

# HUMAN MOTOR CONTROL

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# introduction

# WHAT IS (HUMAN) MOTOR CONTROL?



## **Action (force, displacement)**

Body: bones, muscles, tendons, skin  
Nervous system (sensory, motor, ...)

How the nervous system is organized so that the many individual muscles and joints become coordinated to produce an action?

## **Decision, planning, anticipation, preparation**

All what occur before an action  
**Not in the scope**

# WHY STUDY MOTOR CONTROL?

- **Build tools to investigate or treat diseases affecting the sensorimotor system**
- **Develop computer algorithms and hardware that can be incorporated in products designed to assist in the tasks of daily living**



# HOW TO STUDY MOTOR CONTROL?

- **Experimental**

- observe, measure, quantify
- search for «regular» patterns

*psychophysics, neurophysiology, brain imaging, neuropsychology*

- **Computational**

- what is the problem to be solved?
- reveals the nature of constraints that the physical world puts on the solution of the problem

# CLASSIFICATION OF ACTION

- **Genetically defined / Learned (skills)**

e.g. reflex vs industrial, artistic and athletic skills

- **Reflex / Voluntary**

- **Discrete / Continuous (rhythmic)**

- **Posture / force / displacement**

- **Repertoire**

e.g. walking, running, flying, reaching, grasping, speaking, singing, writing, drawing, looking, smiling, swimming, standing, ...

! It is unclear whether a single set of principles can account of all classes of actions

# ACTION AND THE ENVIRONMENT

- **An action occurs in a environment**
- **The action cannot be isolated from its environment**
- **The environment provides goals, instructions, cues, interactions, ...**
- **The action modifies the environment**

# ACTION AND THE BODY

- **The body grows during development, changes with training and aging, and is modified by injuries and diseases**

short-term (fatigue)

mid-term (muscle tear)

long-term (amputation)

*motor development*

*motor learning*

- **Prosthetics**

*augmentation*



U.S. Bionic Knee and Ankle Prosthesis  
Pioneer **Hugh Herr** Named European  
Inventor Award 2016 Finalist

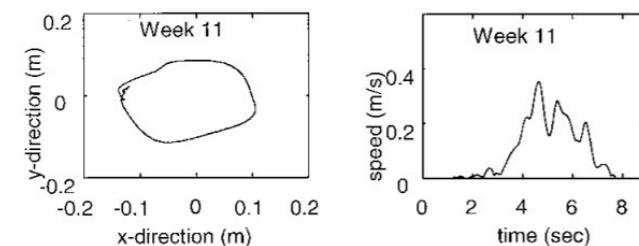
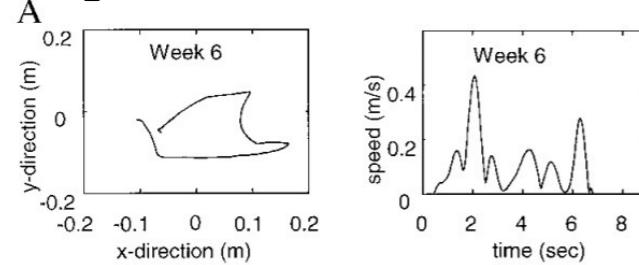


# ACTION AND THE NERVOUS SYSTEM

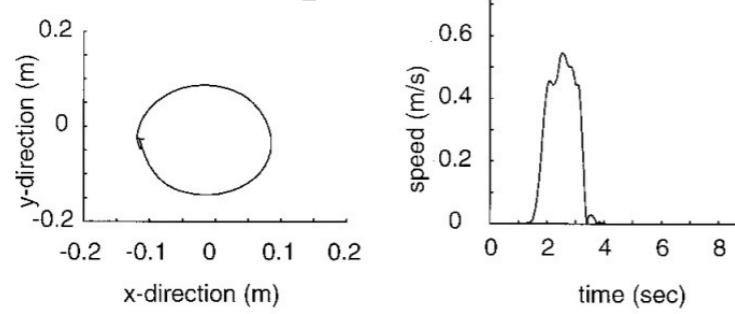
**Acute and chronic changes in neural organization lead to motor disorders**

e.g. **stroke**, Parkinson disease, ...

**patient**



**healthy**



*rehabilitation*

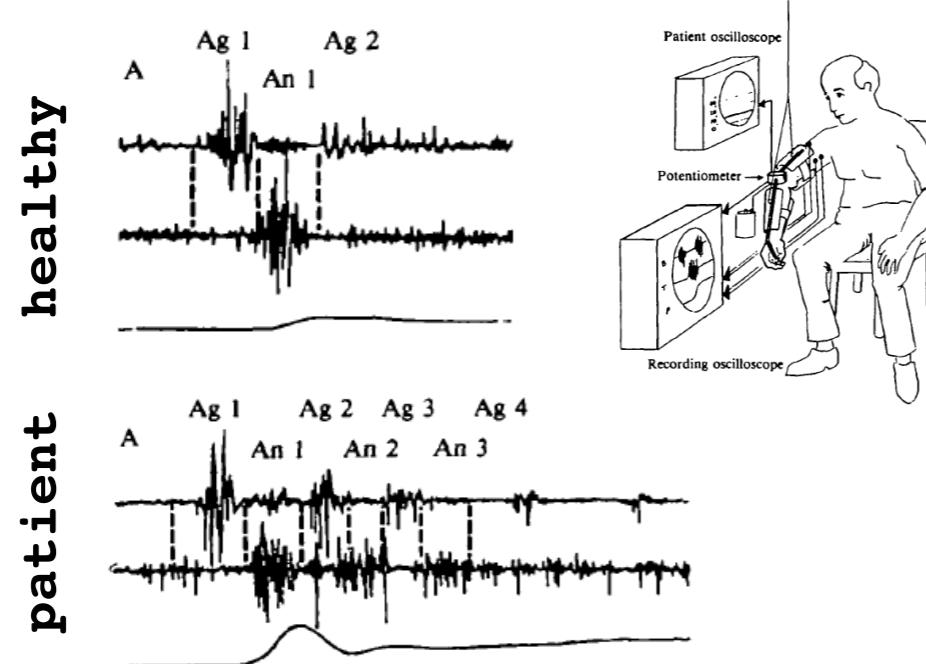


MIT-Manus

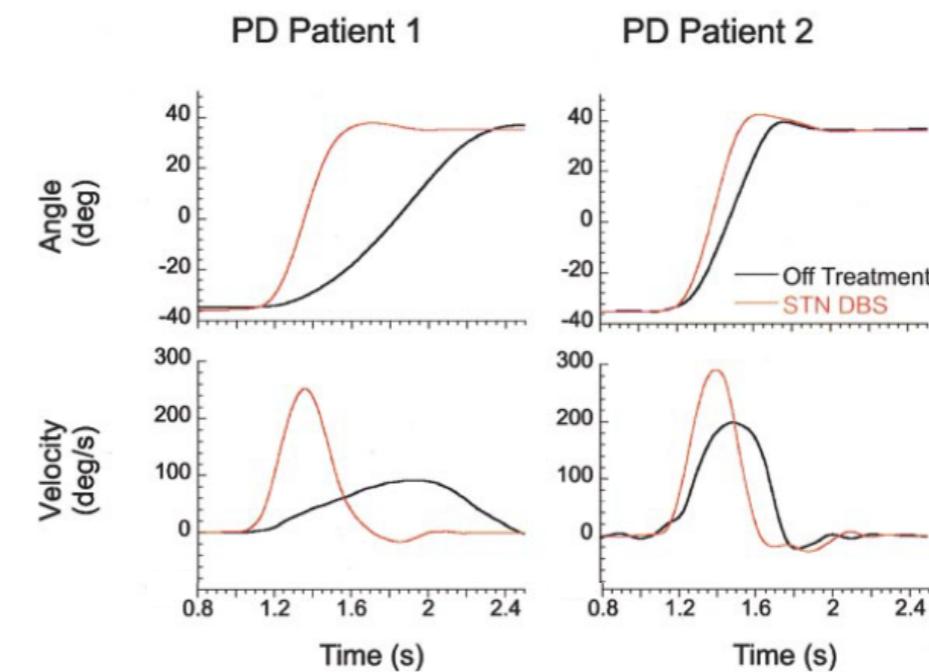
# ACTION AND THE NERVOUS SYSTEM

## Acute and chronic changes in neural organization lead to motor disorders

e.g. stroke, Parkinson disease, ...



*treatment*



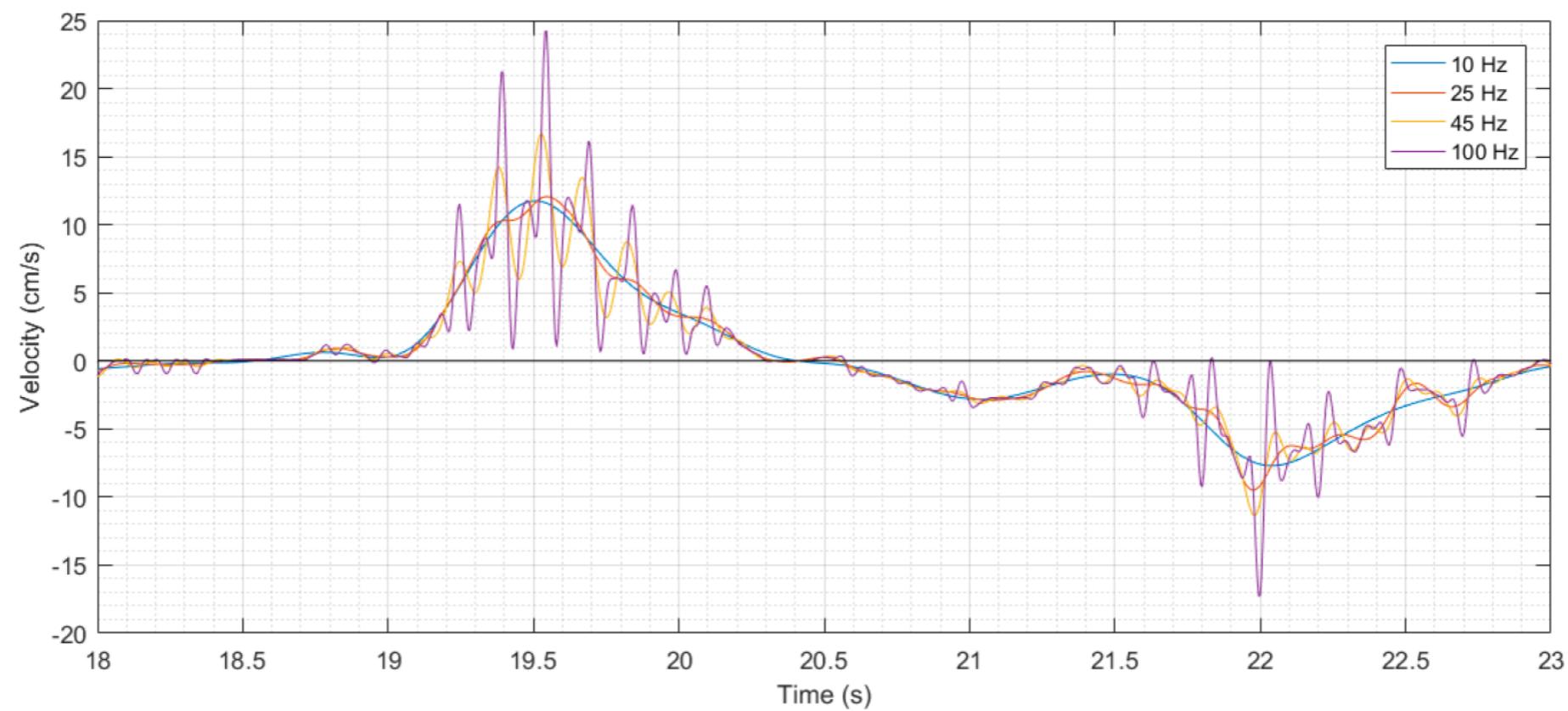
DBS = deep brain stimulation

— Hallett & Khoshbin, 1980, *Brain* 103:301

— Vaillancourt et al., 2004, *Brain* 127:491

# DISCLAIMER

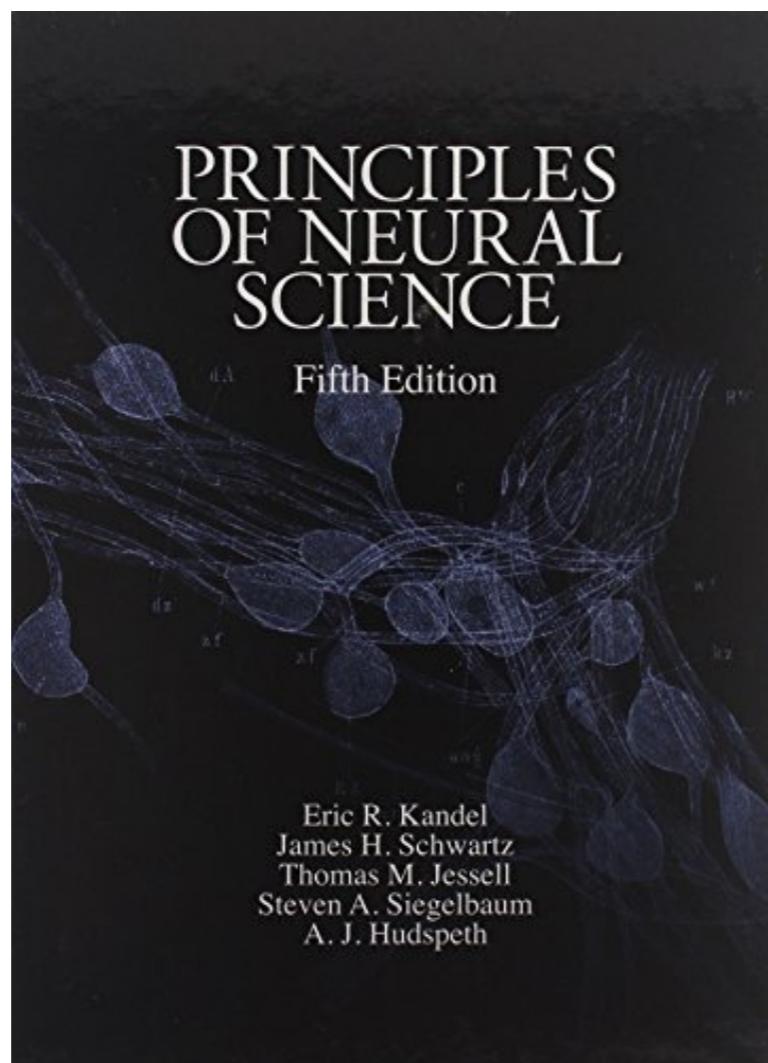
**Do not believe what you see**  
quite any property in motor control depends  
on data processing (filtering)



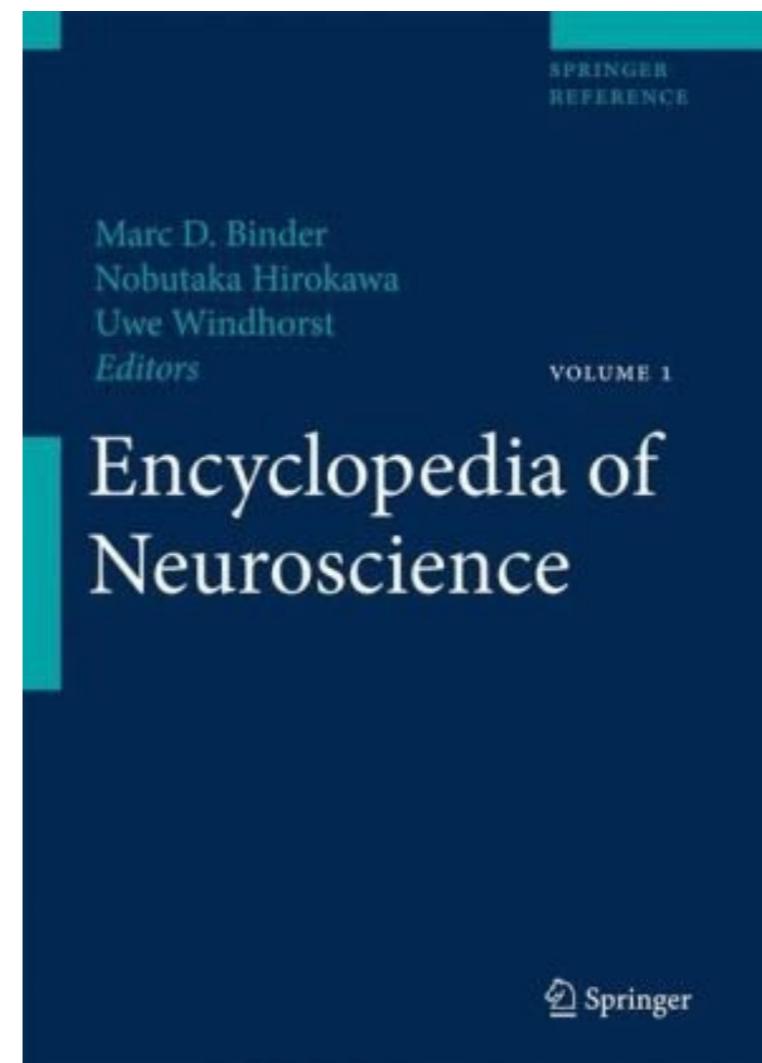
# NOT IN THE SCOPE

- **Motor development/training/adaptation/learning**
- **Motor repertoire**  
posture, walking, running, jumping, flying, swimming, throwing, kicking, drawing, writing, keyboarding, speaking, singing, smiling, ...
- **Psychology of movement**  
movement preparation, reaction time, errors, ...
- **Methods for the study of movements**
- **History of motor control**

# CREDITS



Kandel ER, Schwartz JH, Jessell TM, Siegelbaum SA, Hudspeth AJ, eds (2013) Principles of Neural Science, 5th ed. New York, NY: McGraw-Hill Professional.



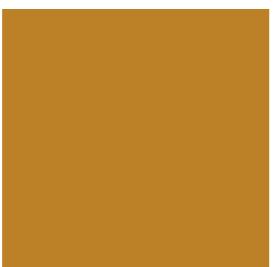
Binder MD, Hirokawa N, Windhorst U, eds (2008) Encyclopedia of Neuroscience. Berlin: Springer.

# OUTLINE



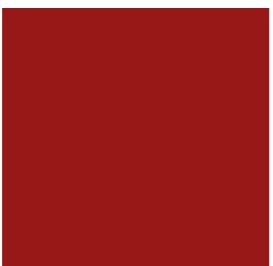
## **I. The organization of action**

Main vocabulary



## **2. Computational motor control**

Main concepts



## **3. Biological motor control**

Basic introduction



## **4. Models and theories**

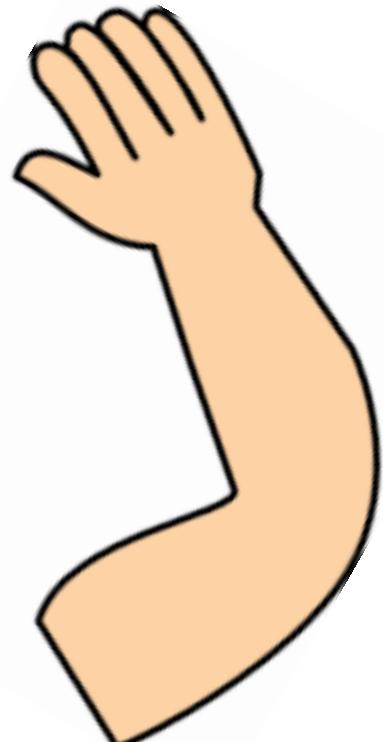
Main ideas and debates



# **I. The organization of action**

## EXAMPLE - TAKE OF COFFEE

- Where is my body? Where is the bar?
- How to reach the bar?
- Where is the cup? Where is my arm?
- How to reach the cup?
- How to calculate the motor command?
- How to interact with the environment?
- Is the command correct?
- How to do better at the next trial?



# WHERE IS THE CUP? WHERE IS MY ARM?

- **Modalities**

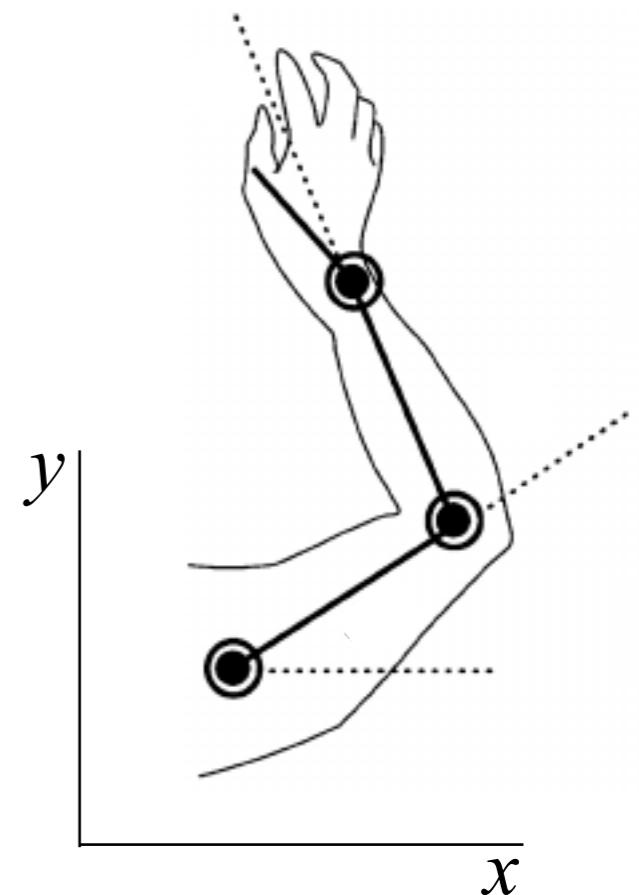
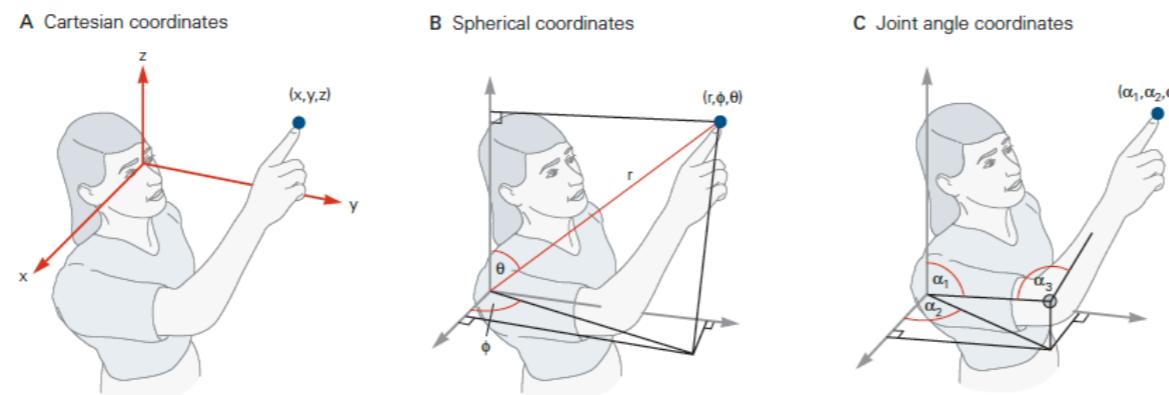
vision, proprioception, ... / multimodal integration



- **Reference frames**

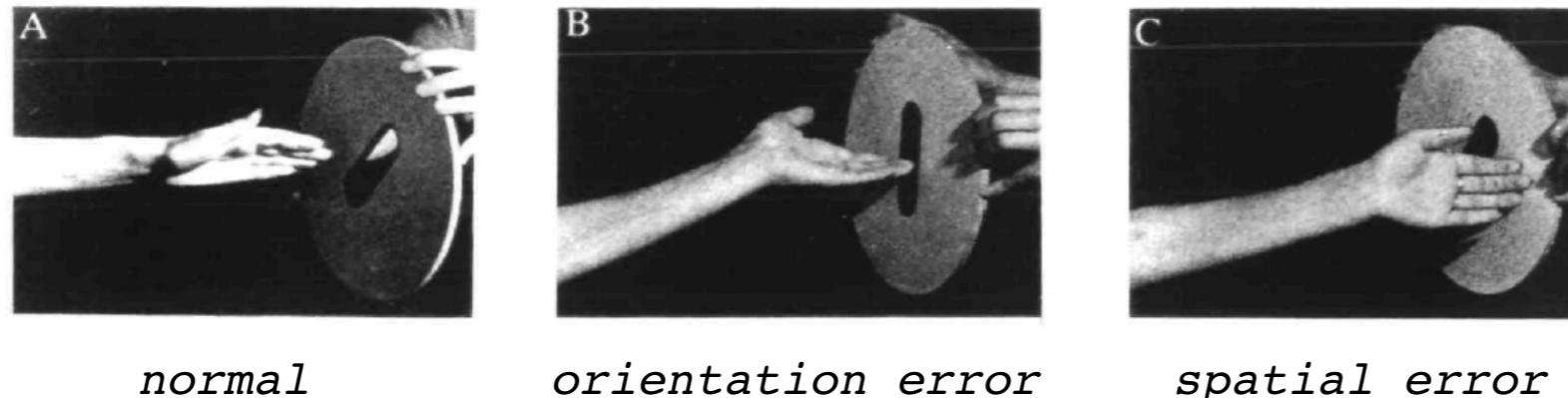
- target position: in a fixed frame (earth), but perceived in a moving frame (body)
- arm position: in body-related frame

In which frame is the movement represented?  
What kind of coordinate systems are used?

