

# Tutorial on Learning from Demonstration

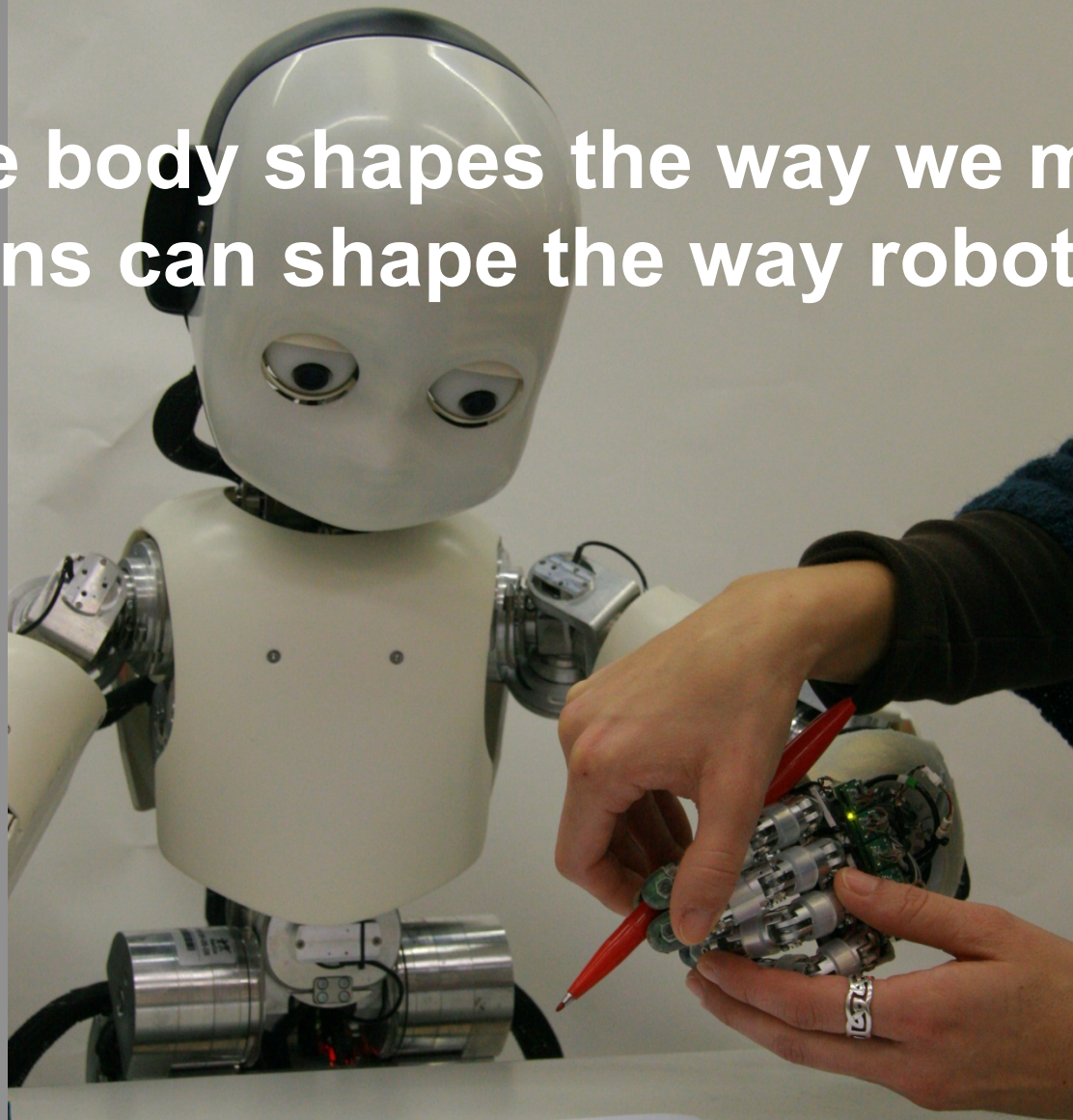
Part 6: Discussion and Overview of  
Open Issues

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# *Why Learning from Human Demonstration?*

