

Human Motor Performance in Robot-Assisted Surgery

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Robotics for Medical Interventions

Rehabilitation



Prosthetics



Robot-assisted surgery



Robot-Assisted Minimally Invasive Surgery



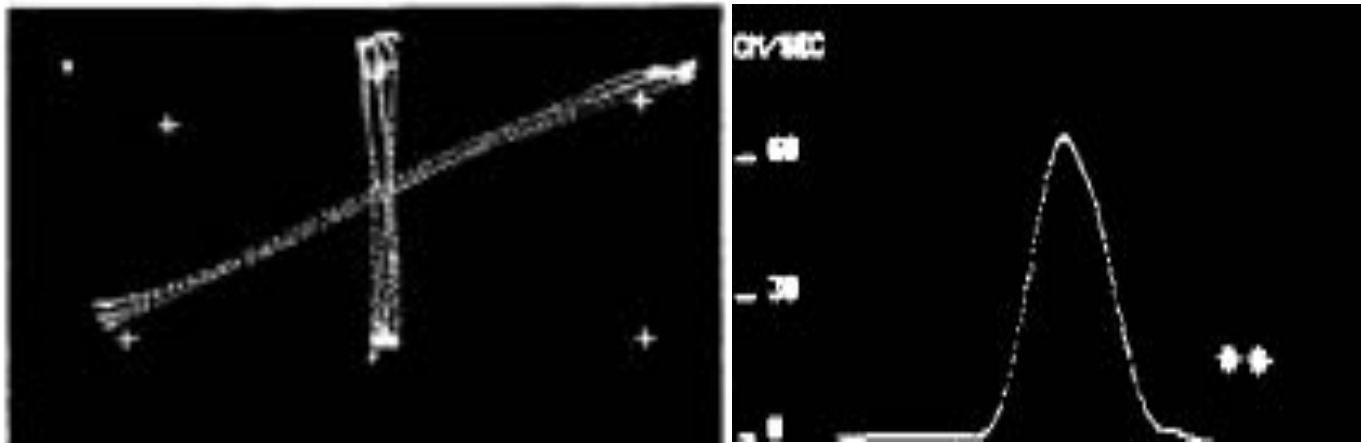
- Design does not fully consider the sensorimotor capabilities of the surgeon
- Training methods have not been optimized

Studying the sensorimotor system could impact both!

Computational Motor Control

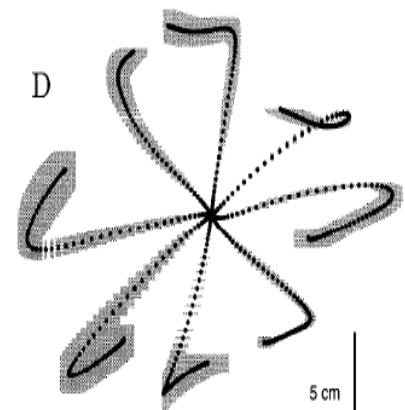
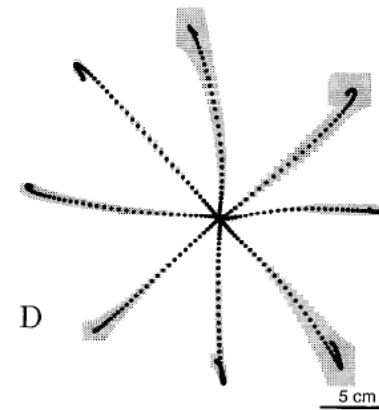
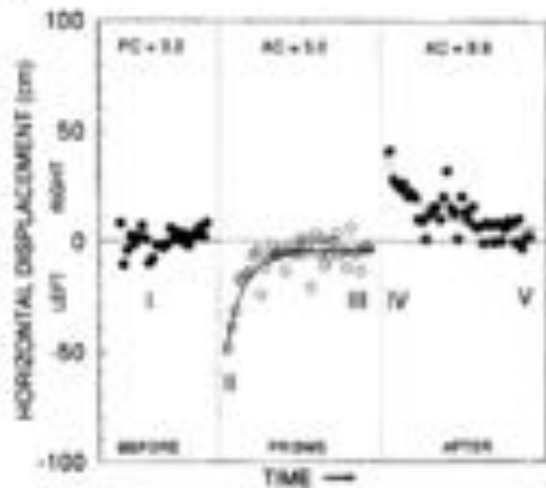
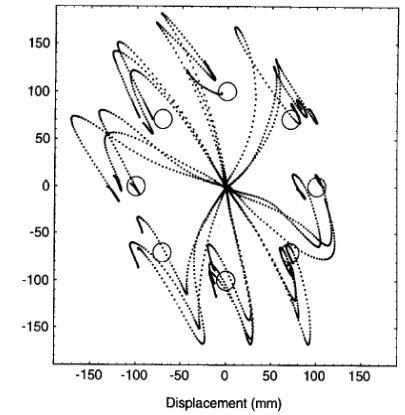
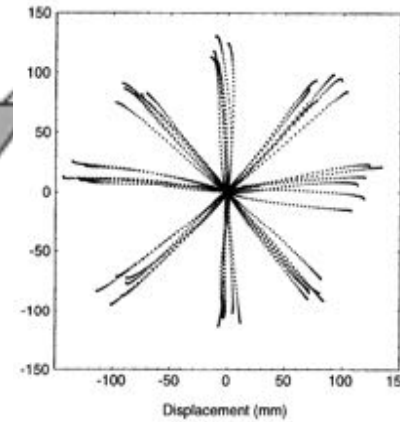
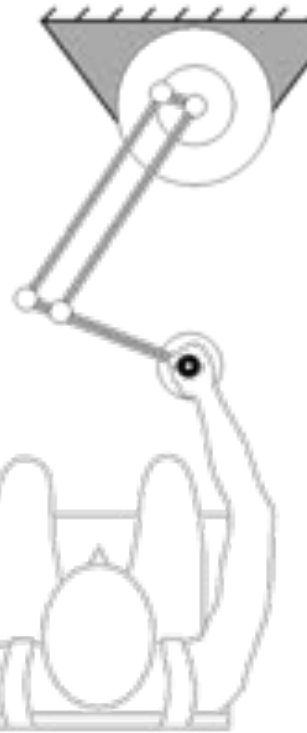
The science of how the brain controls motion and represents the external world

We move in surprisingly regular ways...



Morasso, 1981

Adaptation to Perturbations



Martin et al., 1996

Shadmehr and Mussa-Ivaldi, 1994

Take Home

To build robotic systems that are operated by **humans**, we should:

- Study the **human operator**
- Apply findings to design, control, and training

Operators interact with robotic devices

- This allows us to study the **human operator** in unprecedented ways



Surgery

Open



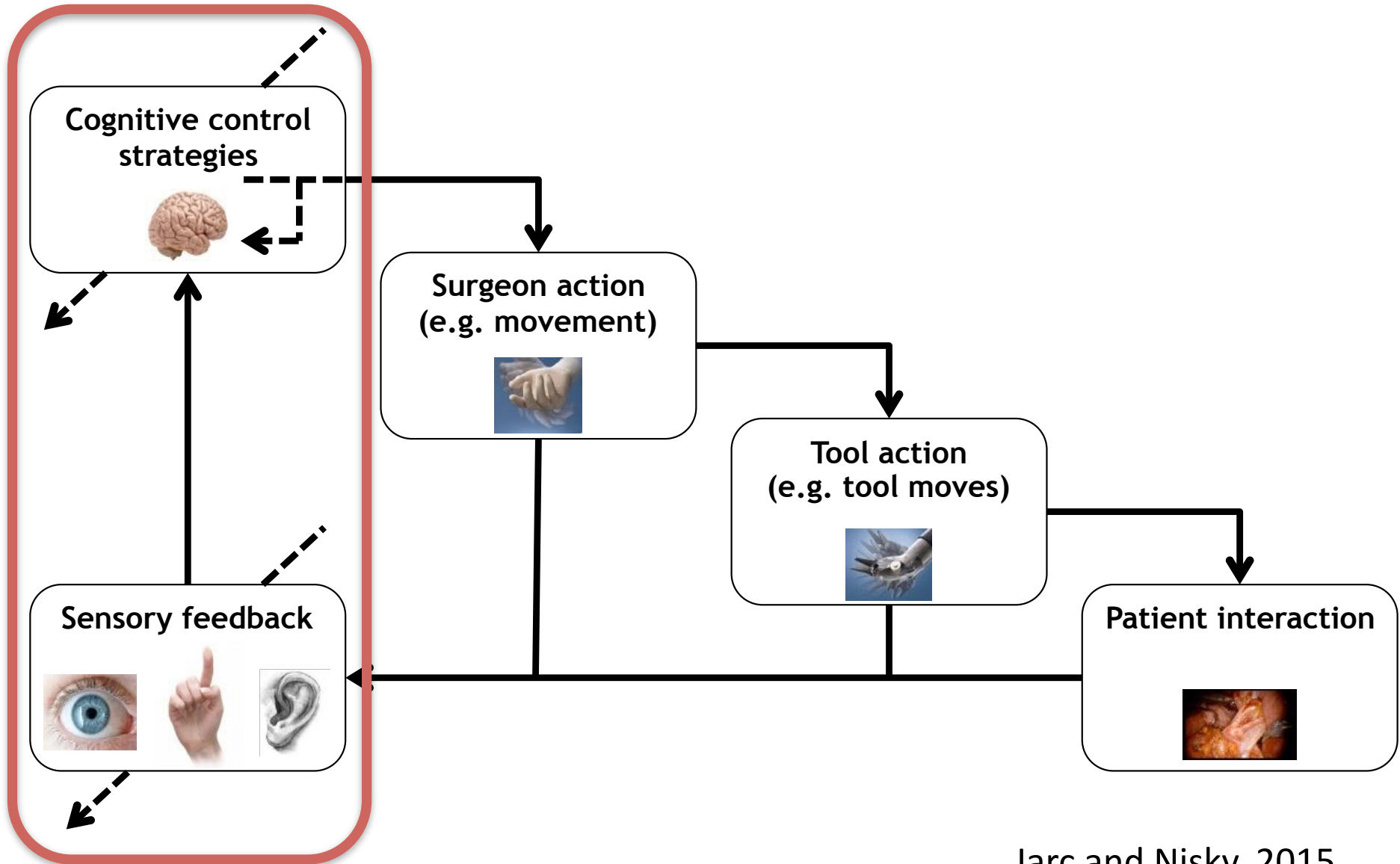
Minimally Invasive



Robot-Assisted



Sensorimotor Performance in RAS



Jarc and Nisky, 2015

Sensorimotor Performance in RAS

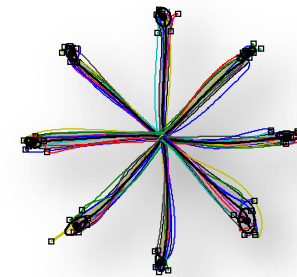
Can we use (and extend) what we know about
human motor control
to improve
design, control, and training
in
Robot-Assisted Surgery?

