

# Pose Tracking: Articulated Object Tracking

CS 6334 Virtual Reality  
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The University of Texas at Dallas

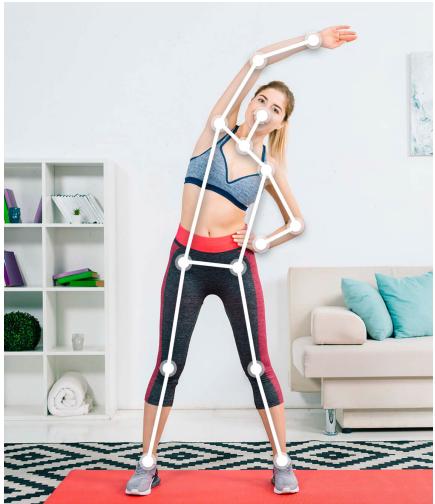
# Tracking in VR

- Tracking the user's sense organs
  - E.g., Head and eye
  - Render stimulus accordingly
- Tracking user's other body parts
  - E.g., **human body and hands**
  - Locomotion and manipulation
- Tracking the rest of the environment
  - Augmented reality
  - Obstacle avoidance in the real world

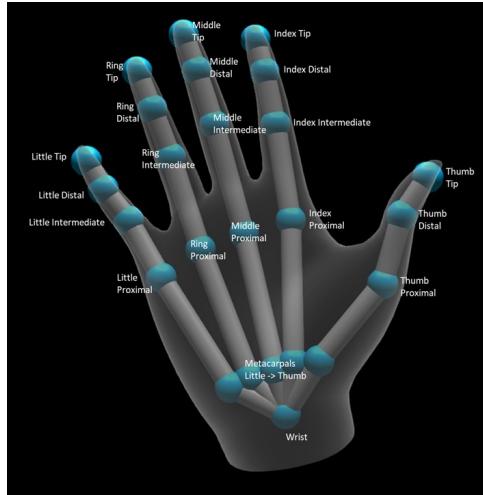


# Articulated Objects

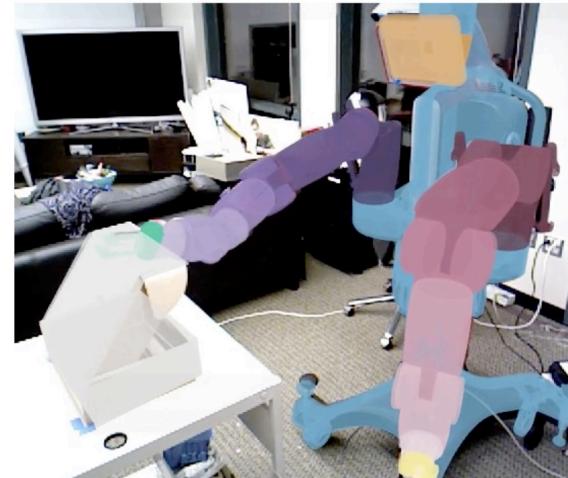
- Objects with joints or articulations
- Links or parts of the object can move relative to each other



Human body



Human hand



Robot



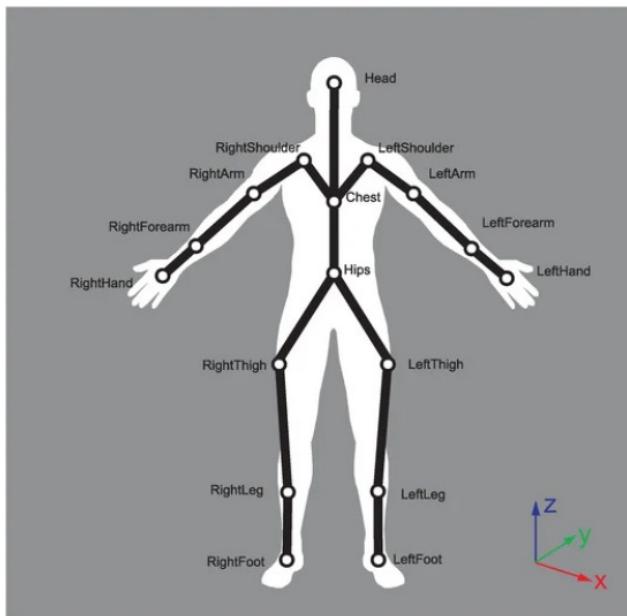
Drawer



Cabinet

# Kinematics

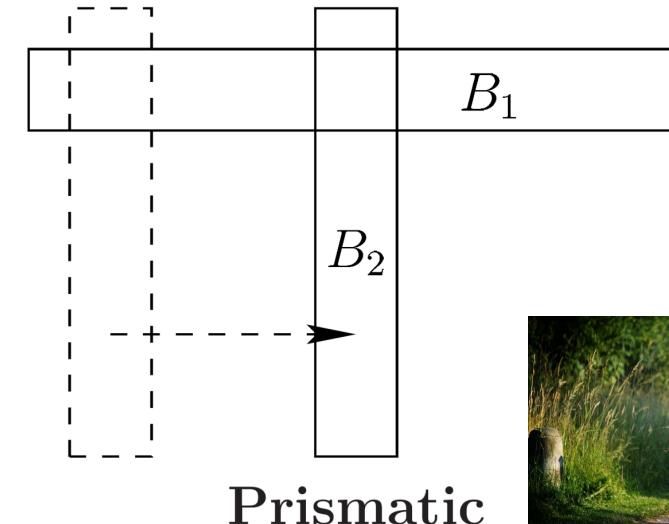
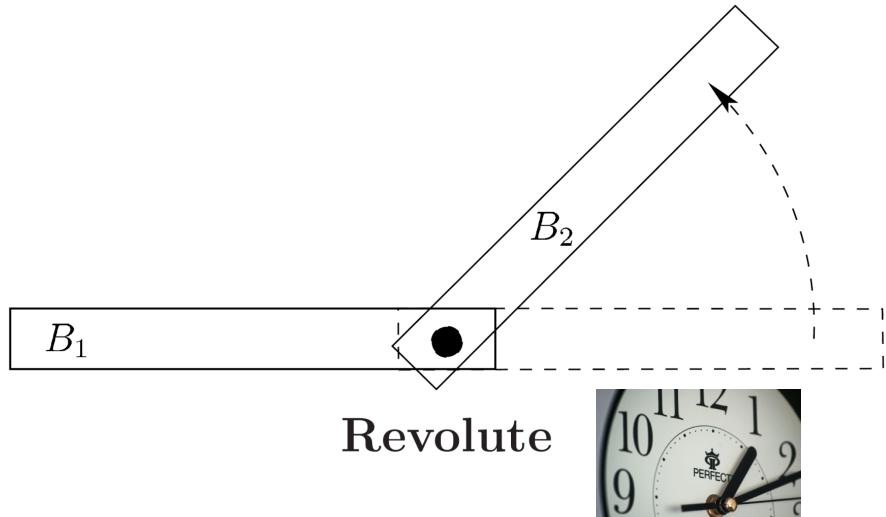
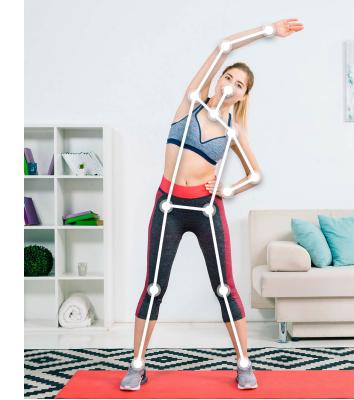
- The study of motion, without regard for the cause of the motion
  - Articulated objects
  - Do not consider the forces that cause the motion



