

# Artificial Intelligence and Robotics for Intelligent Agents - RoboCanes Demonstration -

## *The RoboCanes Team*

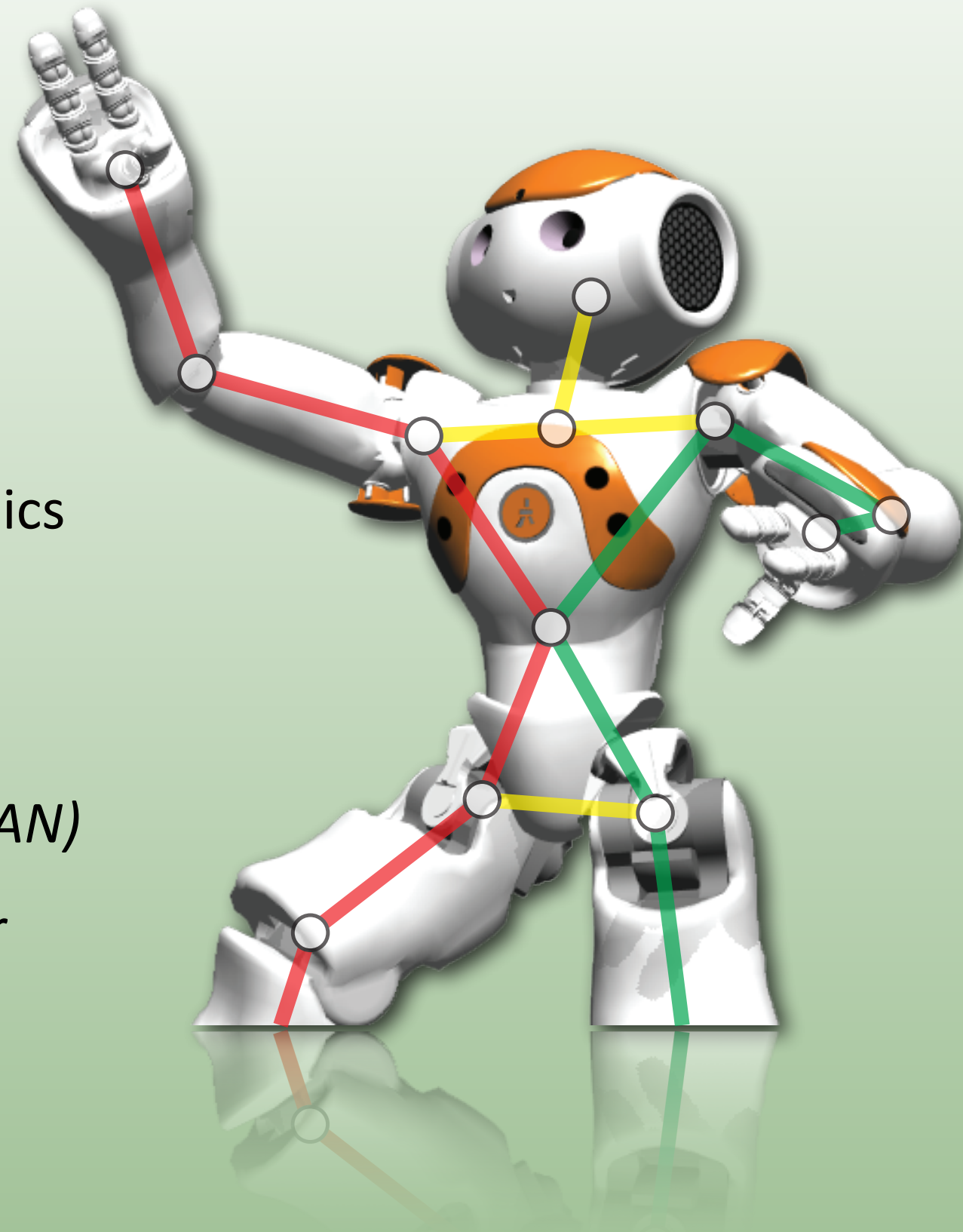
Department of Computer Science  
College of Arts and Sciences  
University of Miami

January 14, 2013



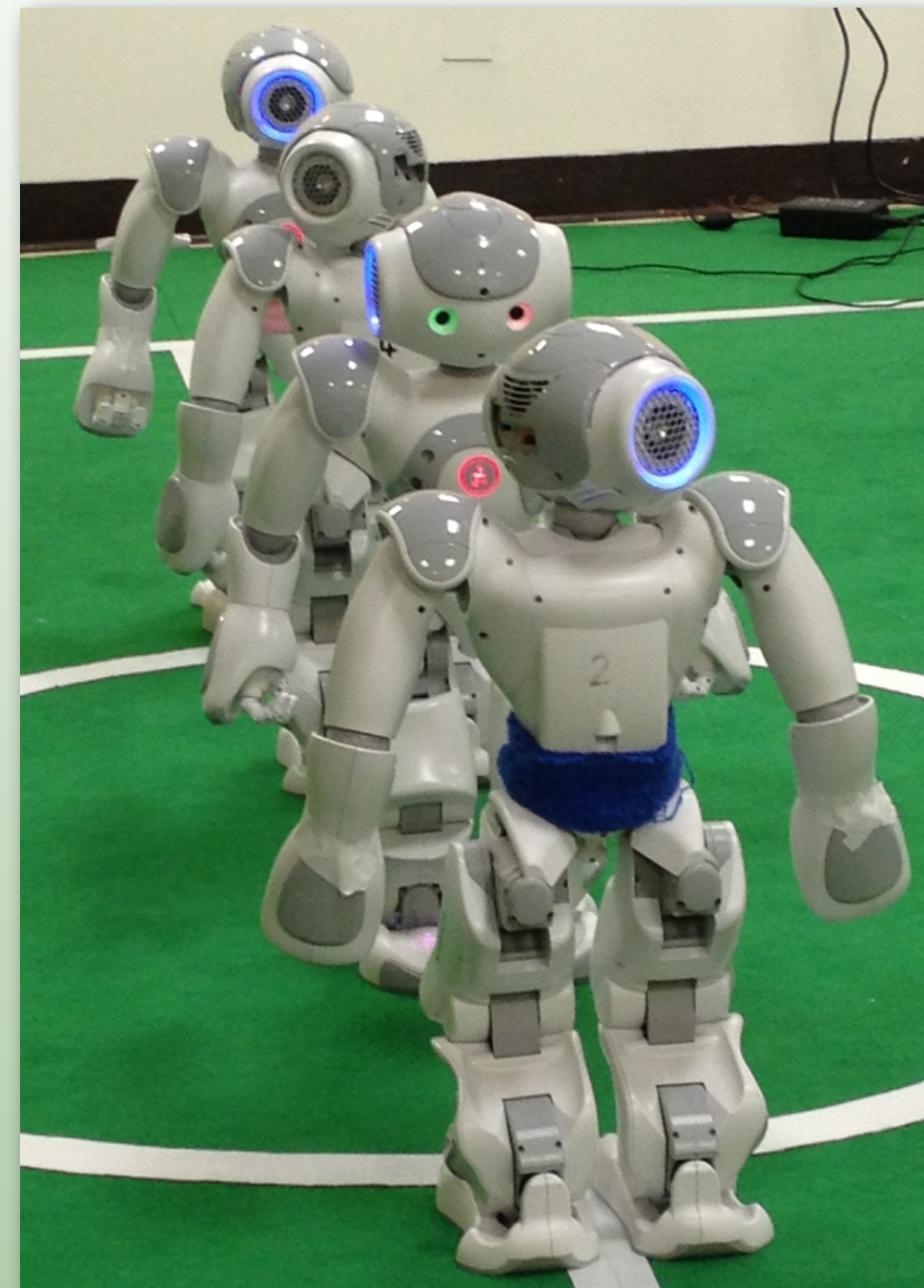
# OUTLINE

- ▶ Motivation
  - ▶ Research Challenges & Tasks
  - ▶ RoboCup
- ▶ RoboCanes
  - ▶ Simulated 3D agents with full physics
  - ▶ Motion capture and optimization
  - ▶ Physical NAO live demo
    - ▶ *Real time vision and motions (LAN)*
    - ▶ *Real time motions and behavior (WLAN)*
- ▶ Game



# RESEARCH CHALLENGES

- ▶ Autonomous robots shall act appropriately in dynamic, real time, and adversarial environments
- ▶ One of the biggest challenges in AI and robotics
- ▶ Numerous examples: rescue scenarios, home assistance, device assistance (e.g. cars, planes)
- ▶ Playing soccer with biped robots as a testbed for development (RoboCup).
- ▶ RoboCup is a landmark project as well as a standard problem (as was chess in the 90s)



*4 RoboCup NAO players*

# RESEARCH TASKS

real time sensor fusion

reactive behavior

learning

learning

real time planning

multi-agent systems

context recognition

strategy acquisition

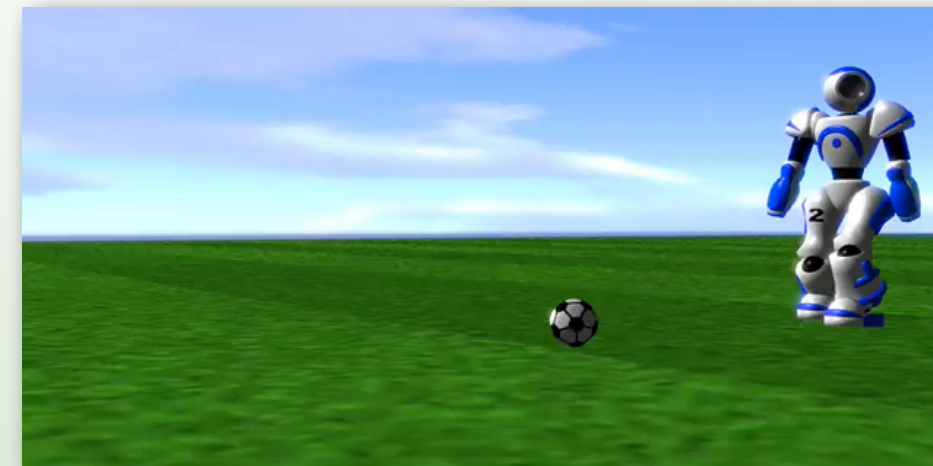
motor control

decision making

intelligent robot control

opponent modeling

and many more...





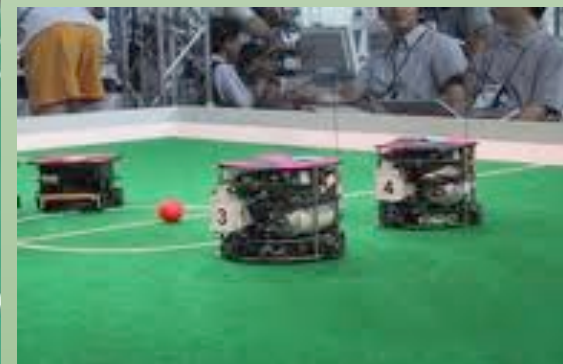
# ROBOCUP

- ▶ International initiative fostering AI & Robotics
- ▶ By the year 2050, develop a team of fully autonomous humanoid robots that can win against the human world soccer champions
- ▶ Large community: approx. 500 teams from > 40 nations compete worldwide; > 15,000 scientists in RoboCup mailing list; > 5,000 active researchers every year
- ▶ RoboCanes active since 2010:
  - ▶ 1st place in European Open 2011
  - ▶ 2nd place in Asian Open 2011, 2012
  - ▶ 2nd place in World Cup in Mexico 2012
  - ▶ 1/4 finals in 2 leagues in World Cup in The Netherlands 2013



# ROBOCUP-SOCCER

- ▶ Research goals: Cooperative multi-robot and multi-agent systems in dynamic adversarial environments
- ▶ All robots in this category are fully autonomous
- ▶ Various leagues
  - ▶ Humanoids
  - ▶ Middle Size Robots
  - ▶ Simulation (2D/3D)
  - ▶ Small Size Robots
  - ▶ Standard Platform



