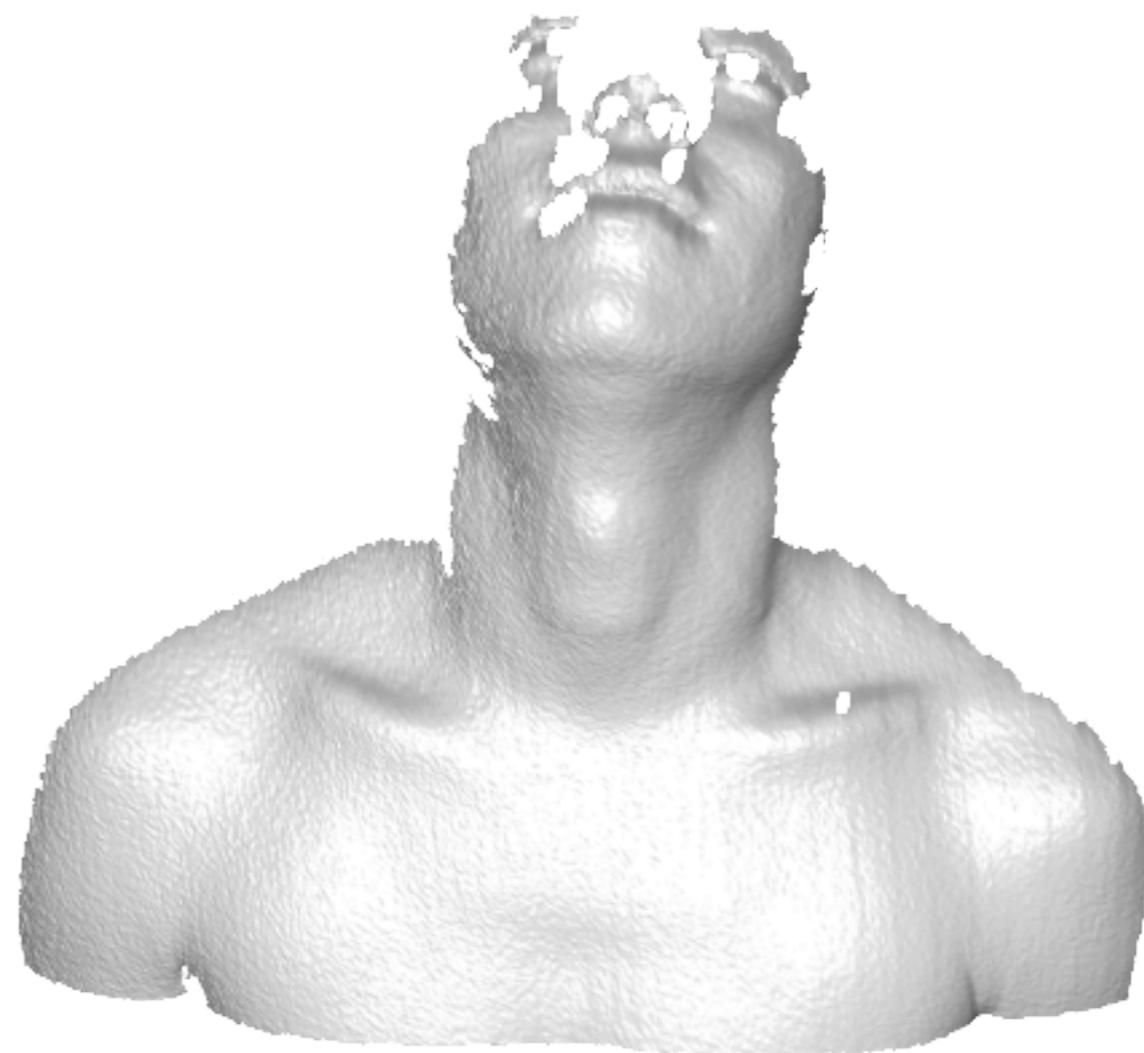
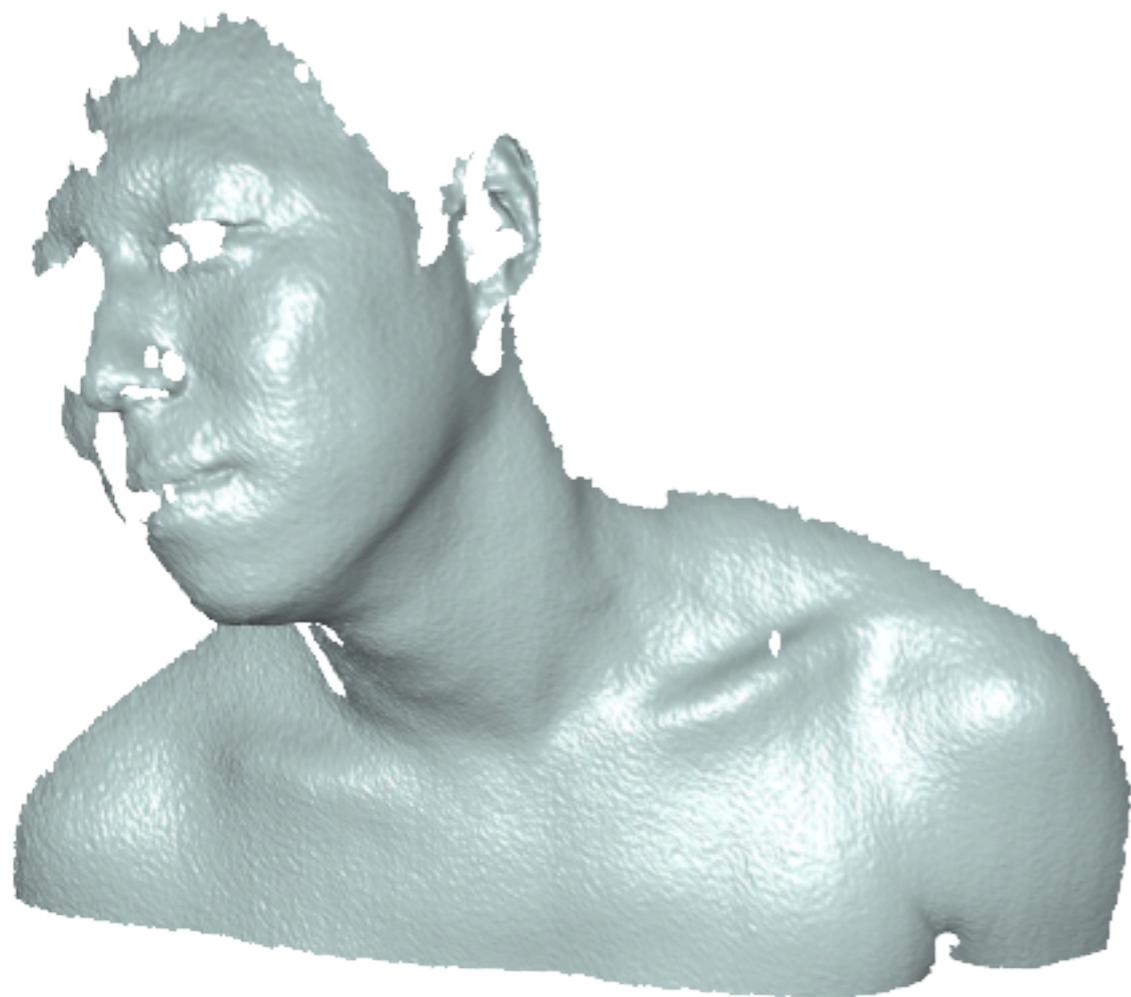


overlapping regions

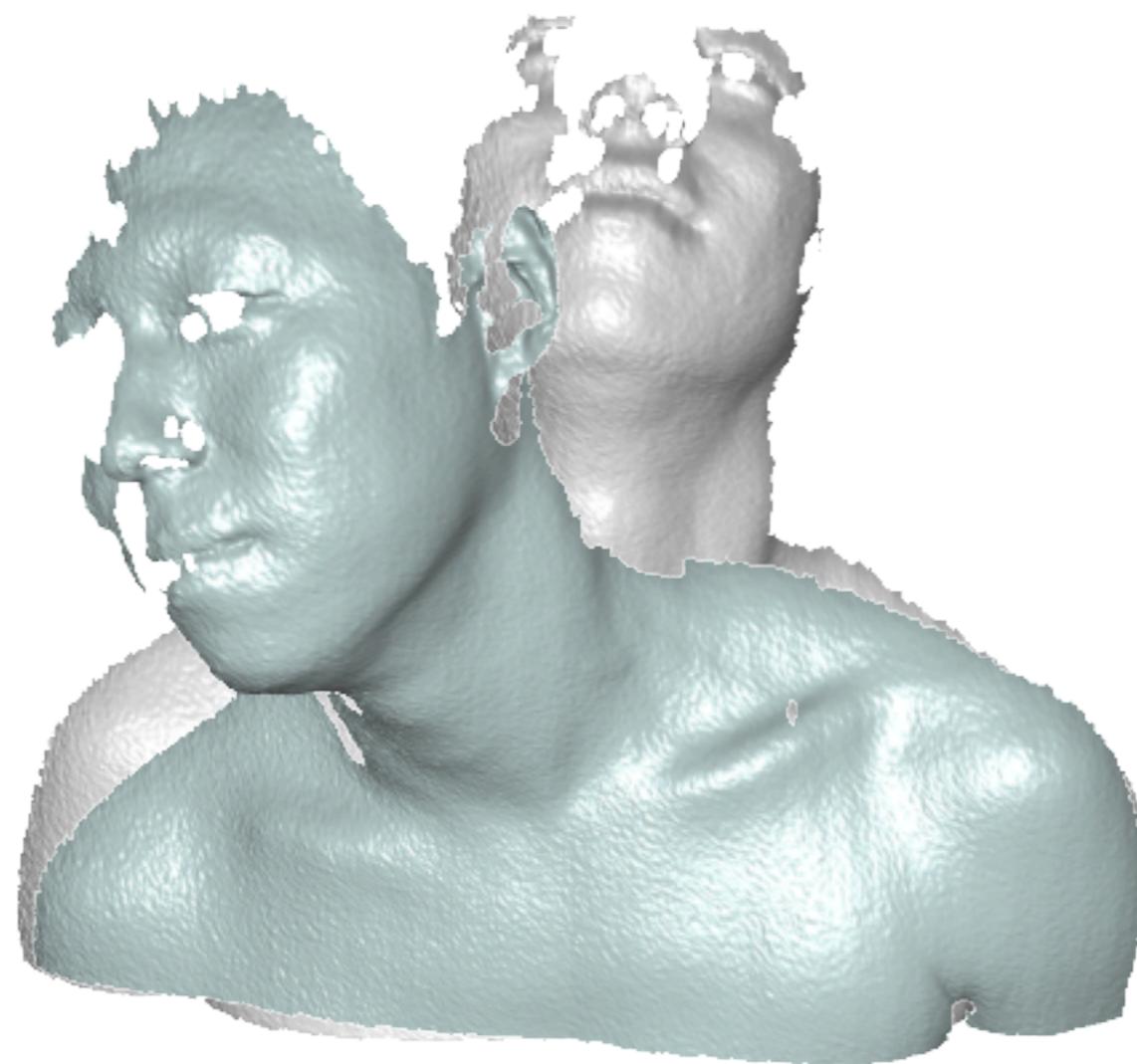
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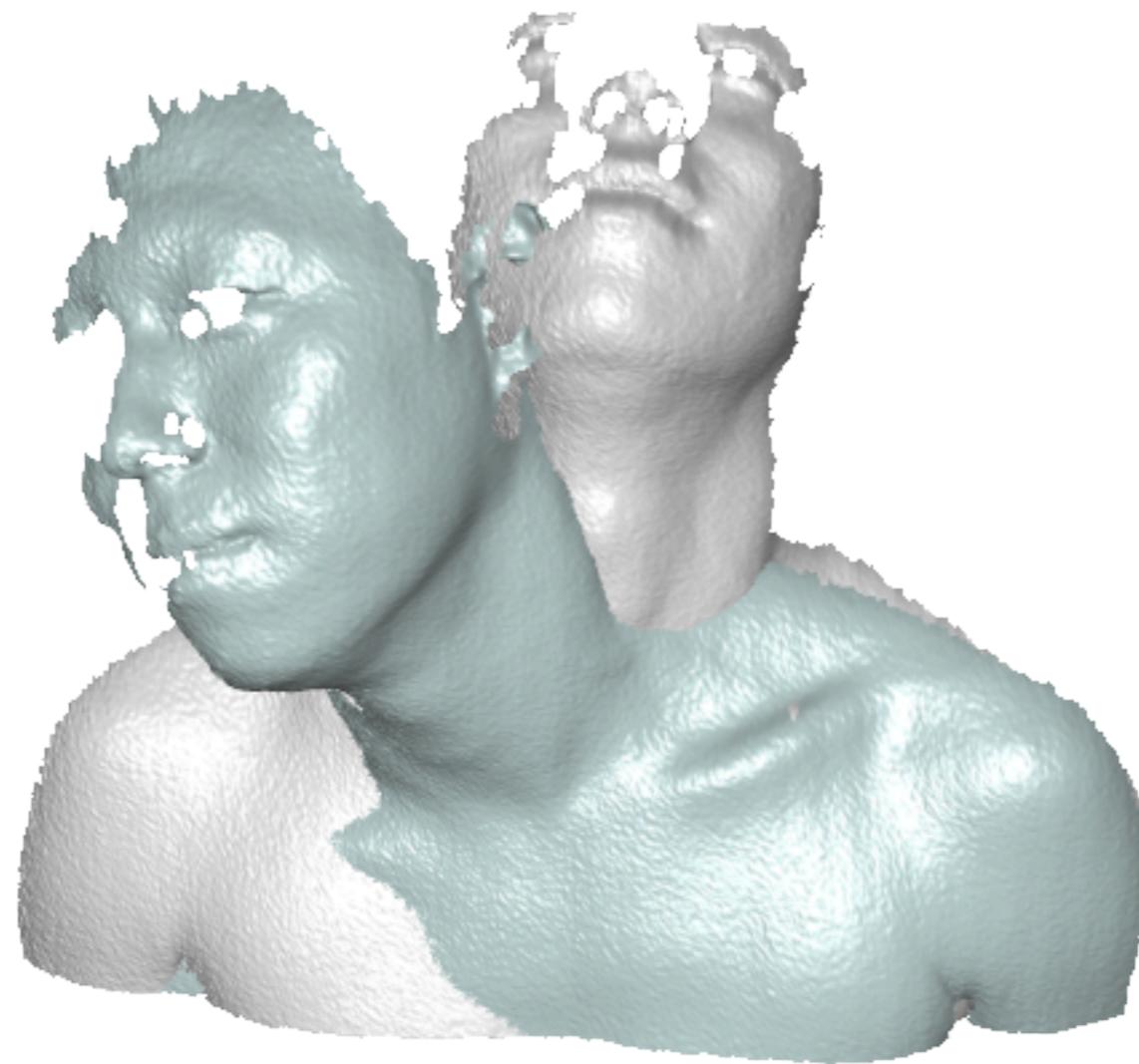


# Overlapping Regions are Lost



# Non-Rigid Registration

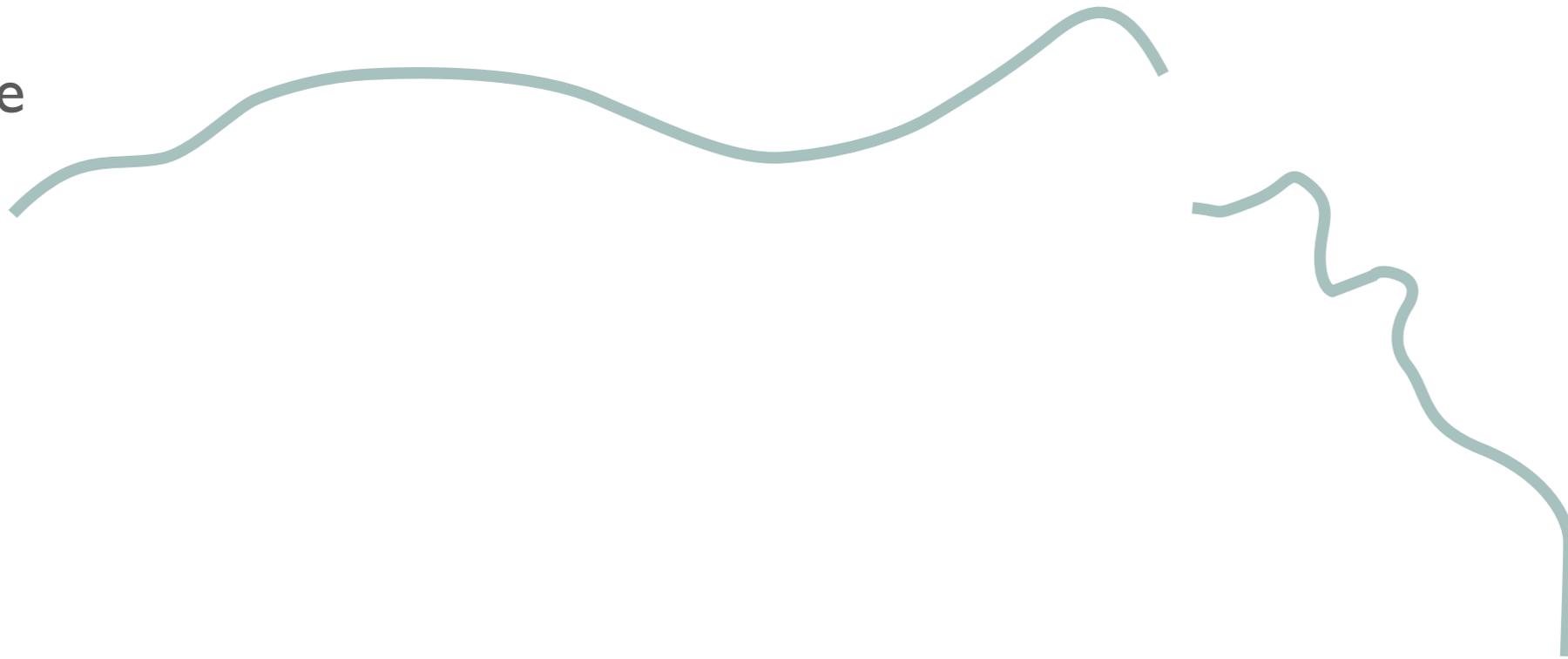
# Non-Rigid Registration



# Three Ingredients

# Three Ingredients

source



# Three Ingredients

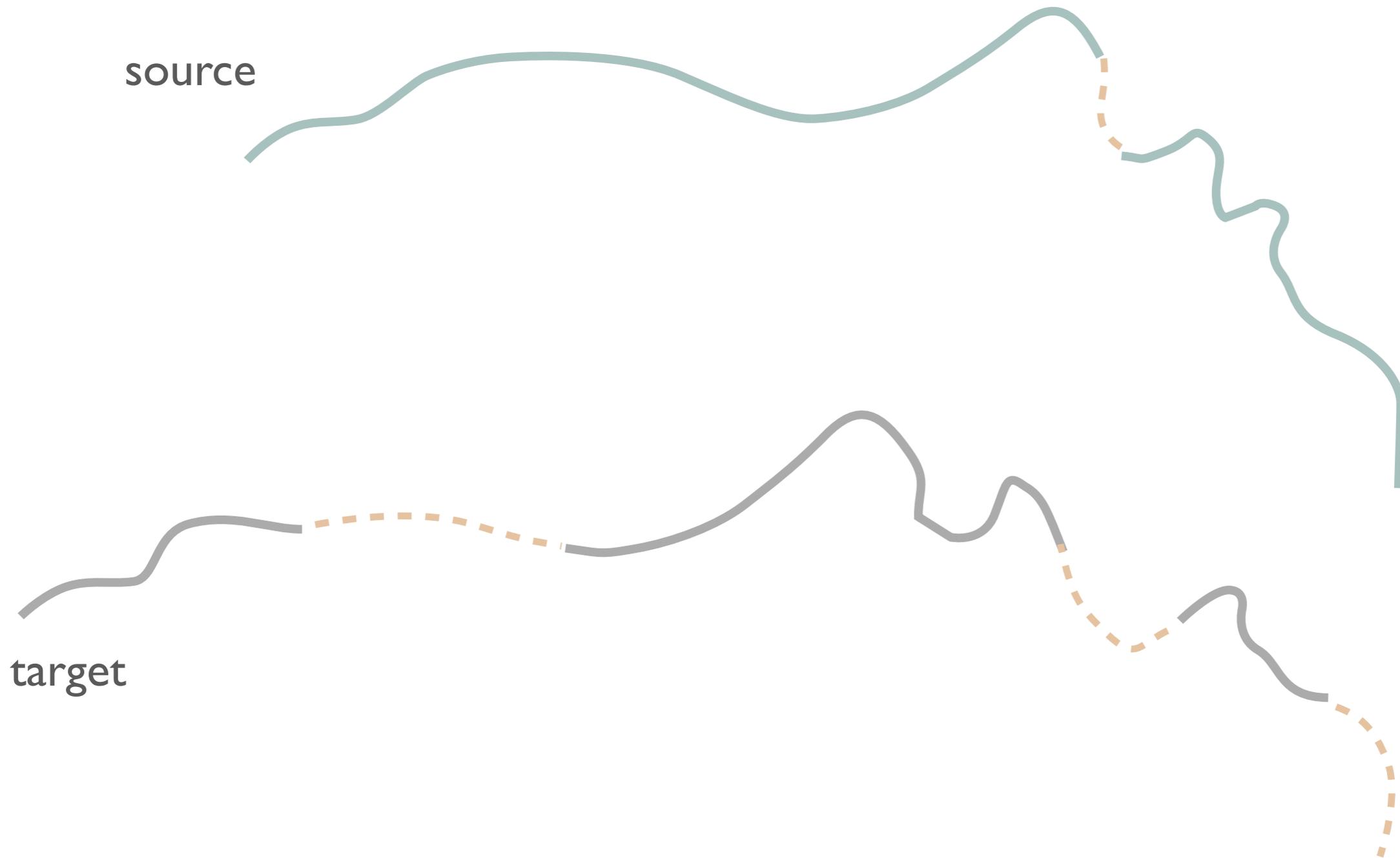
source



target



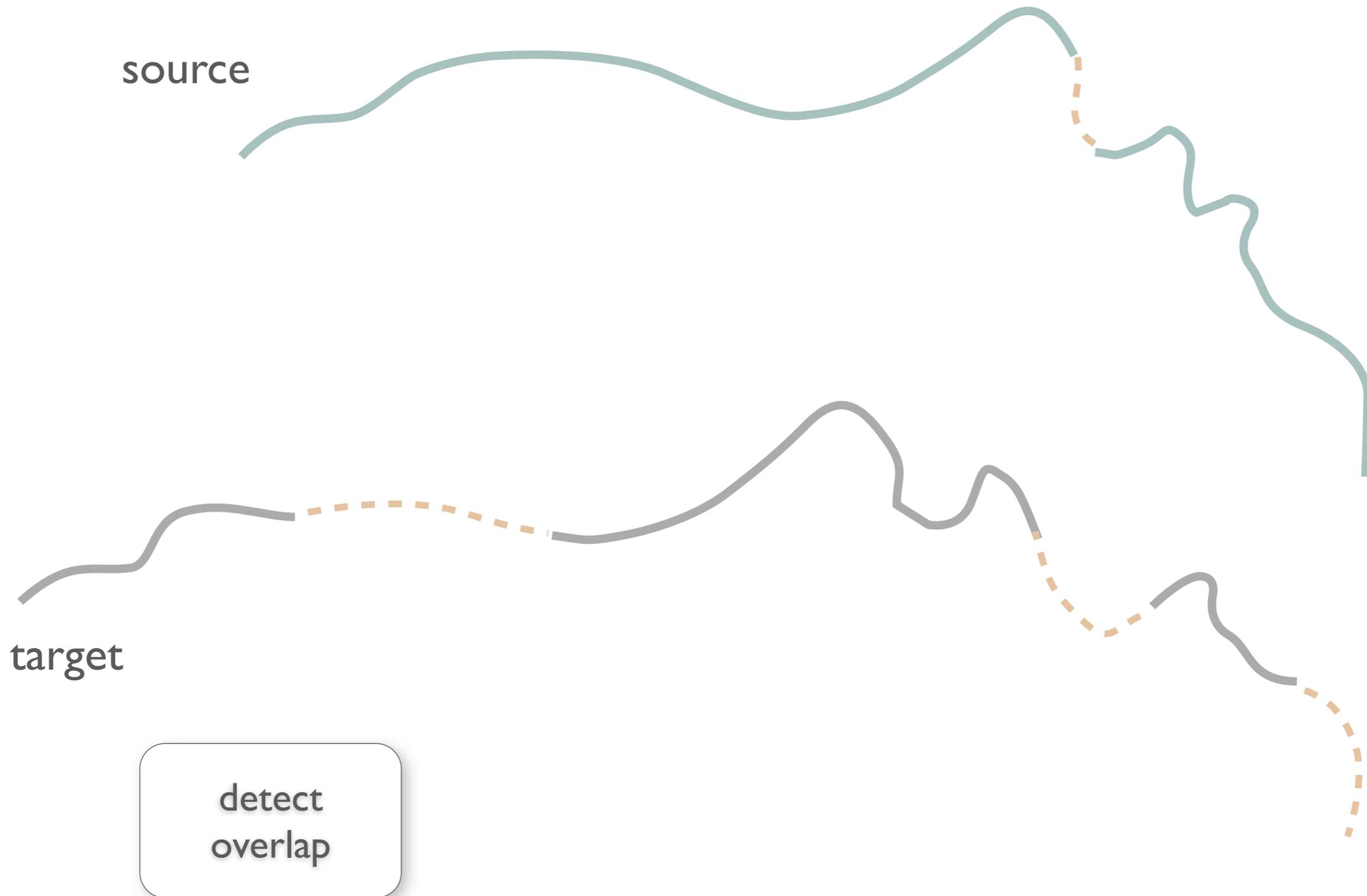
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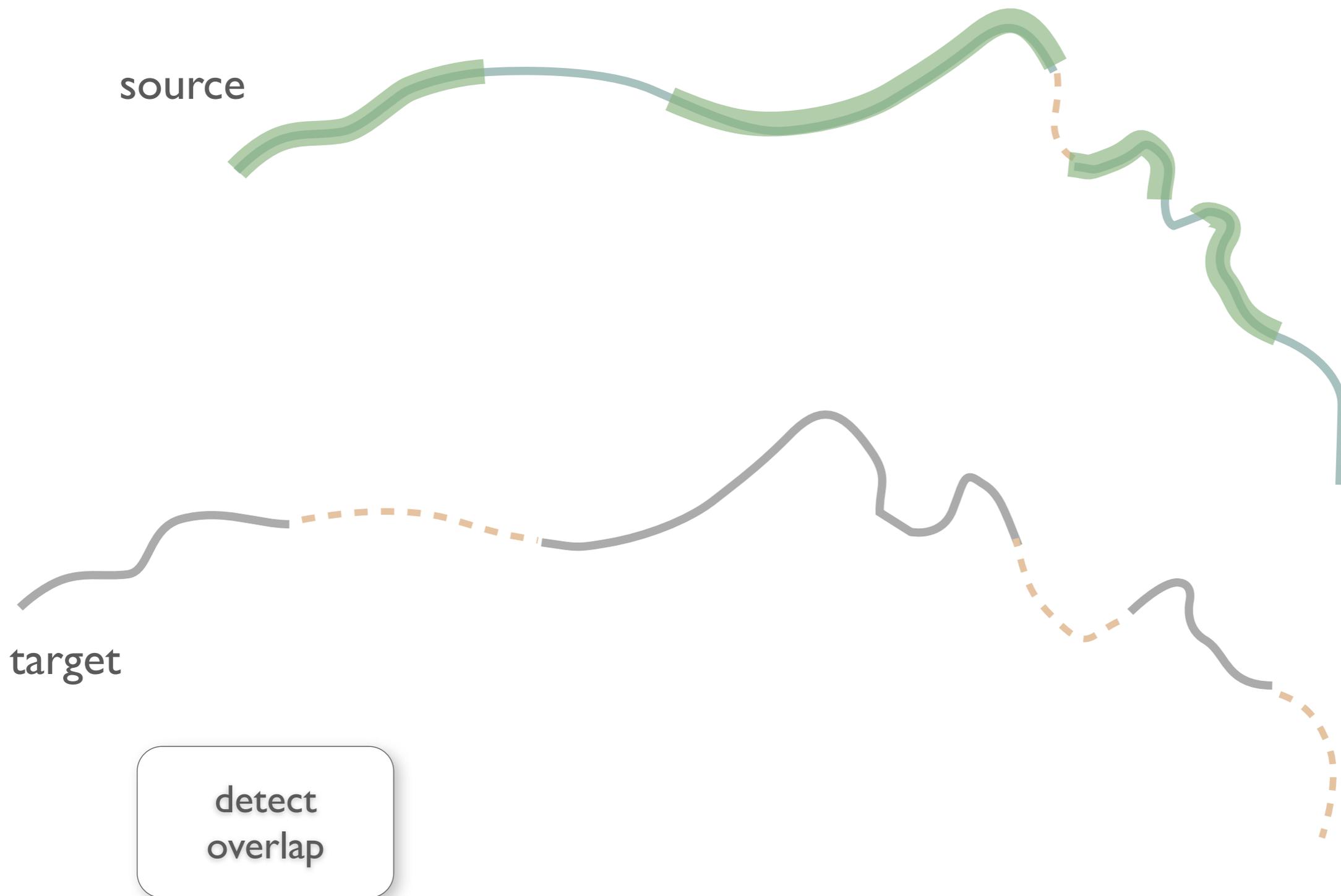
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target

