

NRI: INT: COLLAB: Manufacturing USA: Intelligent Human-Robot Collaboration for Smart Factory

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Partners:



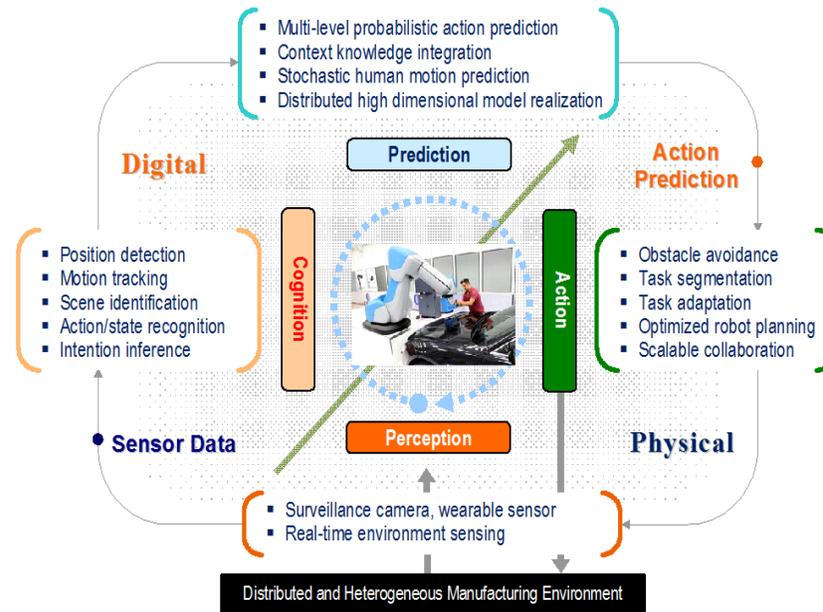
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Challenge

- Separating and highlighting relevant content from irrelevant/ambiguous information in **sensing data** for human action and command **recognition**
- Accounting for uncertainty in human action and trajectory **prediction**
- Estimating collision risk between robot and human trajectory in collaborative **action**

Solution

- Background aware **network**, **attention mechanism**, and **sensor fusion**
- **Probabilistic sequential modeling** for uncertainty quantification
- **Temporal point clouds** for trajectory evaluation and collision prediction



Scientific Impact

- Improved understanding of: 1) discriminative **features** in sensing data relevant to action recognition, and 2) sequential **pattern** underlying human motion trajectory
- Ensured **safety** with mitigated risk of robot mis-trigger and collision

Broader Impact

- Demonstrated **viability** of human-robot collaborative solution that is **generalizable** to various sectors, from education to healthcare
- Improved human **trust** in collaborative robots

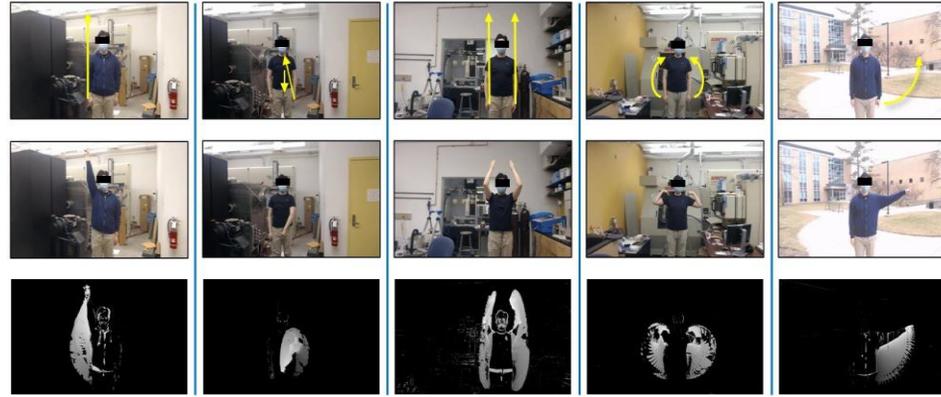
Sensing and Recognition: Real-Time Multi-modal Human-Robot Collaboration Using Gestures and Speech