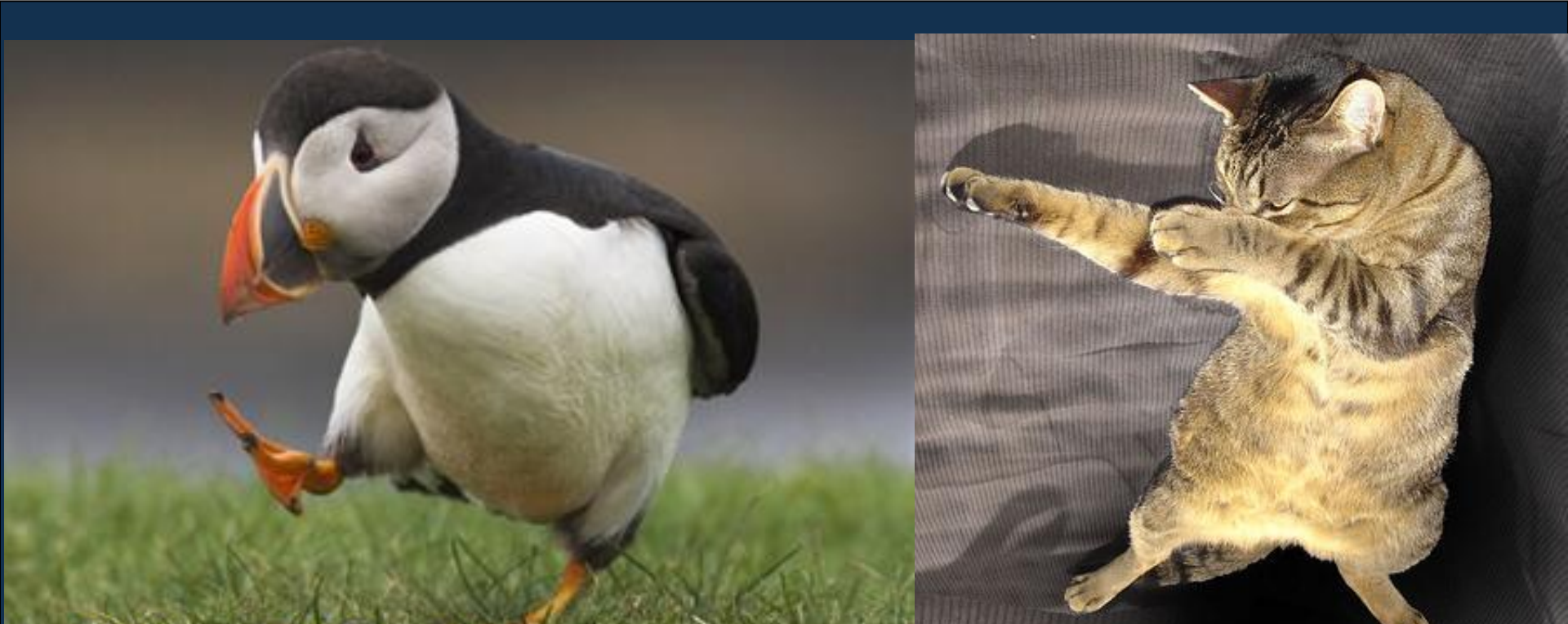
# How the body shapes the way we move

## How humans can shape the way robots move



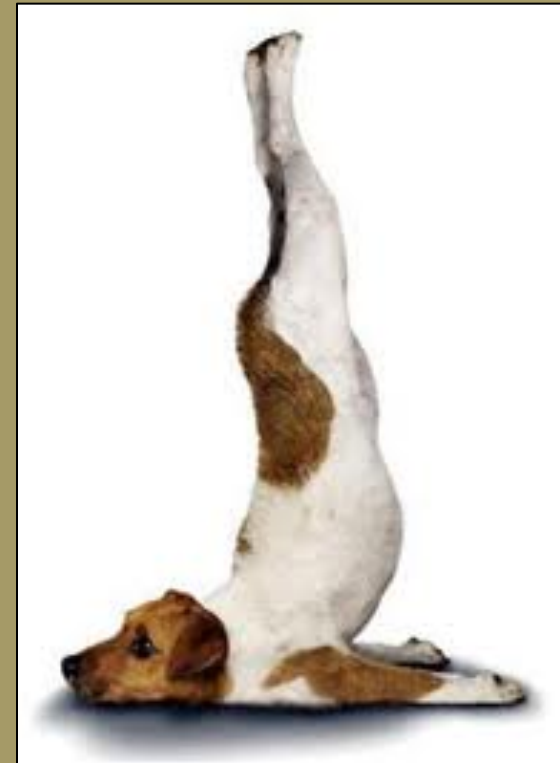
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# How the body shapes the way we move



Evolution has shaped the body and the control system simultaneously so as to optimize the animal's overall motor control system

