

# Compliance in Perceptual Control Systems: Insights and Implications

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## What is 'Compliance'?

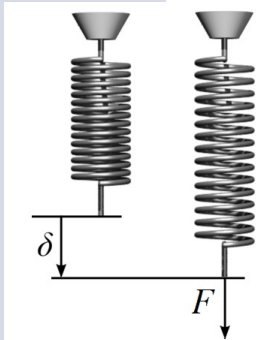


- The property of a material of undergoing **elastic** deformation when subjected to an applied force (the reciprocal of stiffness)
- The act of **conforming**, acquiescing, or yielding

Returns to original state

Adopts new state

# Compliant Systems



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<https://commons.wikimedia.org/w/index.php?curid=80080175>



JLS Automation and Soft Robotics grippers  
<https://www.snackandbakery.com/articles/89167-jls-automation-and-soft-robotics-grippers>

# Active/Passive Compliance in Robotics



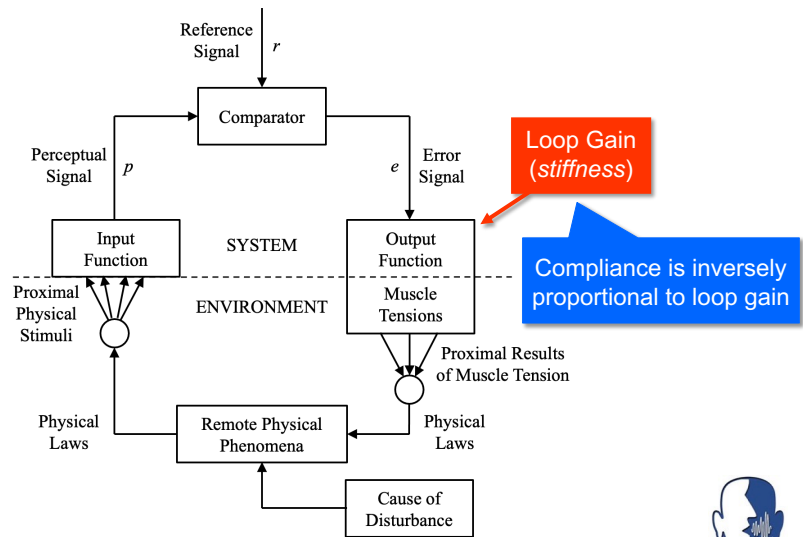
<https://www.thinkrobotics.co.nz/kuka-robots.html>

Compliance needs to be programmed explicitly due to high impedance 'backdrivability'

Compliance is implicit in elastic construction material



Diamond, A., Knight, R., Devereux, D. & Holland, O. (2012)  
 "Anthropomorphic Robots: Concept, Construction and Modelling",  
*International Journal of Advanced Robotic Systems*, vol. 9, pp. 1-14.



