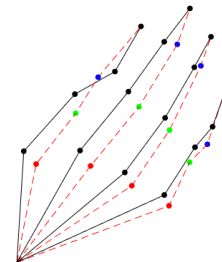
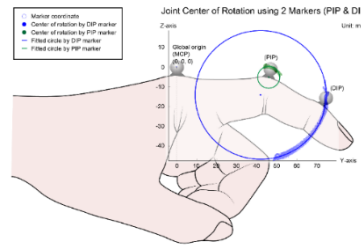
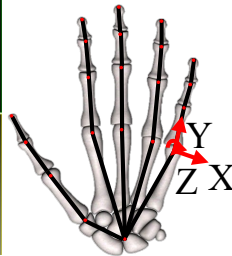
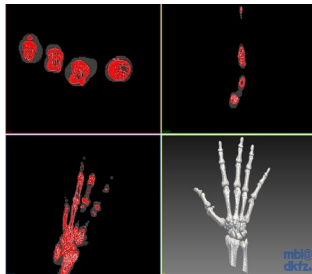
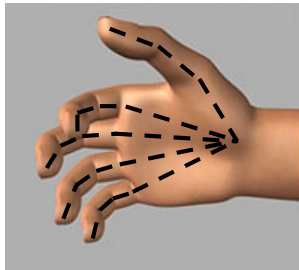


Estimation of Finger Joint Center of Rotation Using Finger Motion



Zhichan Lim, Xiaopeng Yang, Hayoung Jung, Heecheon You

Department of Industrial & Management Engineering, Pohang University of Science
and Technology, Korea

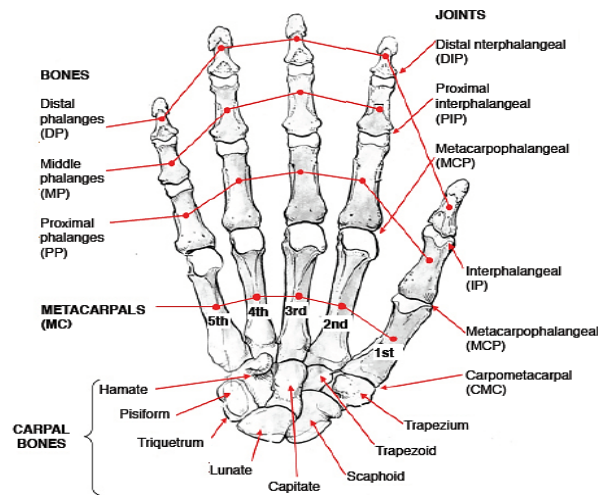
CONTENTS

- Introduction
 - Background
 - Objectives of the Study
 - CT-Based Center of Rotation (CoR) Estimation
 - Discussion
 - Limitation and Future Study
-

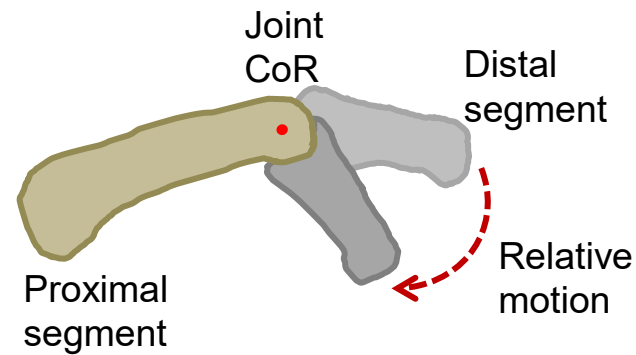
Hand Anatomy

- Hand bone structure: Containing **29 bones** at the wrist and fingers
- Joint CoR: The **center** around which the **relative motion** of a joint's **distal segment** occurs

Hand bone structure
(Figueroa et al., 2016)



Joint CoR



Types of Joint CoR

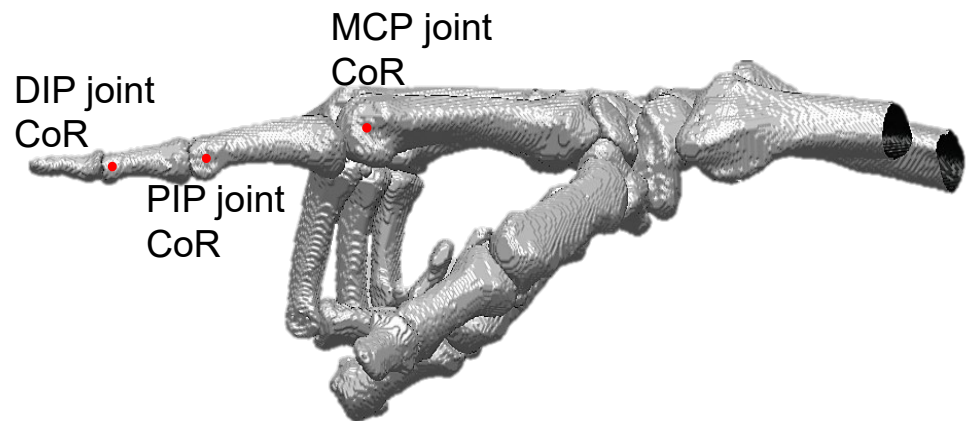
- **Instantaneous joint CoR**
 - The joint CoR around which the distal segment moves at certain instant of time from the starting position to the ending position (Challis, 2001)
- **Fixed joint CoR**
 - No change of Joint CoR location during motion
 - Hand joints: Assumed to have fixed joint CoR in previous studies (Zatsiorsky, 1998)

Instantaneous joint CoR
(Reuleaux, 1875)



Knee joint CoR

Fixed joint CoR
(Fowler, 2001)



MCP joint
CoR

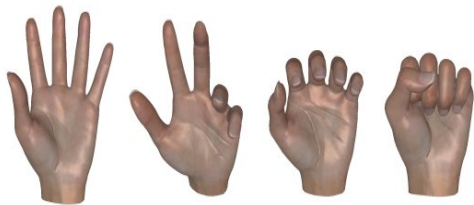
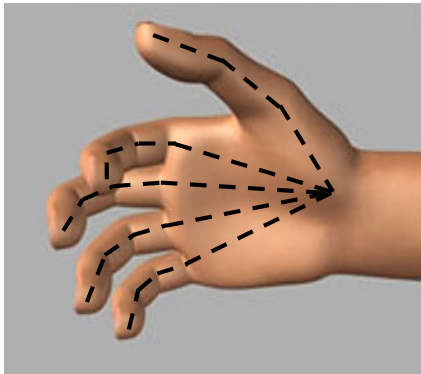
DIP joint
CoR

PIP joint
CoR

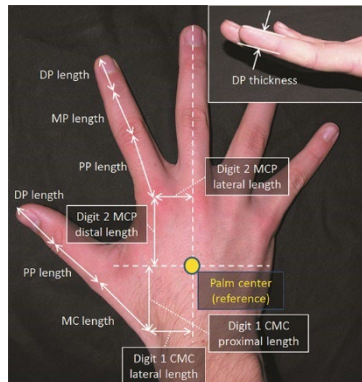
Applications of Finger Joint CoR

- Hand animation, hand posture recognition
- Ergonomic product designs
- Clinical assessment for hand surgery

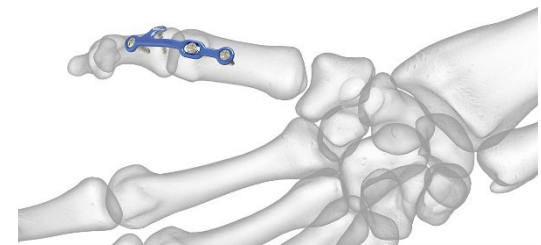
Posture visualization
& recognition



Ergonomic product
design

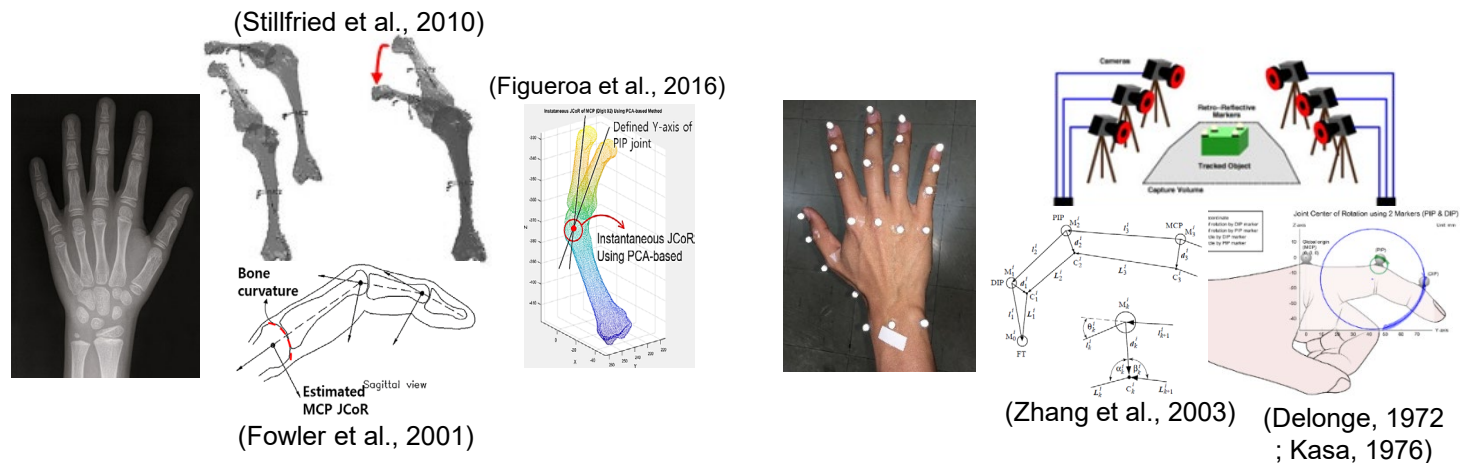


Post-operative medical
evaluation



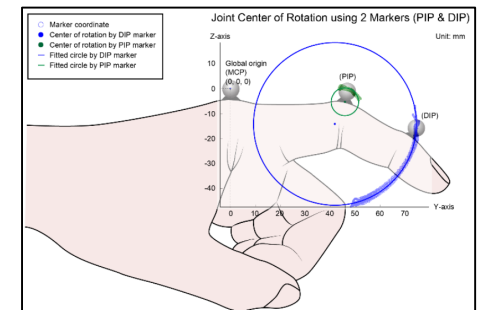
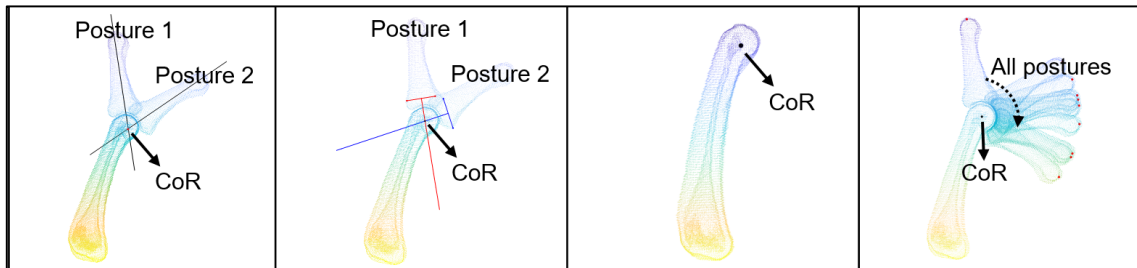
Existing Methods of Joint CoR Estimation