Sensorimotor Performance in RAS

Compare **teleoperated vs. freehand** movements, and **expert vs. novice** participants

- **Teleoperation vs. freehand** => robot design
- **Experts vs. novices** => skill evaluation and training

(1) Tool-tip kinematics



(2) Arm posture variability

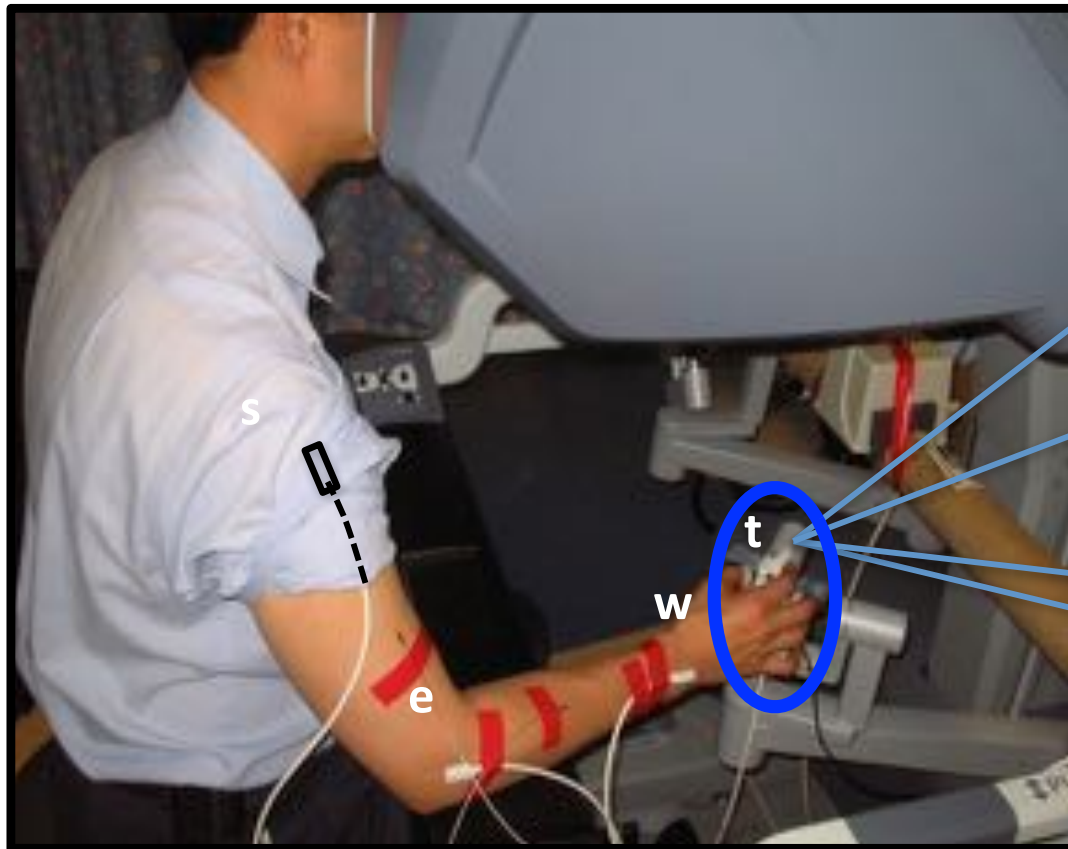


Experimental Setup

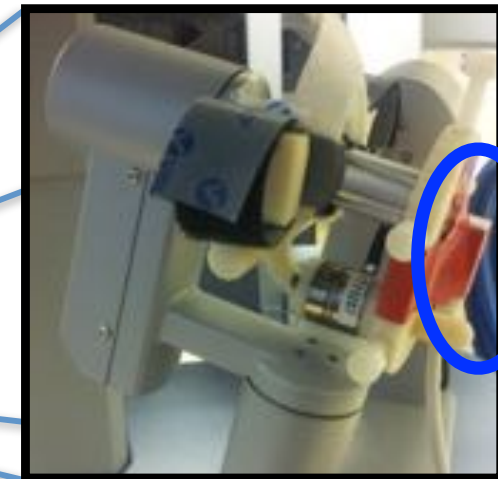


Experimental Setup

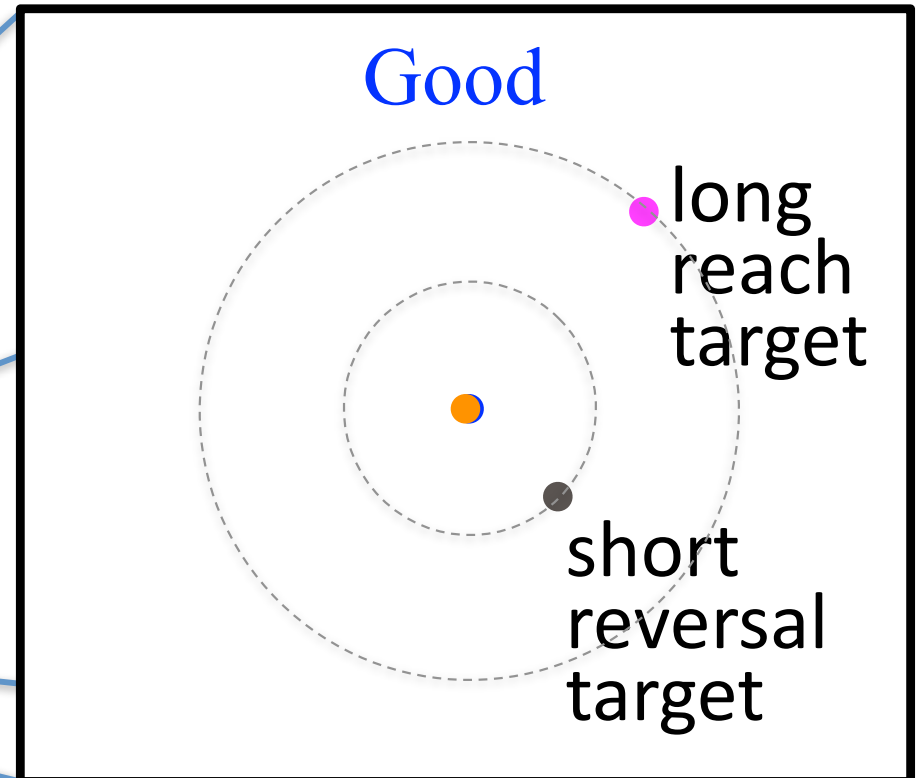
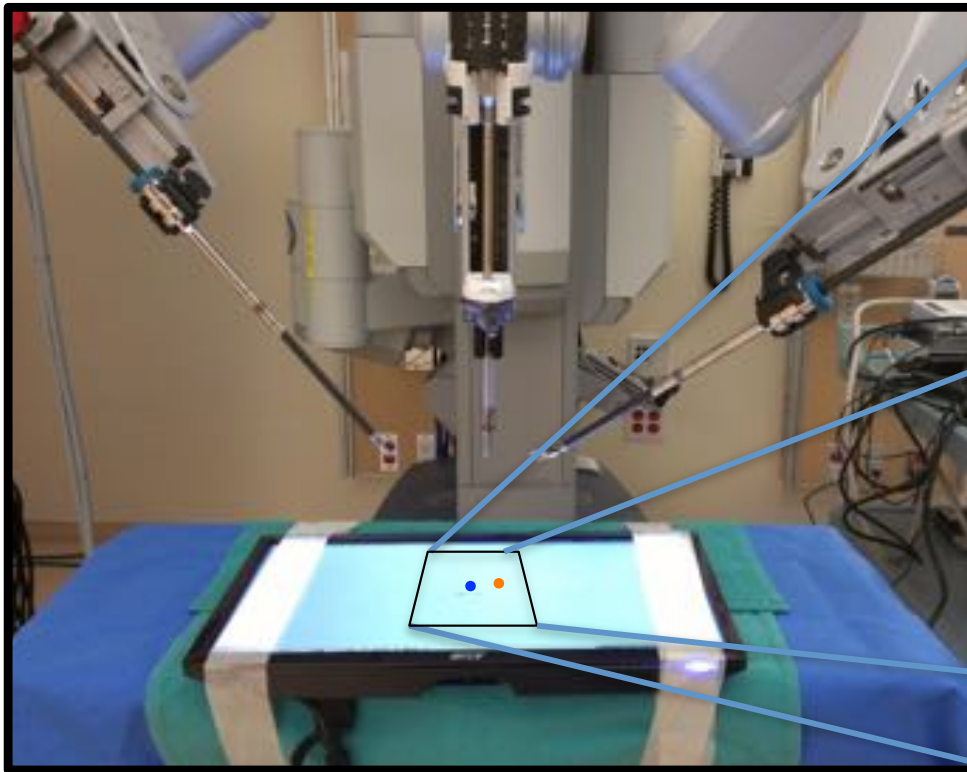
Pose trackers on user arm