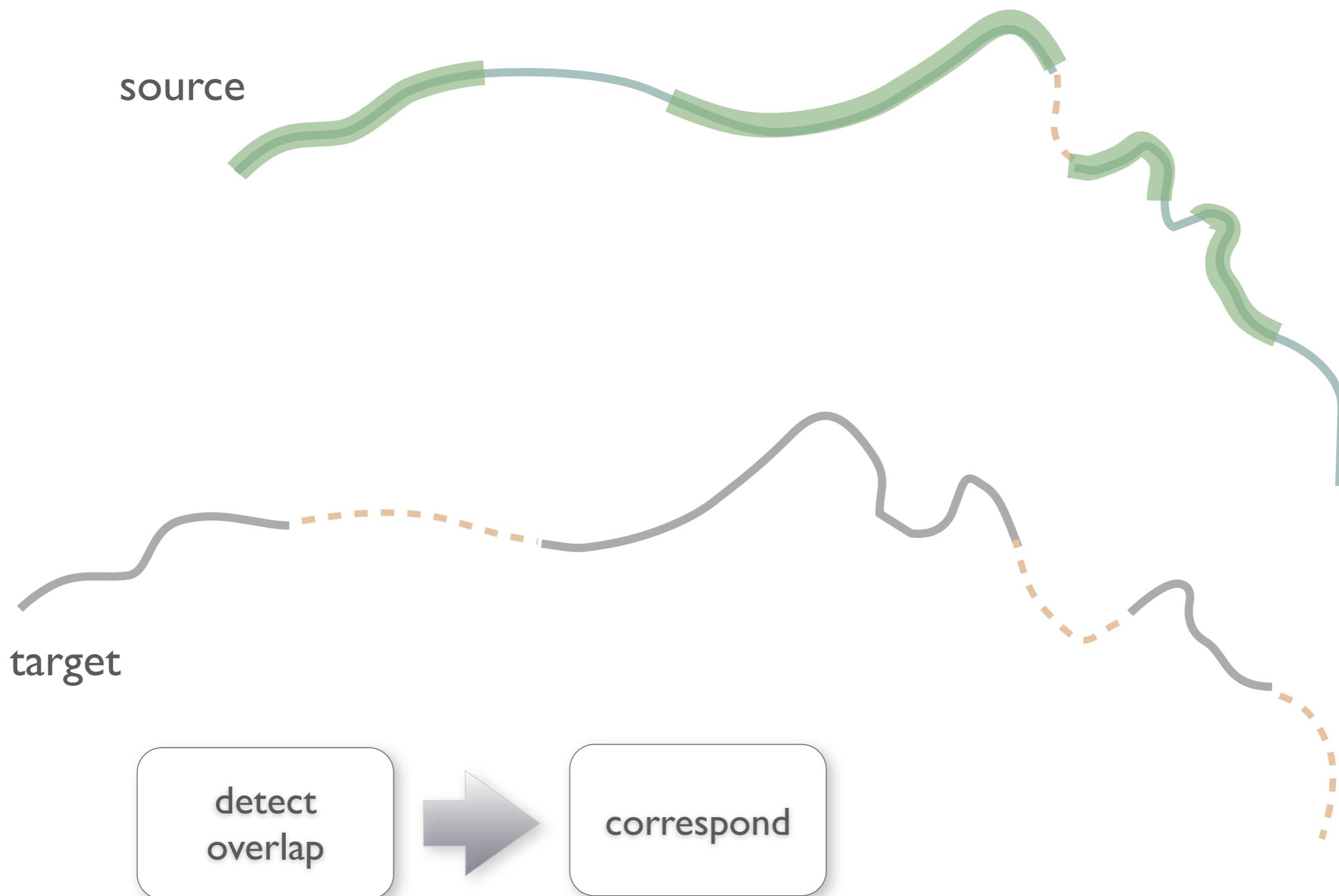
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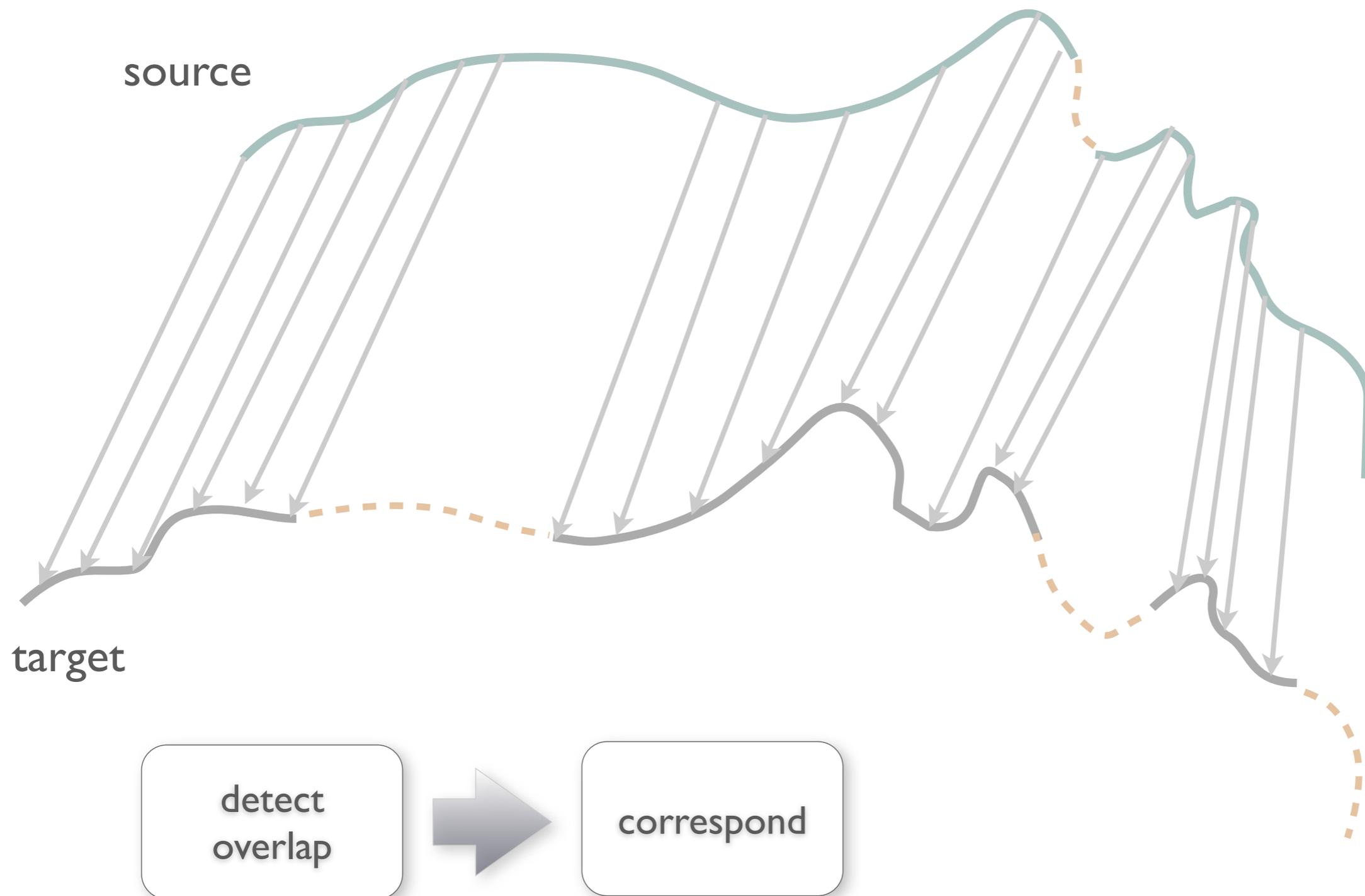
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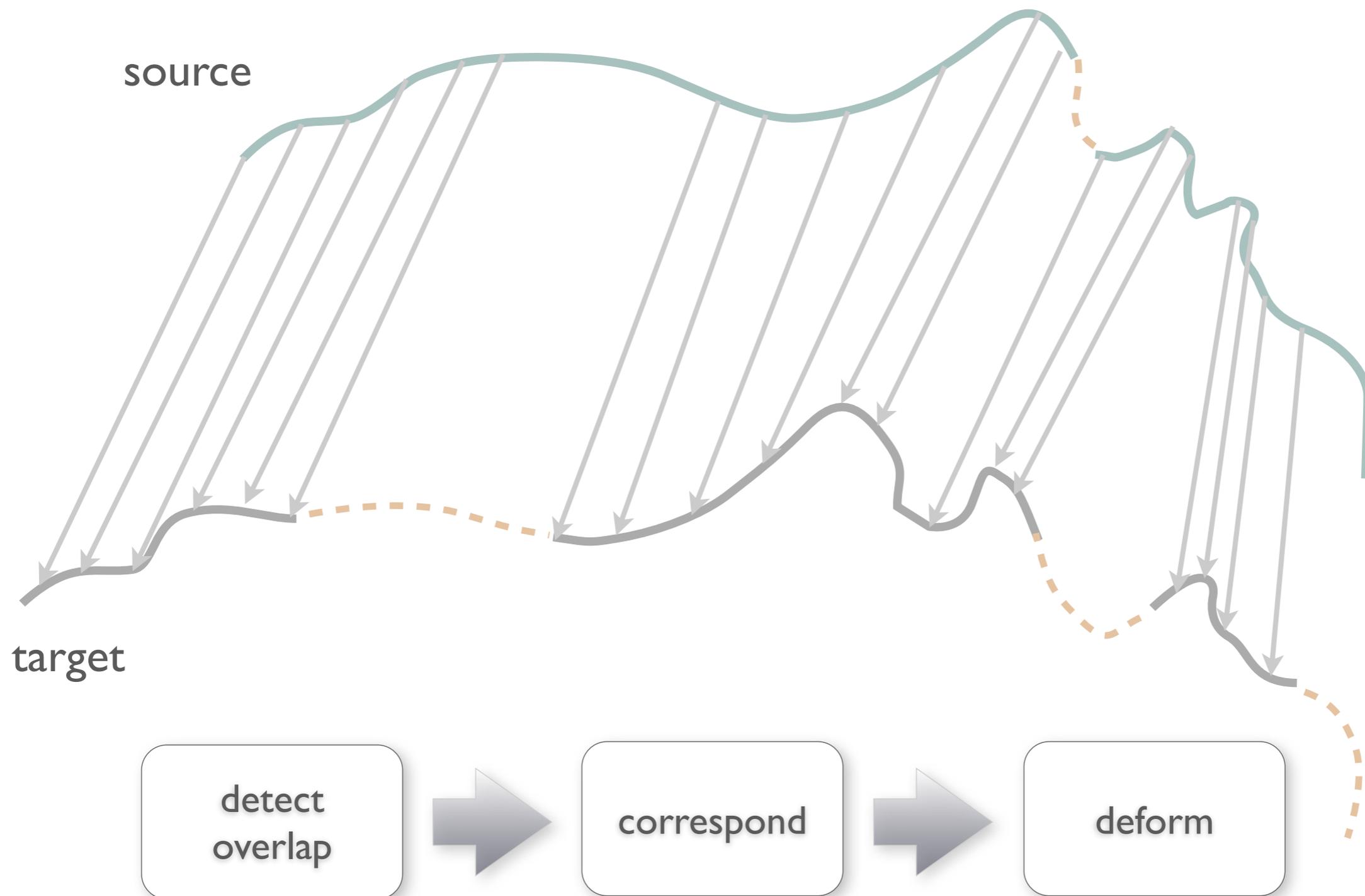
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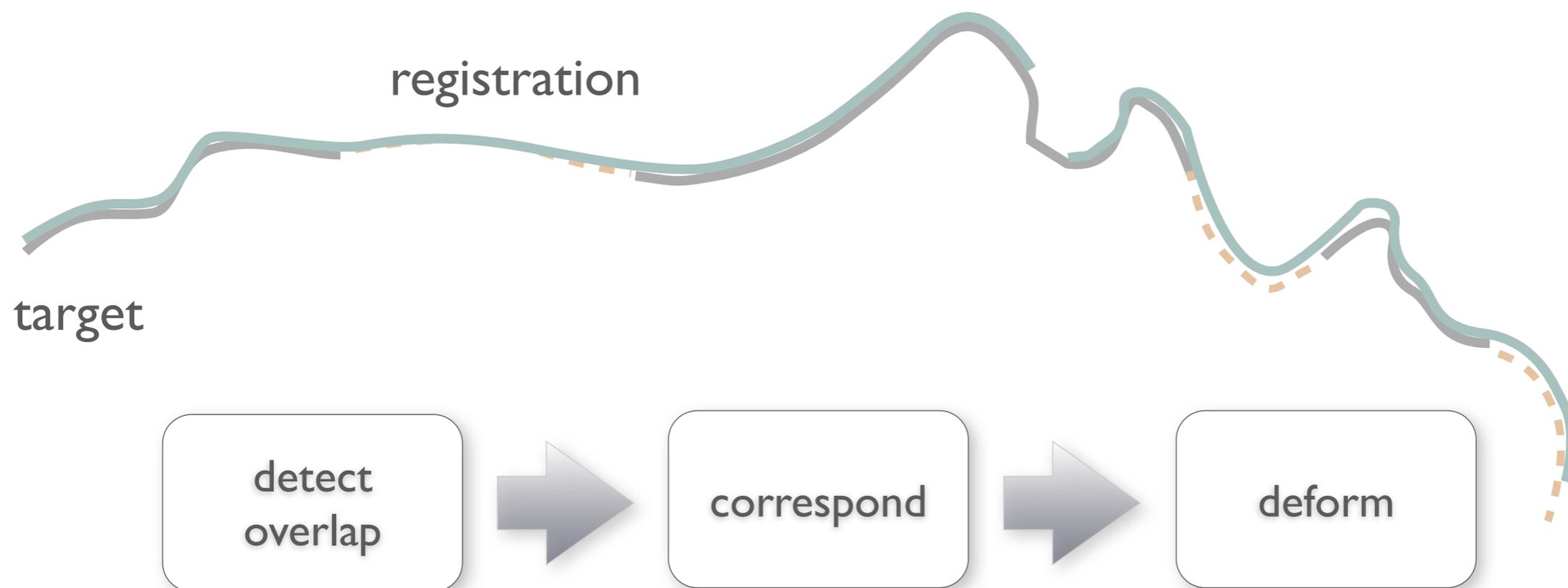
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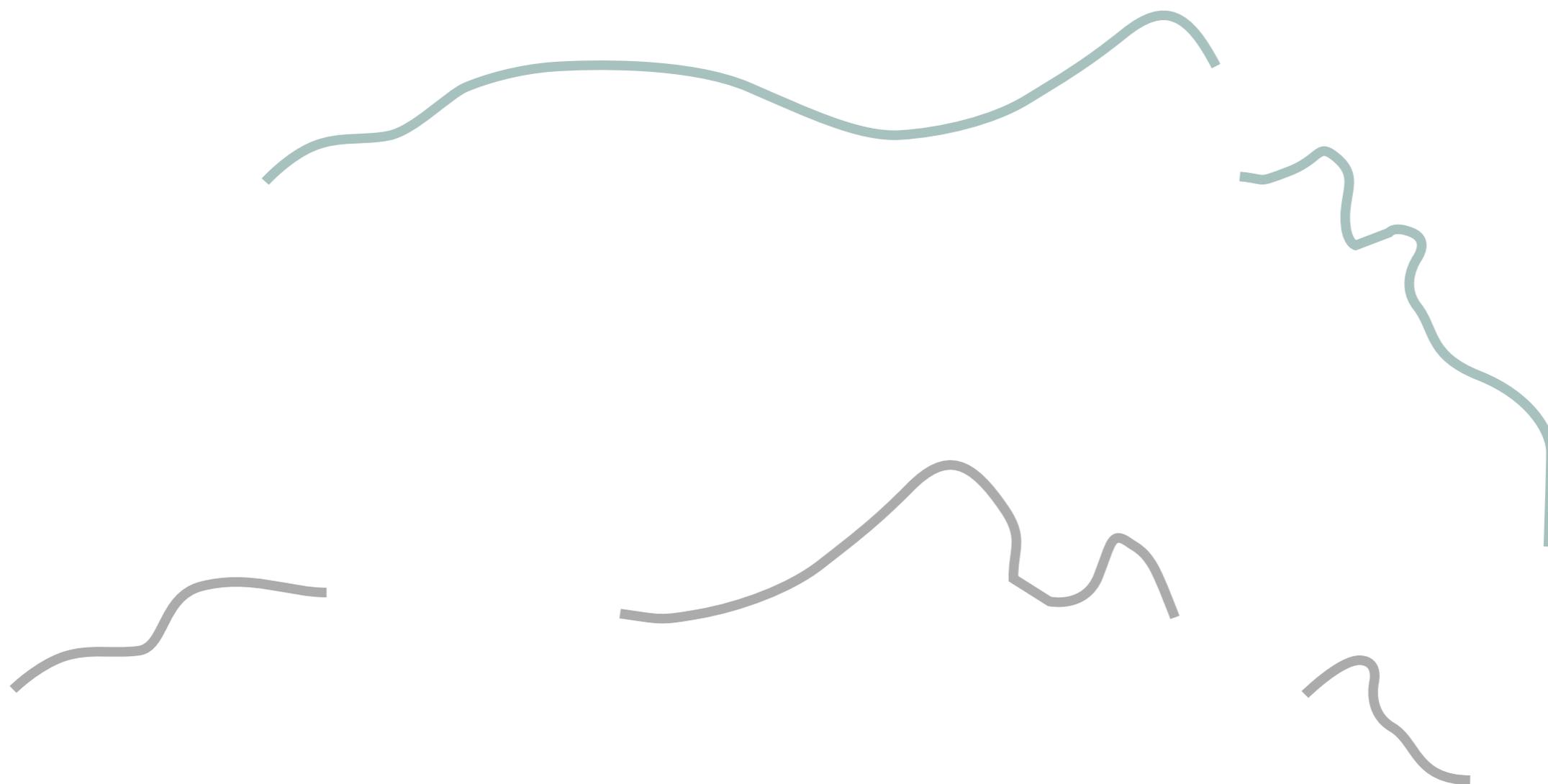
# Three Ingredients



# Three Ingredients



# Challenges



detect  
overlap



correspond



deform

# Challenges



detect  
overlap

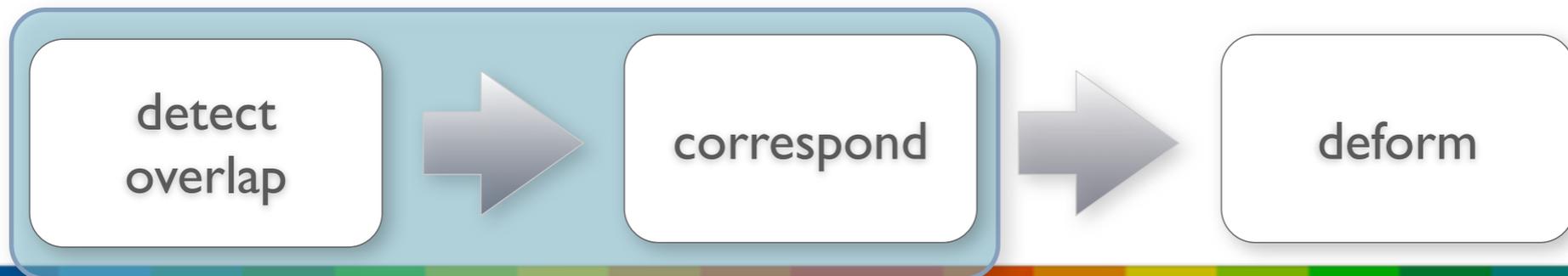
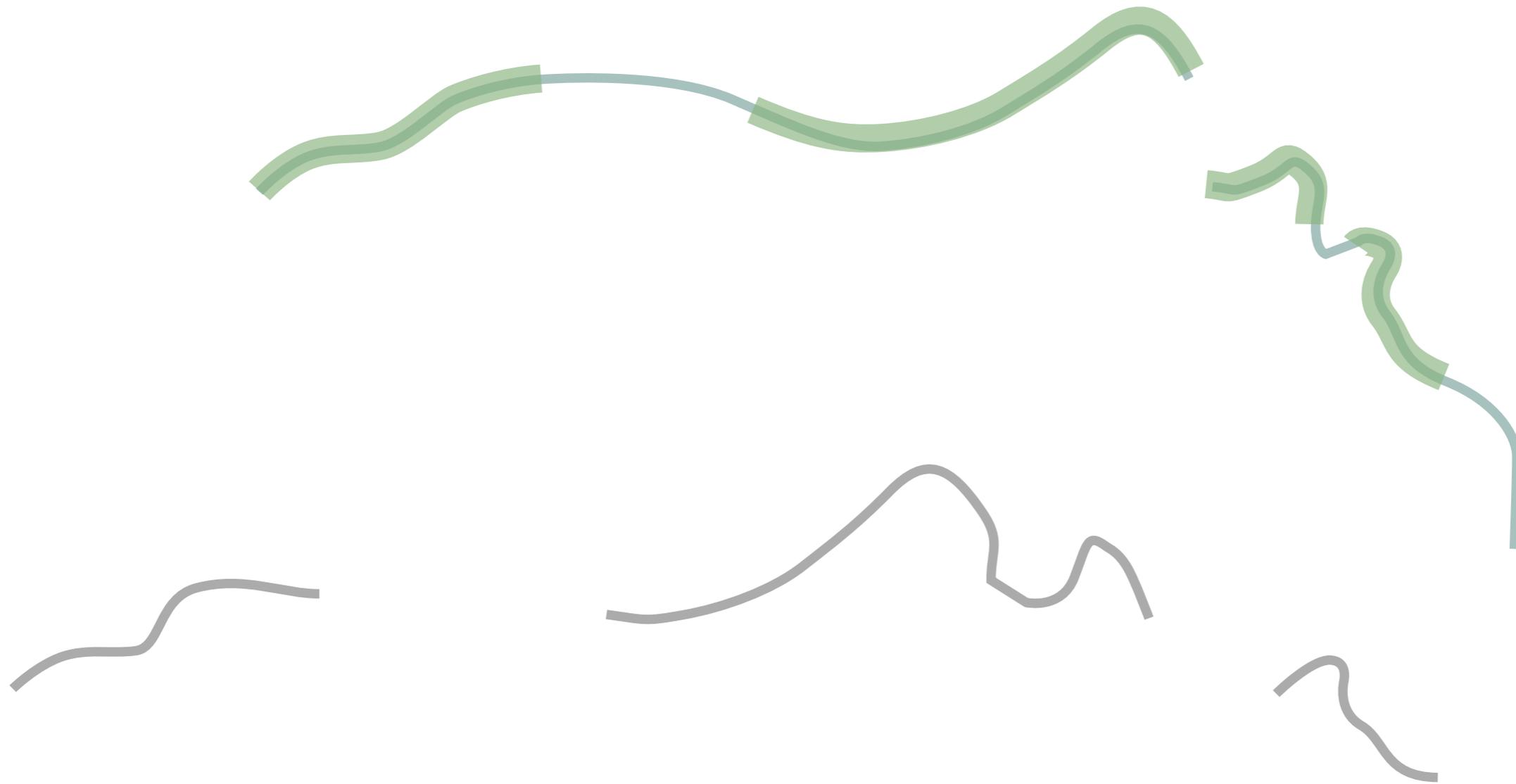