**SCHAUM'S**  
*outlines*

# FEEDBACK AND CONTROL SYSTEMS

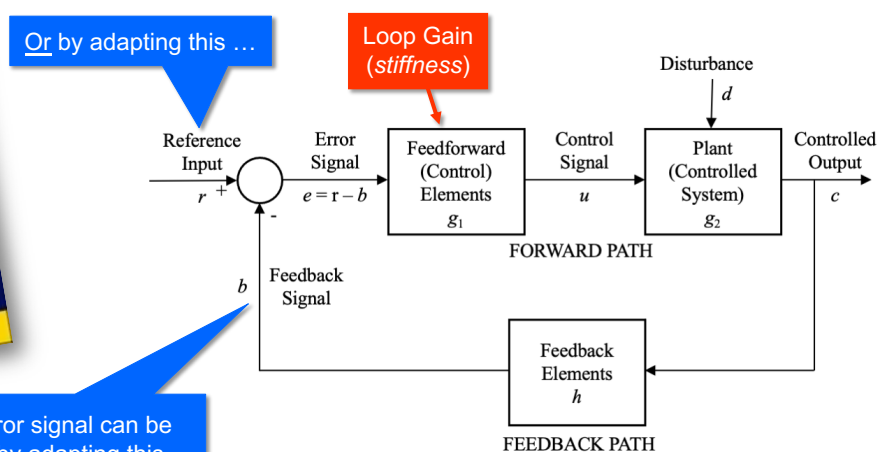
## Second Edition

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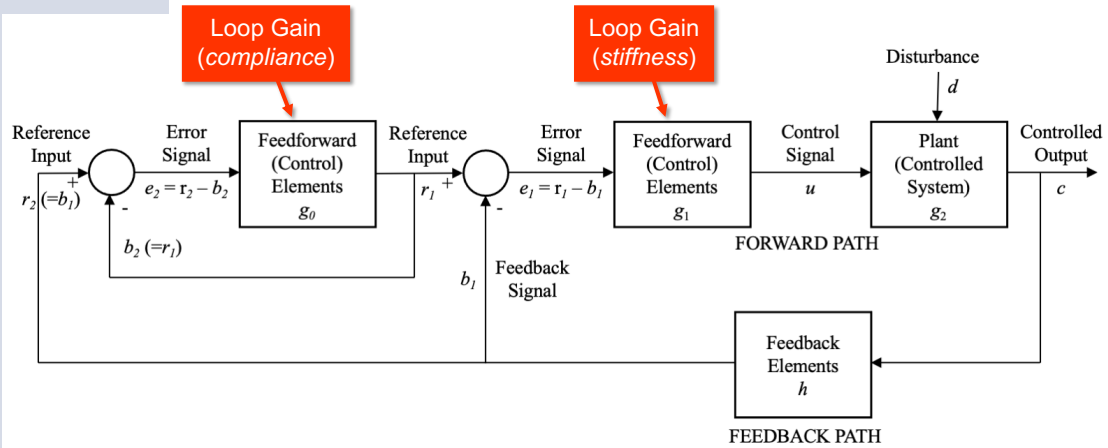
Use with Schaum's: of Feedback Systems, of Systems, of Feedback Systems, of Feedback Systems



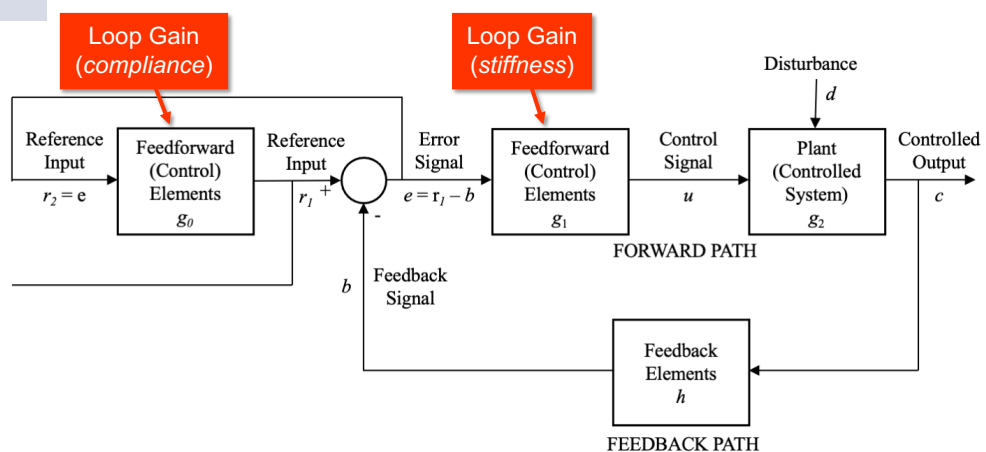
The error signal can be reduced by adapting this ...

DiStefano III, J. J., Stubberud, A. R., & Williams, I. J. (1990). *Feedback and Control Systems* (2nd ed.). New York: McGraw-Hill.

