

Encoding Sensorimotor Redundancy for Flexible Behavior

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11.01.2007



Contents: Computational models of...



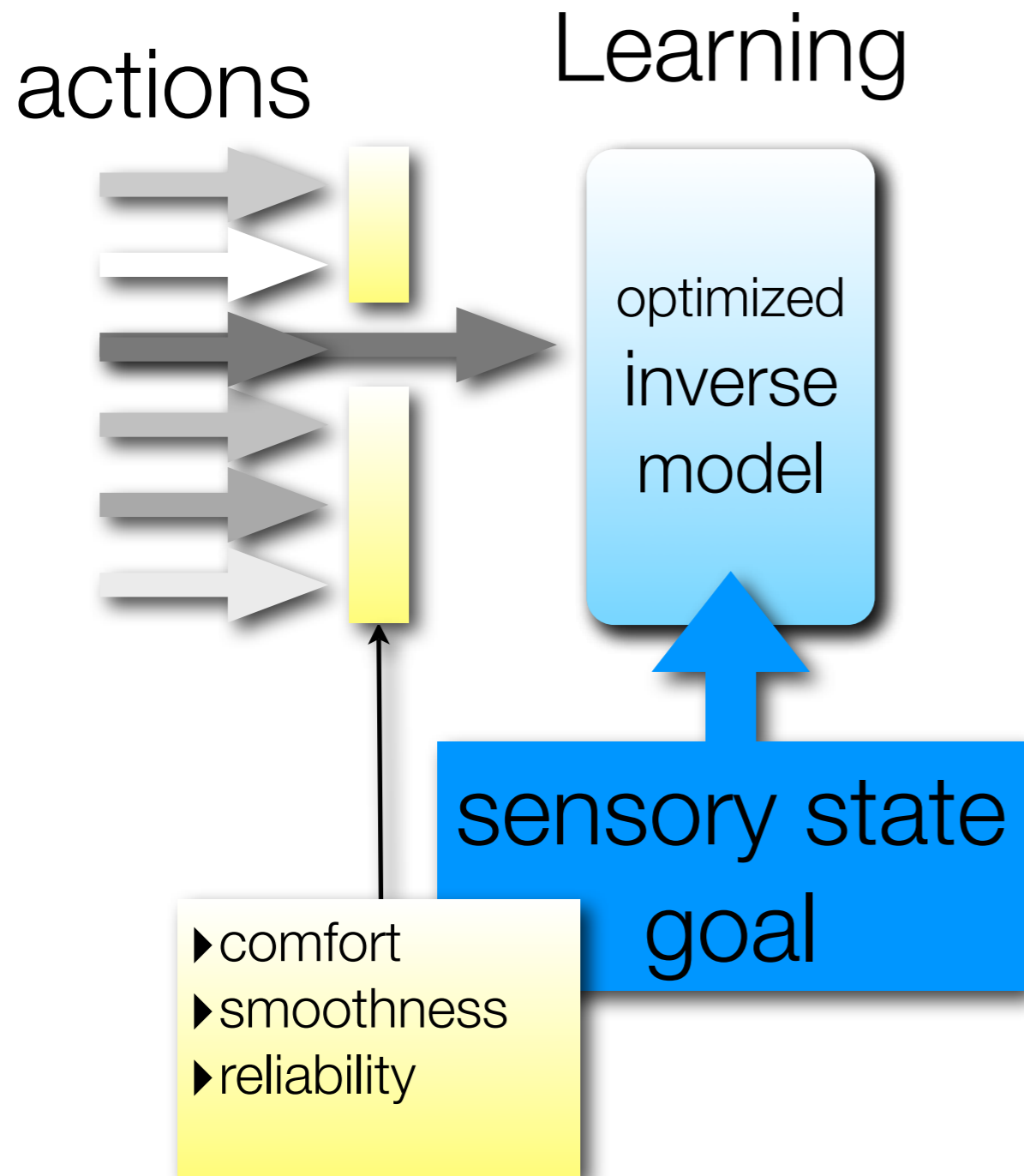
highly flexible
behavior...



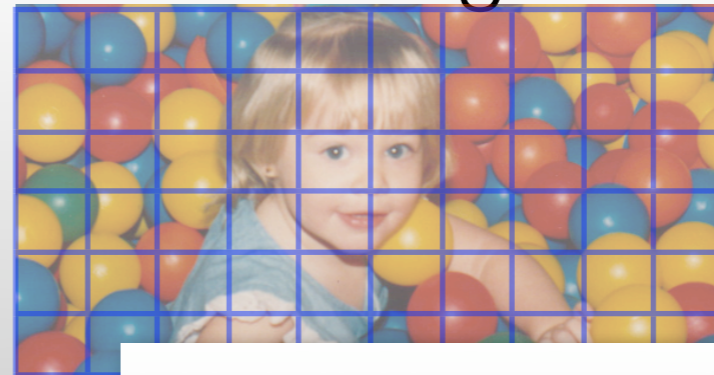
and how it
can be acquired
(motor learning)

