

# Extracting Motion Primitives from Human Biomechanics using Deep Learning

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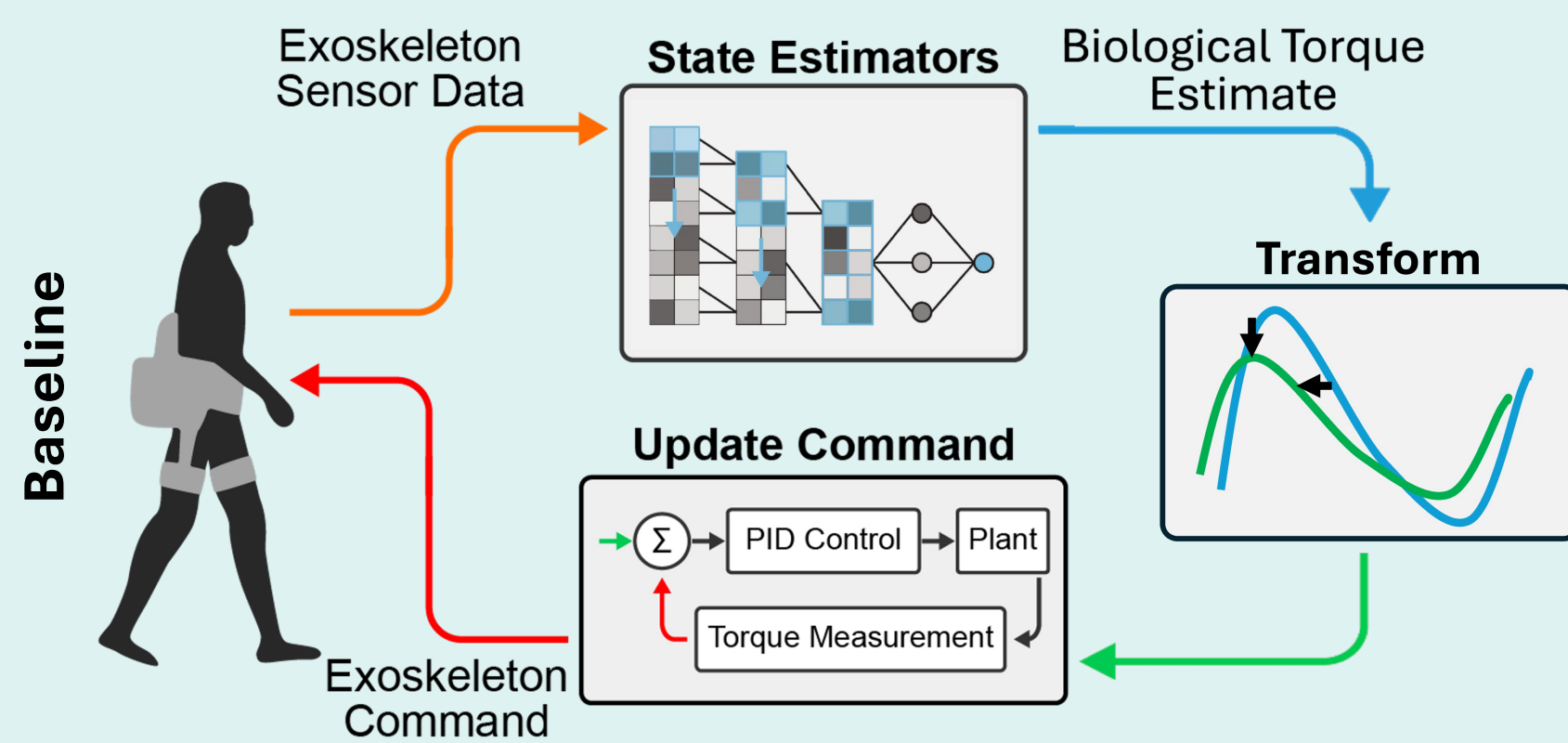