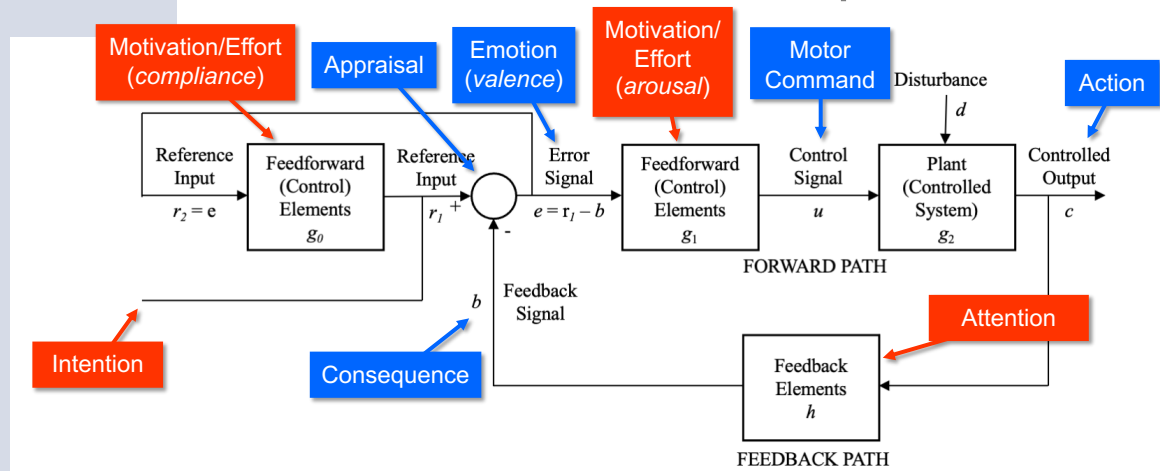
# ‘Compliant’ Control Loop



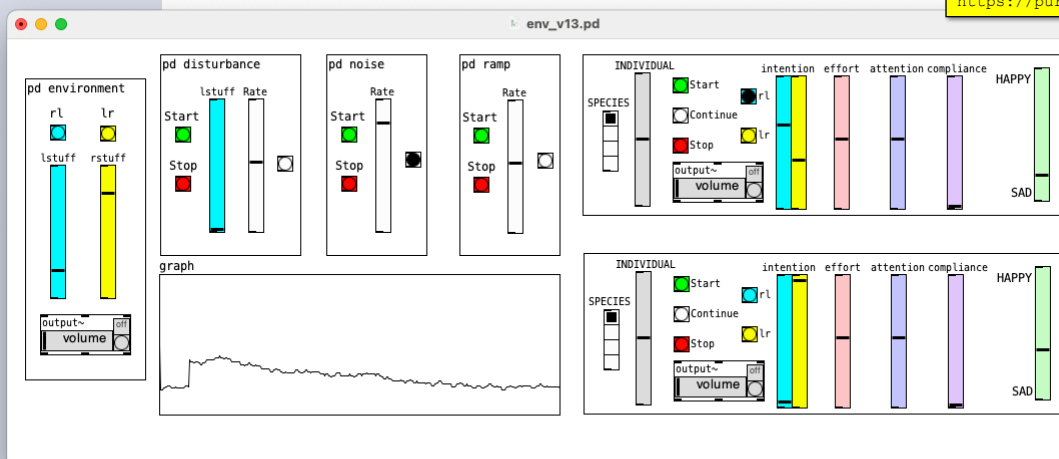
# ‘Compliant’ Control Loop



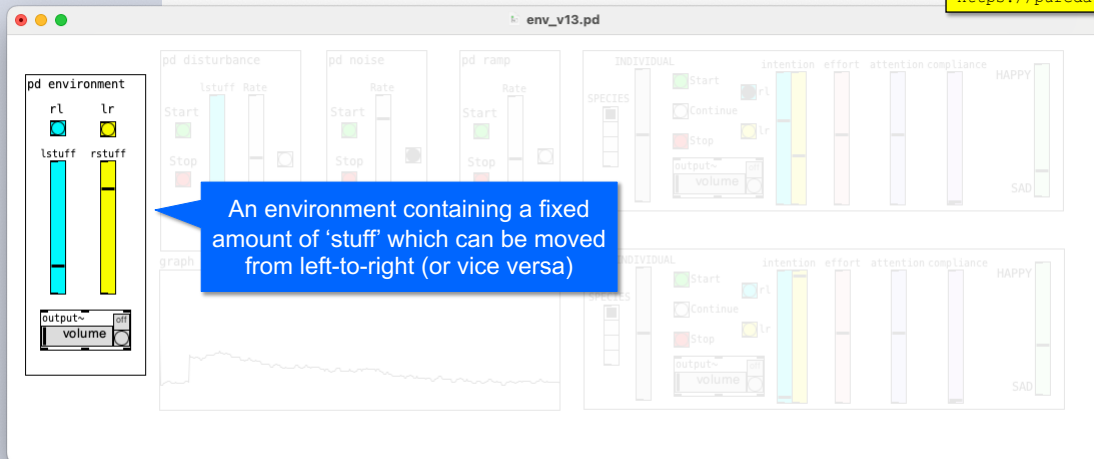
# 'Affective' Control Loop



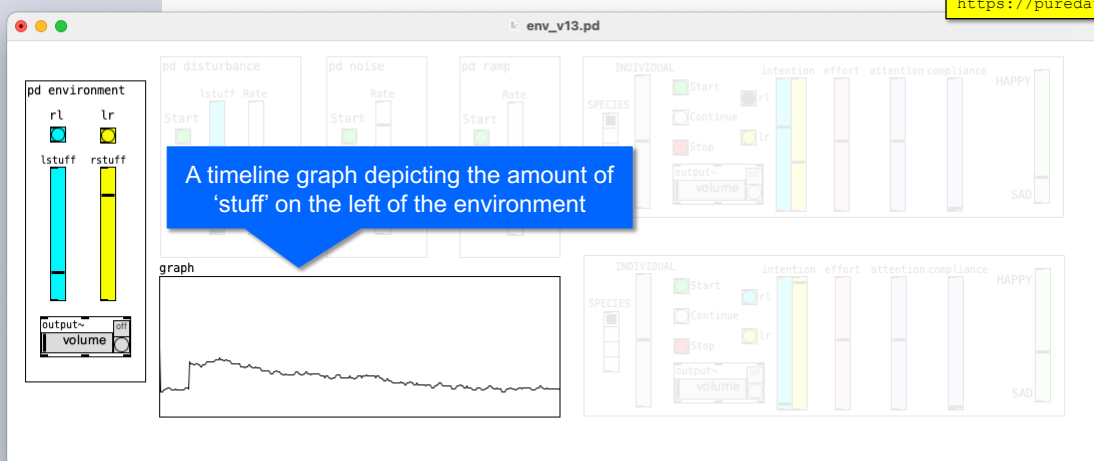
# Simulation Environment


<https://puredata.info>