<https://www.mdpi.com/1424-8220/17/11/2590/htm>

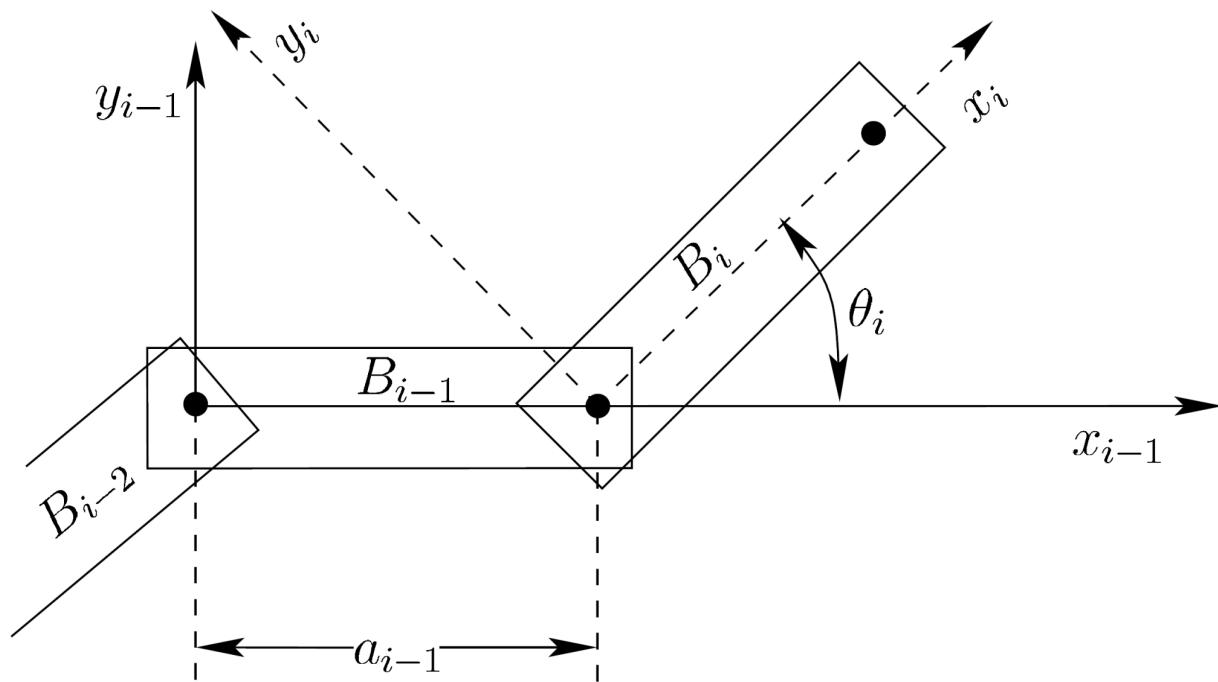
# Links and Joints

- Each body of a multibody system is called a link
- A pair of bodies are attached at a joint
  - Revolute joint
  - Prismatic joint