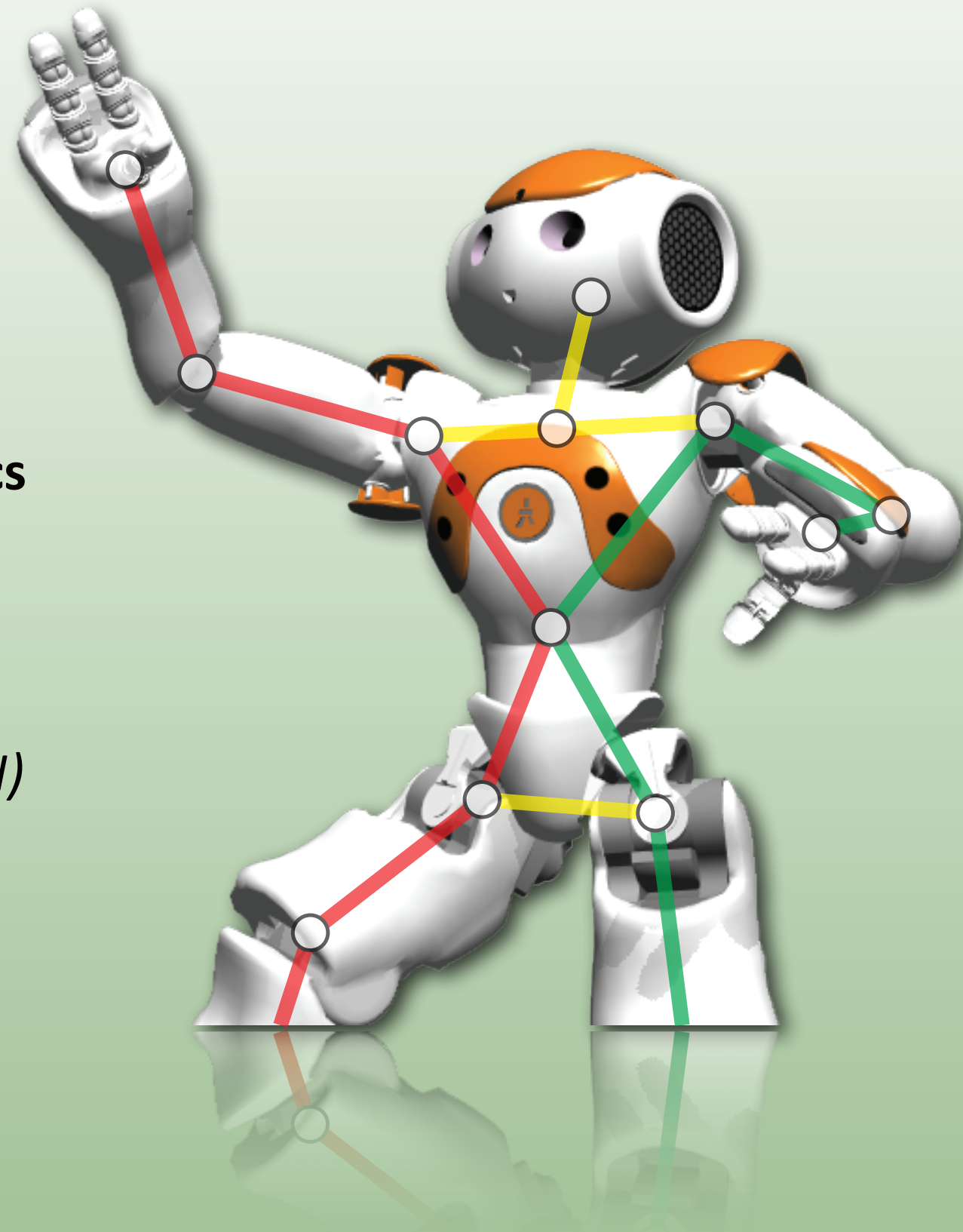


# ROBOCUP-JUNIOR



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# HARDWARE: NAO COMPONENTS OVERVIEW

Manufacturer:  
Aldebaran Robotics  
(France)

573x275x311mm  
5.2kg (11.4lb)

Battery: 60-90 min  
Lithium-Ion

Ethernet 1xRJ45  
10/100/1000 BASE T

WiFi IEEE 802.11.b/g

Degrees of freedom

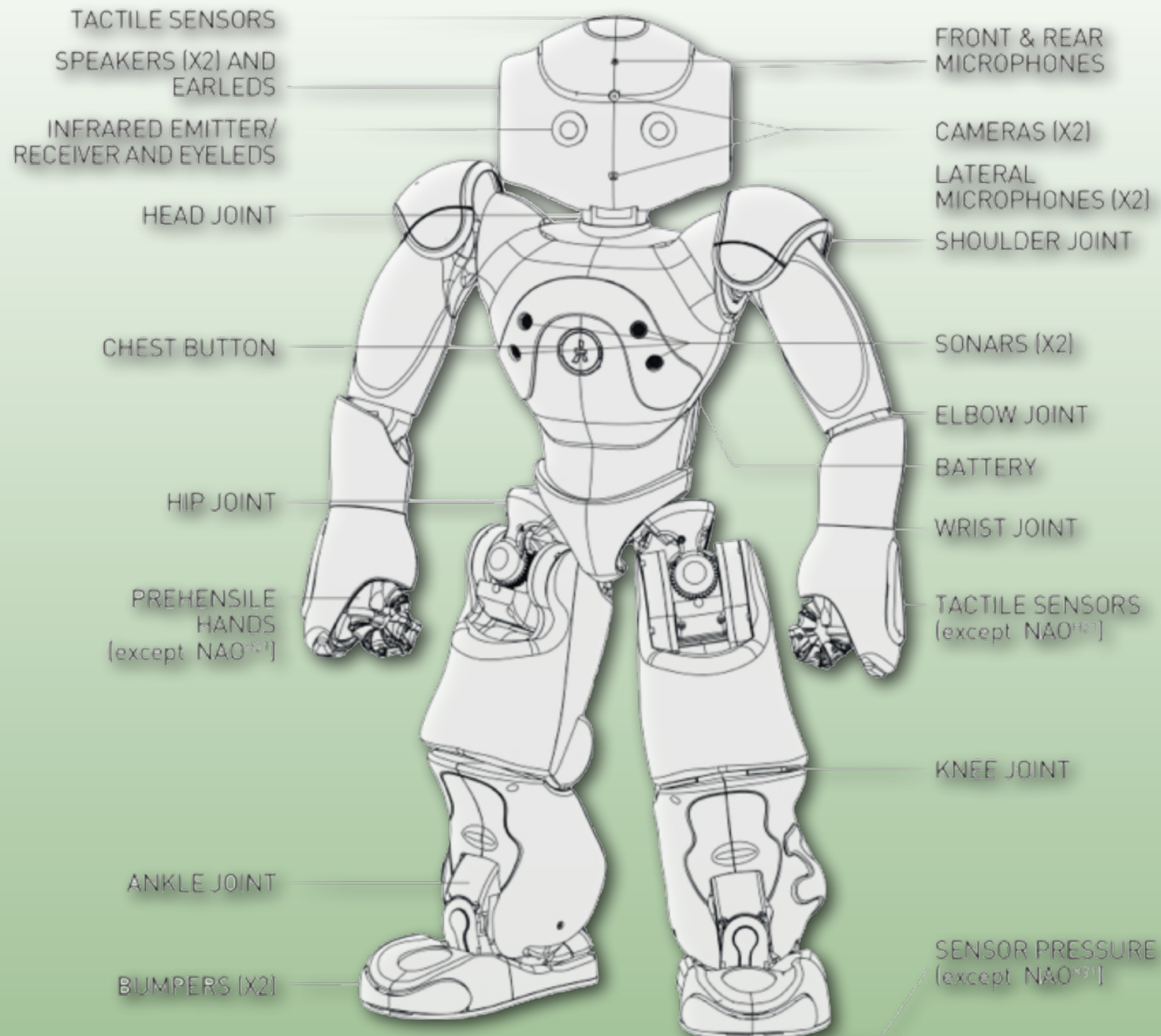
Head : 2

Arm : 4 (x2)

Pelvis : 1

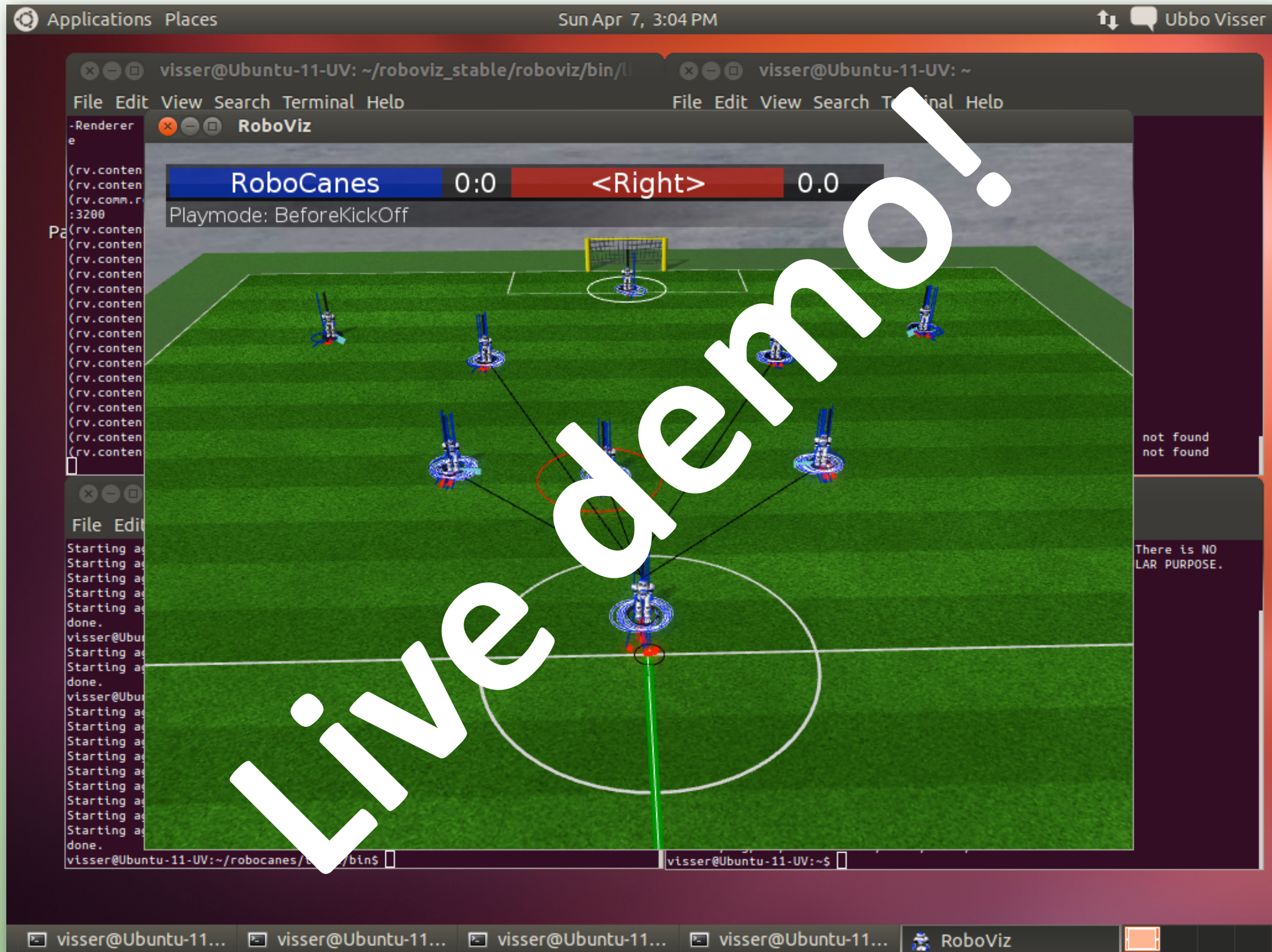
Leg : 5 (x2)