Grasp fixture –
position and force sensing
at tool tip



Experimental Procedures



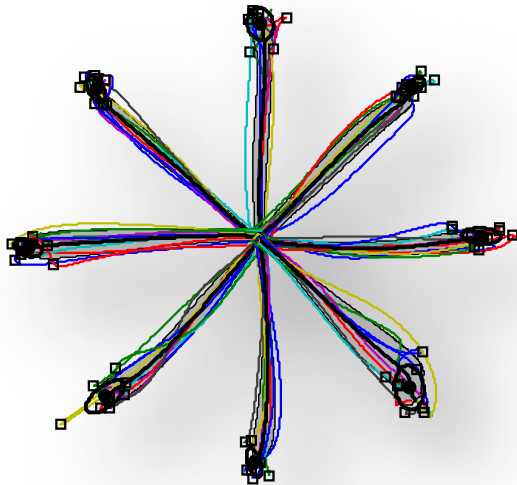
Teleoperation



Freehand



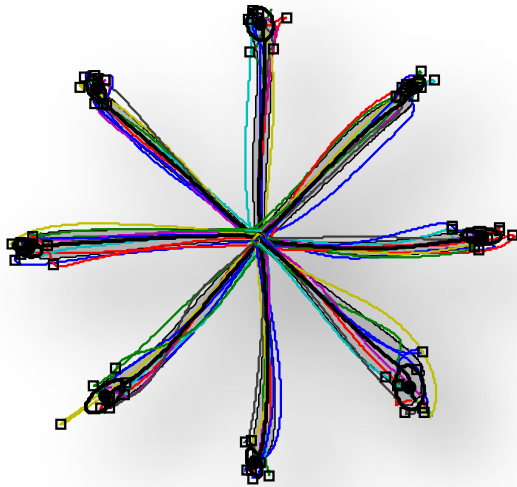
Kinematics



Variability



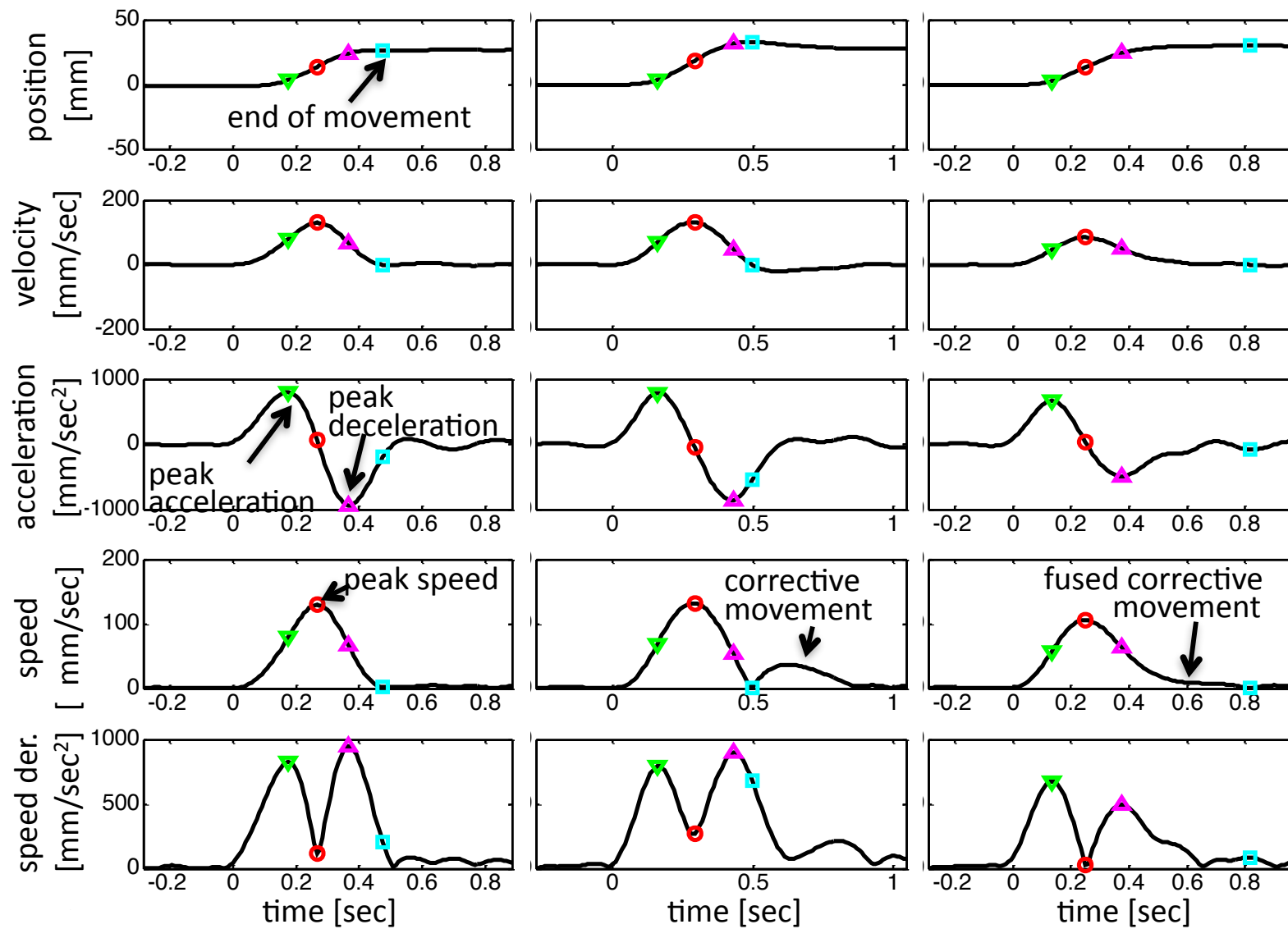
Kinematics



Variability

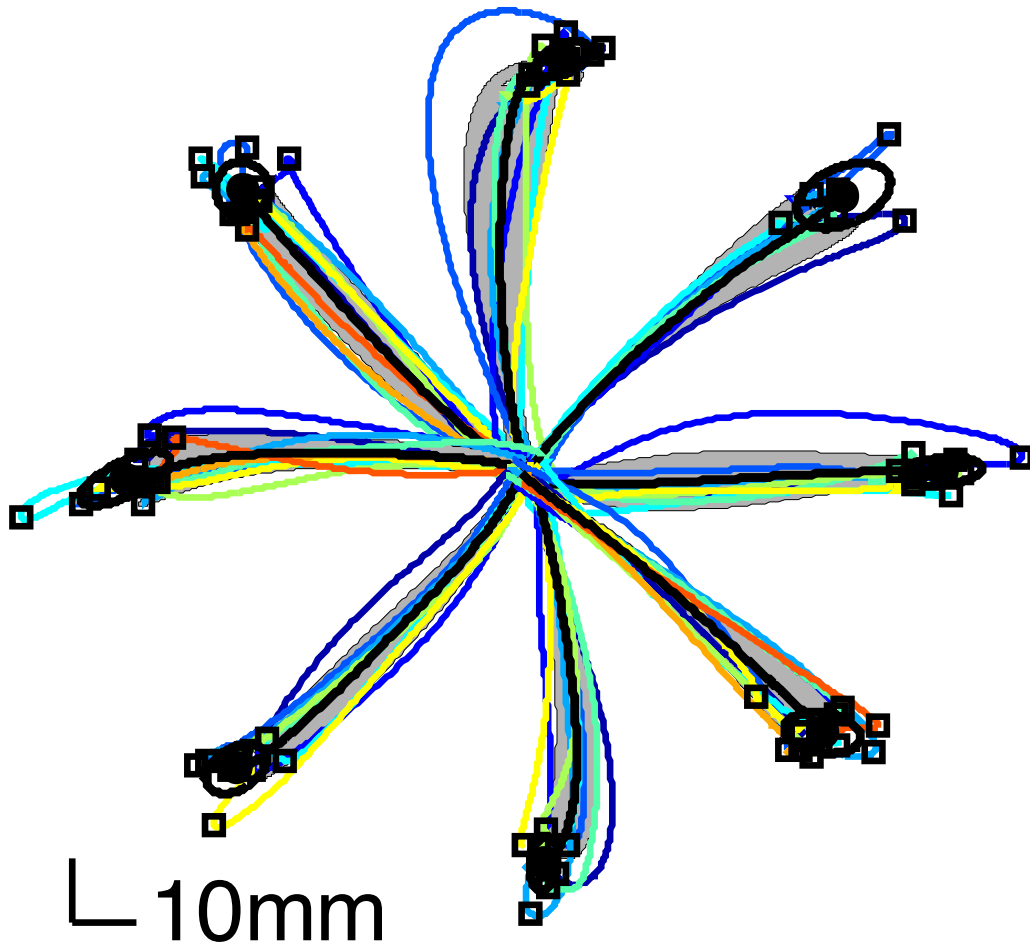


Data Analysis - Reach

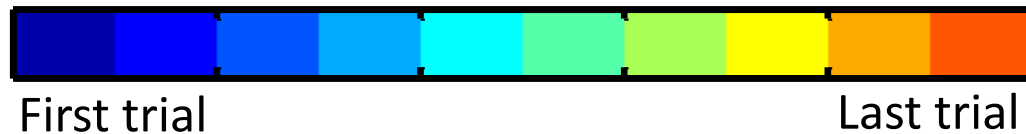


Deviation from Straight Line