correspond

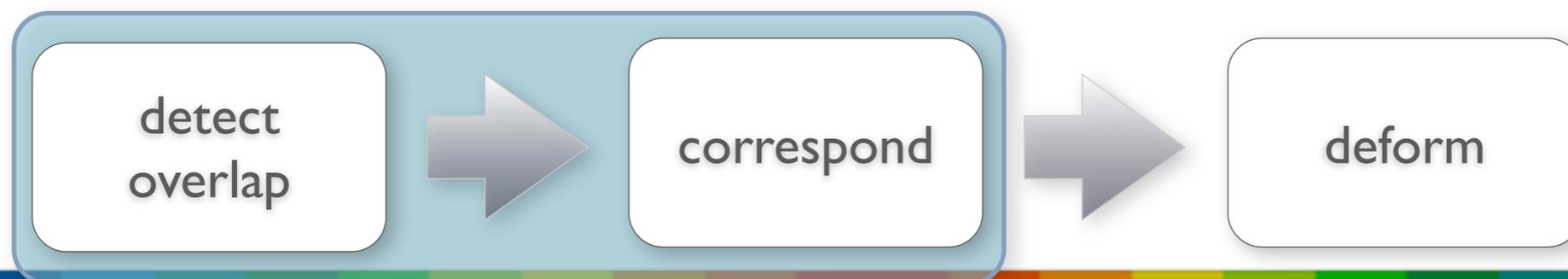


deform

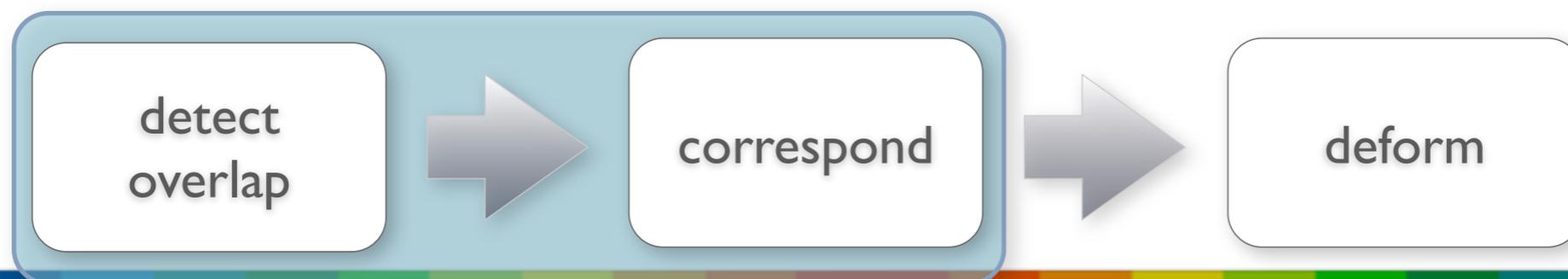
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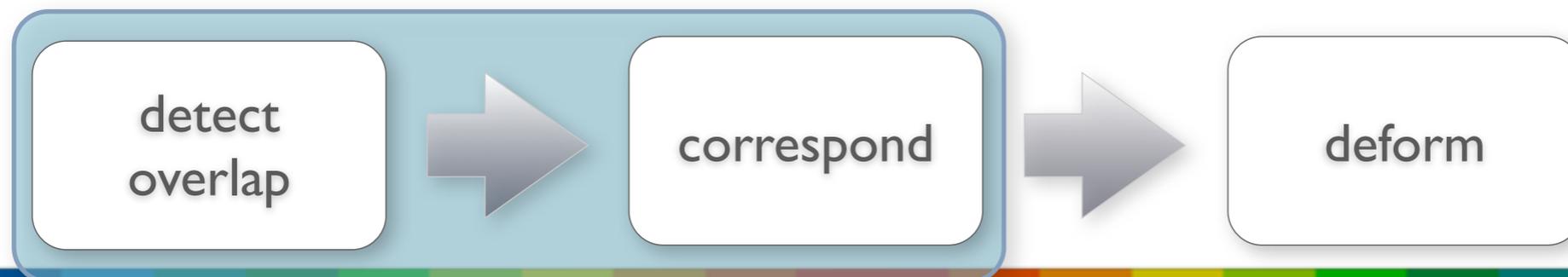
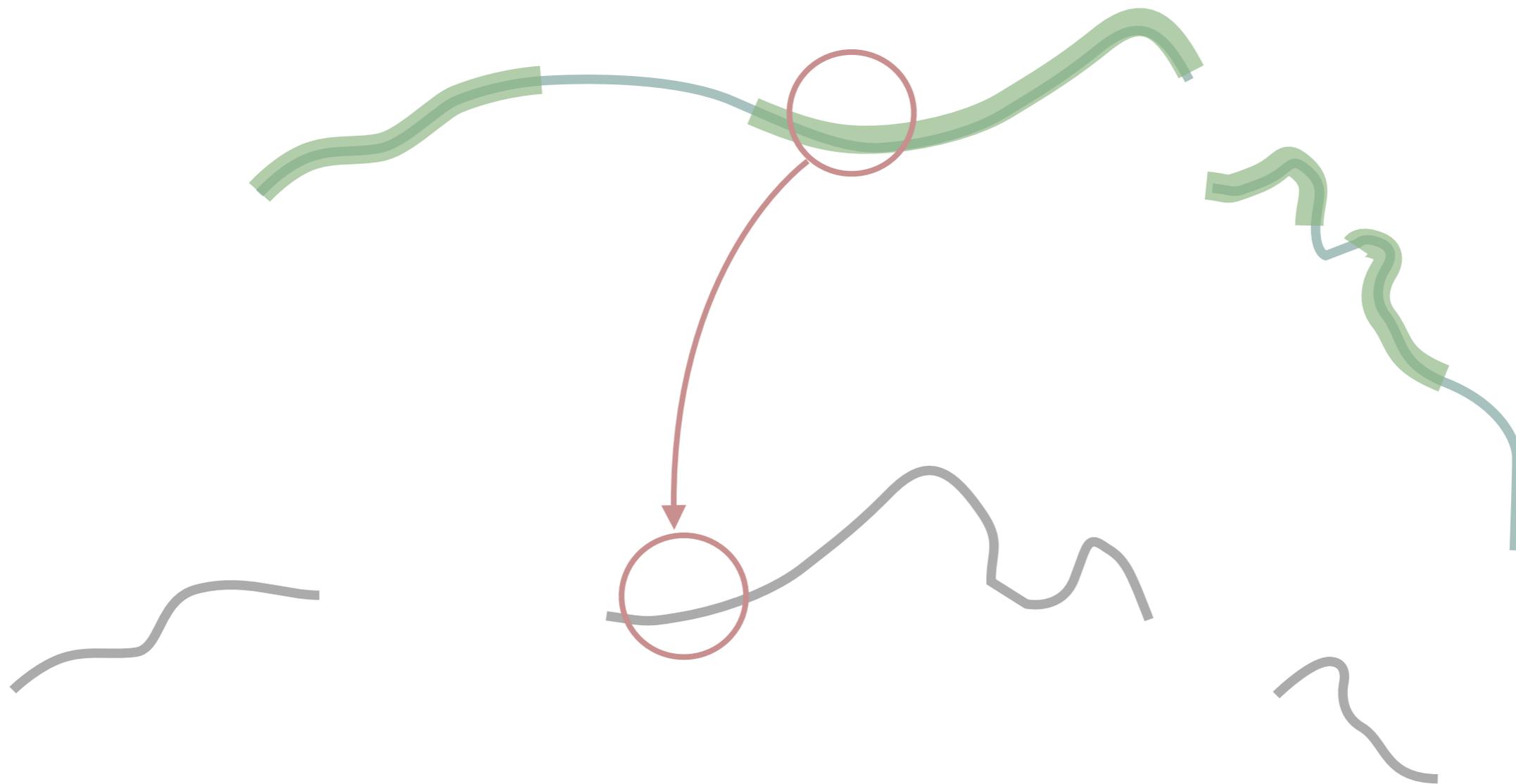
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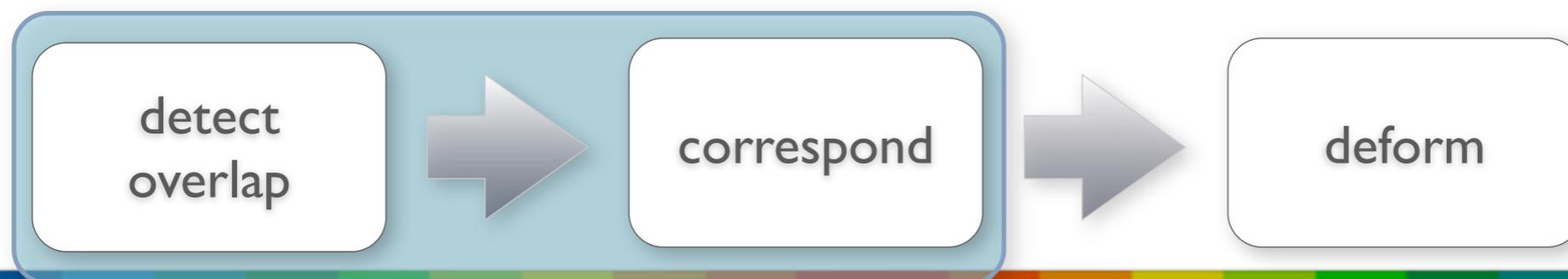
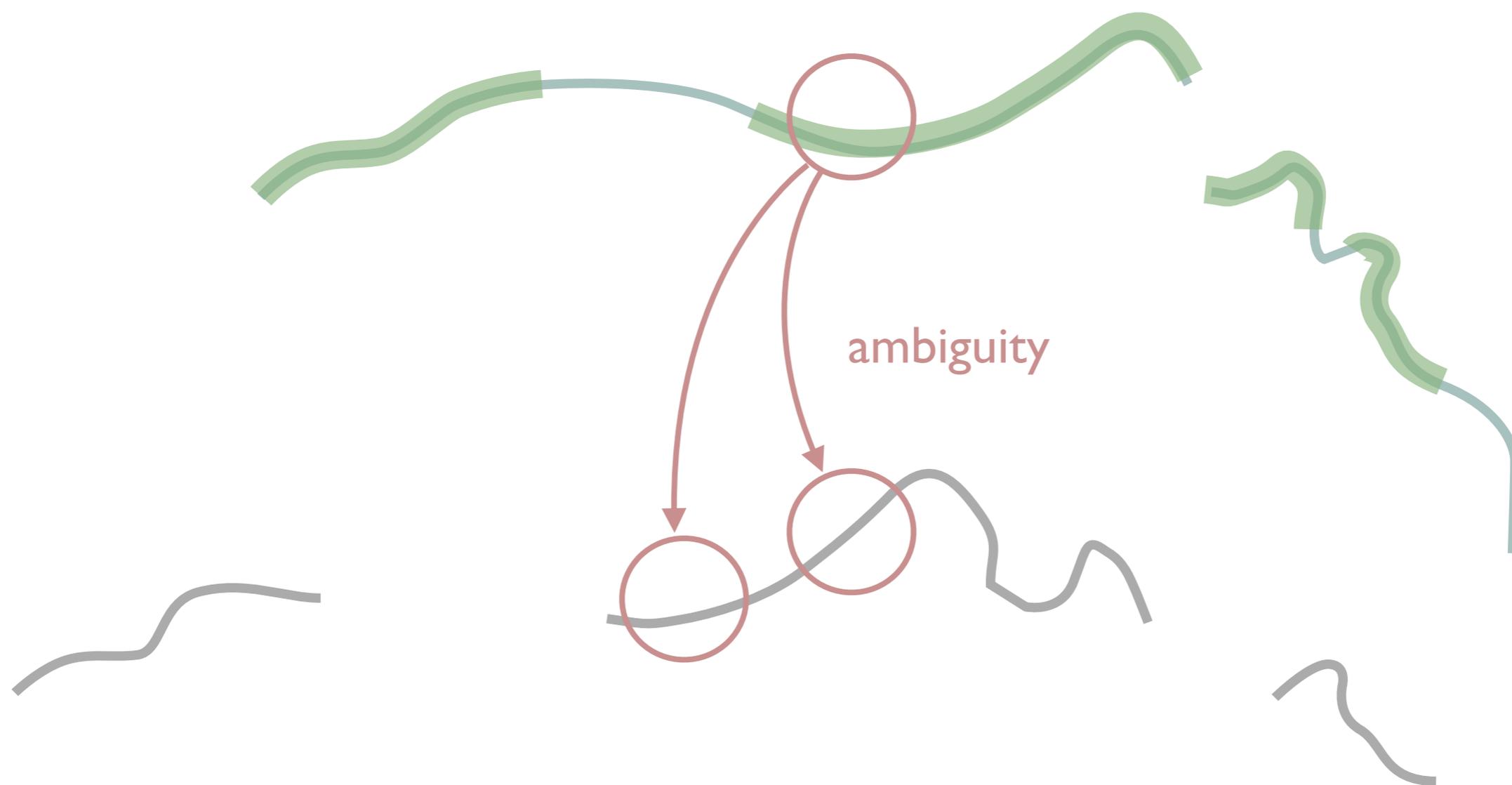
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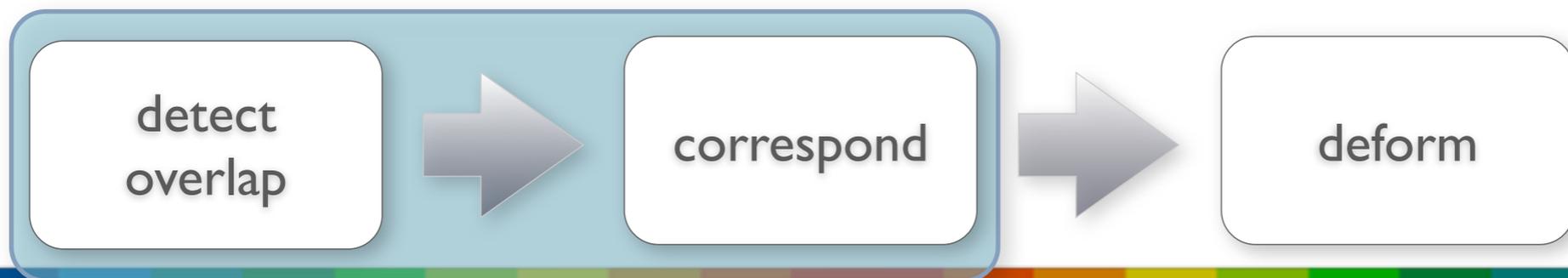
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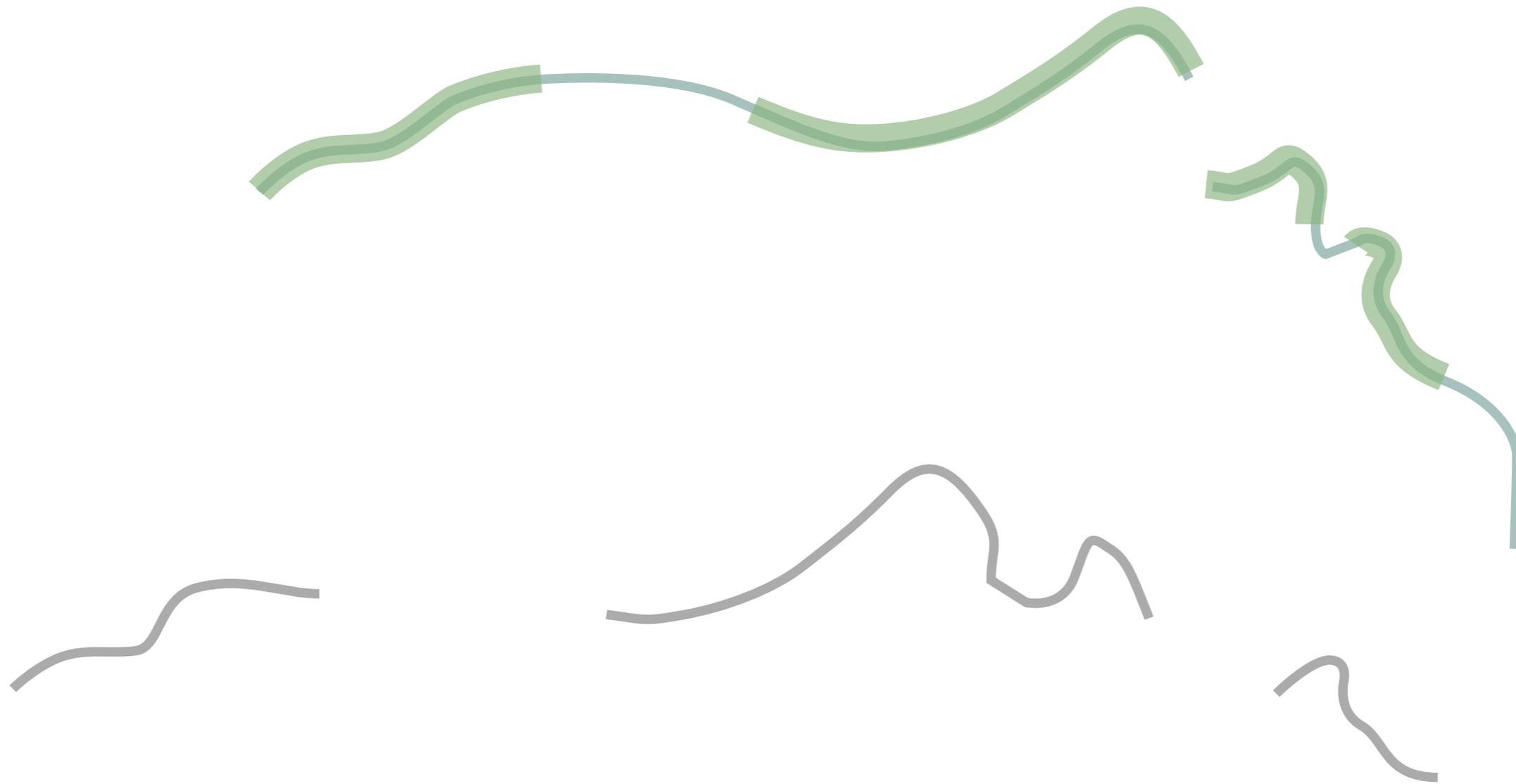
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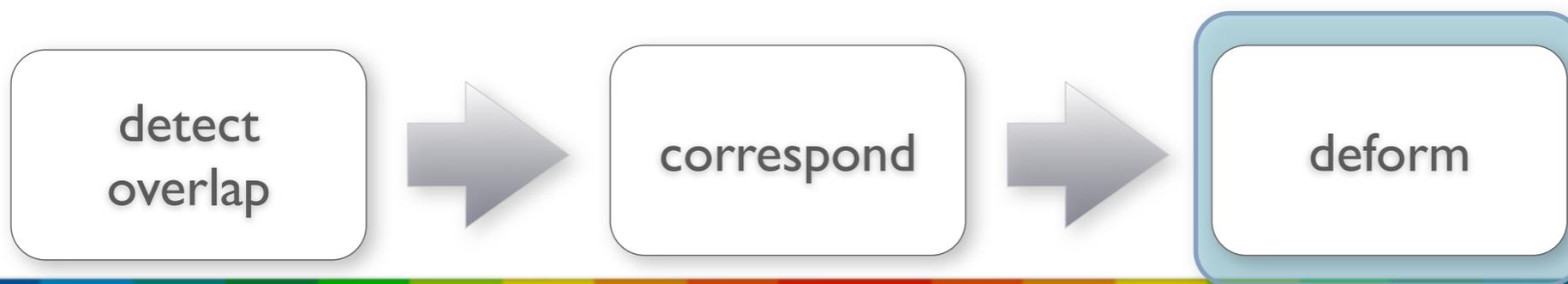
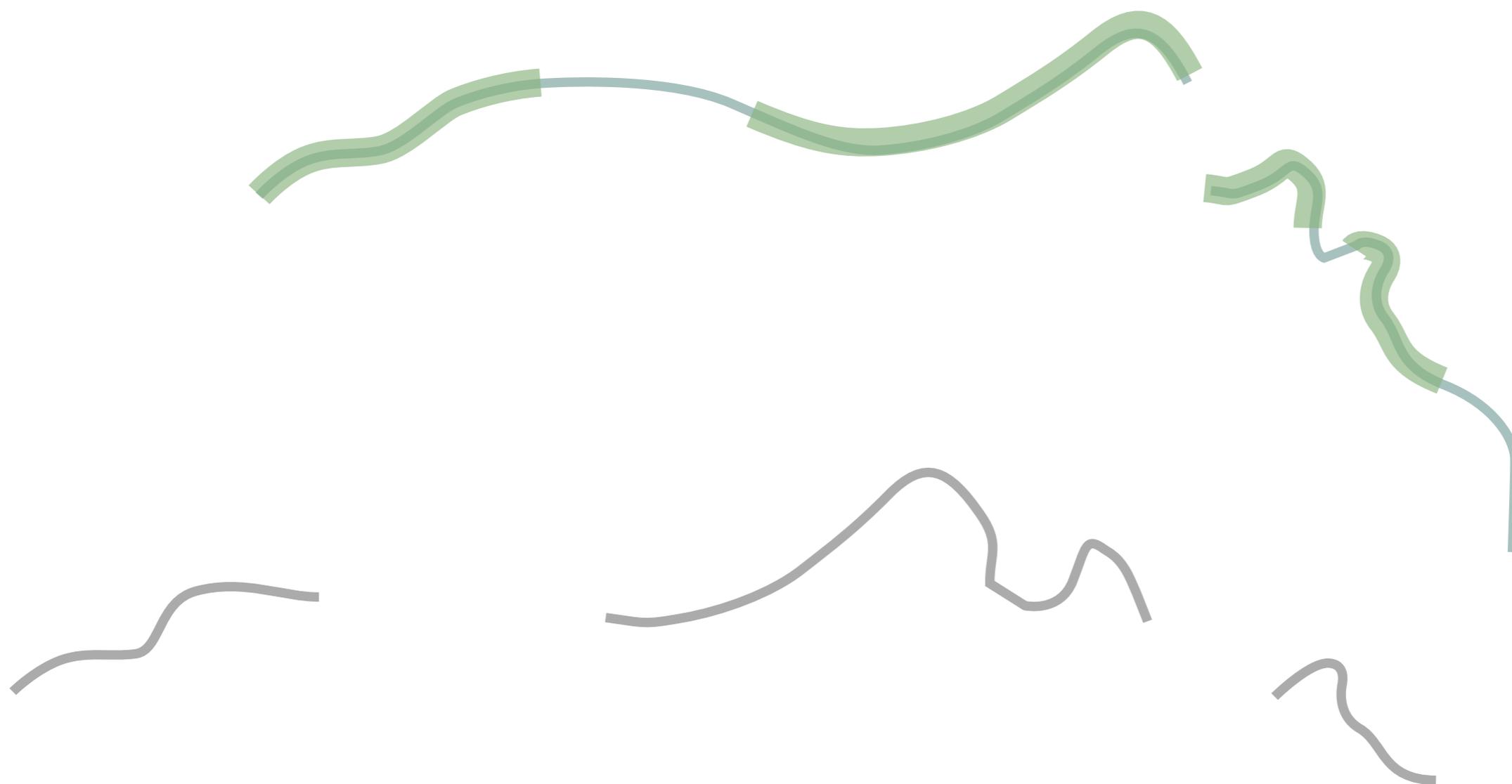
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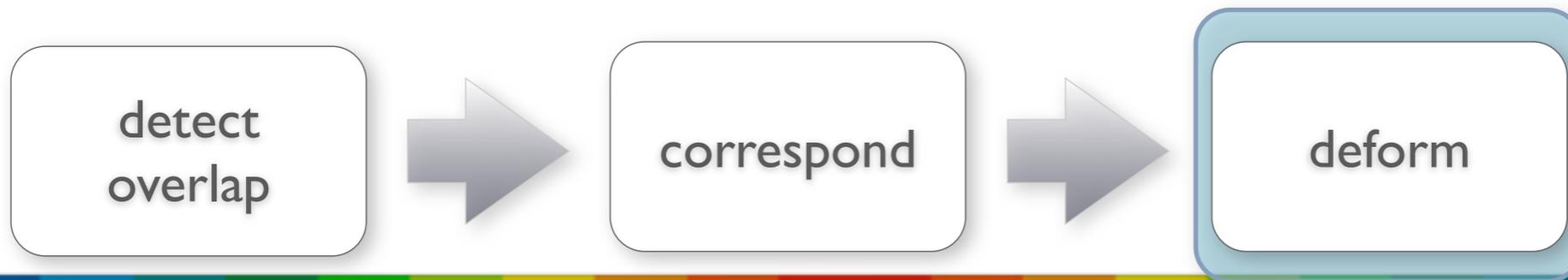
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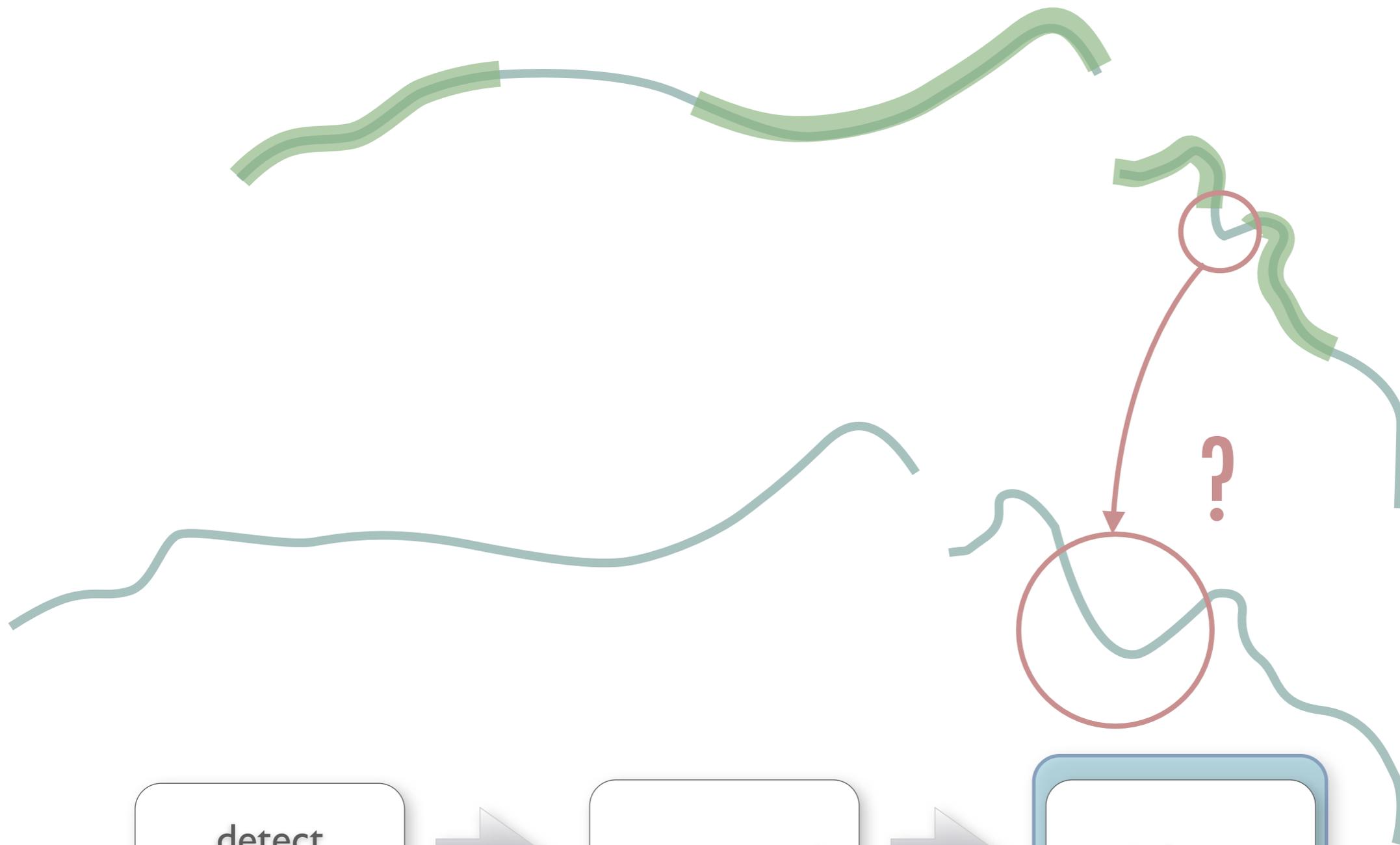
# Challenges