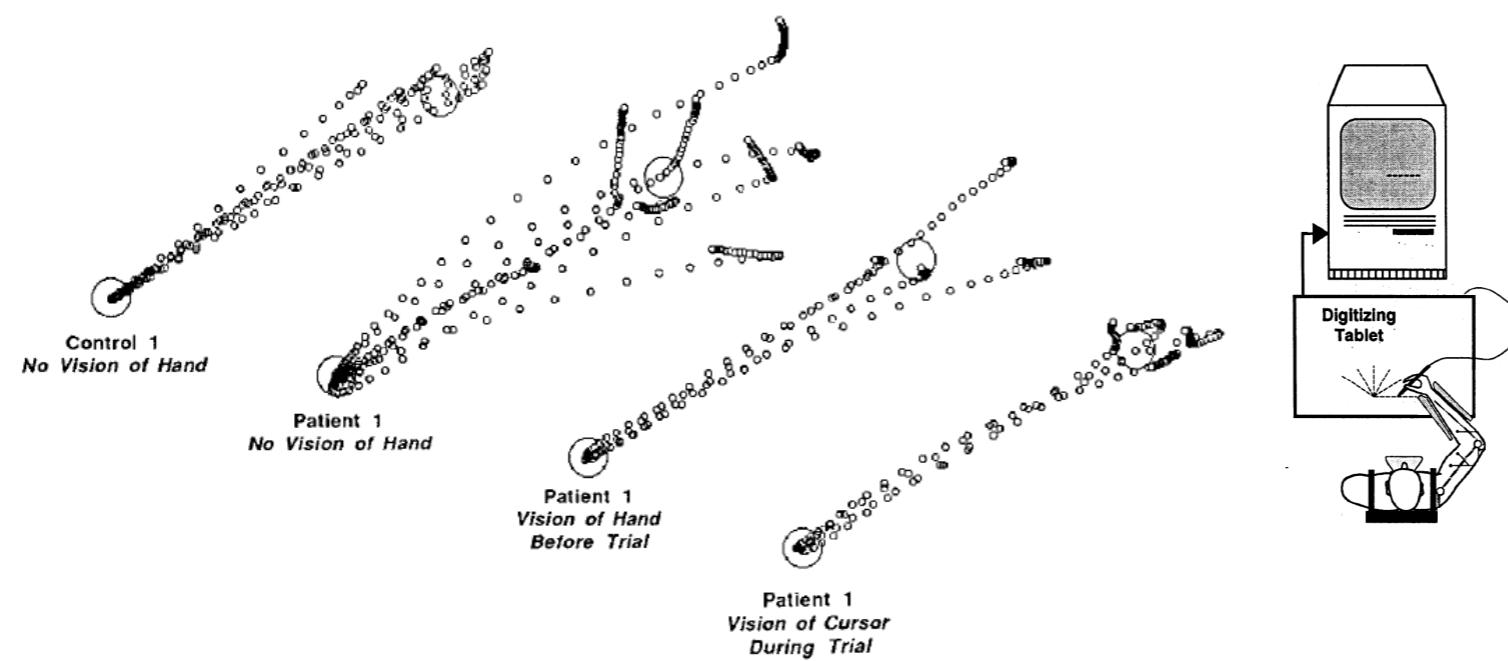


# WHERE IS THE CUP? WHERE IS MY ARM?

optic ataxia (visuomotor coordination)

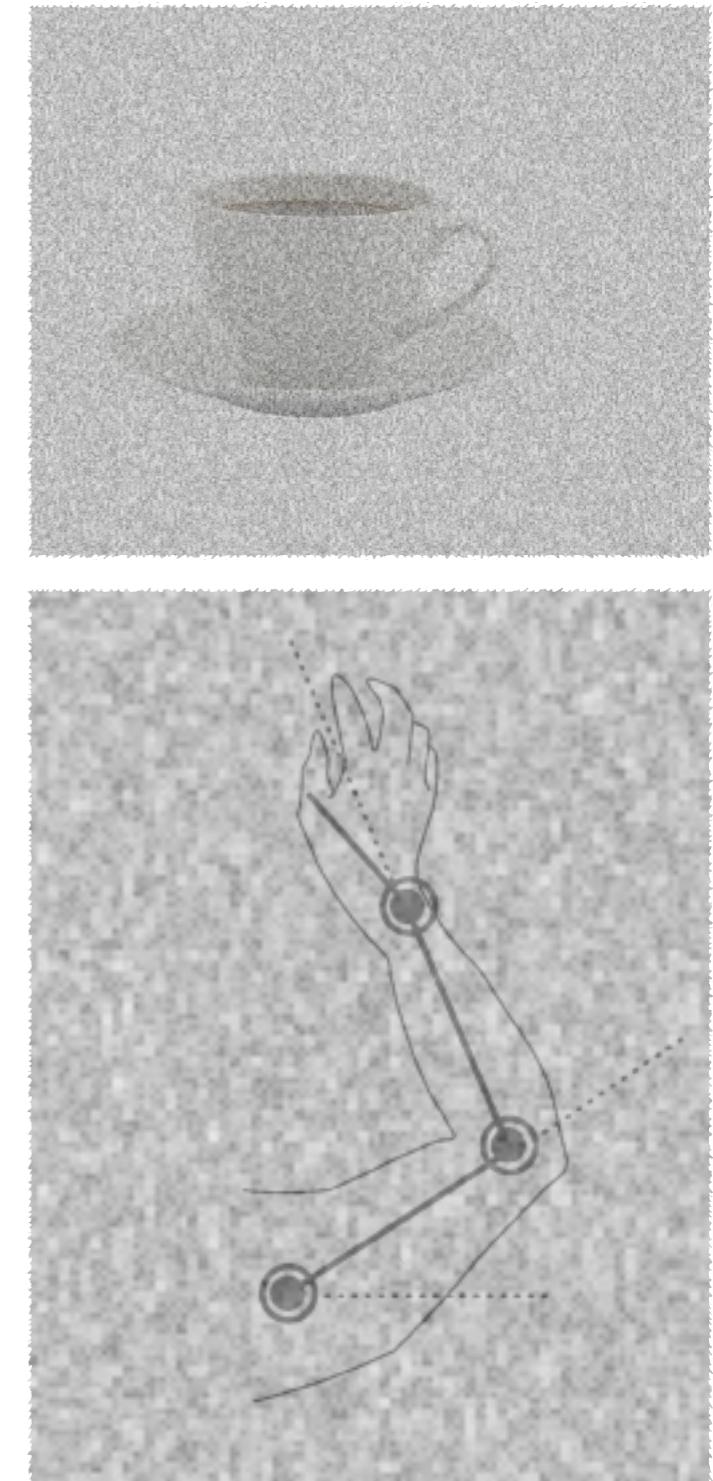


deafferentation (loss of proprioception)



uncertainty  
noise

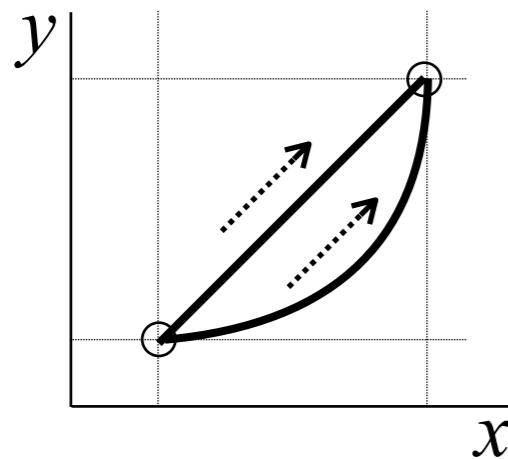
— Perenin & Vighetto, 1988, *Brain* 111:643  
— Ghez et al., 1990, *CSHSQB* 55:837



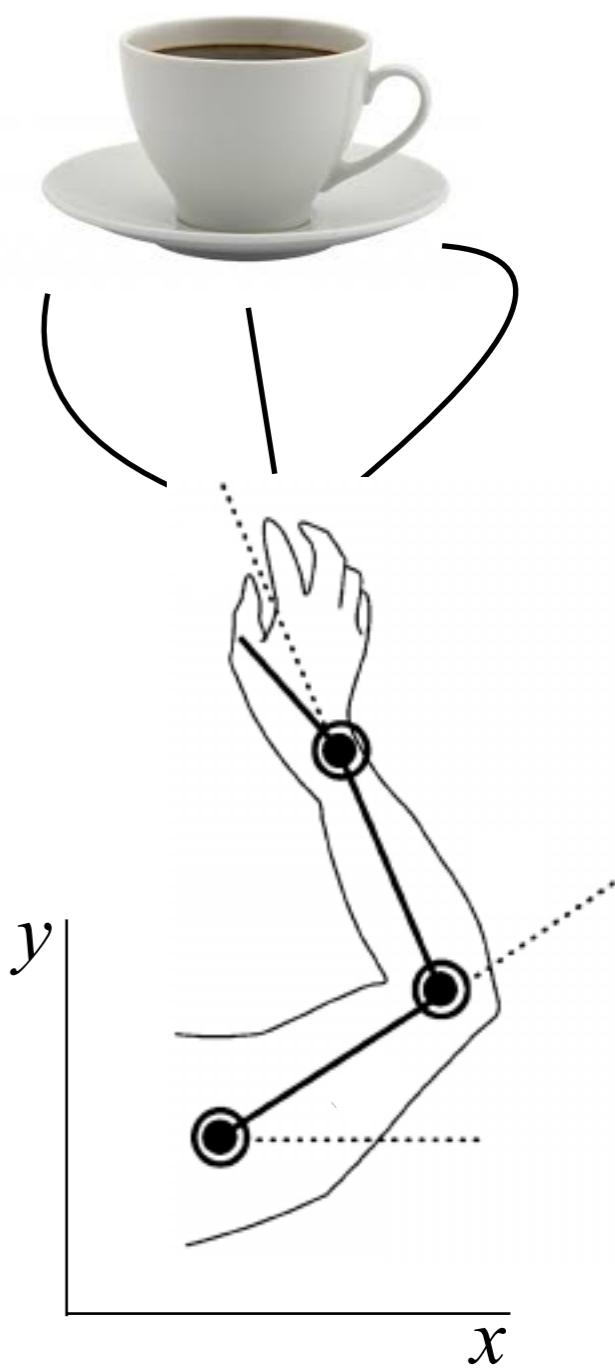
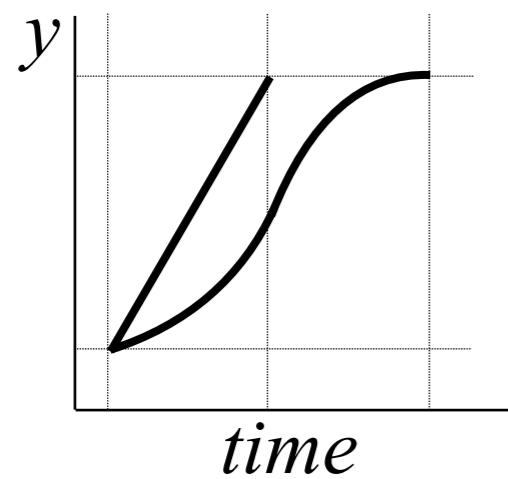
# HOW TO REACH THE CUP?

- **Choice of a *task-space* trajectory**  
path, time course along the path

{ hand, end-point, end-effector trajectory }

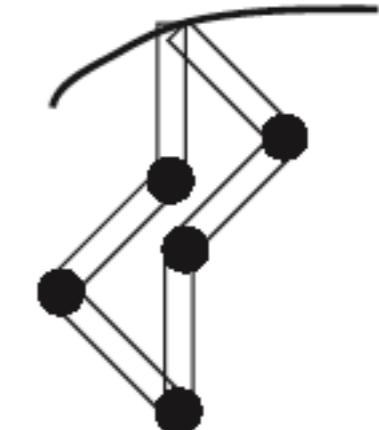


$$f(x, y) = 0$$



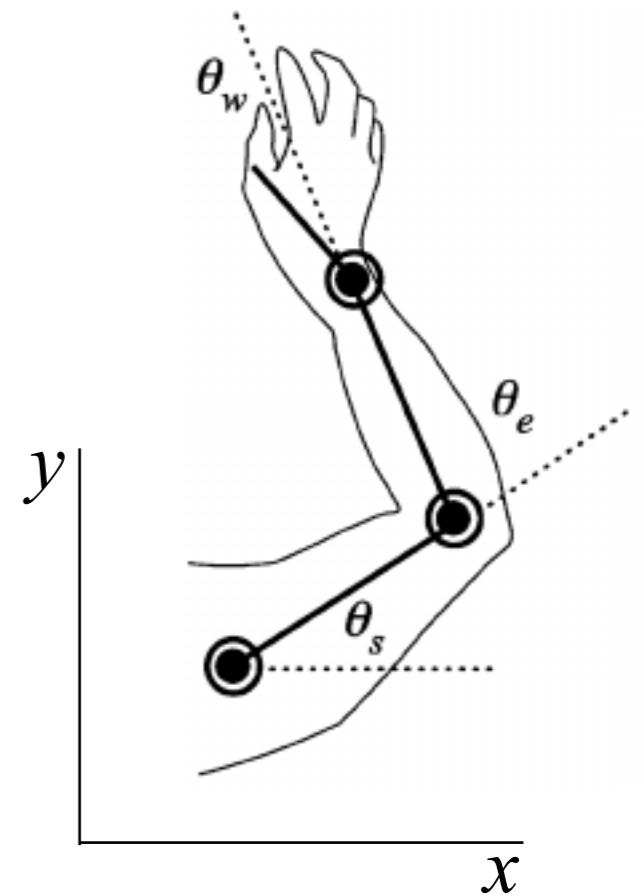
# HOW TO REACH THE CUP?

- **Choice of a *body-space* trajectory**
  - DOF = degrees of freedom  
*« the least number of independent coordinates required to specify the position of the system elements without violating any geometrical constraints »*
  - kinematic redundancy  
number of DOF > *task-space* dimension



- **Kinematics**
  - coordinate transformation
  - inverse kinematics is an ill-posed problem

$$\begin{cases} x = L_s \cos \theta_s + L_e \cos(\theta_s + \theta_e) + L_w \cos(\theta_s + \theta_e + \theta_w) \\ y = L_s \sin \theta_s + L_e \sin(\theta_s + \theta_e) + L_w \sin(\theta_s + \theta_e + \theta_w) \end{cases}$$



degrees-of-freedom problem  
redundancy  
nonlinearity

— Saltzman, 1979, J Math Psychol 20:91

# HOW TO CALCULATE THE COMMAND?

- **Joint torques**

to produce a desired *body-space* trajectory



- **Dynamics**

direct/inverse transformation (Newton's law)

$$\tau_s = (I_s + I_e + m_e l_s l_e \cos \theta_e + \frac{m_s l_s^2 + m_e l_e^2}{4} + m_e l_s^2) \ddot{\theta}_s +$$

$$(I_e + \frac{m_e l_e^2}{4} + \frac{m_e l_s l_e}{2} \cos \theta_e) \ddot{\theta}_e -$$

$$\frac{m_e l_s l_e}{2} \dot{\theta}_e^2 \sin \theta_e - m_e l_s l_e \dot{\theta}_s \dot{\theta}_e \sin \theta_e$$

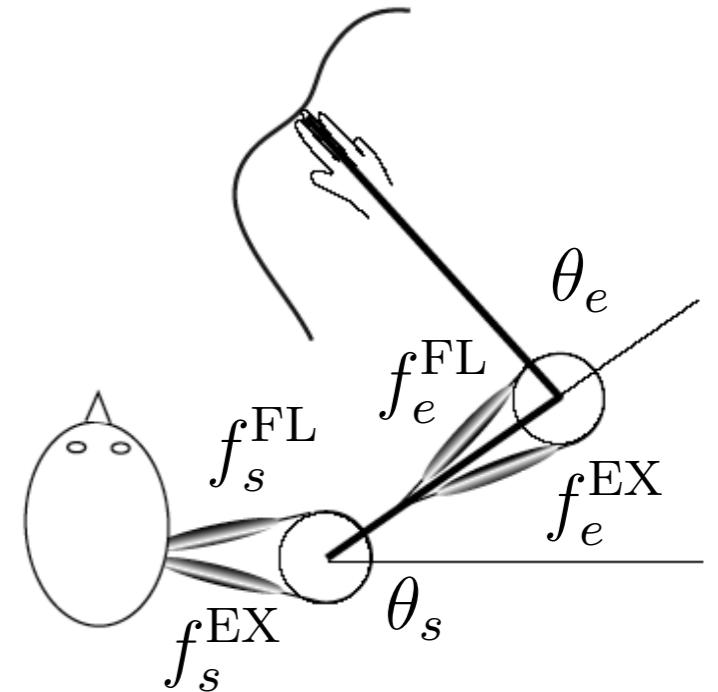
$$\tau_e = (I_e + \frac{m_e l_s l_e}{2} \cos \theta_e + \frac{m_e l_e^2}{4}) \ddot{\theta}_s +$$

$$(I_e + \frac{m_e l_e^2}{4}) \ddot{\theta}_e + \frac{m_e l_s l_e}{2} \dot{\theta}_s^2 \sin \theta_e$$

- **Force distribution**

dynamic redundancy

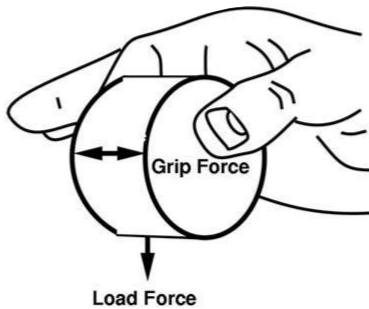
$$\begin{cases} \tau_s = \mu_s^{\text{FL}} f_s^{\text{FL}} - \mu_s^{\text{EX}} f_s^{\text{EX}} \\ \tau_e = \mu_e^{\text{FL}} f_e^{\text{FL}} - \mu_e^{\text{EX}} f_e^{\text{EX}} \end{cases}$$



# HOW TO INTERACT?

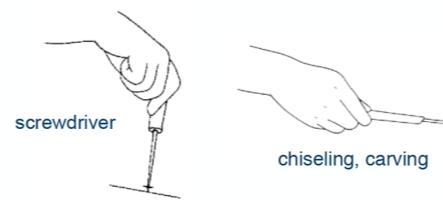
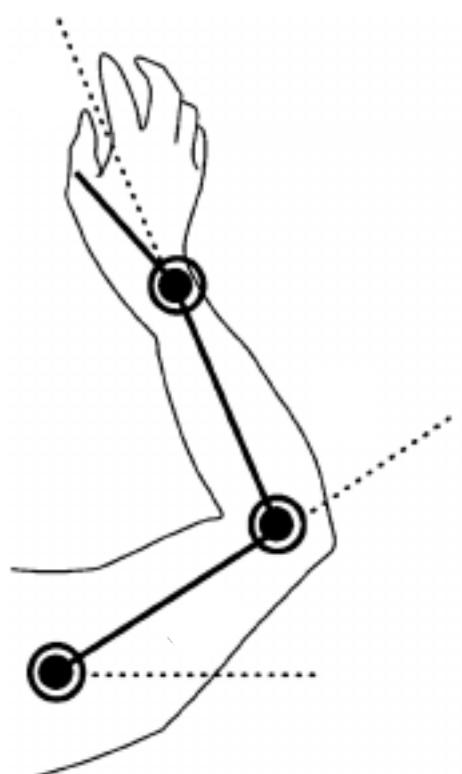
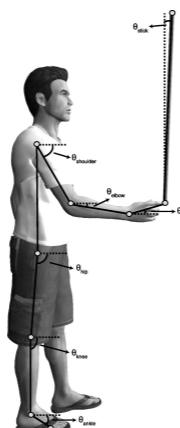
- **Stable**

e.g. firmly grasped, rigid objects



- **Unstable: tool manipulation, posture and gait control**

e.g. using a drill, stick balancing, balancing a tray, riding a bicycle



# IS THE COMMAND CORRECT?

- **Origin of errors**

localization of the target (target/eye, eye/head, ...)

localization of hand and arm (vision or not)

estimation of physical characteristics

fatigue, injury (muscle tear)

perturbations (e.g. the target has been displaced)

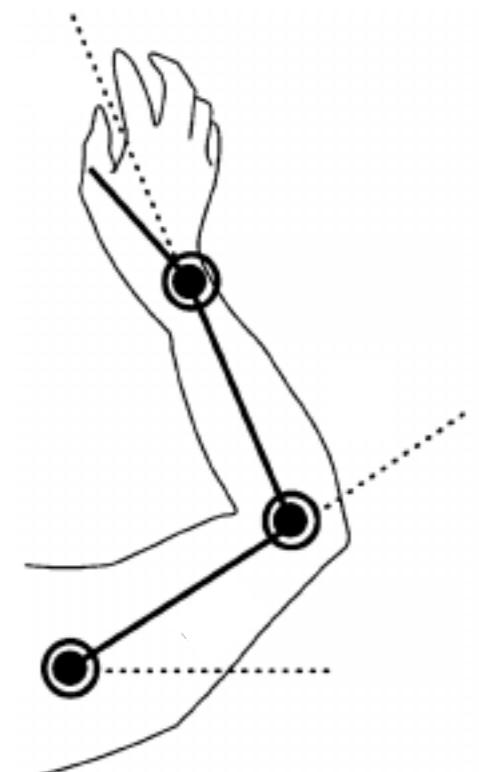
obstacles



- **Solution: feedback**

sensory information, online movement correction

need for flexibility — but: slowness, **time delays**



**sensory information**  
**nonstationarity**  
**perturbation/correction**  
**slowness/time delays**

# HOW TO DO BETTER AT THE NEXT TRIAL?

- **Adaptation, motor learning**

biomechanical interface: tool, telemanipulation

visuomotor transformation (gains, rotations, ...)

dynamic transformation (inertia, viscosity, stiffness)

- **Nature of adaptation and learning**

temporary vs permanent

interferences

learning vs development

- **Error signals**

all or none (success / failure) — quantitative

adaptation  
learning

# SUMMARY

*preparation*

planning

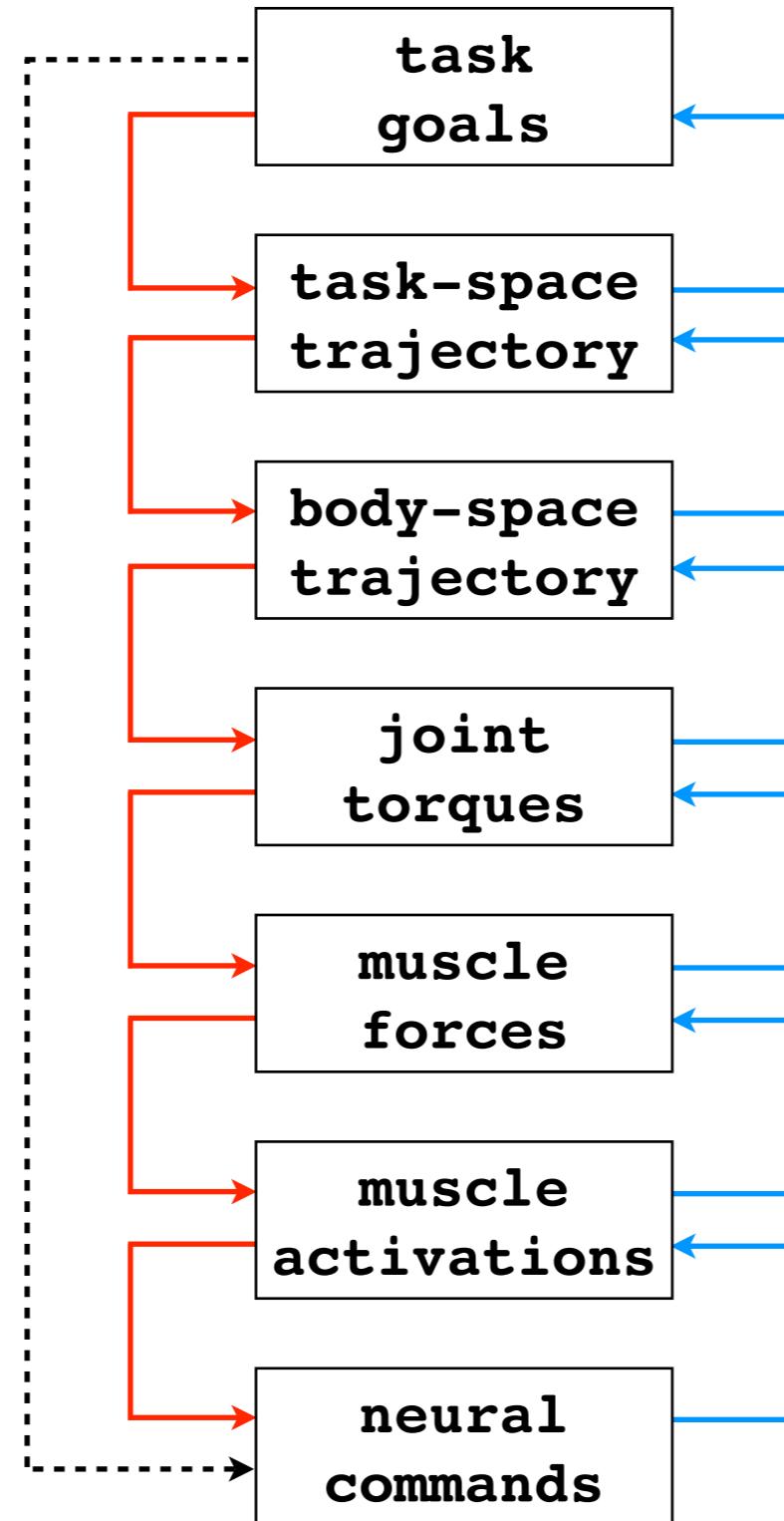
inverse kinematics

inverse dynamics

force distribution

muscle

motoneuron



Is this  
«engineering»  
approach  
appropriate?