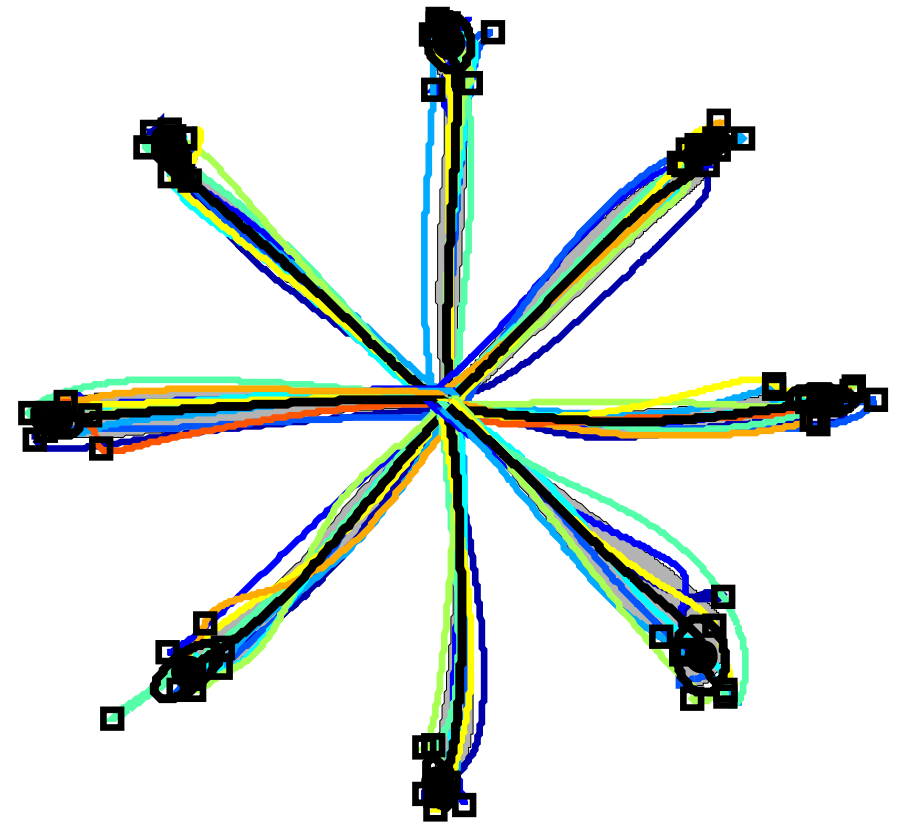
Novice



10mm



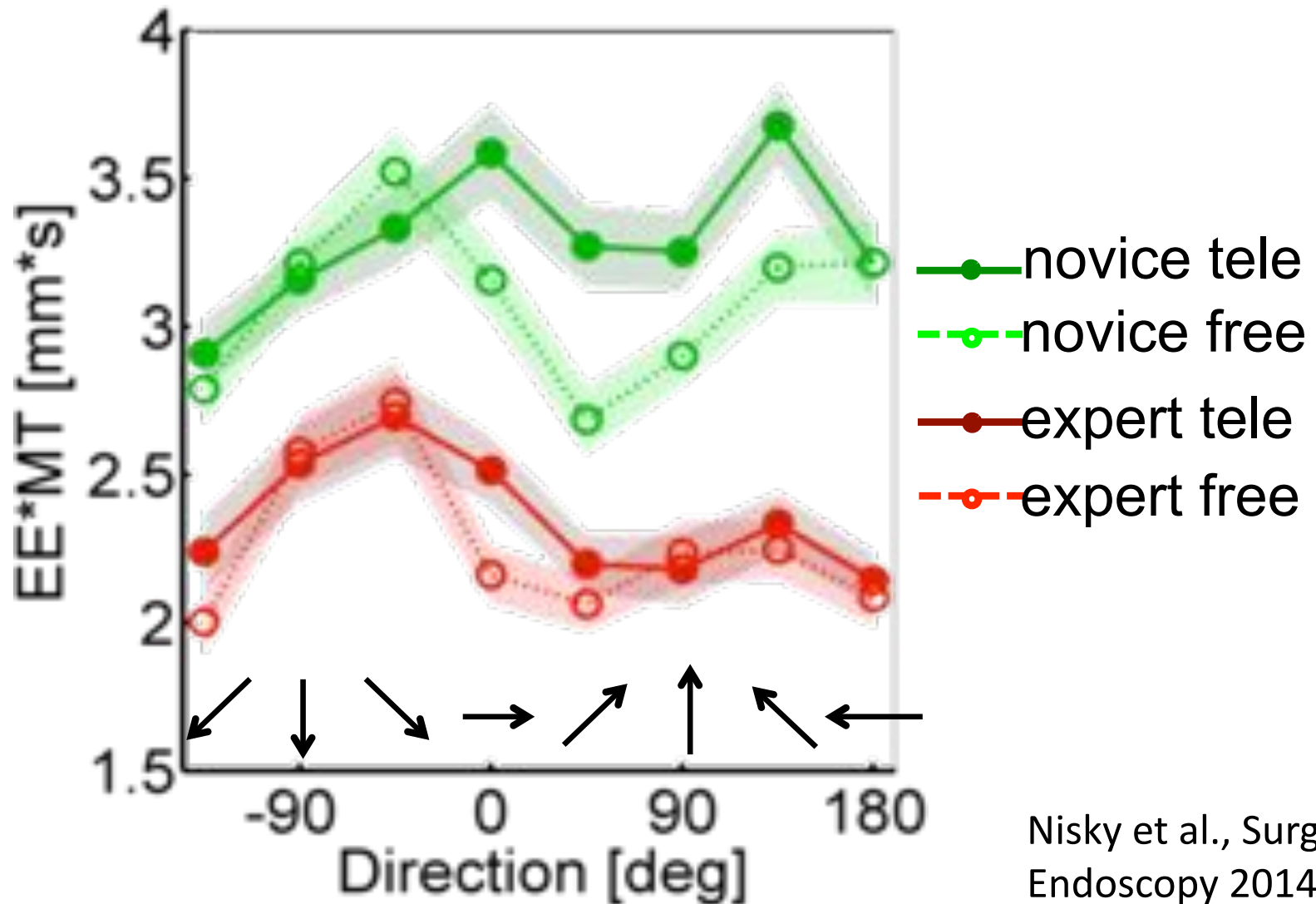
Expert



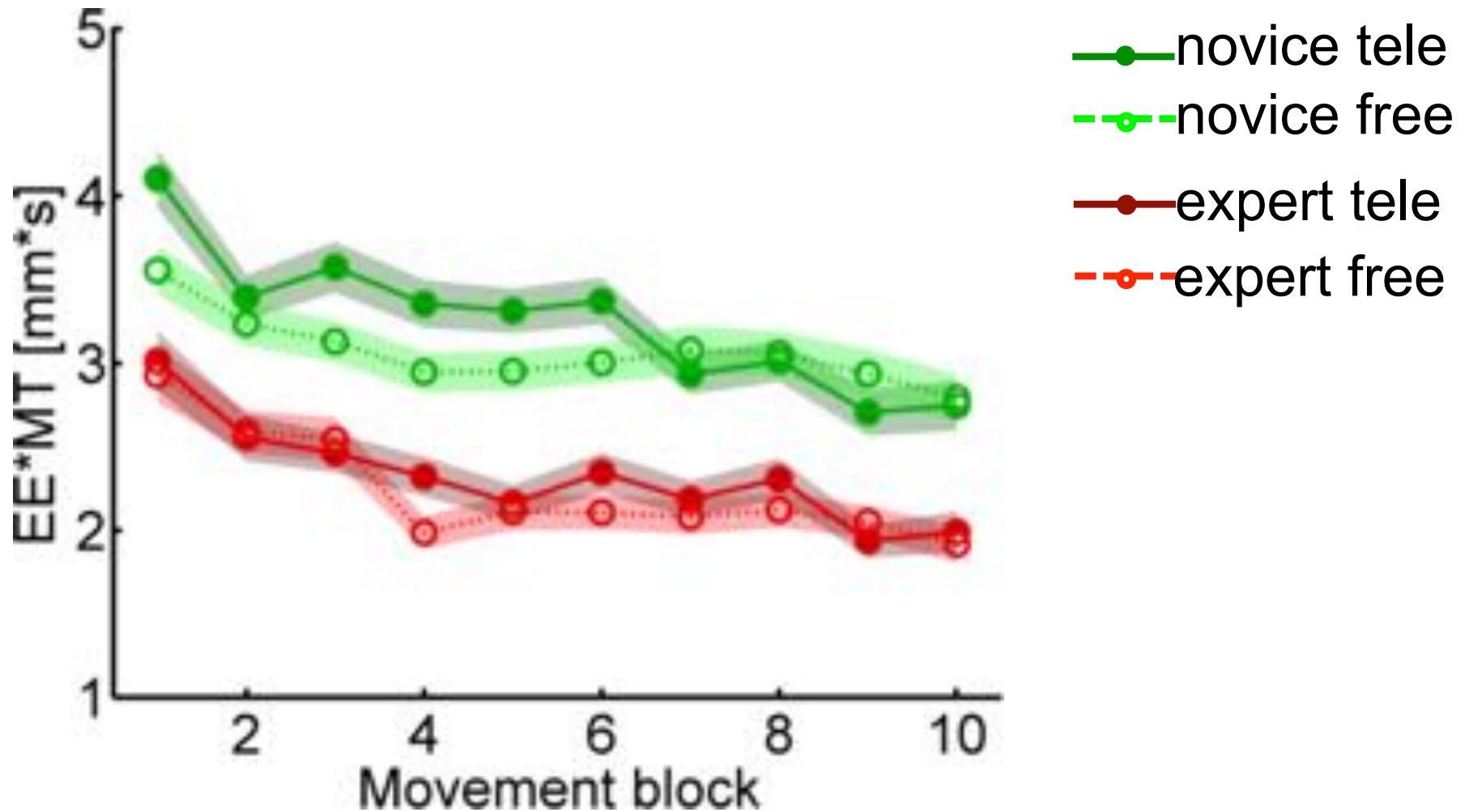
Nisky et al., Surgical
Endoscopy 2014

Performance

Endpoint Error * Movement Time



Learning effects

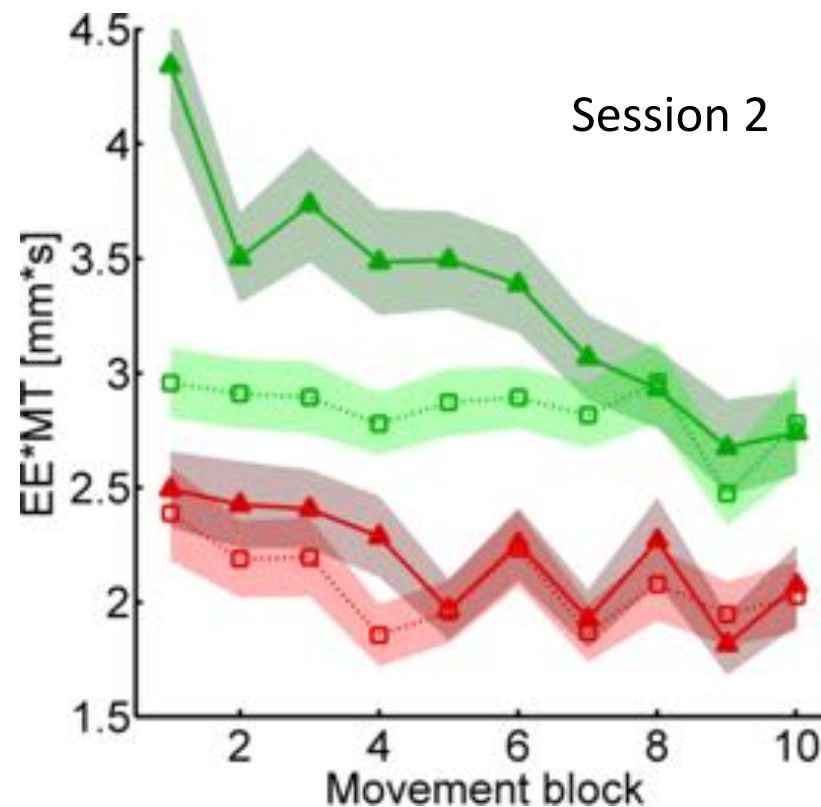
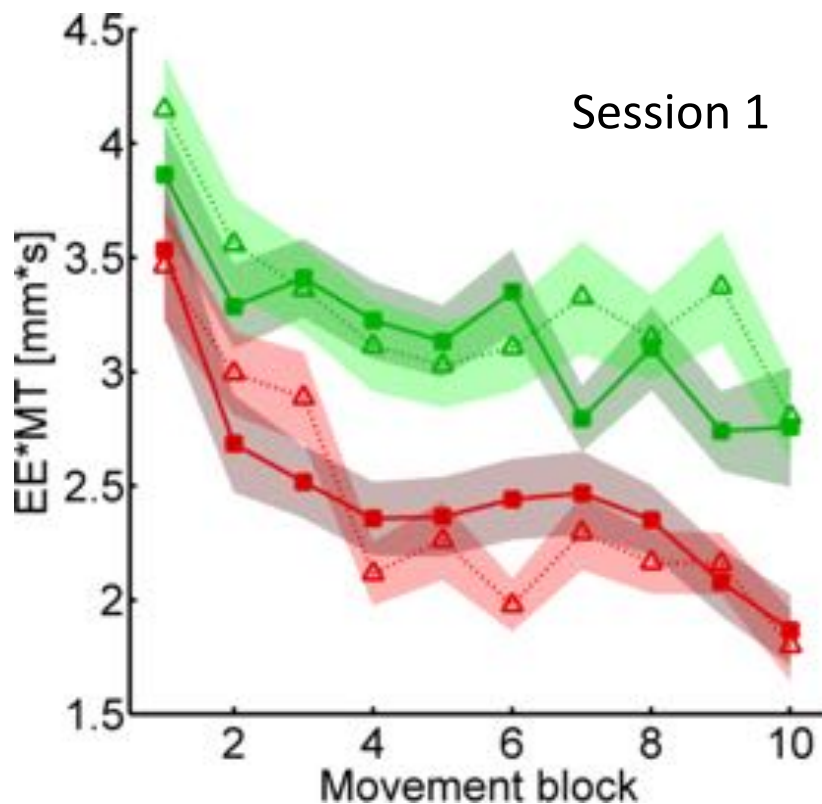


Learning effects

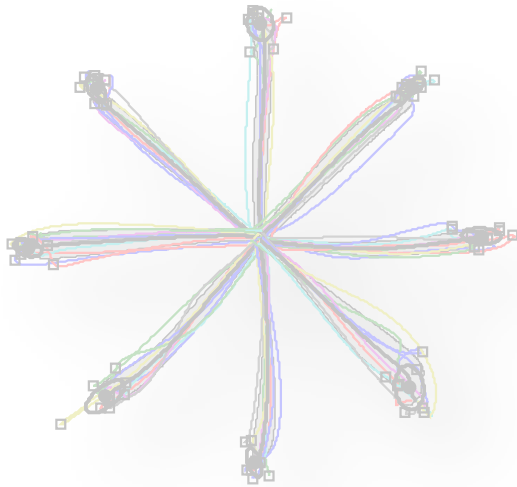