scan for  
more



## Background

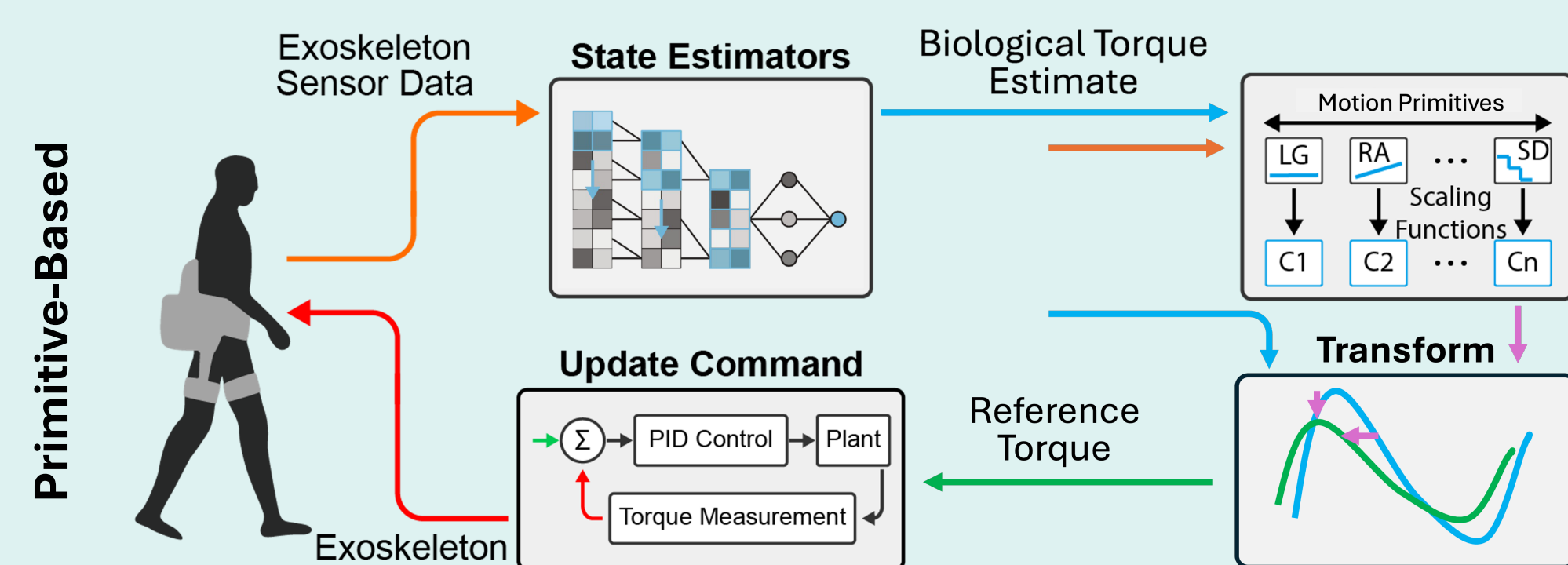
**Biological torque control** is the current state-of-the-art technique for user independent exoskeleton assistance [1].



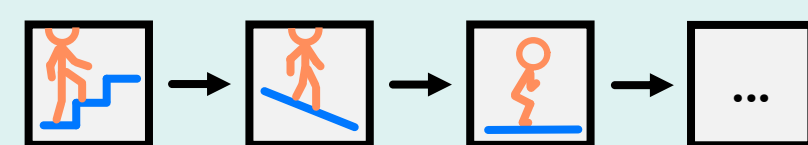
**Problem:** Commanding biological torque is not globally (i.e., across all tasks) optimal.

## Hypothesis

**Idea:** We can create a globally optimal exoskeleton controller by optimizing a parametrization of biological torque for a set of known *motion primitives*.



**Hypothesis:** Let  $C(\cdot)$  be the metabolic cost of completing some circuit:



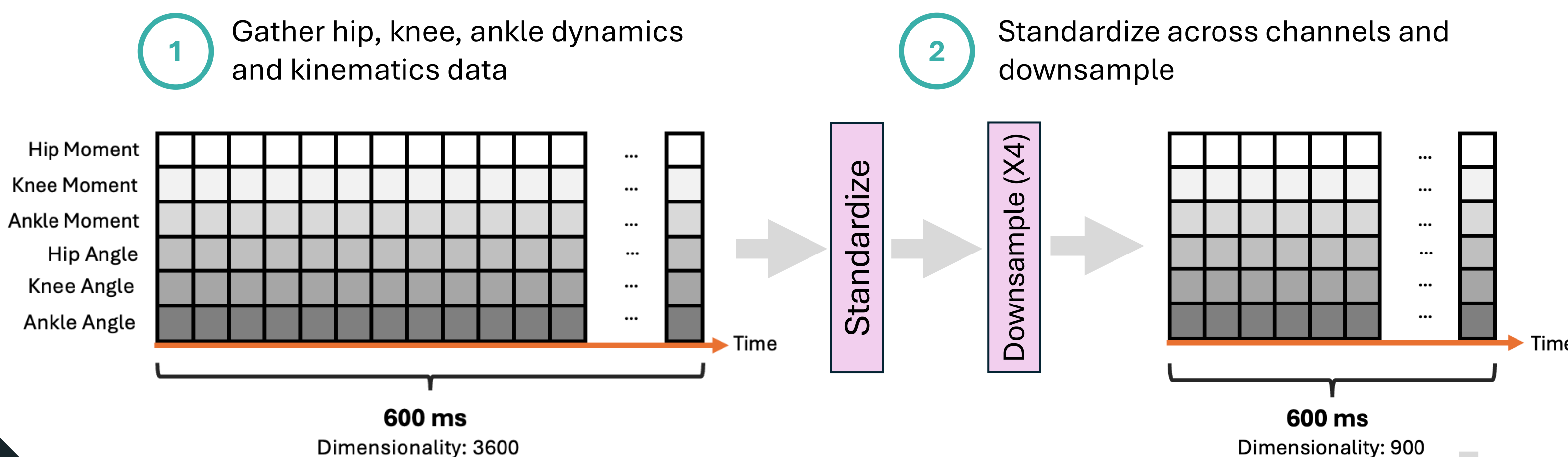
Then,  $C(\text{Primitive} - \text{Based}) < C(\text{Baseline})$