Type	Skeleton-based Estimation	Surface-based Estimation
Data type	Medical images data (MRI/CT)	Surface motion data
Techniques	<ul style="list-style-type: none"> Reuleaux, bone curvature, PCA 	<ul style="list-style-type: none"> Circle fitting, optimization
Strengths	<ul style="list-style-type: none"> Easy to visualize position of joint CoR Accurate joint CoR 	<ul style="list-style-type: none"> Easy to collect data Cost-effective Safe
Limitations	<ul style="list-style-type: none"> Expensive Risk of exposure to ionizing radiation Difficult to collect data Long data processing 	<ul style="list-style-type: none"> Less accurate Existing techniques not validated Complex calculation

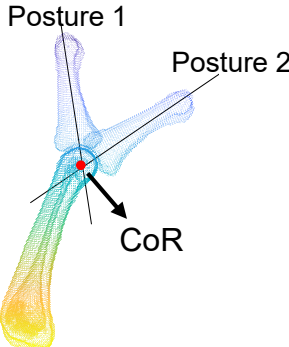
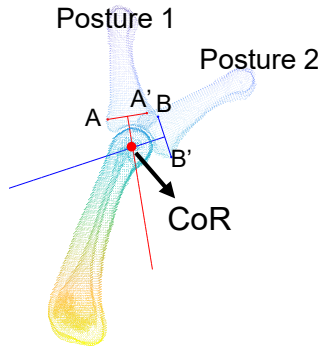
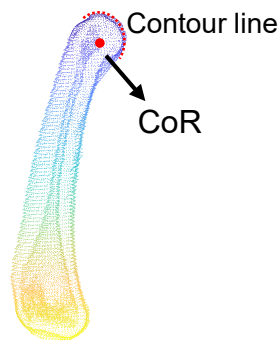
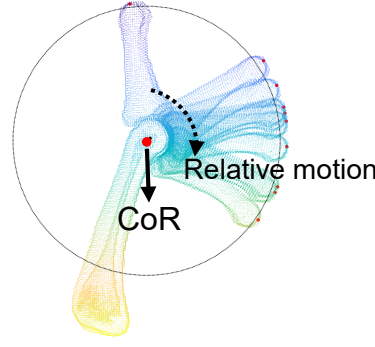


Objectives

Compare different CT-based joint CoR estimation techniques and identify those techniques provide similar results



CT-Based Joint CoR Estimation: Techniques

Techniques	PCA	Reuleaux	Bone Curvature	Delonge-Kasa (D-K)
	 <p>(Figueroa et al., 2016)</p>	 <p>(Reuleaux, 1875)</p>	 <p>(Fowler et al., 2001)</p>	 <p>(KASA, 1976)</p>
Type of joint CoR	Instantaneous & Fixed	Instantaneous & Fixed	Fixed	Fixed
Description	Intersection of centerlines of 2 distinct distal bones	Intersection of perpendicular bisectors of landmark A to A' and B to B'	Center of contour line defined on bone head surface	Fit a circle to the trajectory of landmark motion
Required input data	Centerline of each bone	Distinct coordinate of landmark A to A' and B to B'	Contour line of bone head	Landmark and its displacement vector

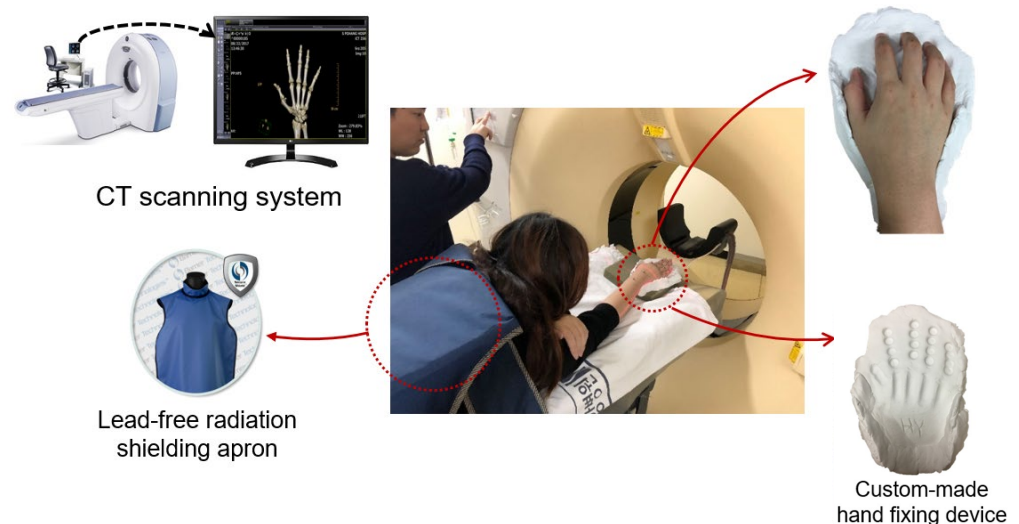
Data Collection and Pre-Processing

Experiment

- 9 participants
 - No neurological or musculoskeletal disorder in dominant hand
 - 3 hand size categories (Size Korea, 2010)
 - Large: > 188.5 mm
 - Medium: 178.3 ~ 188.4 mm
 - Small: < 178.2 mm

- Apparatus

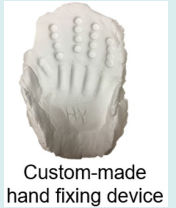
- CT scanning system
- Custom-made hand fixing device
- Radiation shielding apron



Experiment Protocol

1. Preparation

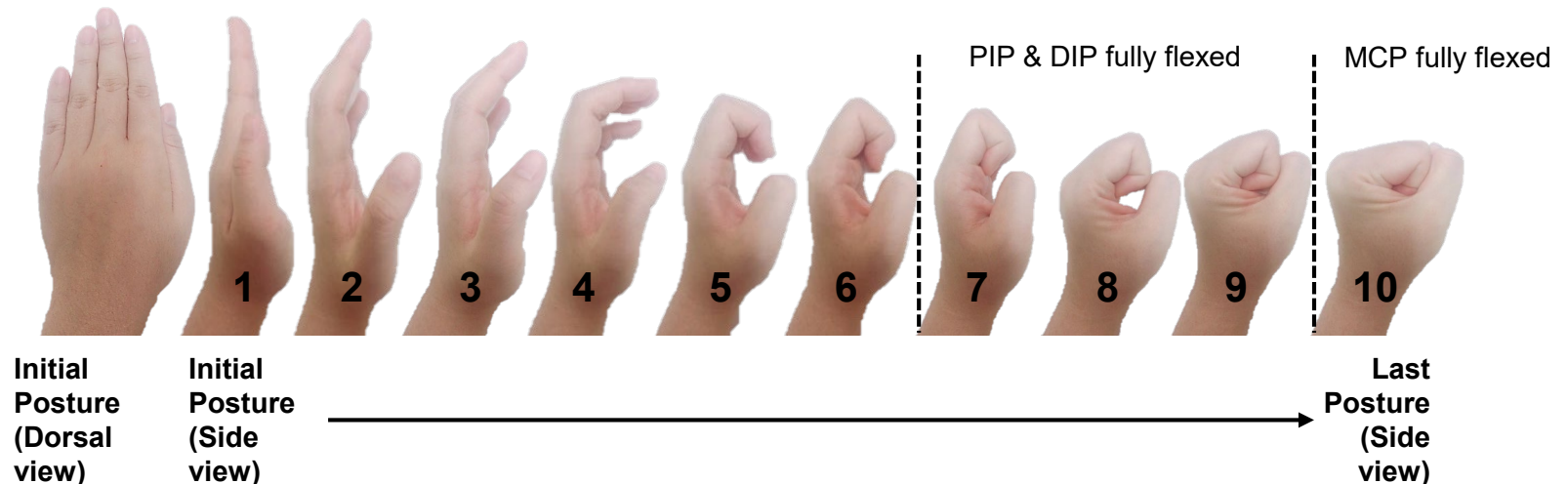
- Measure **hand length**
- Build a custom-made **hand fixing device**
- **Practice** hand **posture**



2. Main experiment

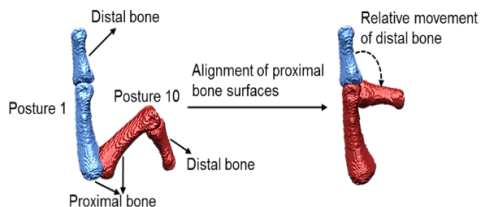
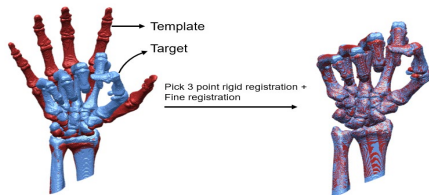
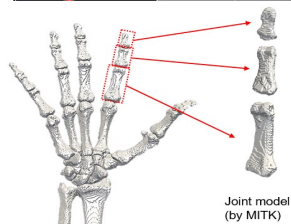
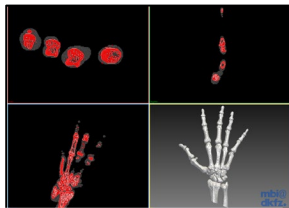
- **Fix hand** and each posture (**10 postures**) at the fixing device
- **CT scan** of each hand posture

3. Debriefing



CT Data Pre-Processing

- Reconstruct the 3D skeletal models of different postures that share the same bone surface



S1.

Segmentation of hand skeleton

- Masking: Remove skin region
- Segmentation of skeleton: Extract bone region

S2.

Preparation of Template bone

Subtraction tool: Remove pixels at the contact region between 2 distinct bones

S3.

Registration of template to target bones

- Pre-alignment: pick-3-point rigid registration
- Fine-alignment: Fine rigid registration

S4.