Focus on reaching movements

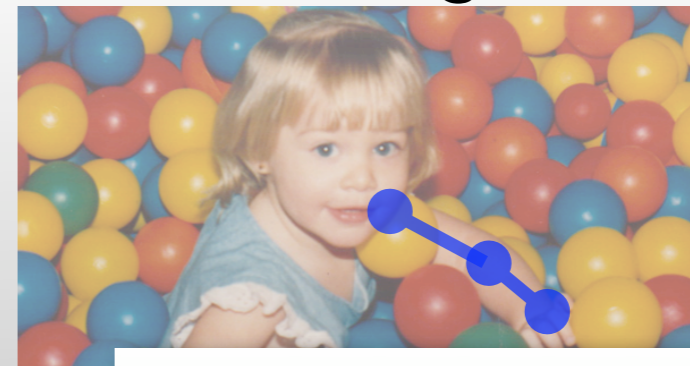
Computational Models of Motor Learning



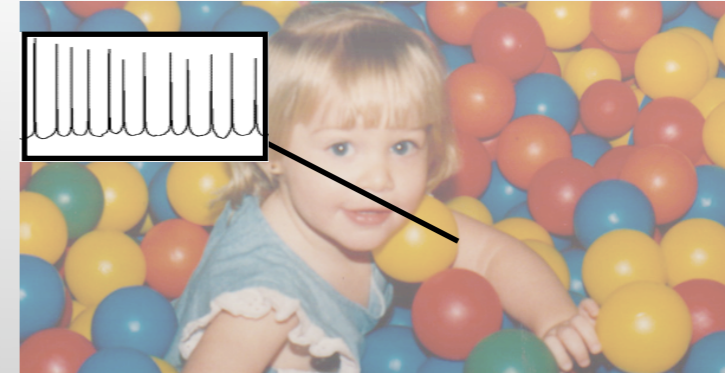
external goal



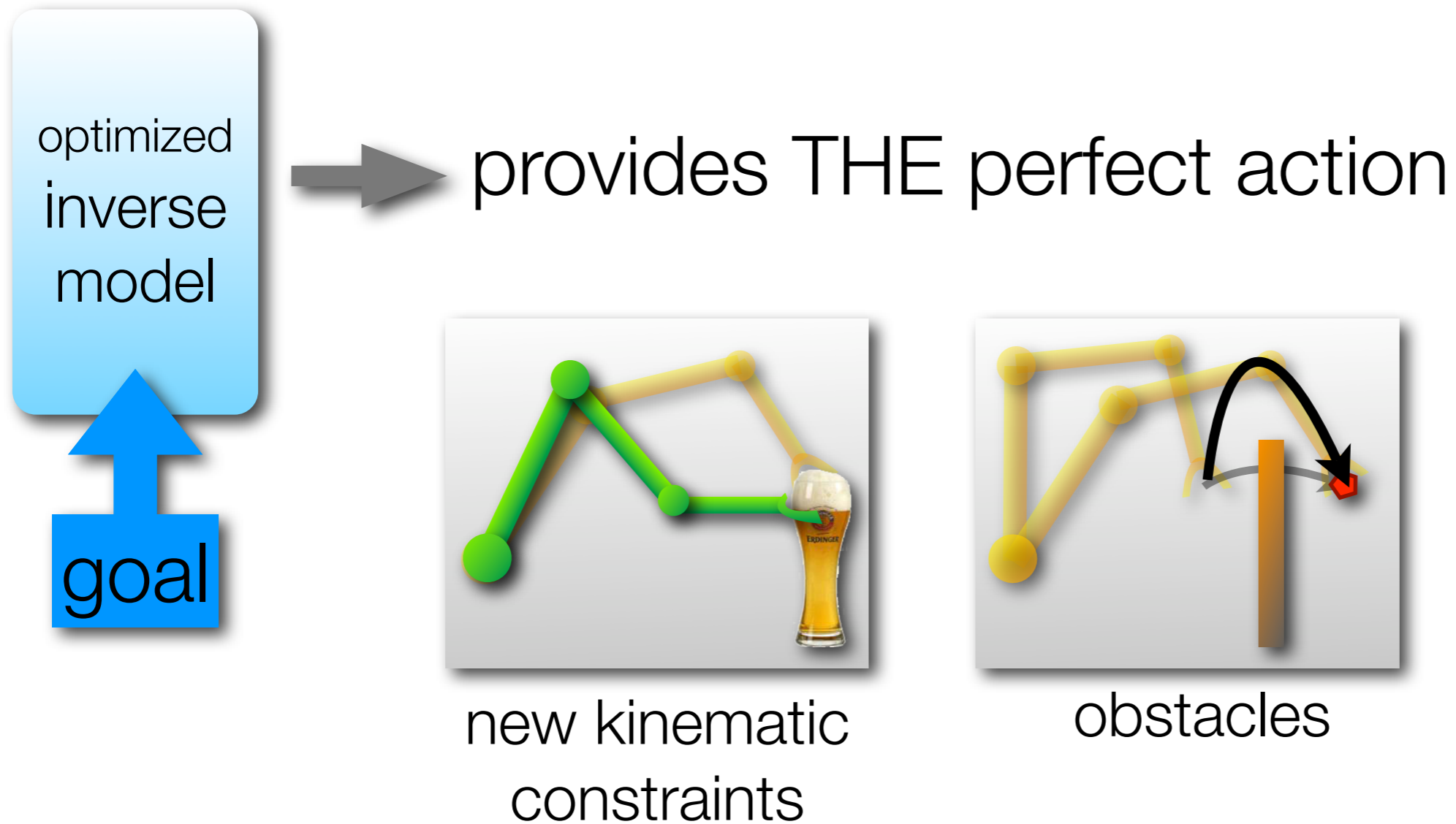
internal goal



motor commands

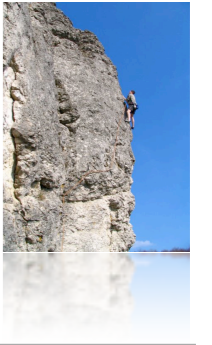


Kinematic inflexibility



No flexible behavior

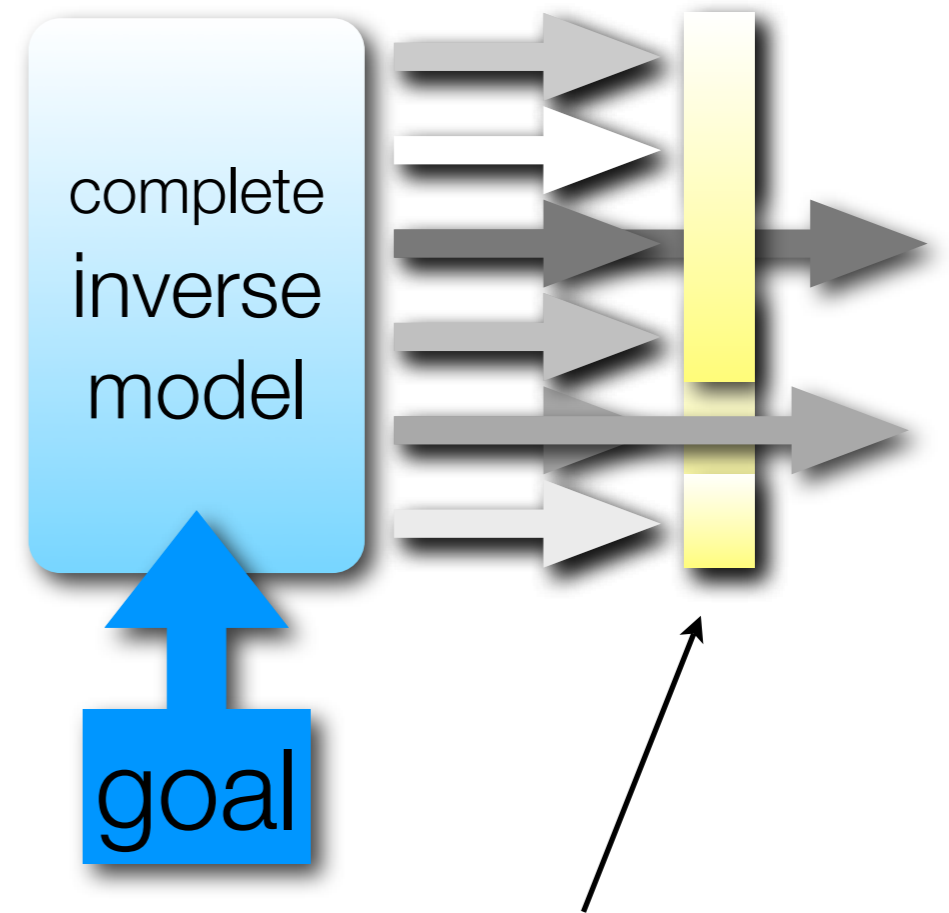
Computational Models of Flexible Behavior