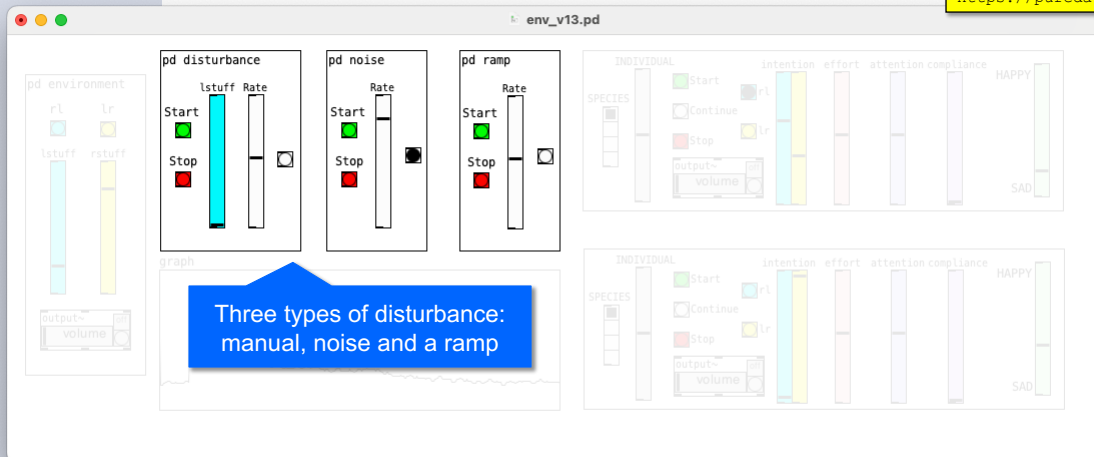
# Simulation Environment


<https://puredata.info>


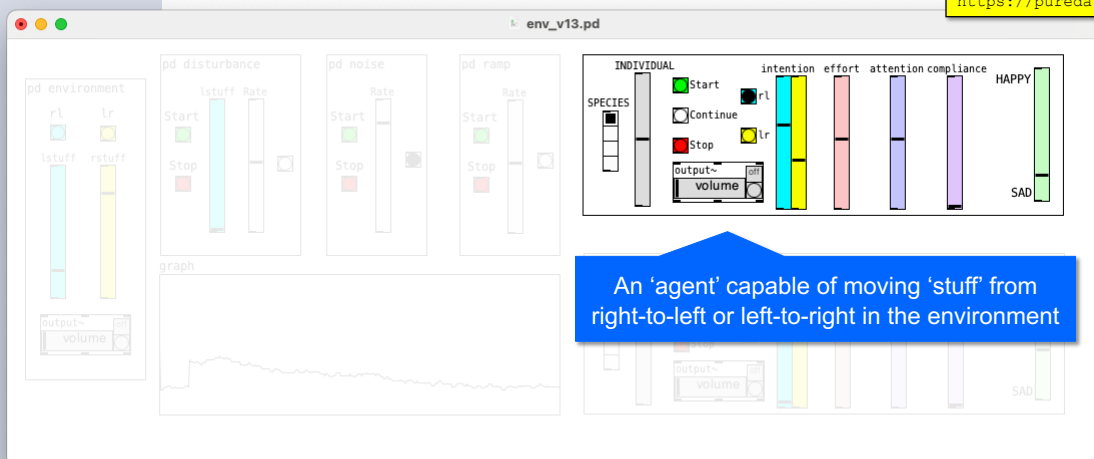
# Simulation Environment


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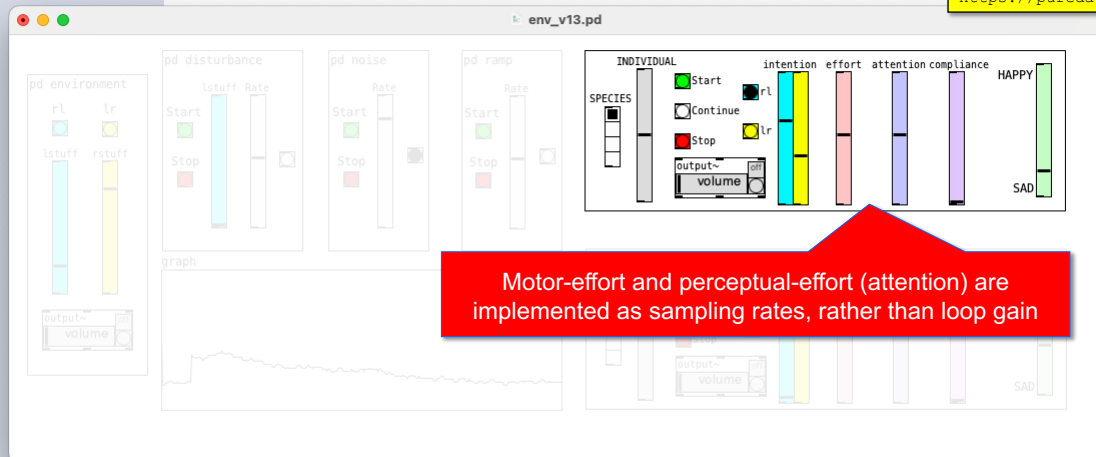
# Simulation Environment