## Methods

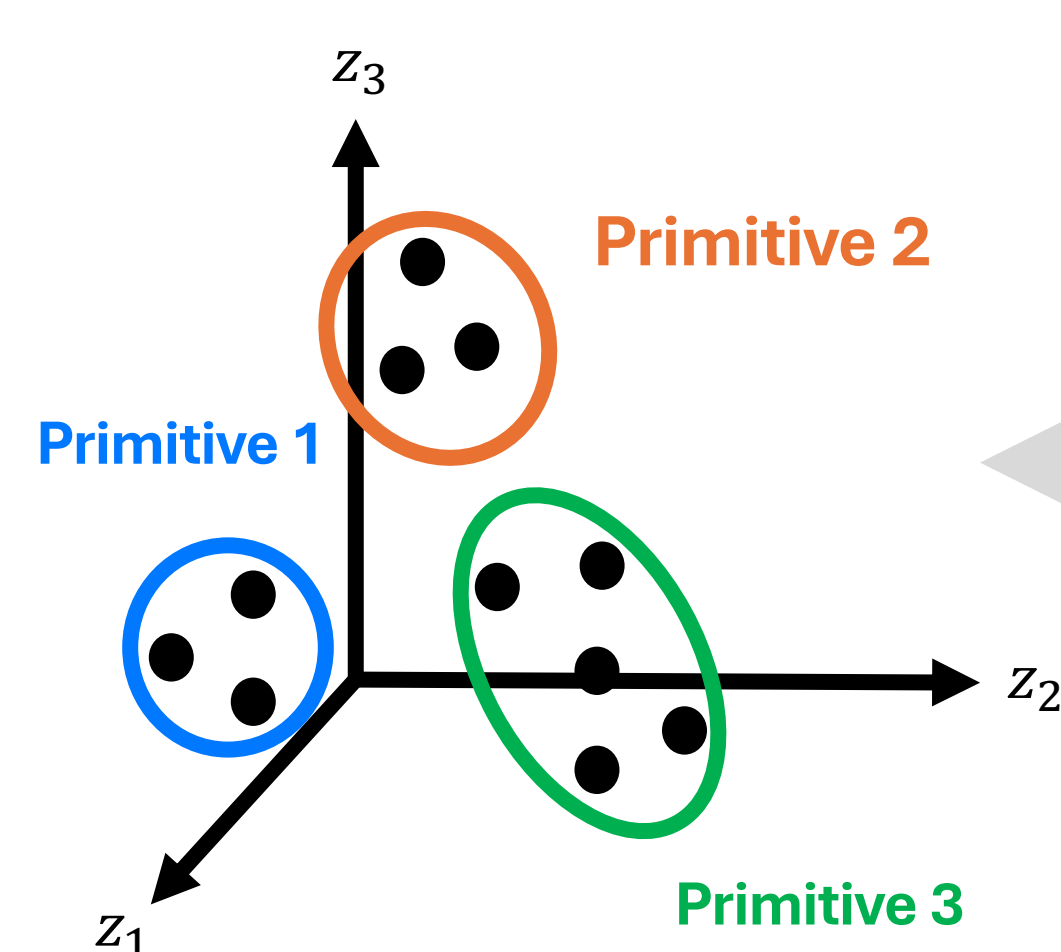
### Steps:

1. Generate set of motion primitives
2. Classify primitives in real time
3. Perform human-in-the-loop optimization on each primitive
4. Compare the primitive-based bio torque controller against the baseline bio torque controller