Learning

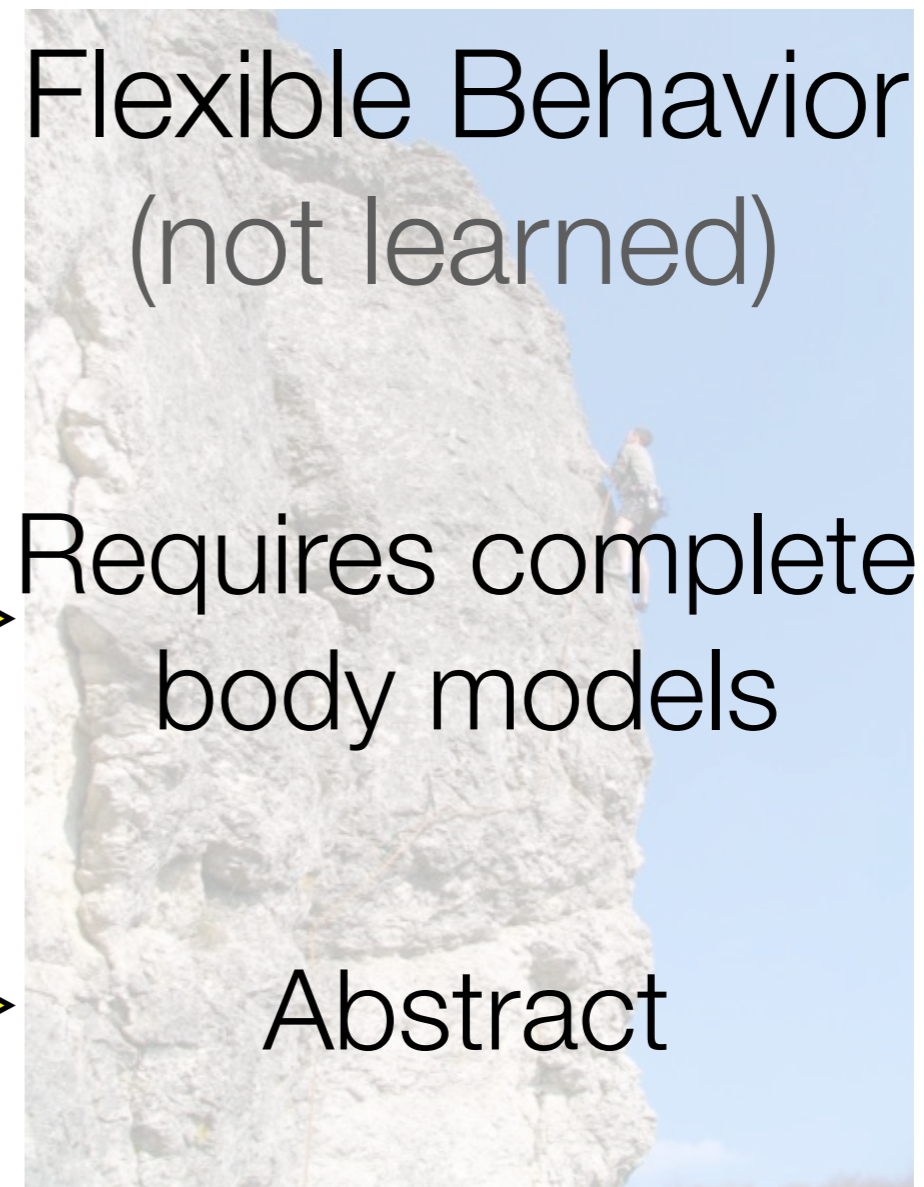
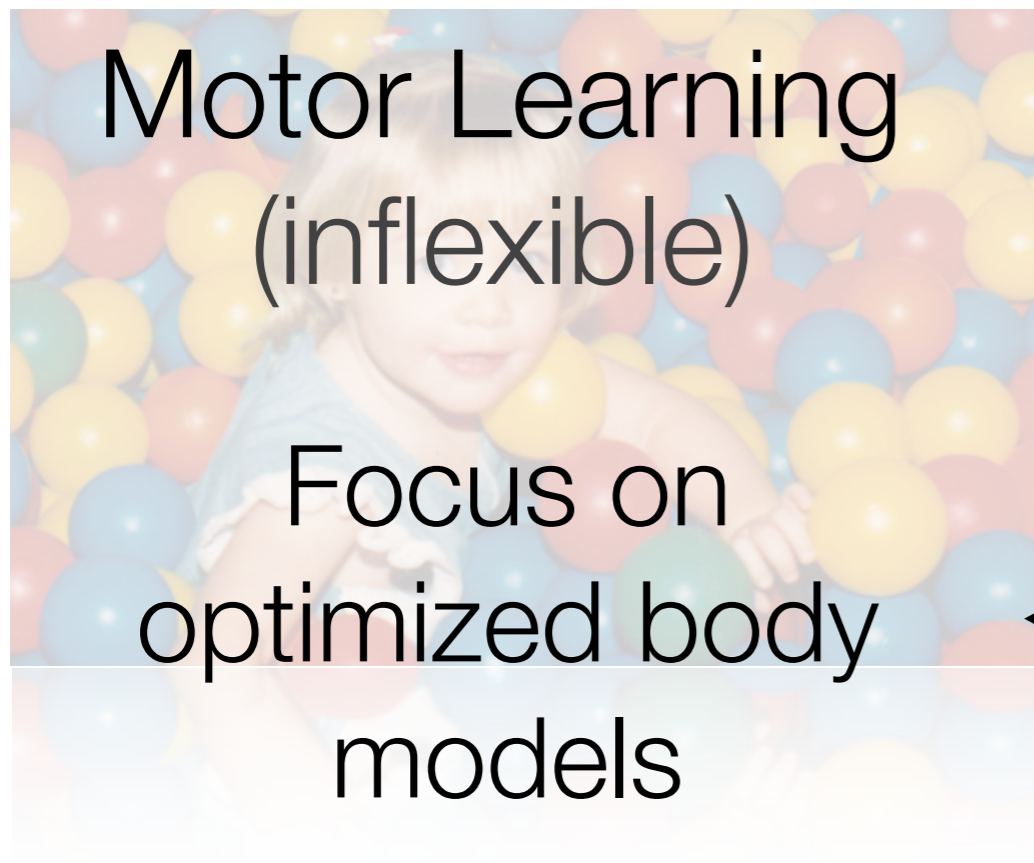


Control



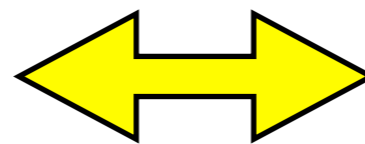
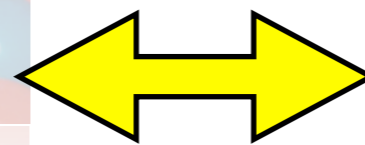
select best action
task dependently

Why don't they go together?



Grounded

Abstract



Merging Motor Learning and Flexible Behavior

Motor Learning
(inflexible)

unsupervised
learning of complete
sensorimotor model

Grounded

Flexible Behavior
(not learned)