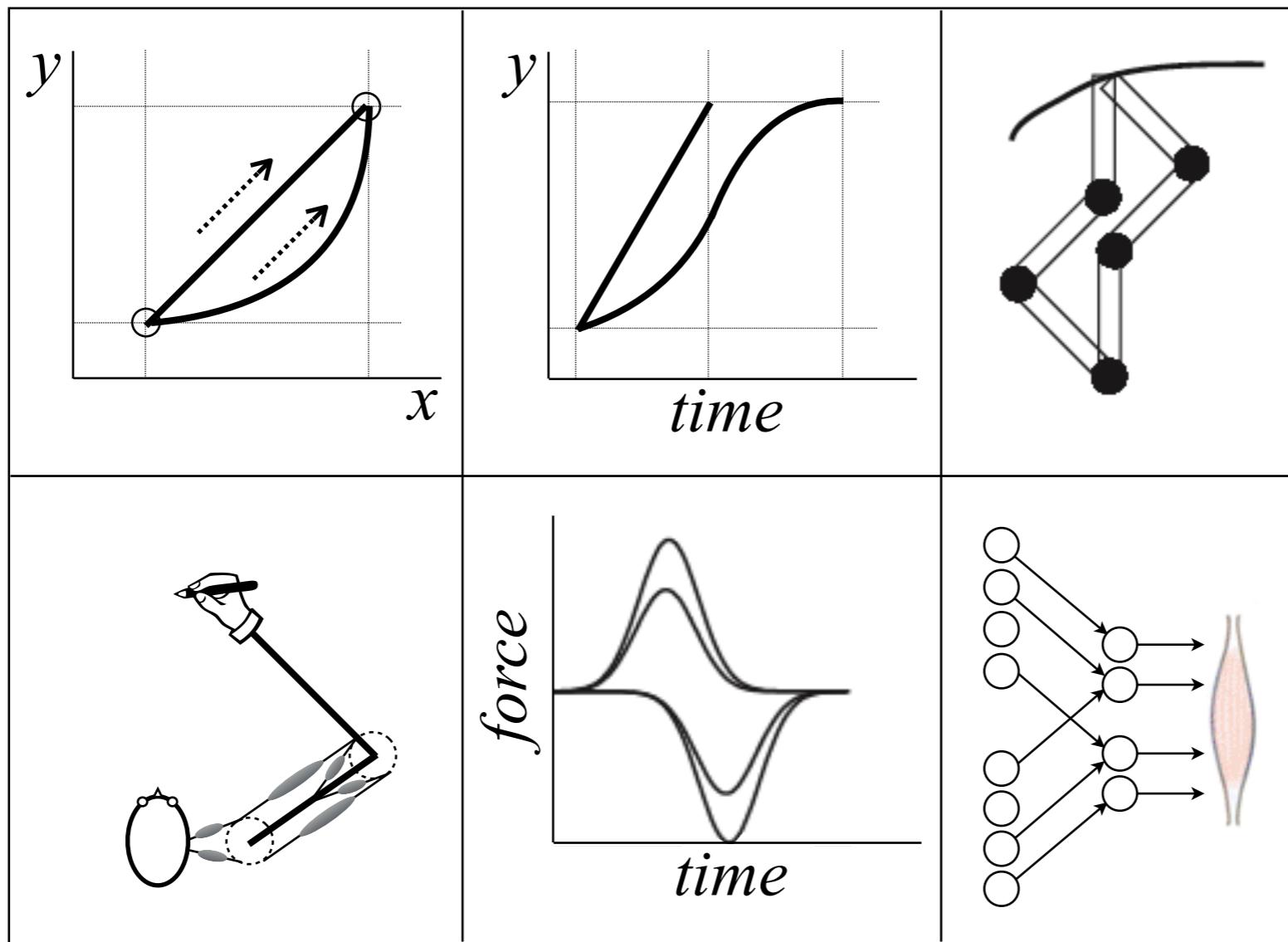
*execution*

# THE DEGREES OF FREEDOM PROBLEM

## Redundancy, nonlinearity

In task space, body space, muscle space, neural space

Problem of **degrees of freedom** (Bernstein's problem)



→ Coordination

example

upper arm

7 dof

26 muscles

100 MUs

10?? neurons

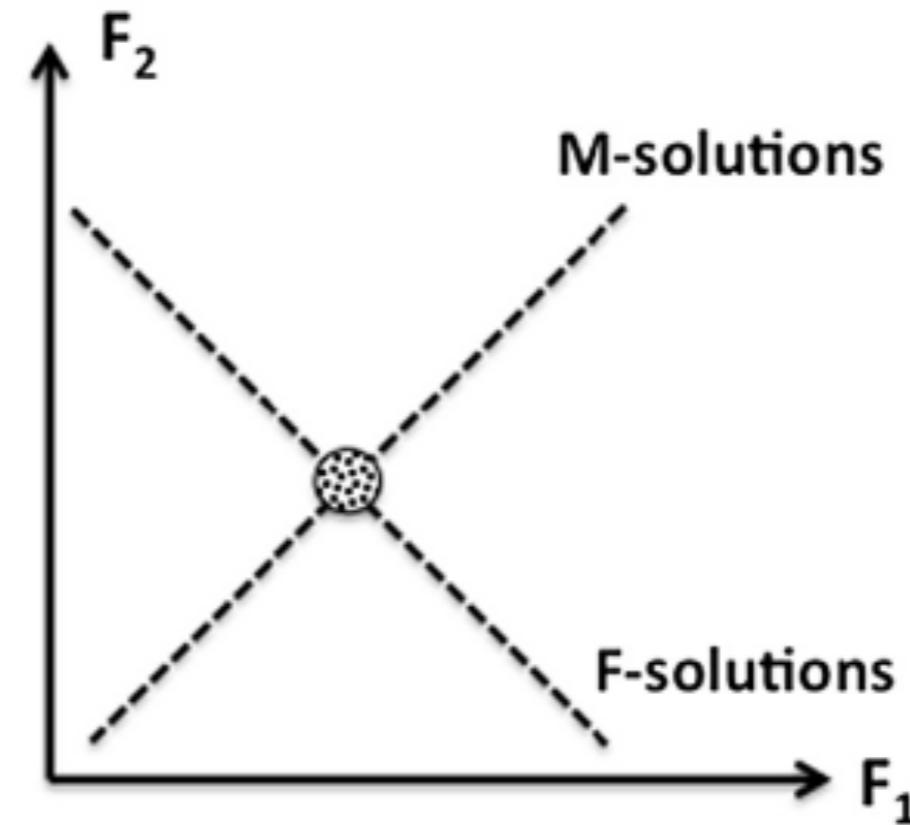
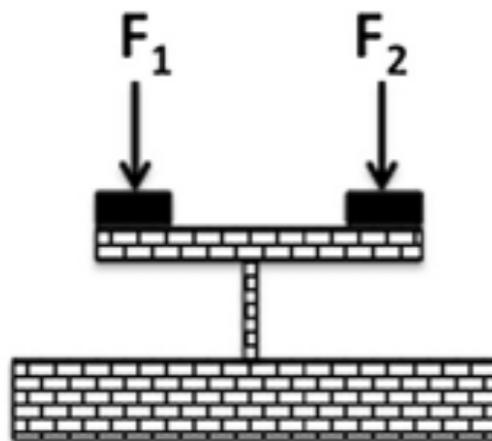


— Bernstein, 1967, *The Co-ordination and Regulation of Movement*, Pergamon

# Redundant problems

$$F_{TOT} = F_1 + F_2$$

$$M_{TOT} = F_1d_1 + F_2d_2 = 0$$

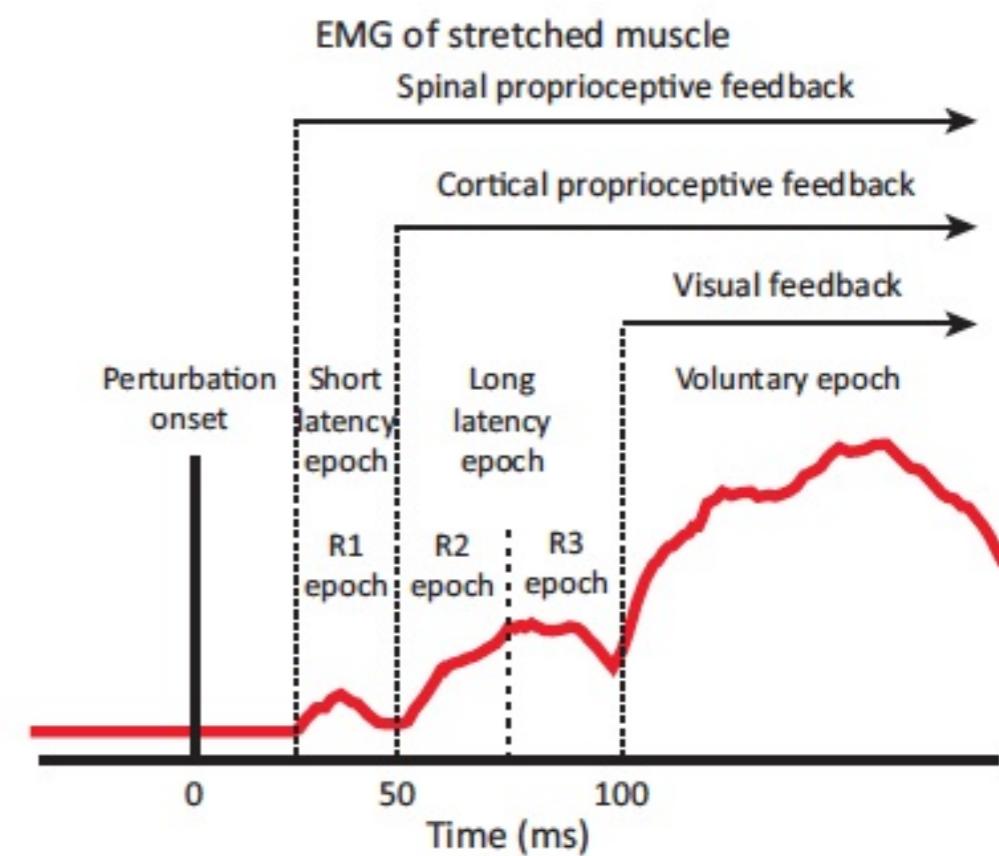
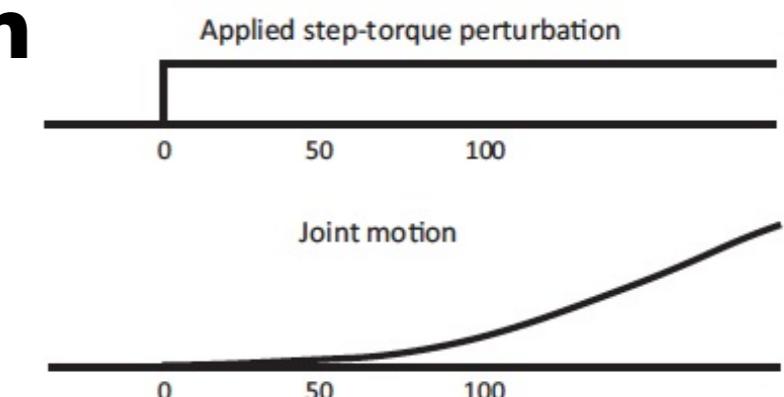
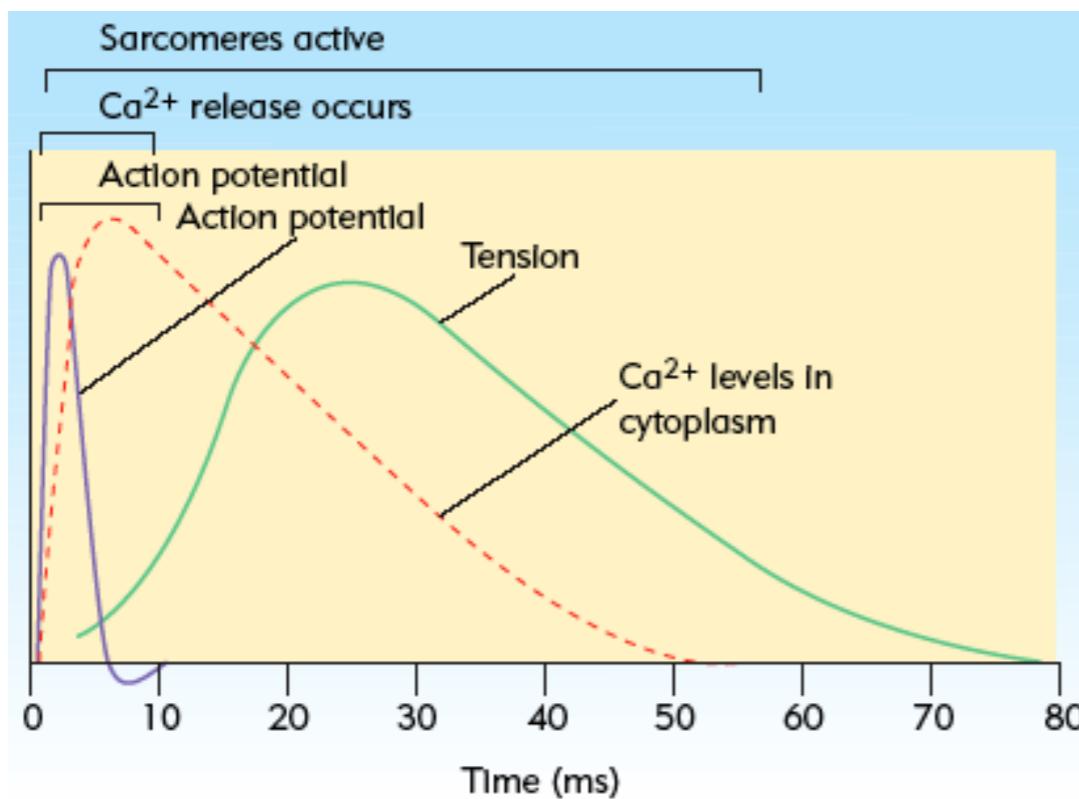


accurate total force production: F-solutions  
zero total moment of force: M-solutions

# SLOWNESS / TIME DELAYS

- **In afferent sensory information**  
receptor dynamics, conduction delays
- **In efferent motor commands**

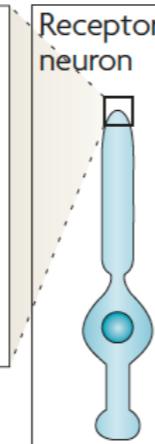
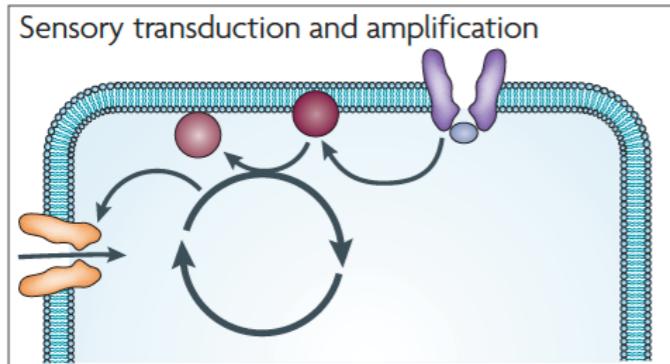
«We live in the past»



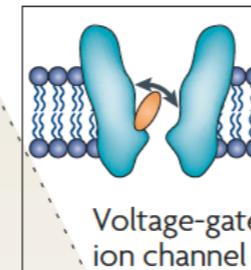
— Scott, 2012, *Trends Cogn Sci* 16:541

# NOISE

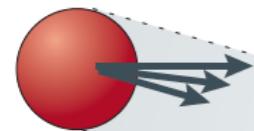
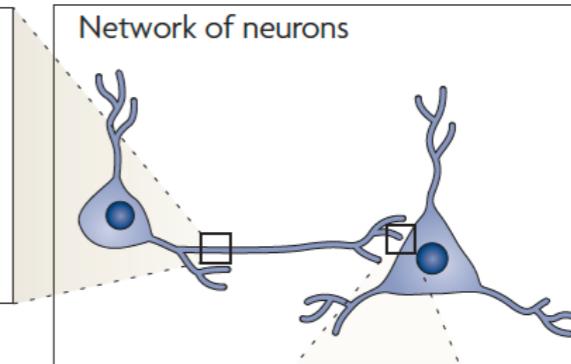
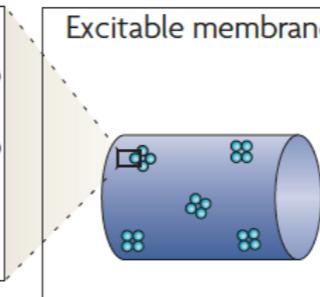
## a Sensory noise



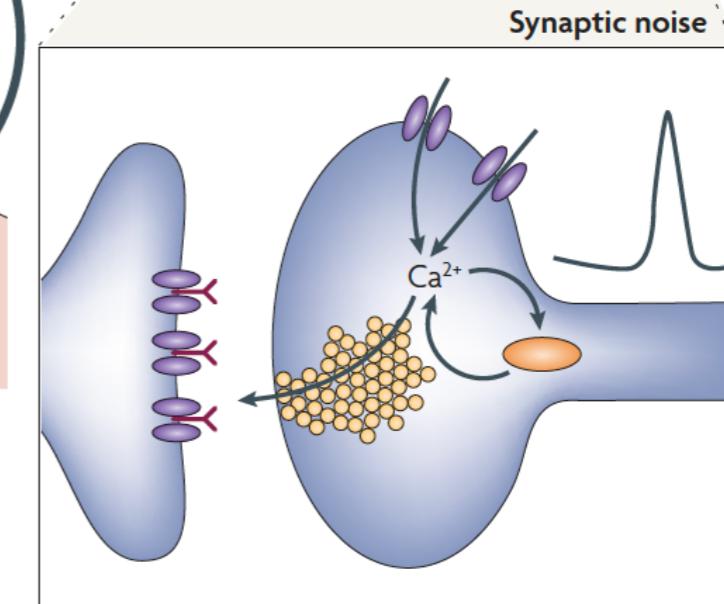
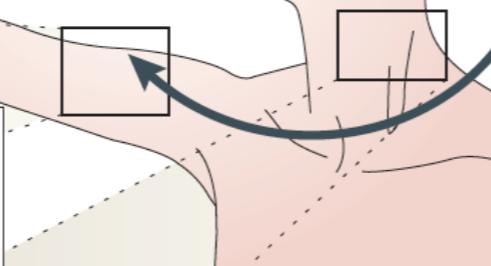
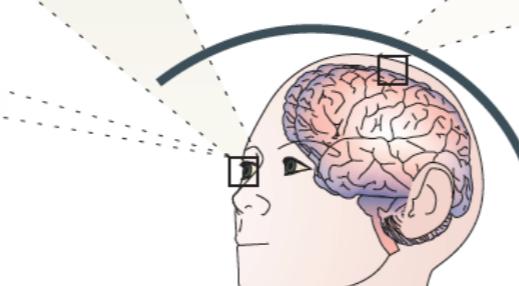
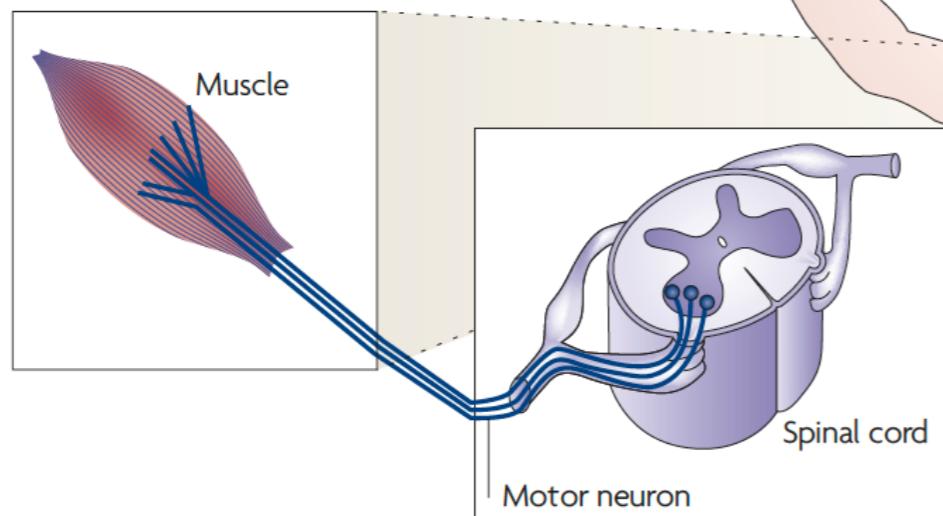
## b Cellular noise