Alignment of proximal bone

Precise alignment: Pick-3-points rigid registration

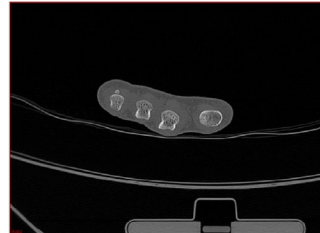
S1. Segmentation of Hand Skeleton

- 2-step procedure for **segmentation of hand skeleton** from CT images

- S1: Masking**

- Exclude the skin region using a **3D sphere tool** of Dr.Liver

Original CT image



Masking



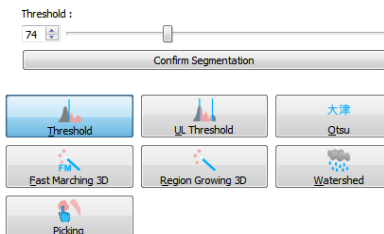
Masked CT image



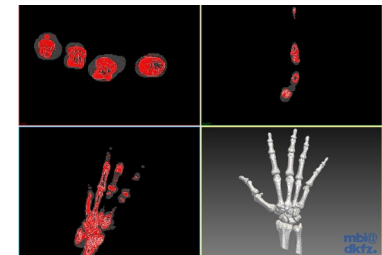
- S2: Segmentation**

- Extract the **skeleton region** using a **threshold-based technique** of MITK by manually adjust threshold value

Threshold selection



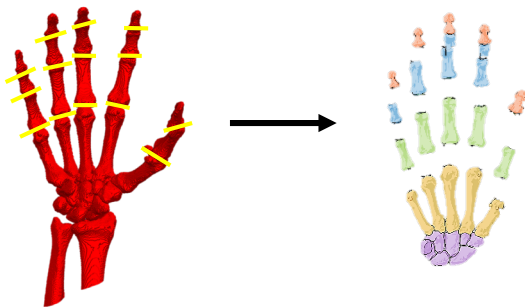
Segmented bone



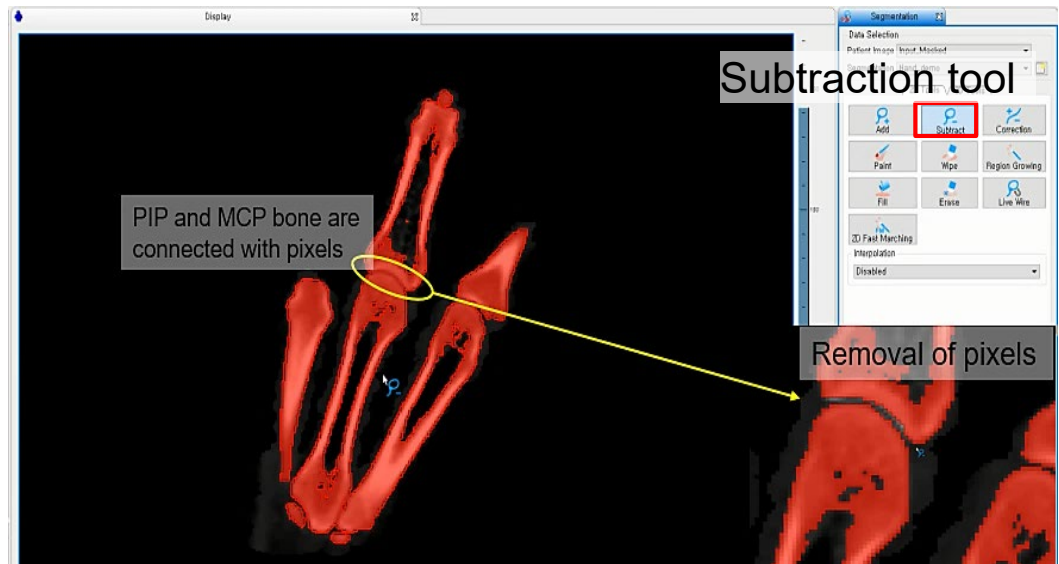
S2. Preparation of Template Bone

- 2-step procedure for **extraction of the bone segments** from **one skeleton model** as **template bone**
 - S1: **Select the skeleton** at the **initial posture**
 - S2: **Remove the connected pixels between 2 bone segments** using a subtraction tool of MITK

Separation of bone segments



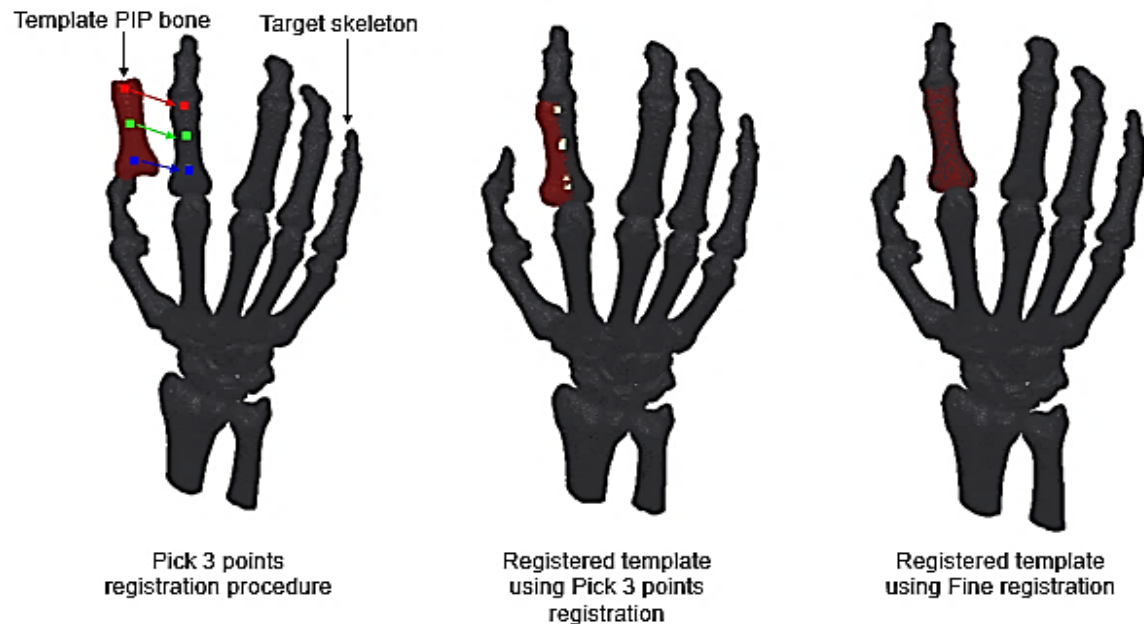
Subtraction Tool by MITK



S3. Registration of Template to Target Bones

- 2-step procedure for **template bone alignment**
 - S1: **Pre-alignment** by the Pick-3-Point rigid registration tool of RapidForm 2006
 - S2: **Fine-alignment** by the Fine rigid registration tool of RapidForm 2006

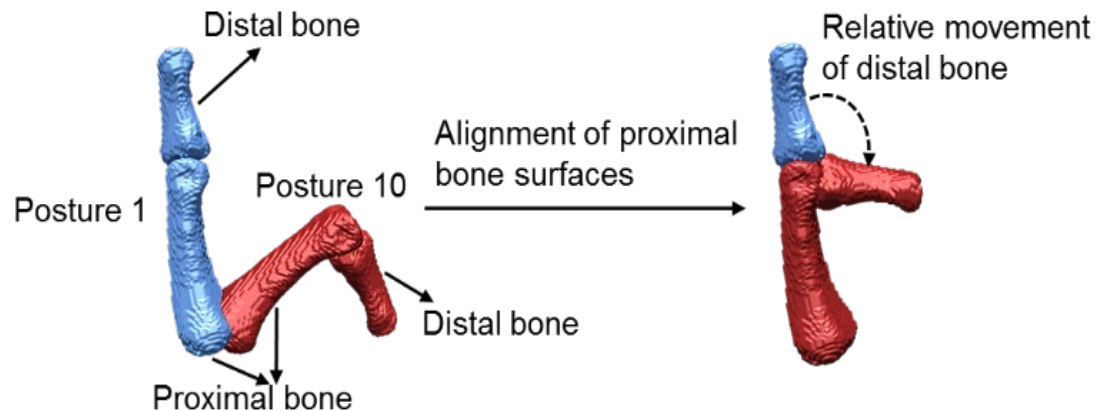
Example of template bone alignment



S4. Alignment of Proximal Bone

- Align the proximal bone segments of all postures to examine the motion of distal bone segments using Pick-3-Point rigid registration tool of RapidForm 2006

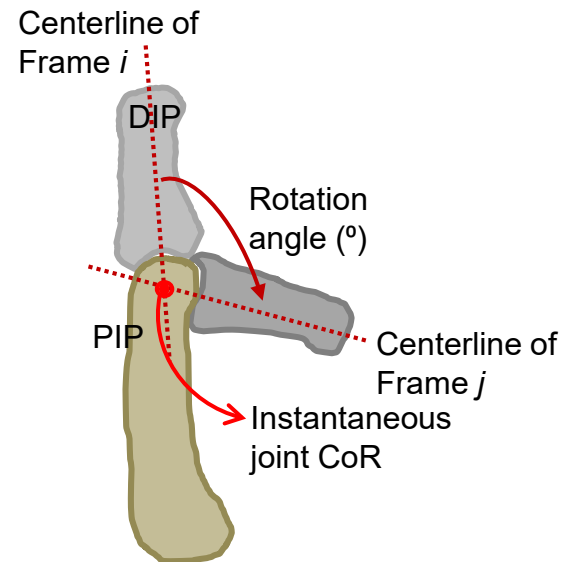
Alignment of proximal bone



CT-Based Instantaneous Joint CoR Estimation

Instantaneous Joint CoR Estimation: PCA

- **Principal Component Analysis (PCA method)**
 - Estimates **instantaneous joint CoR between 2 postures** using **bone centerlines**
 - Steps
 - S1. Determine the **centerline** of the distal segment at each posture
 - S2. Find the **intersection point between the centerlines** of the distal segment at 2 different postures

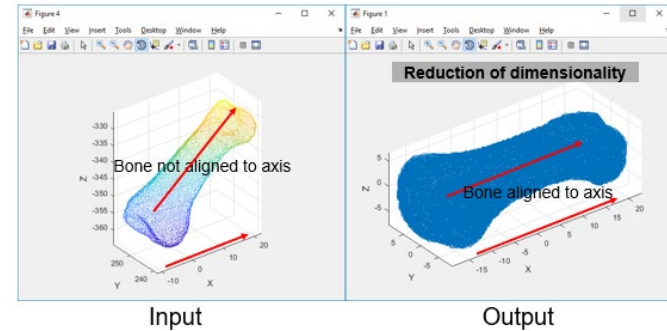


Rosemarie Figueroa 1, T. J. (2016). DETERMINING INSTANTANEOUS CENTERS OF ROTATION FOR FINGER JOINTS THROUGH DIFFERENT POSTURES USING THE ITERATIVE CLOSEST POINT ALGORITHM (ICP). Proceedings of the Human Factors and Ergonomics Society, 1470-1474.