Total: 21



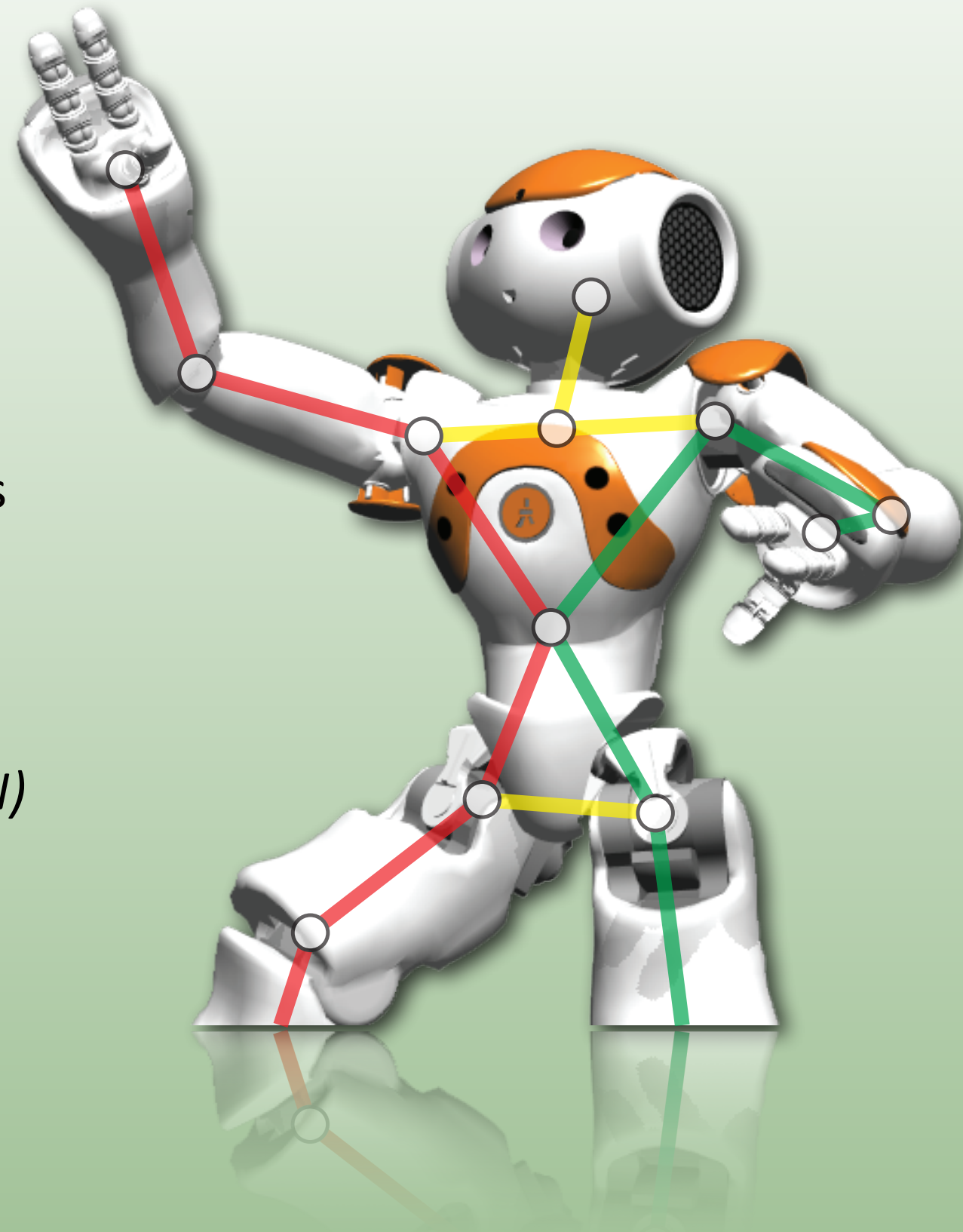


# ROBOCANES: SIMULATED 3D AGENTS WITH FULL PHYSICS



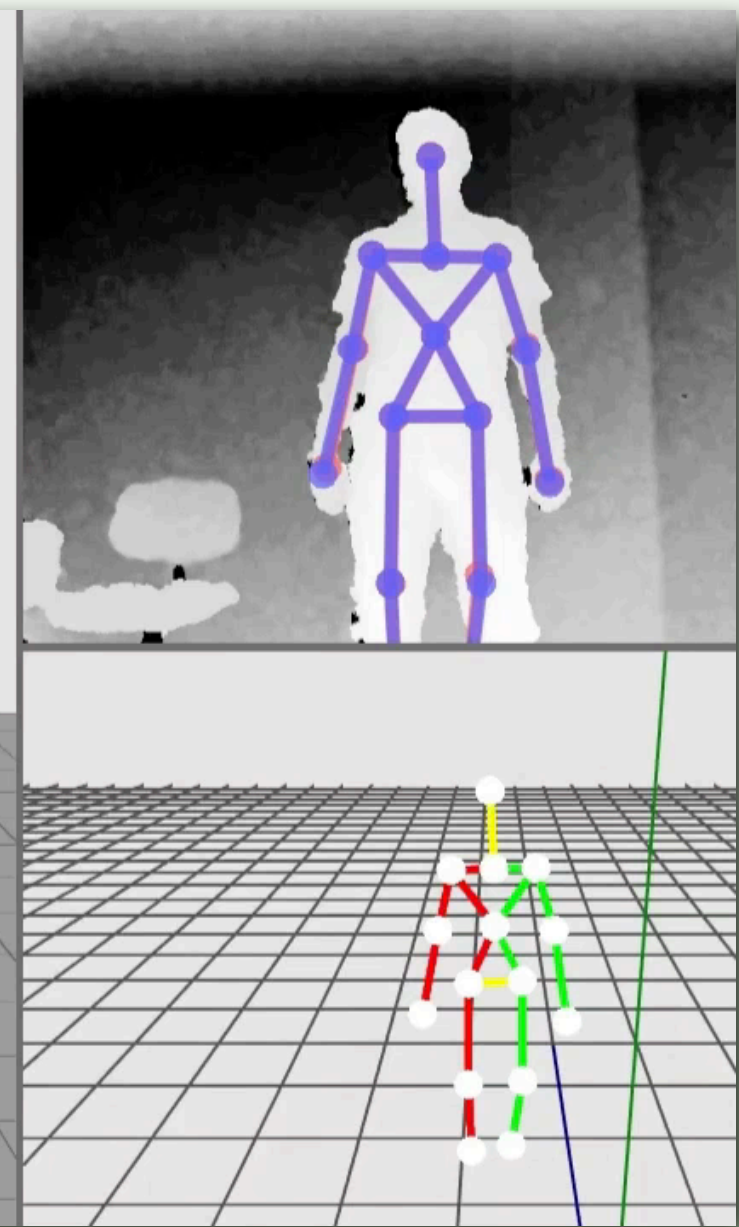
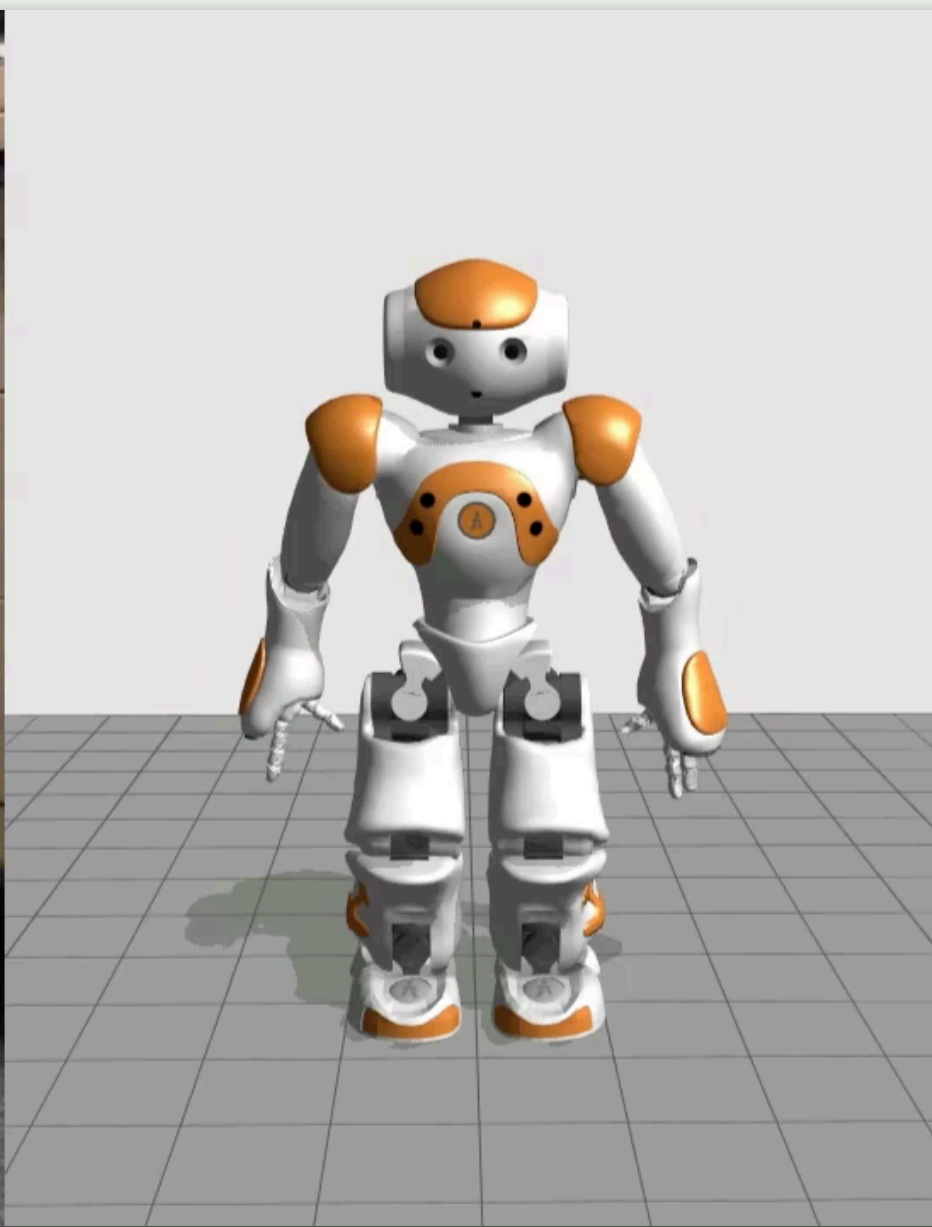
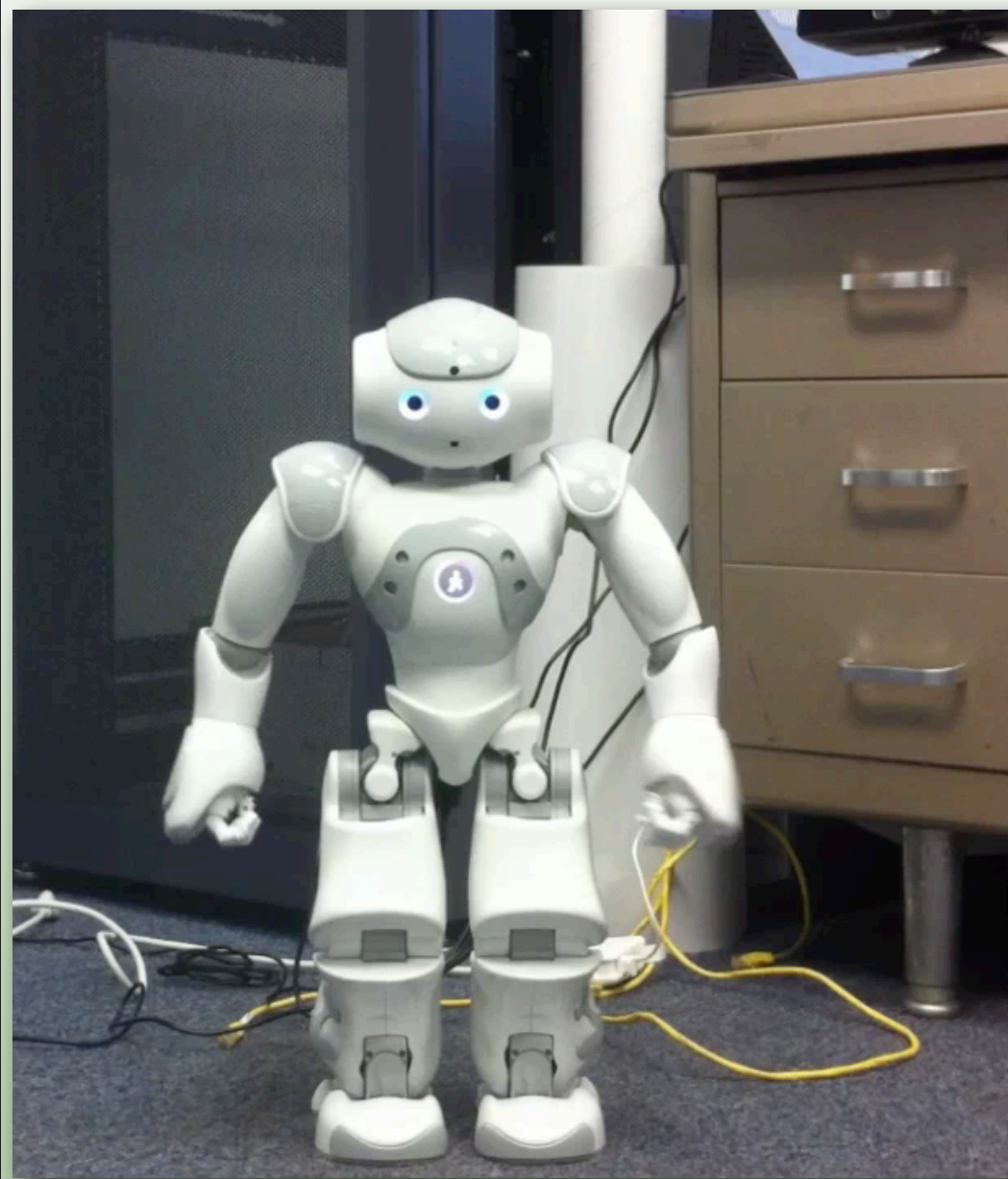
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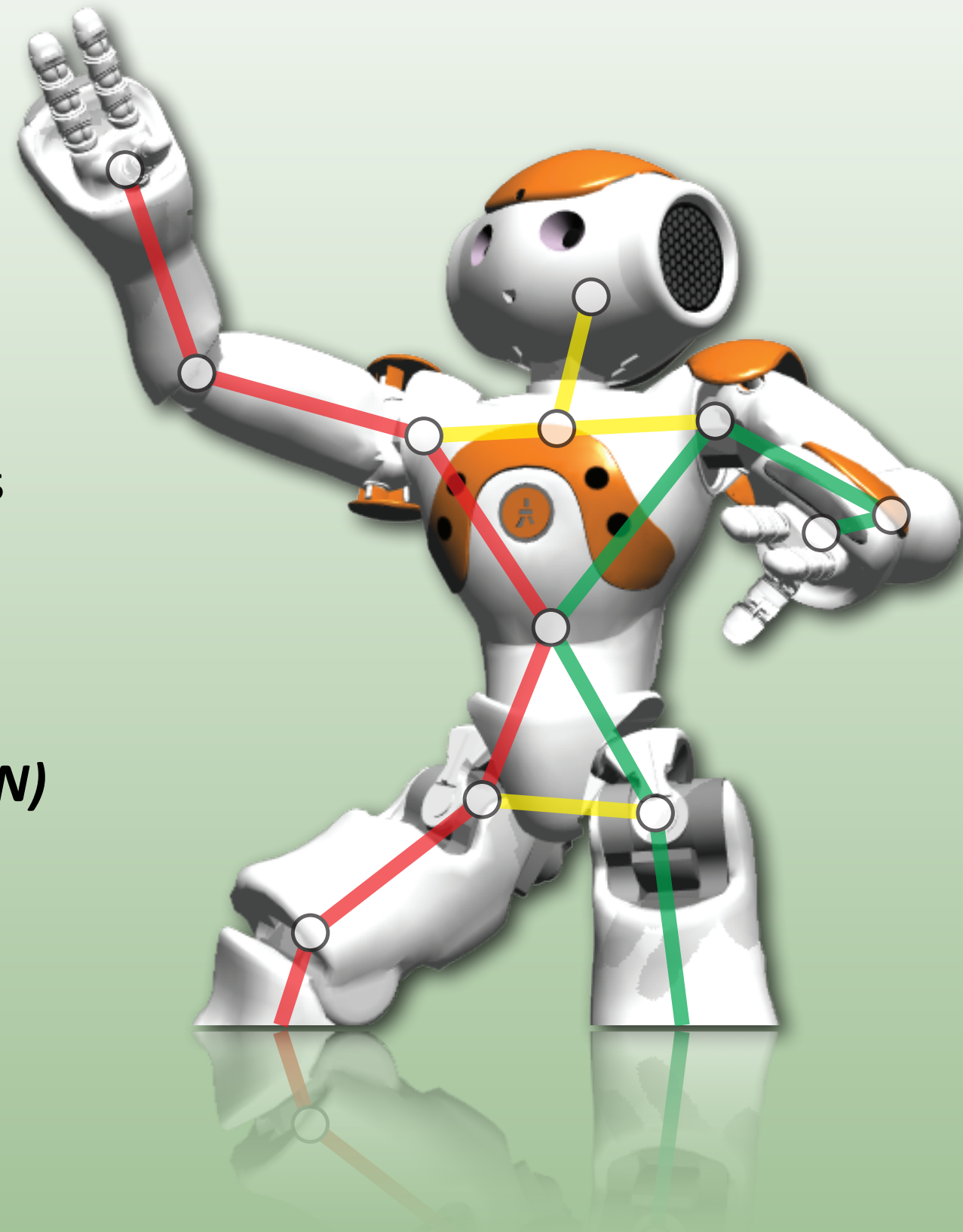
# MOTION CAPTURE AND OPTIMIZATION