# Challenges



# Challenges



detect  
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correspond



deform

# Challenges

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correspond

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# Challenges

correspond

detect  
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deform

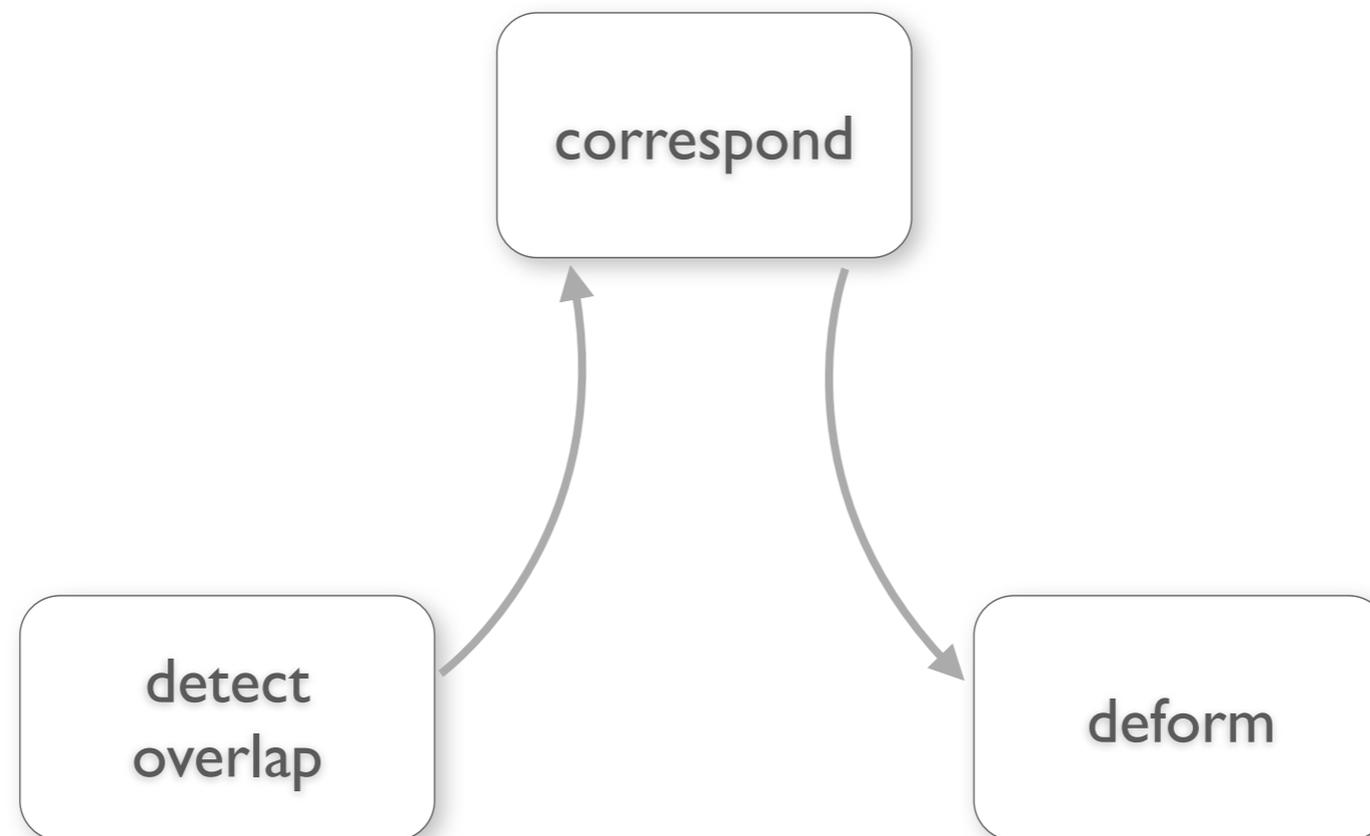
# Observation

correspond

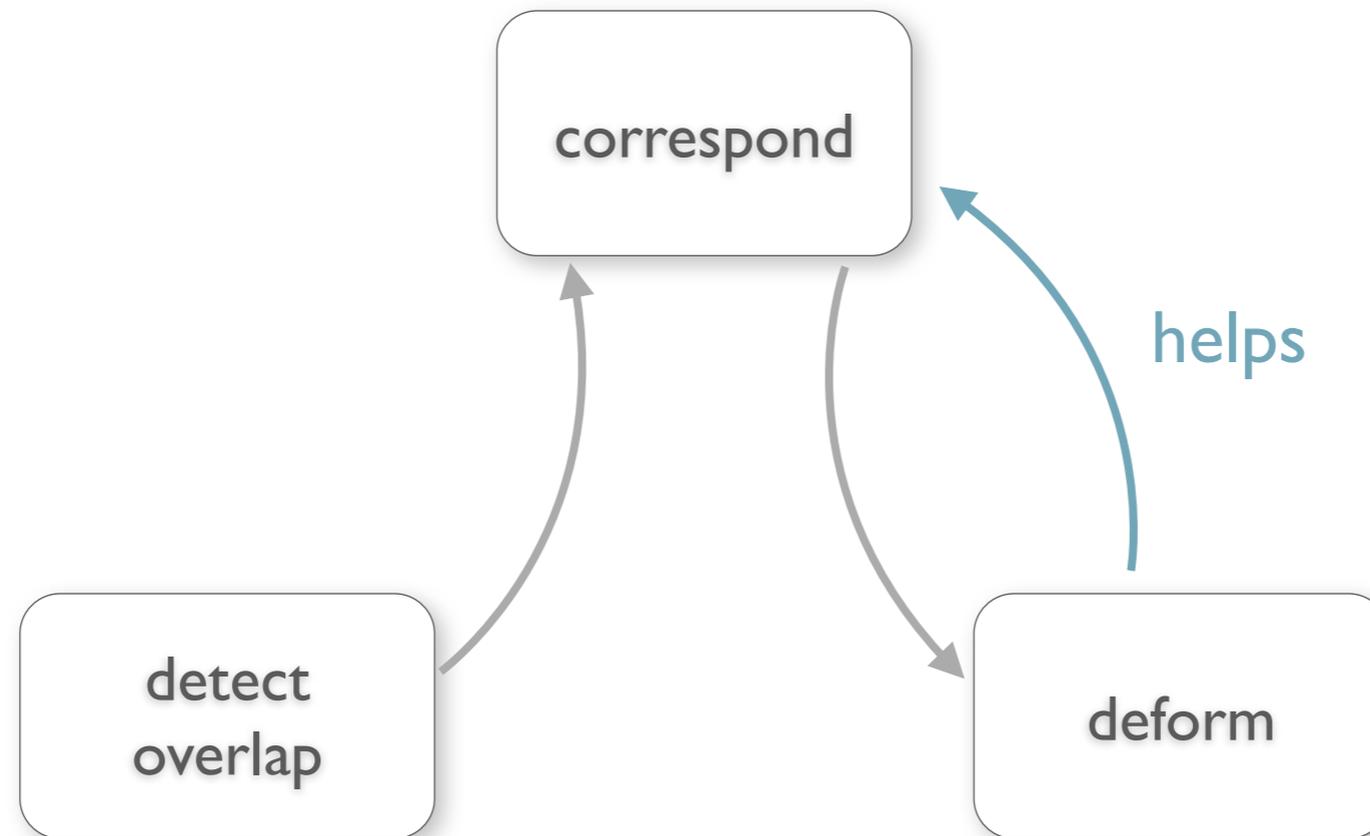
detect  
overlap

deform

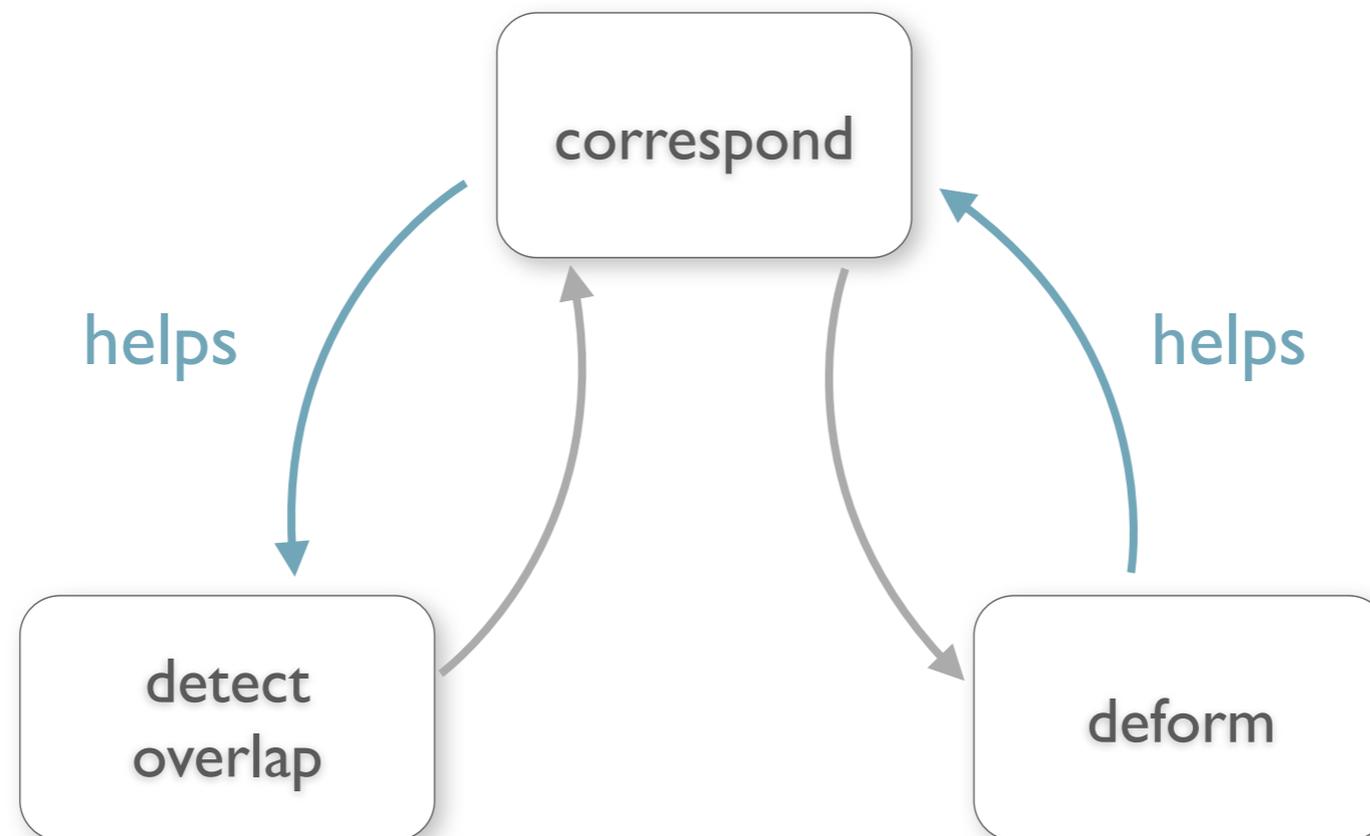
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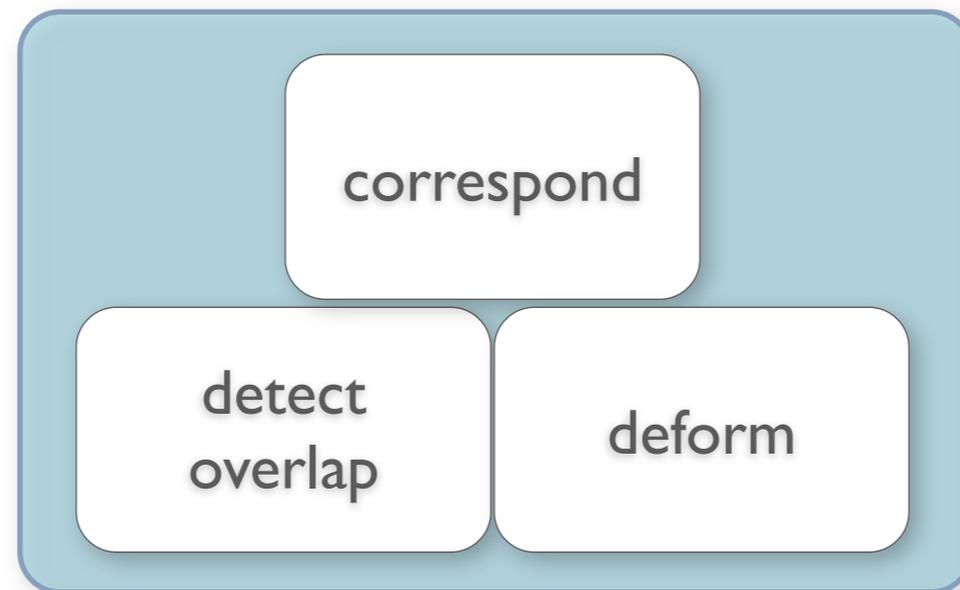
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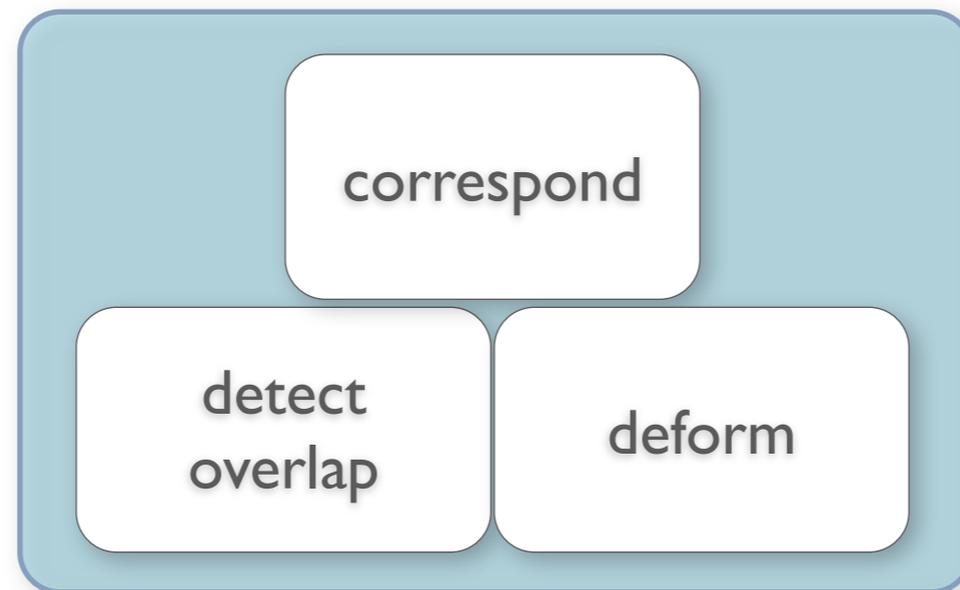
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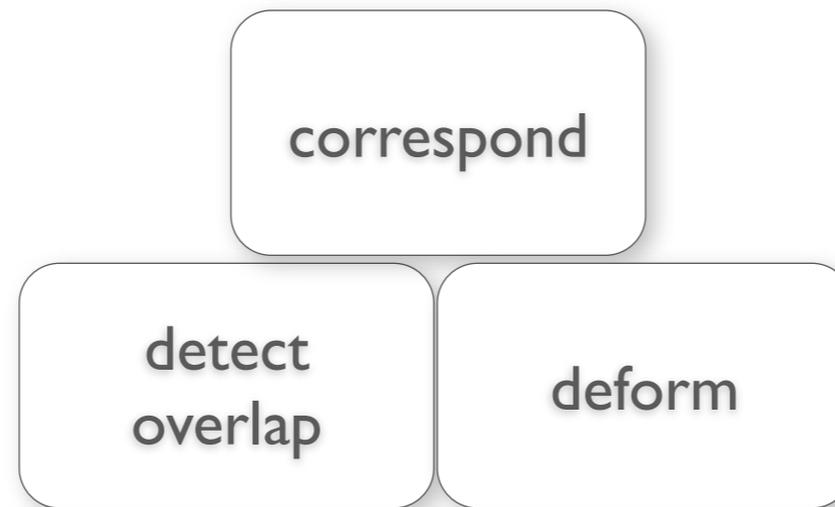