Challenge:

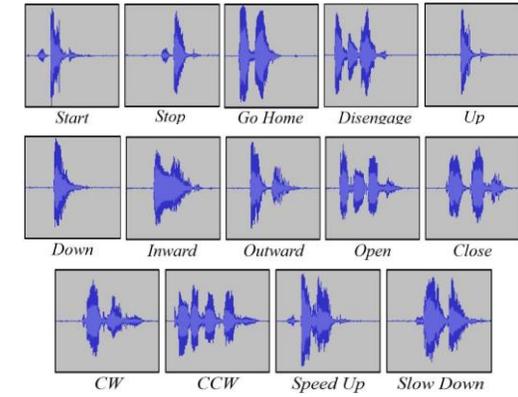
- **Real-time** sensing, recognition and integration of **dynamic gestures** with temporal sequence features and **speech commands** with background noises simultaneously in human-robot collaboration.

Solution:

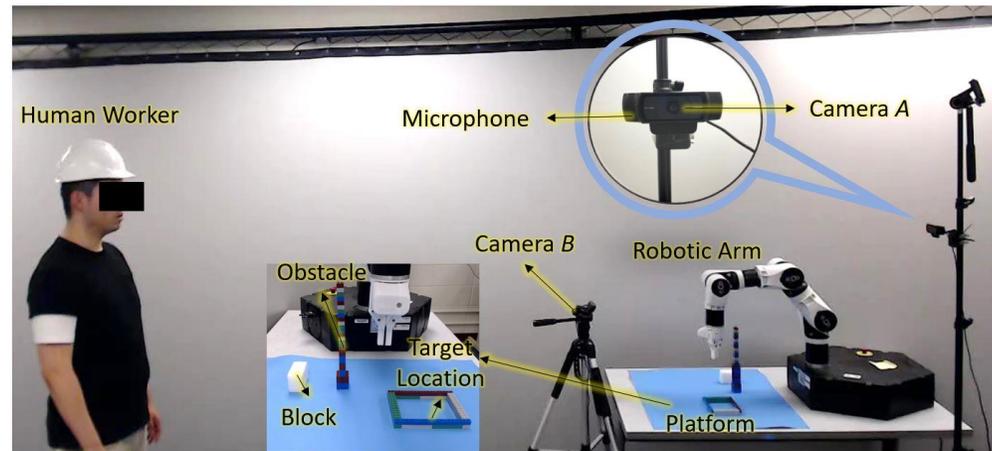
- **Real-time Motion History Image (MHI)** method has been proposed for feature extraction of dynamic gestures in different backgrounds.
- A **multi-threading** architecture has been constructed to operate **parallel tasks simultaneously** in real time.
- A data set of **dynamic gestures** has been designed and a gesture recognizer is built using a multi-view data set and a **convolutional neural network (CNN)**. Robust **speech recognition** is achieved through improvements to an online open-source speech recognizer.



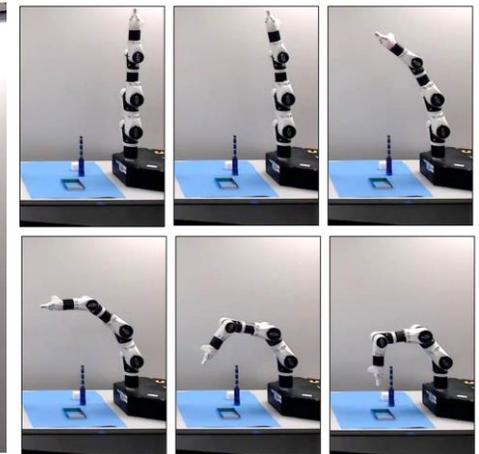
MHIs samples of dynamic gestures in different backgrounds



Waveform samples of speech commands



Overview of the multi-modal human-robot collaboration system using dynamic gestures and speech commands