<https://puredata.info>


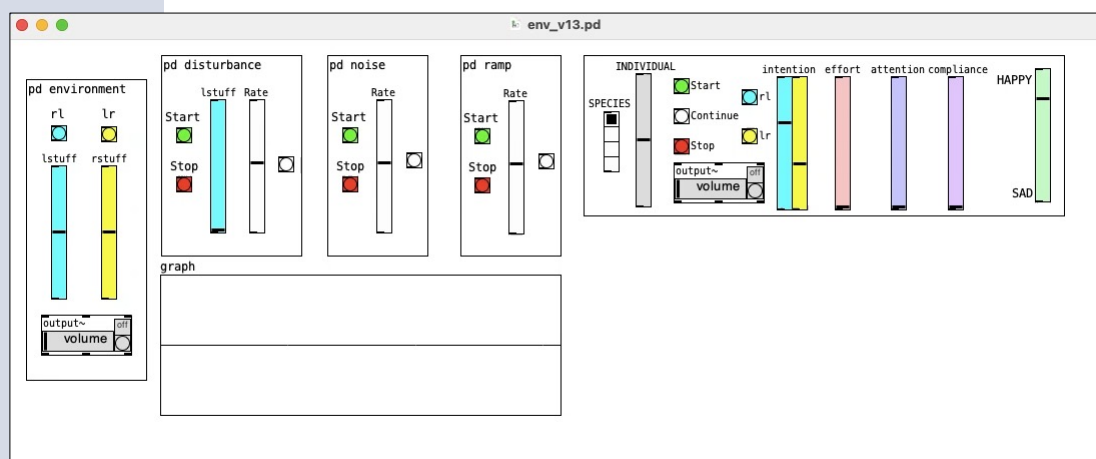
# Simulation Environment


<https://puredata.info>


# Simulation Environment

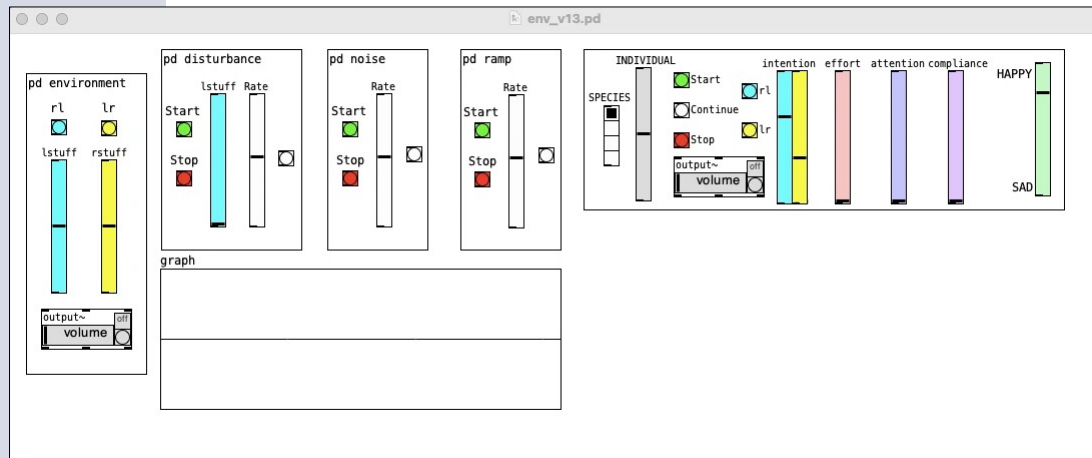

<https://puredata.info>


## Demo-1: Moving 'Stuff' Manually

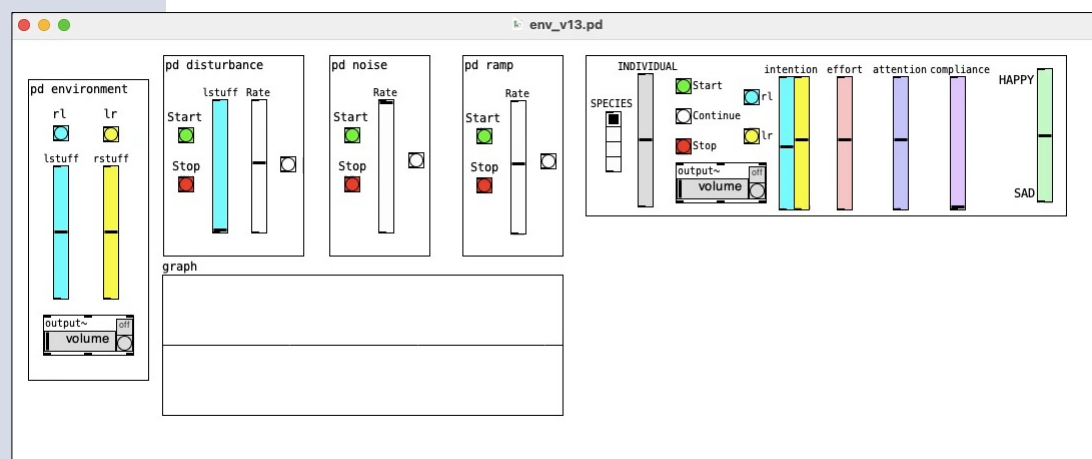




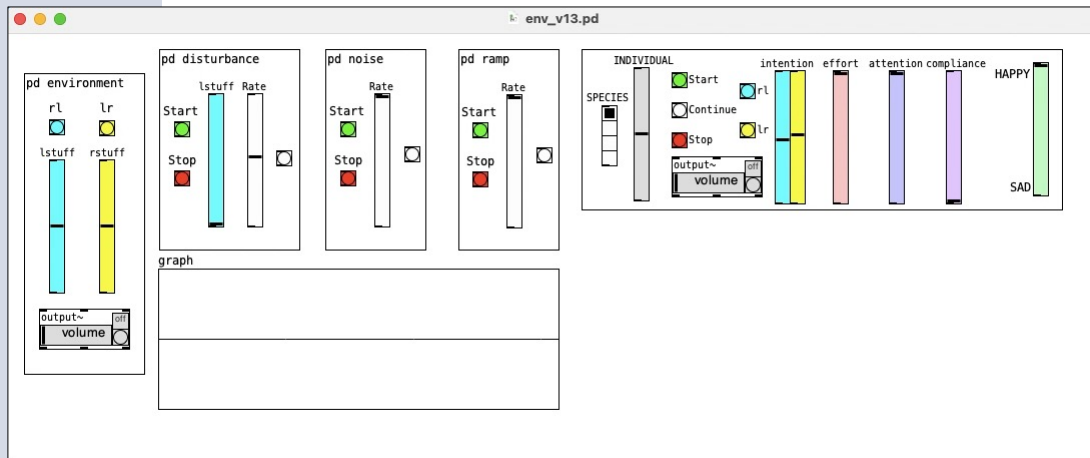
## Demo-2: Agent Moving 'Stuff'