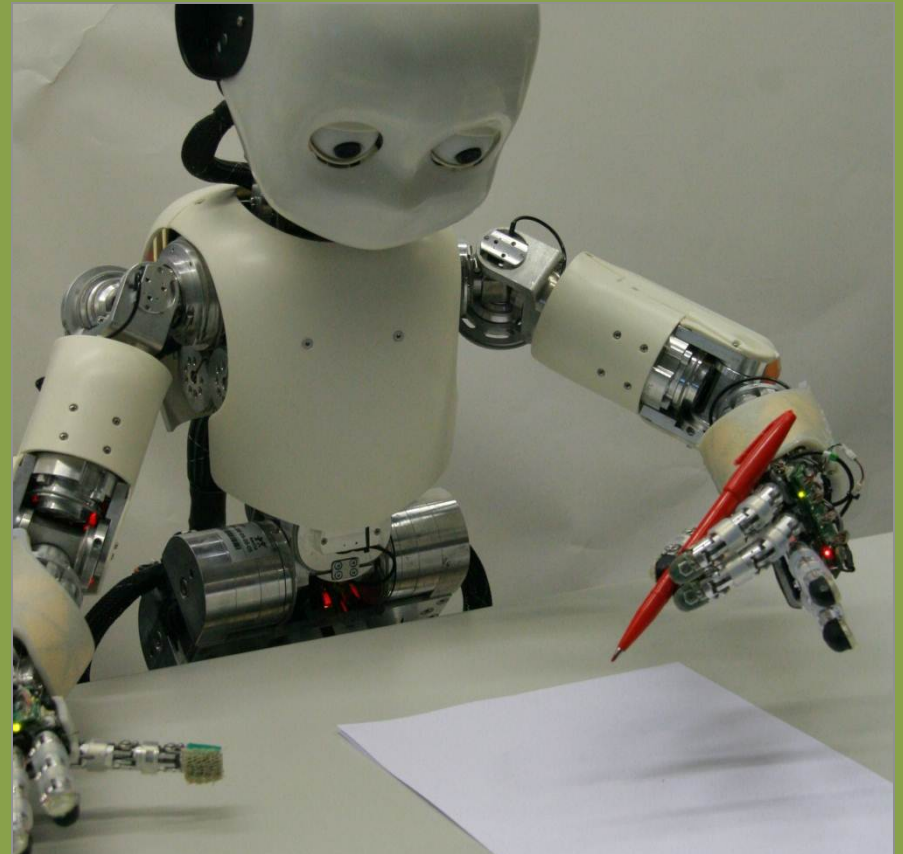
# With enough training....



...we can get bodies to do things for which they were not designed for in the first place, but this requires tedious and long training periods.



# How the body shapes the way we move



*Robots should have arms and hands that are similar to human hands and arms*

# How the body shapes the design of tools

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Robots should help us in our daily tasks

- manipulate the same objects
- objects are designed for the human hand



*Bent to our needs!*

# *Robots should move and act in a way that is similar to the way humans move and act*

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## *Why?*

- *Makes robot's motions more predictable*
  - *Increase safety during human-robot interaction*
  - *Easier for robots and humans to collaborate*
- *Human motions have all these nice properties (robustness to perturbation, smoothness, energy efficiency), which we seek robots to have.*



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# What is easy and what is difficult to imitate

# What is easy and what is difficult to imitate

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Move 10cm on your right!

Move 10cm per second on your right!

Move  $10\text{cm/s}^2$  on your right!