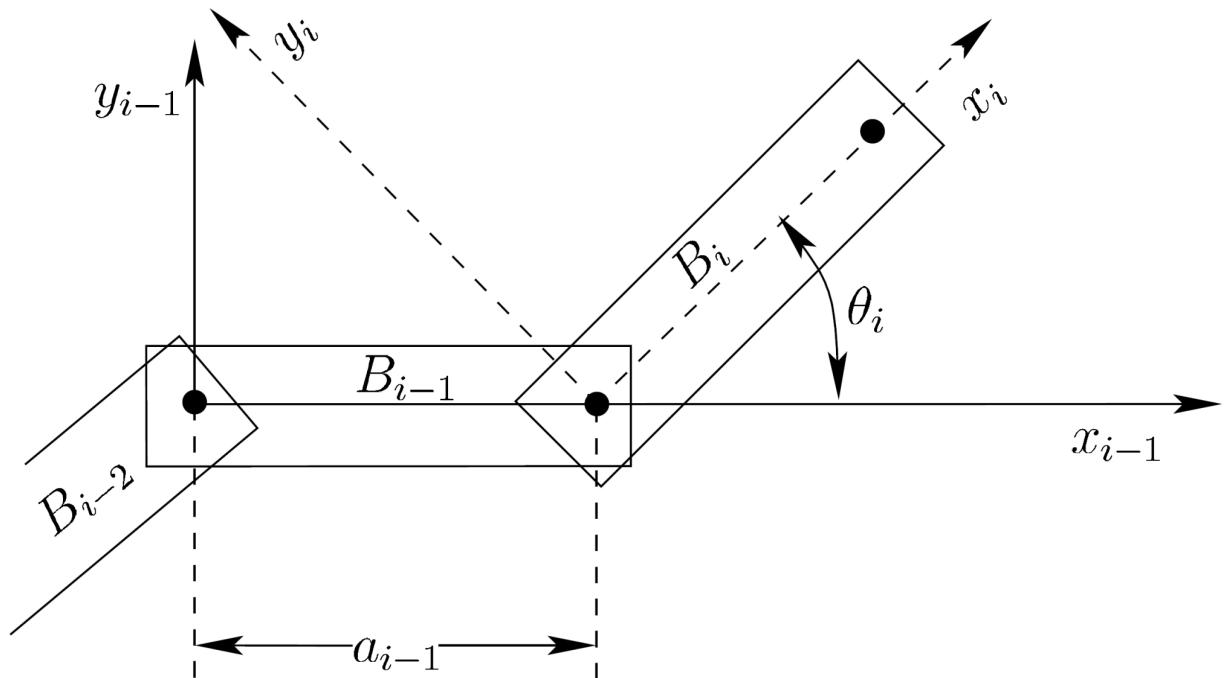


# Forward Kinematics

- Given joint parameters, compute the position of a point on the last link in the coordinate frame of the first link (world frame)
- Body frame of each link
  - Origin defined on the joint



# Forward Kinematics



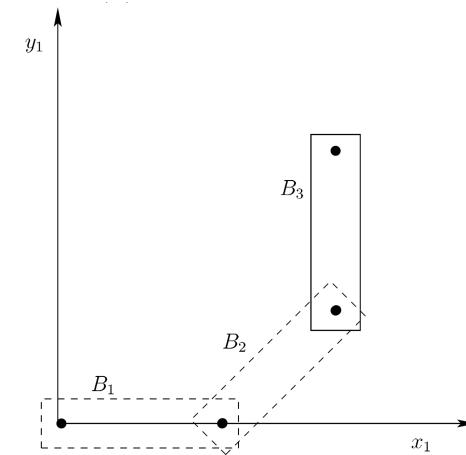
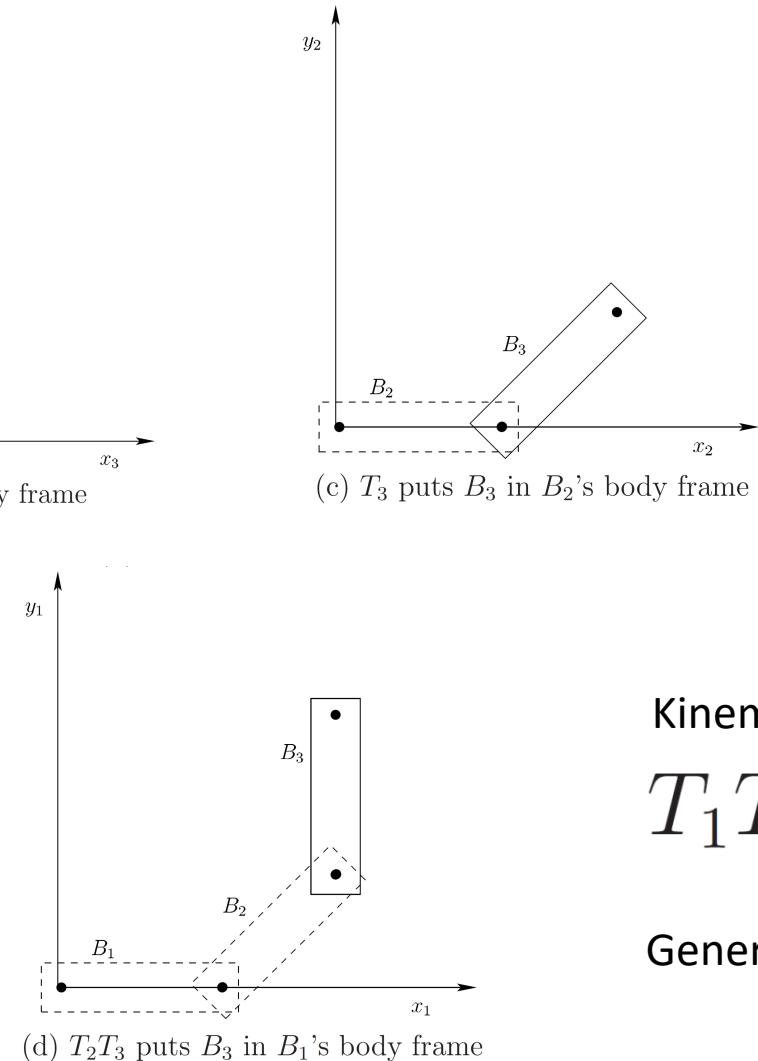
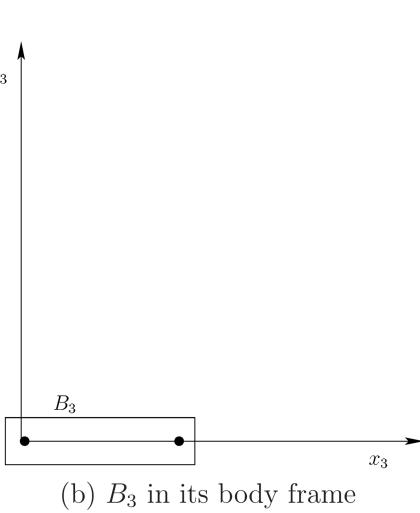
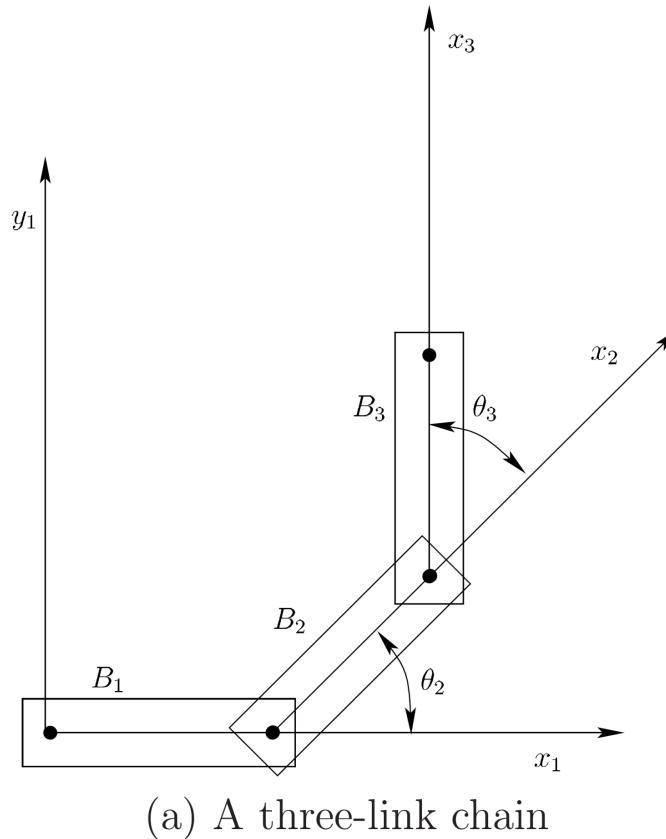
$$T_i = \begin{pmatrix} \cos \theta_i & -\sin \theta_i & a_{i-1} \\ \sin \theta_i & \cos \theta_i & 0 \\ 0 & 0 & 1 \end{pmatrix}$$