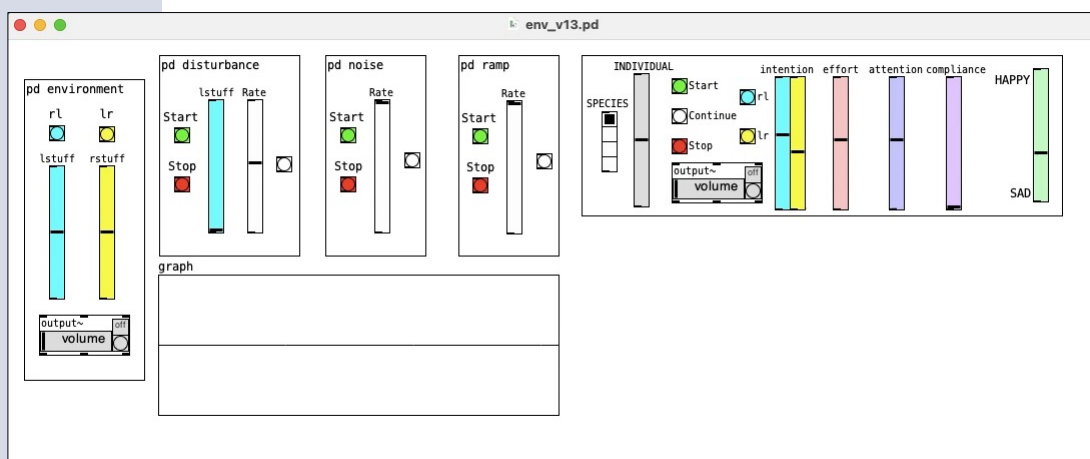
## Demo-3: Agent Resisting Noise



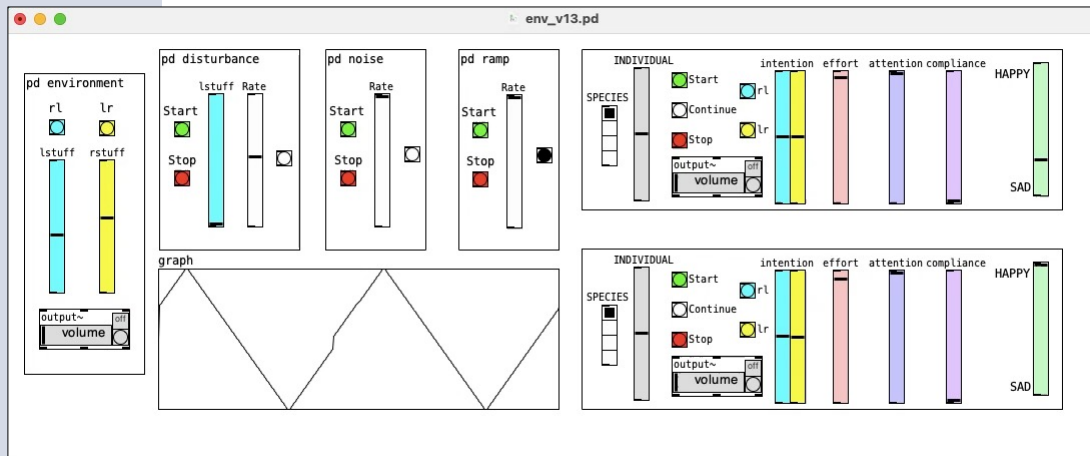
## Demo-4: Agent Resisting Ramp



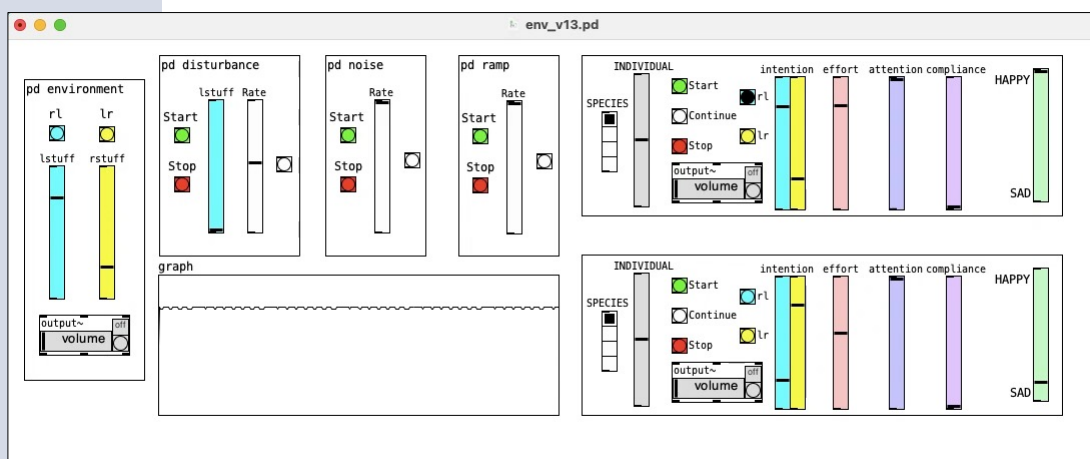
## Demo-5: Agent Complying with Ramp



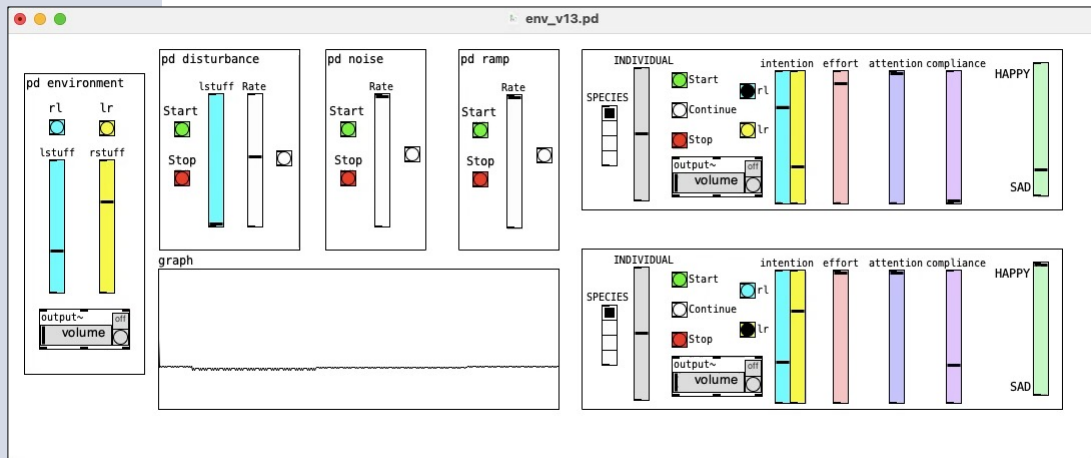
## Demo-6: Cooperation



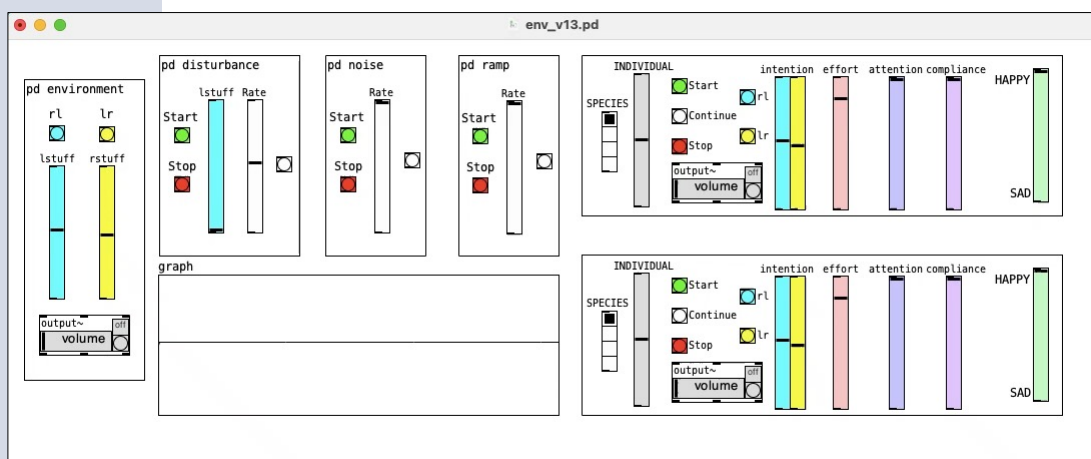
## Demo-7: Competition



## Demo-8: Compliance



## Demo-9: Compromise

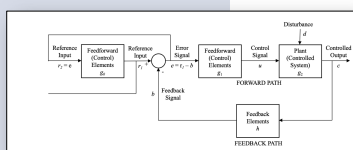


# Implications

compliance → adaptation/learning → mimicry → intent recognition

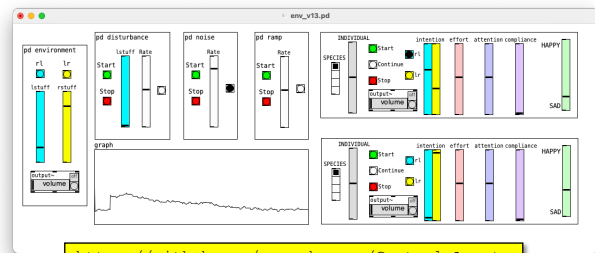
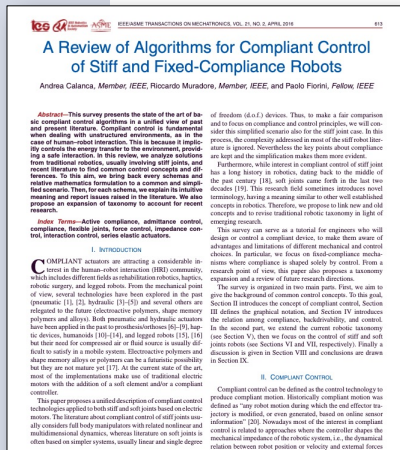
- The compliant agent has learnt a hidden parameter of the dominant agent, and thus has acquired a model of the other agent (it has become the other agent!)
- I.e. a compliant agent acquires a generative model of perception (as in 'predictive processing')
- This is also known as 'recognition-by-synthesis' (and is a special case of 'understanding-by-doing', i.e. the same principle as 'mirror neurons')
- Bottom line: complying = explaining

# Summary and Conclusion



- Natural living systems are intrinsically 'compliant', whereas engineered systems are typically 'stiff'
- This means that engineered systems either have to employ elastic components or have compliance programmed explicitly into their control architectures