Press with 1Newton on the table

# The correspondence problem



Humans and robots may differ tremendously in their body

# The correspondence problem

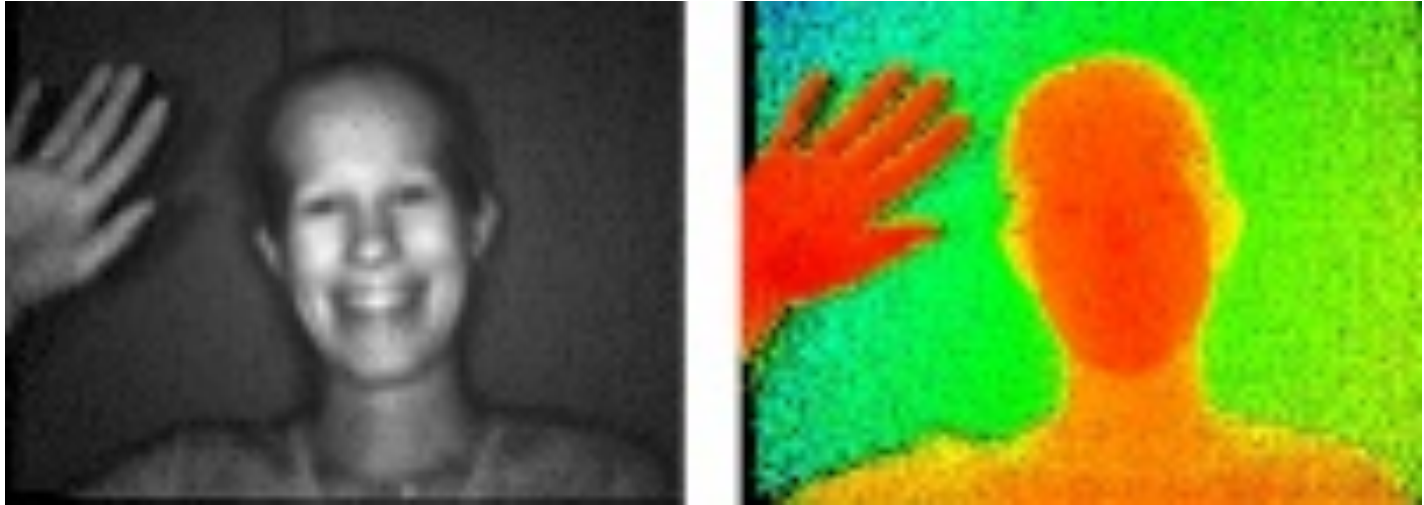
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Even when the robot looks more like the human, its body does not have the same range and dynamics of motion.

# The correspondence problem

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Robots do not perceive things like we do.  
Sonars, infra-red sensors, lasers are common on robots  
and easier to process than information from cameras.



# Partially Open Questions

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Learning human skills by imitation includes learning:

- What to imitate?
- How to imitate?
- When to imitate?
- Who to imitate?

# Other Issues

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Take humans as example

→ Hypothesis: Human is a good example!

- Algorithms robust to imperfect demonstrations
- Learn from few and very noisy data
- Incremental learning

Human teaches the robot by showing how to perform the task

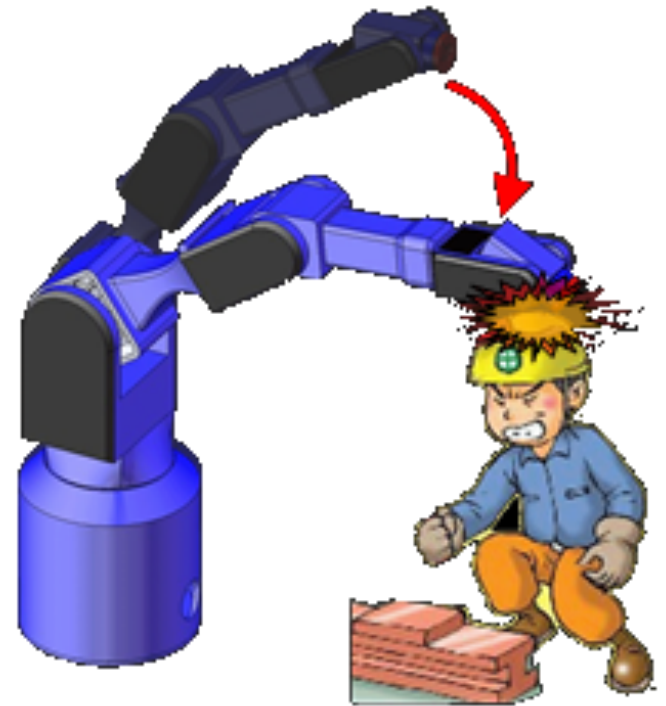
→ Hypothesis: There is an interface to teach the robot

- Need cheaper and more versatile interfaces for haptic control
- Need easy ways to combine interfaces (speech, vision, haptic)

# Safety in LfD

→ Ok when robot is passive during demonstration.

What is actively compliant?



Source: Intelligent Robotics Lab, Korea Univ.

# Other Issues

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Start apply LfD in the real world and document users' reactions

# Summary

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Learning new tasks relies on various means of teaching the robots.

- Imitation learning is useful in so far that it gives hints as to the optimal solution
- The robot must however rely on generic skills of its own to adapt the demonstration to its own body and to the context
- Learning of complex skills is overall relatively slow and must proceed incrementally