Transform a point in  $B_i$  to the body frame of  $B_{i-1}$

For a revolute joint,  $\theta_i$  is a variable,  $a_{i-1}$  is a constant

For a prismatic joint,  $\theta_i$  is a constant,  $a_{i-1}$  is a variable

# Forward Kinematics

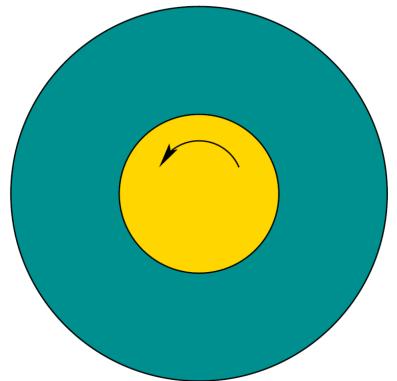


Kinematic chain

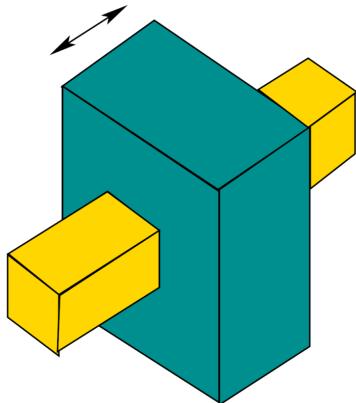
$T_1 T_2 \cdots T_i$

Generalize to 3D

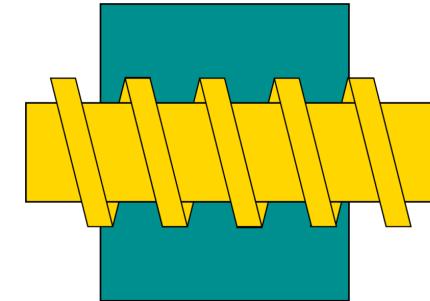
# 3D Joints



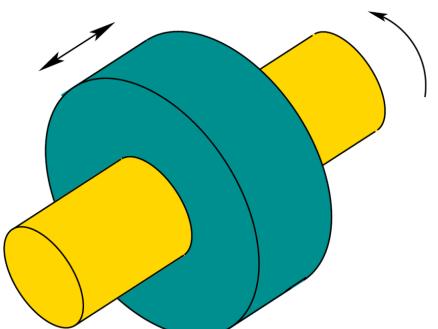
**Revolute**  
1 DOF



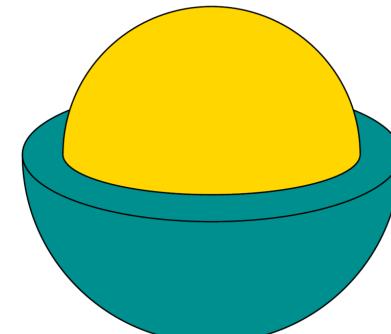
**Prismatic**  
1 DOF



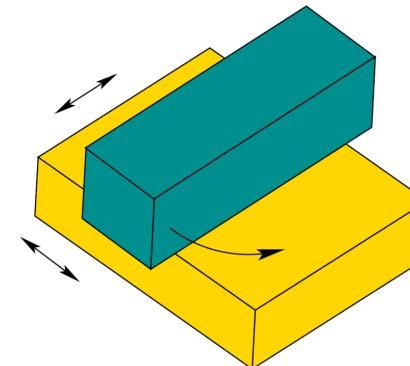
**Screw**  
1 DOF



**Cylindrical**  
2 DOFs



**Spherical**  
3 DOFs



**Planar**  
3 DOFs

# Inverse Kinematics

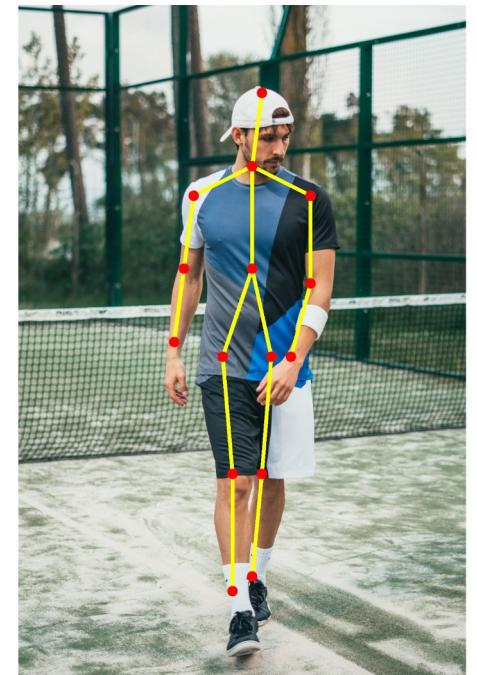
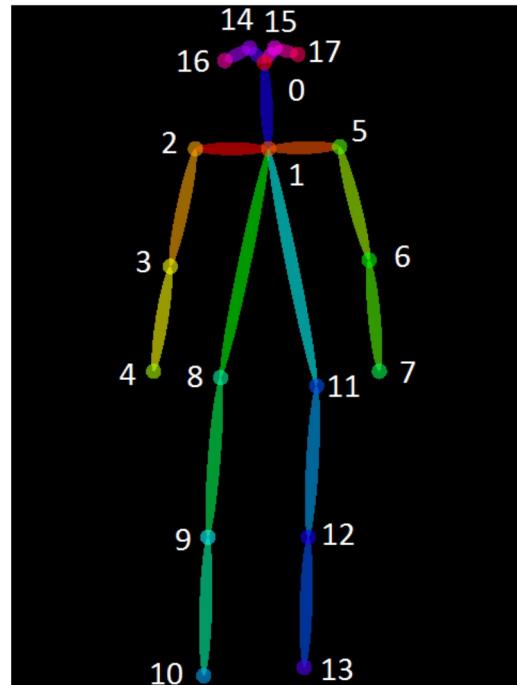
- Compute the joint parameters given the pose of the last link



The target position is represented by a red circle. The target position is defined as the input, and the resulting pose required for the end of the last link to reach the target position is the output.