All groups learn the task within 3-4 movement blocks in the first session

Teleoperating novices also learn system dynamics

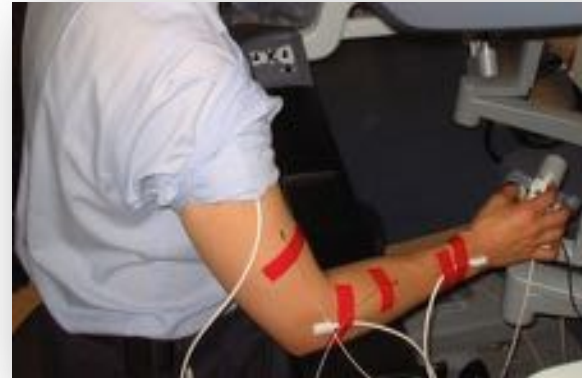
- novice tele
- -○- novice free
- expert tele
- -○- expert free



Kinematics



Variability



Redundancy and Variability

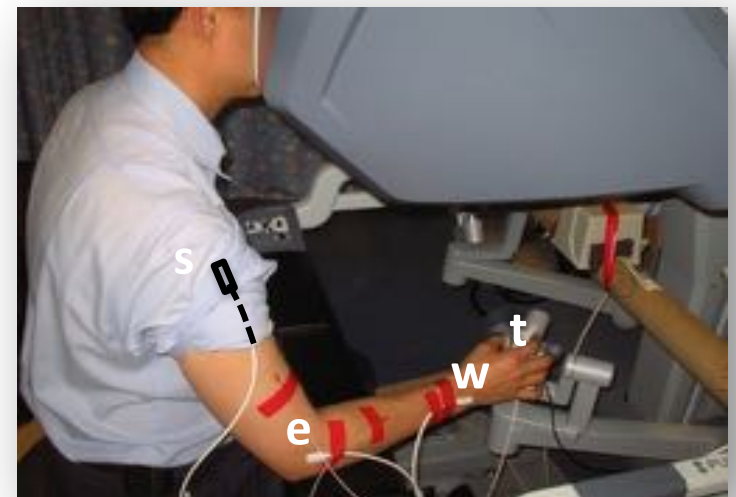
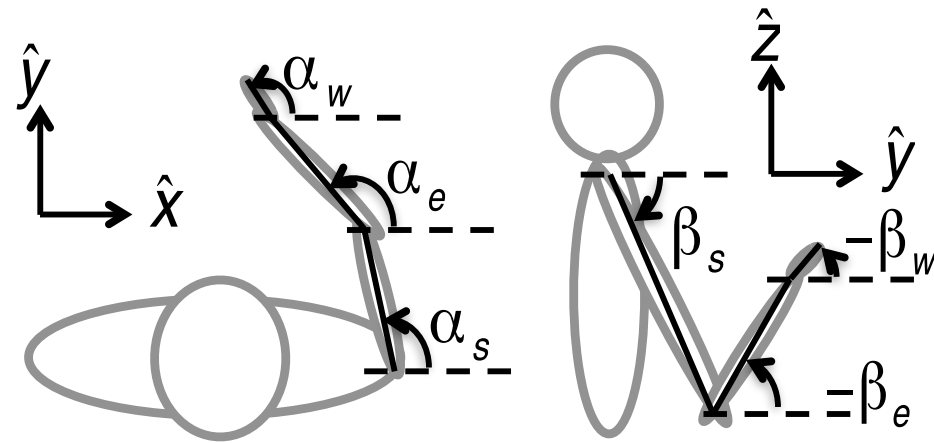
Human arm is a **redundant** manipulator

How is redundancy resolved?