## Electrical noise

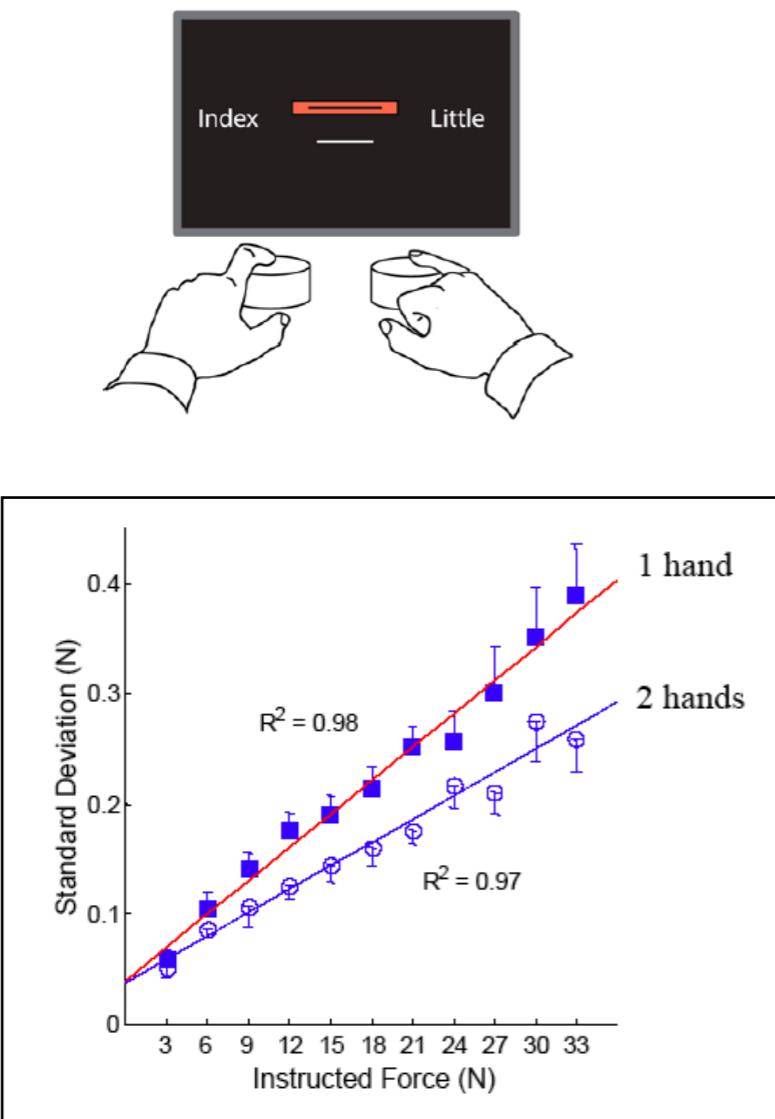


## c Motor noise

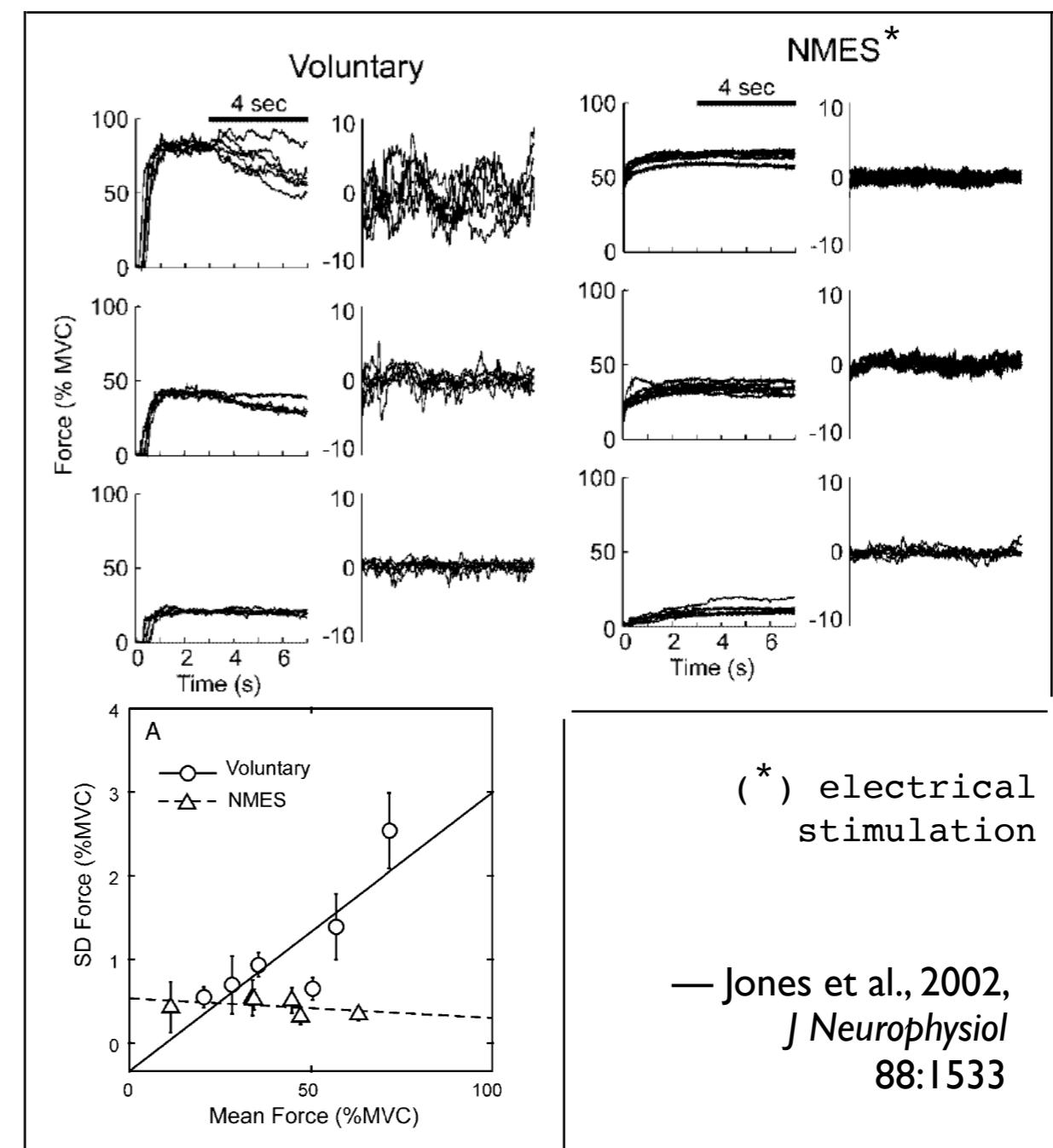


# NOISE

## Signal-dependent motor noise



— Todorov, 2002, *Neural Comput* 14:1233



# NONSTATIONARITY

- **Growth**

development, ageing, training



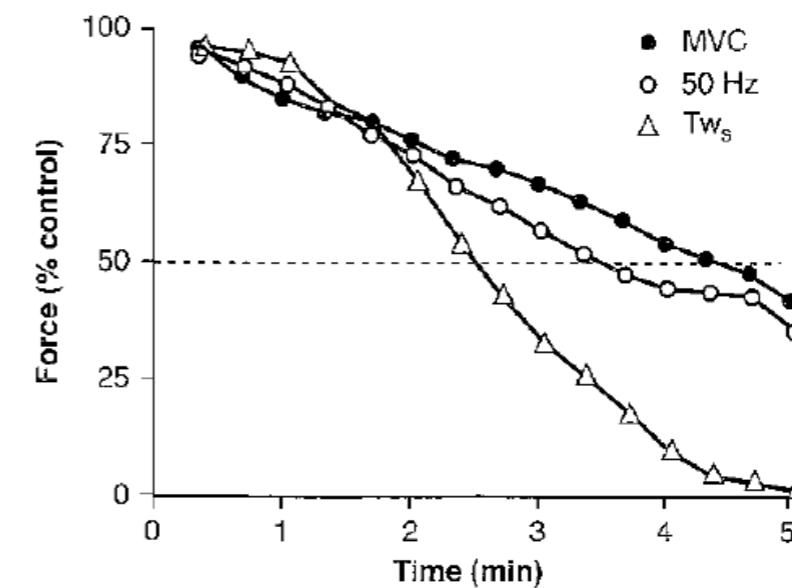
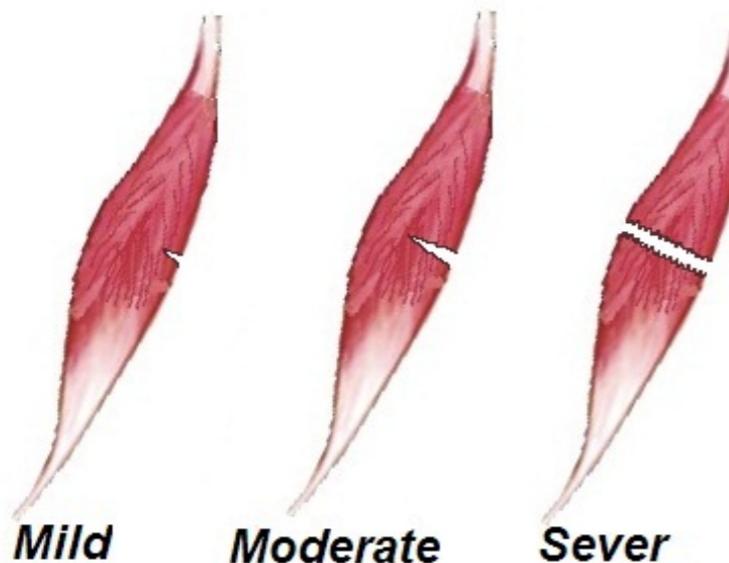
- **Fatigue**

muscle fatigue

changes in force during a fatiguing contraction that involved intermittent contractions

- **Injury**

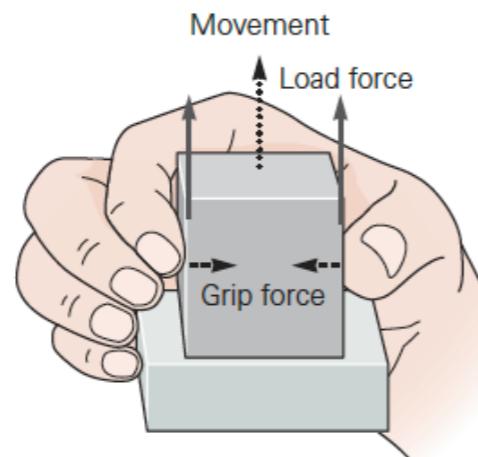
muscle tears



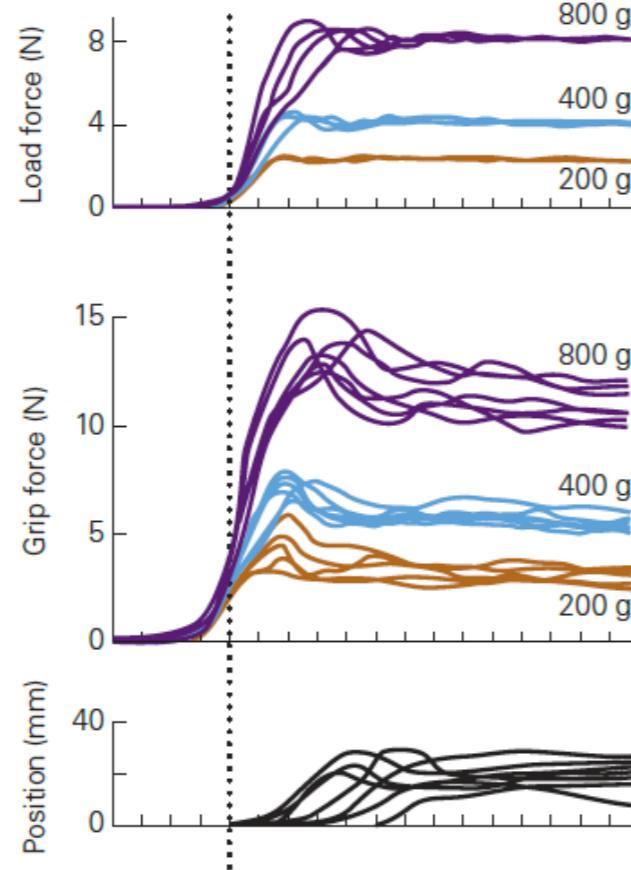
— Bigland-Ritchie et al., 1986, *J Appl Physiol* 61:421

# INTERACTION (RIGID OBJECTS)

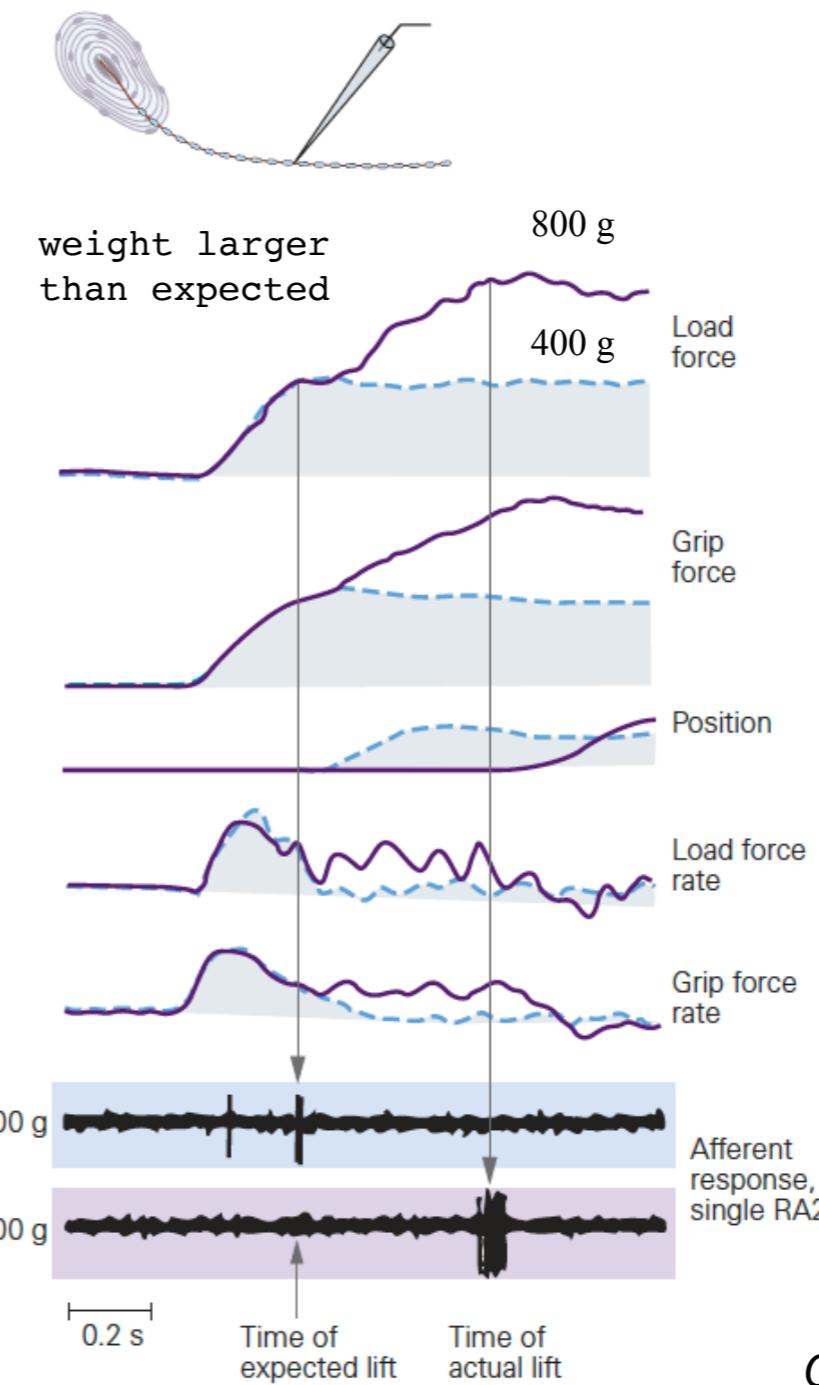
A



B Correctly anticipated weights



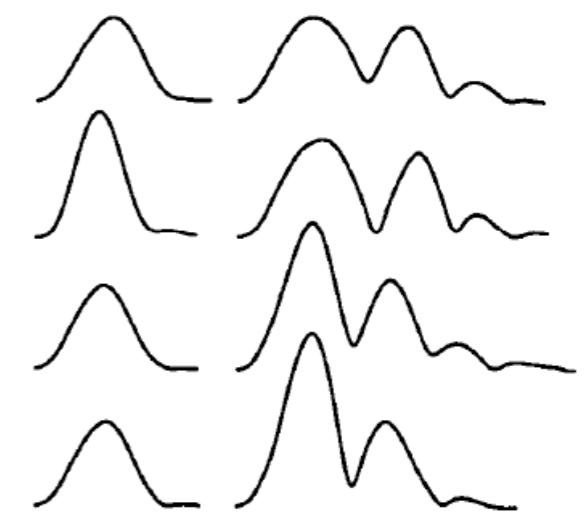
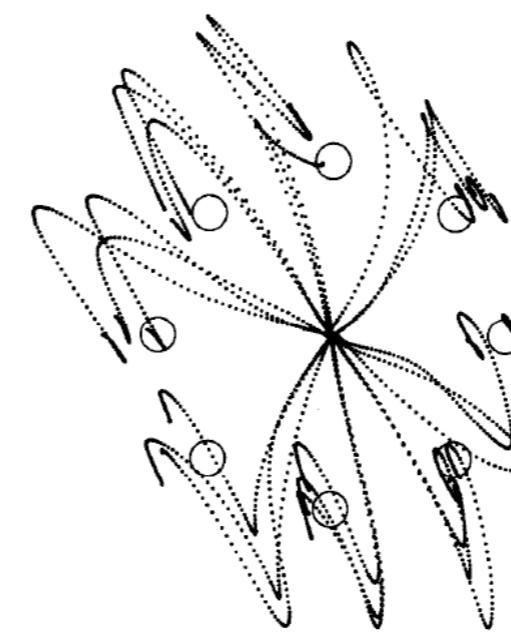
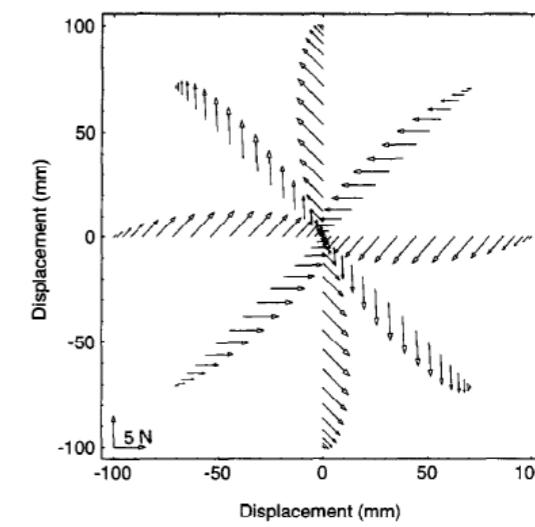
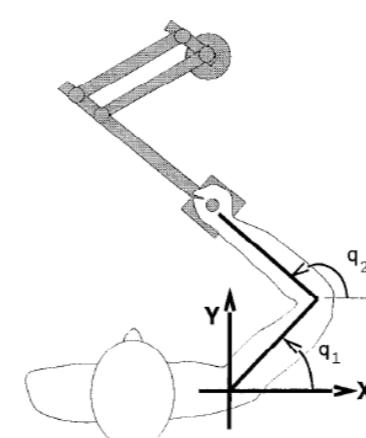
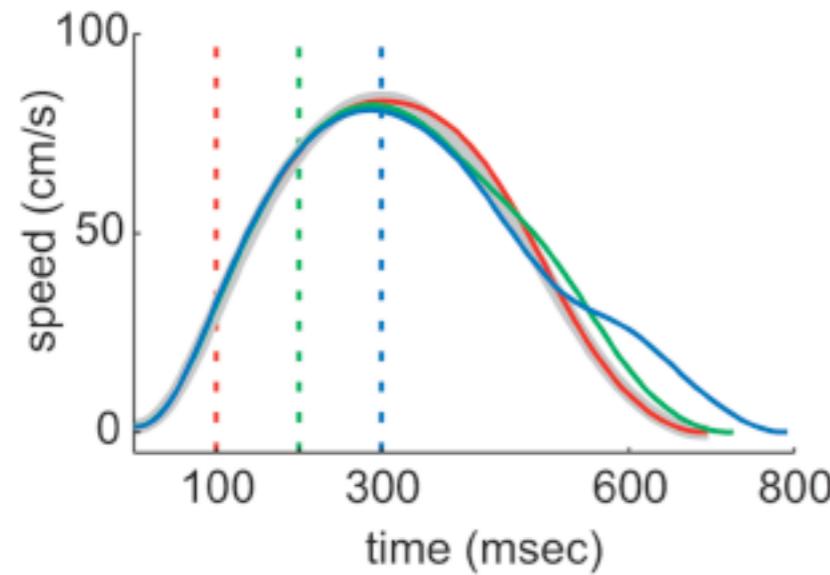
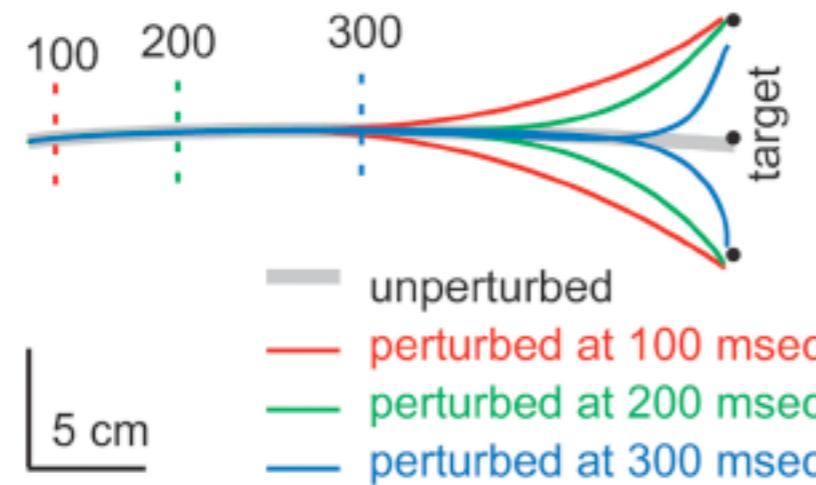
C Correction to unanticipated slippage



— Johansson &  
Cole, 1992, *Curr  
Opin Neurobiol* 2:815

# PERTURBATION — CORRECTION

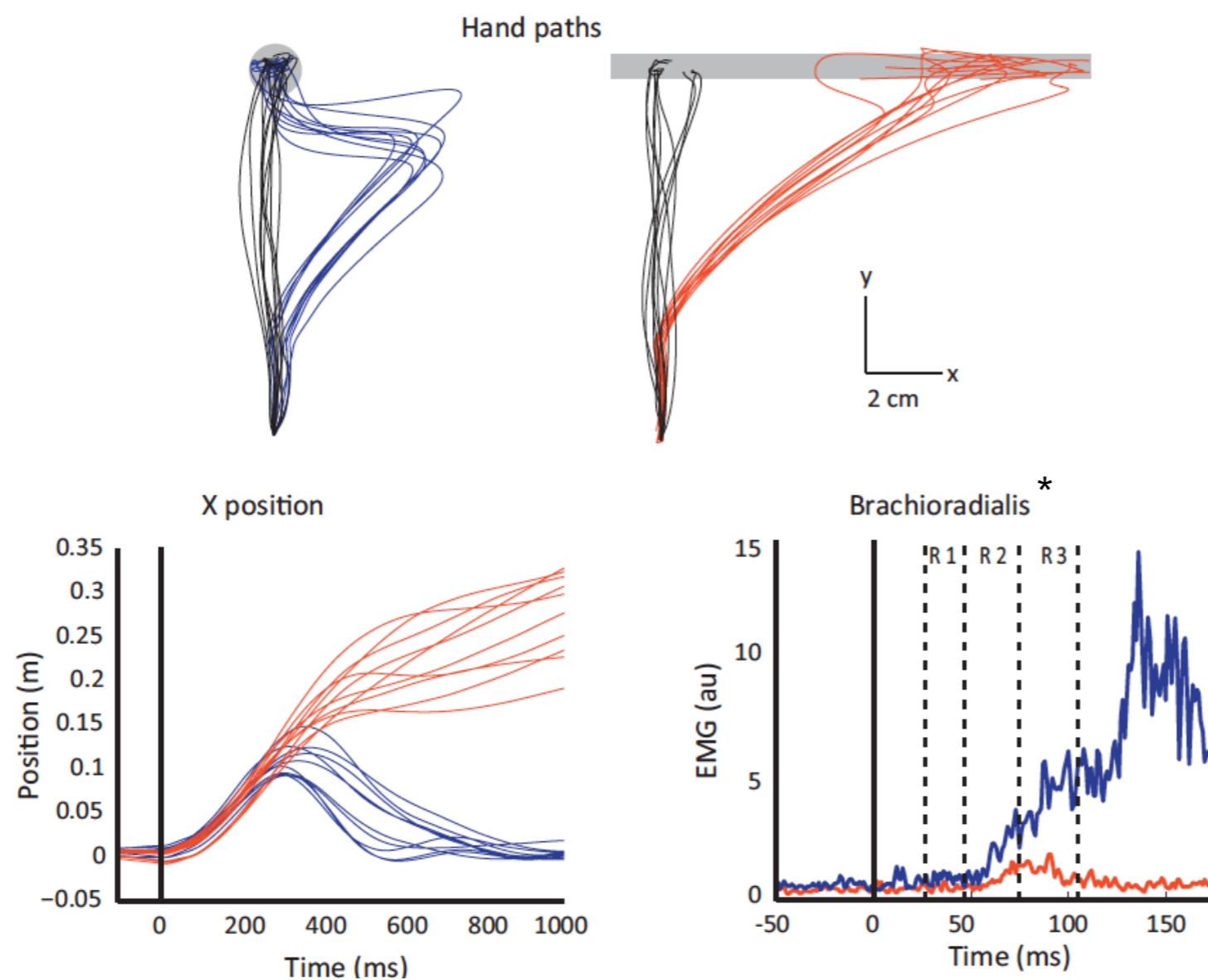
**Motor control is highly flexible in space and time**



# PERTURBATION — CORRECTION

## Error corrections

only if perturbations affect the behavioral goal / ignored if they do not



*Corrective responses are directed back to the circular target, whereas responses for the rectangular bar are redirected to a new location along the bar.*



**Corrective responses do not return to a desired trajectory**

# ADAPTATION — LEARNING

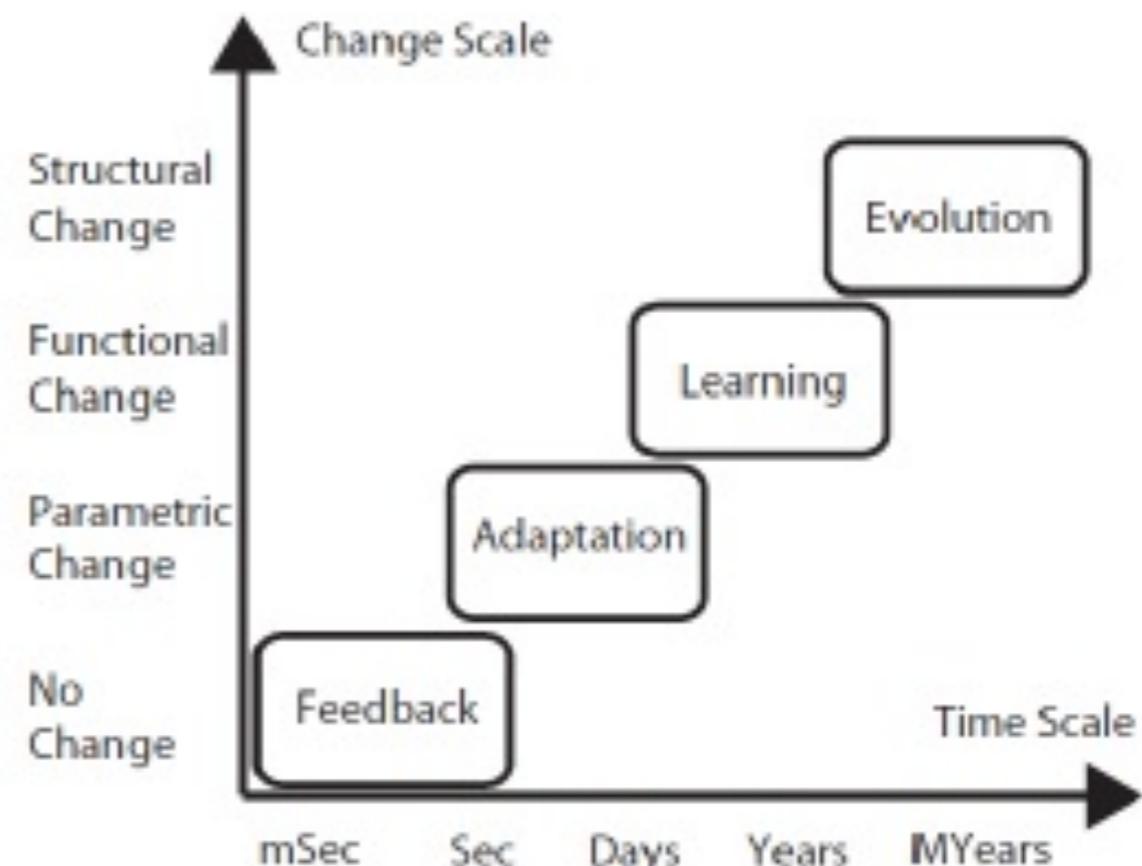
- **Adaptation**

regain former capabilities  
in altered circumstances  
e.g. *prism, force fields, ...*