S1. Centerline of Bone (2/2)

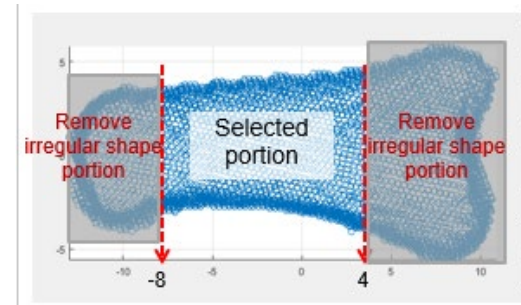
1. Reduce dimensionality of bone using PCA

- Principle component 1 → X-data
- Principle component 2 → Y-data
- Principle component 3 → Z-data



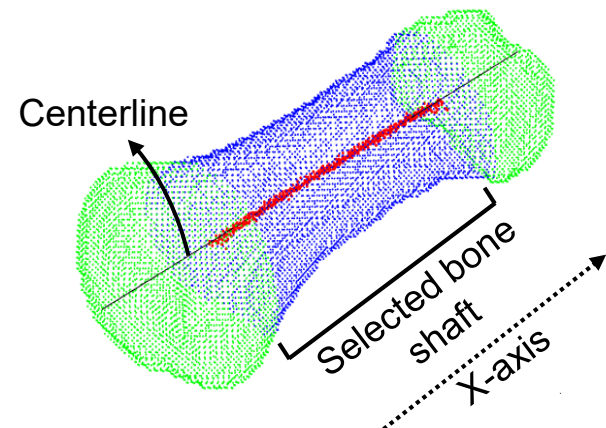
2. Select a bone shaft

- Remove irregular bone regions at the extreme sides of the bone for bone shaft



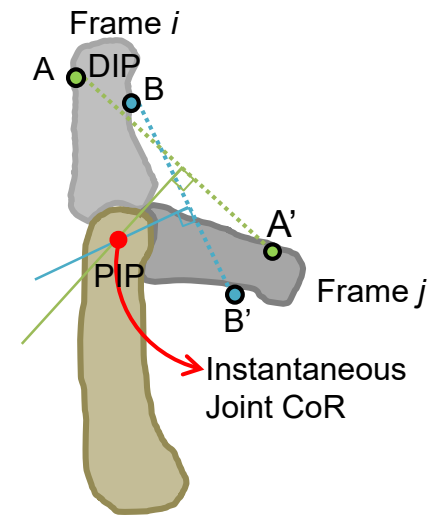
3. Identify a centerline

- Find the centroid of each YZ plane along x-axis perpendicular to the bone shaft
- Linearly fit a line which passes through the centroids along x-axis



Instantaneous Joint CoR Estimation: Reuleaux

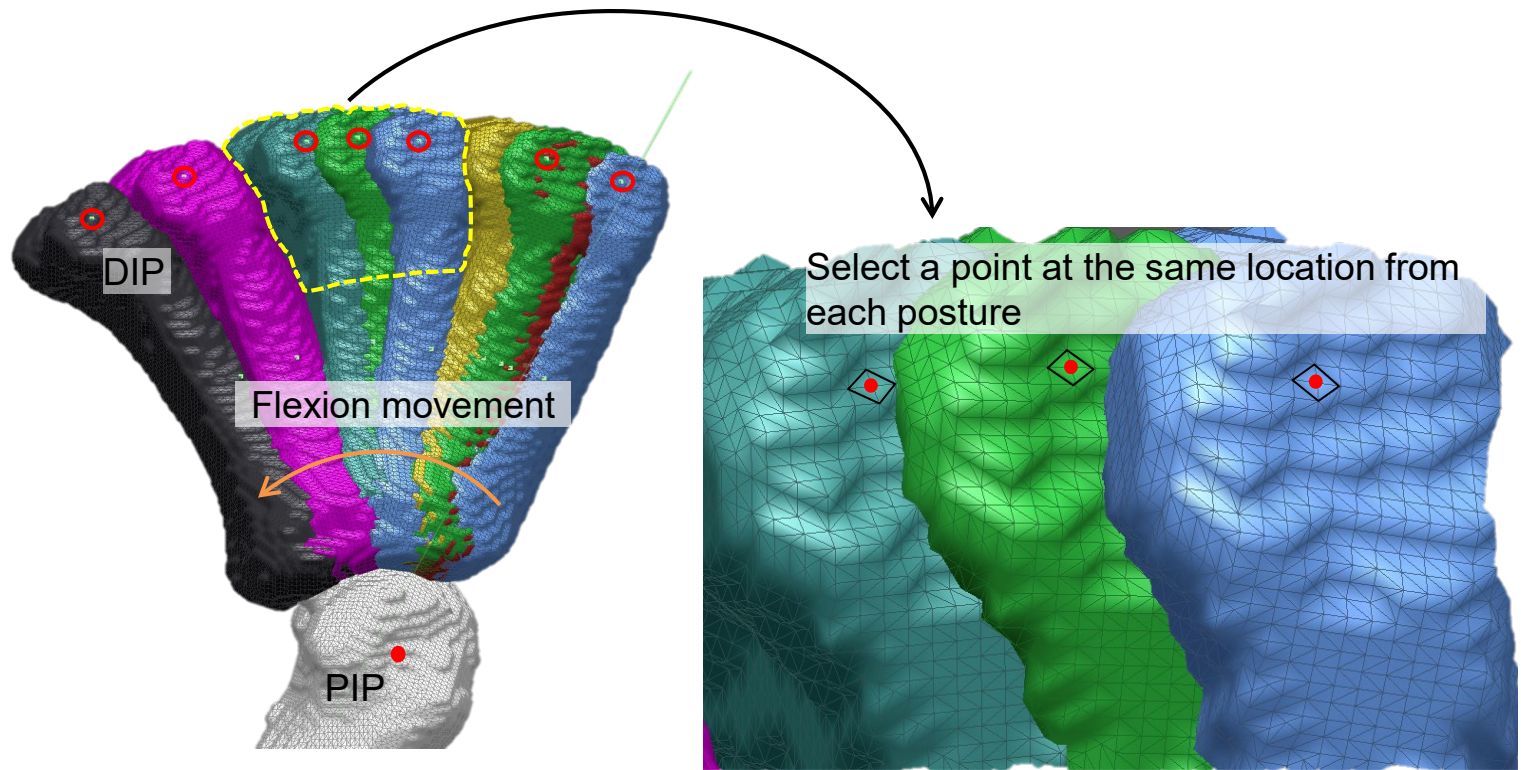
- **Reuleaux method**
 - Estimate an **instantaneous joint CoR** from 2 postures using the **displacement vectors of 2 landmarks**
 - S1. Select **landmarks A** and **B** and their **displacement vectors**
 - S2. Find an **intersection point** between the **perpendicular bisectors of the 2 landmarks**



- Challis, J. H. (2001). Estimation of the finite center of rotation in planar movements. *Medical Engineering & Physics*, 23, 227-233.
- Silmara Nicolau Pedro da Silva, R. M. (2005). Measurement of the flexing force of the fingers by a dynamic splint with a dynamometer. *CLINICS*, 60(5), 381-388.
- Reuleaux, F. (1875). *Theretische Kinematik*. Braunschweig.

S1. Select Landmark (2/2)

- Select a **point** using RapidForm from **each posture at the same location** of the bone surface data as **landmark**



Measures of Joint CoR Estimation Method

- Consistency

- Measured using mean distance between CoRs (mm)

$$\text{Mean distance (MD), mm} = \frac{\sum_{i=1}^N \sum_{i \neq j}^N |X_i - X_j|^2}{C_N^2}$$

↓ Mean distance ↑ Consistency

- Variability

- Measured using standard error (mm)

$$\text{Standard error, mm} = \sqrt{\frac{\sum_{i=1}^N (X_i - \bar{X})^2}{n - 1}}$$

↓ Standard error ↑ Variability

Results

- 96% of joints were significantly different in consistency between PCA method and Reuleaux method ($p < 0.001$) for majority of joints based on paired t-test.

Hand size:

Large

Medium

Small

P1

Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Middle	$p < 0.0005$	$p < 0.0005$	$p = 0.003$
Ring	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Little	$p < 0.0005$	$p < 0.0005$	$p = 0.005$

P4

Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Middle	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Ring	$p = 0.008$	$p < 0.0005$	$p < 0.0005$
Little	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$

P7

Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Middle	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Ring	$p < 0.0005$	$p < 0.0005$	$p = 0.002$
Little	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$

P2

Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p = 0.003$	$p = 0.059$
Middle	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Ring	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Little	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$

P5

Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Middle	$p < 0.0005$	$p < 0.0005$	$p = 0.995$
Ring	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Little	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$

P8

Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Middle	$p < 0.0005$	$p = 0.404$	$p < 0.0005$
Ring	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Little	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$

P3

Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Middle	$p < 0.0005$	$p = 0.162$	$p < 0.0005$
Ring	$p < 0.0005$	$p = 0.029$	$p < 0.0005$
Little	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$

P6

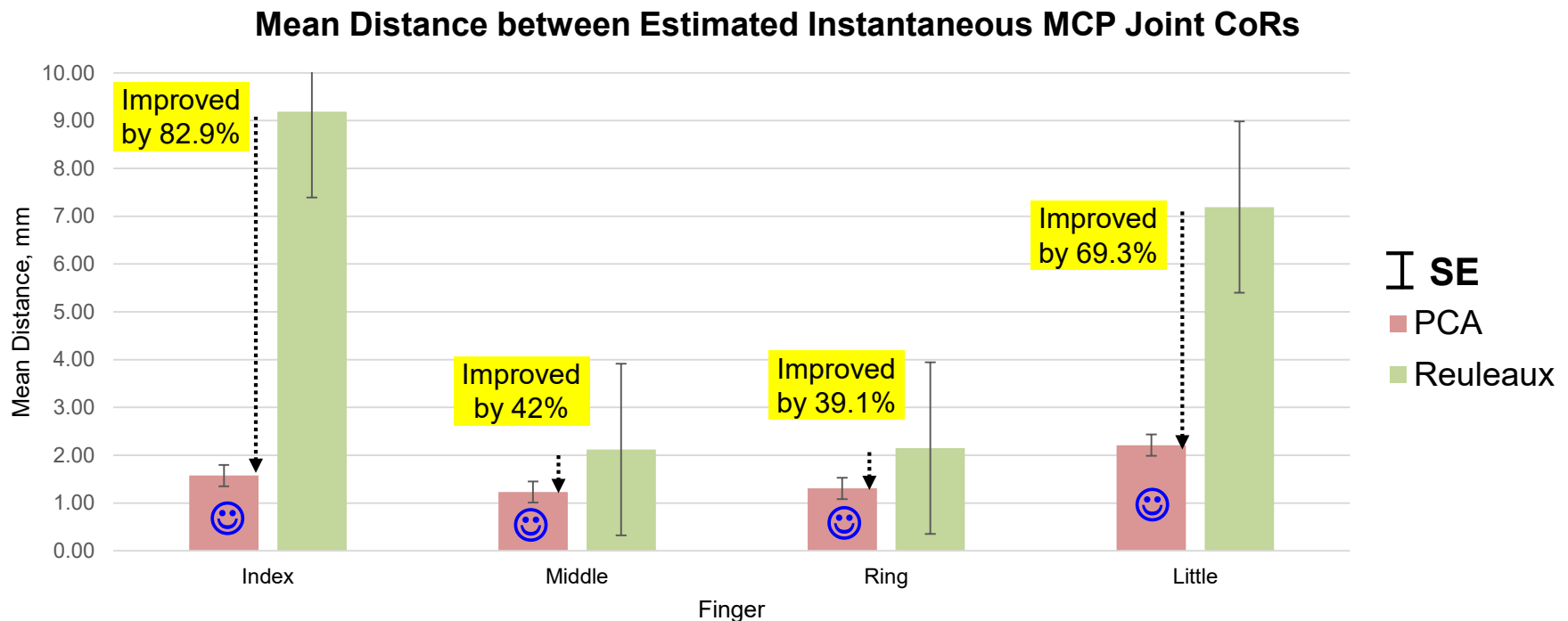
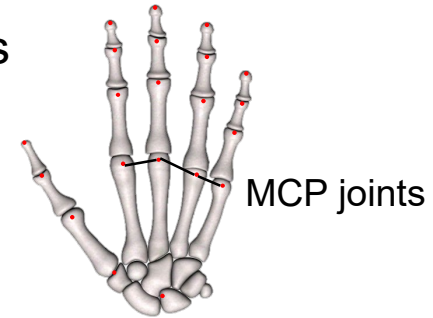
Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Middle	$p < 0.0005$	$p = 0.009$	$p < 0.0005$
Ring	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Little	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$