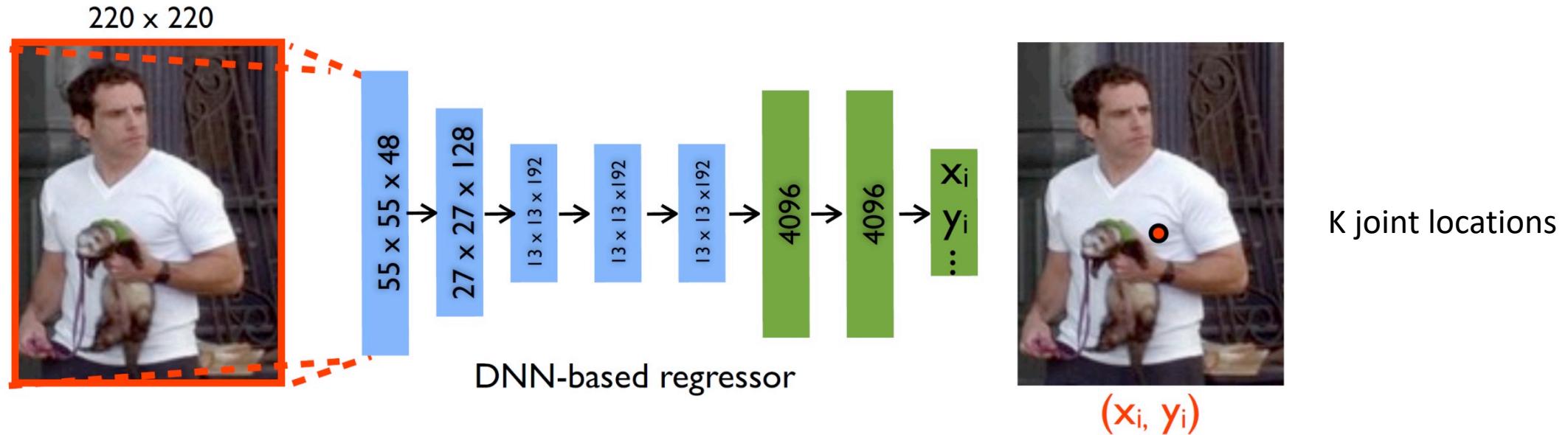
# Human Pose Estimation

- Localizing human joints in images or videos
- 2D human pose estimation
  - Detect human joints in images (x, y)
- 3D human pose estimation
  - Detect human joints in 3D (x, y, z)



# Human Pose Estimation

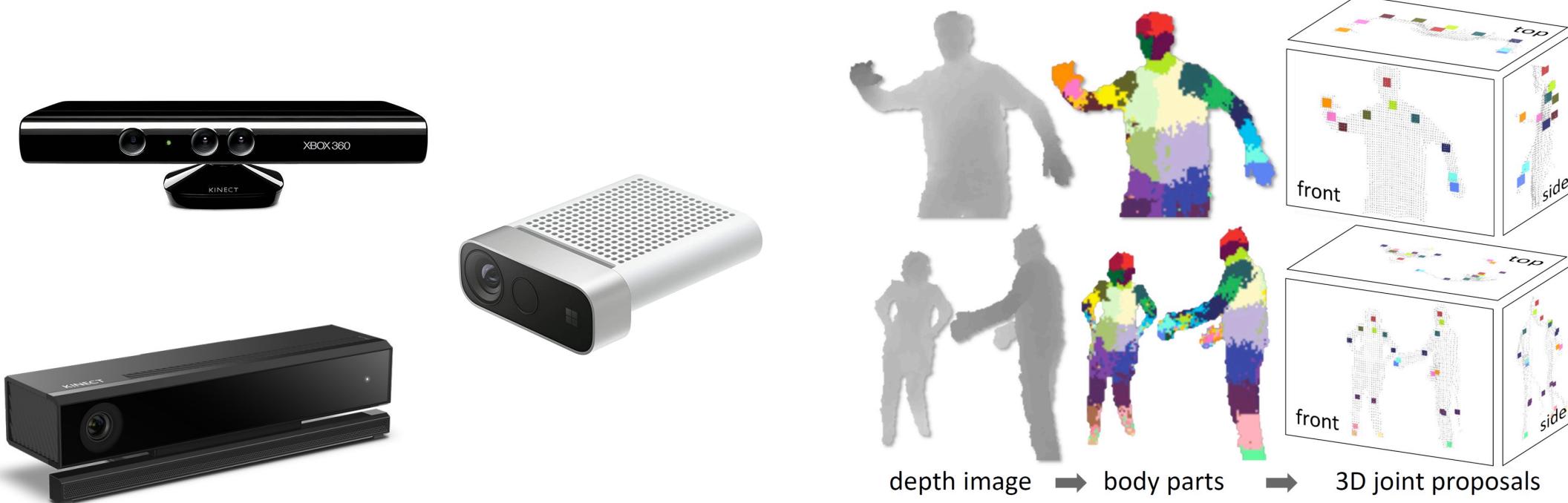
- Body joint detection/regression



DeepPose: Human Pose Estimation via Deep Neural Networks. Toshev and Szegedy, CVPR'14

# Human Pose Estimation

- Kinect: 3D human pose estimation from depth images



Real-Time Human Pose Recognition in Parts from Single Depth Images. Shotton et al, CVPR'11

# Human Pose Estimation



Realtime Multi-Person 2D Pose Estimation using Part Affinity Fields. Cao et al, CVPR'17.