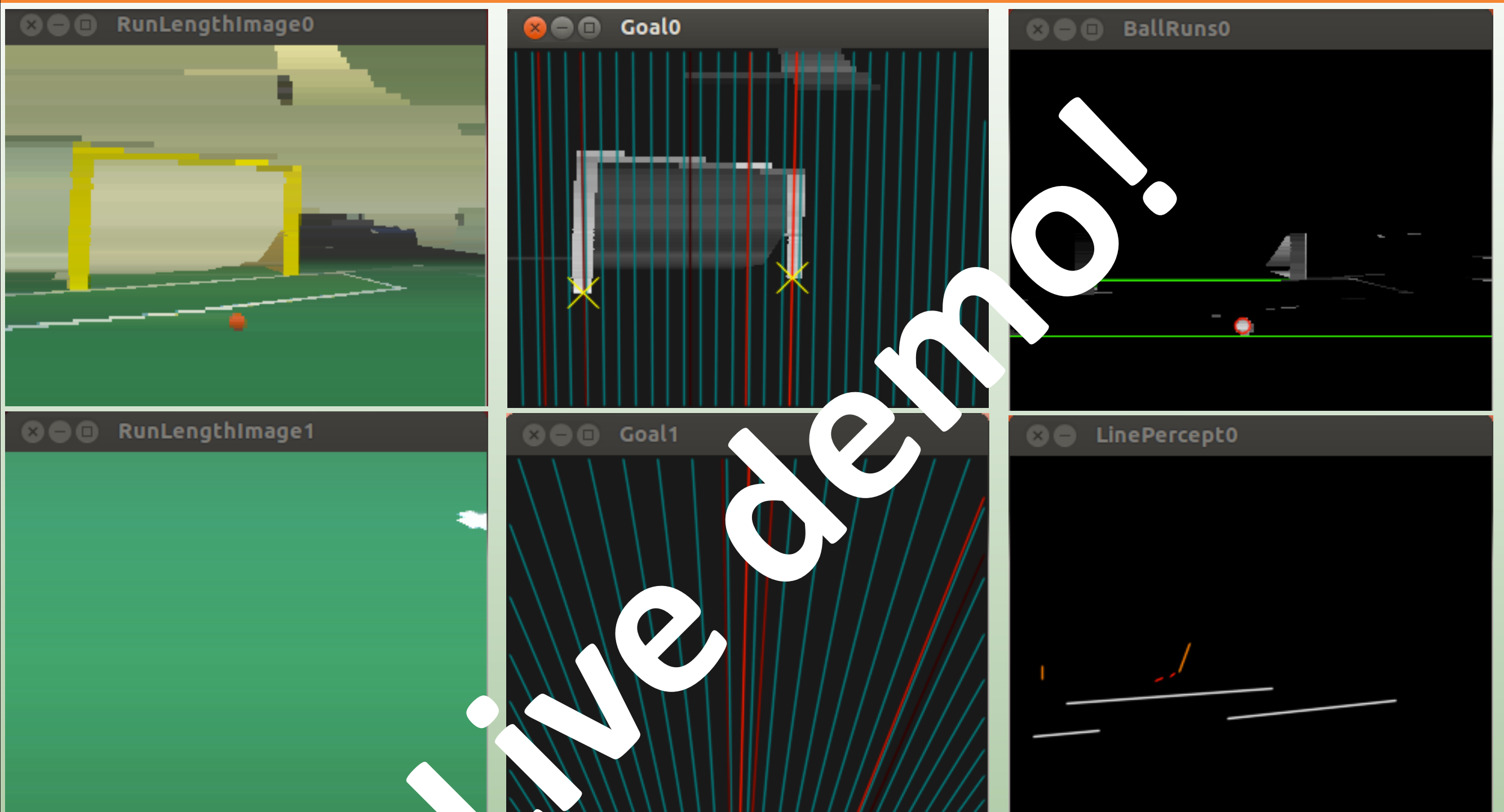


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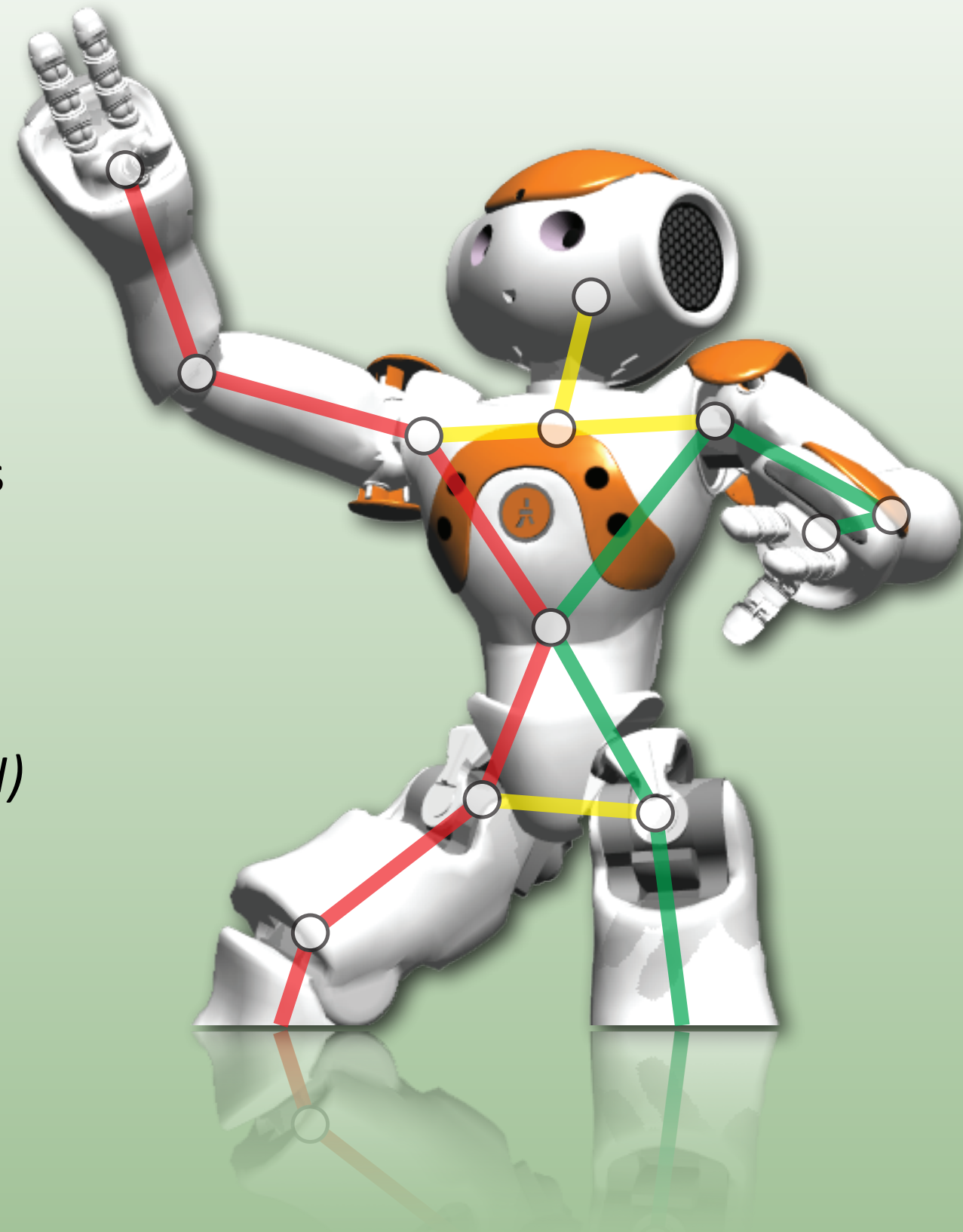