P9

Finger	P-Value of Paired T-test of PCA with Realeaux		
	MCP	PIP	DIP
Index	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Middle	$p = 0.003$	$p < 0.0005$	$p < 0.0005$
Ring	$p < 0.0005$	$p < 0.0005$	$p < 0.0005$
Little	$p < 0.0005$	$p < 0.0005$	$p = 0.169$

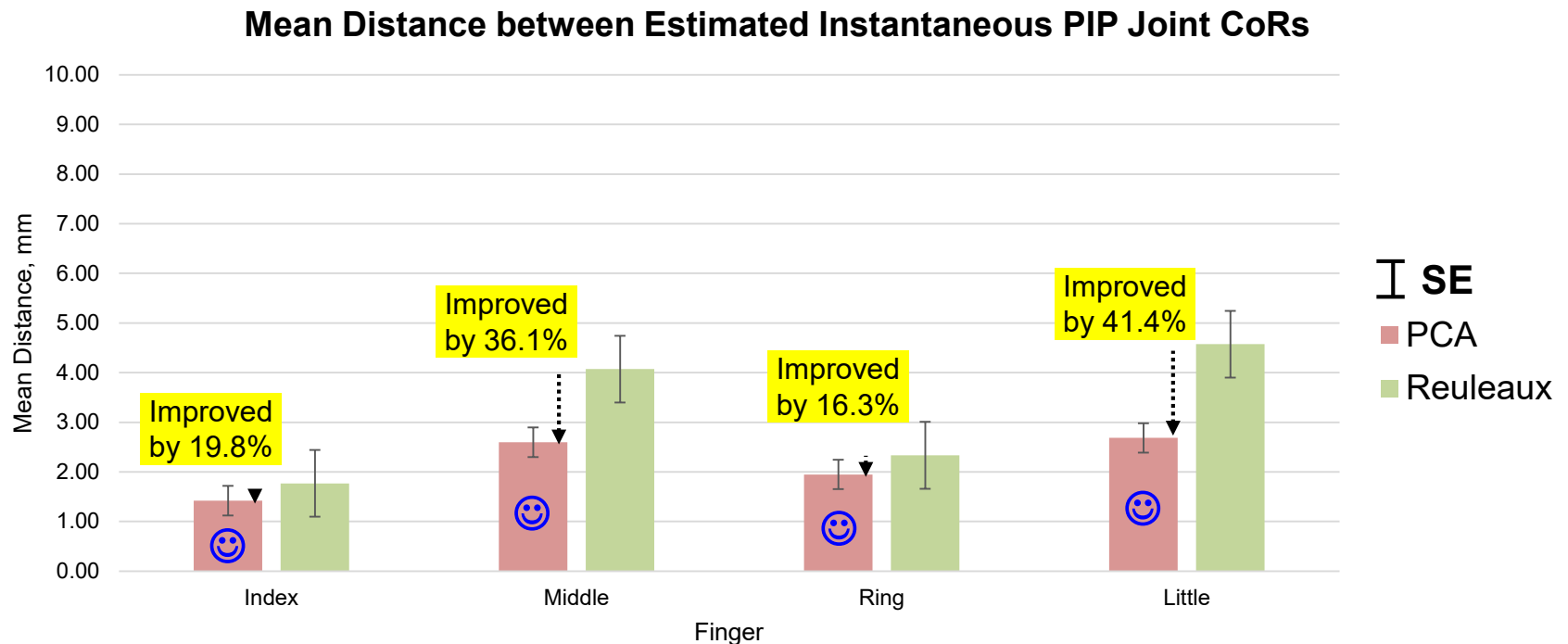
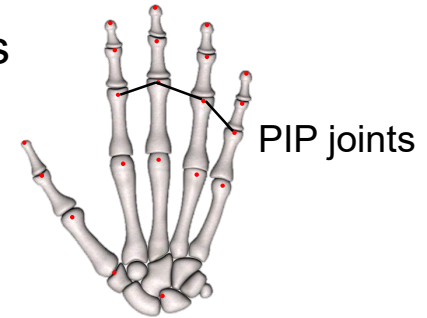
Consistency of Instantaneous CoR: MCP Joint

- PCA method provided more consistent and less variability results (MD = 1.57 ± 0.52 for index, 1.23 ± 0.84 for middle, 2.12 ± 0.82 for ring, 2.21 ± 1.18 mm for little fingers)



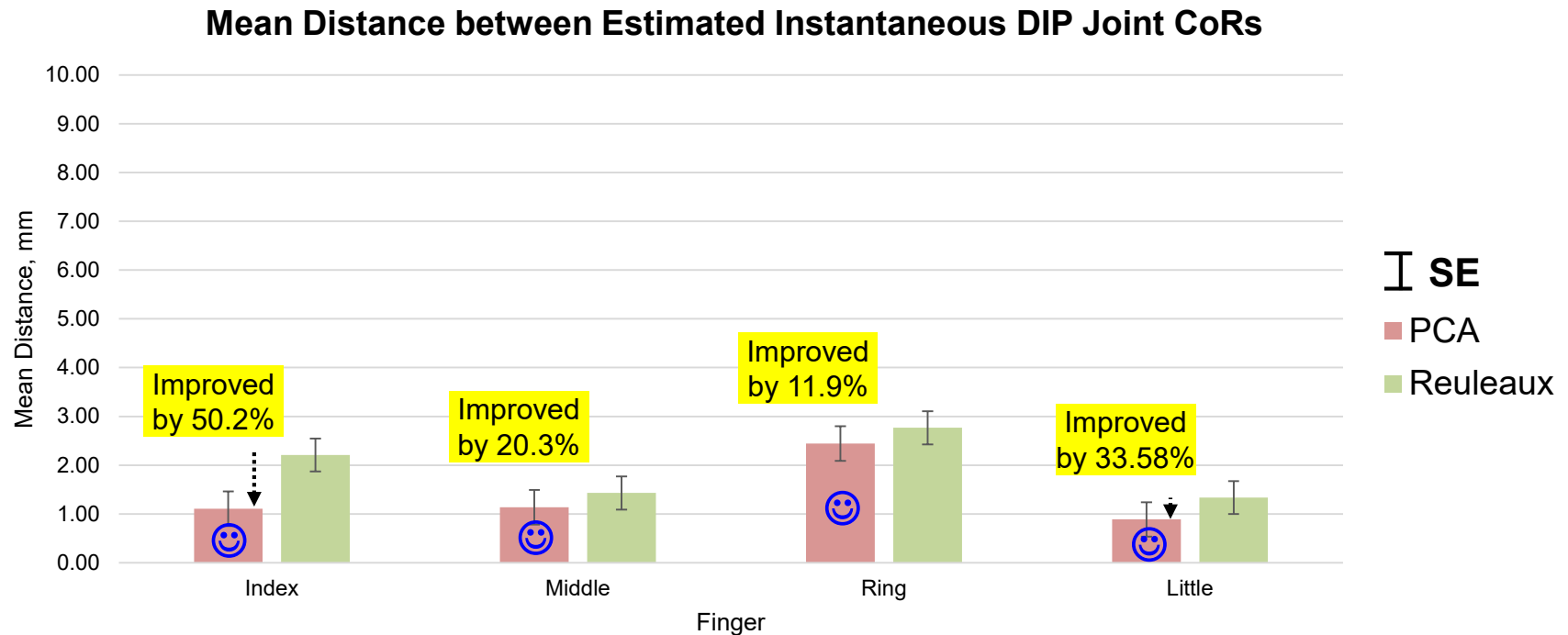
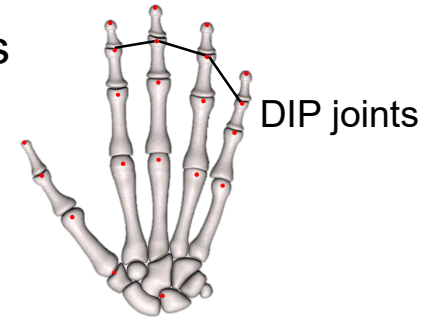
Consistency of Instantaneous CoR: PIP Joint

- PCA method provided more consistent and less variability results (MD = 1.42 ± 0.85 for index, 2.60 ± 2.07 for middle, 1.95 ± 1.26 for ring, 2.68 ± 2.46 mm for little fingers)



Consistency of Instantaneous CoR: DIP Joint

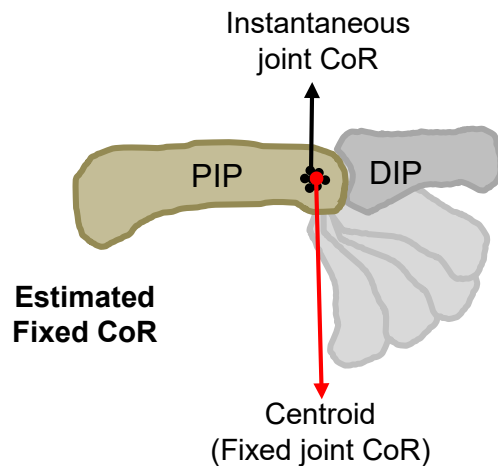
- PCA method provided more consistent and less variability results (MD = 1.10 ± 0.53 for index, 1.14 ± 0.51 for middle, 2.44 ± 3.07 for ring, 0.89 ± 0.51 mm for little fingers)