- **Learning**

change, resulting from  
practice or a novel  
experience, in the  
capability for responding  
e.g. *piano, golf*

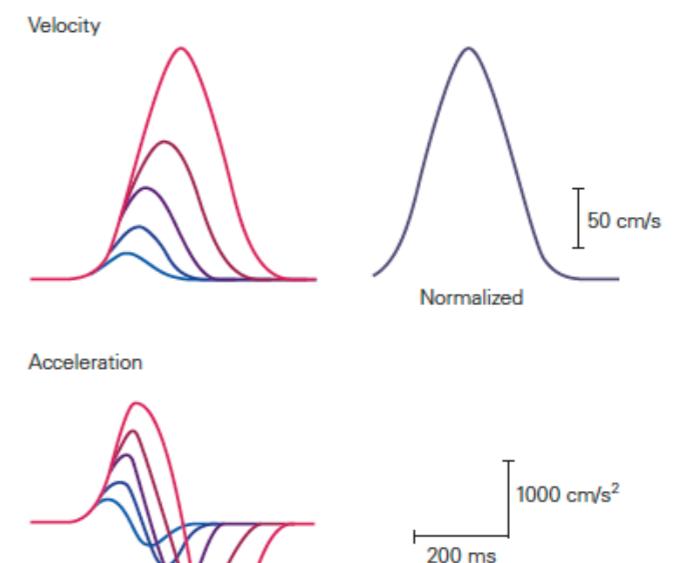
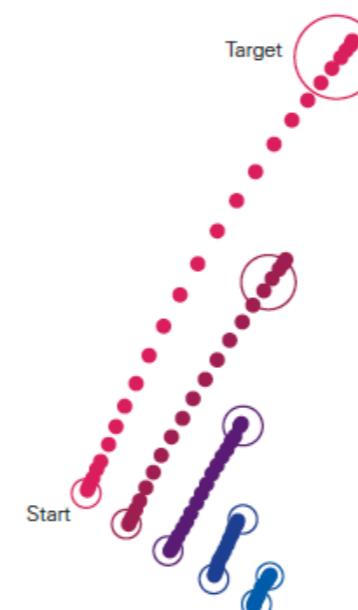
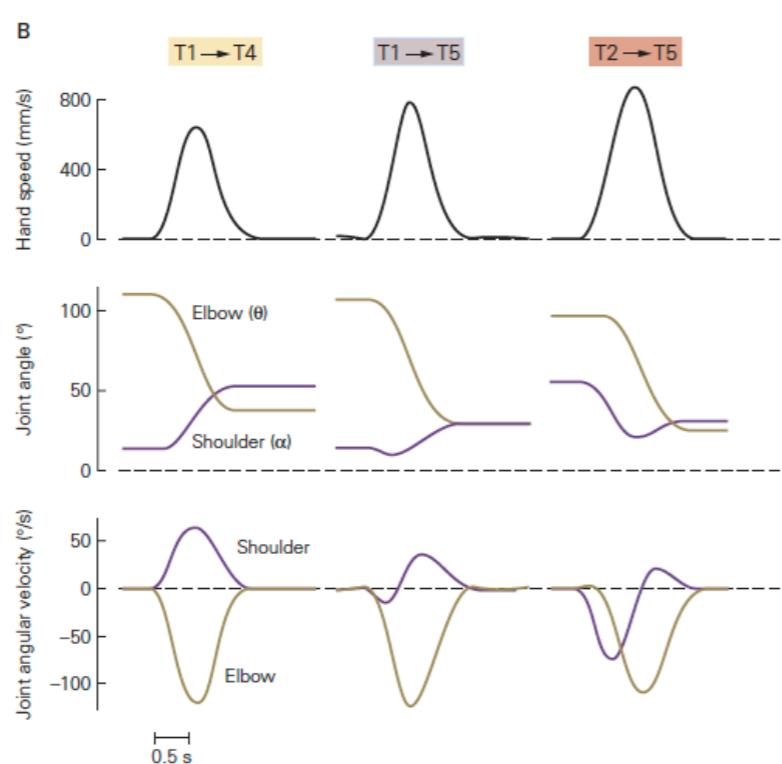
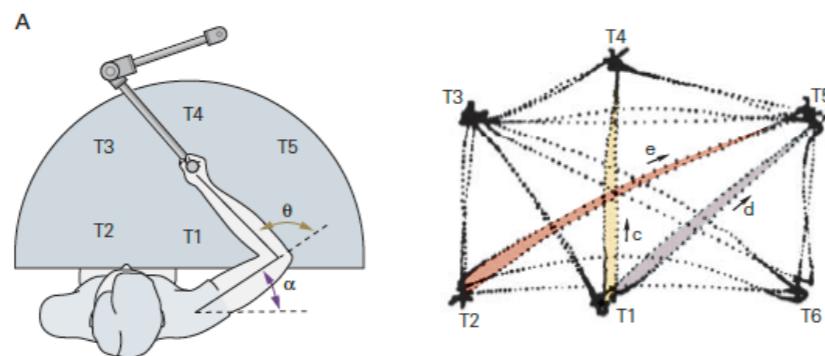
→ motor skills



# MOTOR INVARIANTS

## Trajectories

point-to-point movements: straight, bell-shaped velocity profiles

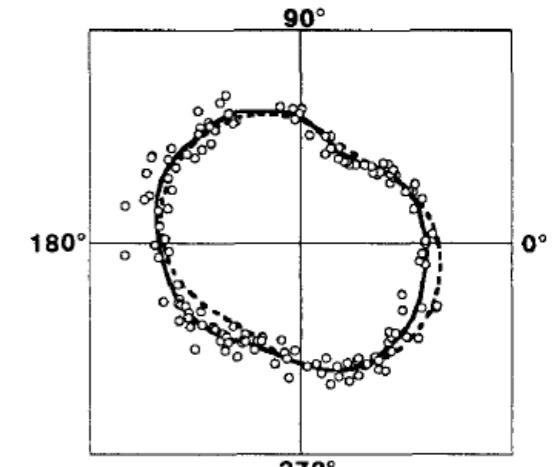
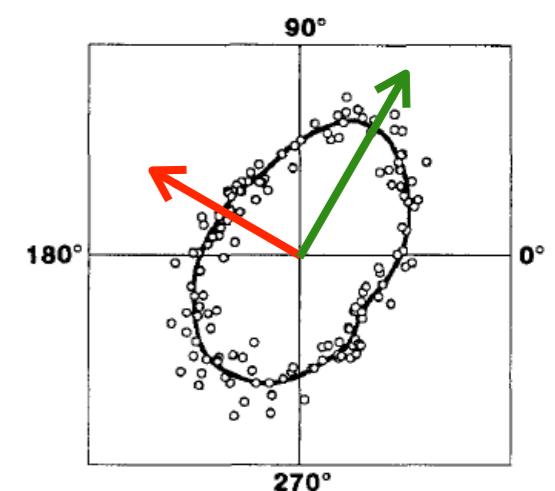
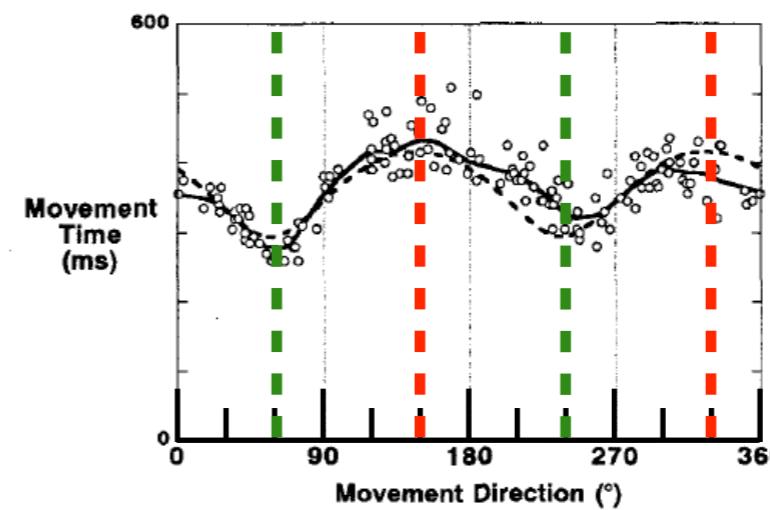
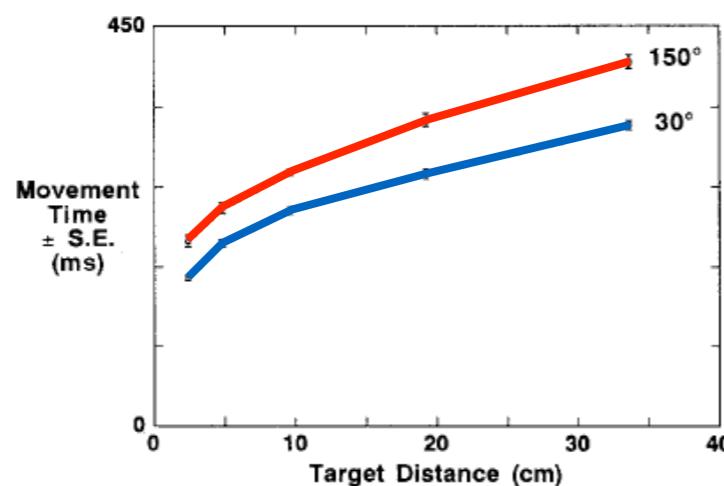
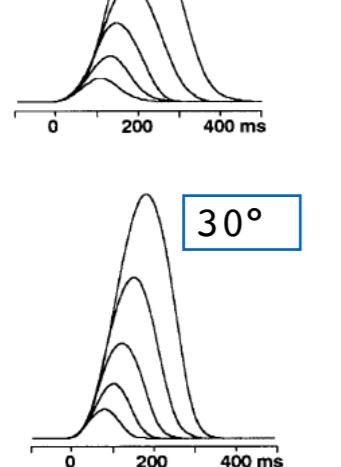
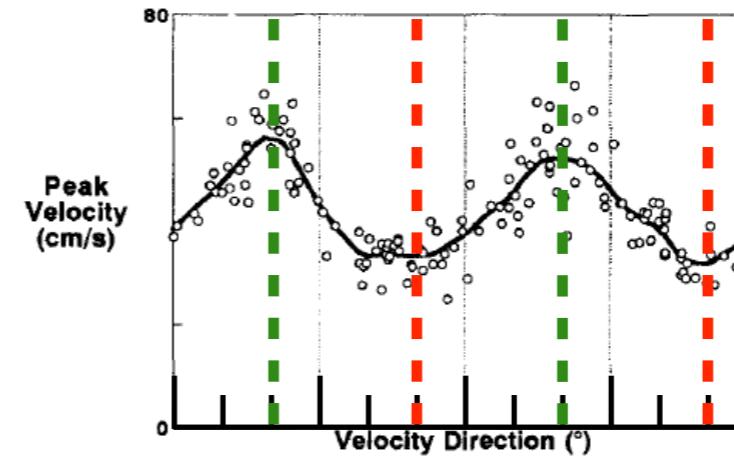
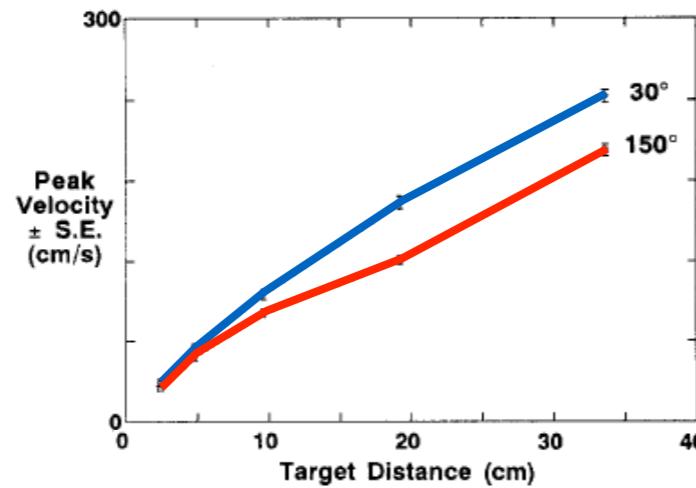
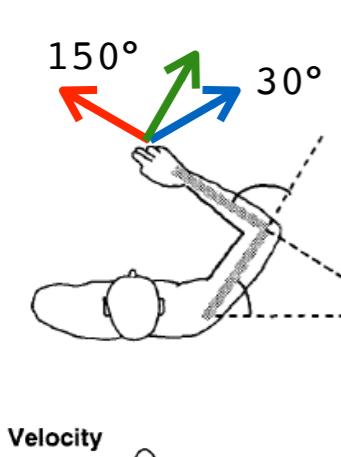
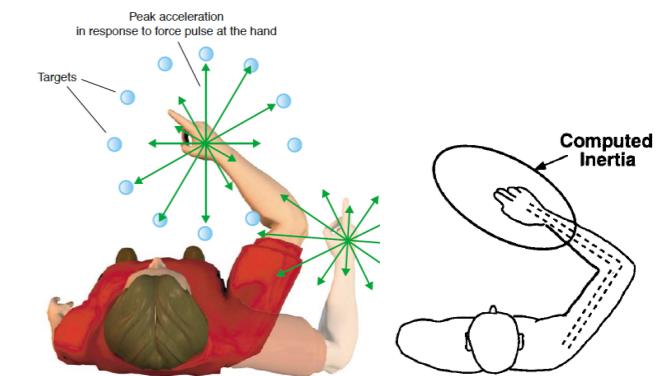


- Morasso, 1981, *Exp Brain Res* 42:223  
— Gordon et al., 1994, *Exp Brain Res* 99:112

# MOTOR INVARIANTS

## Scaling laws

duration and velocity scale with amplitude and load

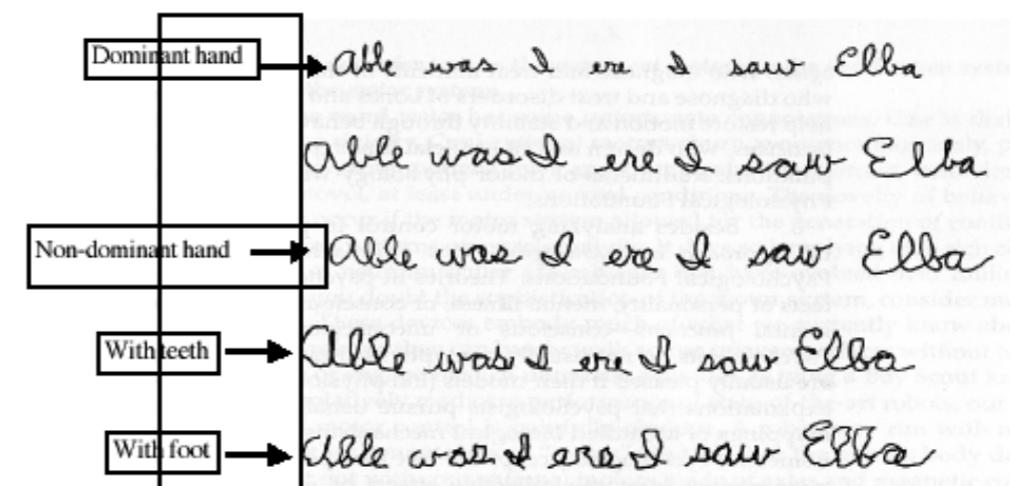
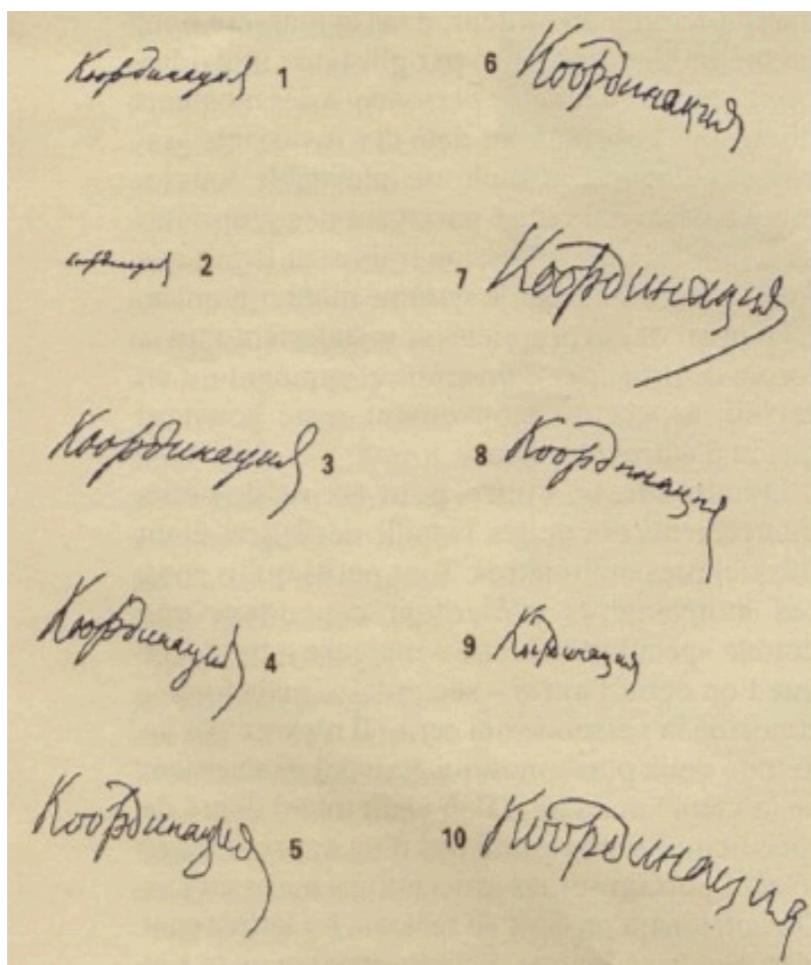


# MOTOR INVARIANTS

## Motor equivalence

Actions are encoded in the central nervous system in terms that are more abstract than commands to specific muscles

Bernstein writes the word «Coordination» in russian

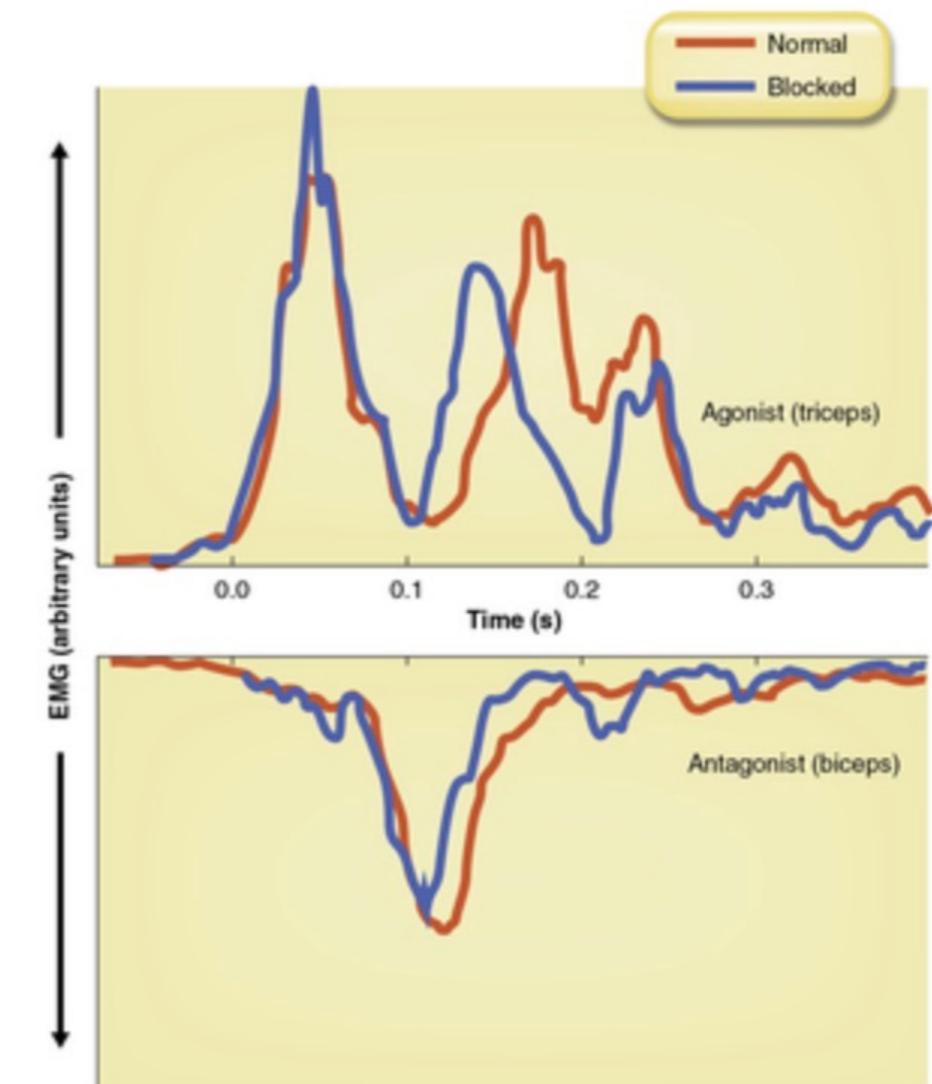
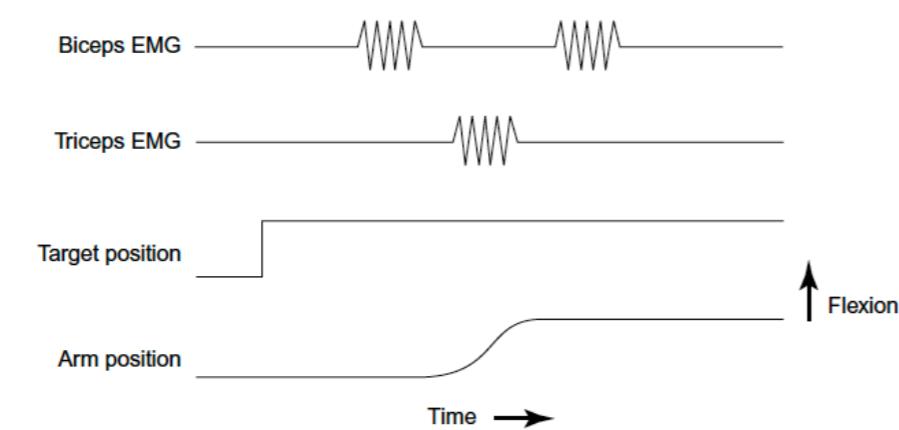
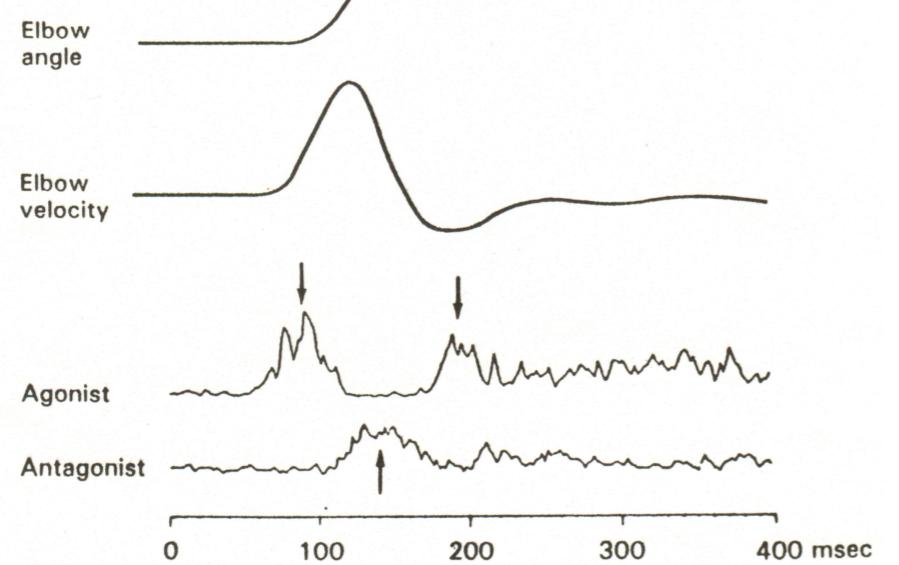


- (1) right hand, normal size
- (2) right hand, small size
- (3) pen attached above the wrist
- (4) pen attached to the elbow
- (5) pen attached to the shoulder
- (6) pen attached to right foot's big toe
- (7) pen between the teeth
- (8) left hand
- (10) pen attached to left foot's big toe