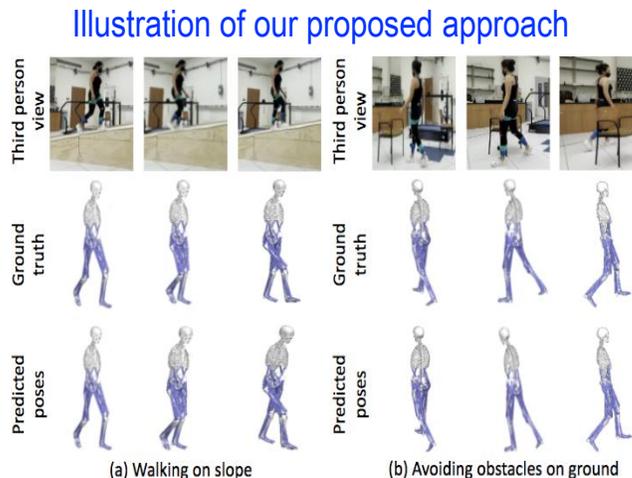
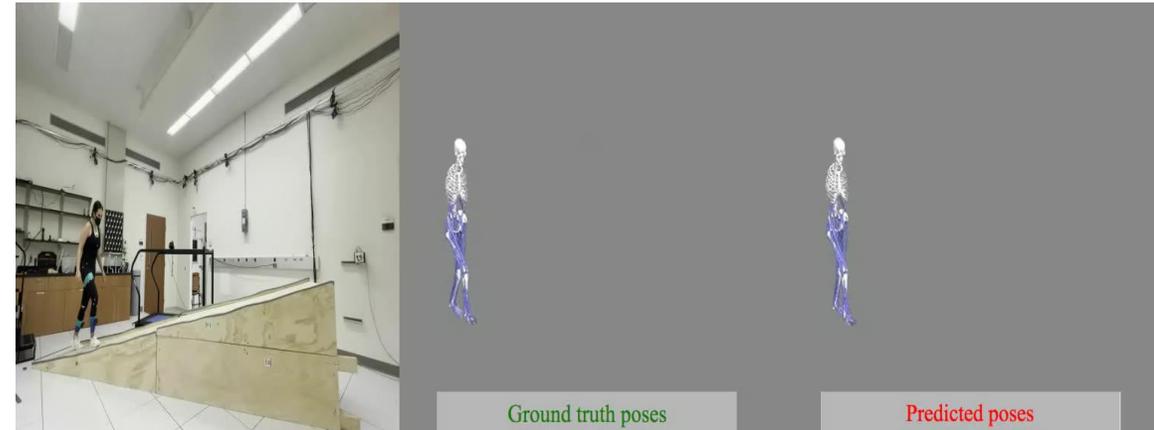
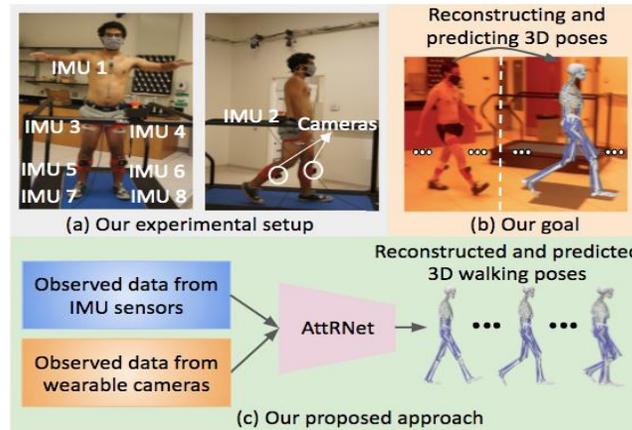
Sensing and Recognition: Reconstructing and Predicting 3D Human Poses from Wearable Sensors

Challenge:

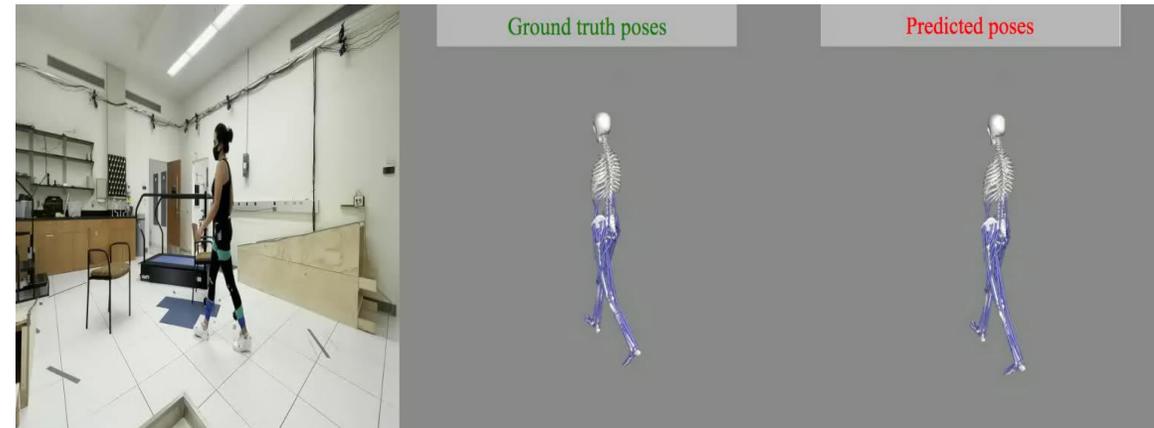
- For the **human pose reconstruction** and **prediction**, we need a feasible and an effective approach to accurately sense human poses with a small set of wearable sensors.

Solution:

- We propose the wearable motion capture problem of **reconstructing and predicting 3D human poses** from a small number of wearable IMUs and wearable cameras.
- We introduce a novel **Attention-Oriented Recurrent Neural Network (AttRNet)** to reconstruct the current pose and predict the future poses.



Visualization of predicted poses over time

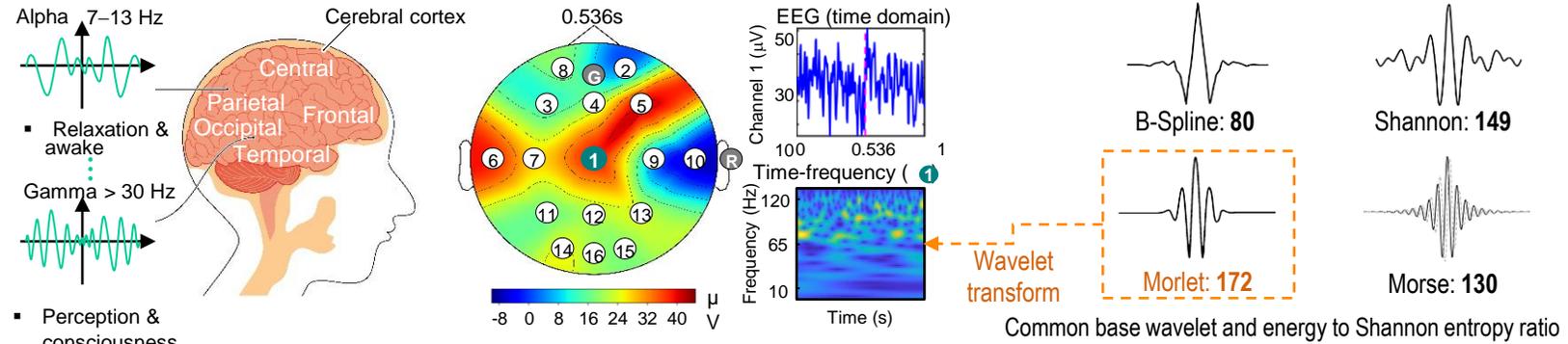


The subject walks on ground and avoid the obstacles

Prediction: Collaborative Action Prediction Based on Brainwaves

Challenge:

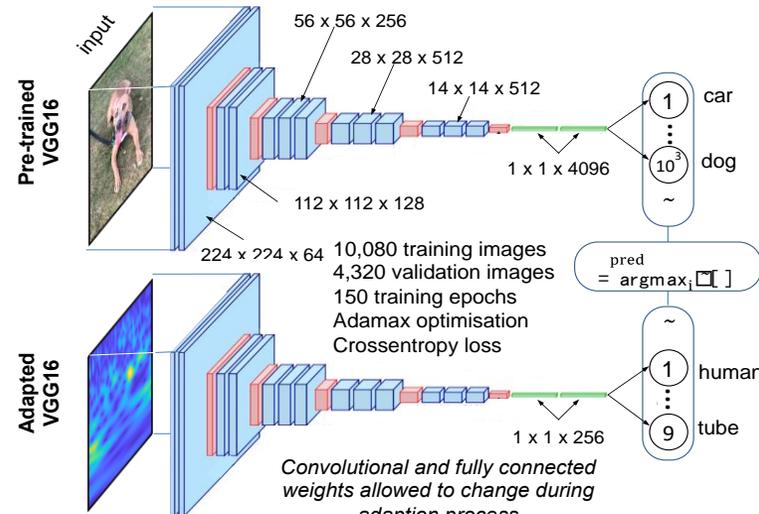
- To investigate how **human brainwaves** can be leveraged to **predict and control robot's action** in collaborative assembly, without the limitations of sensing modalities such as vision and voice under environmental disturbance on the shop floor.



Brain structure and wavelet transform of brainwaves into time-frequency images

Solution:

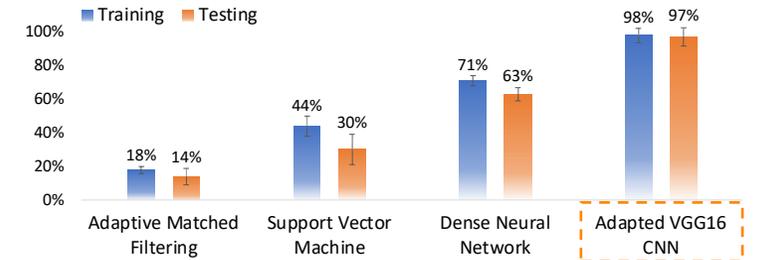
- A robot action prediction and control method based on **wavelet transform of brainwave EEG signals** has been developed and evaluated.
- Optimal base **wavelet selection** is based on maximizing the energy to Shannon entropy ratio.
- Transfer learning** is investigated to adapt a pre-trained VGG16 CNN structure for efficient robot activation and control using wavelet transformed EEG images as input to CNN.