CT-Based Fixed Joint CoR Estimation

Fixed Joint CoR Estimation: K-means Clustering

- **K-means clustering method**
 - Estimate a **centroid** from a group of estimated **instantaneous joint CoRs** as **fixed CoR** using **K-means clustering** technique ($K = 1$)



K-means technique:
Minimize the squared error function

$$J(V) = \sum_{i=1}^k \sum_{j=1}^{K_i} (\|X_i - V_j\|)^2$$

K_i = the number of data points in i^{th} case

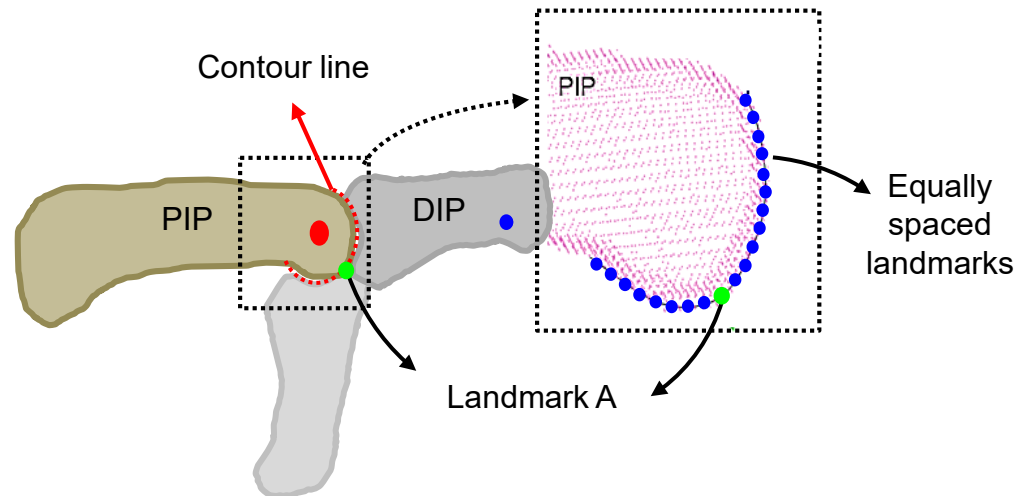
$k = 1$ which is the number of cluster centers

V_j = the centroid for cluster j

$\|X_i - V_j\|$ = the distance between 2 n-dimensional data points, X_i, V_j

Fixed Joint CoR Estimation: Bone Curvature (1/2)

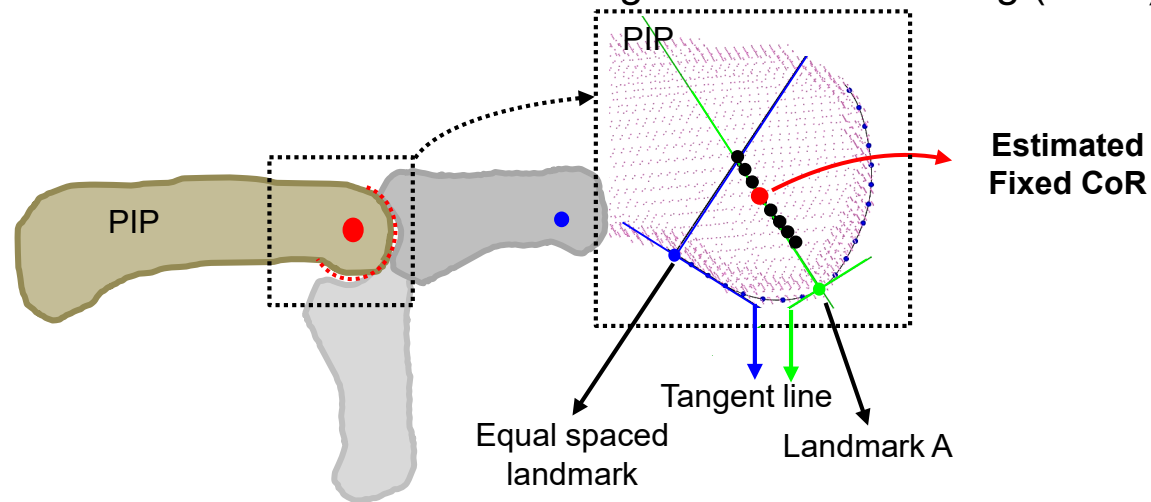
- **Bone curvature method**
 - Estimate the **fixed joint CoR** from the **center** of the **curvature of bone head**
 - Steps
 - S1. Define a **contour line of the bone head**, **landmark A** (point that has the highest curvature on the contour), **equally spaced landmarks** along the contour



N.K. Fowler, A. N. (2001). Method of determination of three dimensional index finger moment arms and tendon lines of action using high resolution MRI scans. *Journal of Biomechanics*, 34, 791-797.

Fixed Joint CoR Estimation: Bone Curvature (2/2)

- Steps (cont.)
 - S2. Draw **tangent lines** that passing through the **landmark A** and an **equal spaced landmark**
 - S3. Draw the **normal of the tangent lines**
 - S4. Find an **intersection point** between the **normal lines**
 - S5. Compute a **centroid as fixed CoR** using K-means clustering ($K = 1$)



N.K. Fowler, A. N. (2001). Method of determination of three dimensional index finger moment arms and tendon lines of action using high resolution MRI scans. *Journal of Biomechanics*, 34, 791-797.

S1. Define Contour Line and Landmarks (3/3)

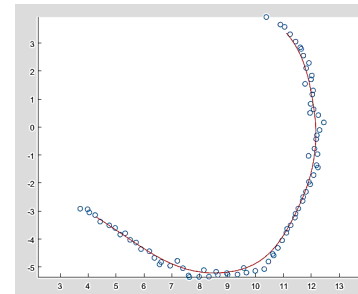
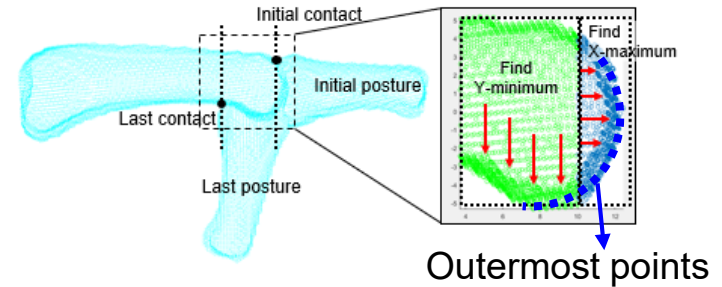
1. Find the **outermost points** around the **bone head surface**



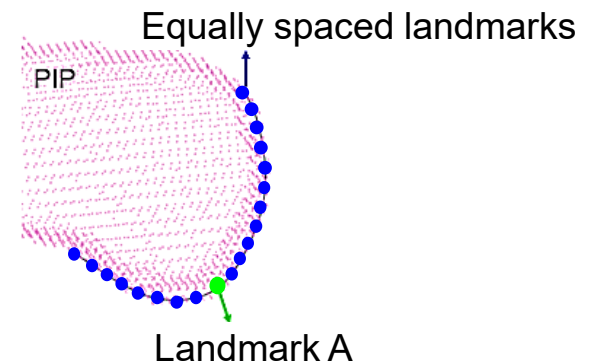
2. **Connect those points to form a contour line** and **smooth the contour line** using Gaussian smoothing filter (smoothing window = 5~15)



3. Determine the point with the **highest curvature** from the contour line as **landmark A** and other equally spaced landmarks

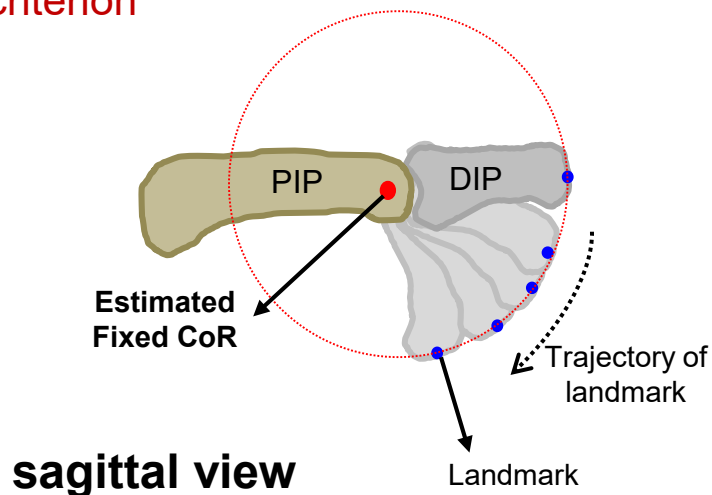


— Contour line
○ Outermost points



Fixed Joint CoR Estimation: D-K Method

- **D-K method**
 - Estimate a **fixed joint CoR** from the **trajectory of a landmark**
 - **Steps**
 - S1. Select a **landmark** from each posture at the same position of bone surface data
 - S2. **Fit a circle** to the trajectory of the **landmark** by **minimizing the least square error criterion**



Least square error criterion:

$$\text{Min} \sum_{i=1}^N (R_i - R)^2$$

* Where $R_i = (x_i - A)^2 + (y_i - B)^2$

(x_i, y_i) = Marker locations

(A, B) = Calculated joint CoR

R = Radius of the fitted circle over the trajectory of marker motion

KASA. (1976). A Circle Fitting Procedure and Its Error Analysis. IEEE TRANSACTIONS ON INSTRUMENTATION AND MEASUREMENT, 8-14.