Rely on complete
body models

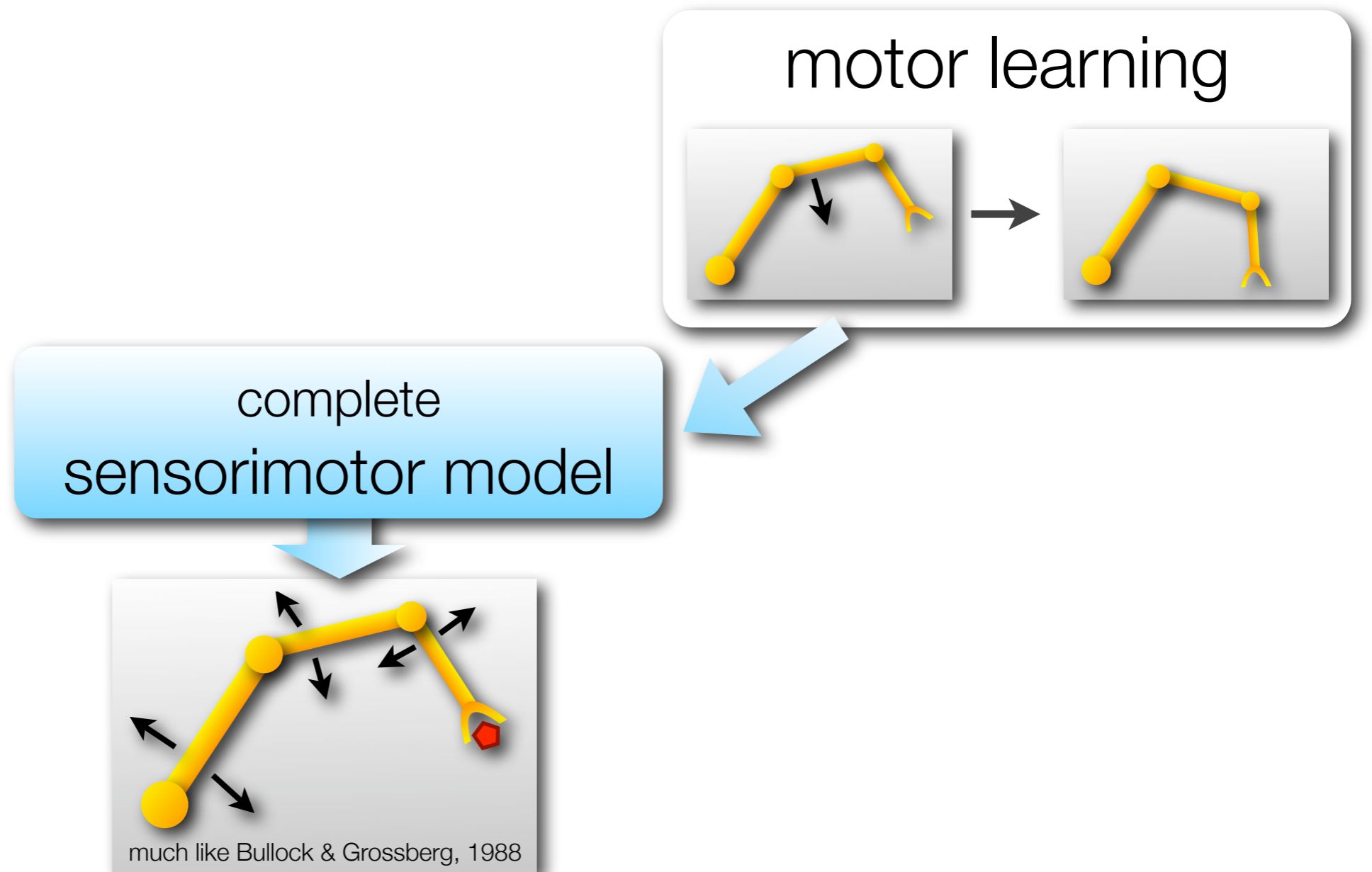
Abstract

SURE_REACH

Sensorimotor **U**n-supervised **R**edundancy **R**esolving **A**rchitecture

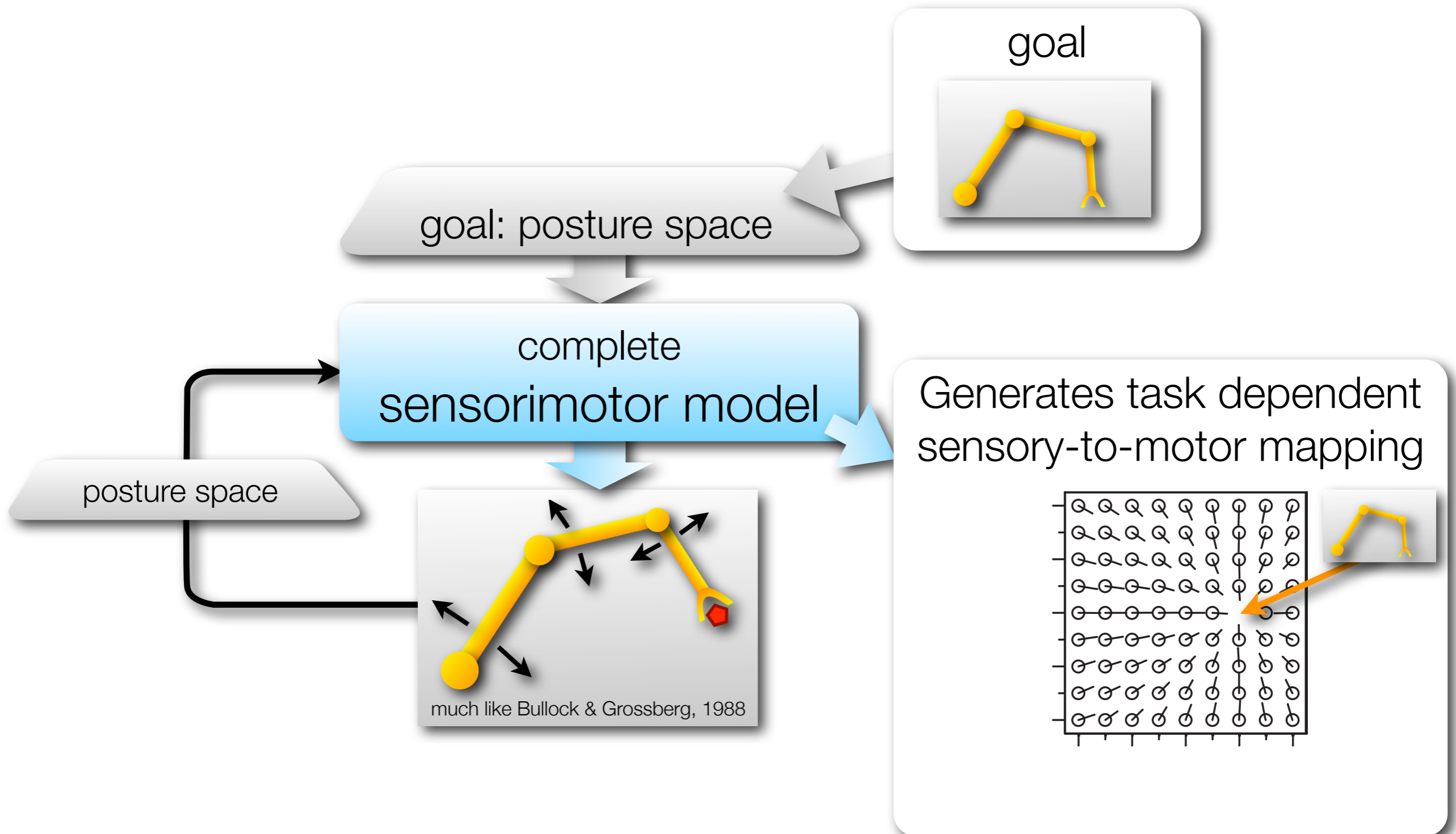
The SURE_REACH Approach

Acquiring a complete sensorimotor model



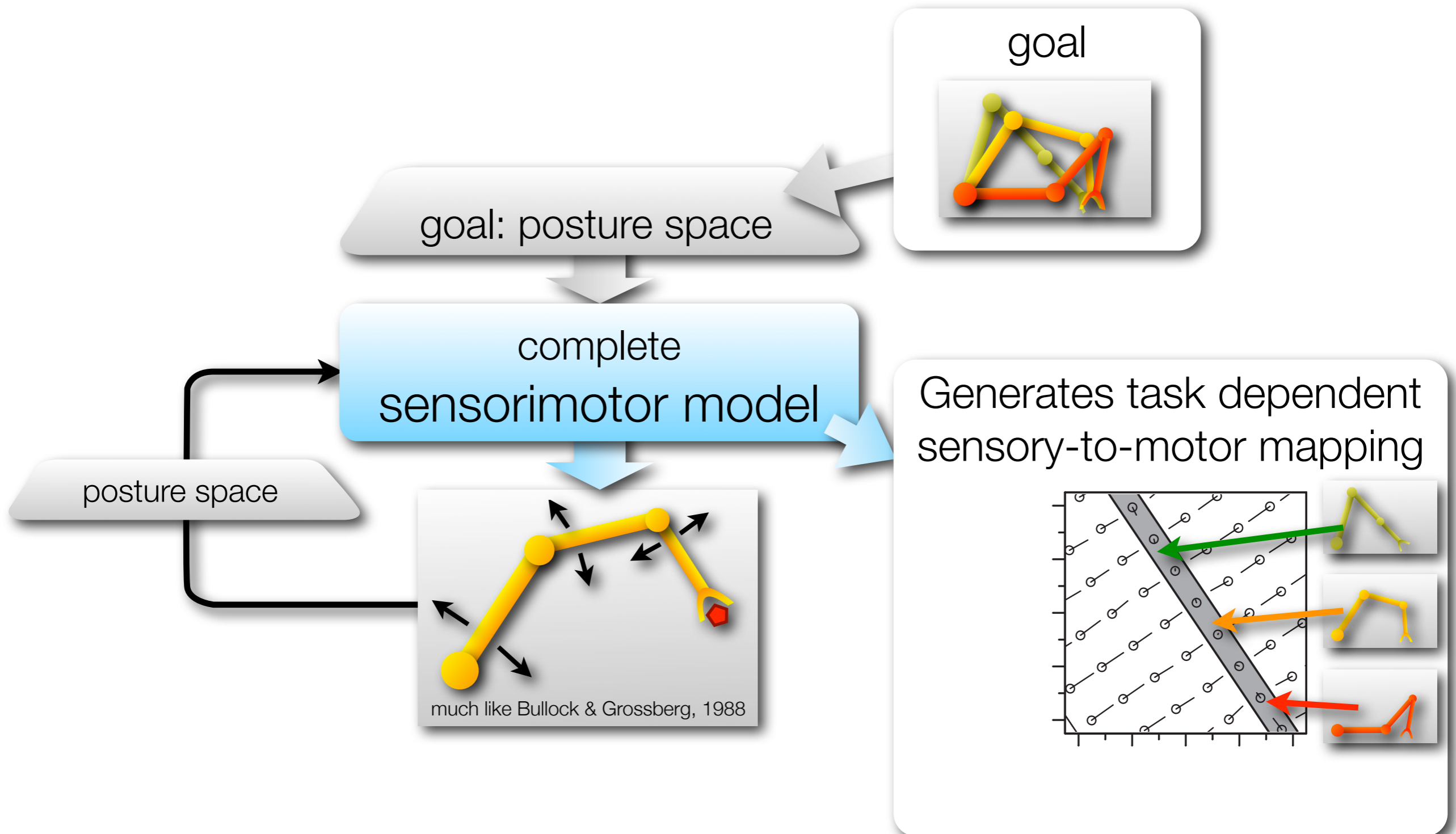
The SURE_REACH Approach

Motor control



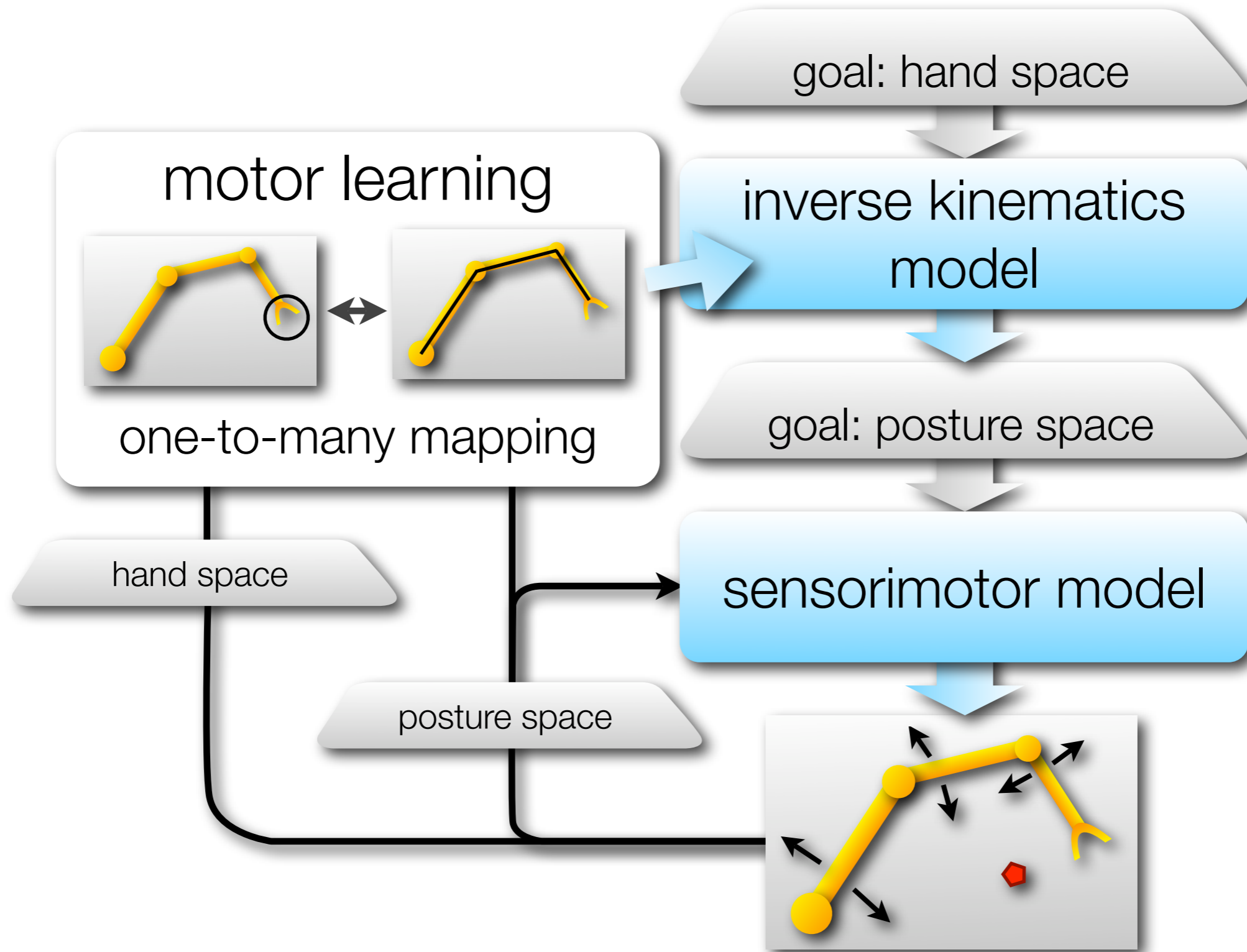
The SURE_REACH Approach

Flexible goal representations