Pretrained VGG16 structure and transfer for EEG-based action prediction



Predicted action: examples



Prediction accuracy comparison with other techniques

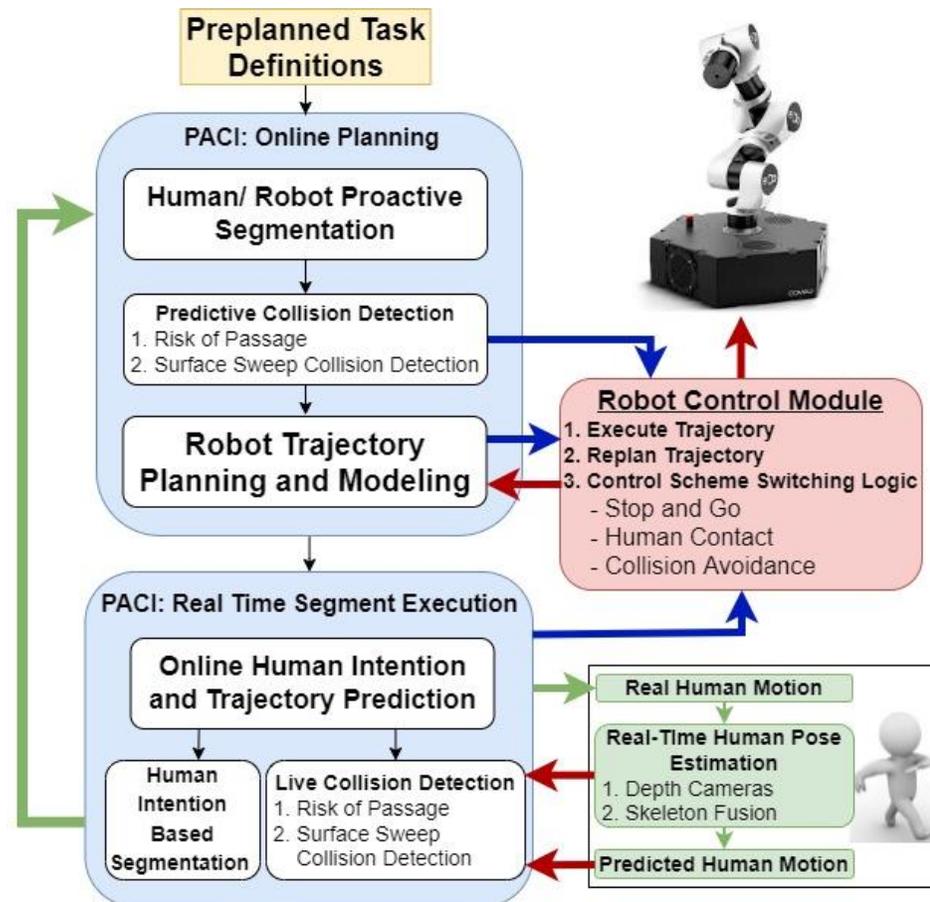
Robot Action: Proactive-n-Reactive Behavior Intelligence

Challenge:

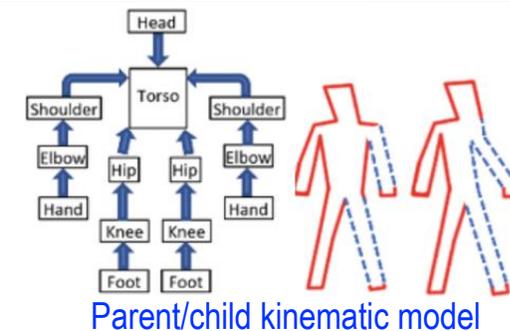
- Seamless **integration** of sensing, cognition, and prediction into robot controller yielding efficient Proactive Adaptive Collaboration Intelligence (PACI) to ensure **safe interactions** with humans and **mitigate production disruptions**.

Solution:

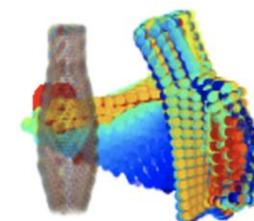
- Segmentation** framework of predicted, real time, and behavioral classifications to allow for modularity and flexibility within PACI for task and motion adaptation.
- Parent-child human kinematics** algorithm to correct joint locations from vision trackers → **mis-trigger reduction**.
- Combining and filtering human poses from multiple cameras with skeleton tracking via stitching **'best' quaternion** representations into a fused skeleton for more accurate tracking of human motion.



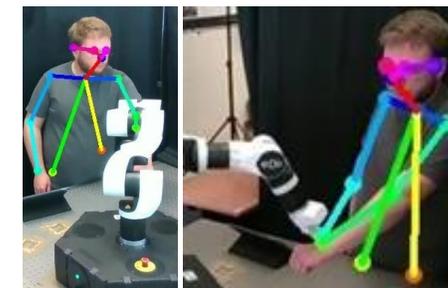
PACI control architecture



Parent/child kinematic model



Improved temporal point cloud generation for predicted human-robot collision detection



Tracked human skeleton with robot as occlusion