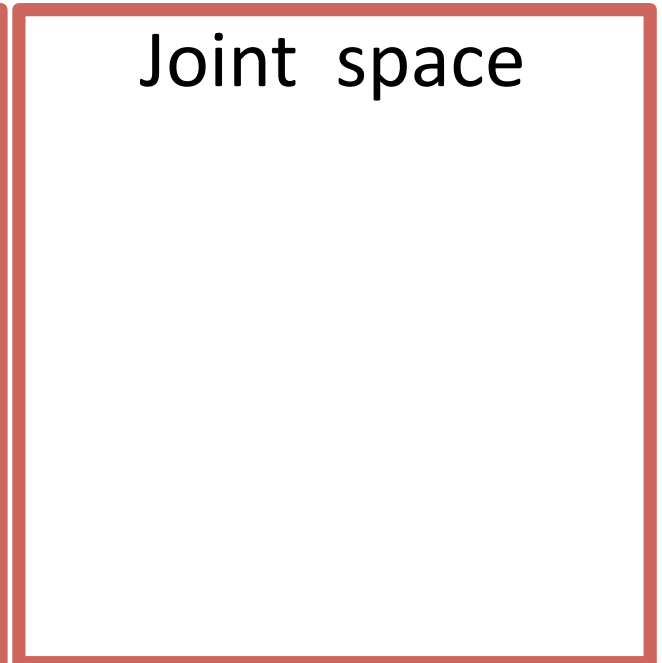
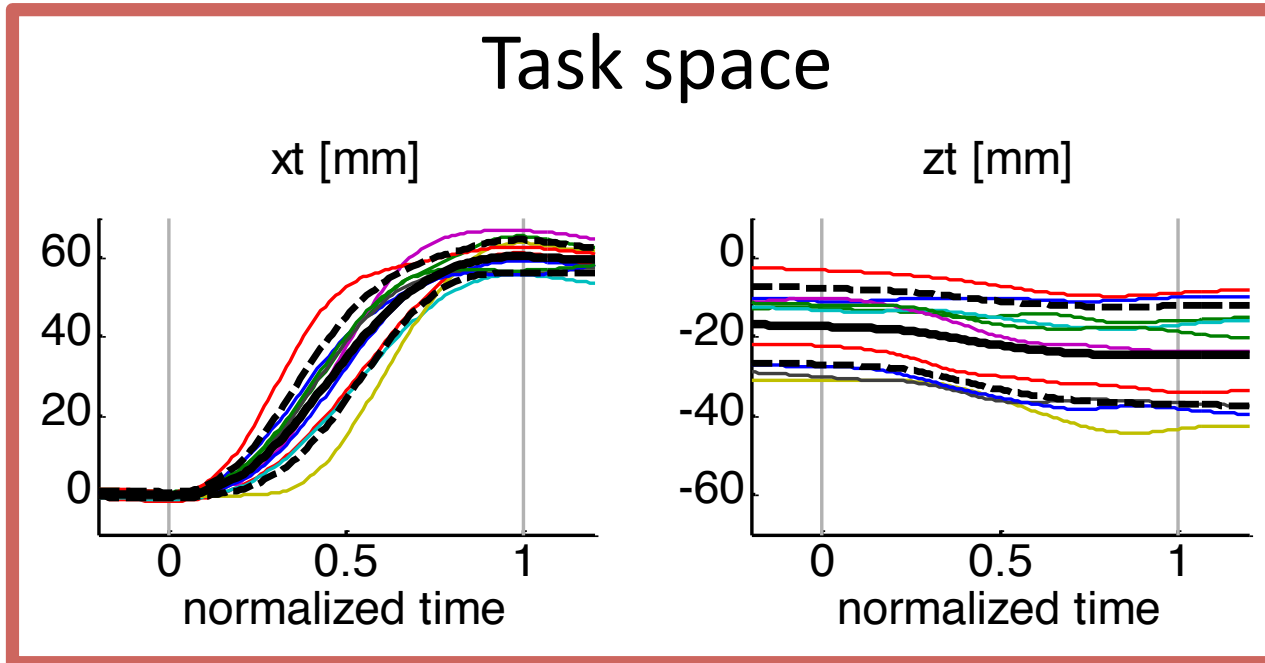
- Bernstein, 1967

Motor system constrains only task relevant variability

- Uncontrolled Manifold Hypothesis Scholz and Schoner, 1999
- Minimum intervention principle Todorov 2002



Uncontrolled Manifold Hypothesis



2 kinds of trial-to-trial
variability in joint angles

- Changes task performance: V_{task}
- Doesn't change task performance: V_{other}

Variability
coordination

$$R_V = \log(V_{\text{other}}/V_{\text{task}})$$

$R_V > 0$ stabilize
 $R_V = 0$ independent

Variability in Joint Space - Uncontrolled Manifold

Forward kinematics

$$\mathbf{x}[t] = F(\mathbf{q}[t])$$

Linearize FWD kinematics

$$\mathbf{x}[t] - \bar{\mathbf{x}}[t] = \mathbf{J}(\bar{\mathbf{q}}[t])(\mathbf{q}[t] - \bar{\mathbf{q}}[t])$$

Calculate null space

$$\mathbf{J}(\bar{\mathbf{q}}[t]) \cdot \mathbf{e} = 0$$

Project variance onto null and orthogonal spaces

$$\mathbf{q}_{\text{UCM}}[t] = \mathbf{e}\mathbf{e}^T (\mathbf{q}[t] - \bar{\mathbf{q}}[t])$$
$$\mathbf{q}_{\text{ORT}}[t] = (\mathbf{q}[t] - \bar{\mathbf{q}}[t]) - \mathbf{q}_{\text{UCM}}[t]$$

Calculate log of
variance ratio

$$R_v[t] = \log \left(\frac{\sum_{i=1}^N (\mathbf{q}_{\text{UCM}}[t])^2 d_{ucm}^{-1} N^{-1}}{\sum_{i=1}^N (\mathbf{q}_{\text{ORT}}[t])^2 d_{task}^{-1} N^{-1}} \right)$$

Details in Nisky et al., ICRA 2013,
Nisky et al., IEEE TBME 2014

Variability Predictions

XY movements are stabilized $R_v > 0$

Z movements are not $R_v = 0$

Larger R_v of **experts**

Skill increases R_v (Muller and Sternad, 2004)