## REAL TIME VISION AND MOTIONS (LAN)



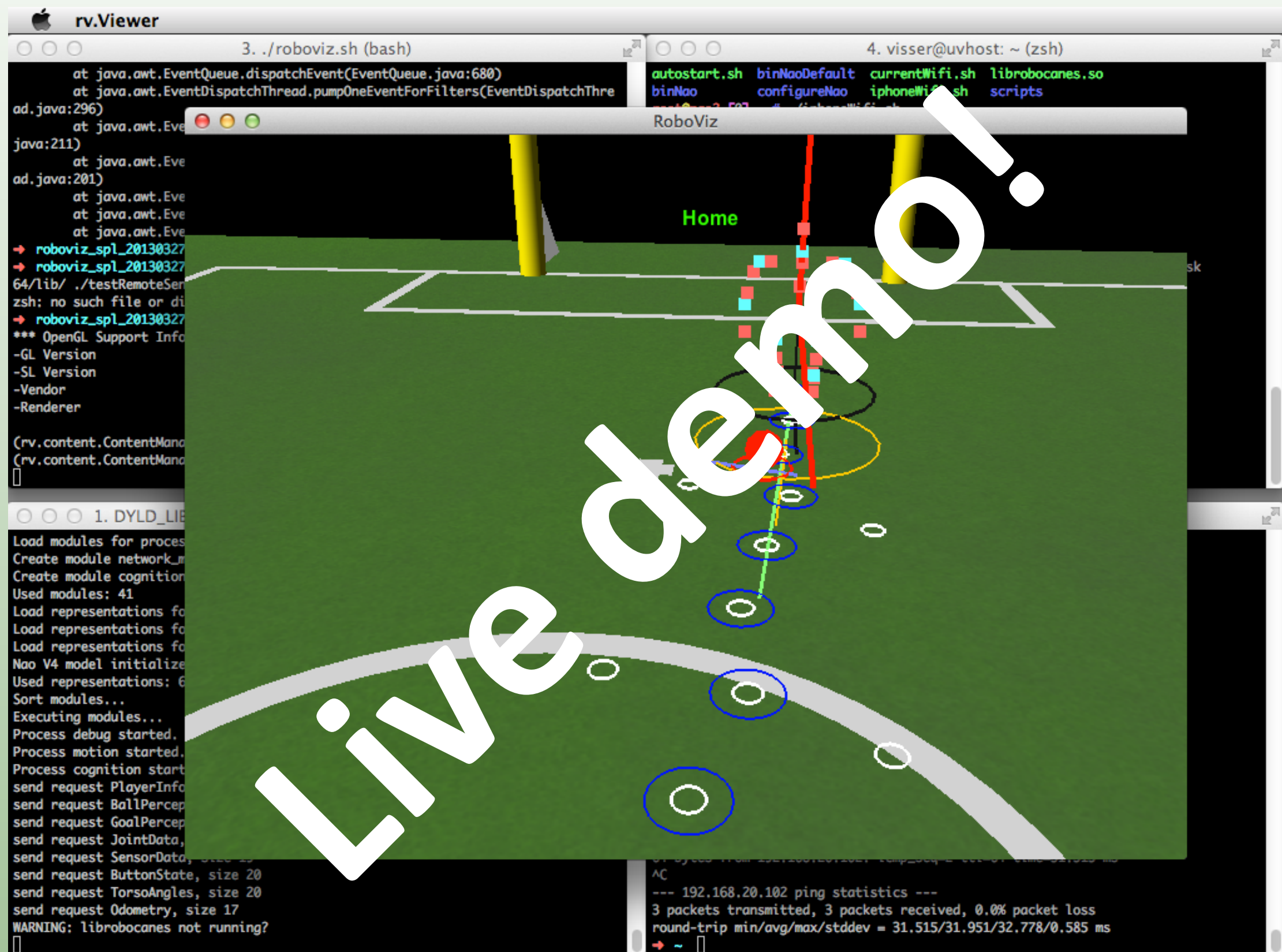
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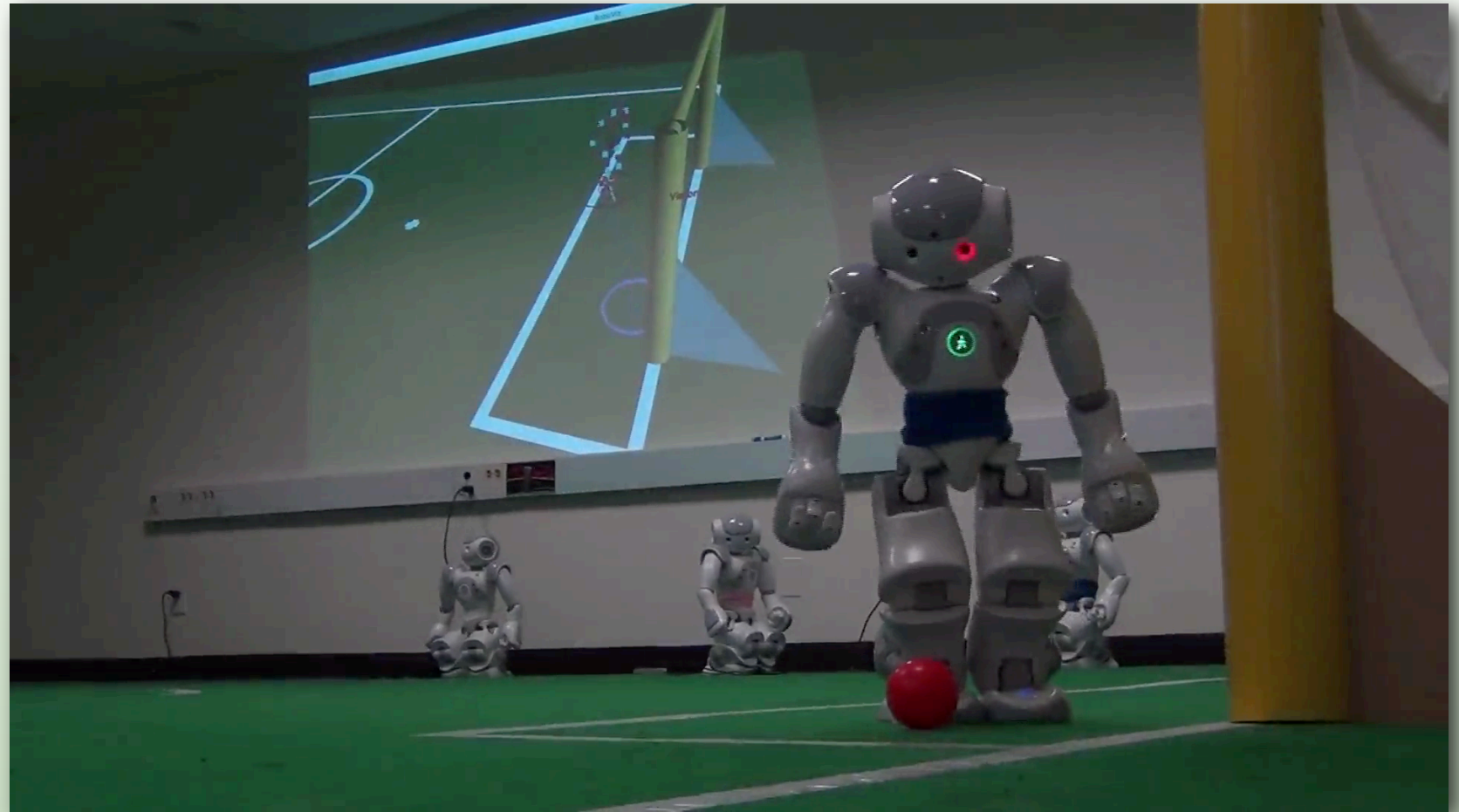
# REAL TIME MOTIONS AND BEHAVIOR (WLAN)





# THANK YOU!

- ▶ Acknowledgements:
  - ▶ UM Department of Computer Science
  - ▶ College A&S
- ▶ RoboCanes Team 2013:
  - ▶ *Saminda Abeyruwan*
  - ▶ *Alexander Härtl*
  - ▶ *Piyali Nath*
  - ▶ *Andreas Seekircher*
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  - ▶ Email: [robocanes@cs.miami.edu](mailto:robocanes@cs.miami.edu) or [visser@cs.miami.edu](mailto:visser@cs.miami.edu)



# EXTRA SLIDES

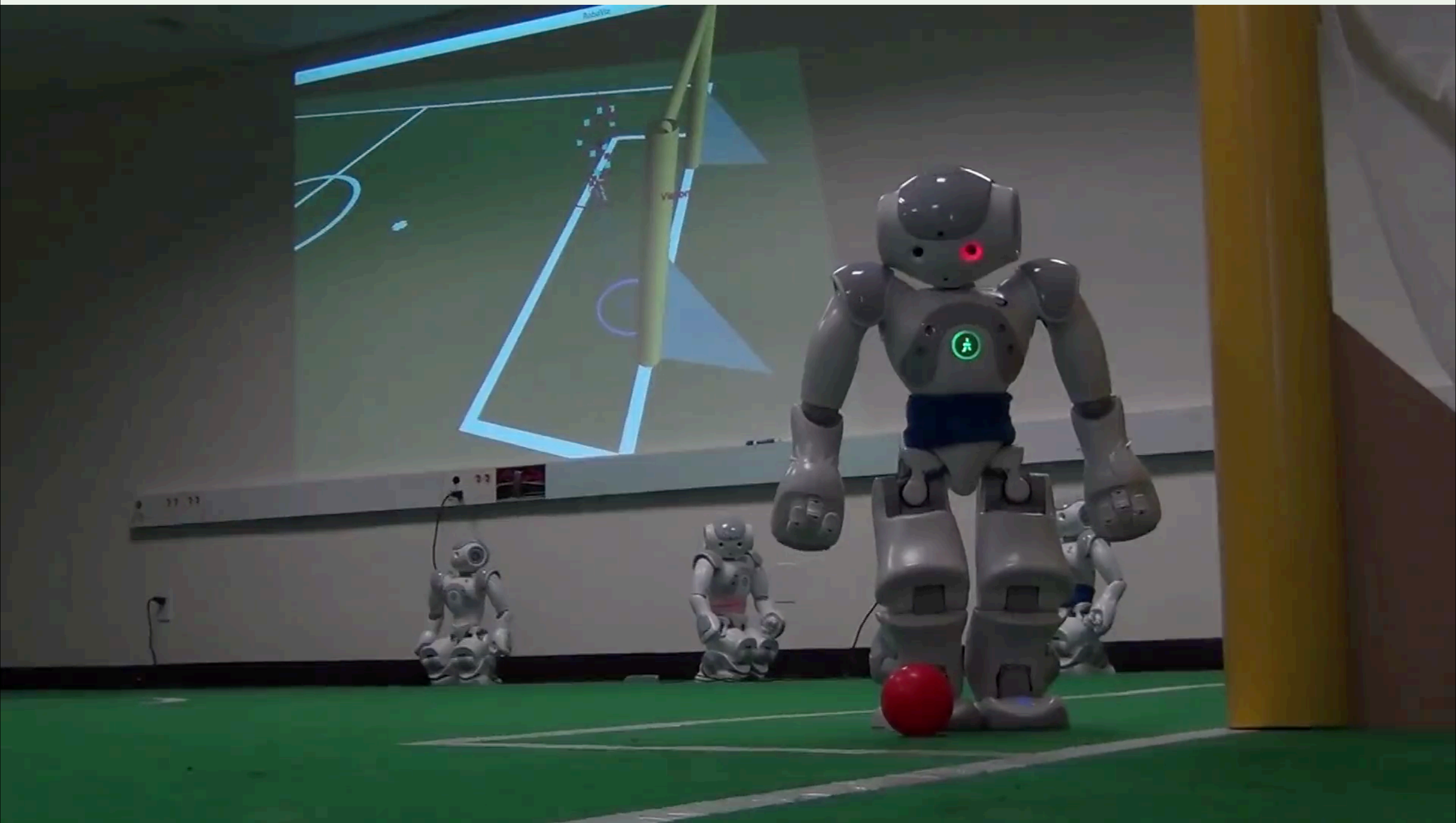


# ROBOCANES: SIMULATED 3D AGENTS WITH FULL PHYSICS





## REAL TIME MOTIONS AND BEHAVIOR





RoboCanes

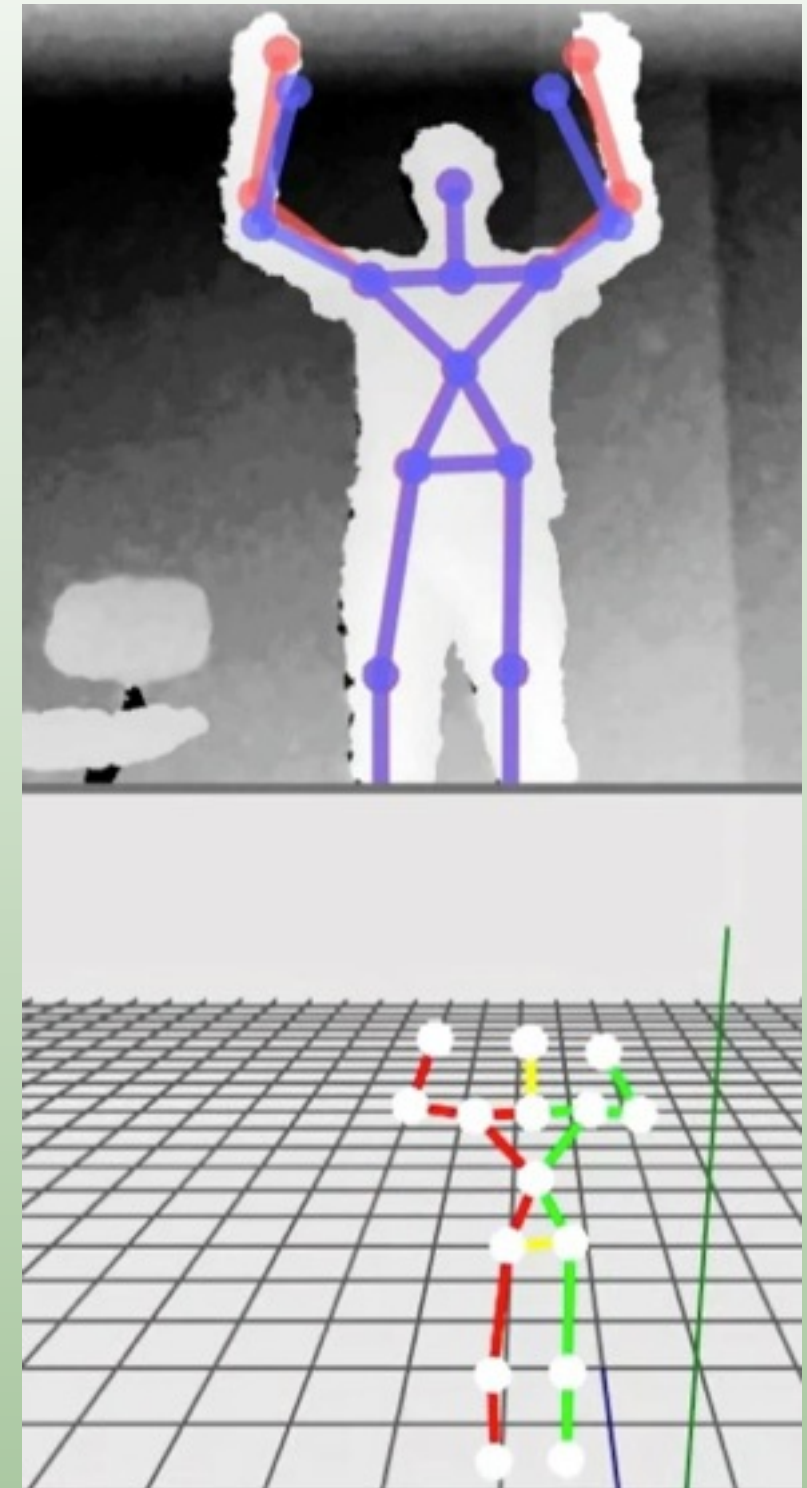
RoboCup 2013  
SPL Qualification Material

*November 8, 2012*

Email: [robocanes@cs.miami.edu](mailto:robocanes@cs.miami.edu)