# Observation



global optimization via local refinement

# Iterative Global Optimization



# Iterative Global Optimization

correspond

detect  
overlap

deform

# Iterative Global Optimization

correspond

detect  
overlap

deform

# Iterative Global Optimization



correspond

detect  
overlap

deform

# Iterative Global Optimization



correspond

detect  
overlap

deform

# Iterative Global Optimization



correspond

detect  
overlap

deform

# Iterative Global Optimization

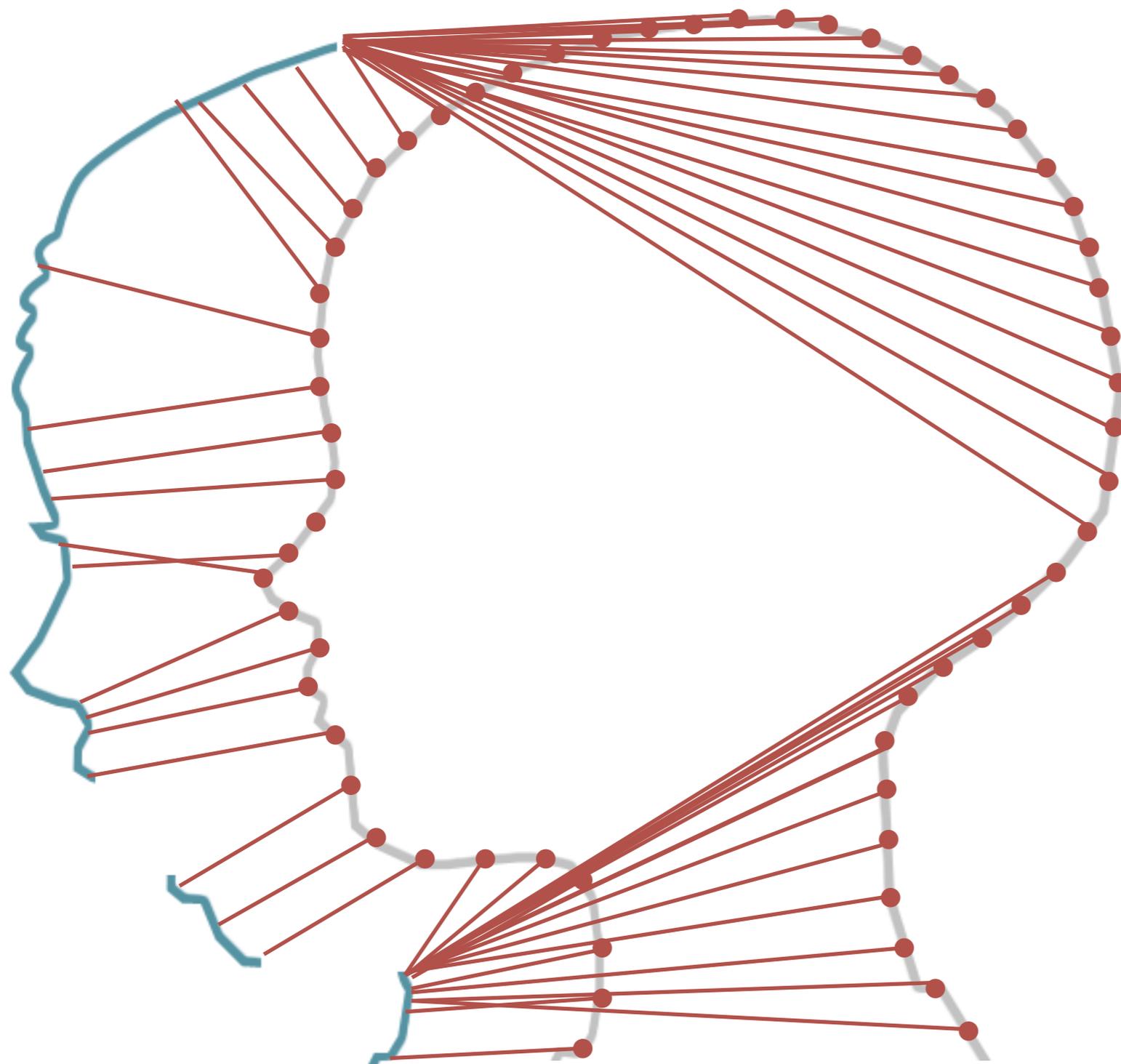


closest point

detect  
overlap

deform

# Iterative Global Optimization

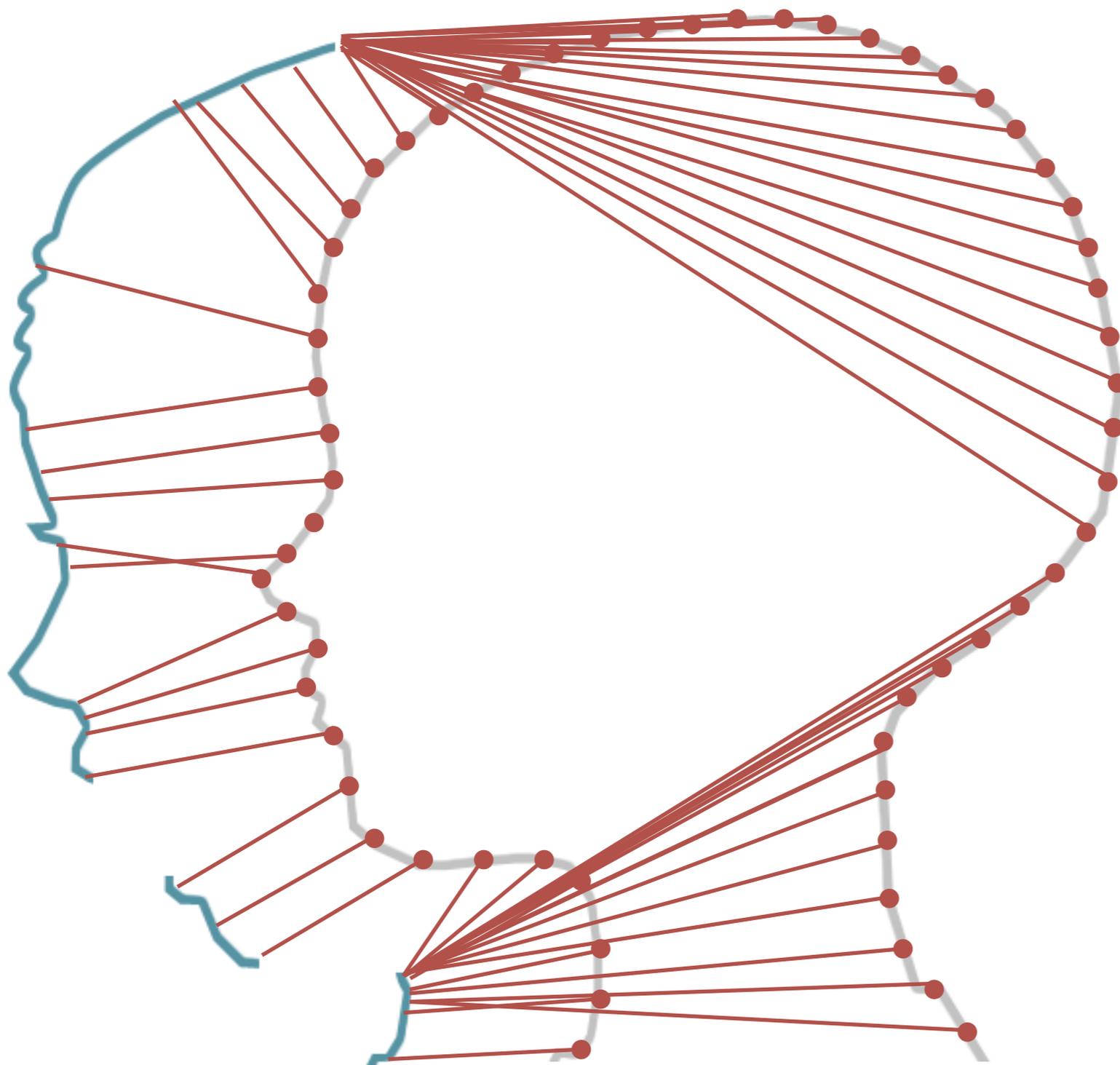


closest point

detect  
overlap

deform

# Iterative Global Optimization



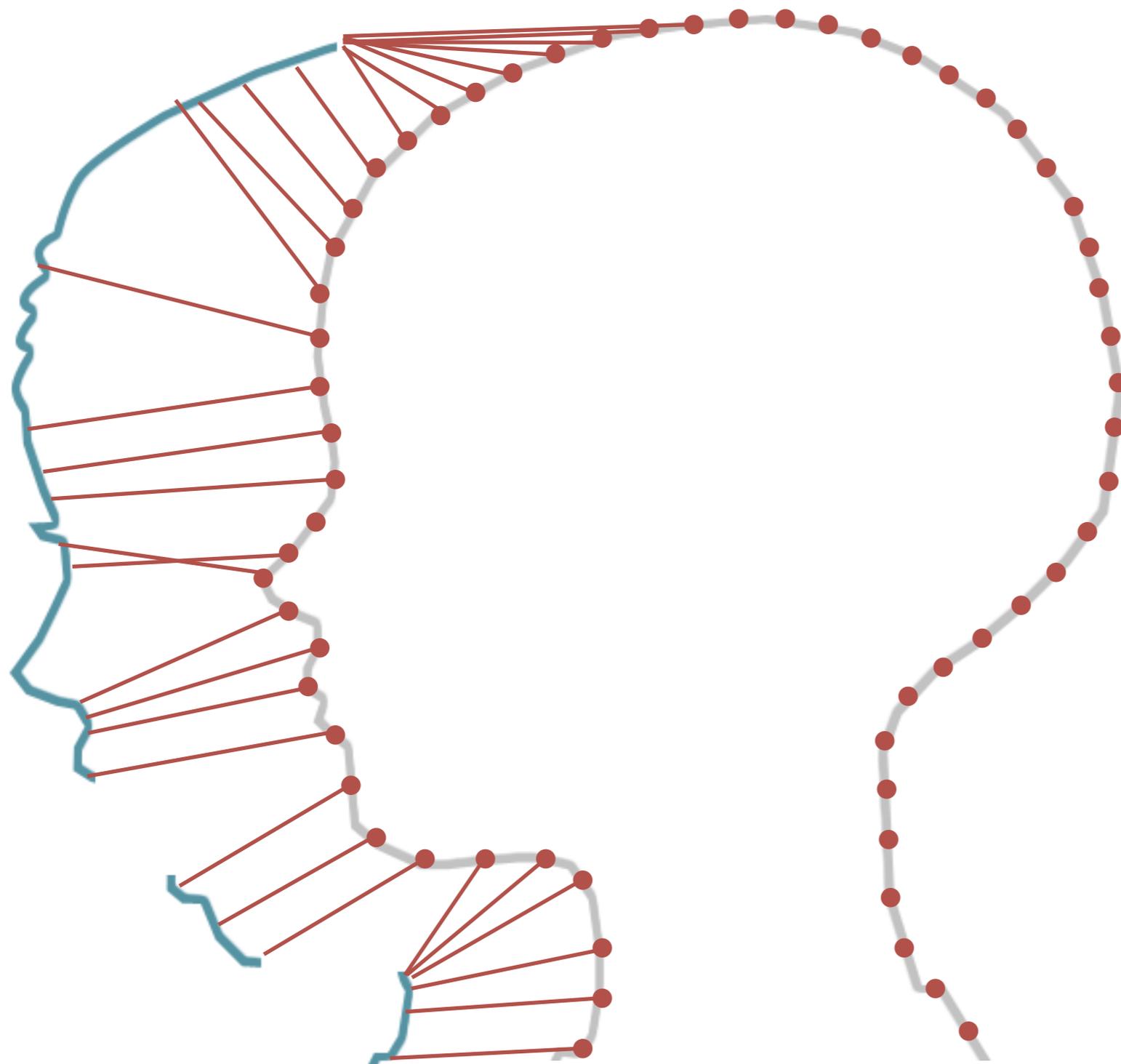
closest point



pruning

deform

# Iterative Global Optimization



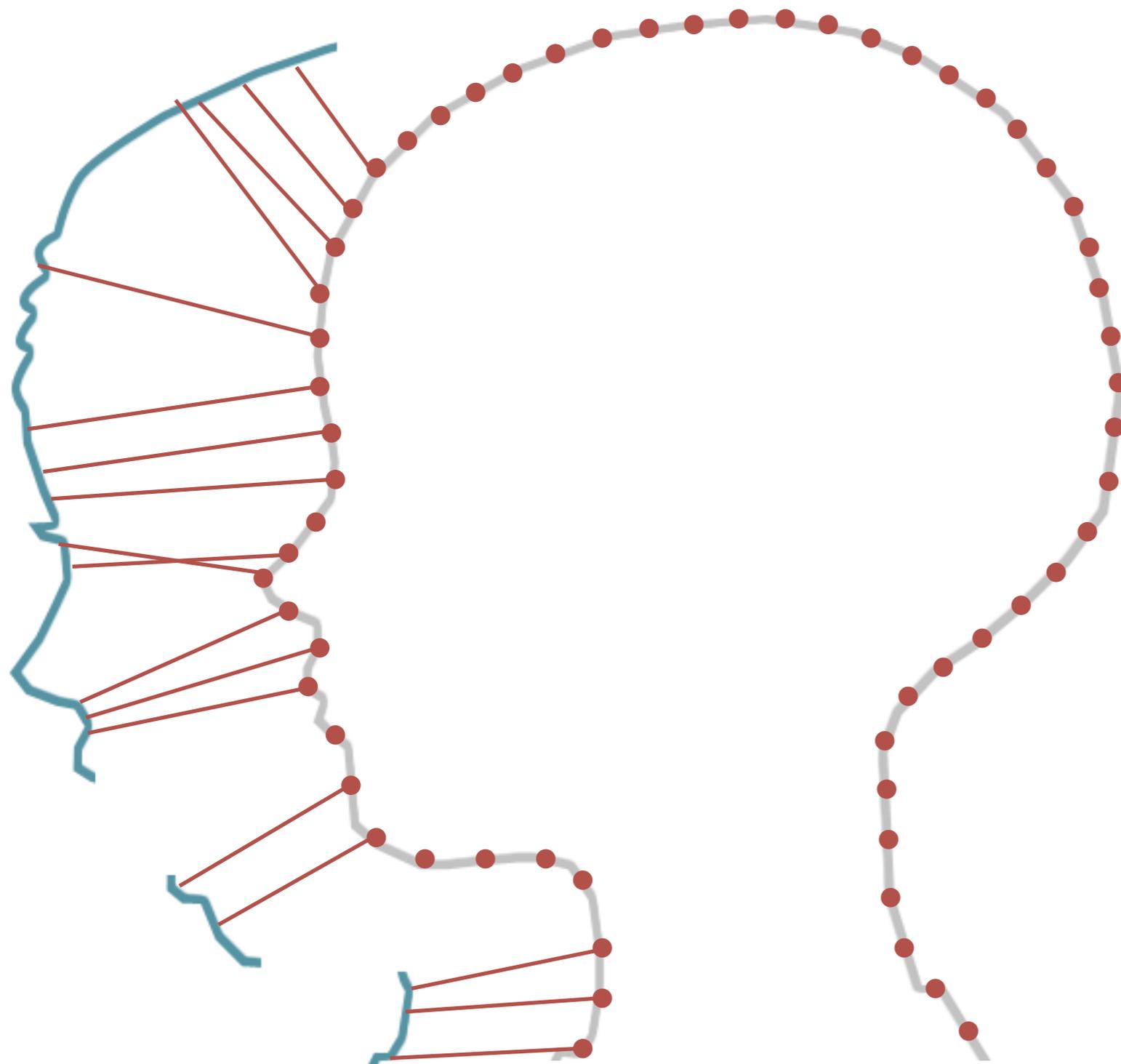
closest point



pruning

deform

# Iterative Global Optimization



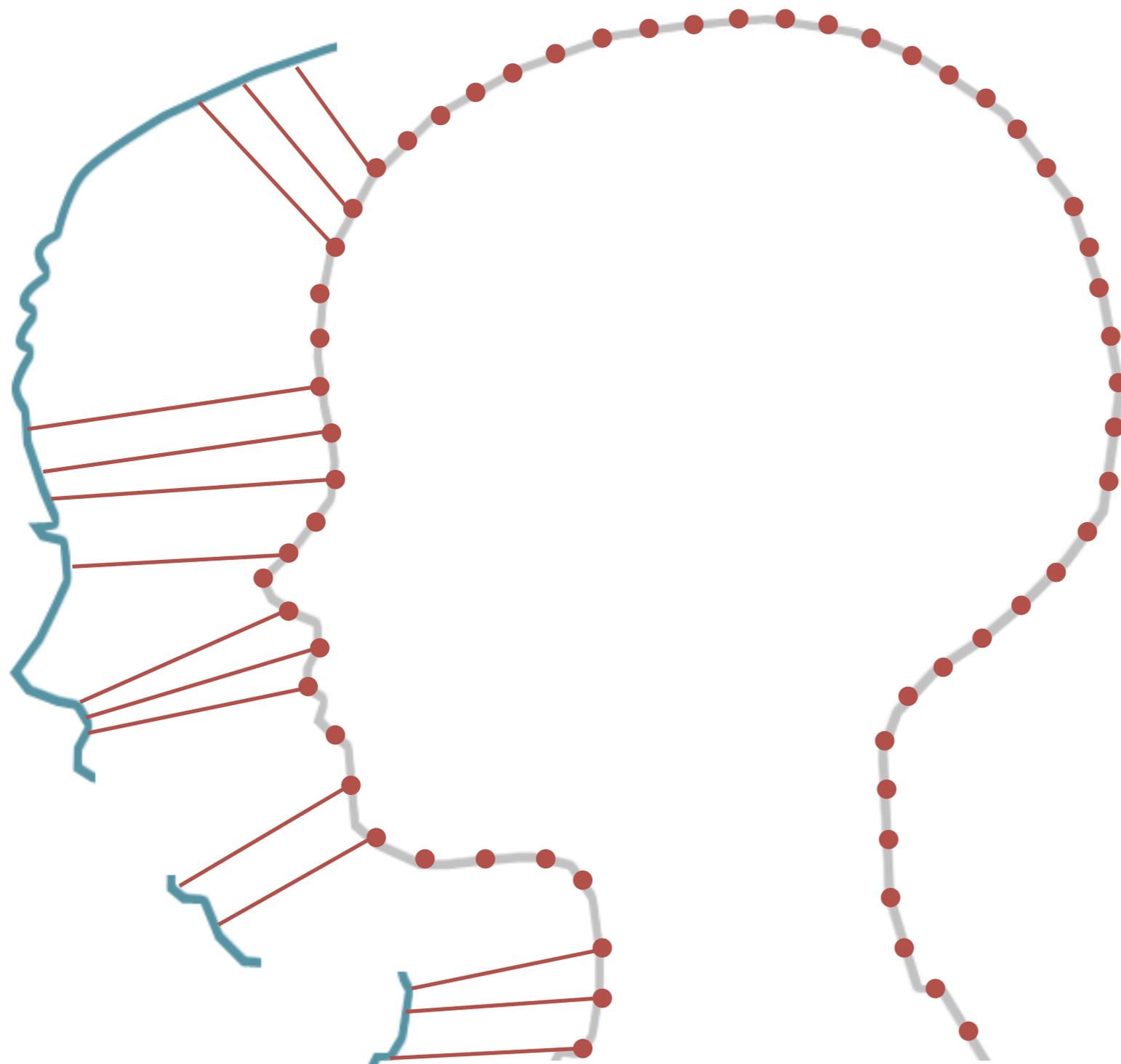
closest point



pruning

deform

# Iterative Global Optimization



closest point



pruning

deform

# Iterative Global Optimization



closest point



pruning

deform

# Iterative Global Optimization



closest point



pruning



global  
optimization

# Iterative Global Optimization



closest point

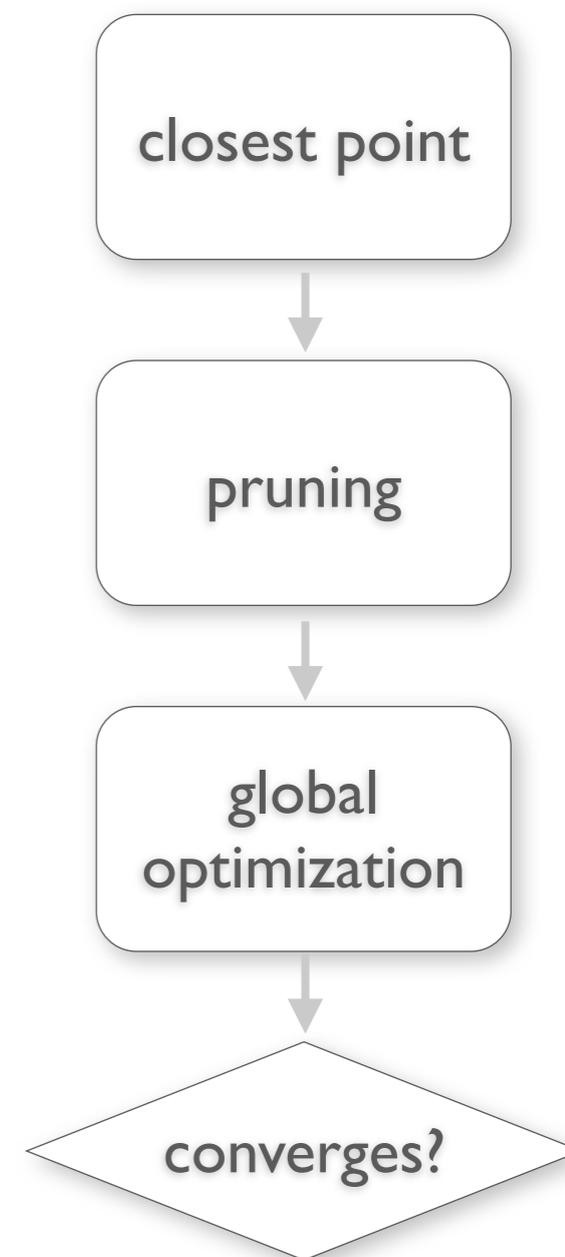


pruning

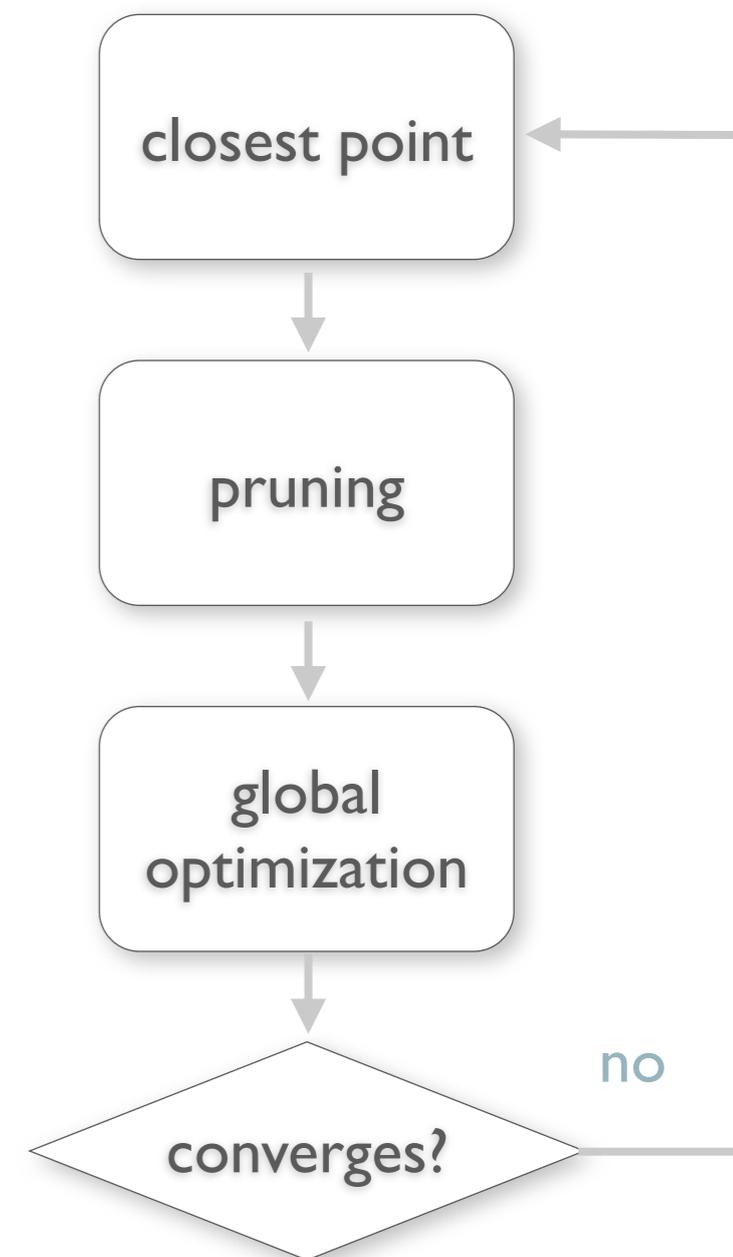


global  
optimization

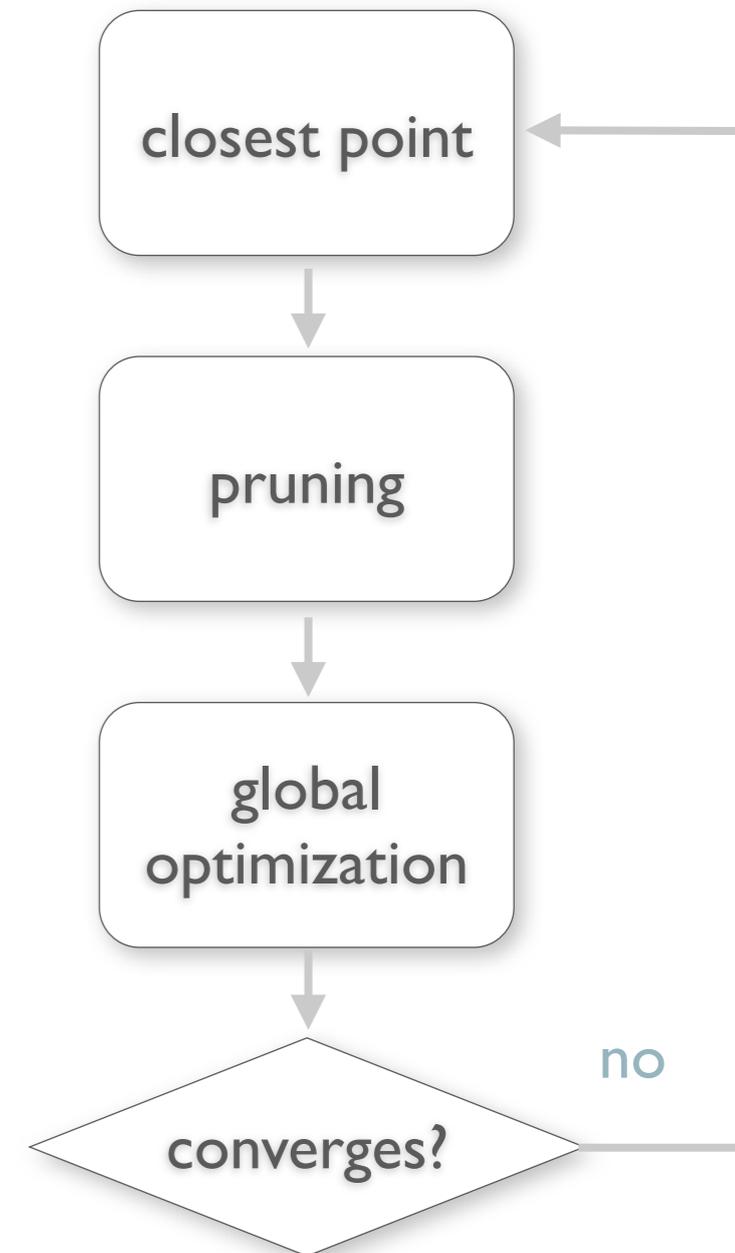
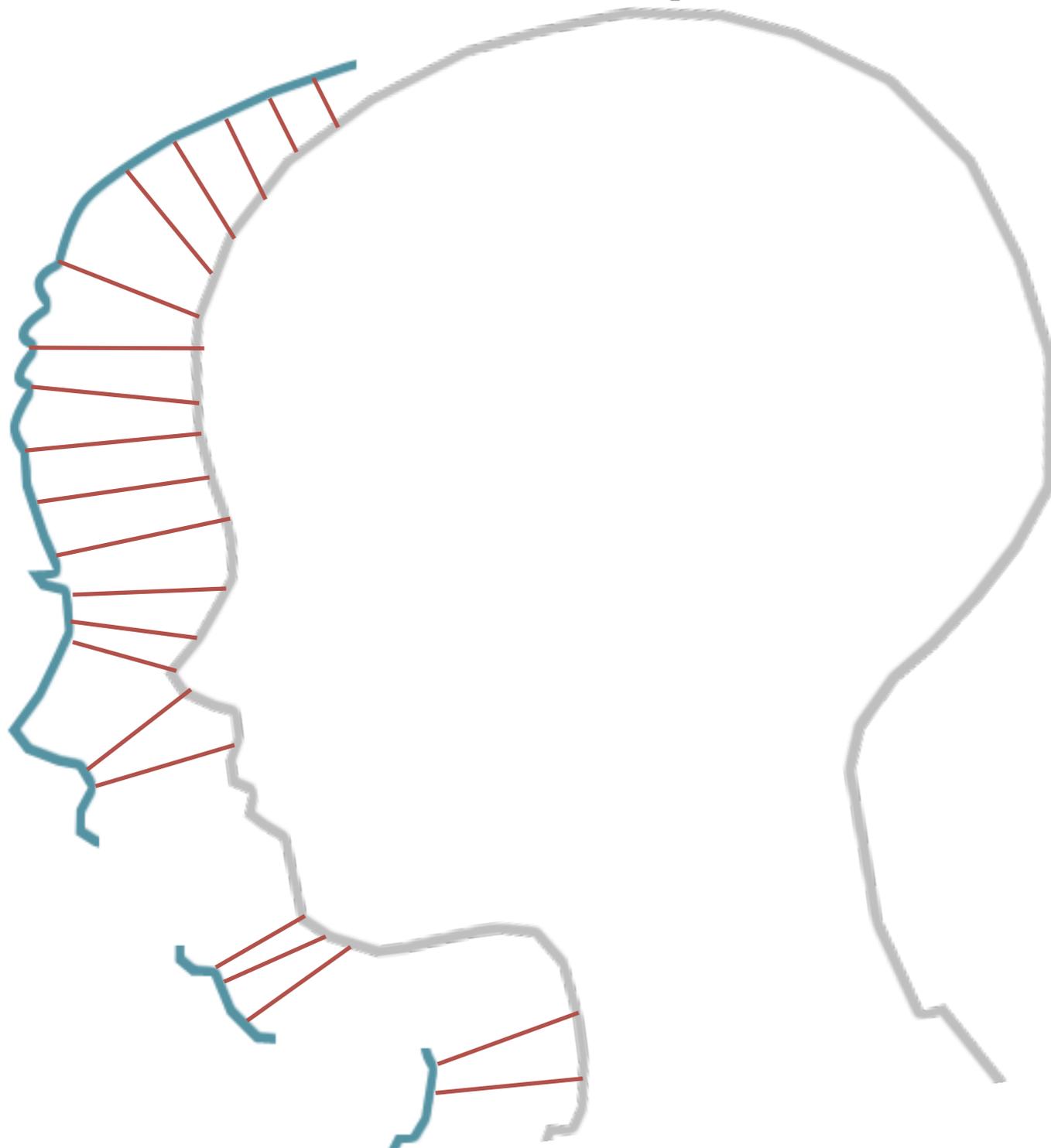
# Iterative Global Optimization