Smaller R_v in **teleoperation**

Coordination of Arm Posture Variability

The **task** requires only accurate **XY** movements

XY movements $R_V > 0$

Z movements $R_V = 0$

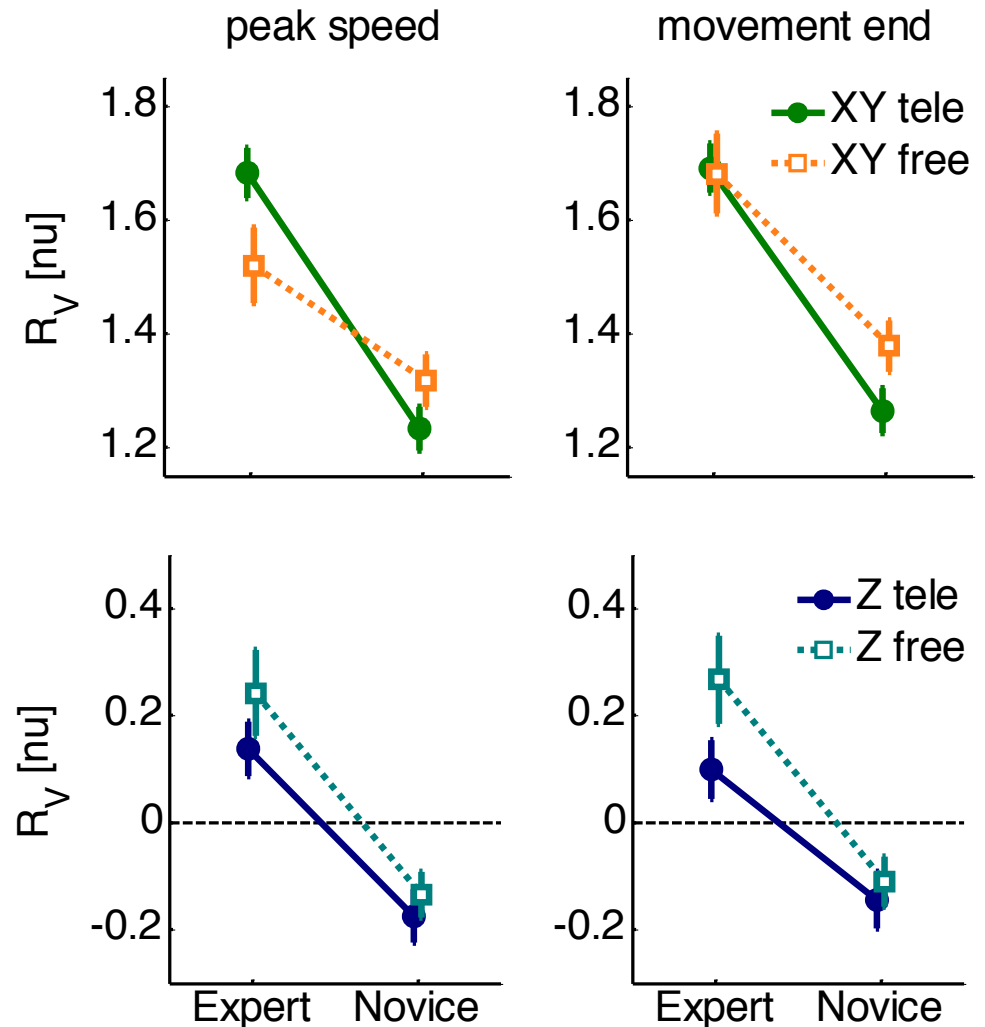
Experience

Larger R_V of experts

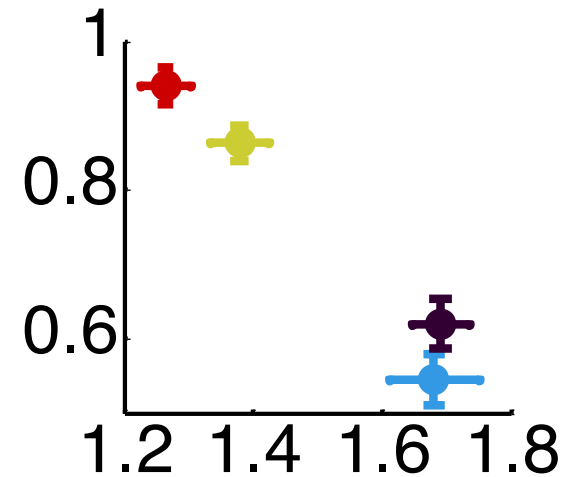
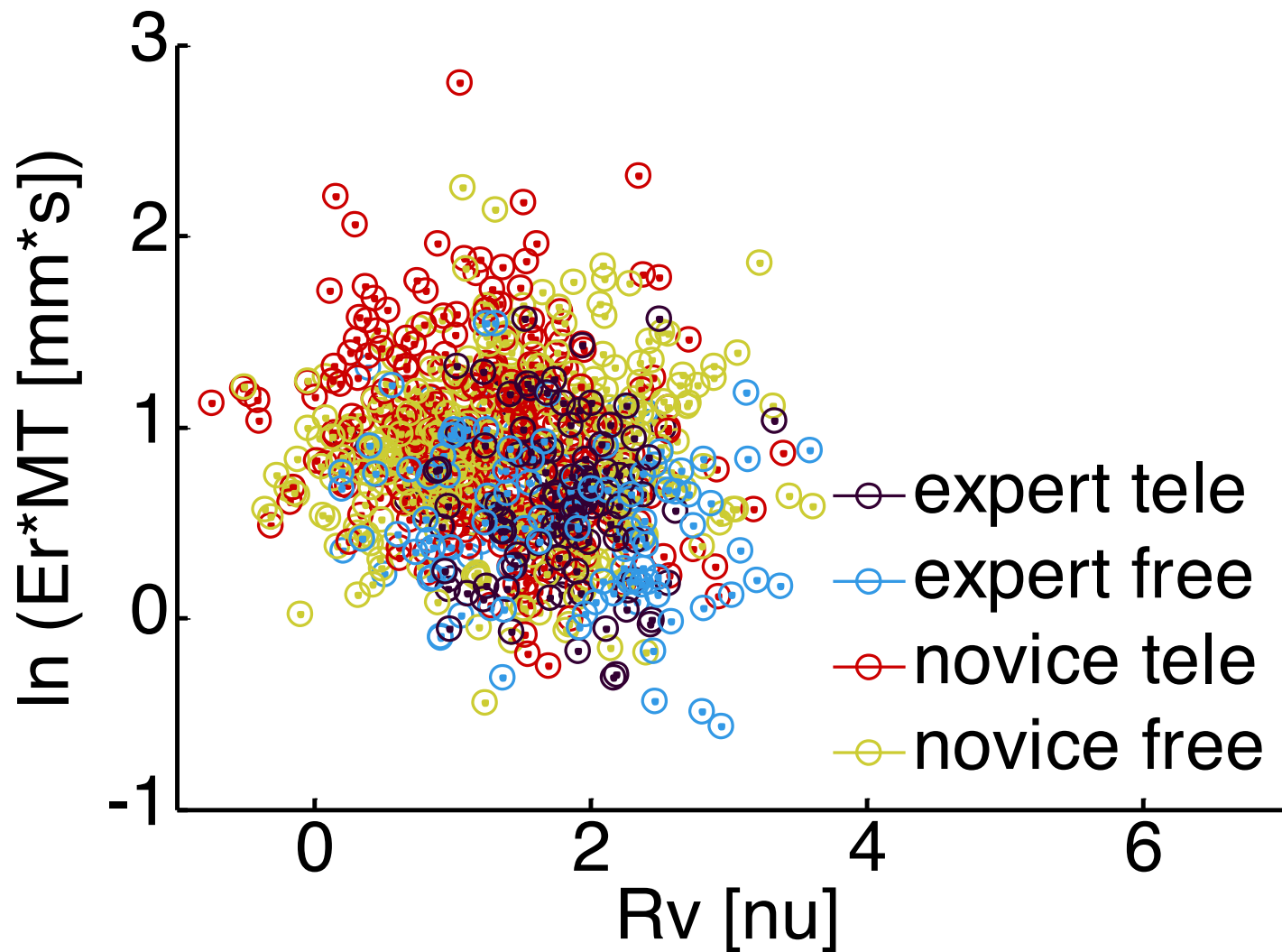
Teleoperation

Experts R_V increase

Novices R_V decrease



Rv and Performance



“Dexterous” Task: Needle driving

Clinically relevant movement

Complexity

3D movement

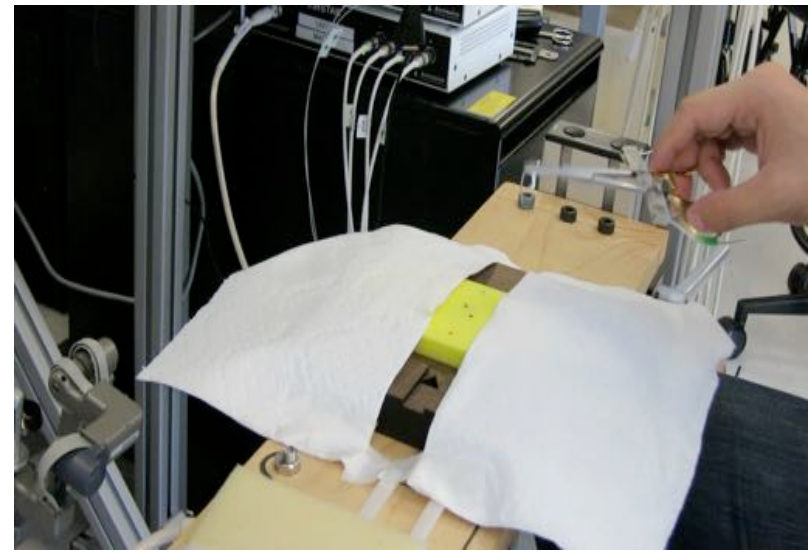
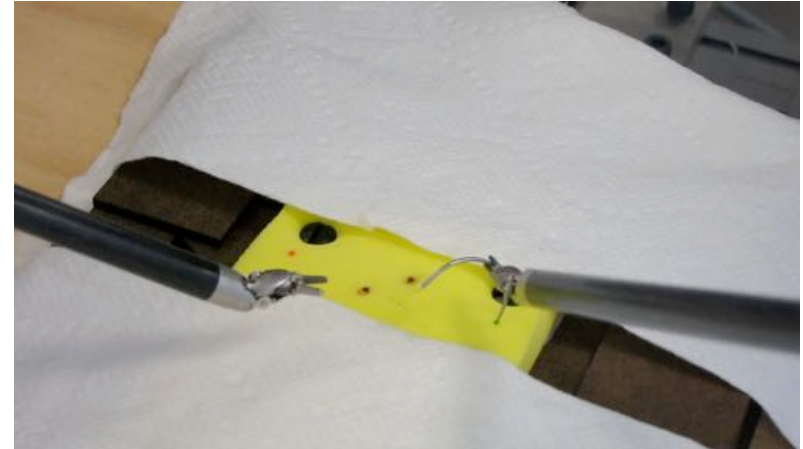
Tissue interaction