- PCT is able to provide a general framework for modelling variable stiffness/compliance which may be applied to both natural and artificial systems
- Computer-based simulations have shown how PCT may be used to model key compliant behaviours, including interaction between agents with matched or mismatched compliance
- It has also been shown how the PCT perspective on compliance may be readily extended to encompass a form of adaptation/learning and the foundation of a generative/predictive model of perception

# Where to Find Out More



<https://github.com/rogerkmoore/Control-Agents>

Calanca, A., Muradore, R., & Fiorini, P. (2016). A Review of Algorithms for Compliant Control of Stiff and Fixed-Compliance Robots. *IEEE/ASME Trans. Mechatronics*, 21(2), 613–624.



University of  
Sheffield

33rd IAPCT Conference

12-14 October 2023

slide 27



## Thank You

<http://staffwww.dcs.shef.ac.uk/people/R.K.Moore/>

# Abstract

- In living systems - specifically, animals - movement is typically enacted by innervating one or more muscles to pull upon tendons, bones and soft tissues.
- In contrast, actuation in engineered systems is customarily implemented by means of electric motors actuating hard components such as gears, levers and wheels.
- This means that natural systems are intrinsically 'compliant' (that is, capable of adapting to a resistive force), whereas engineered systems are inherently 'stiff' and either have to employ soft components (such as springs or elastic structures) or have compliance programmed explicitly into their control architectures.
- The latter is particularly interesting from the perspective of Perceptual Control Theory (PCT), as PCT is able to provide a general framework for modelling variable stiffness/compliance which may be applied to both natural and artificial systems.
- This talk will illuminate this principle using computer-based simulations, and it will be shown how PCT may be used to model key compliant behaviours, including the consequences for interaction between agents with matched or mismatched compliance.
- In particular, it will be shown how dominant/submissive agents fare in cooperative and competitive scenarios, especially in terms of the motivational effort deployed towards solving a specific task.
- It will also be shown how the PCT perspective on compliance may be readily extended to encompass a form of adaptation/learning, which itself may be construed as a primitive form of predictive processing or, more interestingly, recognition-by-synthesis.
- In other words, while compliance may be characterised as an important feature of adaptive behaviour, it may also be seen as the foundation of perception.
- 30 mins = ~20 slides