### Step 1: Classify primitives in real time

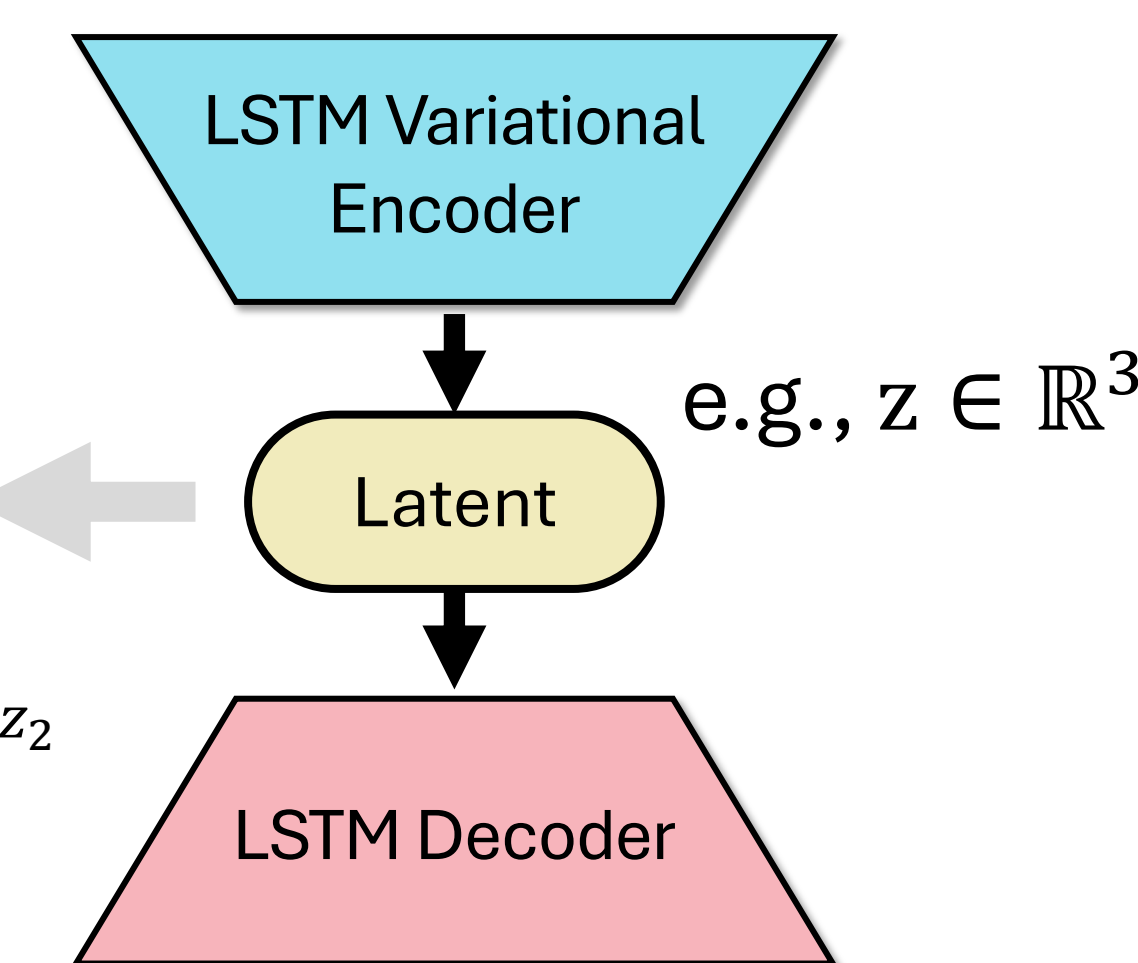


### 4 Cluster latent space using GMM



Steps 2-4 are future work.