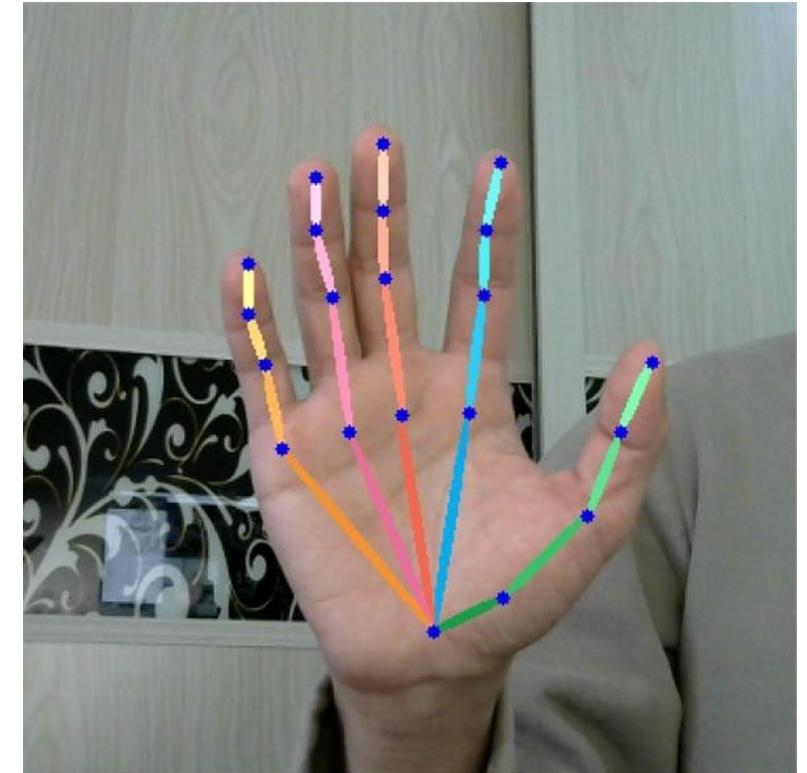
# Human Pose Estimation



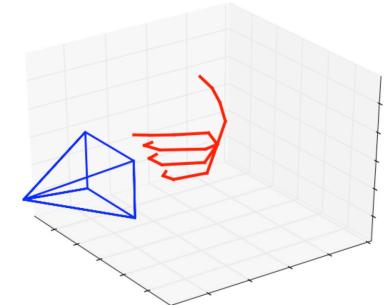
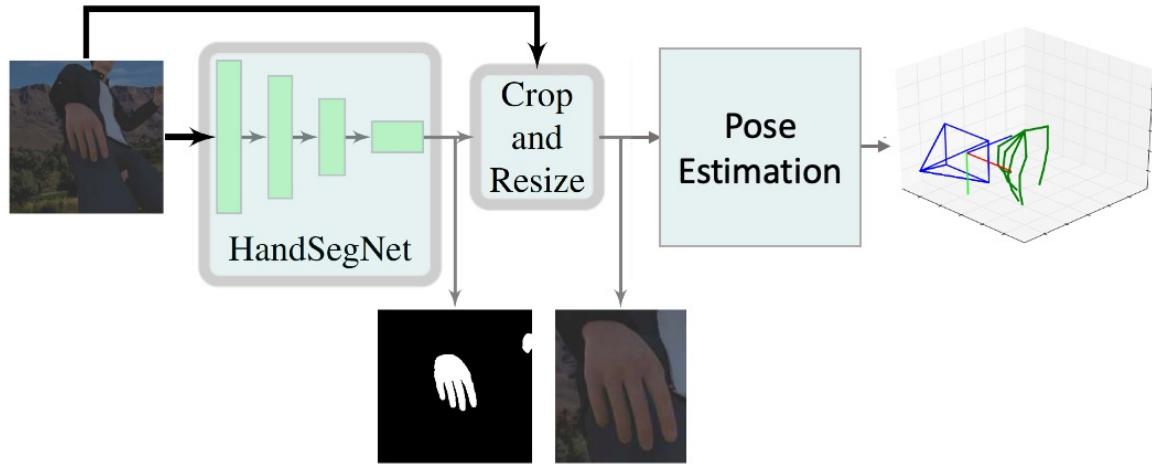
OpenPose: <https://github.com/CMU-Perceptual-Computing-Lab/openpose>

# Hand Pose Estimation

- Localizing hand joints in images or videos
- 2D hand pose estimation
  - Detect hand joints in images (x, y)
- 3D hand pose estimation
  - Detect hand joints in 3D (x, y, z)

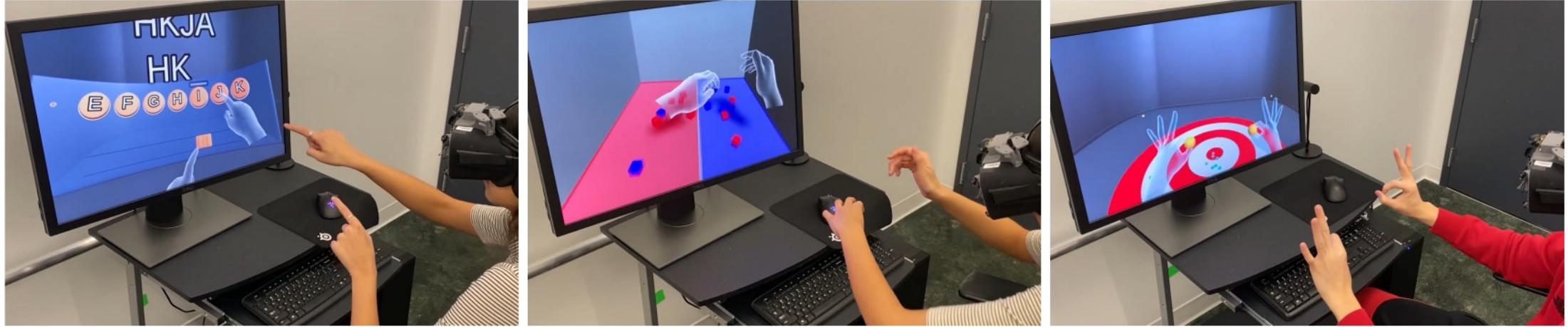


# Hand Pose Estimation



Learning to Estimate 3D Hand Pose from Single RGB Images. Zimmermann and Brox. ICCV'17.