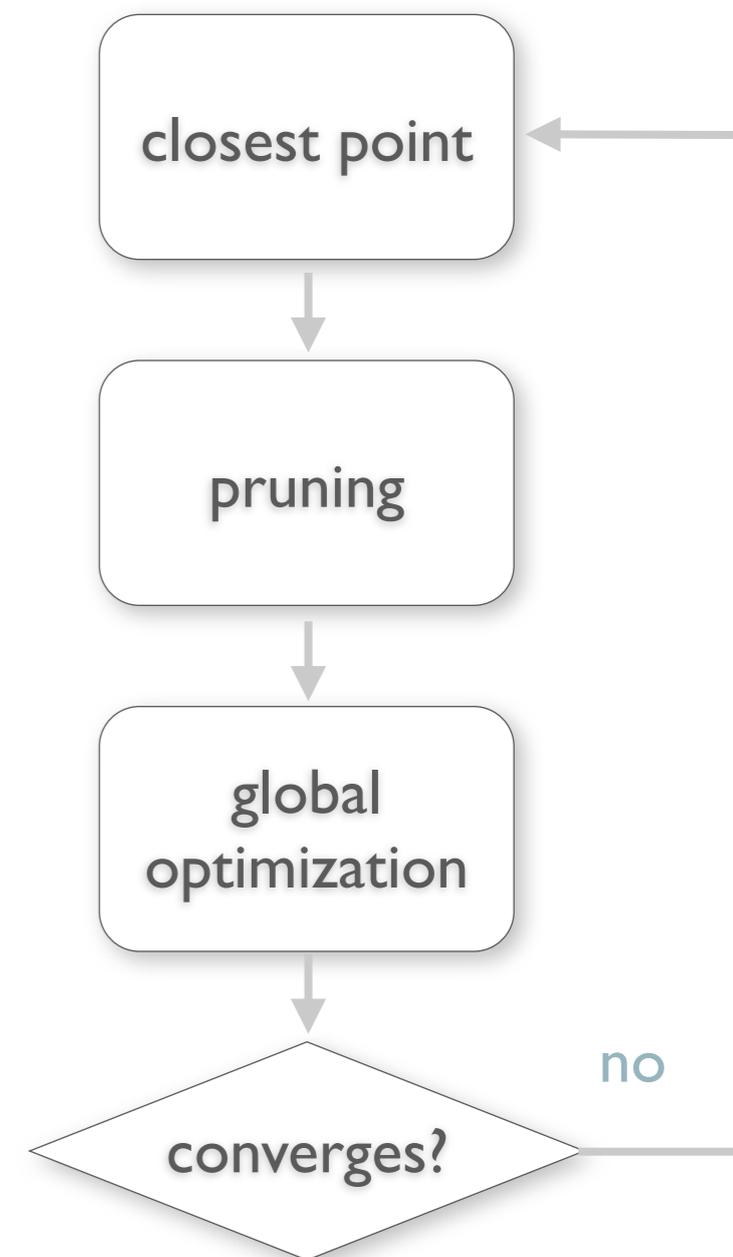
# Iterative Global Optimization



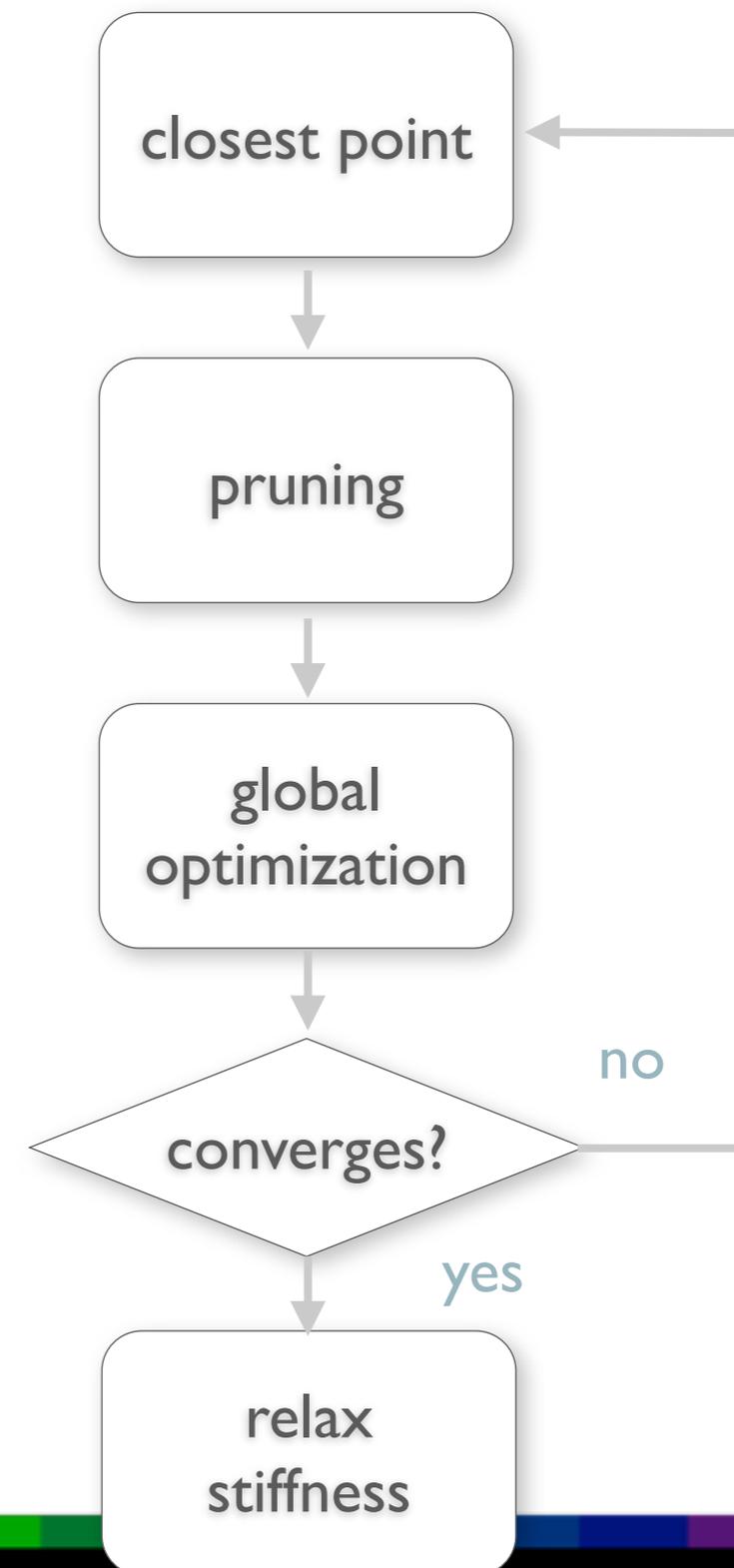
# Iterative Global Optimization



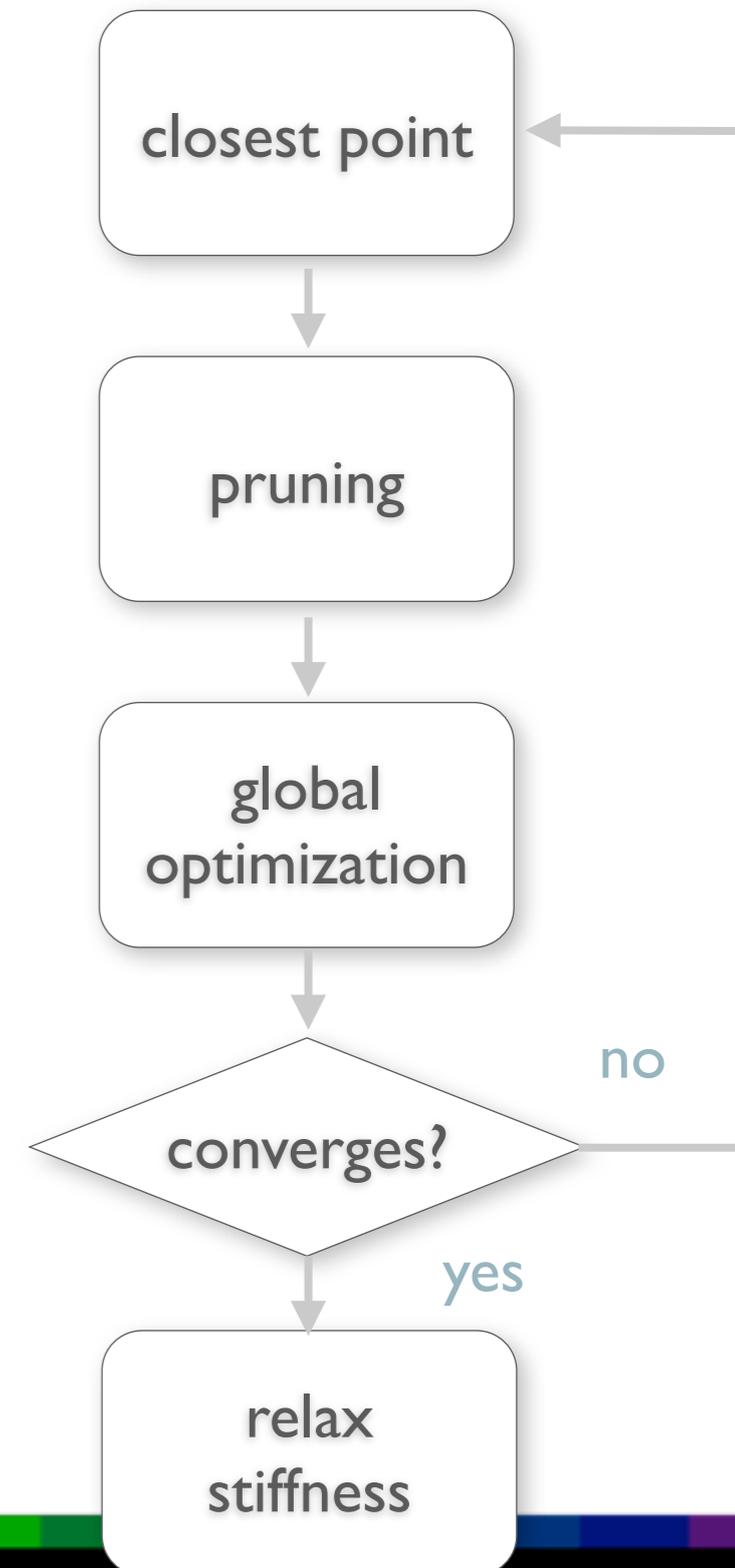
# Iterative Global Optimization



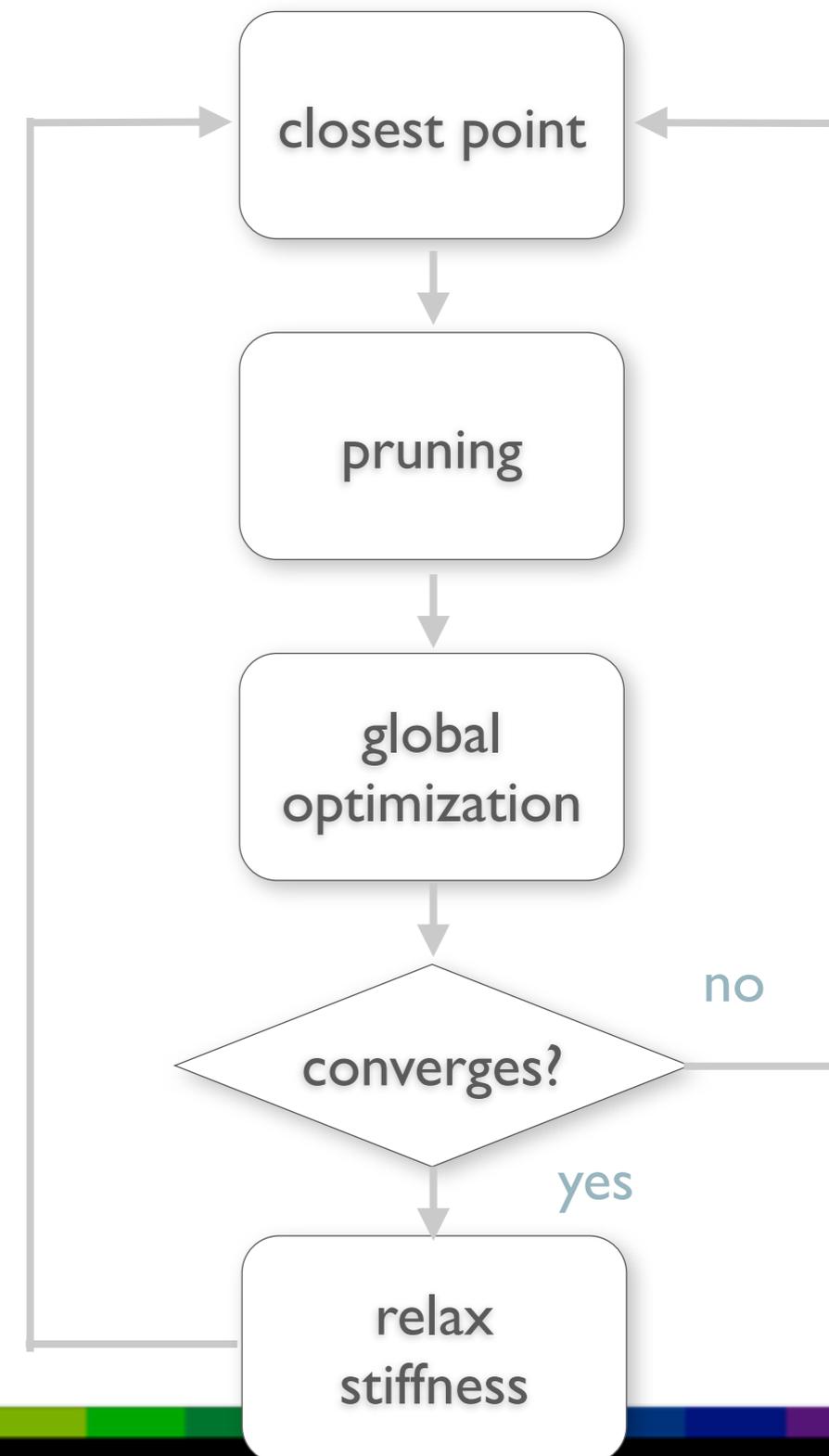
# Iterative Global Optimization



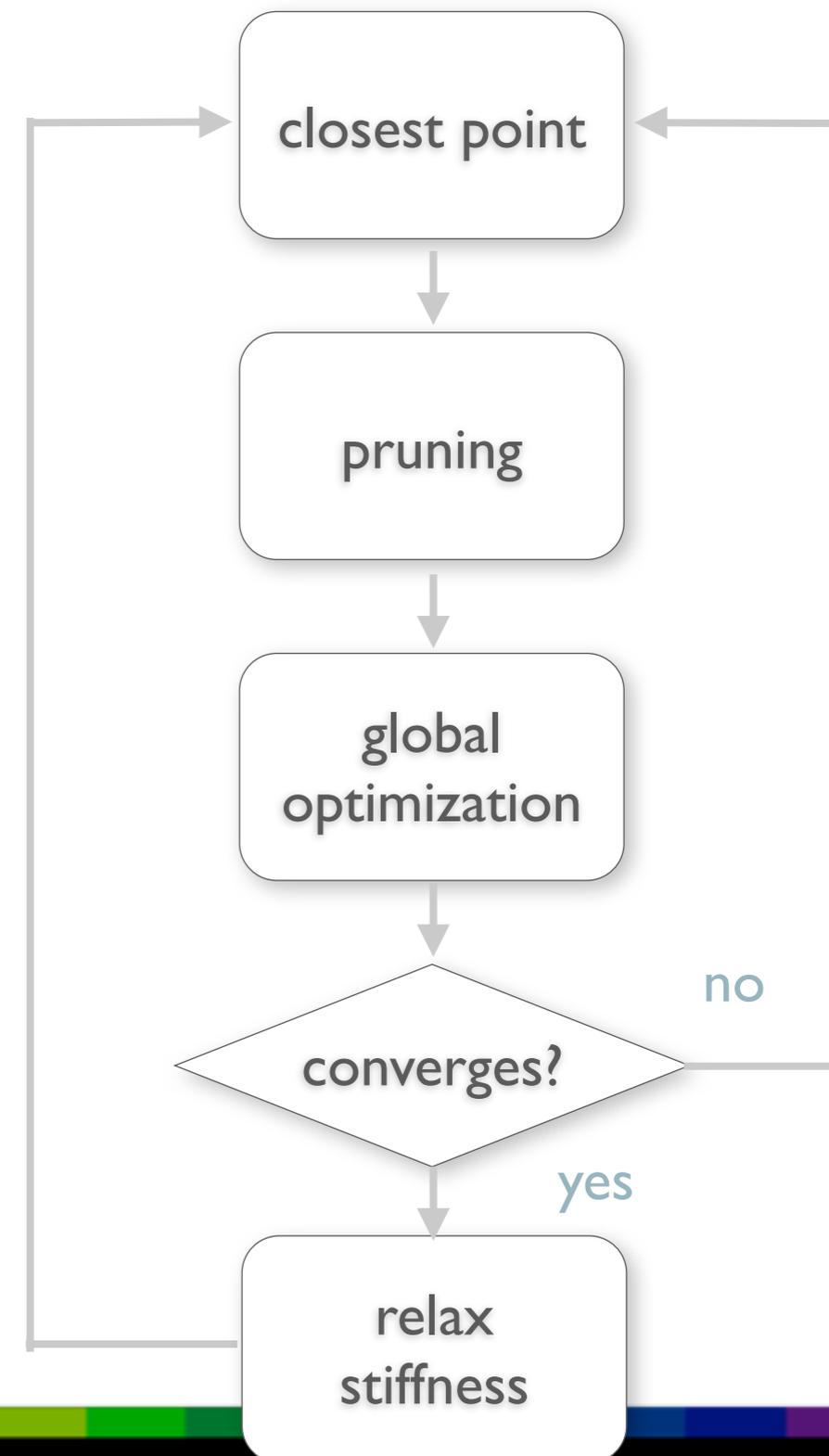
# Iterative Global Optimization



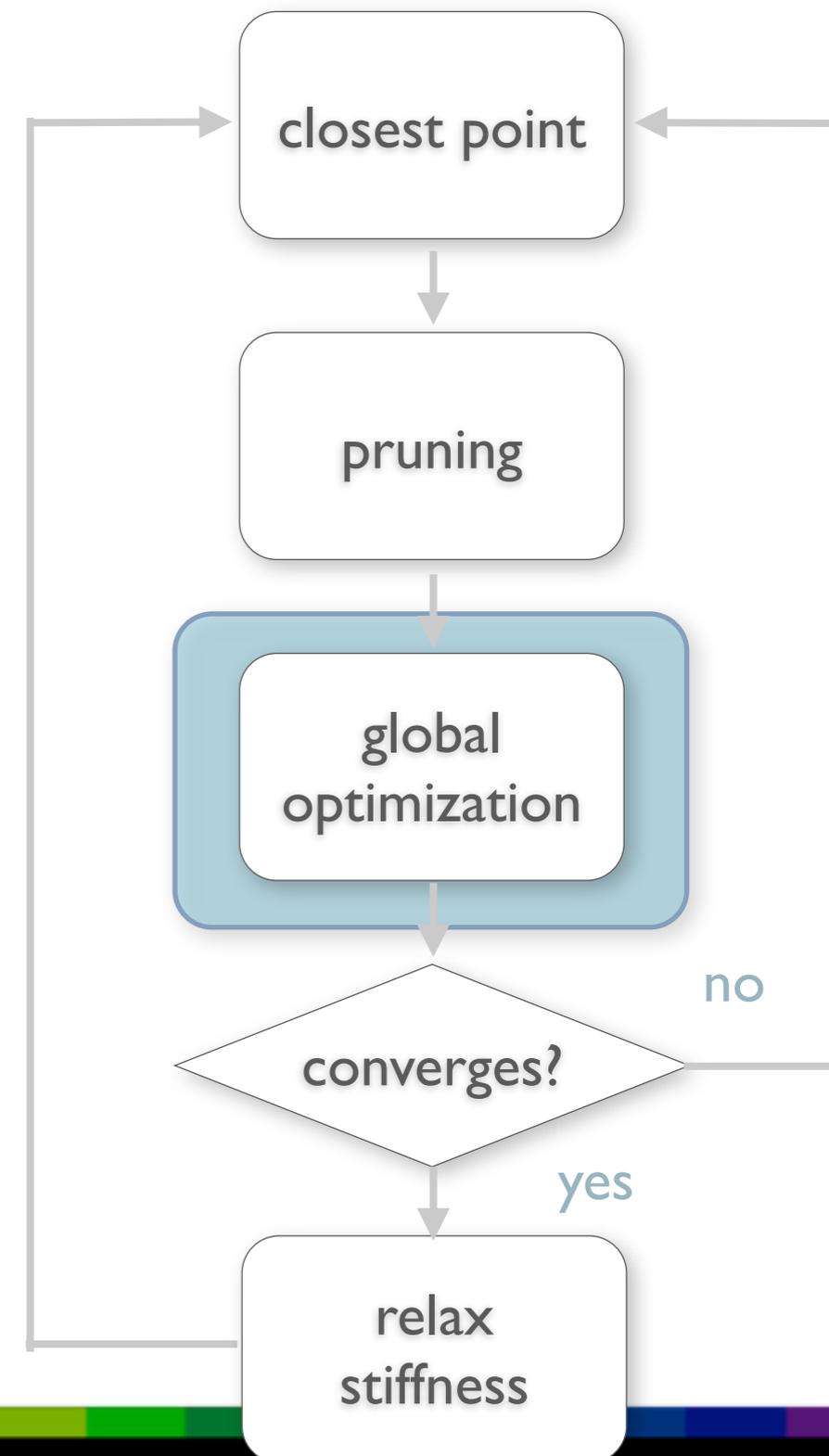
# Iterative Global Optimization



# Iterative Global Optimization



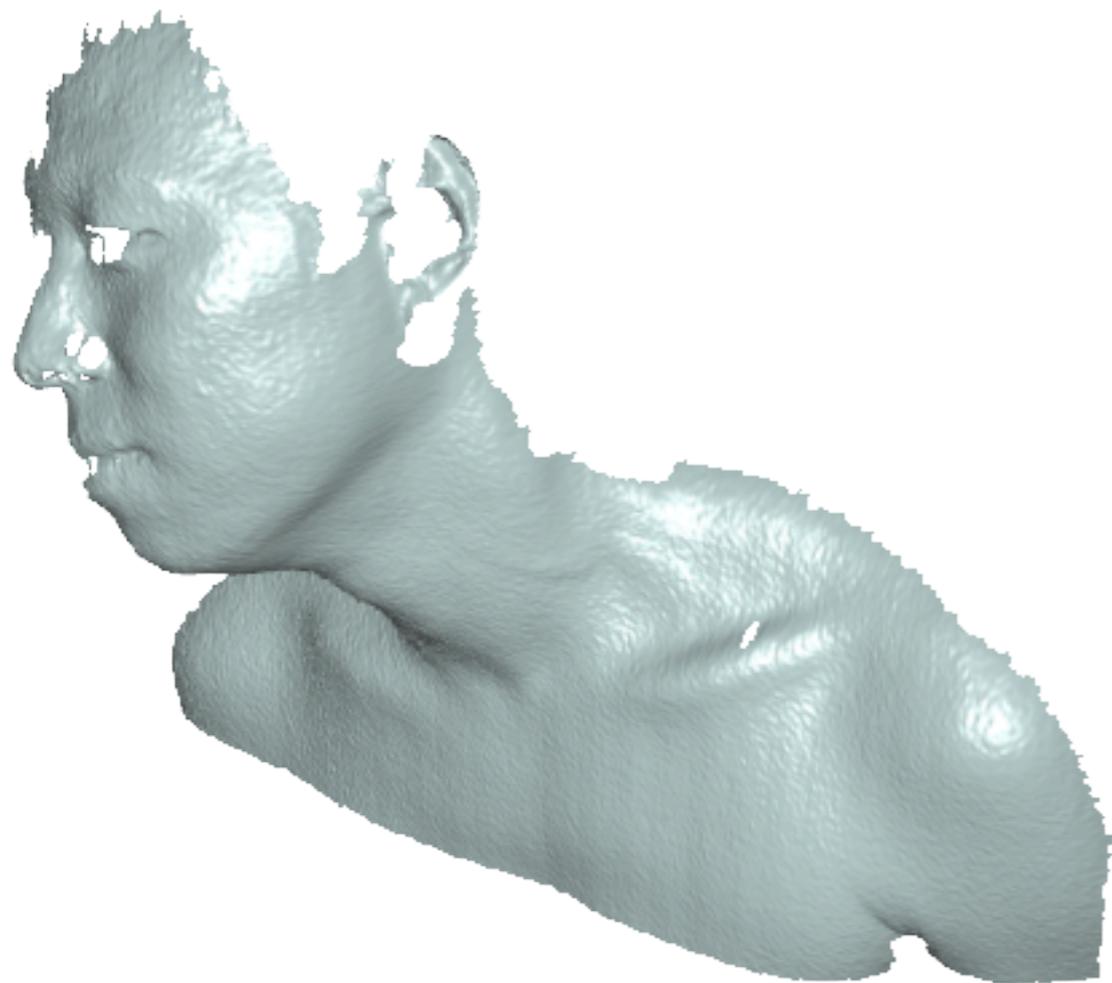
# Iterative Global Optimization



# Embedded Deformation Model

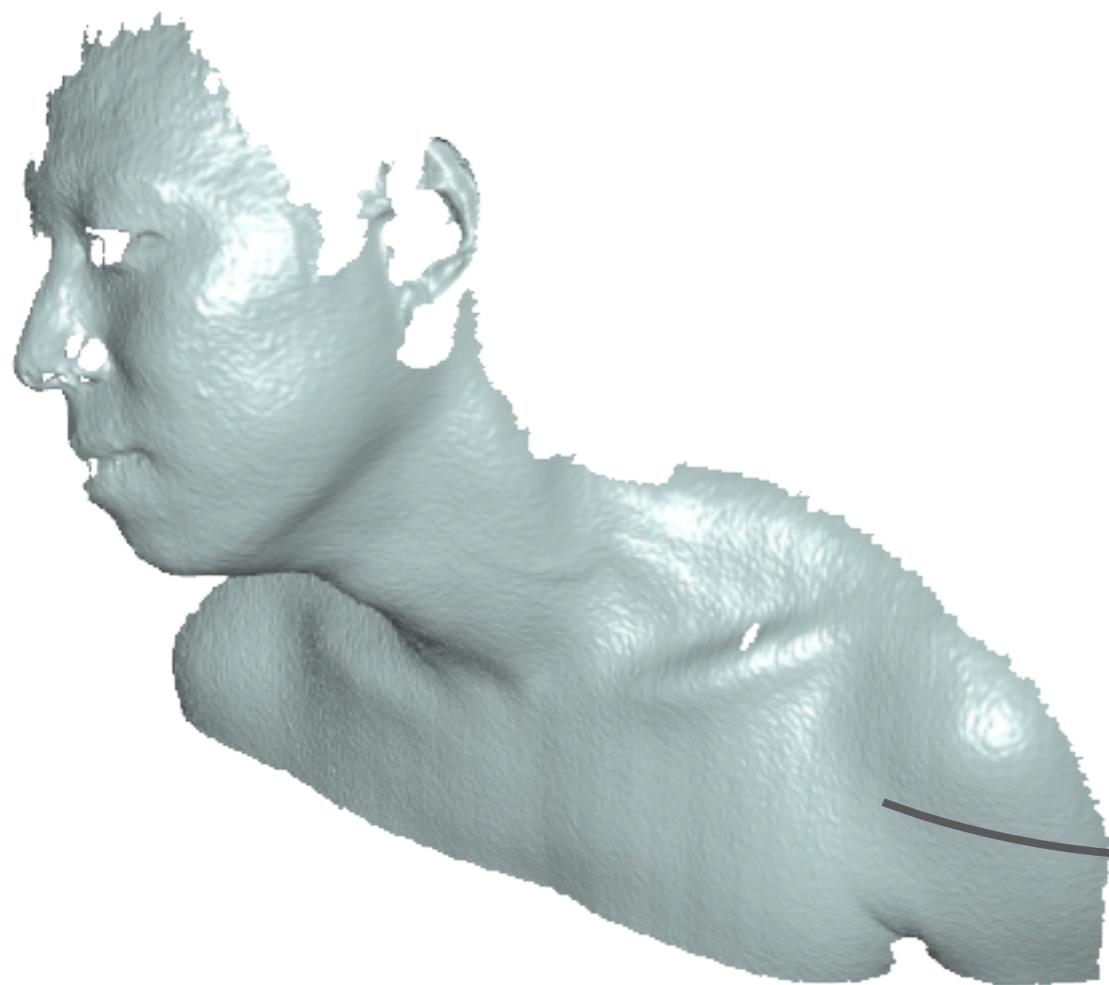
detail preservation  
global consistency

# Embedded Deformation Model



detail preservation  
global consistency

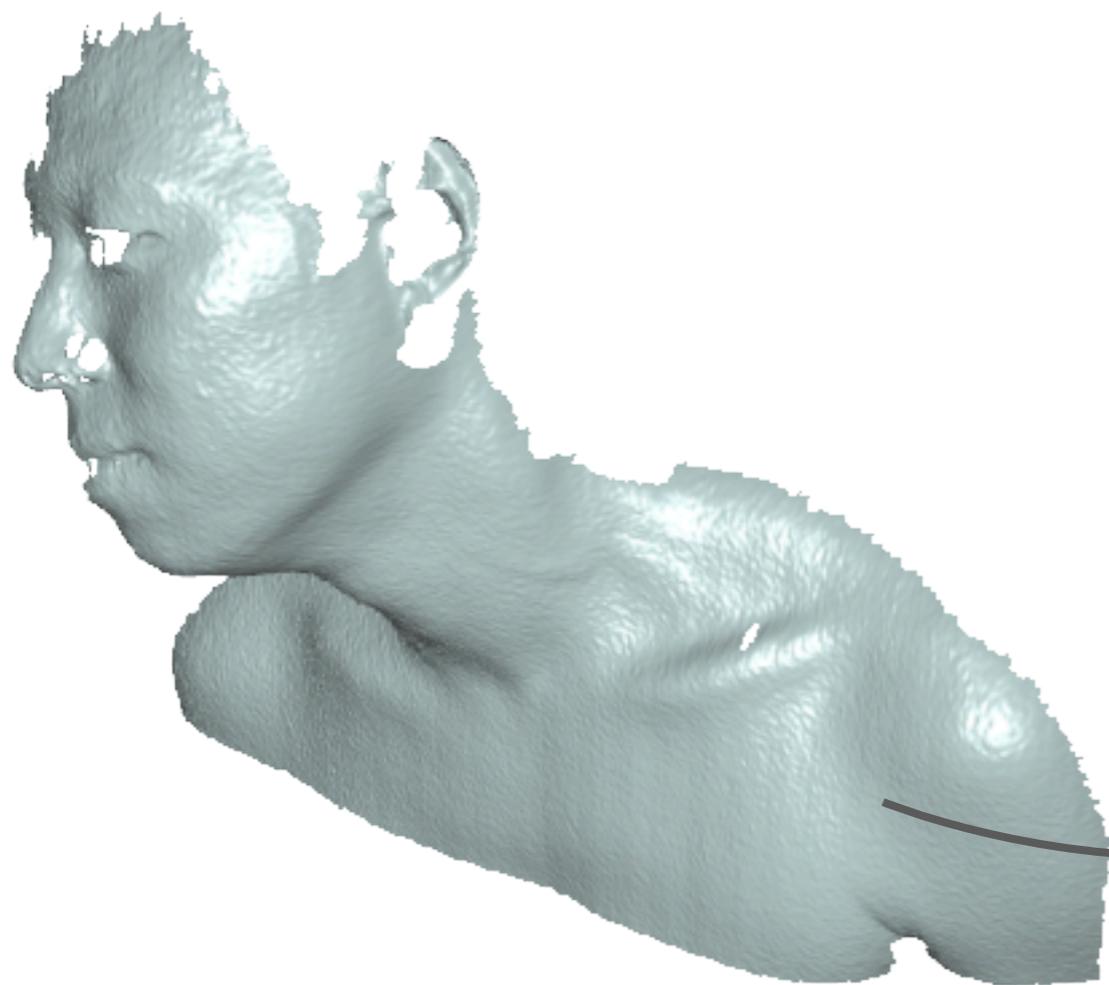
# Embedded Deformation Model



detail preservation  
global consistency



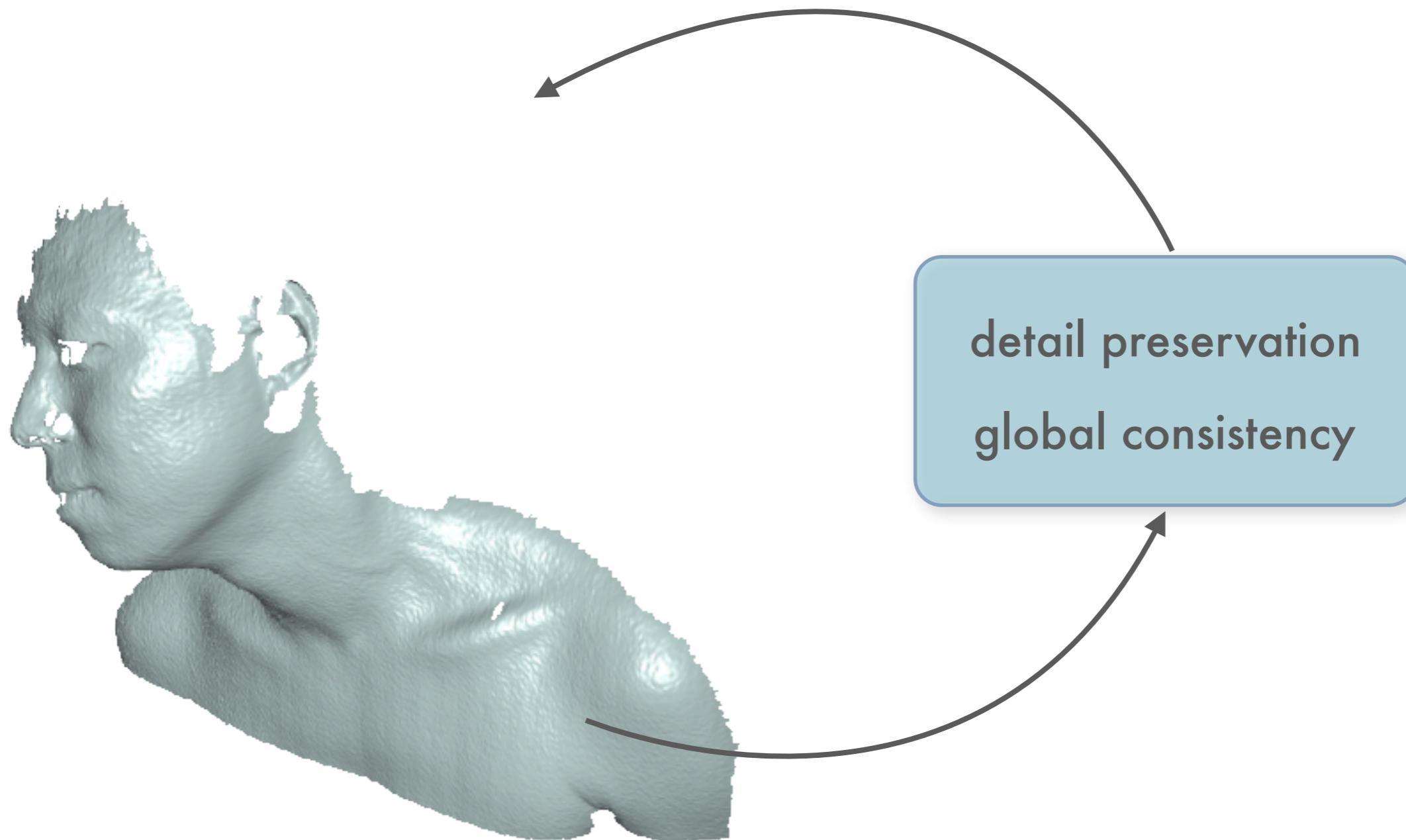
# Embedded Deformation Model



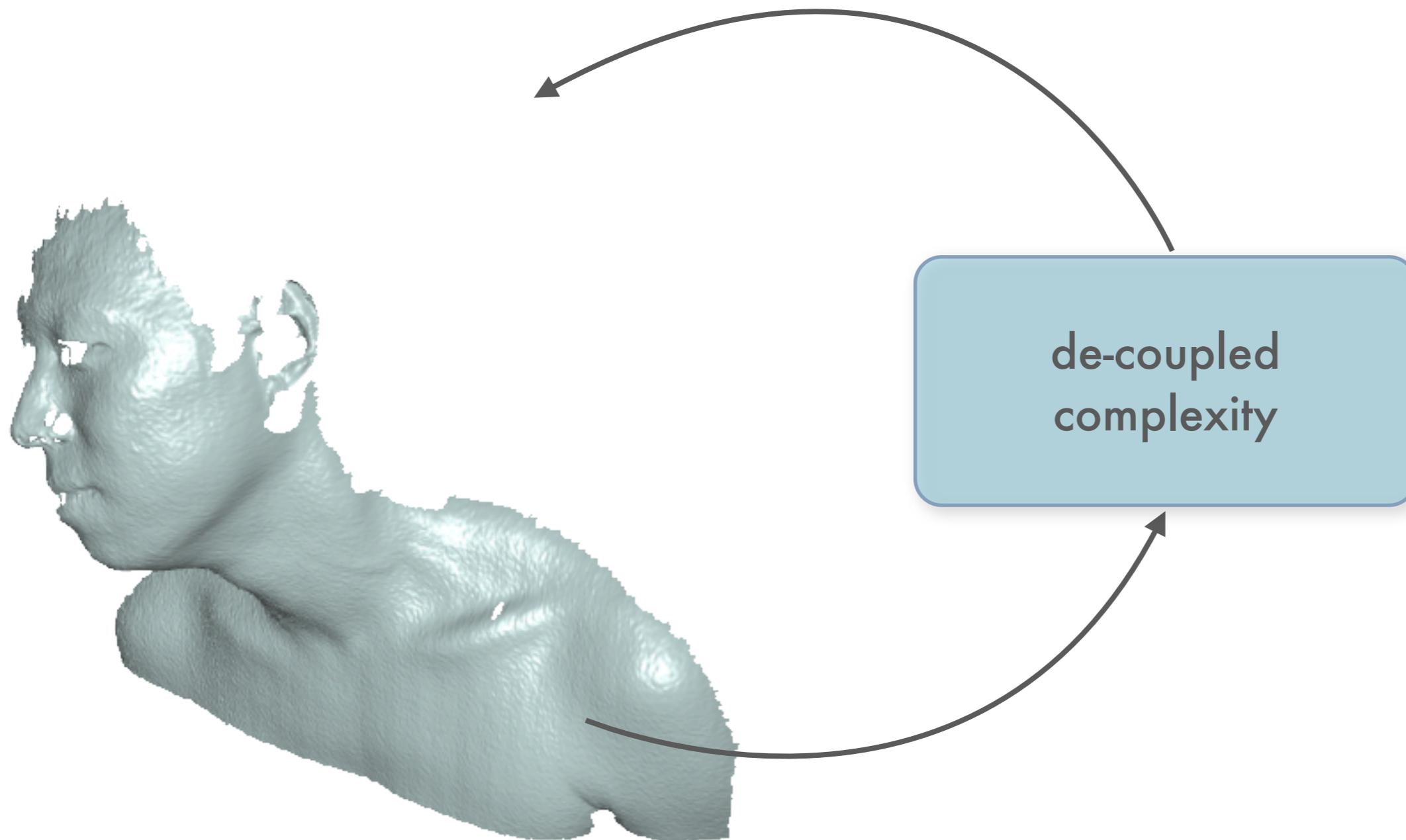
detail preservation  
global consistency