# MOTOR INVARIANTS

## EMG

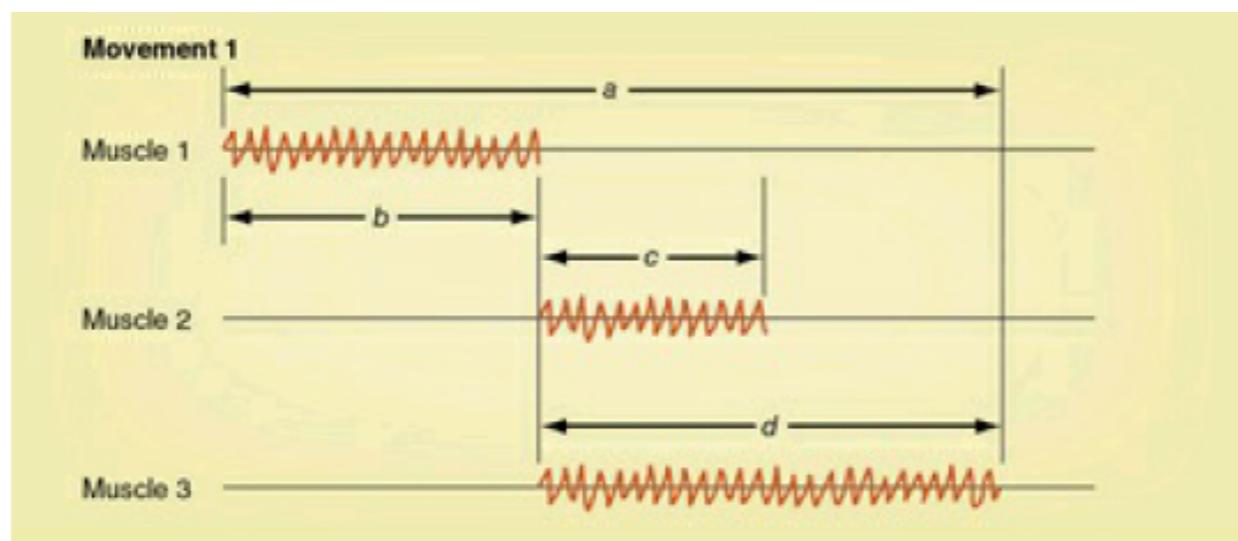
triphasic pattern during fast movements



— Wadman et al., 1979, *J Hum Mov Stud* 5:3

# RELATIVE TIMING

**Set of ratios of the durations of intervals**  
within a motor act

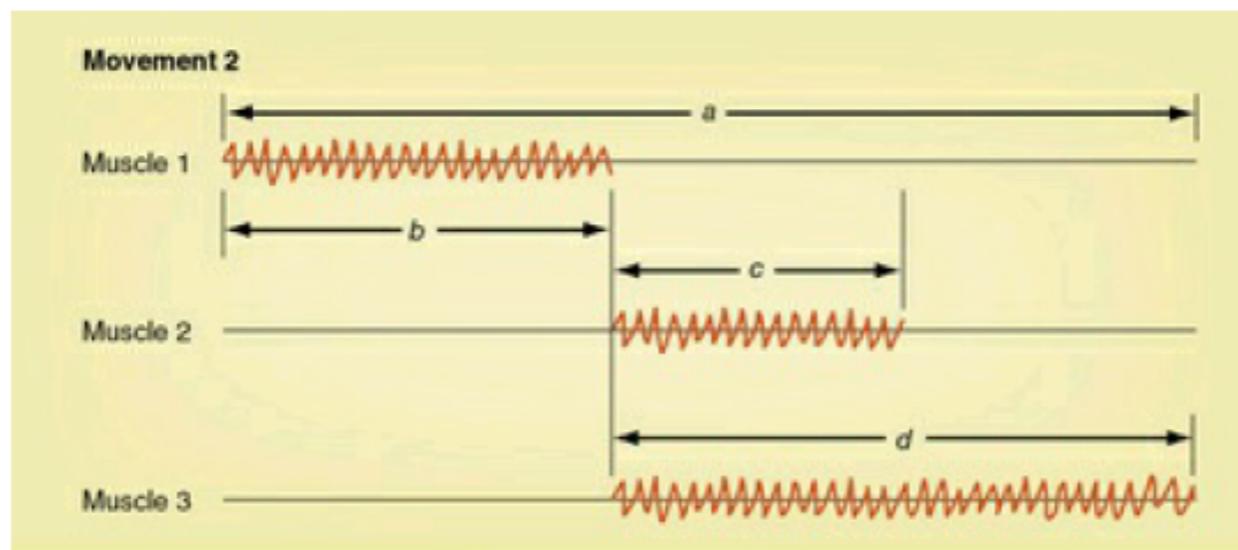


hypothetical relative  
timing of EMG traces

$$b/a = 0.4$$

$$c/a = 0.3$$

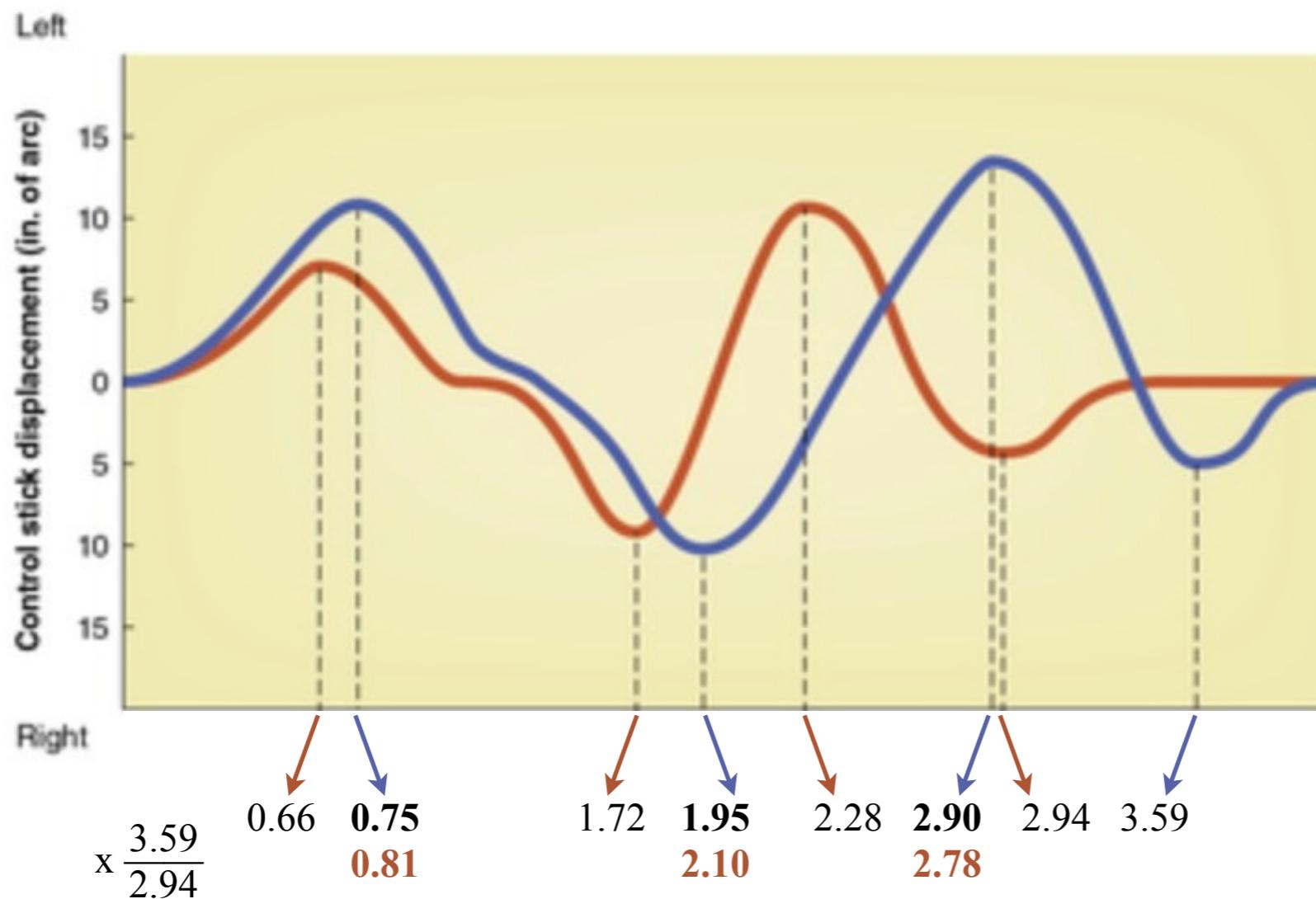
$$d/a = 0.6$$



— Schmidt & Lee, 2014, *Motor Learning and Performance*, Human Kinetics

# RELATIVE TIMING

**Reproduction of a pattern of movement**  
movements are sped up or slowed proportionally



pattern to  
reproduce  
  
too fast  
reproduction

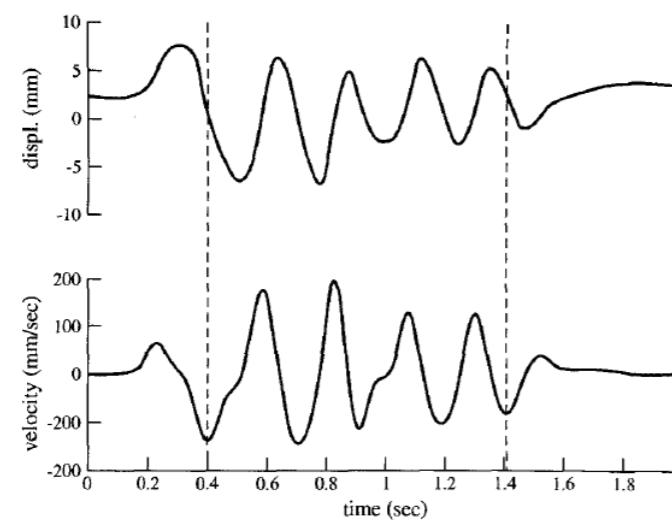
– Schmidt & Lee, 2014, Motor Learning and Performance, Human Kinetics

# RELATIVE TIMING IN SPEECH

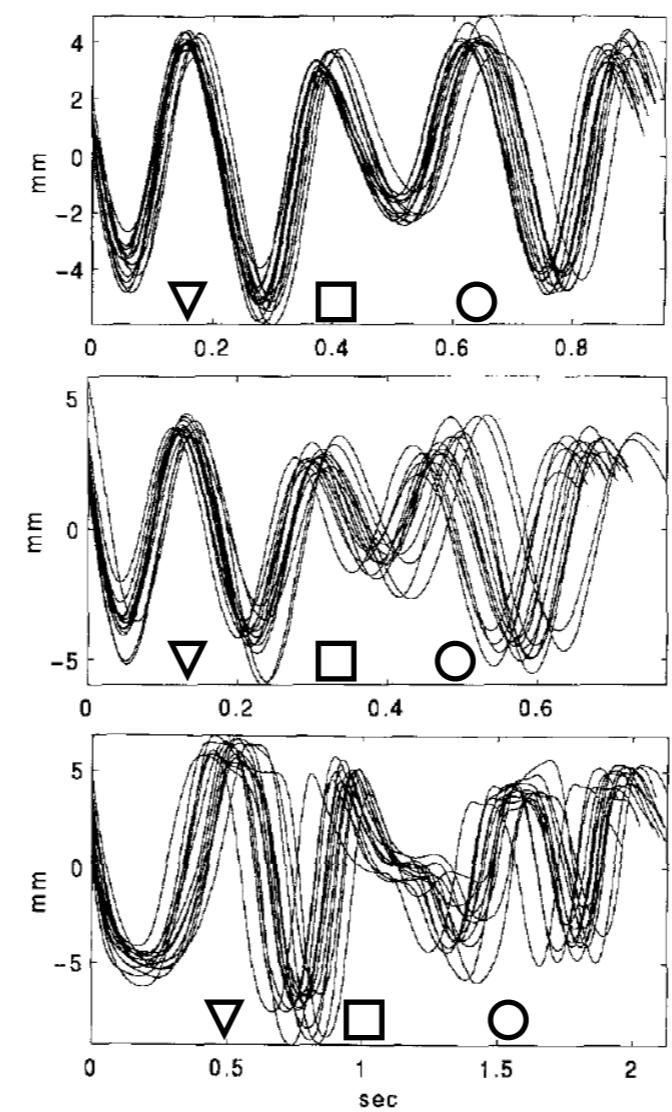
## Speech

lower lip displacement during production of «buy Bobby a puppy» at different rates

**normal**  
**fast**  
**slow**

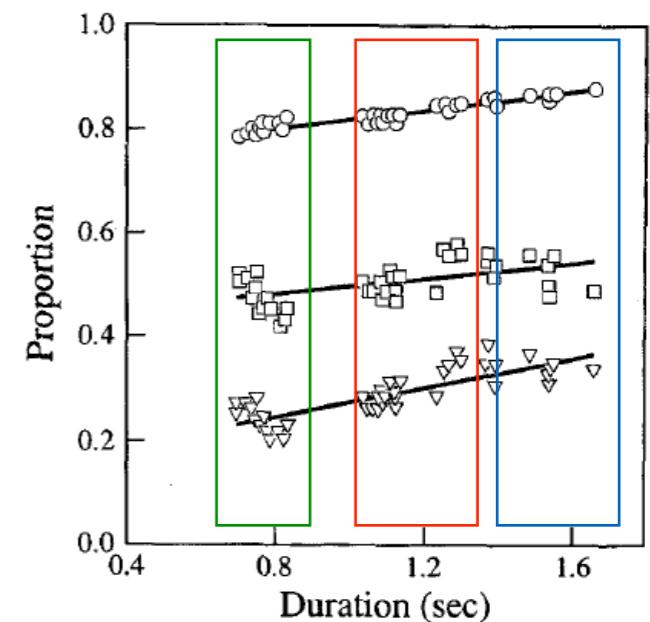


— Smith et al., 1995,  
*Exp Brain Res* 104:493

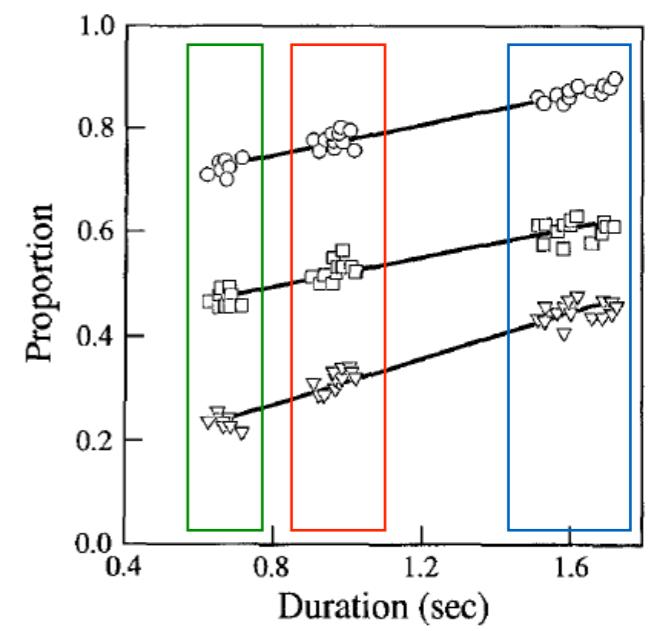


test of the *proportional duration* model

**Subject 5**

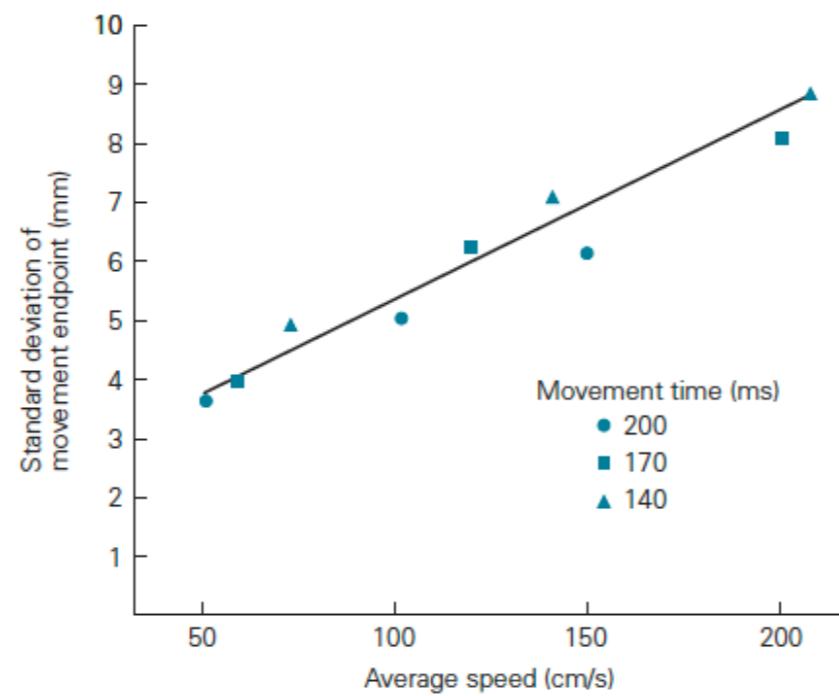
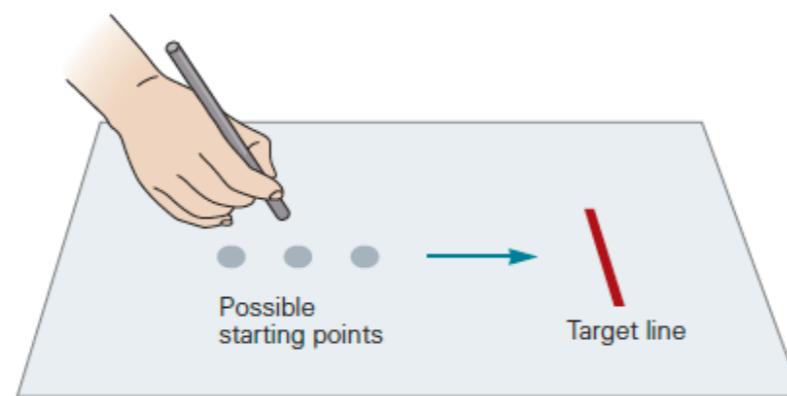


**Subject 7**



# MOTOR VARIABILITY

**Spatial accuracy varies with speed**

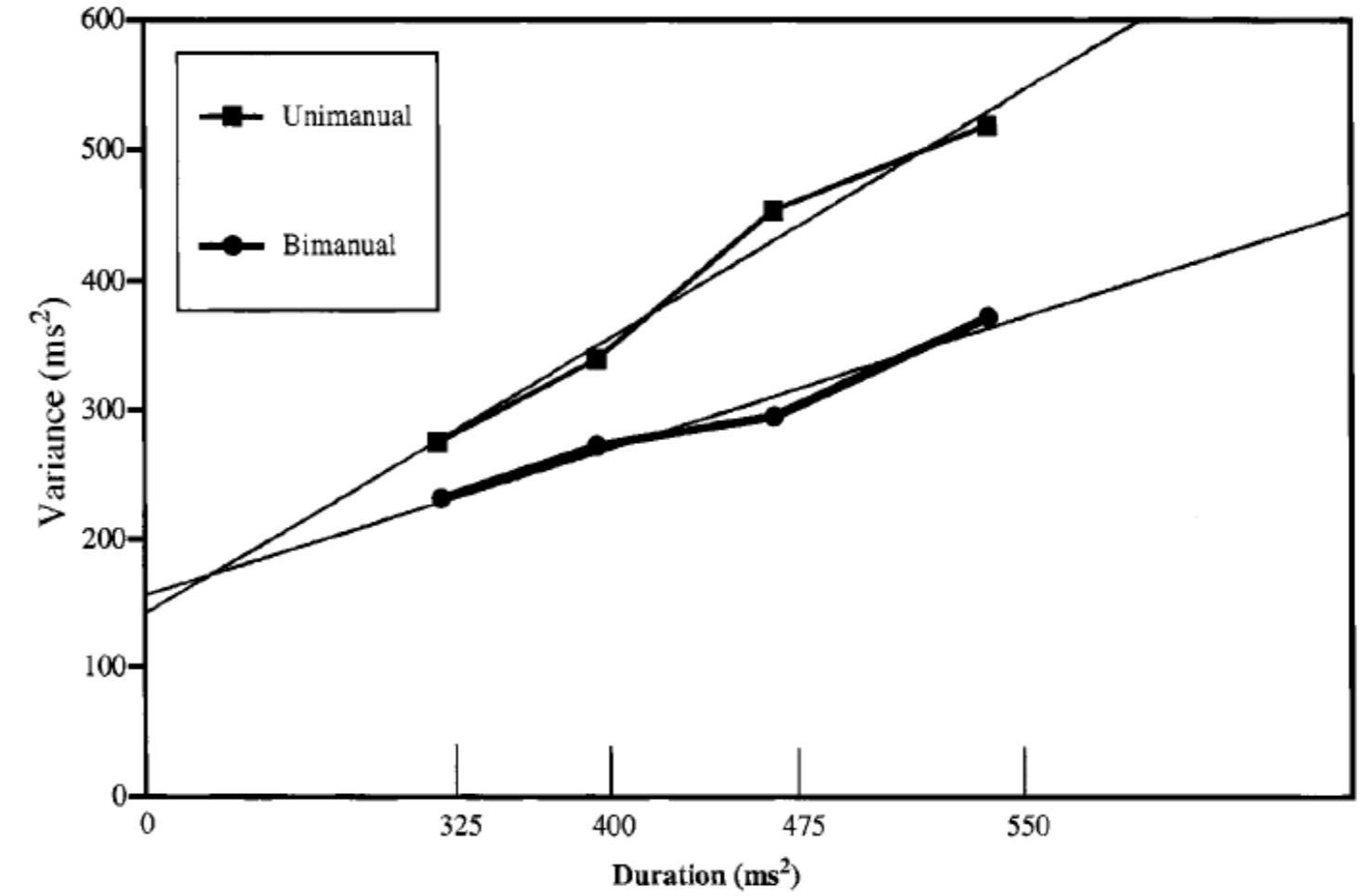
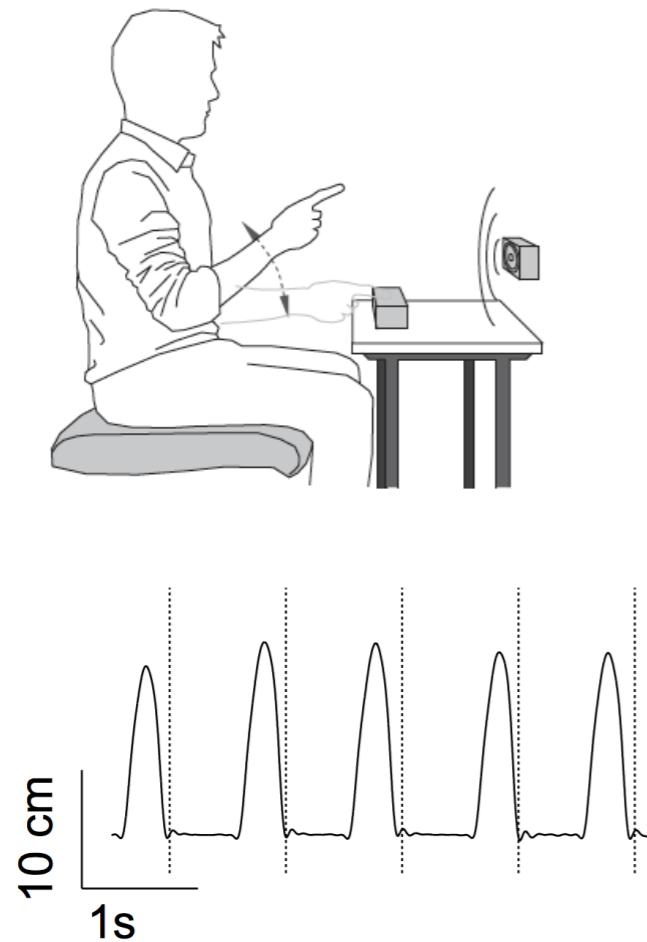