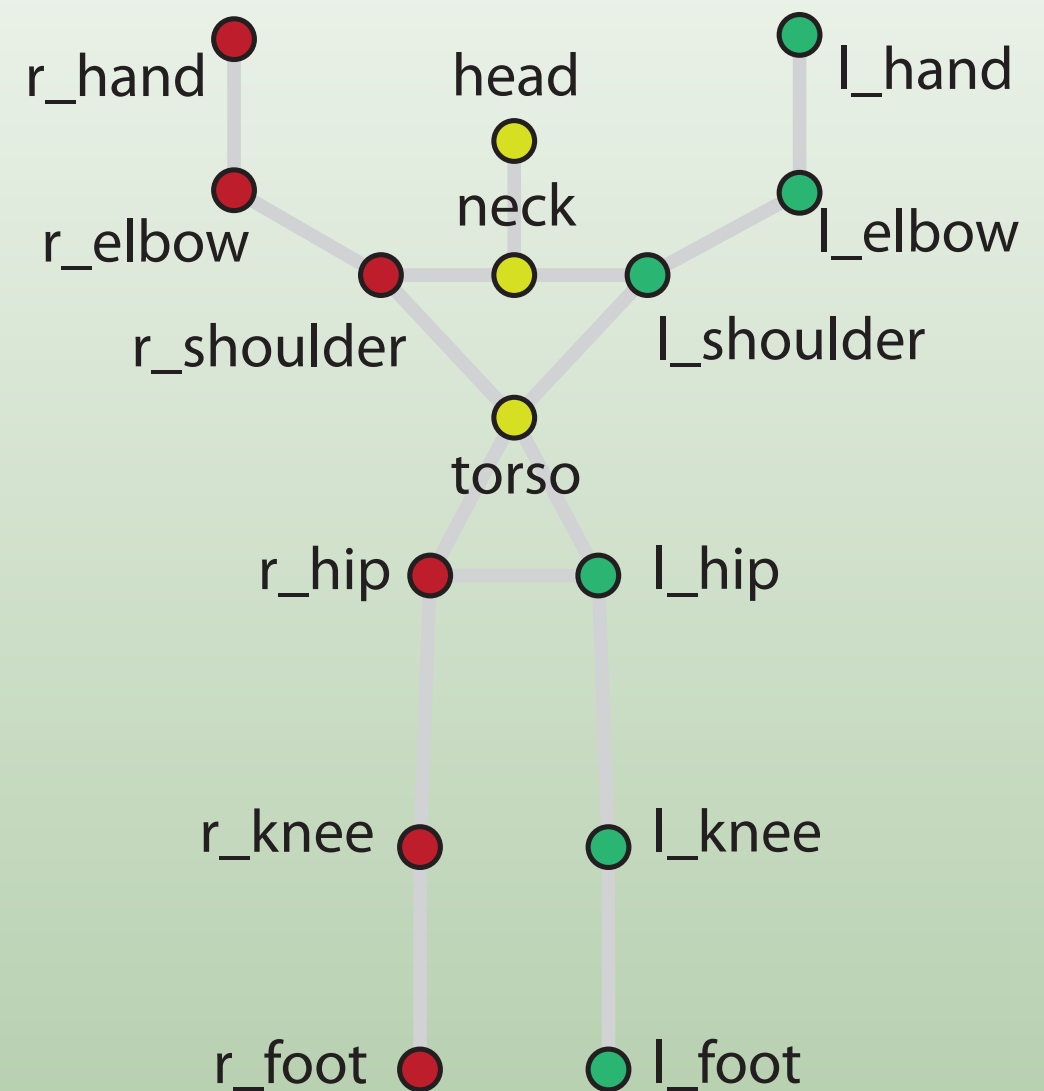
# MOTION CAPTURE

- ▶ Many choices for motion capture
  - ▶ *Optical (marker, marker-less, ...)*
  - ▶ *Mechanical*
  - ▶ *Inertial*
- ▶ Quality vs. cost and setup time
- ▶ How to represent motion data?
  - ▶ *Markers*
  - ▶ *Angles*
  - ▶ *Skeleton*



# MOTION CAPTURE

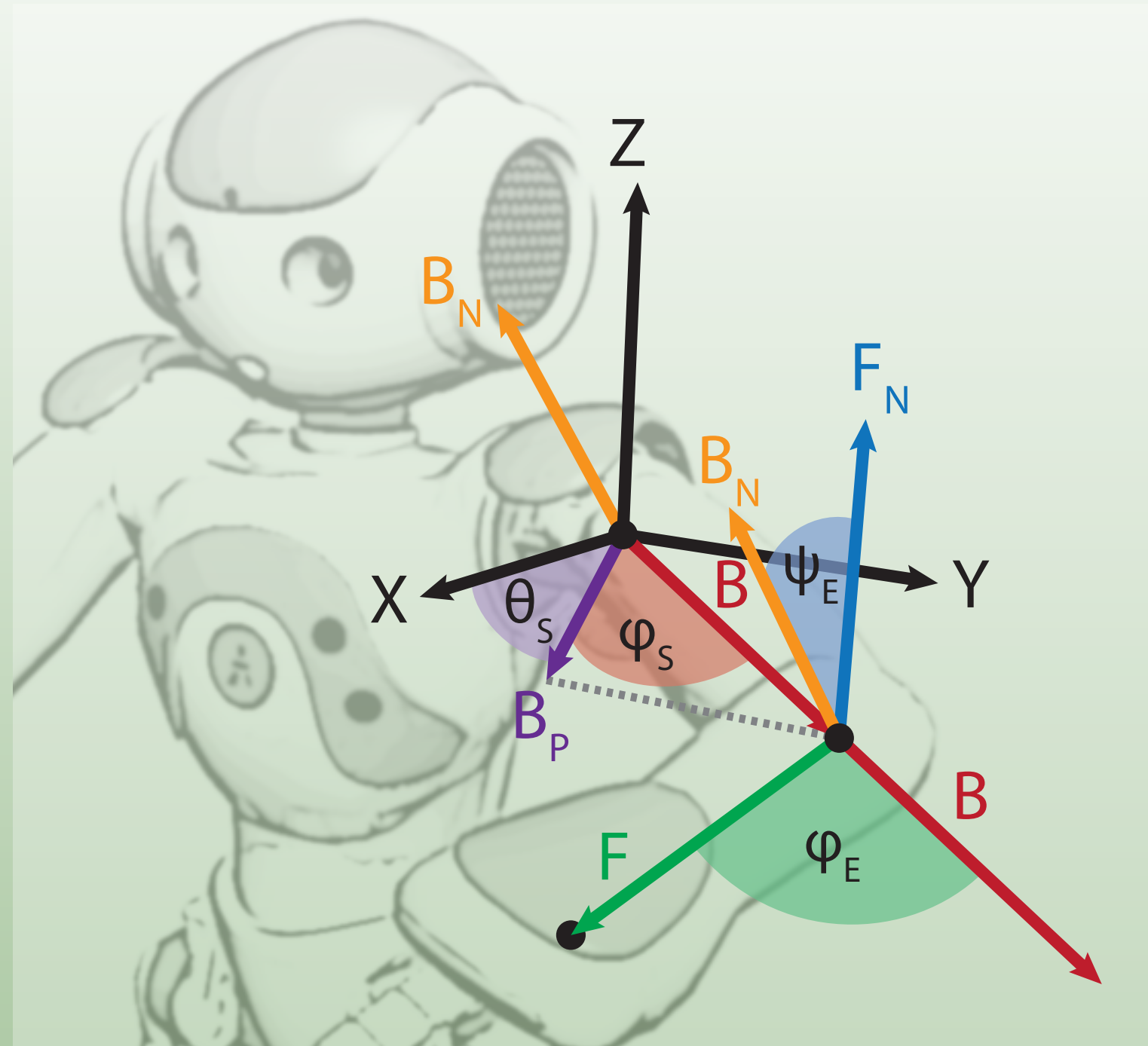
- ▶ OpenNI is a framework for using *natural interaction* (NI) devices
  - ▶ RGB-D sensors (Kinect, Xtion Pro)
  - ▶ PrimeSense NITE skeleton tracking algorithm for Kinect
  - ▶ 3D joint positions must be used to calculate robot joint angles
- ▶ Mapping approach
  - ▶ Vector/angle calculation
  - ▶ IK drawbacks
    - ▶ *Limb lengths change*
    - ▶ *End effector positioning vs. angles*





# MOTION MAPPING: ARMS

$$\begin{aligned}\mathbf{B} &= \mathbf{l}_{\text{elbow}} - \mathbf{l}_{\text{shoulder}} \\ \mathbf{B}_P &= \mathbf{X}(\mathbf{X} \cdot \mathbf{B}) + \mathbf{Z}(\mathbf{Z} \cdot \mathbf{B}) \\ \mathbf{B}_N &= \frac{\mathbf{B}_P \times \mathbf{B}}{|\mathbf{B}_P \times \mathbf{B}|} \\ \mathbf{F} &= \mathbf{l}_{\text{hand}} - \mathbf{l}_{\text{elbow}} \\ \mathbf{F}_N &= \frac{\mathbf{F} \times \mathbf{B}}{|\mathbf{F} \times \mathbf{B}|} \\ \theta_S &= \angle(\mathbf{X}, \mathbf{B}_P, \mathbf{Y}) \\ \varphi_S &= \angle(\mathbf{B}_P, \mathbf{B}, \mathbf{B}_N) \\ \psi_E &= \angle(\mathbf{B}_N, \mathbf{F}_N, \mathbf{B}) \\ \varphi_E &= \angle(\mathbf{B}, \mathbf{F}, \mathbf{F}_N)\end{aligned}$$



# MOTION MAPPING: LEGS

Pre-compute hip configurations  
with forward kinematics

$$\mathbf{T} = \mathbf{l}_{\text{knee}} - \mathbf{l}_{\text{hip}}$$

$$\mathbf{S} = \mathbf{l}_{\text{foot}} - \mathbf{l}_{\text{knee}}$$

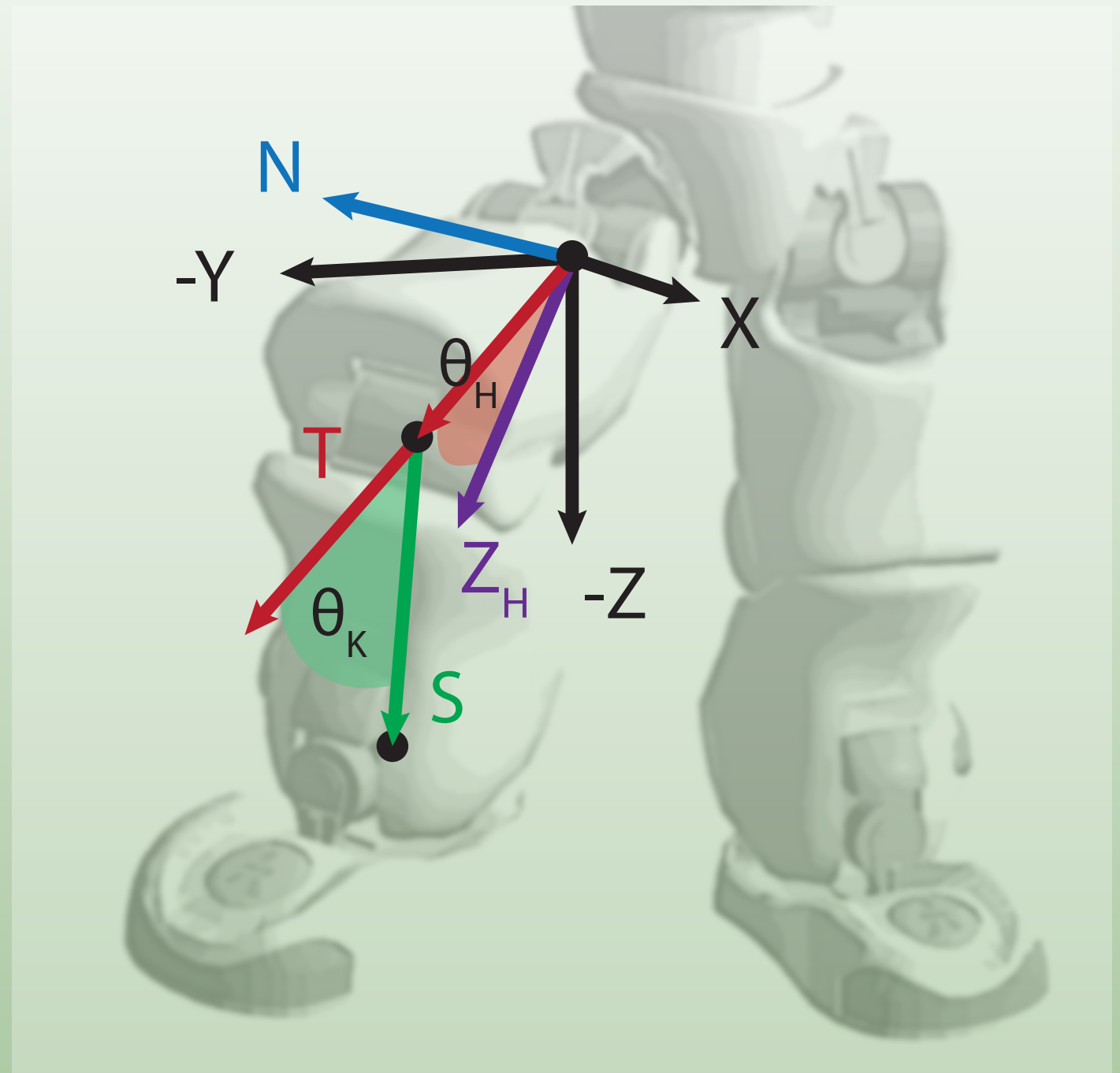
$$\mathbf{N} = \frac{\mathbf{S} \times \mathbf{T}}{|\mathbf{S} \times \mathbf{T}|}$$