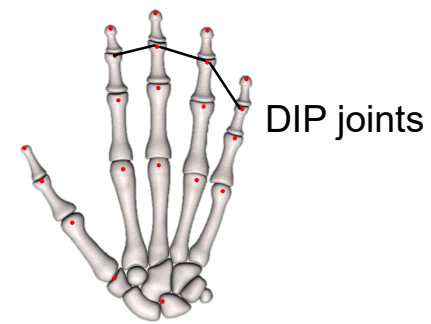
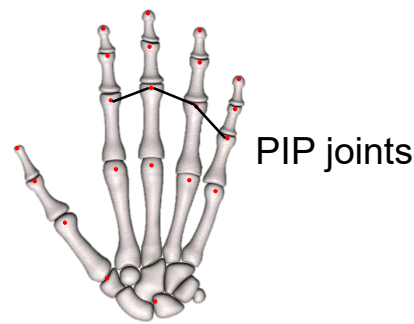
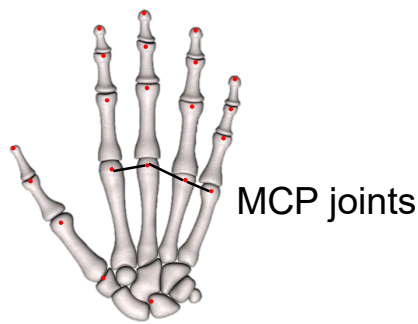
Consistency of Fixed CoR: Summary

- Review of methods that provide the most consistent fixed joint CoR

Unit: mm

	Index	Middle	Ring	Little
MCP	D-K (1.80±0.84)	Reuleaux (1.08 ± 0.25)	D-K (1.28±0.49)	PCA (1.37 ± 0.45)
PIP	D-K (0.41±0.20)	D-K (0.40±0.15)	Reuleaux (0.45 ± 0.23)	D-K (0.47±0.28)
DIP	D-K (0.52 ± 0.14)	Reuleaux (0.65 ± 0.21)	D-K (0.45 ± 0.23)	D-K (0.33 ± 0.11)

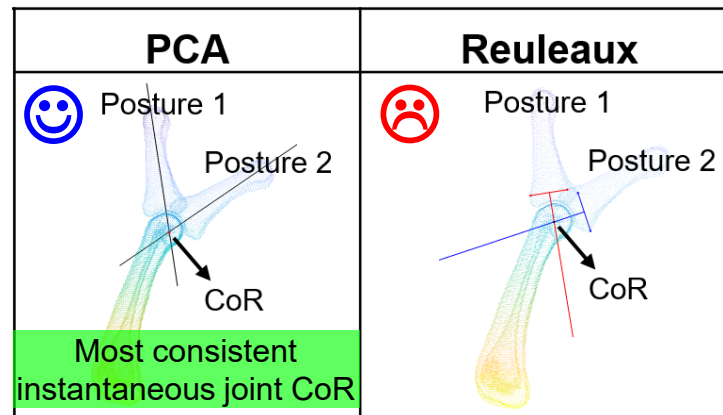
Estimated fixed joint CoR by Delonge-Kasa (D-K) is selected as reference CoR and used to validate motion-based joint CoR



Discussion

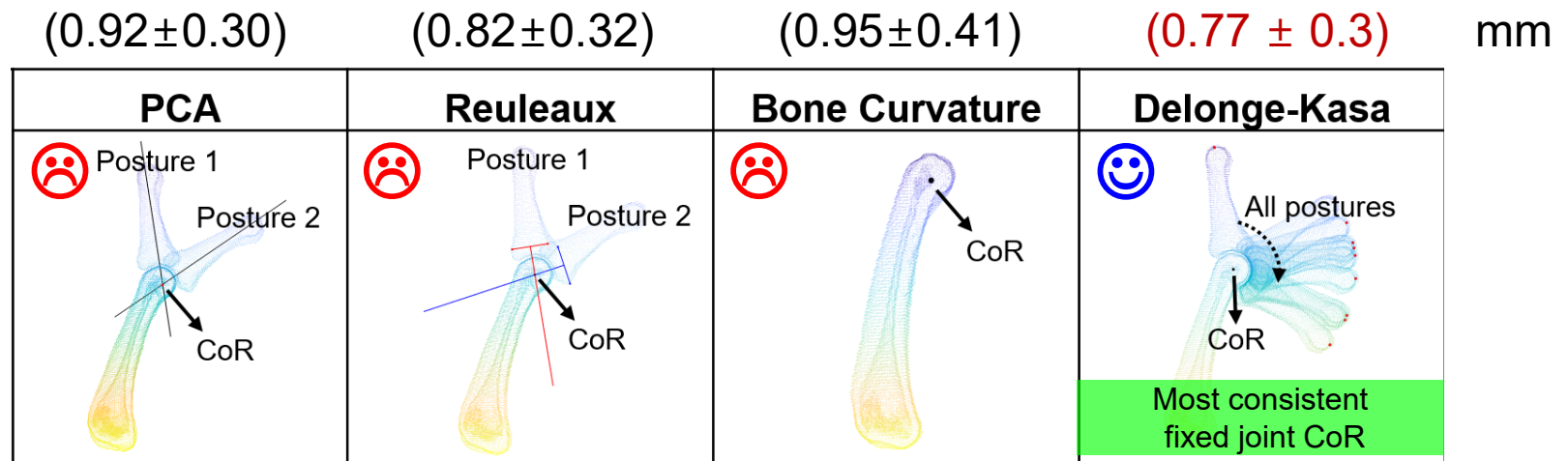
CT-based Joint CoR Estimation (1/2)

- Compared the **instantaneous joint CoR estimation** methods: PCA and Reuleaux
 - PCA (1.71 ± 0.84) > Reuleaux (3.43 ± 3.86)** in terms of the **mean consistency** and **variability** of CoR
 - MCP: 58.3% higher** (Variability: **82.4% lower**)
 - PIP: 28.4% higher** (Variability: **61.5% lower**)
 - DIP: 29% higher** (Variability: **30.0% lower**)



CT-based Joint CoR Estimation (2/2)

- Compared the **fixed joint CoR estimation** methods: PCA, Reuleaux, D-K, and Bone curvature
 - D-K (0.77 ± 0.3)** > Reuleaux (0.82 ± 0.32) > PCA (0.92 ± 0.30) > Bone curvature (0.95 ± 0.41) in terms of the **mean consistency** and **variability** of the CoR



Limitation & Future Study

- Limitation
 - The experiment is costly and lack of practicability
 - The evaluation of techniques is not include the thumb
- Future study
 - Extend the evaluation to thumb
 - Use hand anthropometric information (or motion capture data) to estimate finger joint CoR for practical application

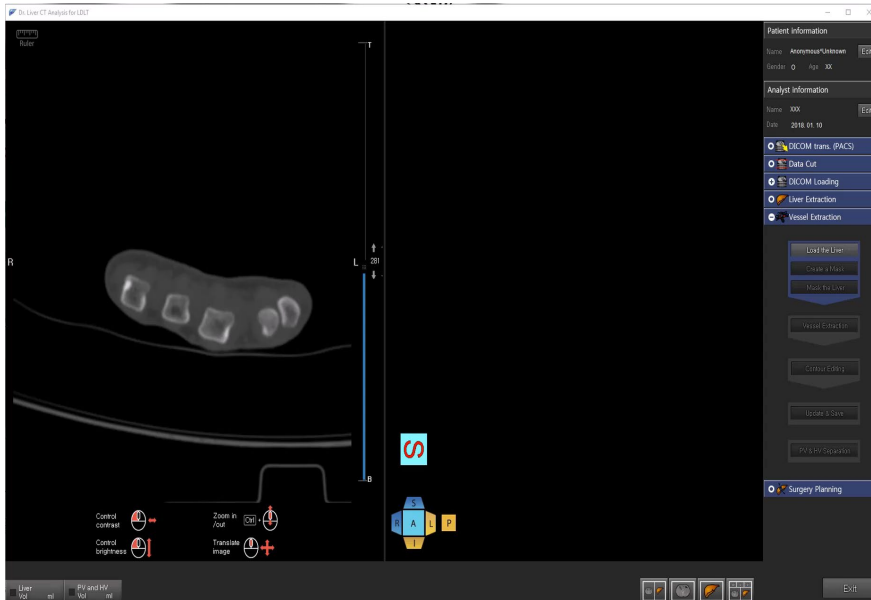


THANK YOU
FOR
YOUR
ATTENTION
ANY QUESTIONS?