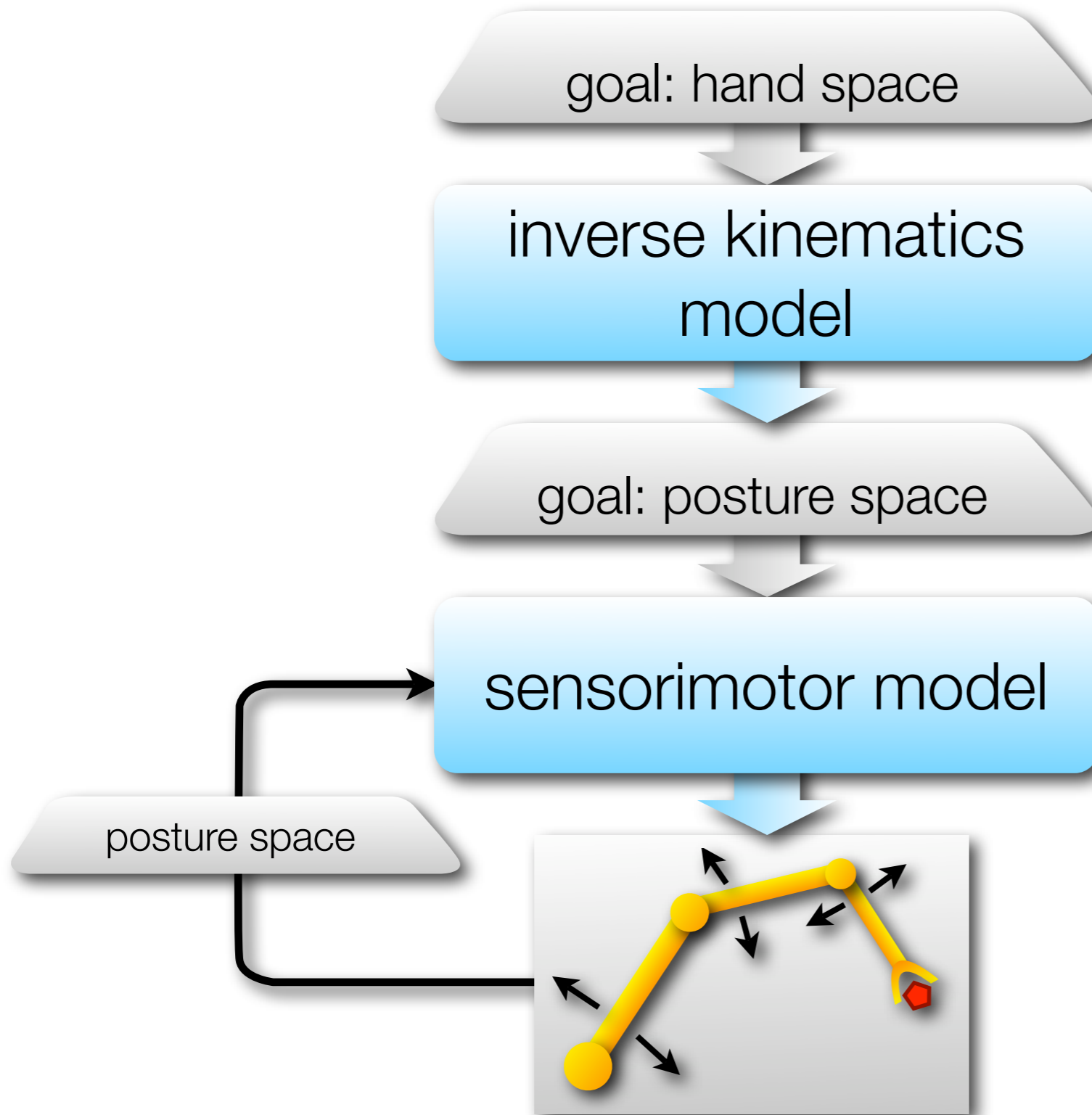
The SURE_REACH Approach

Acquiring a complete inverse kinematics model



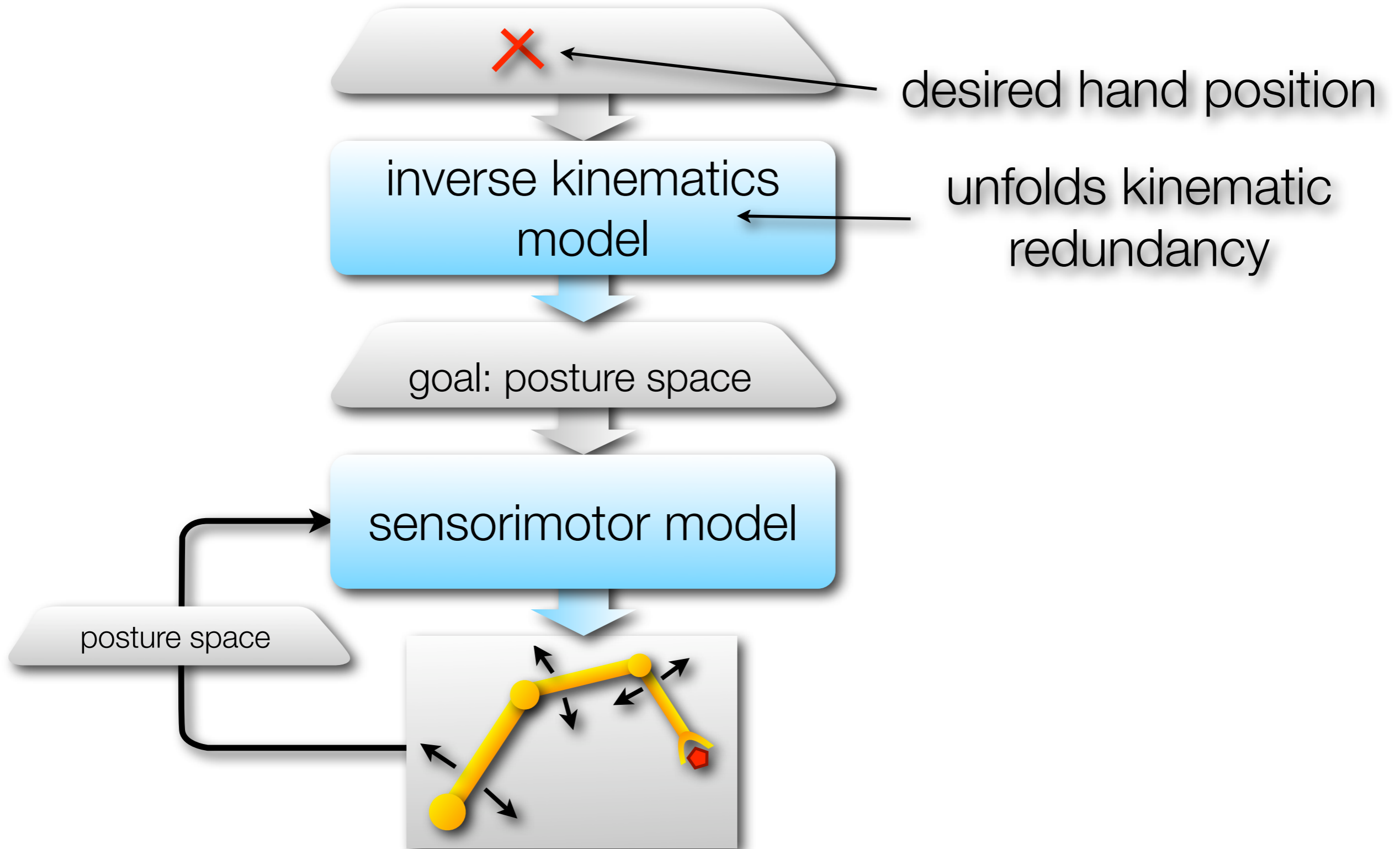
The SURE_REACH Approach

Motor control



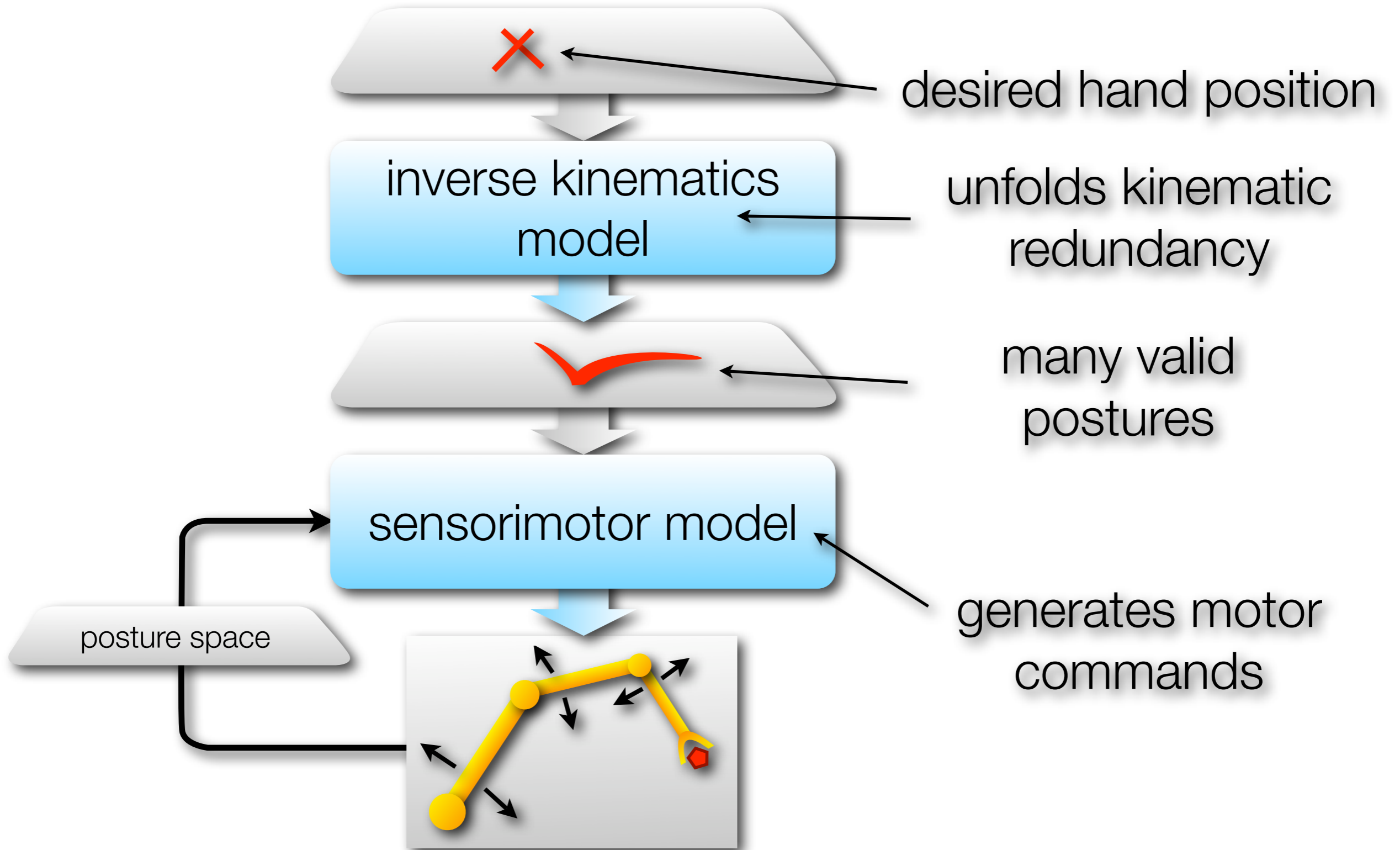
The SURE_REACH Approach

Motor control

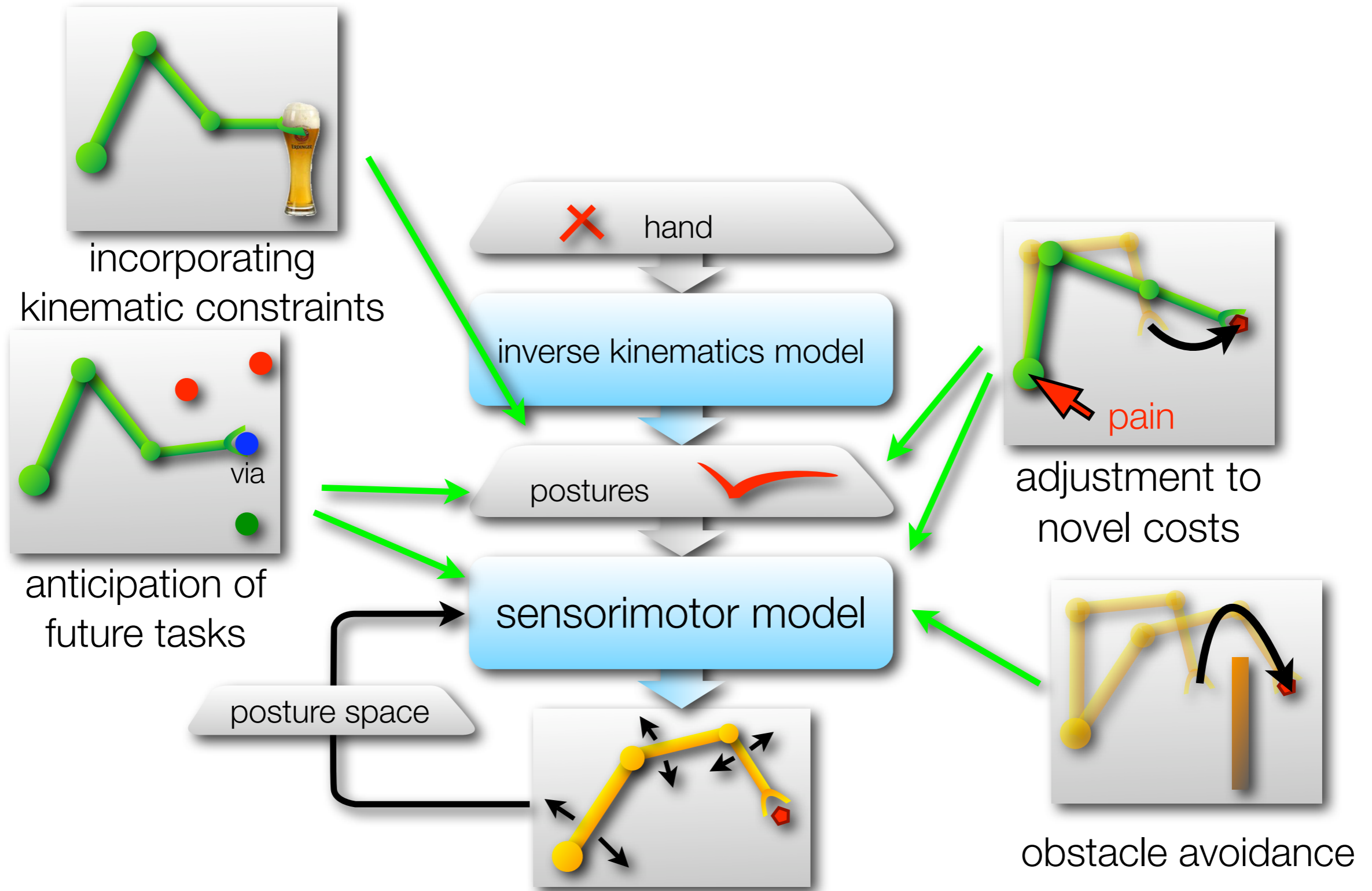


The SURE_REACH Approach

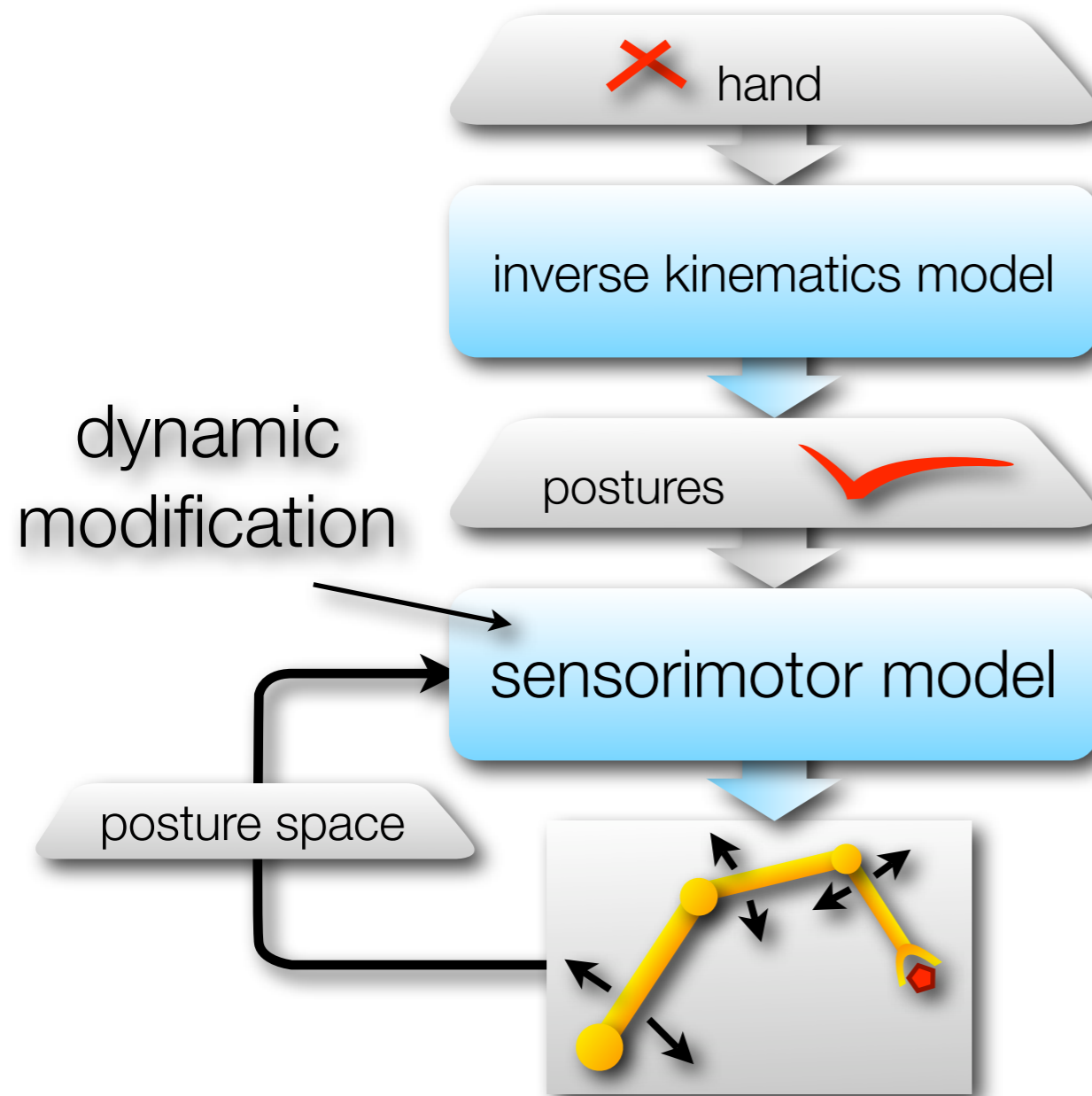
Motor control



Modularity enables Flexible Behavior