$$\alpha_H = \text{from lookup}(\mathbf{N})$$

$$\varphi_H = \text{from lookup}(\mathbf{N})$$

$$\theta_H = \angle(\mathbf{T}, \mathbf{Z}_H, \mathbf{N})$$

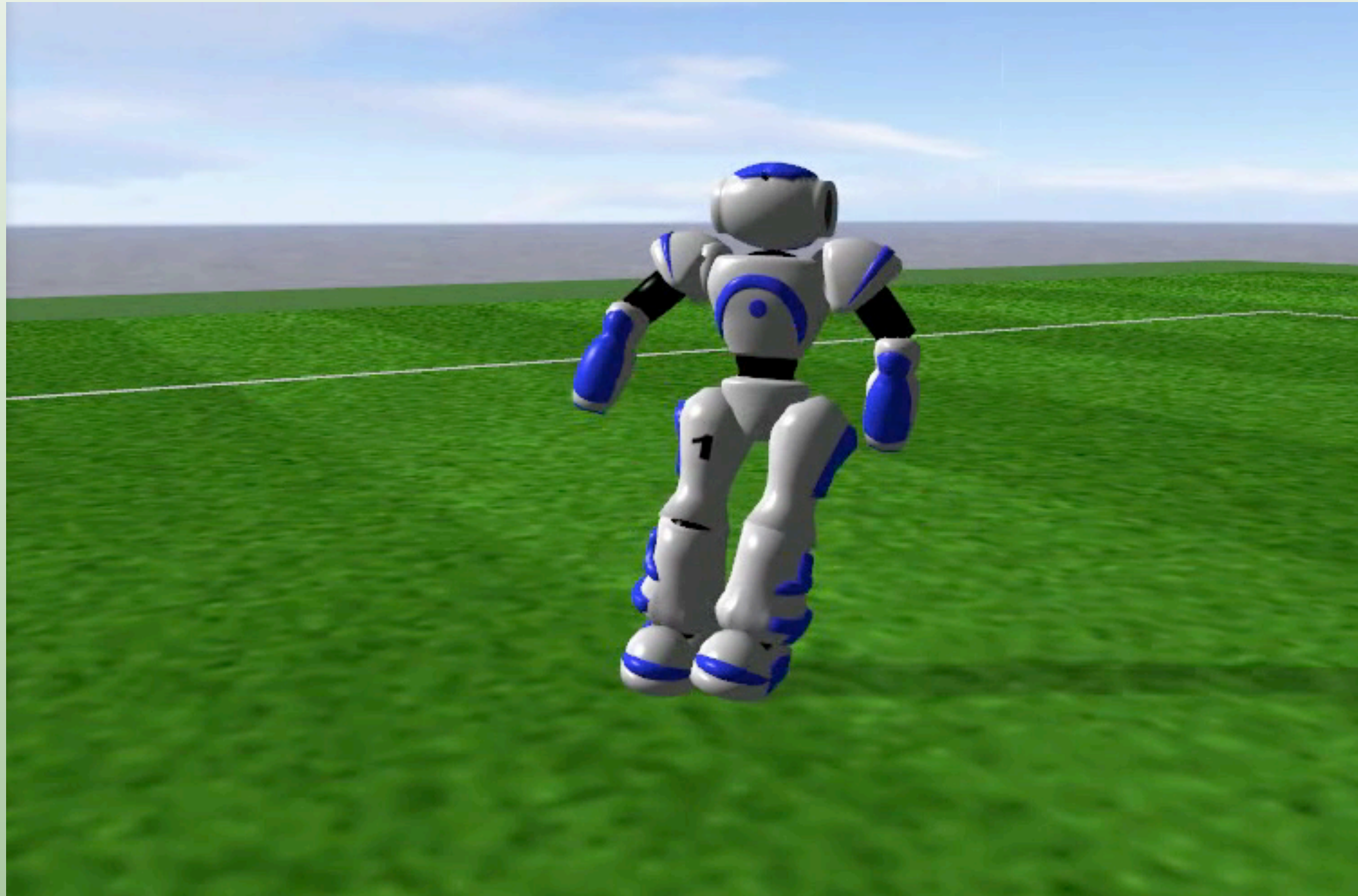
$$\theta_K = \angle(\mathbf{S}, \mathbf{T}, \mathbf{N})$$





# MOTION OPTIMIZATION

Original Motion (directly using MoCap angles)



# MOTION OPTIMIZATION

- ▶ MoCap provides 16 joint control angles at 50 Hz. Model has 22 DOF.

- ▶ Model:

$$y(\mathbf{x}, \boldsymbol{\theta}) = \sum_{j=0}^{N-1} \theta_j \phi_j(\mathbf{x}) = \boldsymbol{\theta}^T \boldsymbol{\Phi}(\mathbf{x})$$

- ▶ Basis functions:

$$\phi_j(x) = x^j \qquad \phi_j(x) = \sigma\left(\frac{x - \mu_j}{s}\right)$$

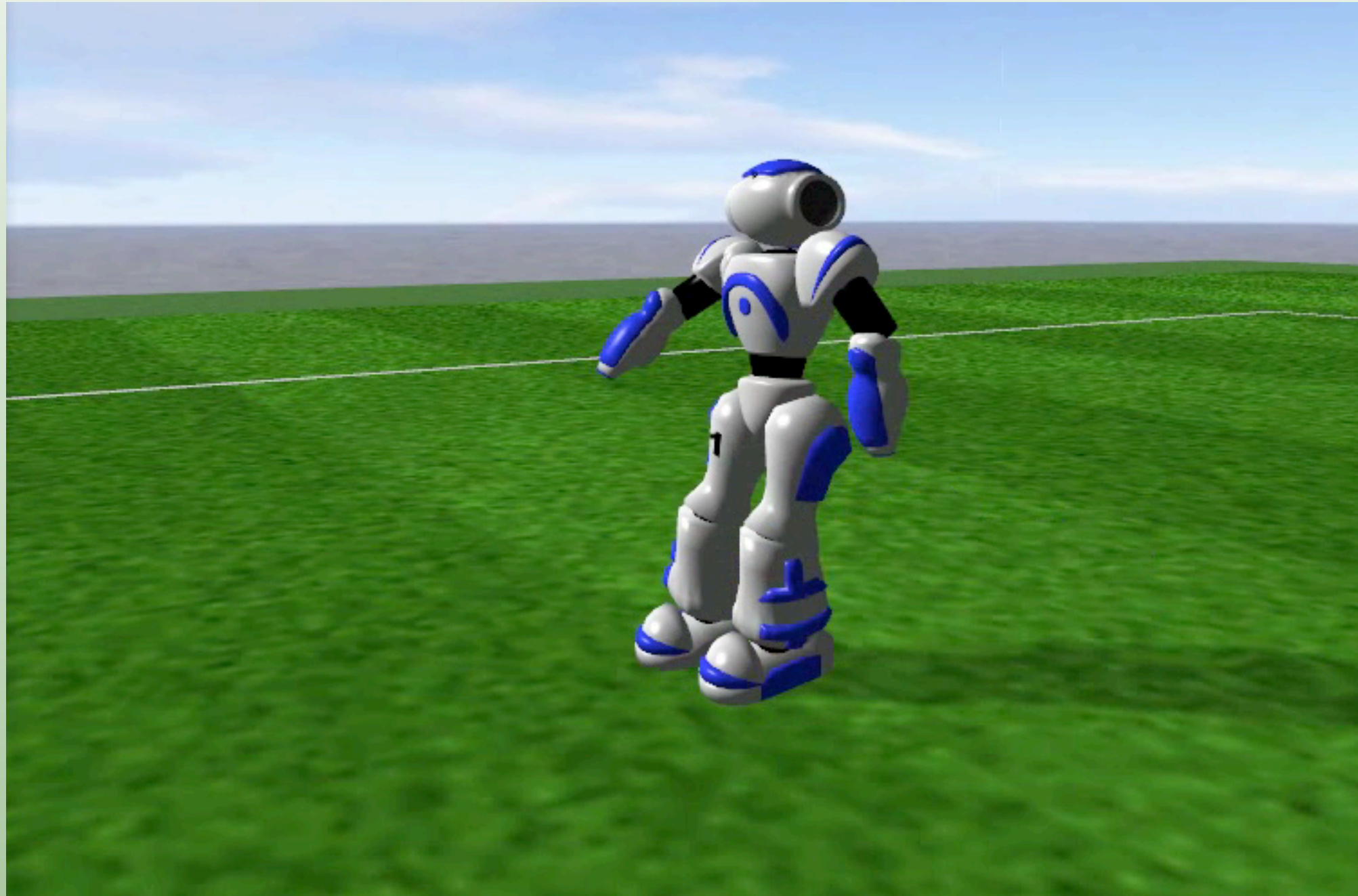
- ▶ Initial objective function:

$$\min \sum_{i=1}^M (t_i - \boldsymbol{\theta}^T \boldsymbol{\Phi}(\mathbf{x}))^2$$



# MOTION OPTIMIZATION

## Curve-Fit Motion



# MOTION OPTIMIZATION

- ▶ Initial optimization of the model parameters is used as a seed for the optimization of the motion for stability on the robot.
- ▶ Task is optimization problem with two conflicting objectives.
- ▶ Following exactly joint angles provided by the MoCap does not guarantee the outcome to be correct.
- ▶ Also, the changes in the angles have to be small to ensure the final result to be close to the captured motion.
- ▶ Objective functions:

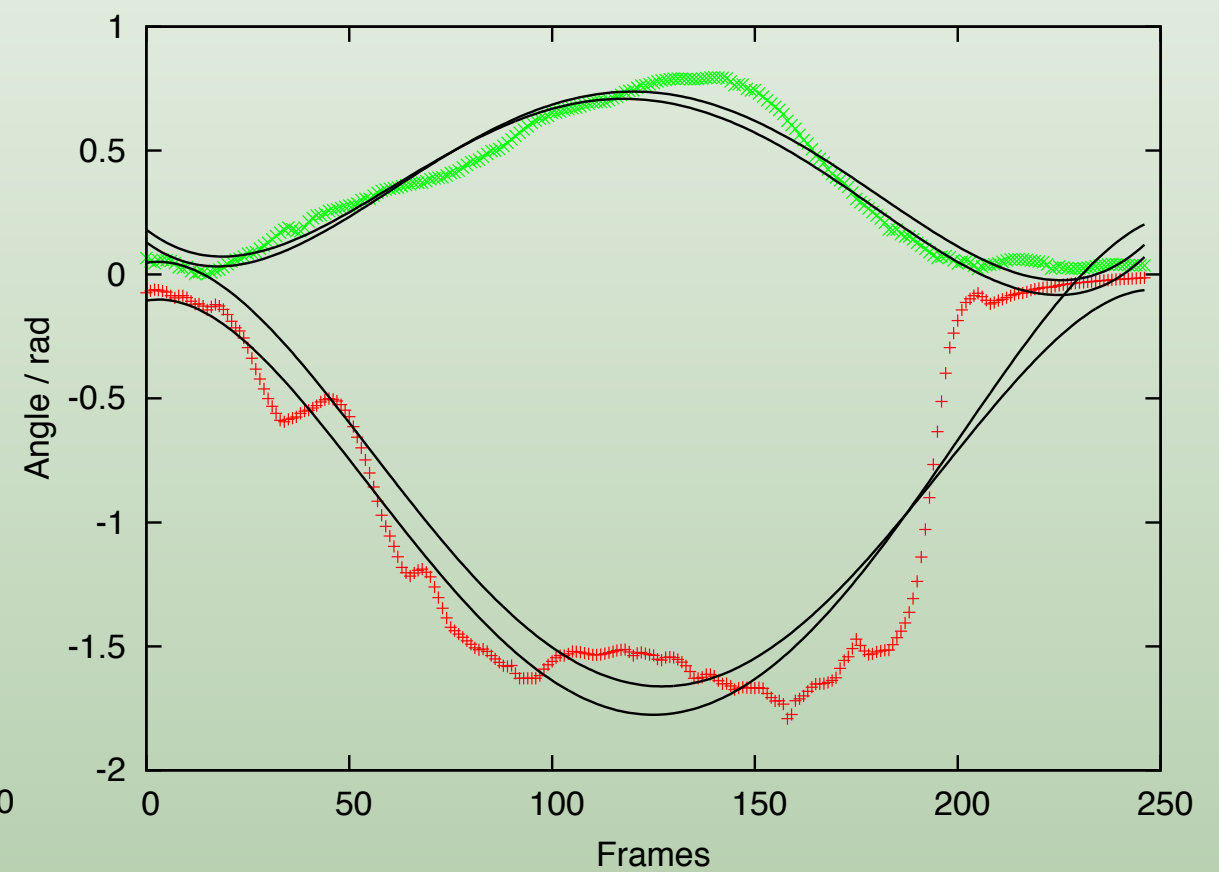
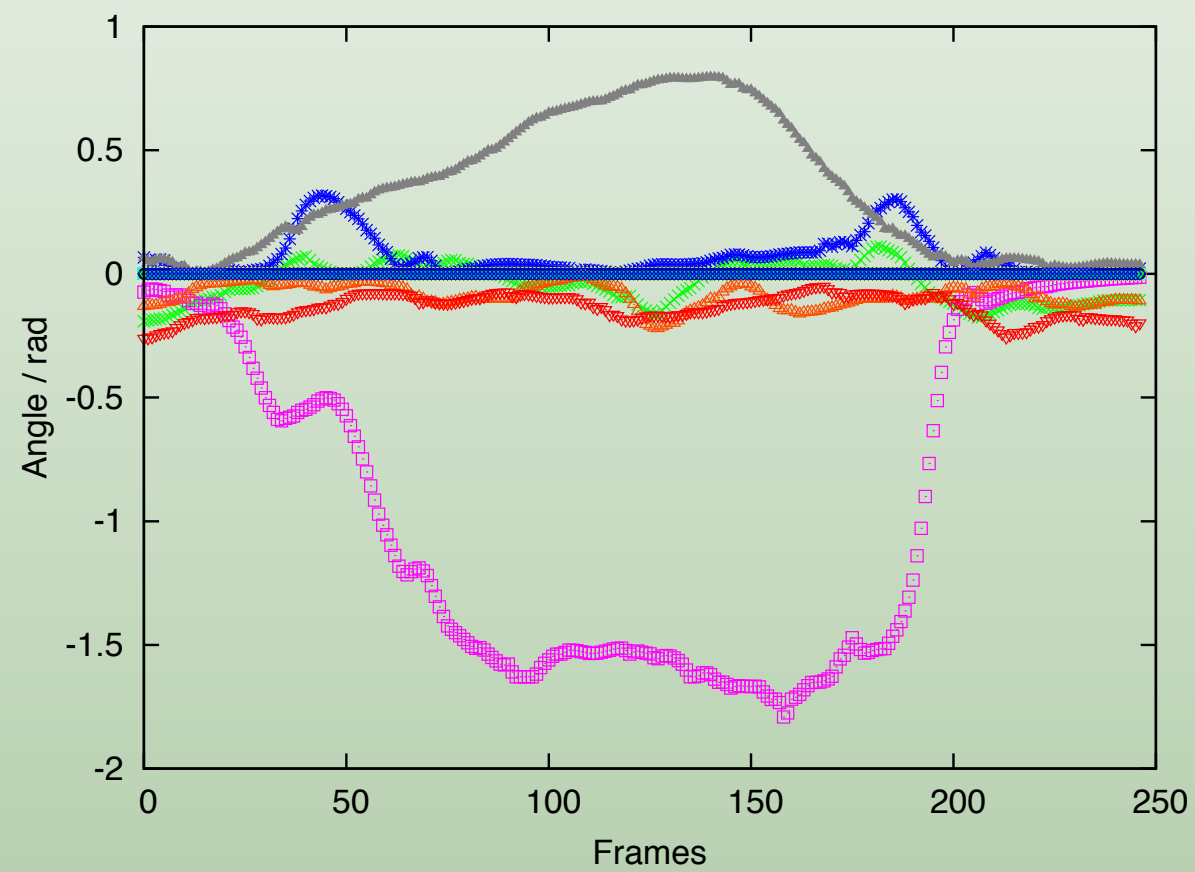
$$\sum_t \max_{i \in \{\text{fwd}, \text{up}, \text{side}\}} (\angle(\text{MoCapTO}_{t,i}, \text{ObsTO}_{t,i}))^2$$