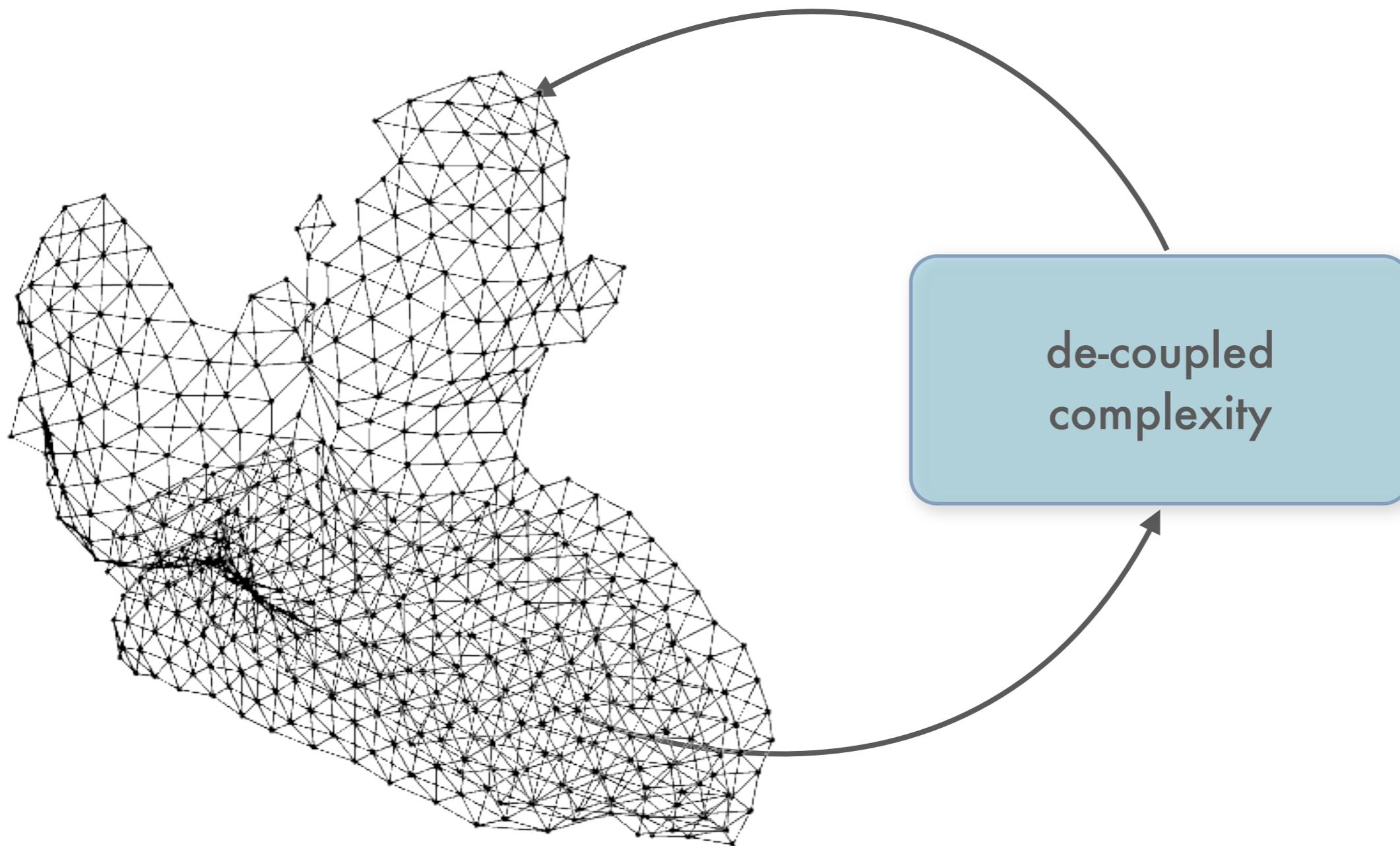
# Embedded Deformation Model



# Embedded Deformation Model

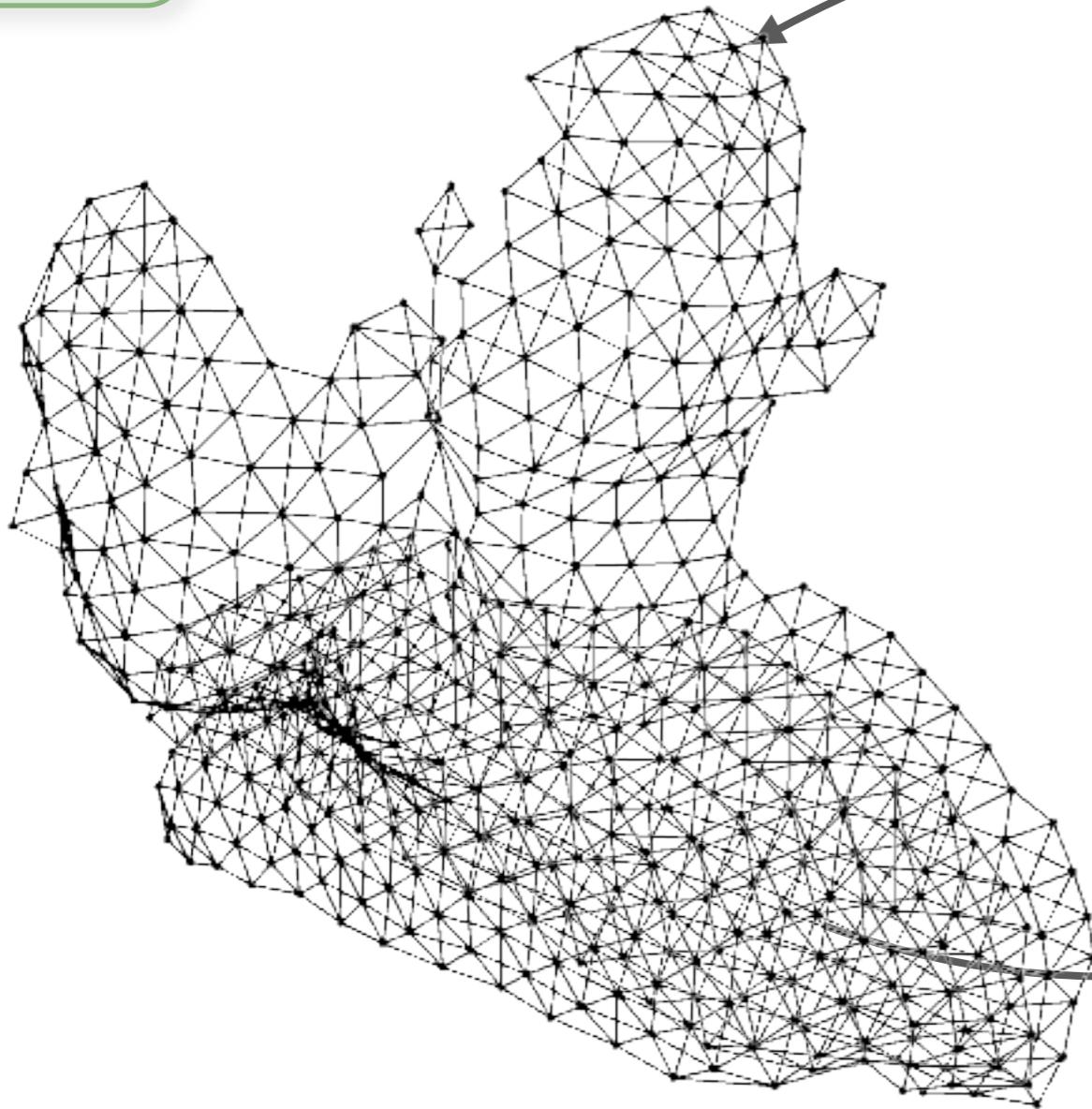


# Embedded Deformation Model



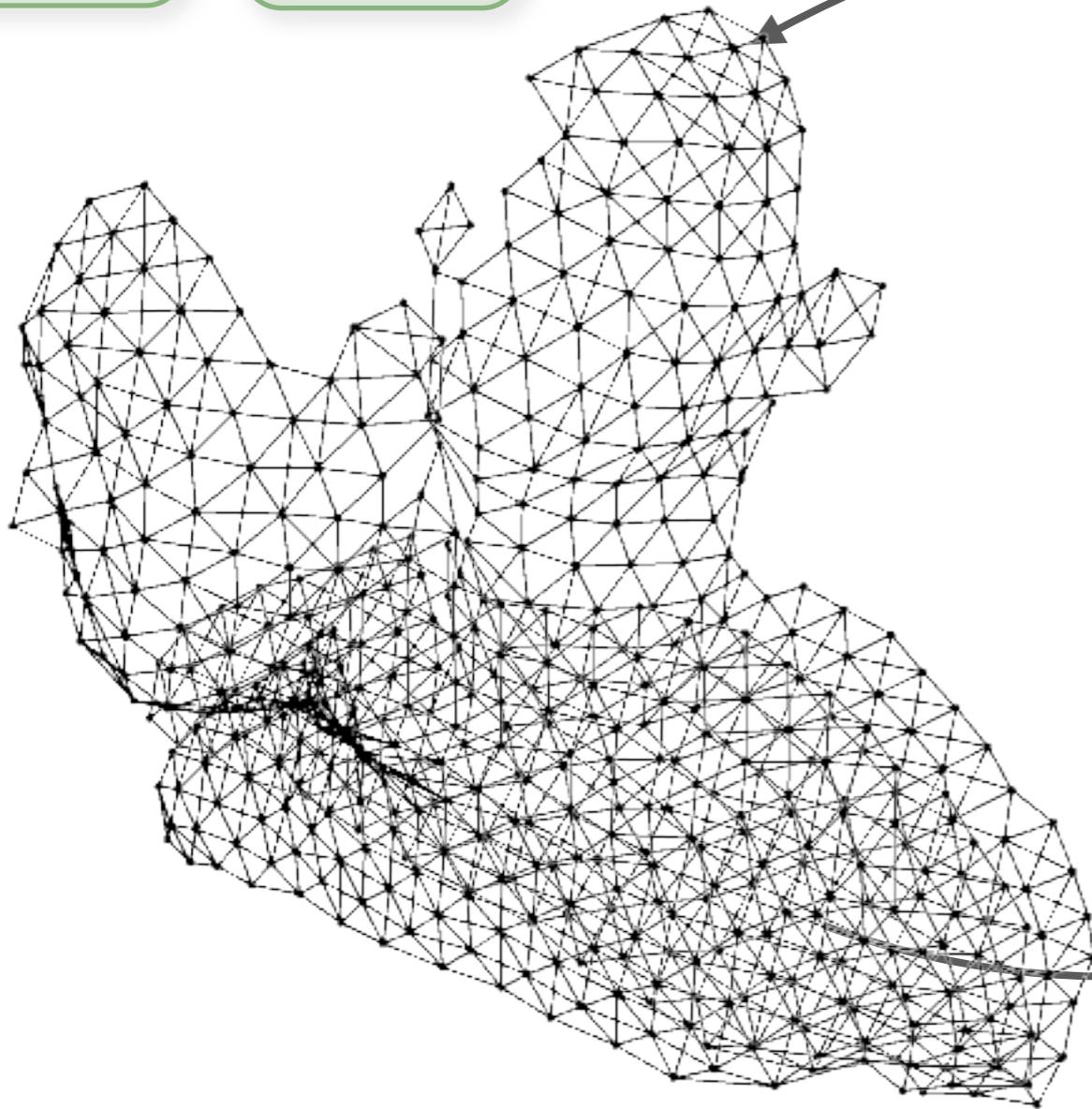
# Embedded Deformation Model

$E_{\text{rigid}}$



de-coupled  
complexity

# Embedded Deformation Model

 $E_{\text{rigid}}$  $E_{\text{smooth}}$ 

de-coupled  
complexity

# Non-Linear Energy Minimization

 $E_{\text{rigid}}$  $E_{\text{smooth}}$

# Non-Linear Energy Minimization

 $E_{\text{rigid}}$  $E_{\text{smooth}}$

# Non-Linear Energy Minimization

 $E_{\text{rigid}}$  $E_{\text{smooth}}$

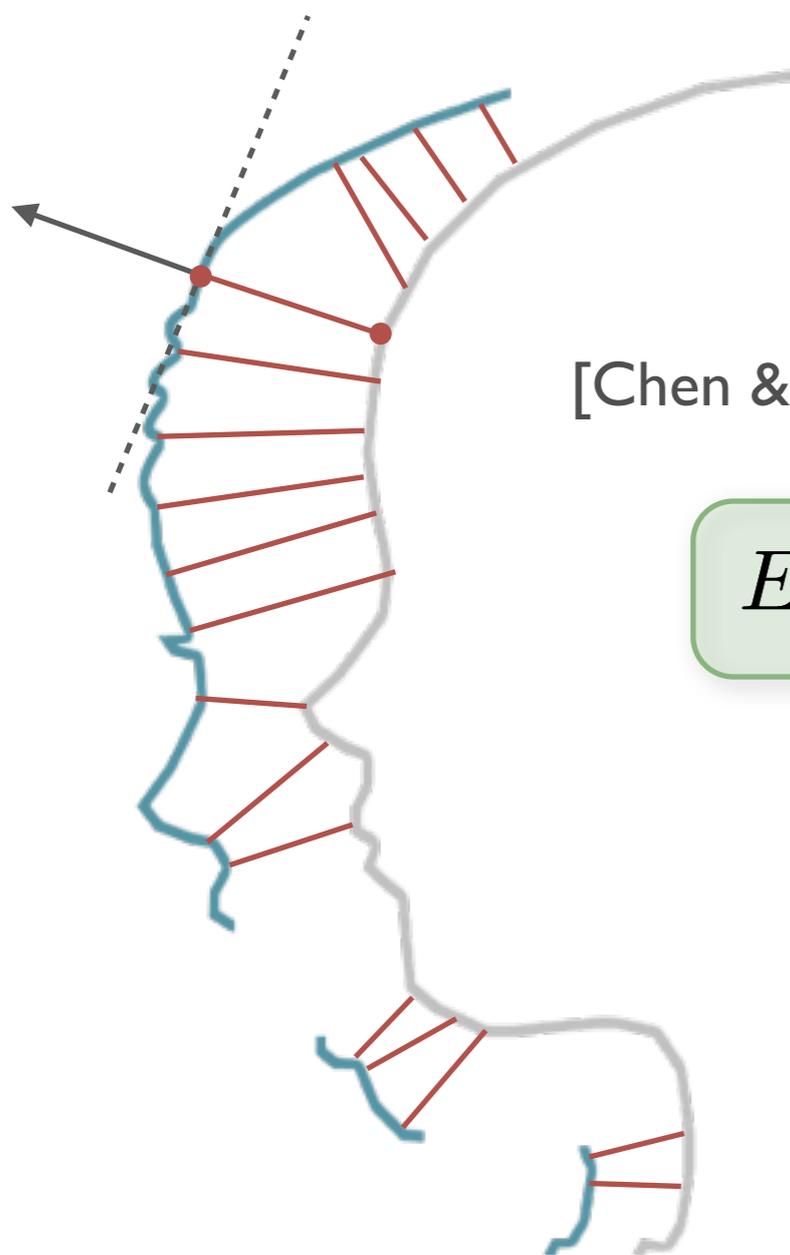
# Non-Linear Energy Minimization

 $E_{\text{rigid}}$  $E_{\text{smooth}}$

# Non-Linear Energy Minimization

 $E_{\text{point}}$  $E_{\text{rigid}}$  $E_{\text{smooth}}$

# Non-Linear Energy Minimization



[Chen & Medioni '92]

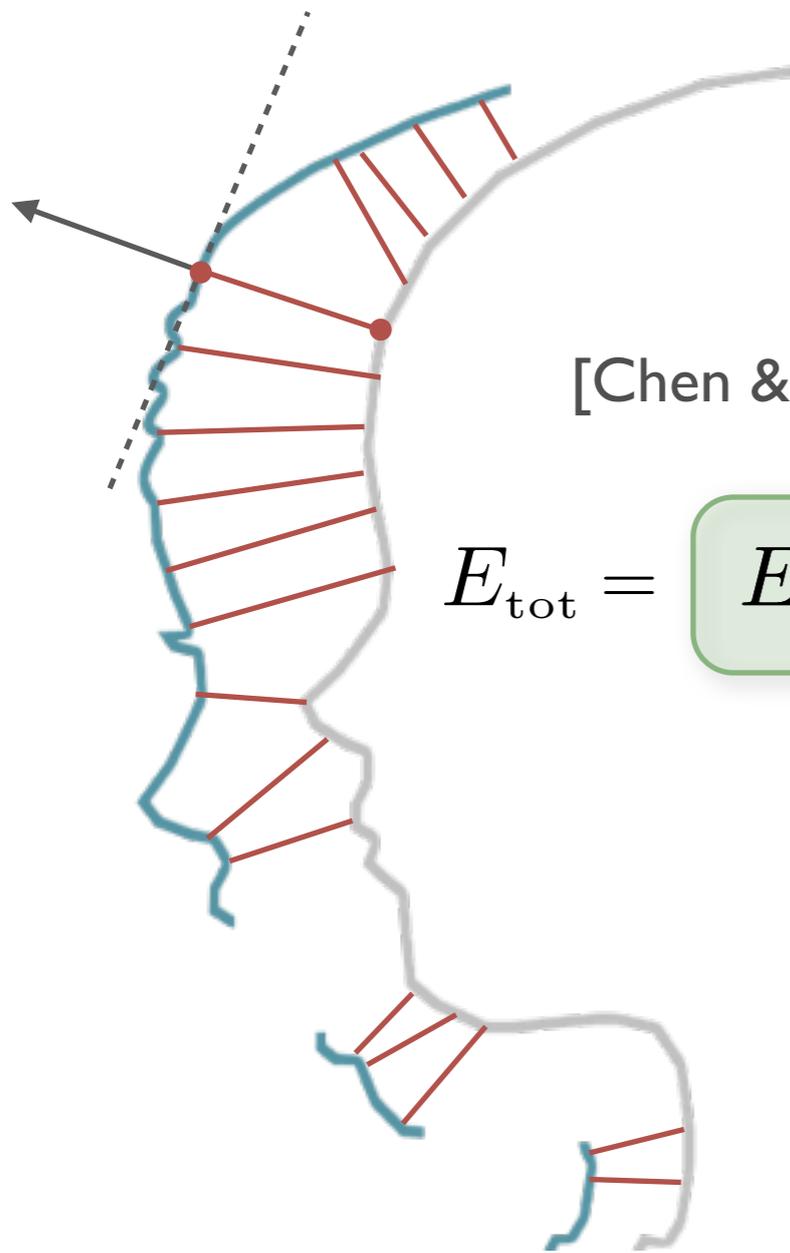
$E_{\text{plane}}$

$E_{\text{point}}$

$E_{\text{rigid}}$

$E_{\text{smooth}}$

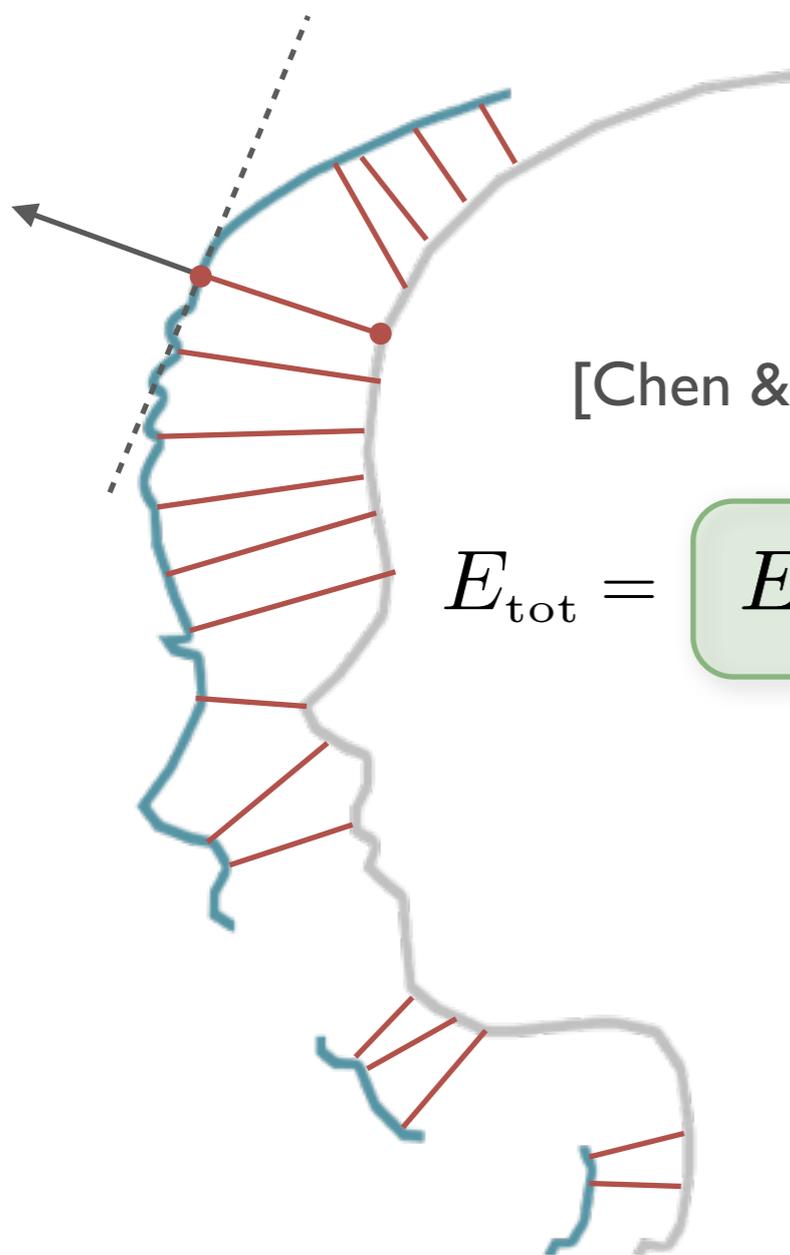
# Non-Linear Energy Minimization



[Chen & Medioni '92]

$$E_{\text{tot}} = E_{\text{plane}} + \alpha_{\text{point}} E_{\text{point}} + \alpha_{\text{rigid}} E_{\text{rigid}} + \alpha_{\text{smooth}} E_{\text{smooth}}$$