# Hand Pose Estimation for VR

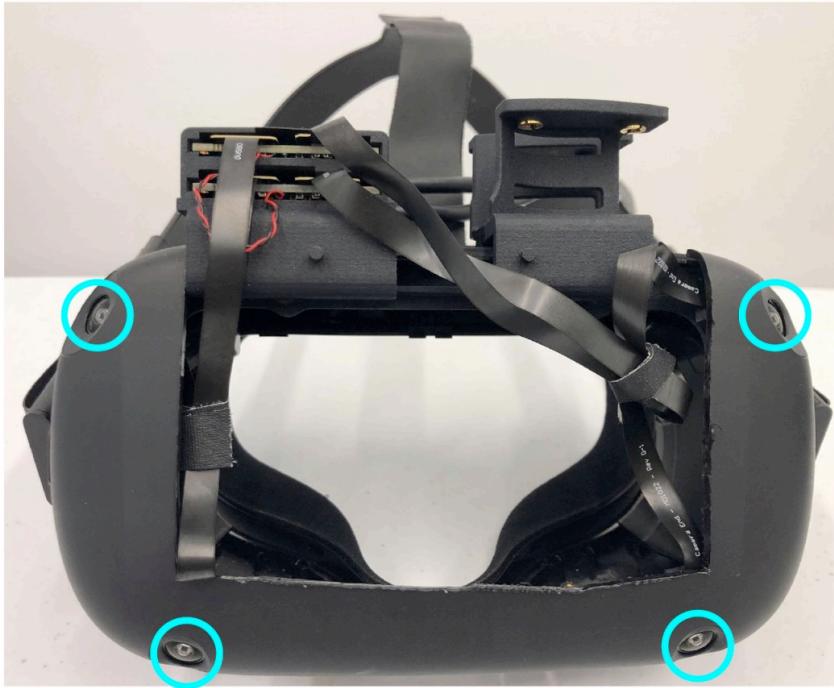


A real-time hand-tracking system using four monochrome cameras mounted on a VR headset

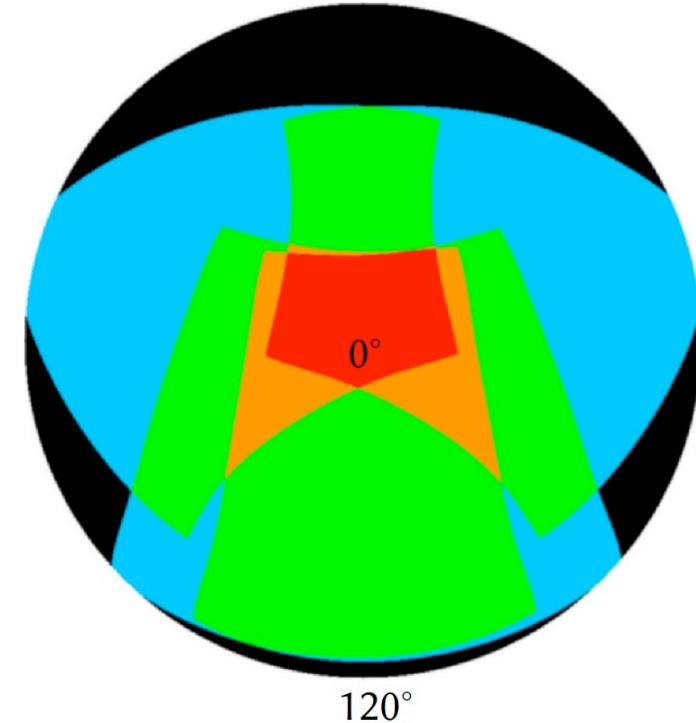
- The user's skeletal poses and rigged hand model meshes are outputted
- Users can use the system to drive interactive VR experiences

MEgATrack: Monochrome Egocentric Articulated Hand-Tracking for Virtual Reality. Han et al., SIGGRAPH'20.

# Hand Pose Estimation for VR



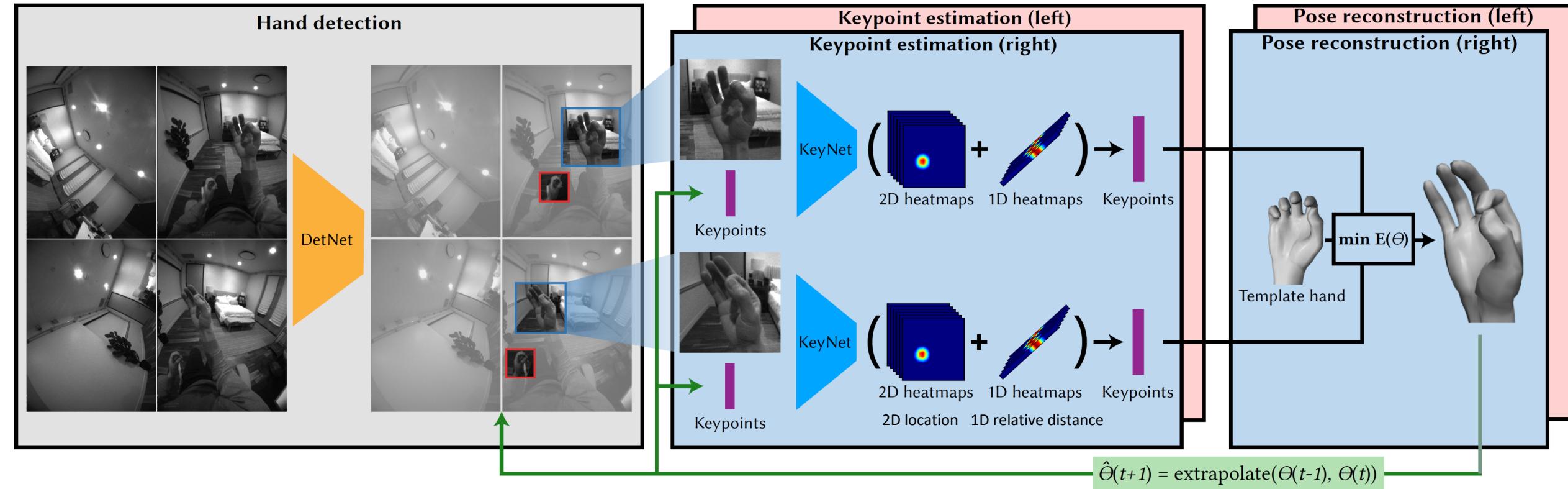
4 monochrome VGA fisheye cameras



field of view at 50cm. 4(red),  
3(orange), 2(green), 1(blue), 0(black).