— Kandel et al., 2013,  
*Principles of Neural Science*,  
McGraw-Hill

— Schmidt et al., 1979,  
*Psychol Rev* 86:415

# MOTOR VARIABILITY

**Temporal accuracy varies with duration**  
tapping task



— Ivry & Richardson, 2002, *Brain Cogn* 48:117

# MOTOR VARIABILITY

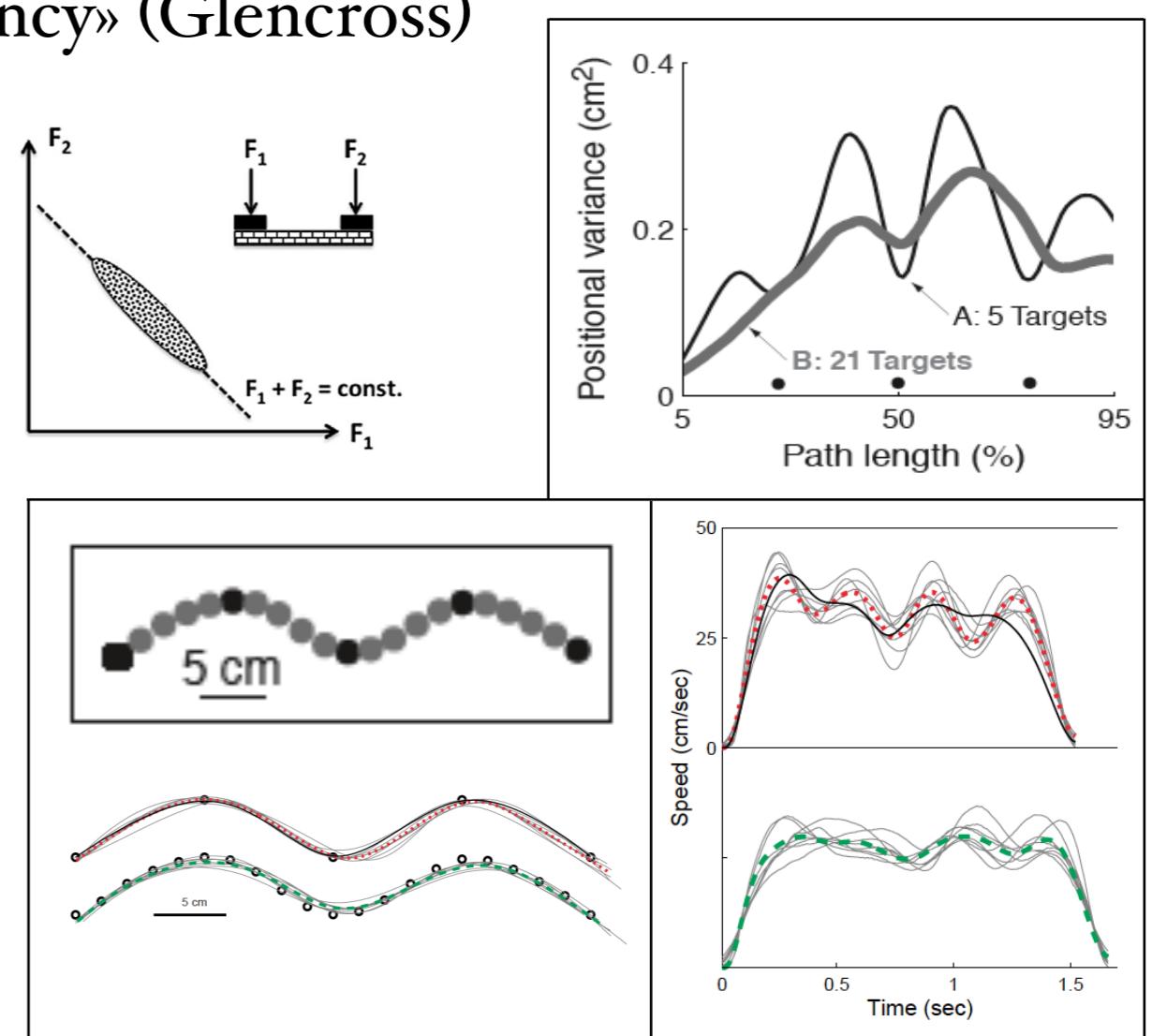
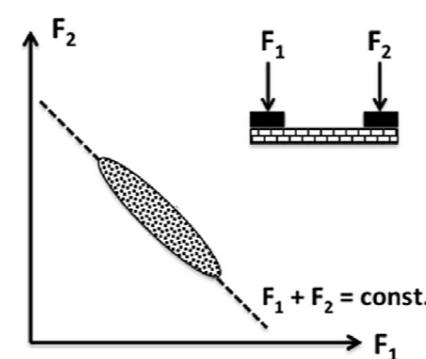
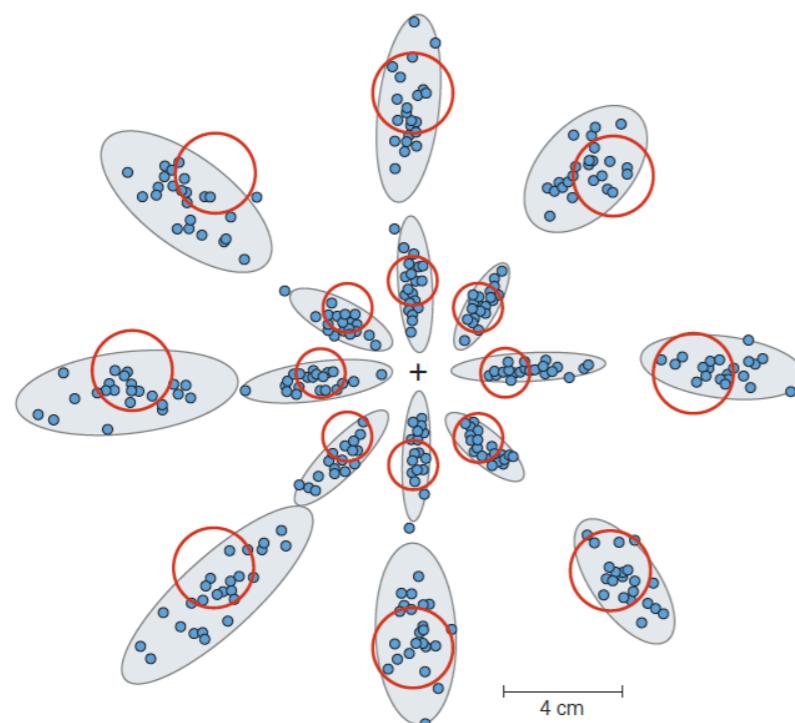
## Structured variability

«Repetition without repetition» (Bernstein)

«Uniqueness and stability/consistency» (Glencross)

*uncontrolled manifold*

*minimum intervention principle*



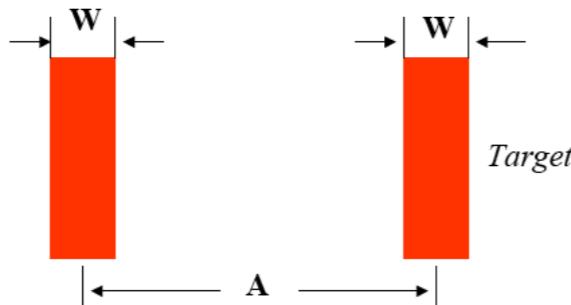
— Gordon et al., 1994, *Exp Brain Res* 99:97

— Todorov & Jordan, 2002, *Nat Neurosci* 5:1226

# LAWS OF MOVEMENT

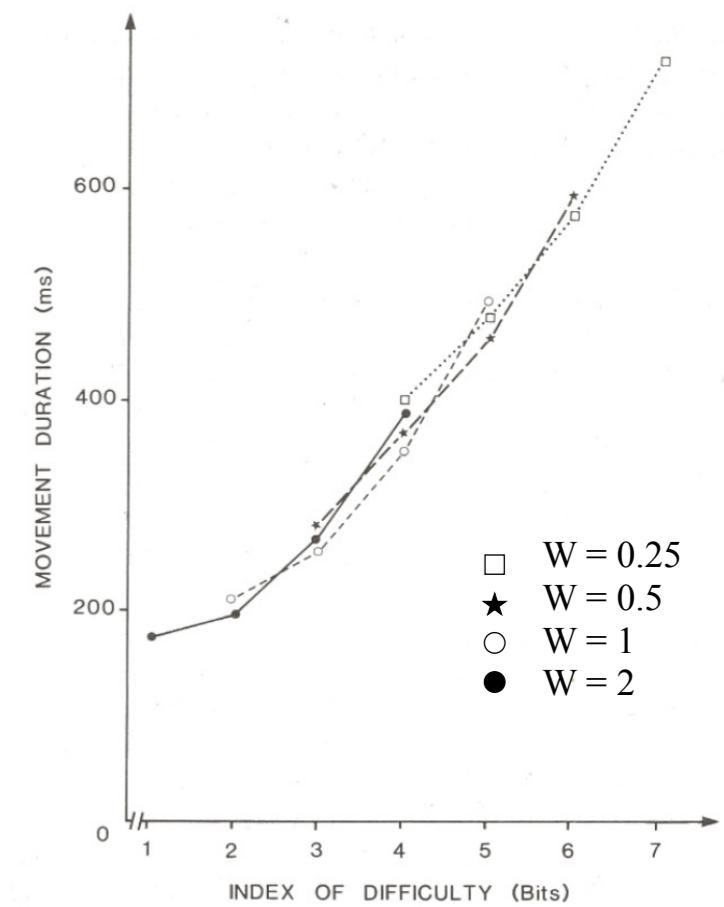
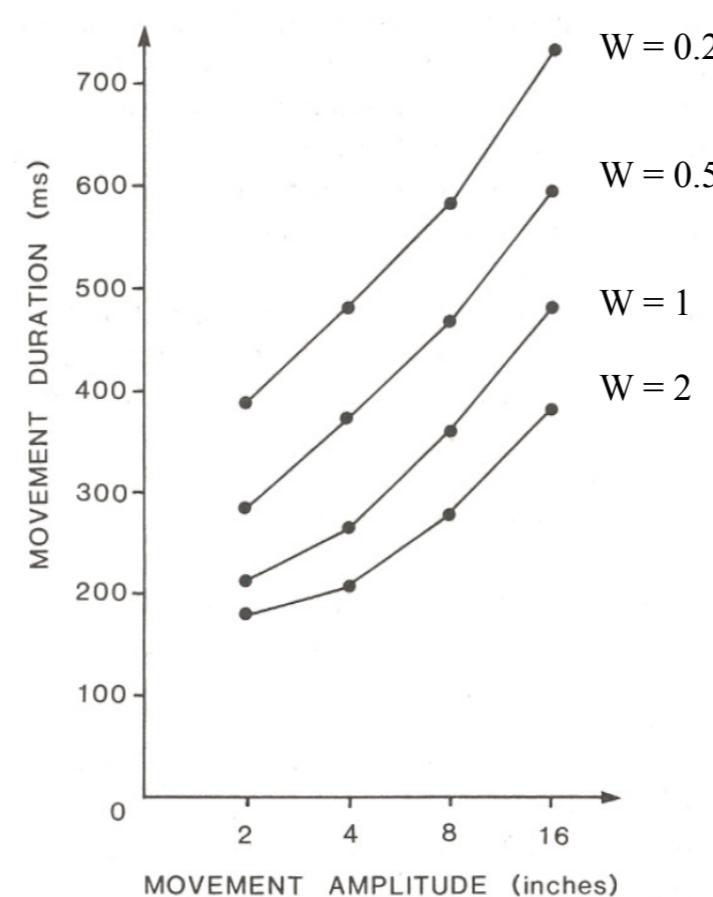
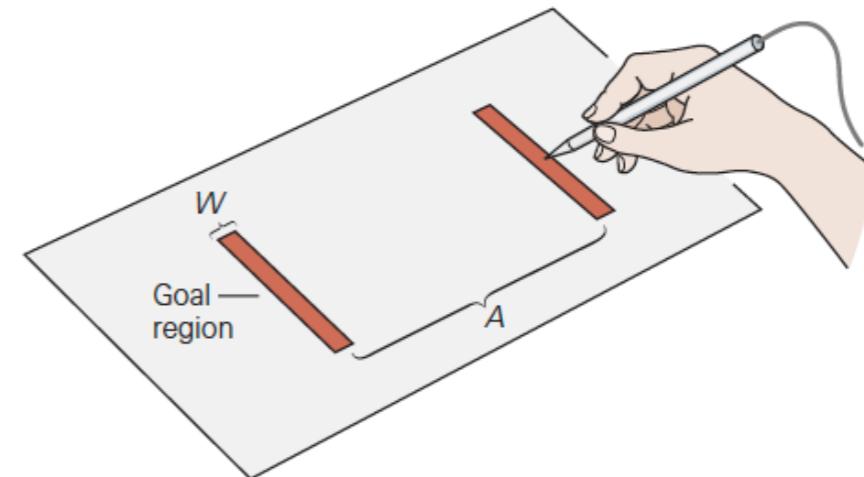
## Fitts' law

speed/accuracy trade-off



$$MT = a + b \underbrace{[\log_2(2A/W)]}_{ID \text{ (index of Difficulty)}}$$

- Fitts, 1954, *J Exp Psychol* 47:381
- Jeannerod, 1988, *The Neural and Behavioural Organization of Goal-Directed Movements*, Clarendon Press

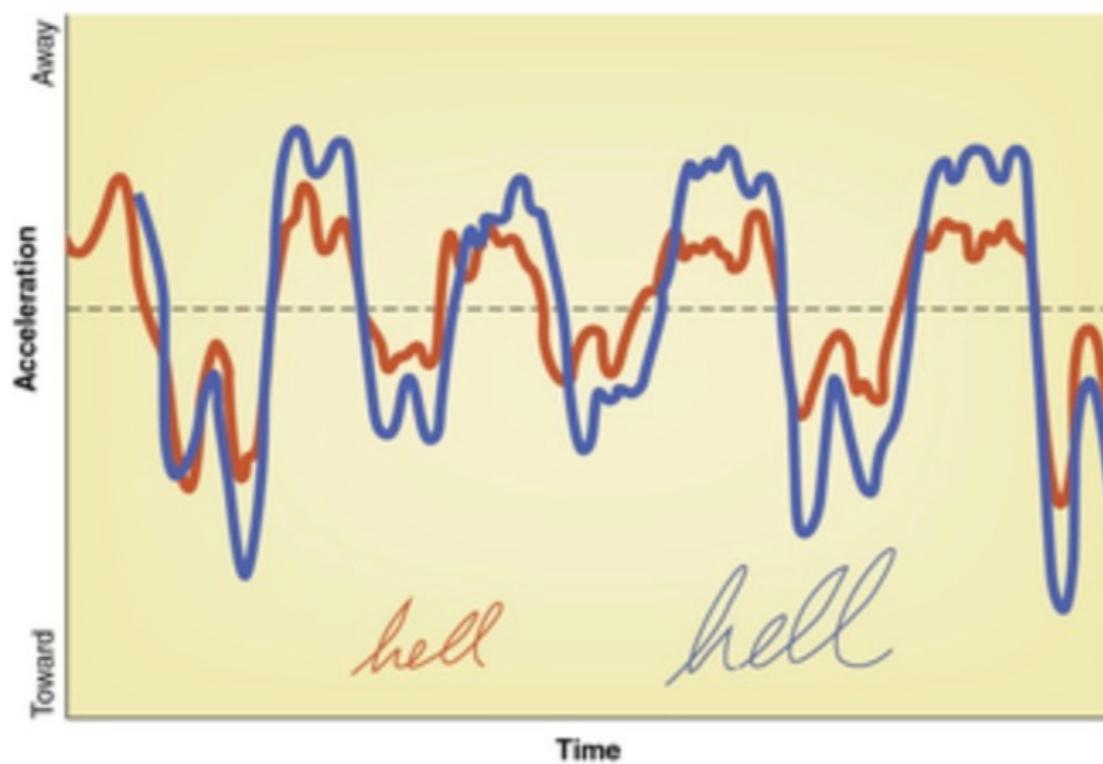


# ISOCHRONY PRINCIPLE

## Maintain constant duration

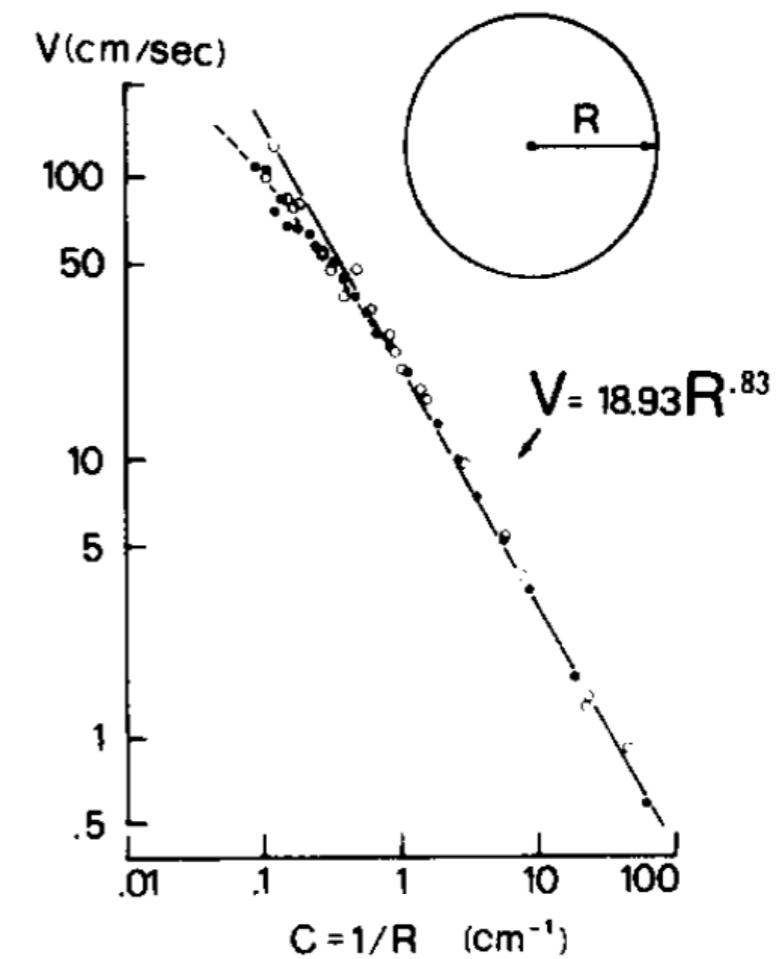
compensatory increase of speed with increasing amplitude

handwriting



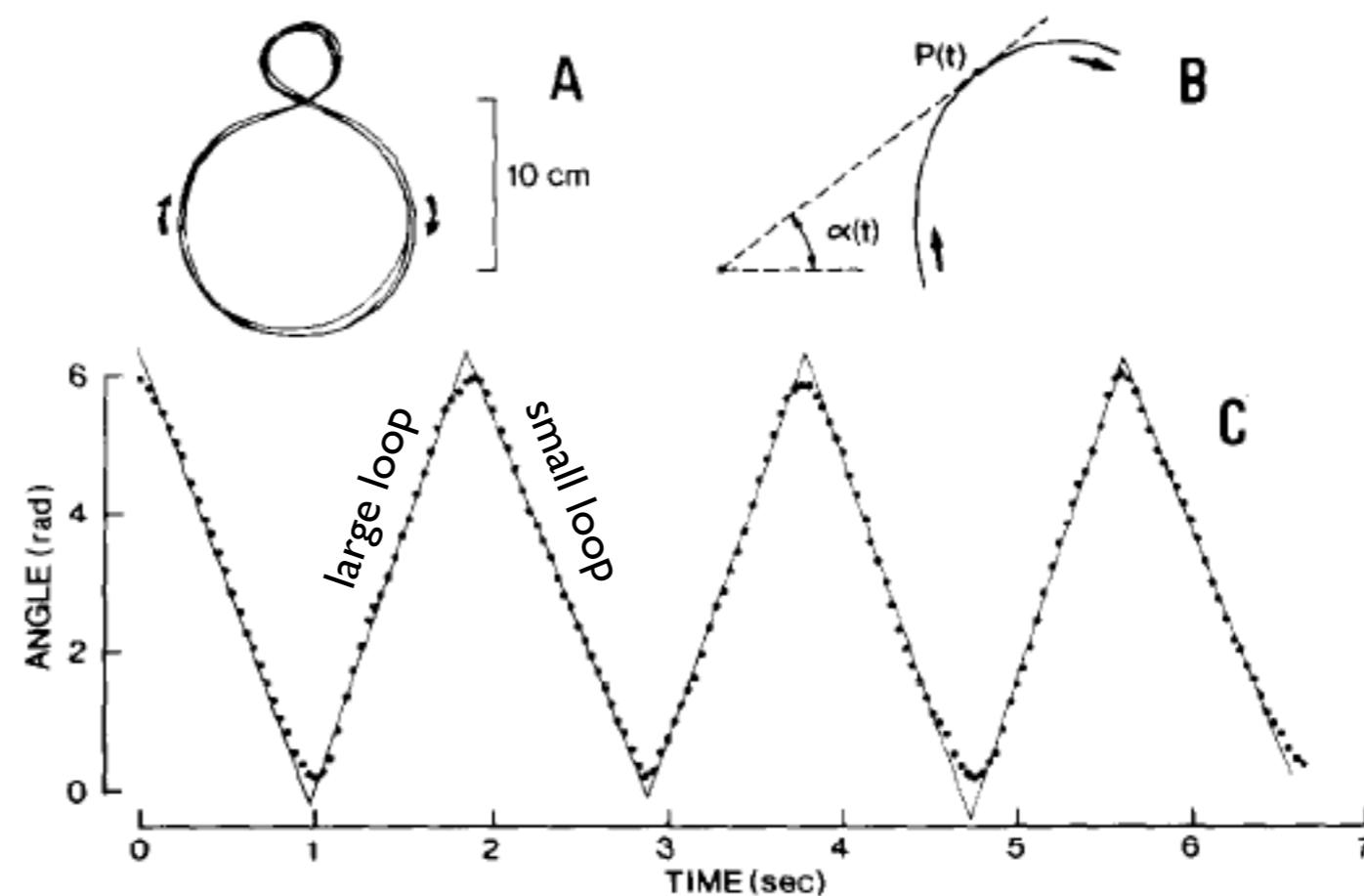
- Hollerbach, 1978, *Doctoral Dissertation, MIT*
- Viviani & McCollum, 1983, *Neuroscience* 10:211

circle drawing



# ISOGONY PRINCIPLE

**Equal angles are described in equal time**  
in a drawing task



— Lacquaniti et al., 1983, *Acta Psychol* 54:115

# TWO-THIRD POWER LAW

**Relationship between angular velocity and curvature**  
in a scribbling task



$$v(t) = kr(t)^{1/3}$$

$$a(t) = kc(t)^{2/3}$$

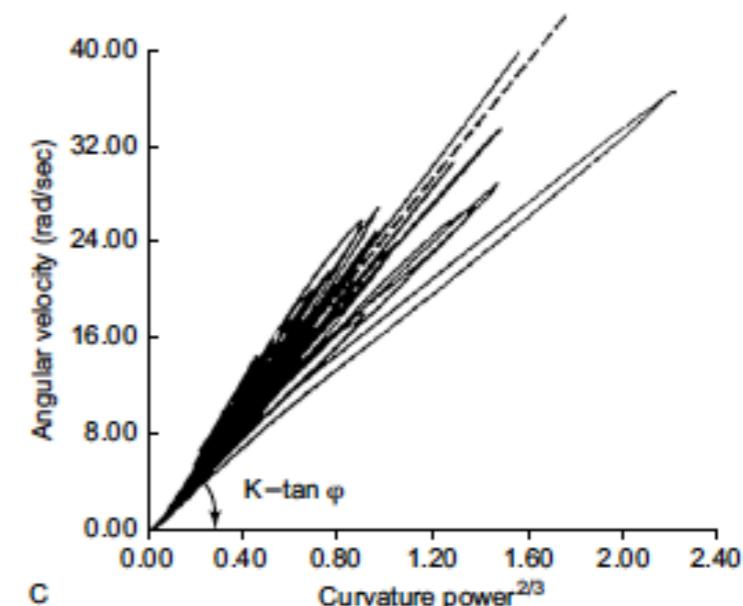
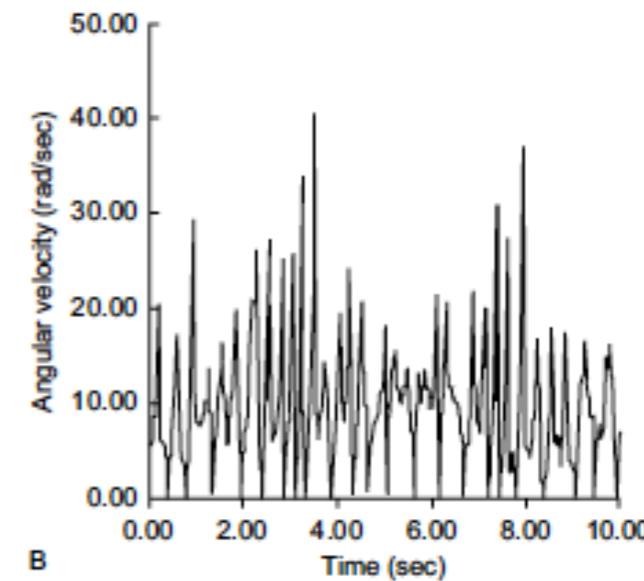
$\mathbf{x}(t) = [x(t), y(t)]^T$  trajectory