$$\sum_t \left( \sum_j (\text{MoCapAngle}_j - \text{ObsJointAngle}_j)^2 \right)$$

- ▶ ES/PSO algorithms are used again to optimize the model parameters.
- ▶ Optimize only the traces of the agent's legs (12 traces for each motion),  $N \times 12$  parameters (e.g., with eight parameters, we optimize 96 parameters).

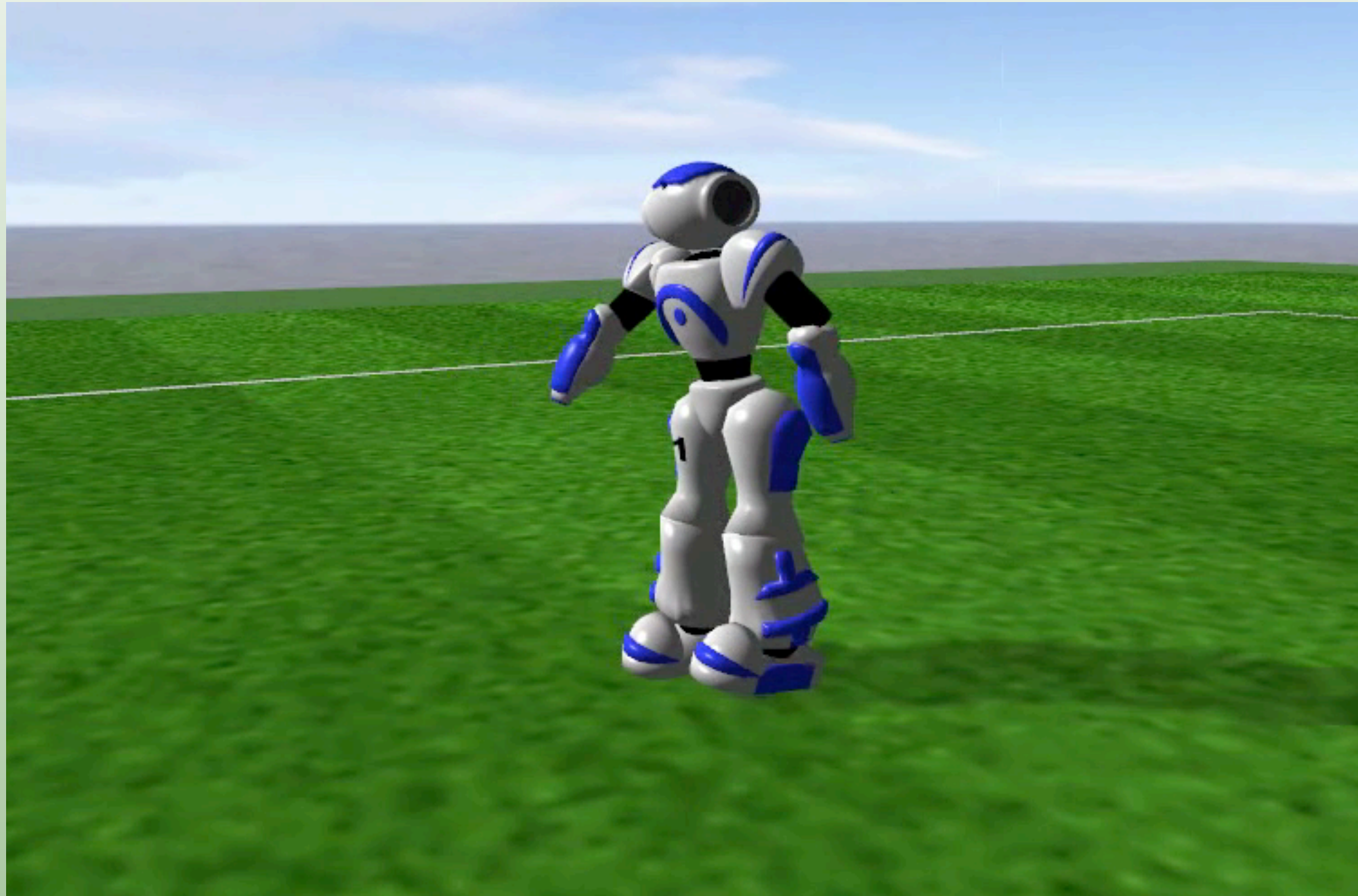


# EXPERIMENTAL SETUP



# MOTION OPTIMIZATION

## Optimized Motion



# MOTION CAPTURE AND OPTIMIZATION



Seekircher, A., Stoecker, J., Abeyruwan, S., & Visser, U. (2014). Fast, robust, and low-cost method to create complex whole body motions on biped robots. *Artificial Intelligence Journal*, under review.



# CONCLUSION

- ▶ Hypothesis verified: robust motions for a biped soccer robot can be quickly generated with inexpensive MoCap techniques and optimization.
- ▶ Kinect sensor provides enough information to map complex and initially unstable poses, such as the balancing motions.
- ▶ We have found a process that can be used to produce a number of motions needed for humanoid soccer robots.
- ▶ No claim that our approach will hold for all possible motions.
- ▶ Motions were mostly stable after ~30 min.
- ▶ Making use of parallel processing on a cluster of computers can bring the entire processing time down to 10-30 min per motion, including the MoCap.
- ▶ Observation: CMA-ES and xNES are similar in performance, PSO shows partly smaller errors with a larger variance and it takes longer to learn.
- ▶ Models with sigmoidal basis functions yields good results for all three algorithms.

# EXPERIMENTAL SETUP

- ▶ SimSpark [ORR04], the simulated robot is a humanoid robot similar to the Nao (21 DOF, sensor cycle 50 Hz).
- ▶ 4 motions in the experiments: 1) lift right leg, 2) simple kick, 3) forward lean with balancing on one leg while stretching the other leg back, and 4) leans torso to the side.
- ▶ Joint motions modeled using polynomials and linear weighted sigmoidal basis functions.
- ▶ Models are initialized by minimizing the least squared error to the input angles.
- ▶ Using the initial parameters as a seed, 12 leg joints are optimized by CMA-ES, xNES, and PSO using the fitness function based on the joint and the torso error.
- ▶ Population size is 50 for all optimization methods.

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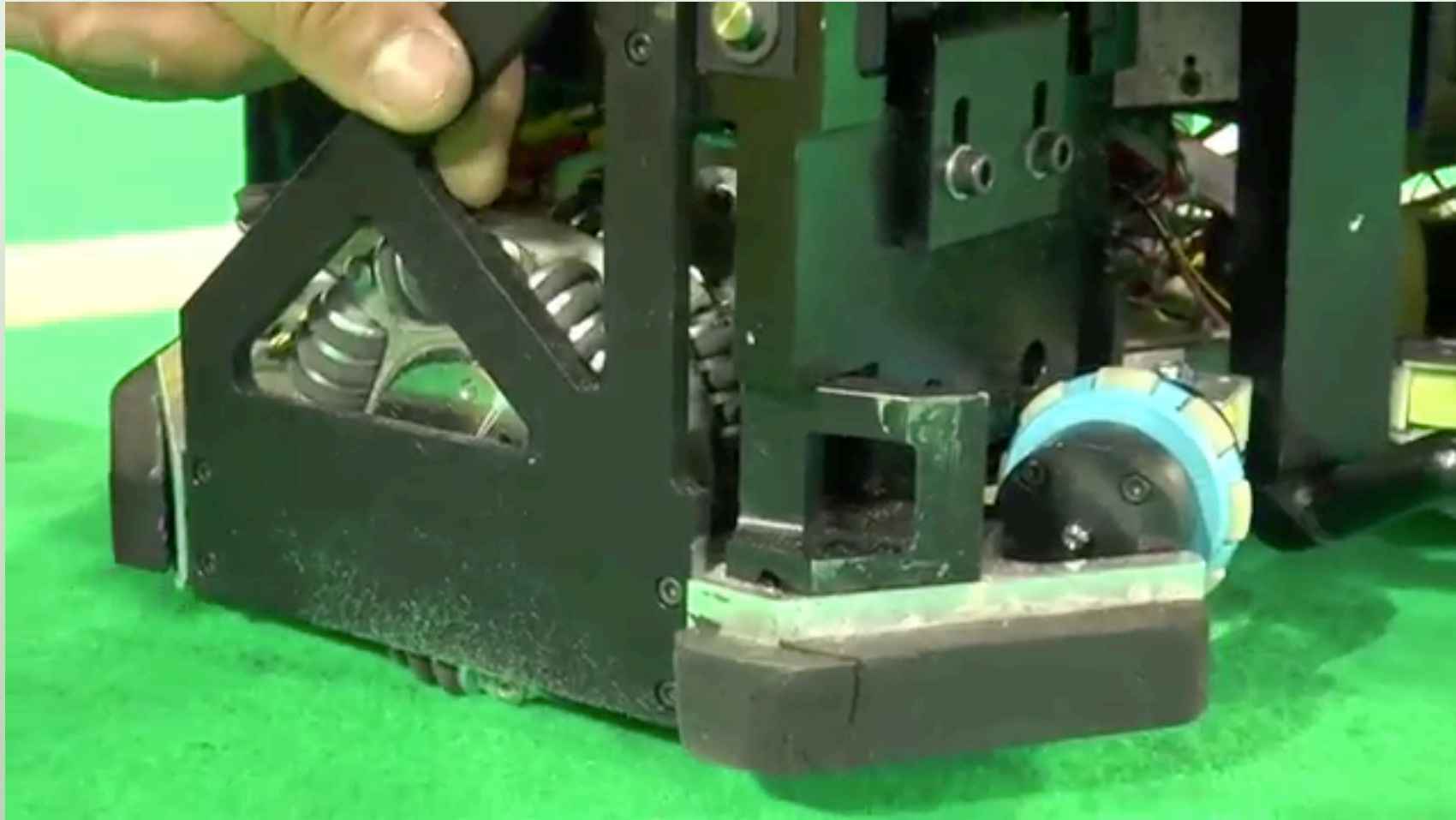
# FINAL KIDSIZE ROBOCUP 2013



# FINAL ADULTSIZE ROBOCUP 2013



# MIDSIZE LEAGUE INTRODUCTION





# FINAL 3D SOCCER SIMULATION ROBOCUP 2013



# FINAL SMALL SIZE LEAGUE ROBOCUP 2013





# FINAL STANDARD PLATFORM LEAGUE ROBOCUP 2013