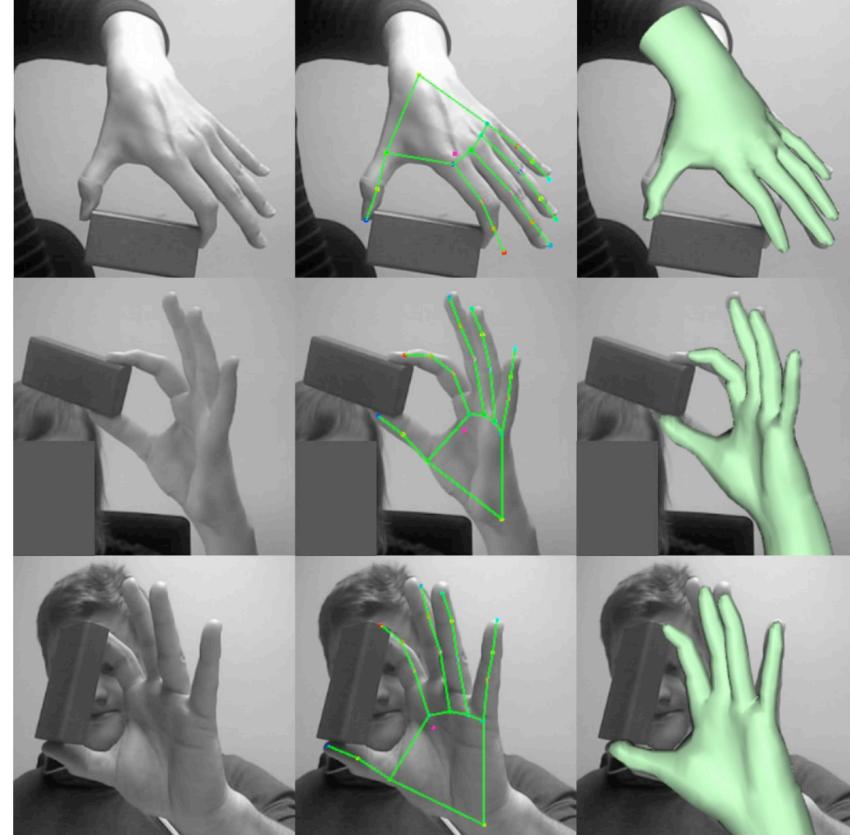
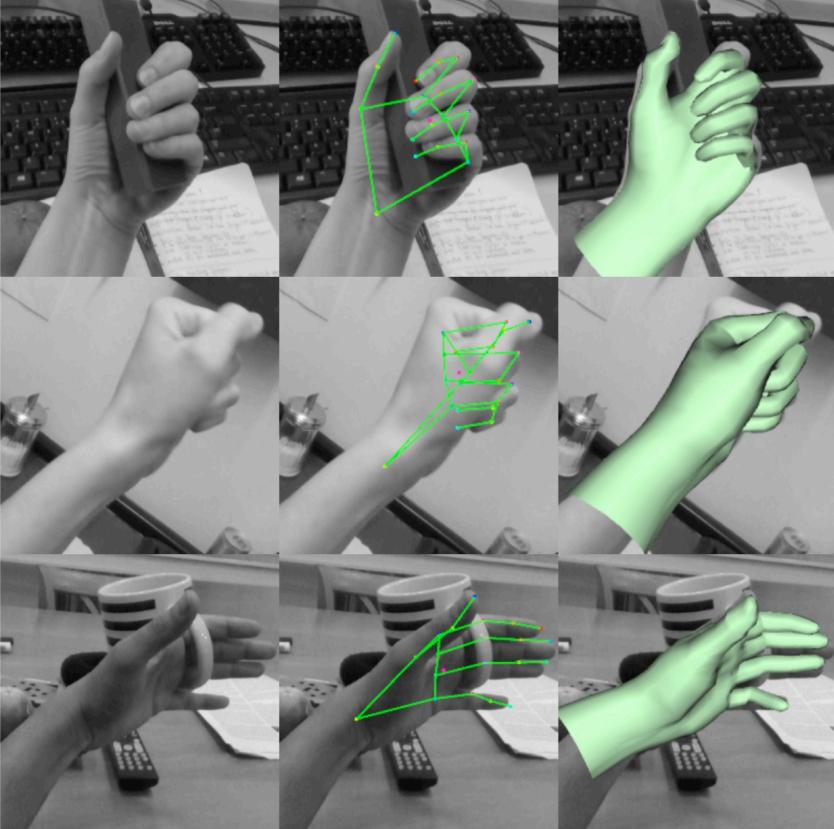
MEgATrack: Monochrome Egocentric Articulated Hand-Tracking for Virtual Reality. Han et al., SIGGRAPH'20.

# Hand Pose Estimation for VR



MEgATrack: Monochrome Egocentric Articulated Hand-Tracking for Virtual Reality. Han et al., SIGGRAPH'20.

# Hand Pose Estimation for VR



MEgATrack: Monochrome Egocentric Articulated Hand-Tracking for Virtual Reality. Han et al., SIGGRAPH'20.

# Hand Pose Estimation for VR



<https://research.fb.com/publications/megatrack-monochrome-egocentric-articulated-hand-tracking-for-virtual-reality/>

MEgATrack: Monochrome Egocentric Articulated Hand-Tracking for Virtual Reality. Han et al., SIGGRAPH'20.

# Further Reading

- Section 9.4, Virtual Reality, Steven LaValle
- MEgATrack: Monochrome Egocentric Articulated Hand-Tracking for Virtual Reality. Han et al., SIGGRAPH'20.