$a(t)$  angular velocity

$v(t) = \|\dot{\mathbf{x}}(t)\|$  tangential velocity

$c(t)$  curvature

$r(t) = 1/c(t)$  radius of curvature



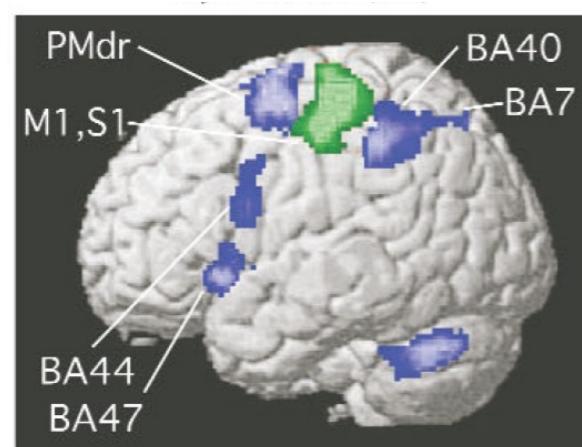
# RHYTHMIC AND DISCRETE ACTIONS

- **Rhythmic**

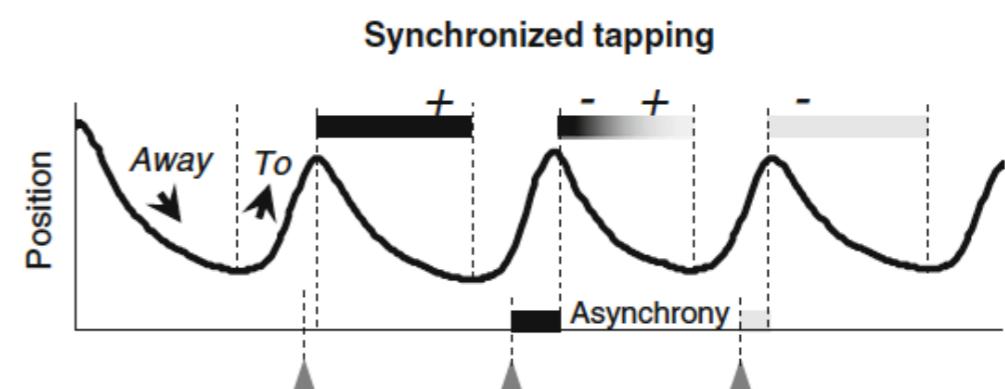
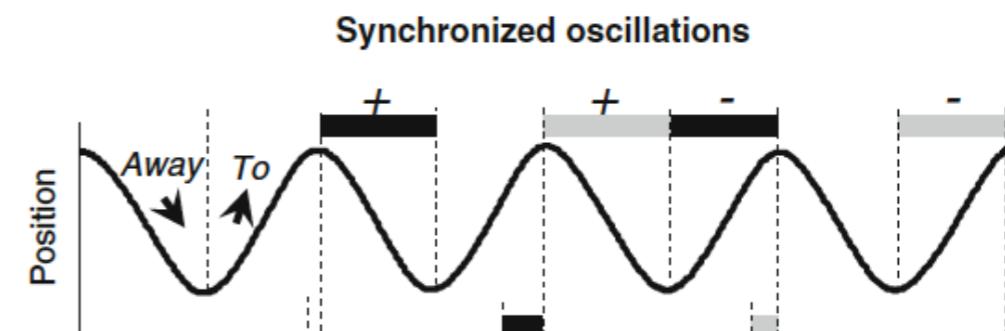
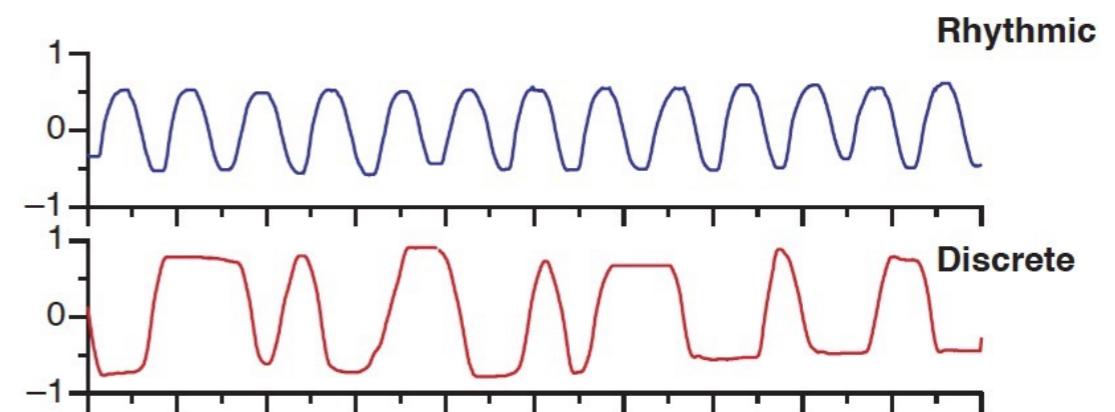
e.g. walking, chewing, scratching

- **Discrete**

e.g. reaching, grasping, kicking



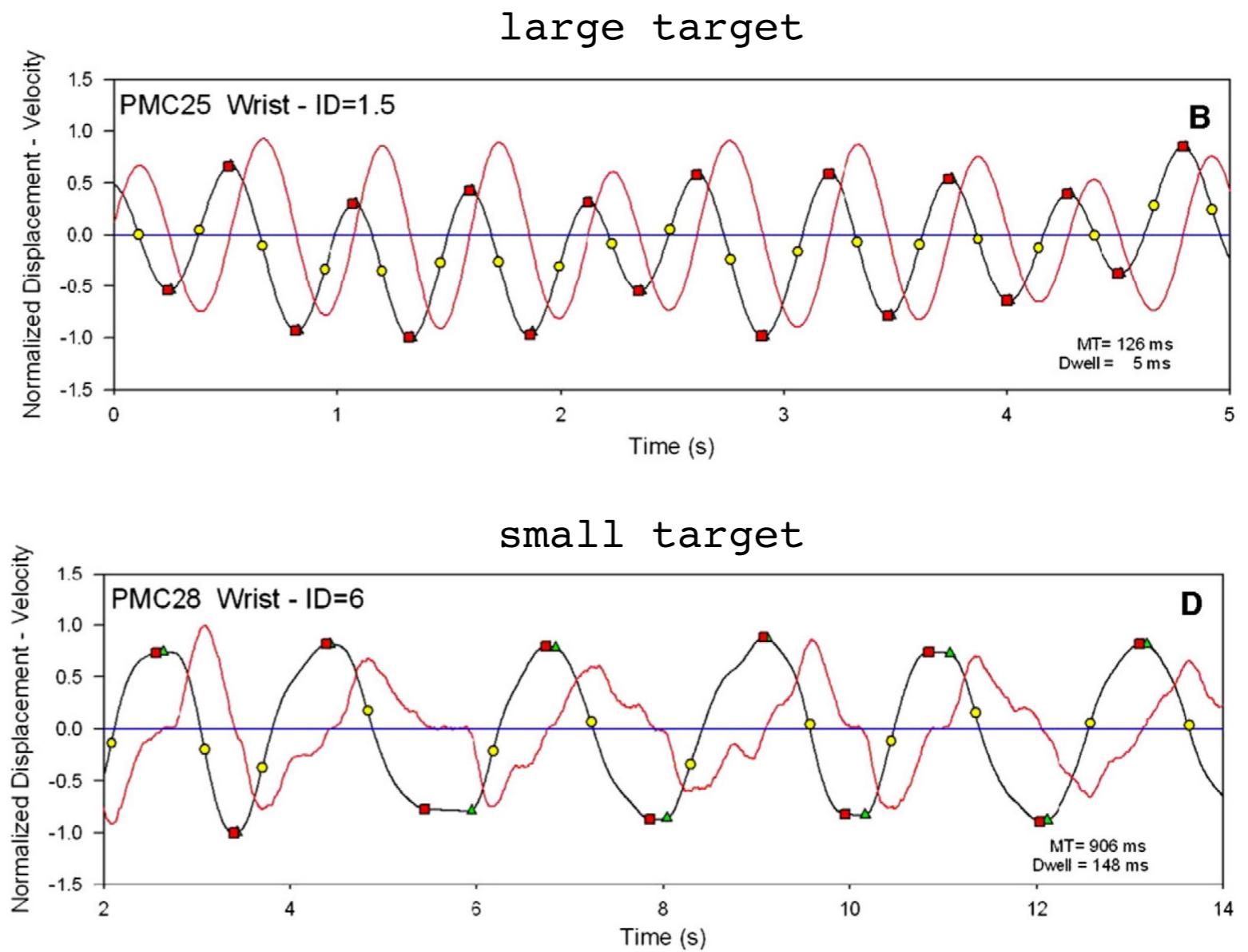
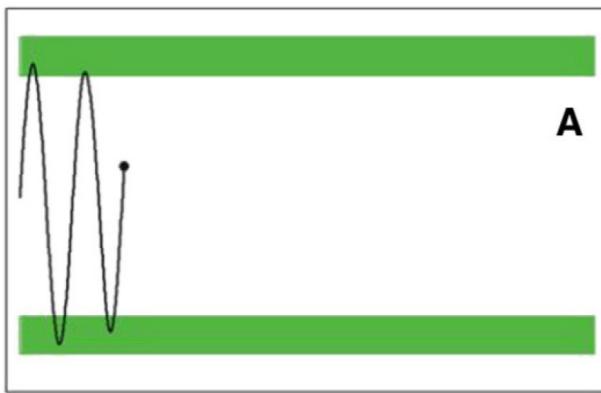
**DISCRETE-RHYTHMIC  
RHYTHMIC-DISCRETE**



— Schaal et al., 2004, *Nat Neurosci* 7:1136

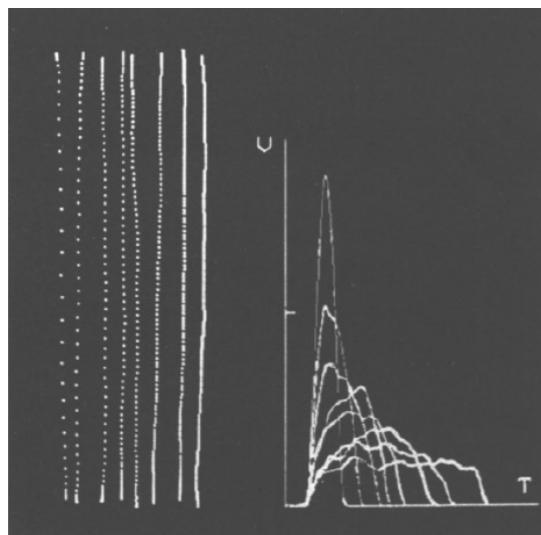
— Torre & Balasubramaniam, 2009, *Exp Brain Res* 199:157

# SLOW MOVEMENTS

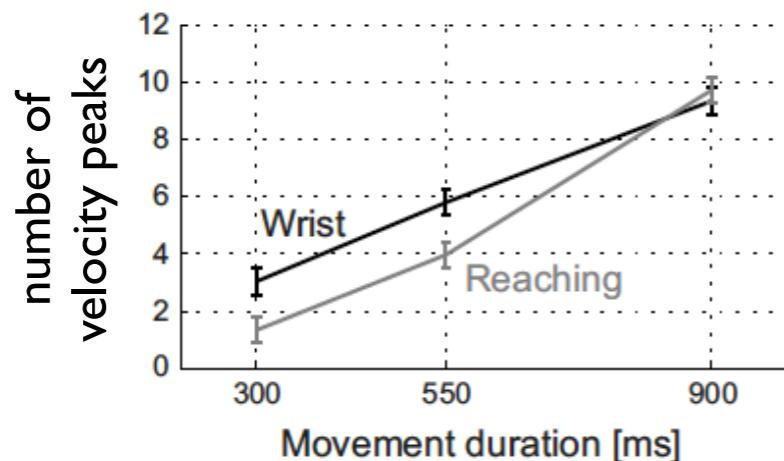


# SLOW MOVEMENTS

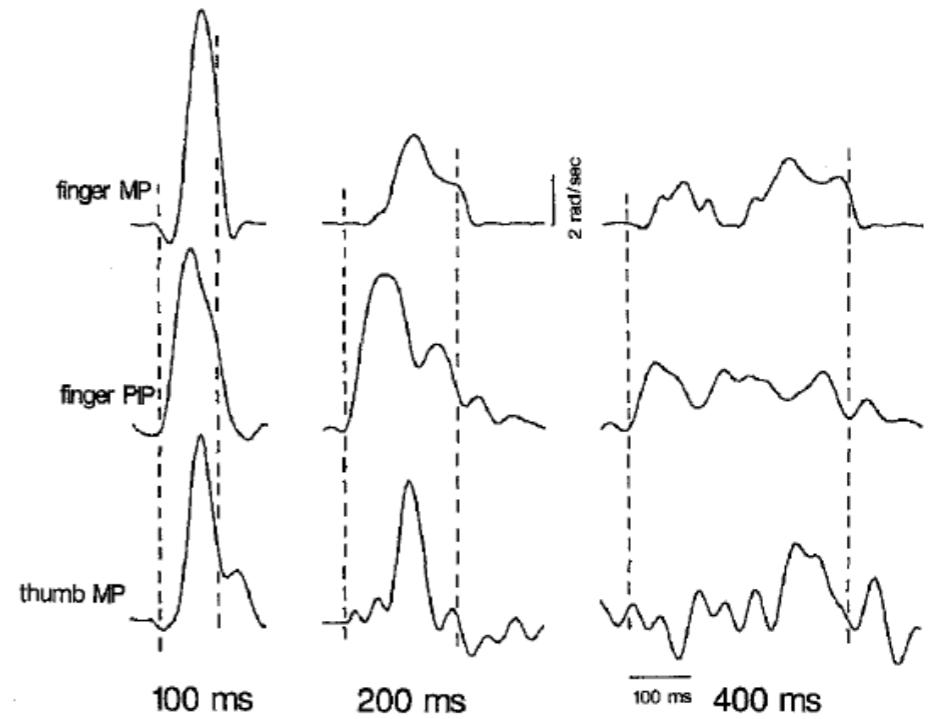
**Are not smooth**  
segmentation



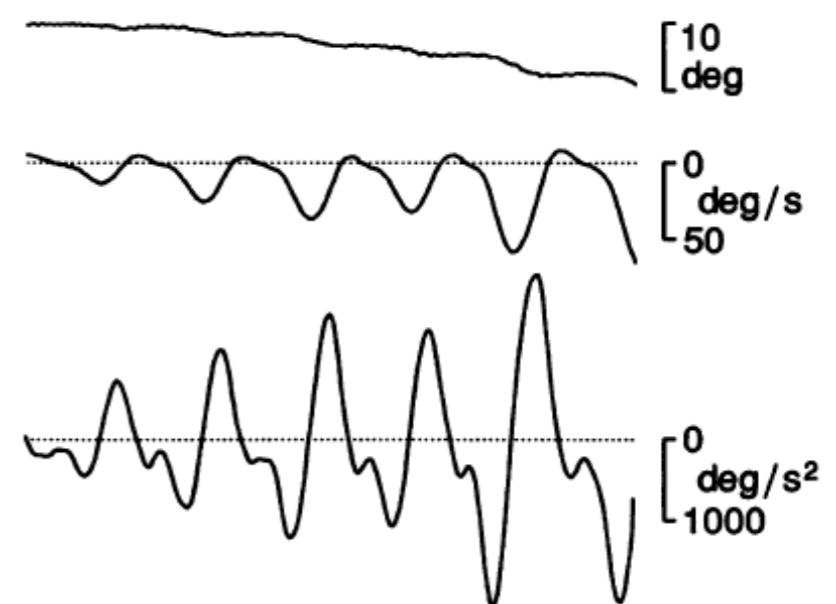
— Morasso et al.,  
1983, *Acta Psychol*  
54:83



— Salmond et al., 2017,  
*J Neurophysiol* 117:1239



— Darling et al., 1988, *Exp Brain Res* 73:225



— Vallbo & Wessberg, 1993, *J Physiol (Lond)* 469:673

# POSTURE AND MOVEMENT

## Definition

**movement** — large and rapid displacement of focal body segments to subserve a goal-directed action

**posture** — small and slow displacements of the whole body to achieve postural orientation and equilibrium maintenance

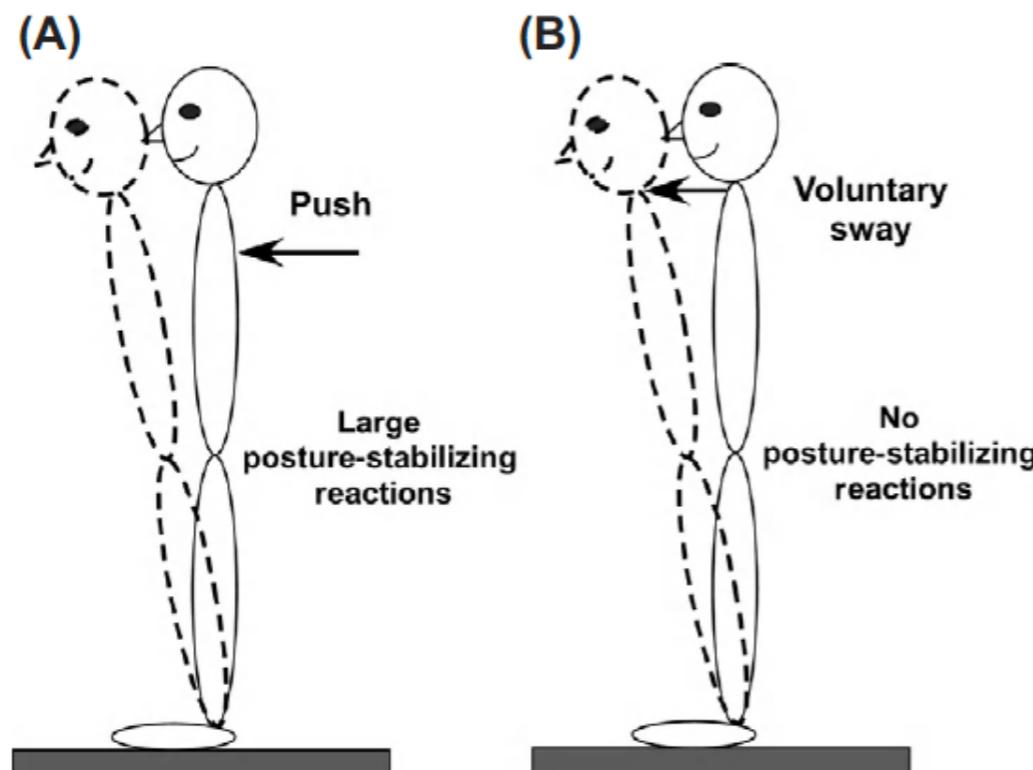


motor behavior is a continuous superimposition of movement and posture periods

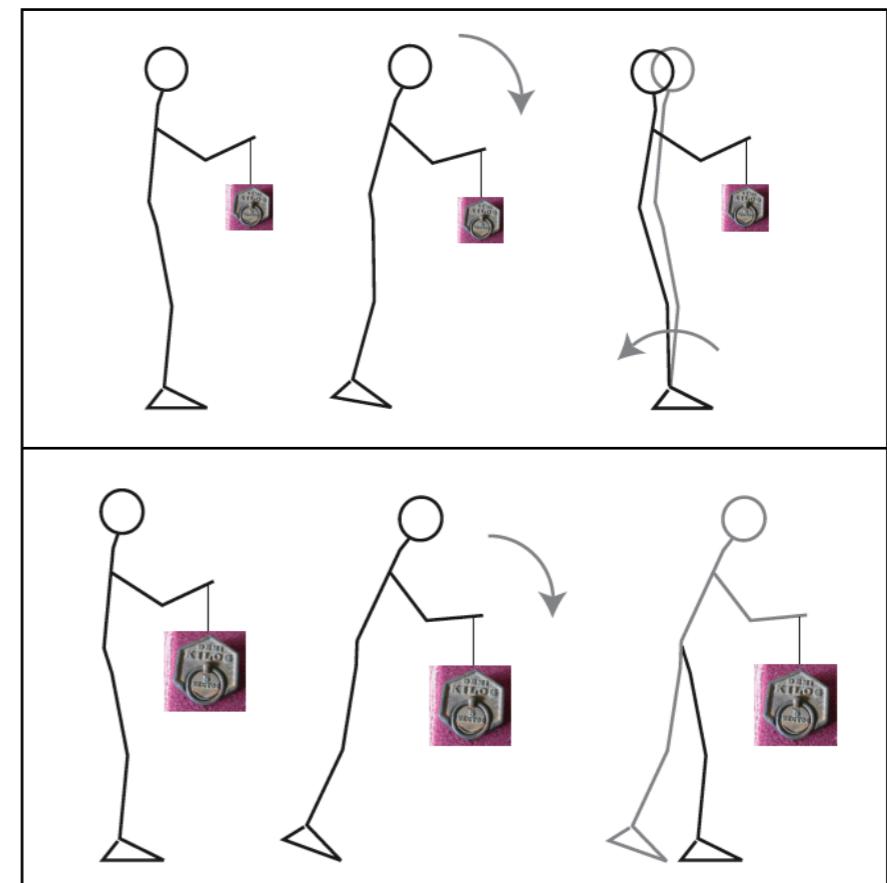
# POSTURE AND MOVEMENT

## Paradox

how is it that we can move from one posture to another without triggering resistance from all these posture-stabilizing mechanisms? (von Holst)



— Latash, 2012, *Fundamentals of Motor Control*, Academic Press

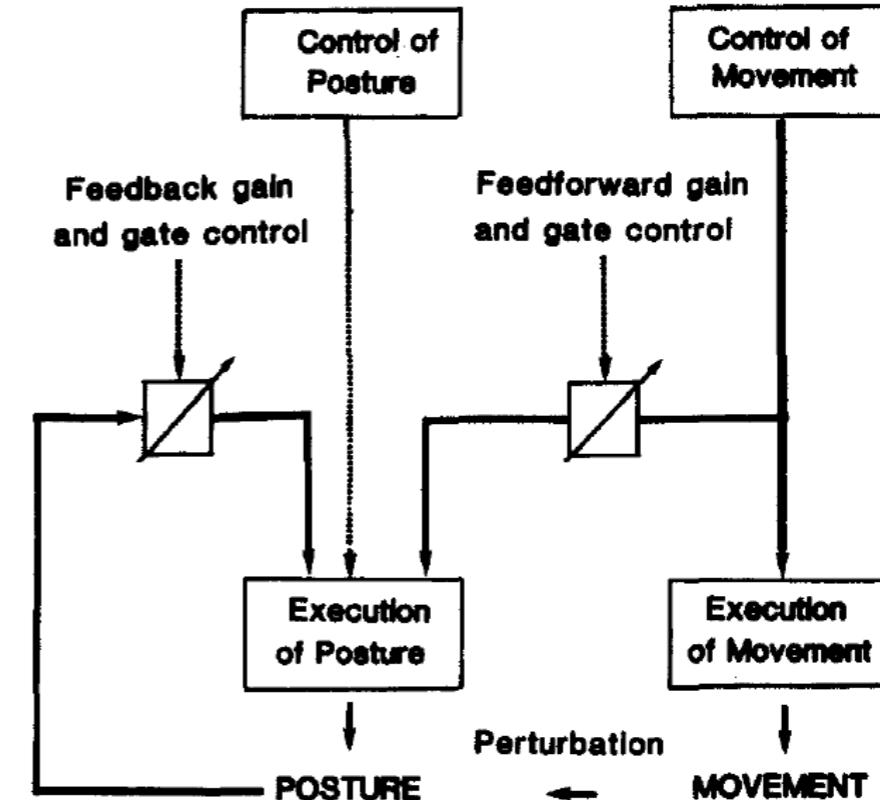
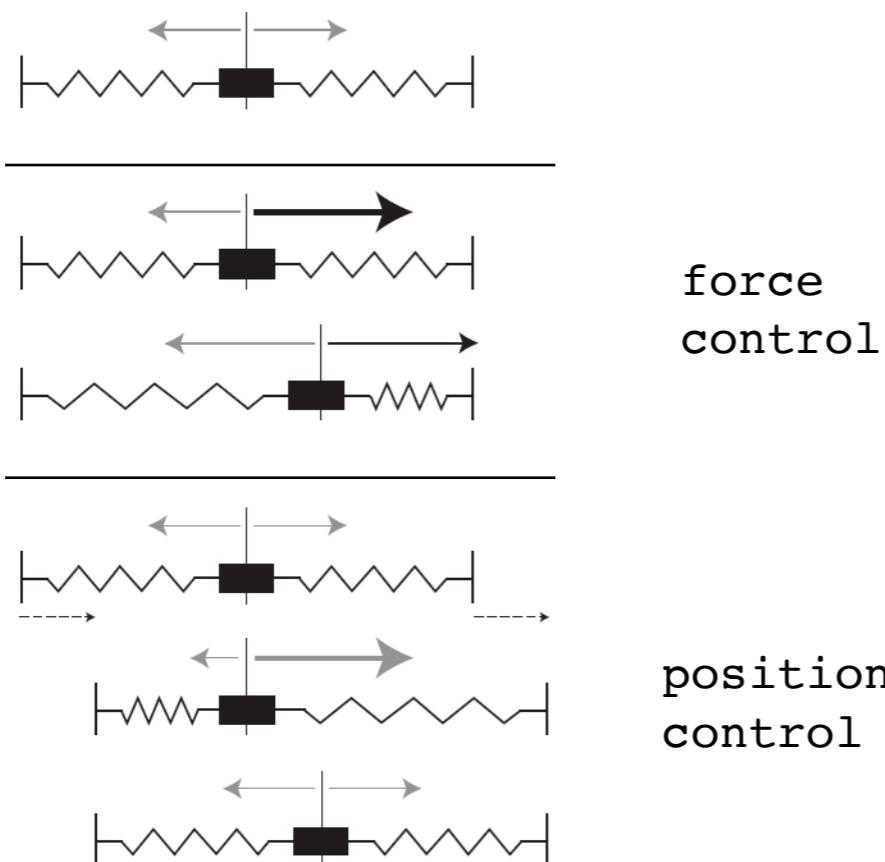


single kinematic chain  
single motor program?

# POSTURE AND MOVEMENT

## Shared or separated processes?

- movement derives from posture
- movement and posture are subserved by different processes
- *posture derives from movement?*



— Ostry & Feldman, 2003, *Exp Brain Res* 153:275

— Massion, 1992, *Prog Neurobiol* 38:35

# WHAT IS MOTOR CONTROL?

- **Complex problem with multiple levels of redundancy (task-space, body-space, muscle-space, neural-space), nonlinearities, uncertainty, noise and time delays**
- **Flexible in time and space**
- **Apparent ease in the control of action**
- **Stereotyped behaviors, structured variability**  
motor constancy, uniqueness of action, stability and consistency of action, modifiability of action

— Bernstein, 1967, *The Co-ordination and Regulation of Movements*, Pergamon

— Glencross, 1980, in *Tutorials in Motor Behavior*, North-Holland

# **WHAT IS «NOT» MOTOR CONTROL?**

- **Multijoint movements are not scaled-up versions of single-joint movements.**  
**Multijoint movements are influenced by intersegmental dynamics**
- **No « elementary » movements which would be equivalent to elementary sensory stimuli (complex problems to solve even for the simplest motor acts)**
- **Not a chain of reflexes. Not a rigid « trajectory-following » system**