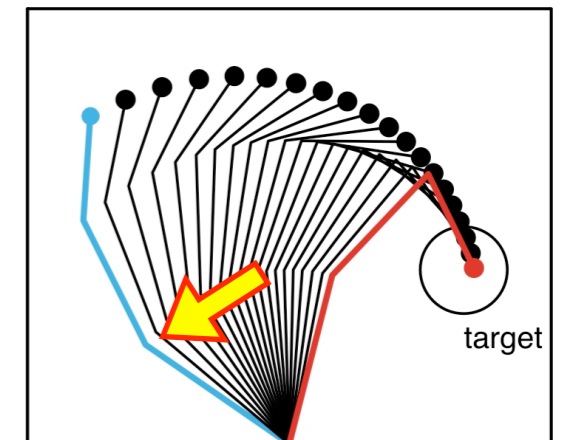
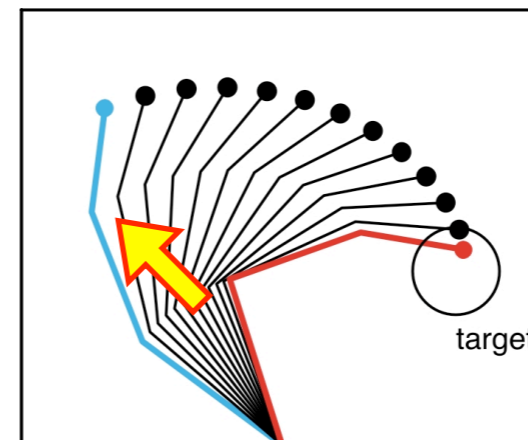
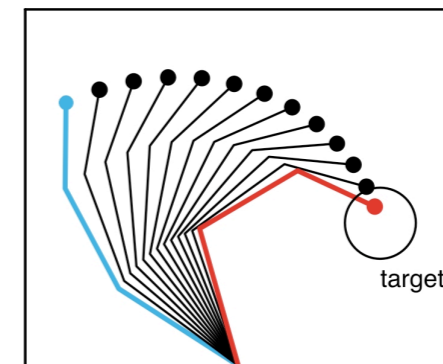


Example: Novel Optimality Criteria



Task:
changed movement costs

Results:



Psychological and Neurophysiological Relevance

- ▶ Psychology

 - ▶ Temporal aspects of motor control during learning

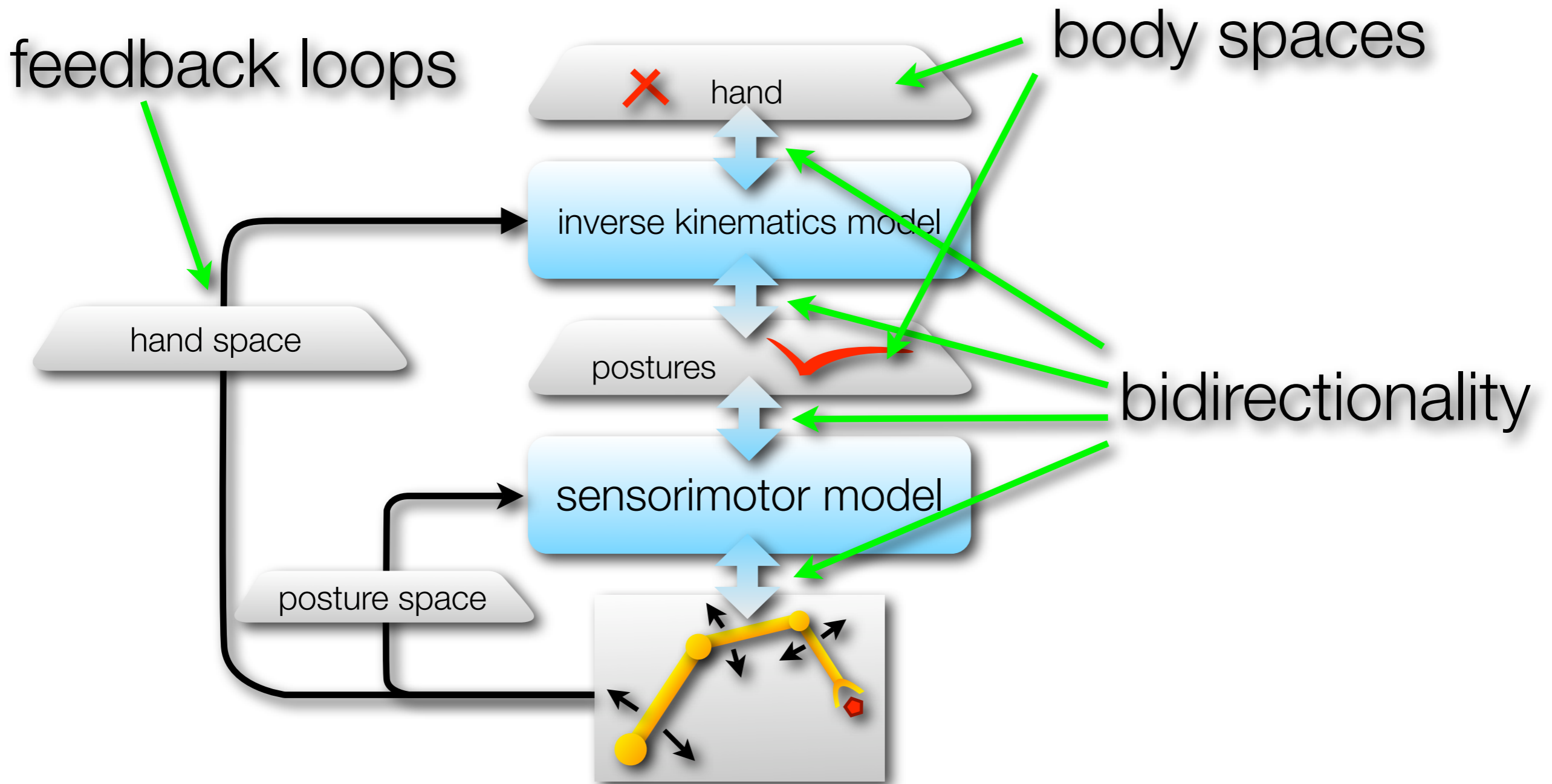
 - ▶ Priming effects

- ▶ Neurophysiology

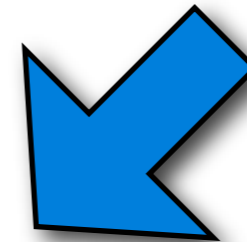
 - ▶ Population encoding

 - ▶ Synaptic learning rules

Outlook



Conclusion



flexible behavior

SURE_REACH

Exploiting Redundancy for Flexible Behavior: Unsupervised Learning in a Modular Sensorimotor Control Architecture (submitted).

Thank you for your attention

- ▶ email: oliver.herbort@psychologie.uni-wuerzburg.de
- ▶ url: <http://www.psychologie.uni-wuerzburg.de/i3pages/>

- ▶ Herbort, O., Butz, M. V., & Hoffmann, J., (2005). Towards an adaptive hierarchical anticipatory behavioral control system. In C. Castelfranchi, C. Balkenius, M. V. Butz, & A. Ortony (Eds.), *From reactive to anticipatory cognitive embodied systems: Papers from the AAI fall symposium* (p. 83-90), Menlo Park, CA: AAI Press.

- ▶ Butz, M.V., Herbort, O., & Hoffmann, J., (submitted). Exploiting Redundancy for Flexible Behavior: Unsupervised Learning in a Modular Sensorimotor Control Architecture.