# Non-Linear Energy Minimization

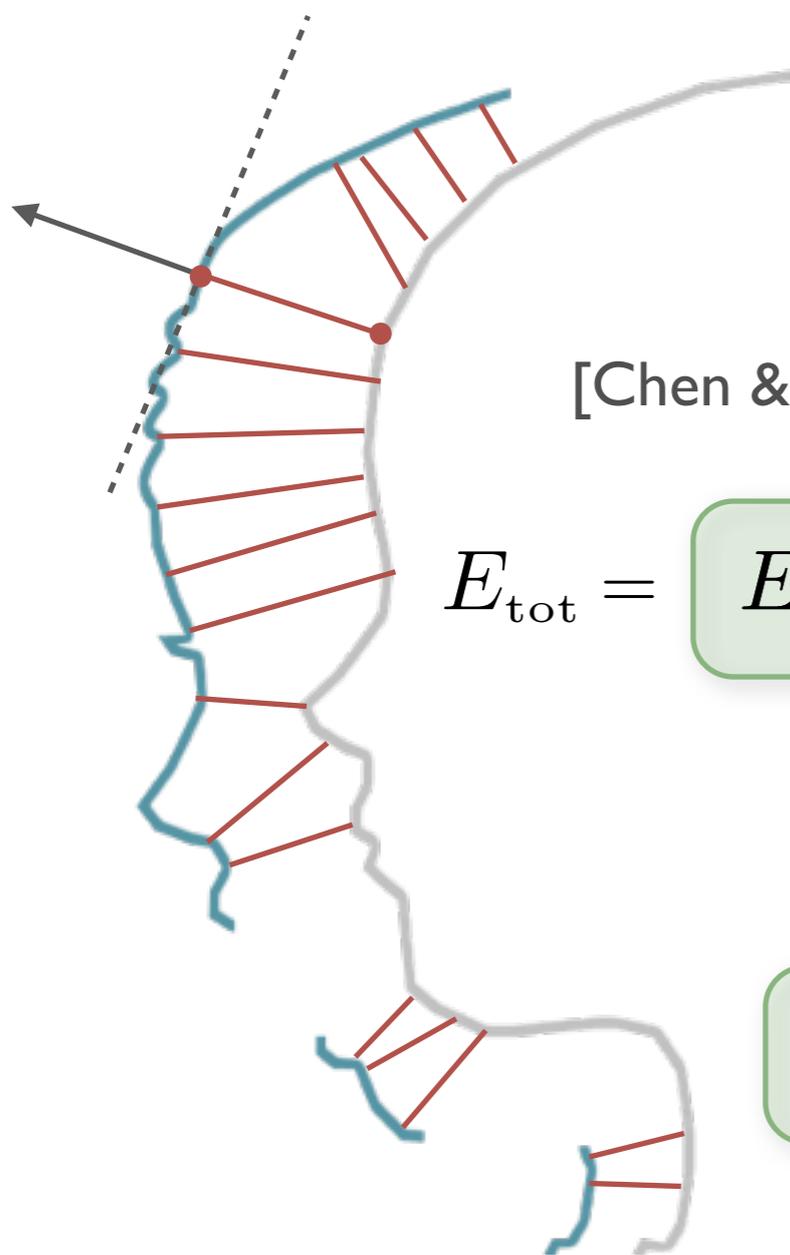


[Chen & Medioni '92]

$$E_{\text{tot}} = E_{\text{plane}} + \alpha_{\text{point}} E_{\text{point}} + \alpha_{\text{rigid}} E_{\text{rigid}} + \alpha_{\text{smooth}} E_{\text{smooth}}$$

non-linear least squares  
minimization

# Non-Linear Energy Minimization



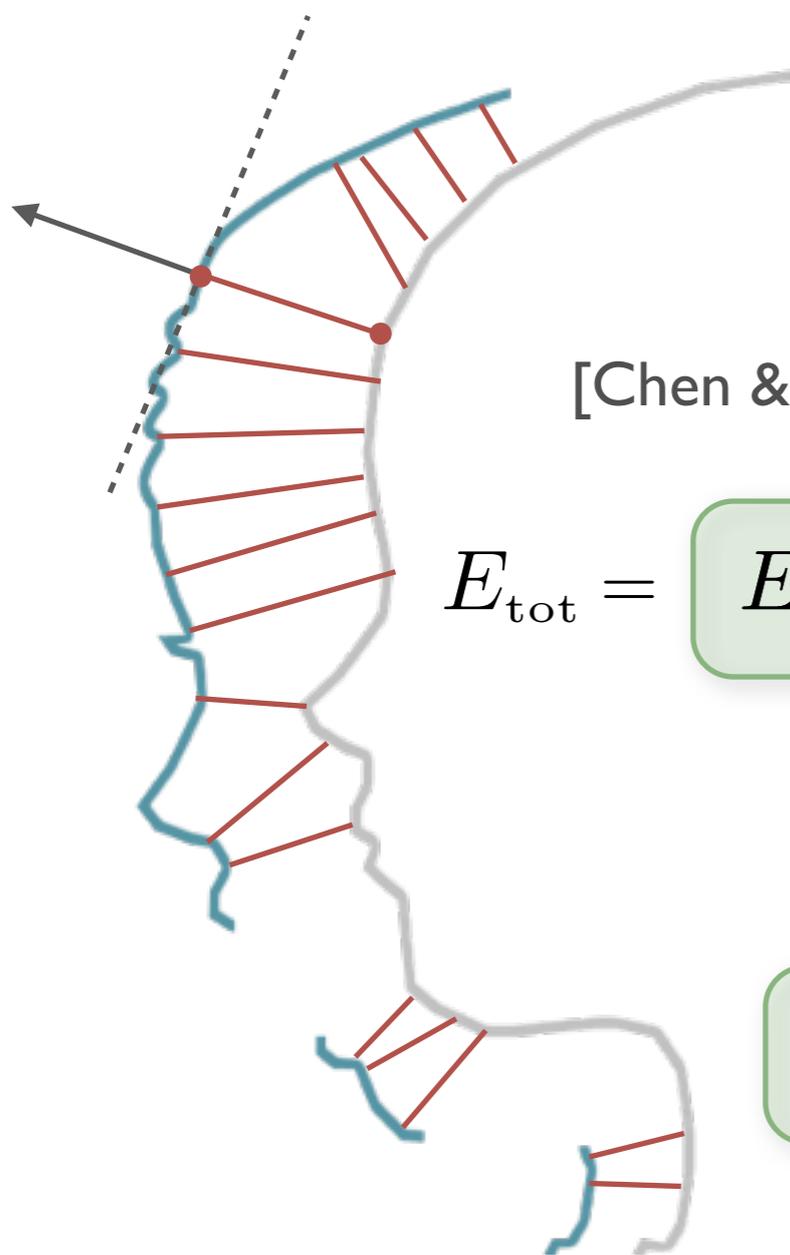
[Chen & Medioni '92]

$$E_{\text{tot}} = E_{\text{plane}} + \alpha_{\text{point}} E_{\text{point}} + \alpha_{\text{rigid}} E_{\text{rigid}} + \alpha_{\text{smooth}} E_{\text{smooth}}$$

non-linear least squares  
minimization

Gauss-Newton method

# Non-Linear Energy Minimization



[Chen & Medioni '92]

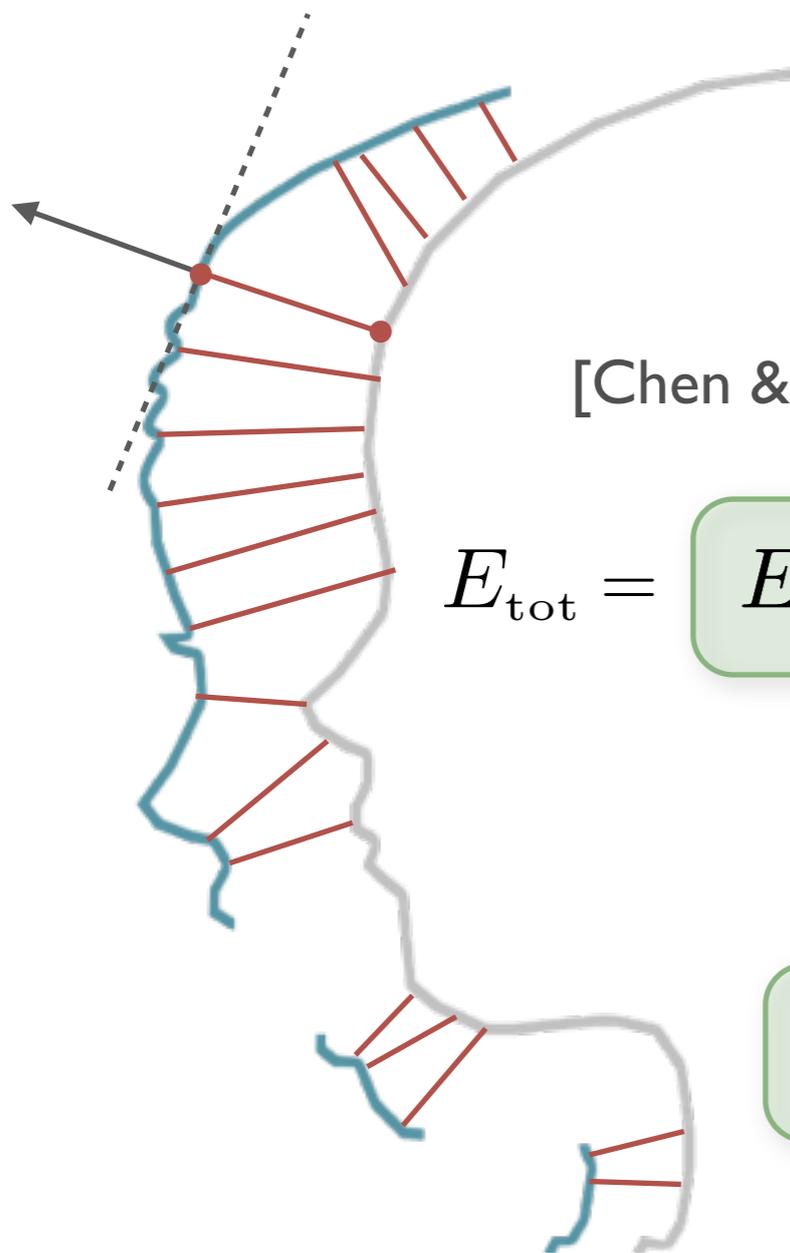
$$E_{\text{tot}} = E_{\text{plane}} + \alpha_{\text{point}} E_{\text{point}} + \alpha_{\text{rigid}} E_{\text{rigid}} + \alpha_{\text{smooth}} E_{\text{smooth}}$$

non-linear least squares  
minimization

Gauss-Newton method

Jacobian is  
sparse

# Non-Linear Energy Minimization



[Chen & Medioni '92]

$$E_{\text{tot}} = E_{\text{plane}} + \alpha_{\text{point}} E_{\text{point}} + \alpha_{\text{rigid}} E_{\text{rigid}} + \alpha_{\text{smooth}} E_{\text{smooth}}$$

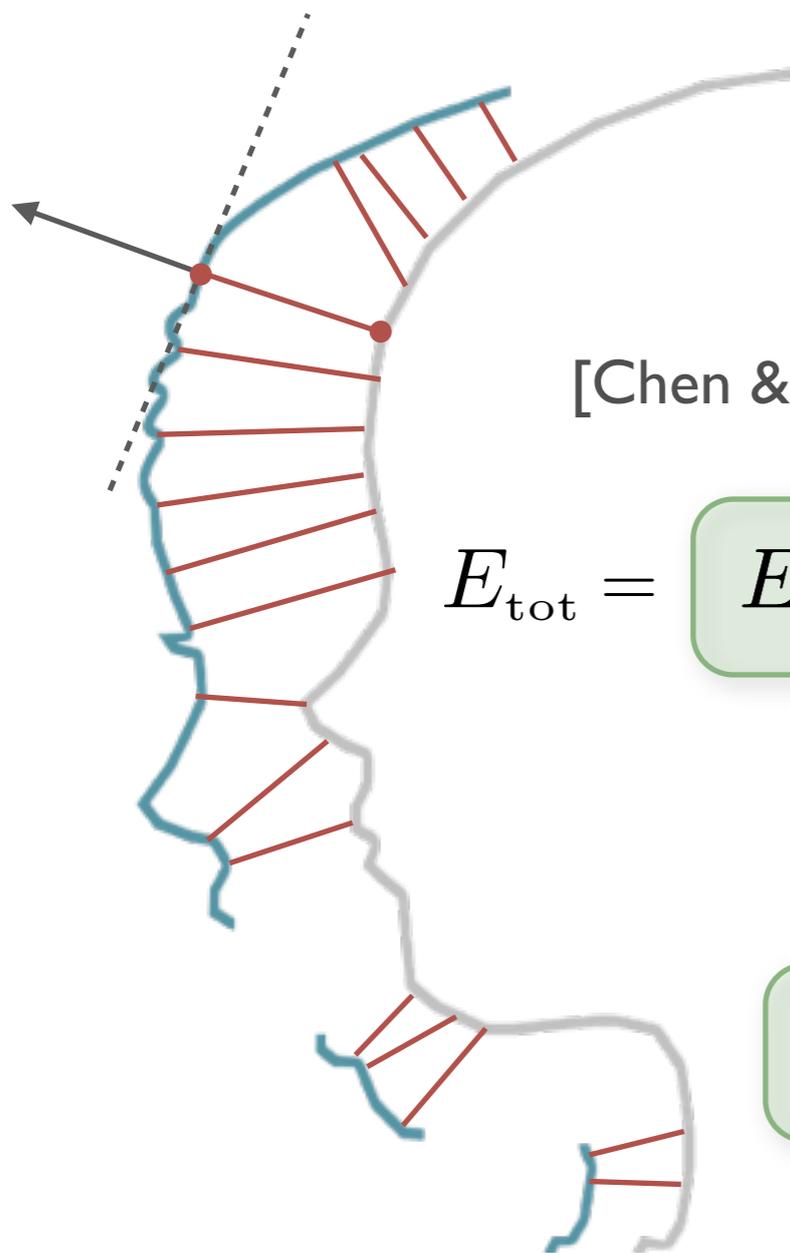
non-linear least squares  
minimization

Gauss-Newton method

Jacobian is  
sparse

sparse Cholesky factorization

# Non-Linear Energy Minimization



[Chen & Medioni '92]

$$E_{\text{tot}} = E_{\text{plane}} + \alpha_{\text{point}} E_{\text{point}} + \alpha_{\text{rigid}} E_{\text{rigid}} + \alpha_{\text{smooth}} E_{\text{smooth}}$$

non-linear least squares  
minimization

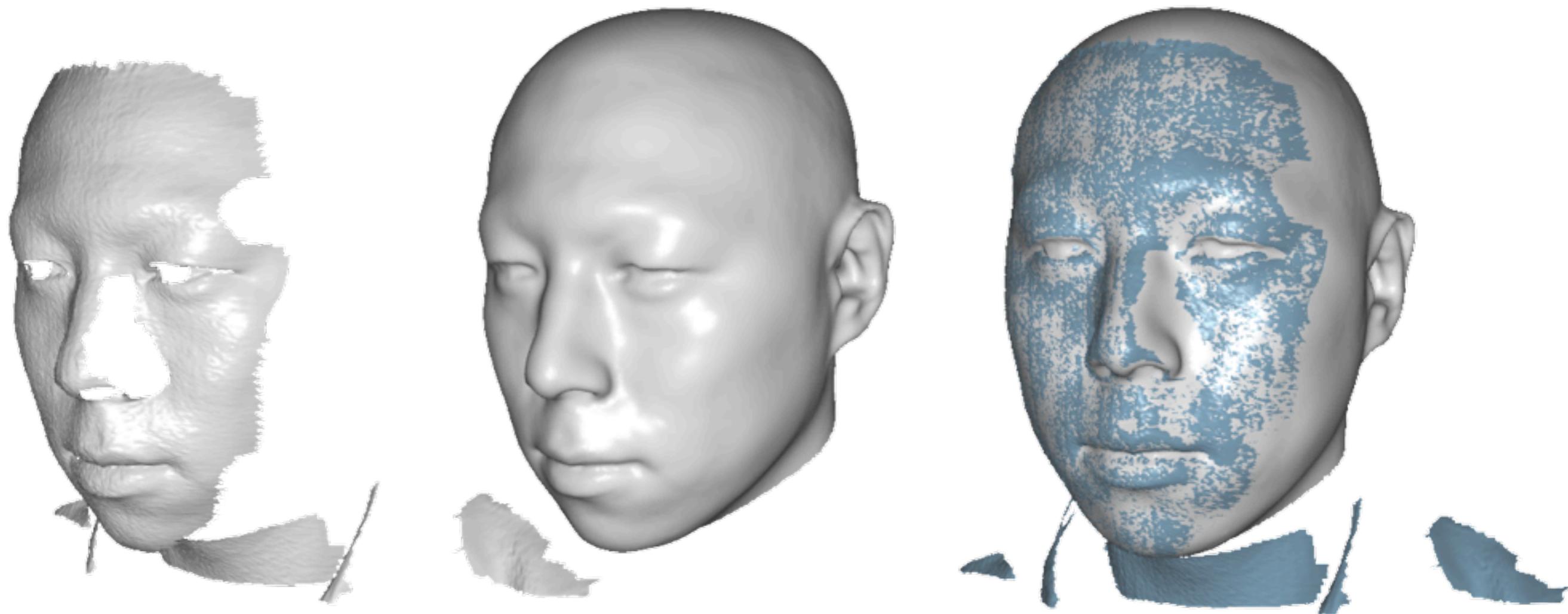
Jacobian is  
sparse

Gauss-Newton method

sparse Cholesky factorization

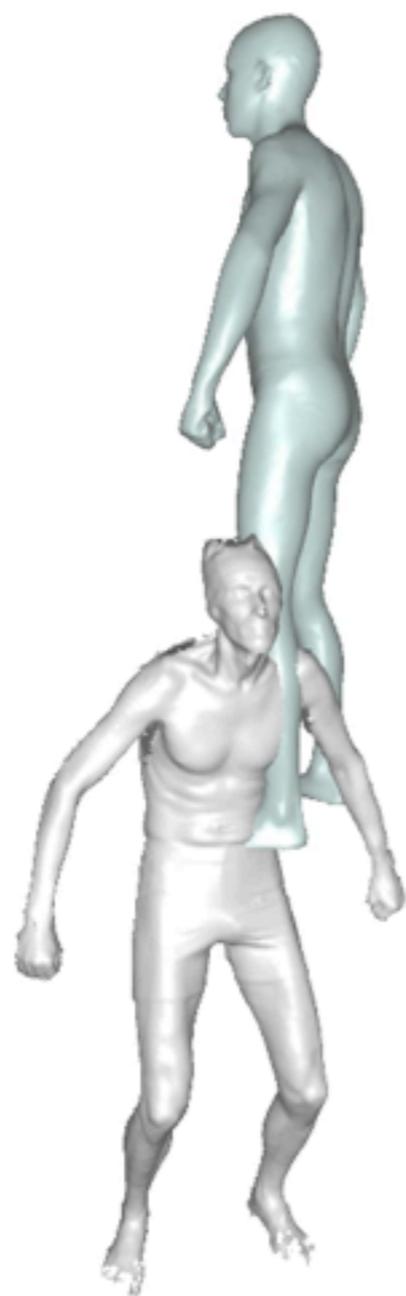
that's it!

# Template-Based Tracking



# Not only for Faces!

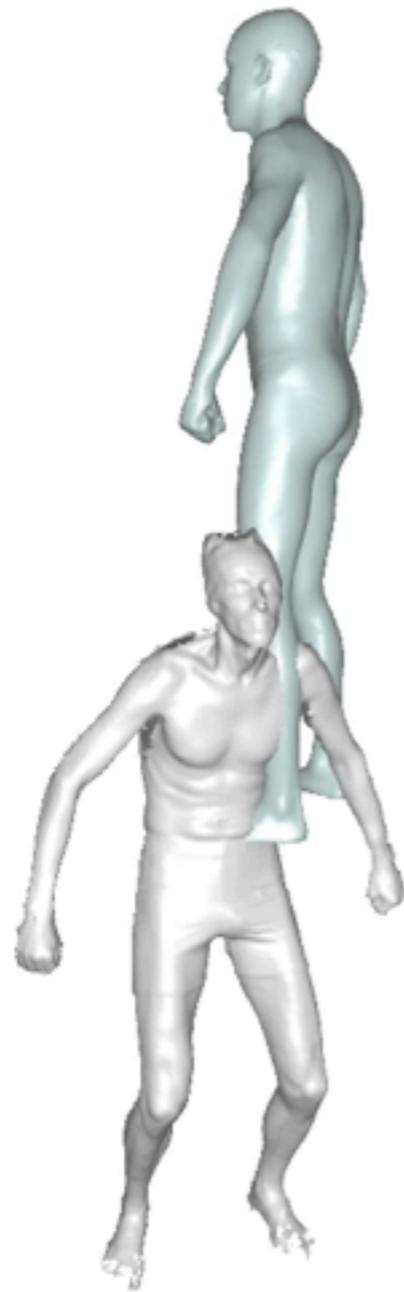
# Not only for Faces!



template



# Not only for Faces!



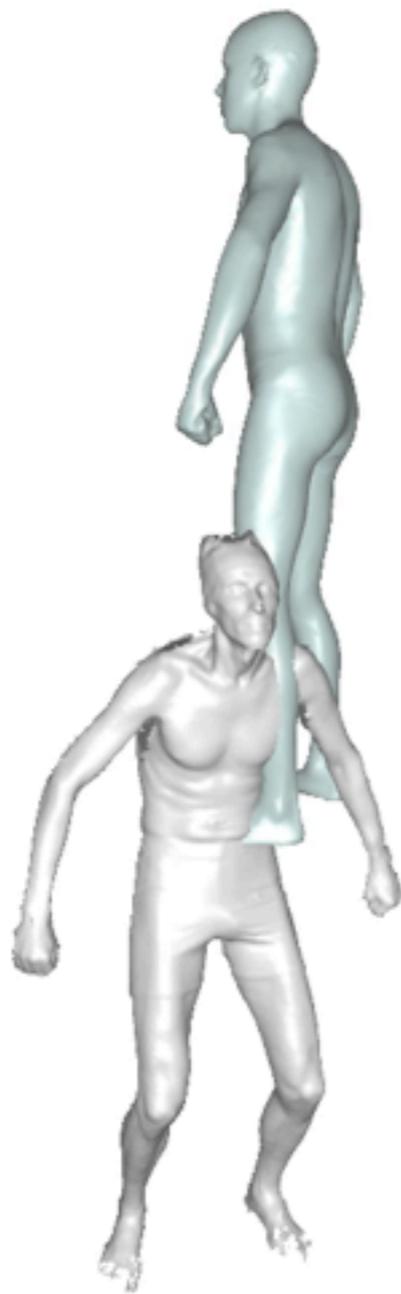
template



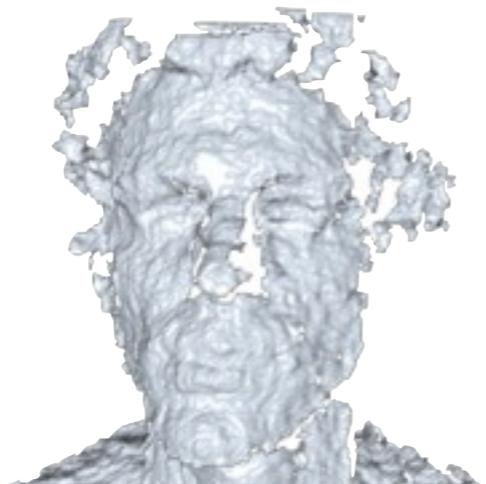
3D scan



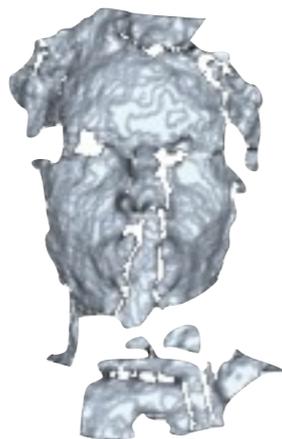
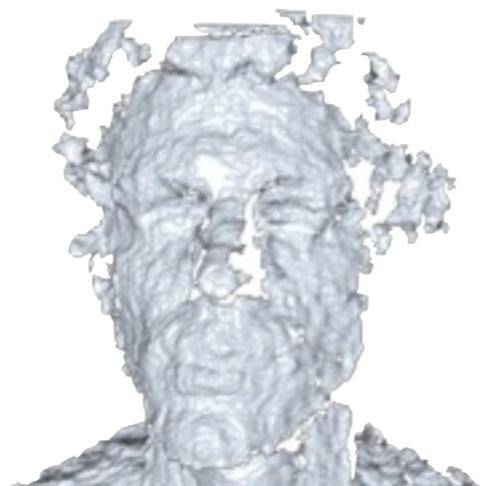
# Not only for Faces!



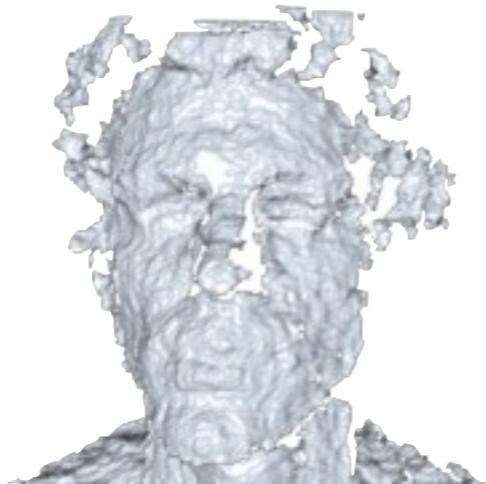
# Requirements for a Practical System



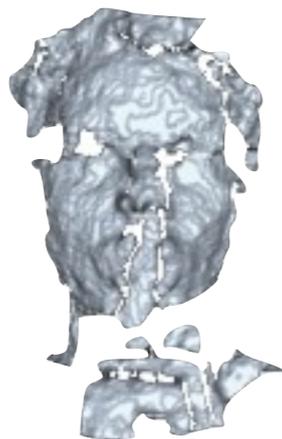
# Requirements for a Practical System



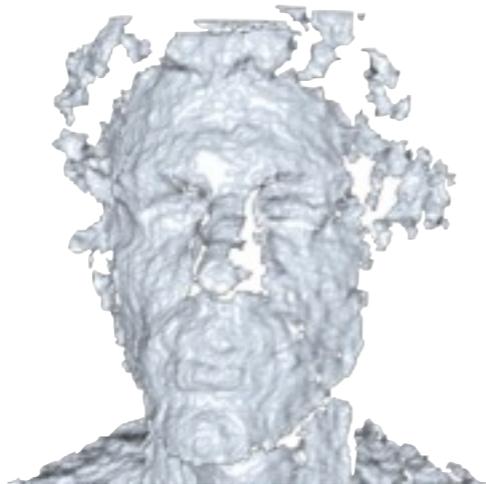
# Requirements for a Practical System



## 1. Real-time performance

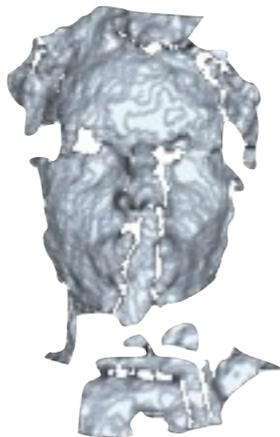


# Requirements for a Practical System

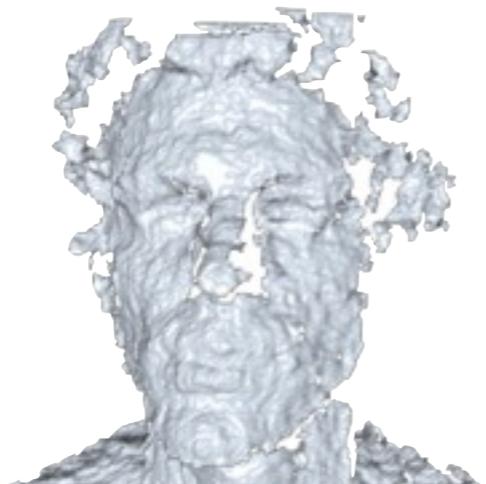


1. Real-time performance

2. Robustness to noise



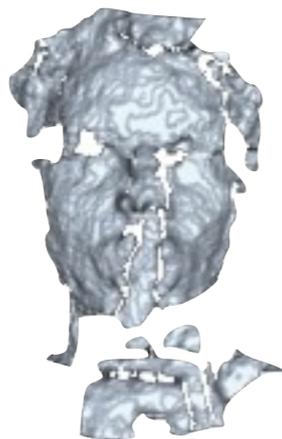
# Requirements for a Practical System



1. Real-time performance

2. Robustness to noise

3. High-level semantics



# Real-time Facial Capture

# Objective



# Building Expression Space

tracked template

input scan

# Building Expression Space



tracked template



input scan

# Expression PCA for Reduced Dimension

# Expression PCA for Reduced Dimension



# Expression PCA for Reduced Dimension



Principal Component Analysis

# Expression PCA for Reduced Dimension



Principal Component Analysis



# Expression PCA for Reduced Dimension



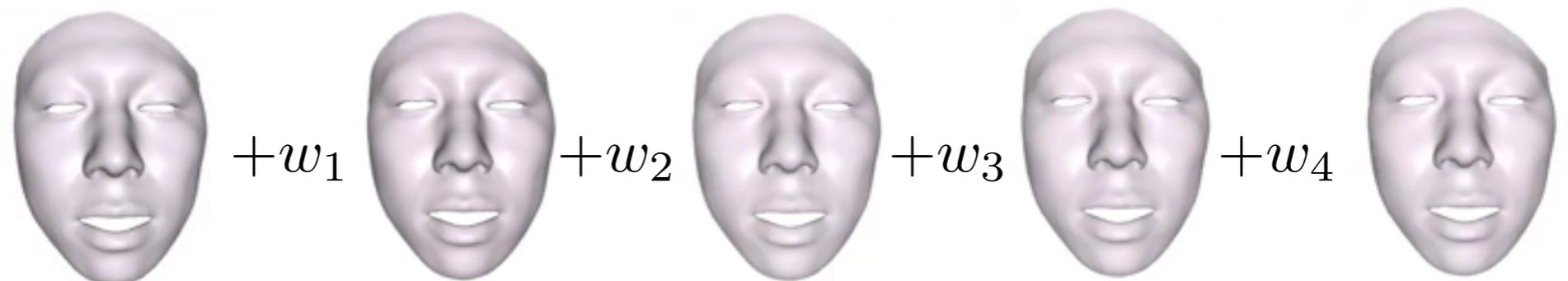
Principal Component Analysis



# Expression PCA for Reduced Dimension



Principal Component Analysis



# Expression PCA for Reduced Dimension



Principal Component Analysis