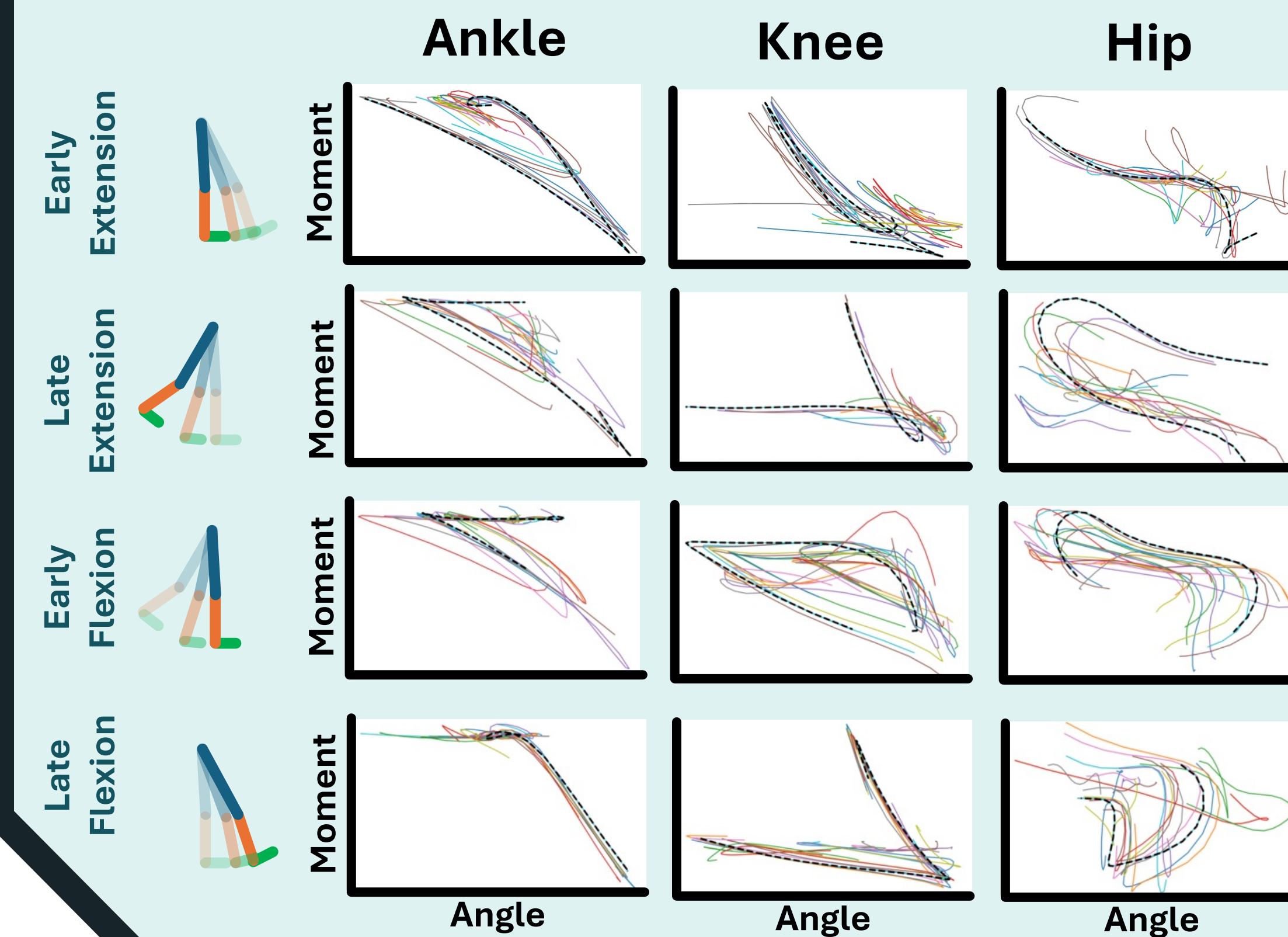
### 3 Extract latent space



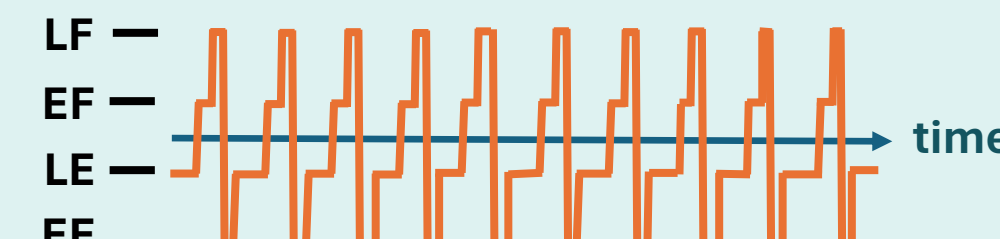
## Preliminary Results

### Example: Level ground walking

- N=8-2 train-validation split
- model spec: 400 ms window size, 3 layers
- 4 primitives



### Offline Walking Trial Analysis



## Impact

**Understanding** what a globally optimal task and user-independent control profile looks like could bring us one step closer to developing a true end-to-end controller and facilitate the widespread adoption of active wearable exoskeletons.

## References & Acknowledgements

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[1] Dean D. Molinaro et al., Estimating human joint moments unifies exoskeleton control, reducing user effort. *Sci. Robot.* 9, ead18852(2024). DOI:10.1126/scirobotics.ad18852