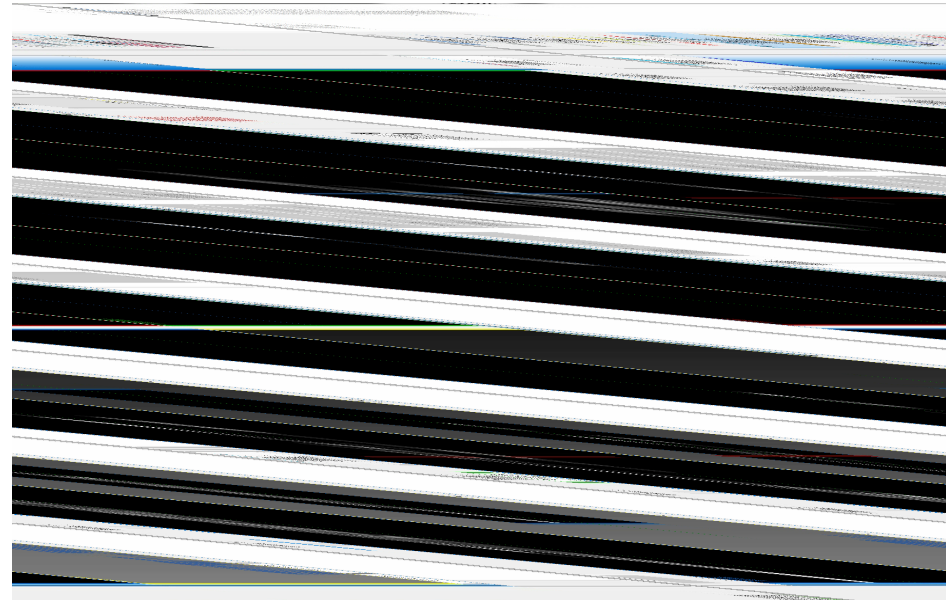
Appendices

Demo: Segmented Bone Model

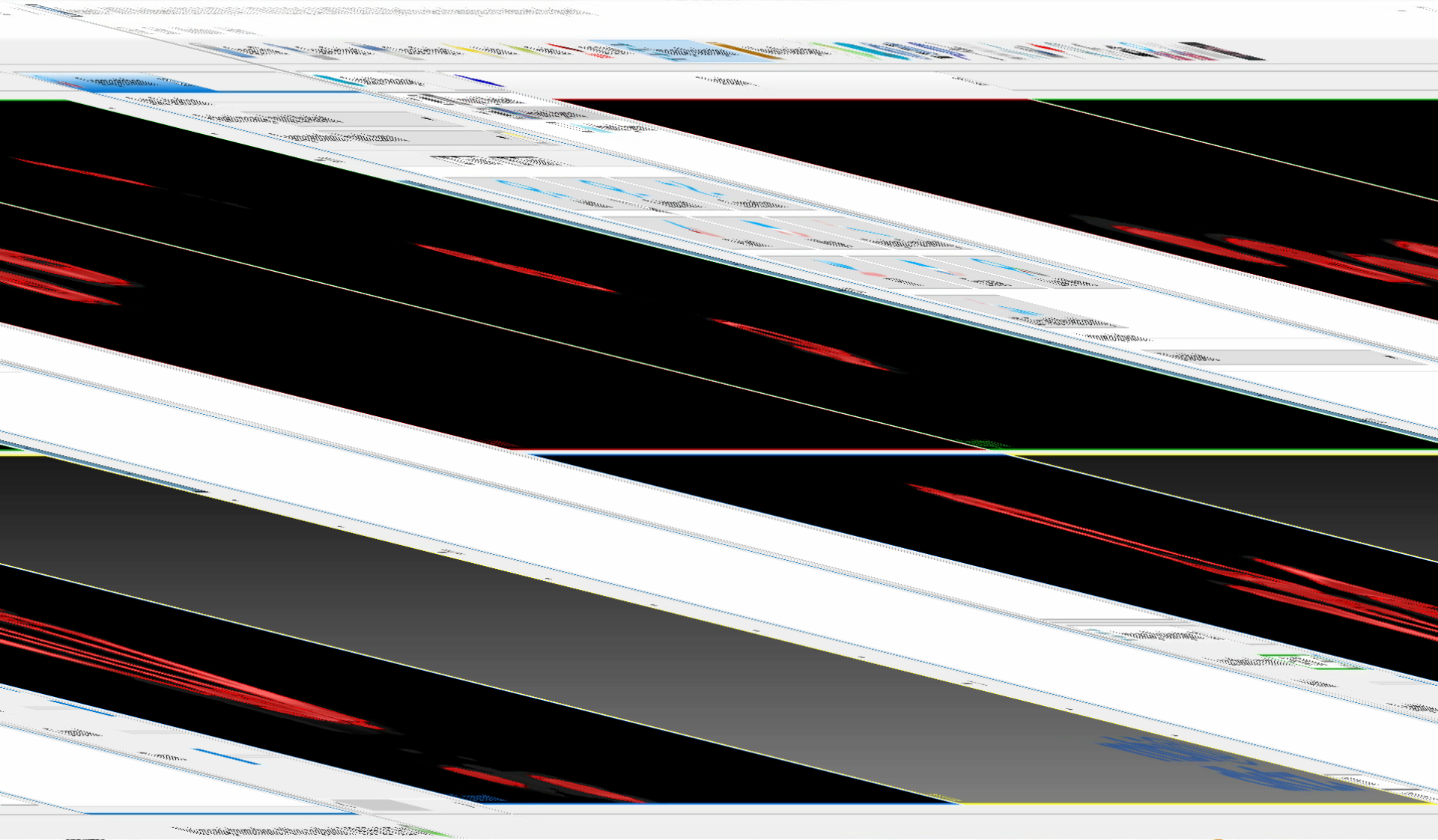
- Step 1: Masking method



- Step 2: Threshold based method



Demo: Separation of Bone Segments

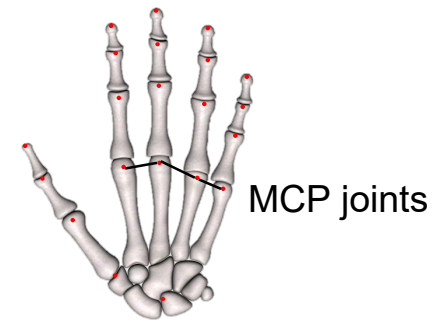


Demo: Registration of Each Bone Segments

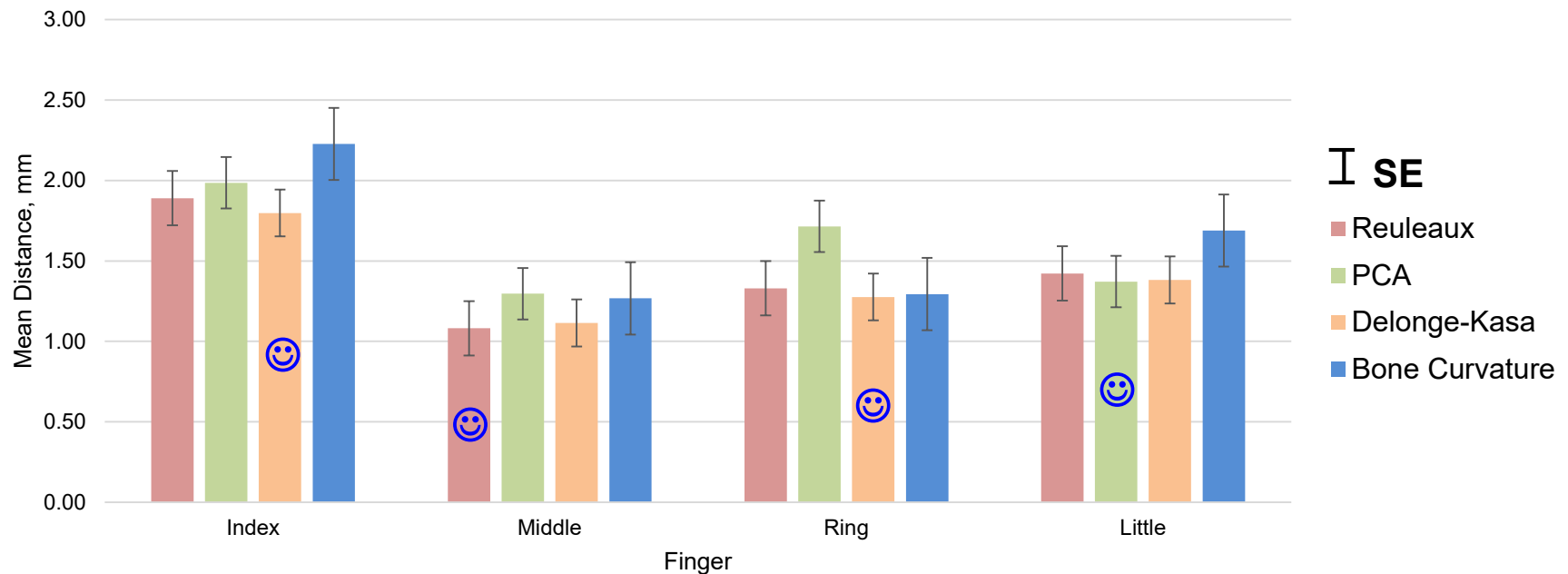


Consistency of Fixed CoR: MCP Joint

- **Methods** that provide the **most consistent** results
 - Index and ring: **D-K** (Index = 1.80 ± 0.84 ; Ring = 1.28 ± 0.49)
 - Middle: **Reuleaux** (1.08 ± 0.25)
 - Little: **PCA** (1.37 ± 0.45)

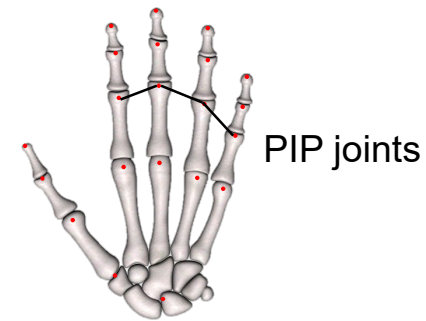


Mean Distance between Estimated Fixed MCP Joint CoRs

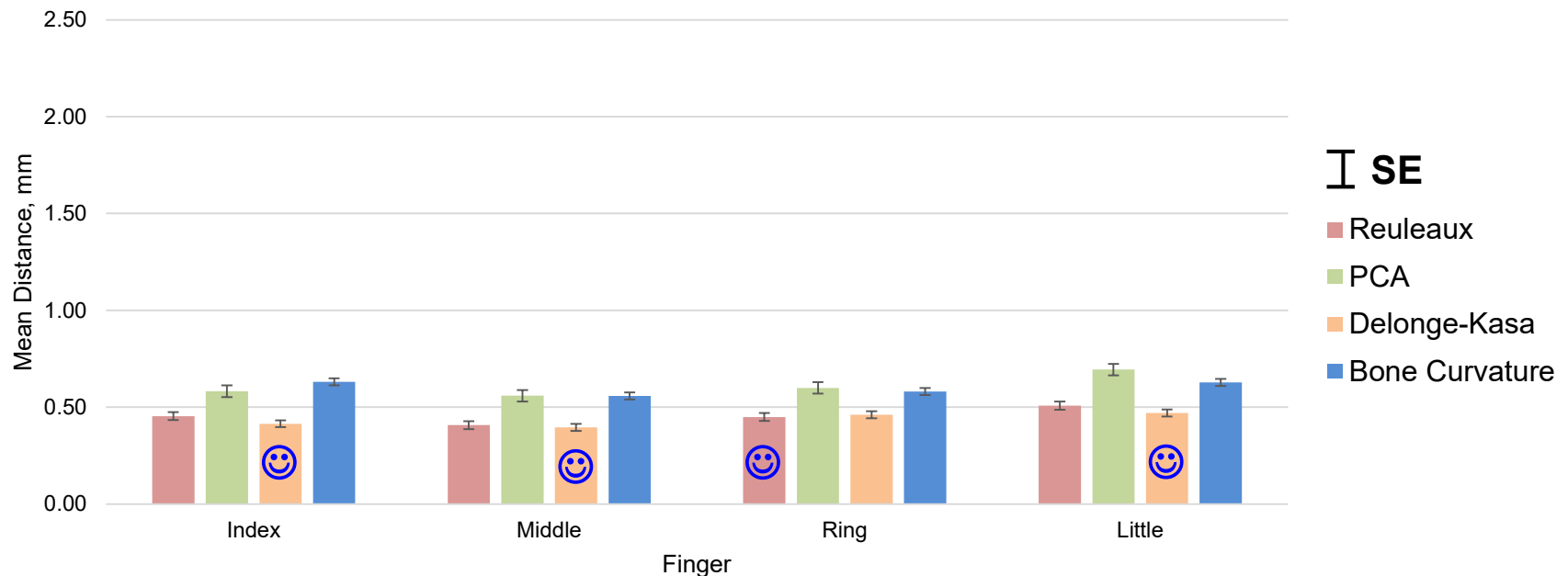


Consistency of Fixed CoR: PIP Joint

- Method that provides the **most consistent** results
 - Index, Middle, and Little finger : **D-K**
(Index = 0.41 ± 0.20 ; Middle = 0.40 ± 0.15 ; Little = 0.47 ± 0.28)
 - Ring finger : **Reuleaux** (0.45 ± 0.23)

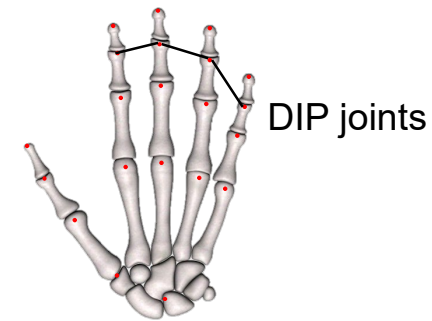


Mean Distance between Estimated Fixed PIP Joint CoRs



Consistency of Fixed CoR: DIP Joint

- Method that provides the most consistent results
 - Index, Ring, and Little finger : **D-K**
(Index = 0.52 ± 0.14 ; Ring = 0.45 ± 0.23 ; Little = 0.33 ± 0.11)
 - Middle finger : **Reuleaux** (0.65 ± 0.21)



Mean Distance between Estimated Fixed DIP Joint CoRs