Orientation is critical

Conditions and participants

Teleoperated v. open

Experienced surgeons v. novices



Experimental Setup

Teleoperated - dVRK



Open – magnetic tracking instrumented needle driver

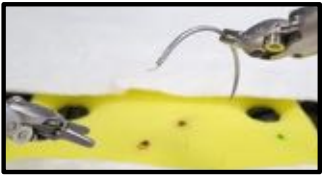


Needle Driving Task

1



2



3



4



5



6



7

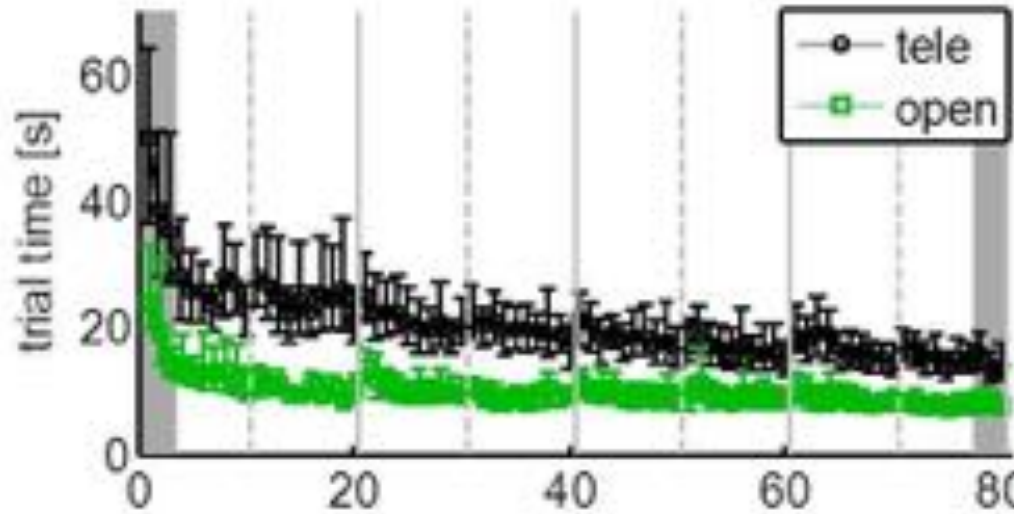


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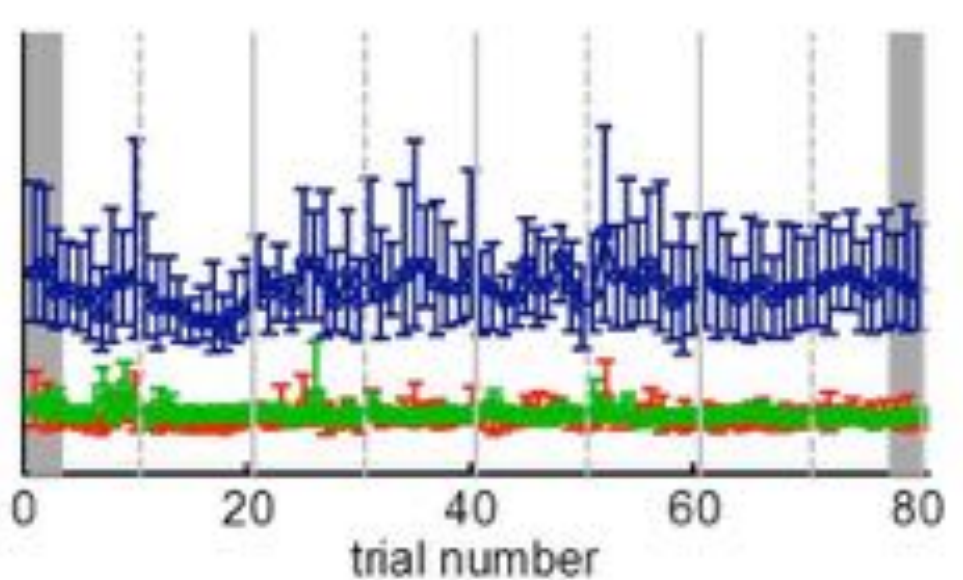
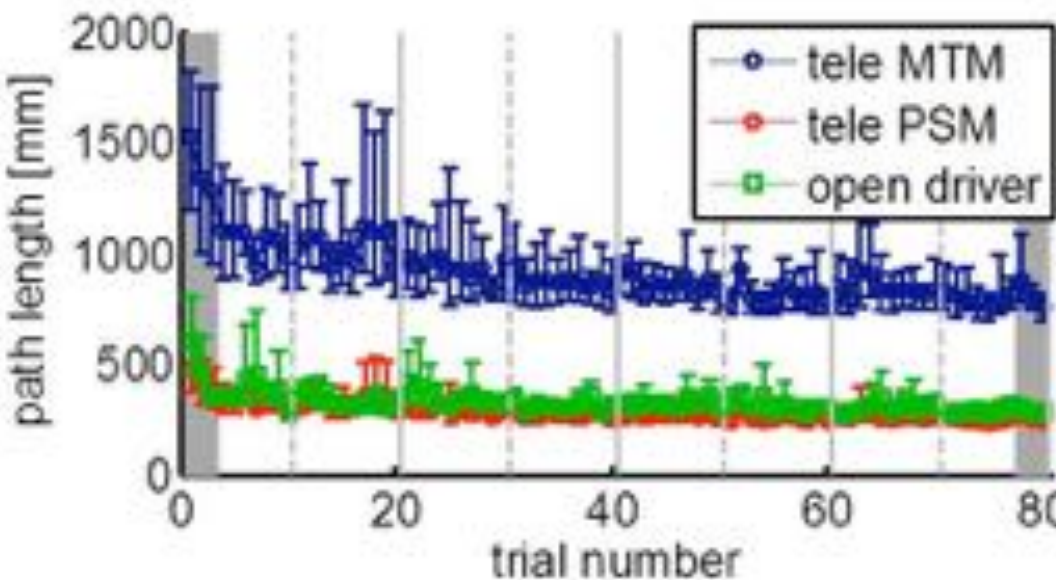
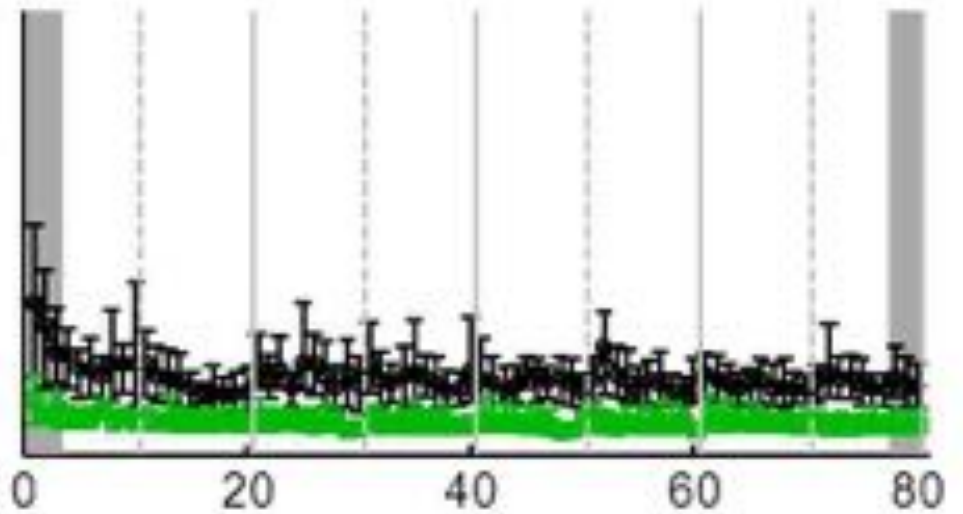


Learning Curves

novices



experts

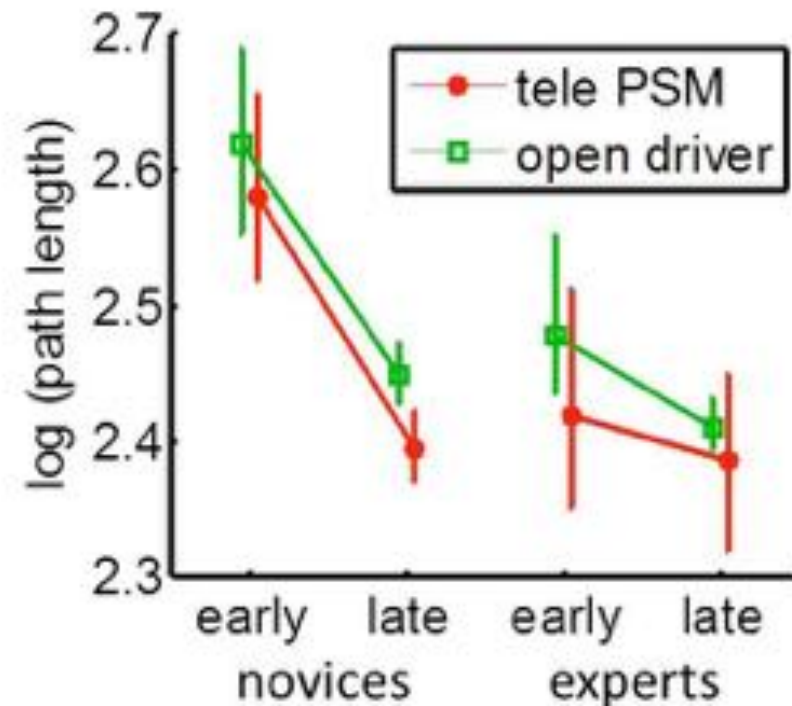
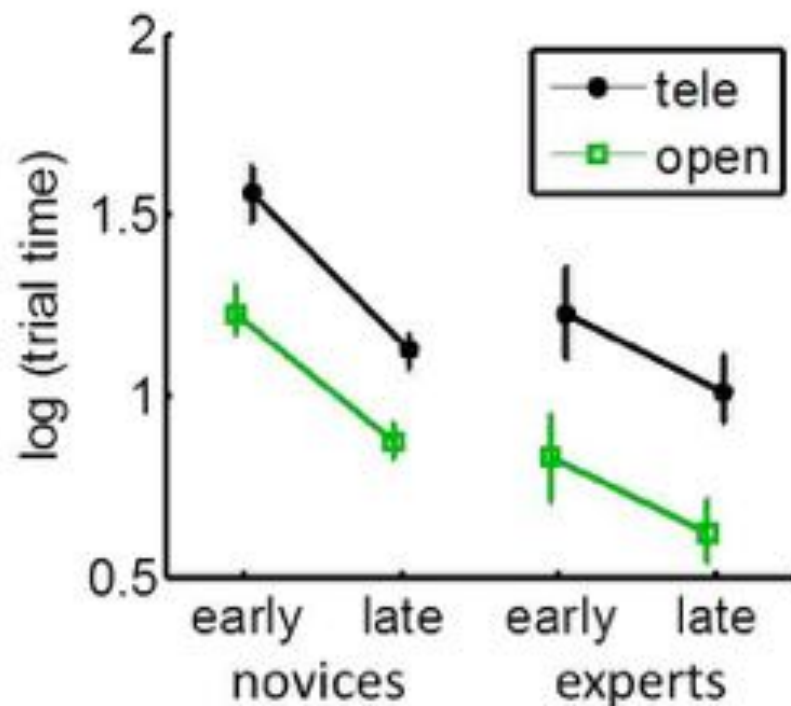


Learning Curves Summary

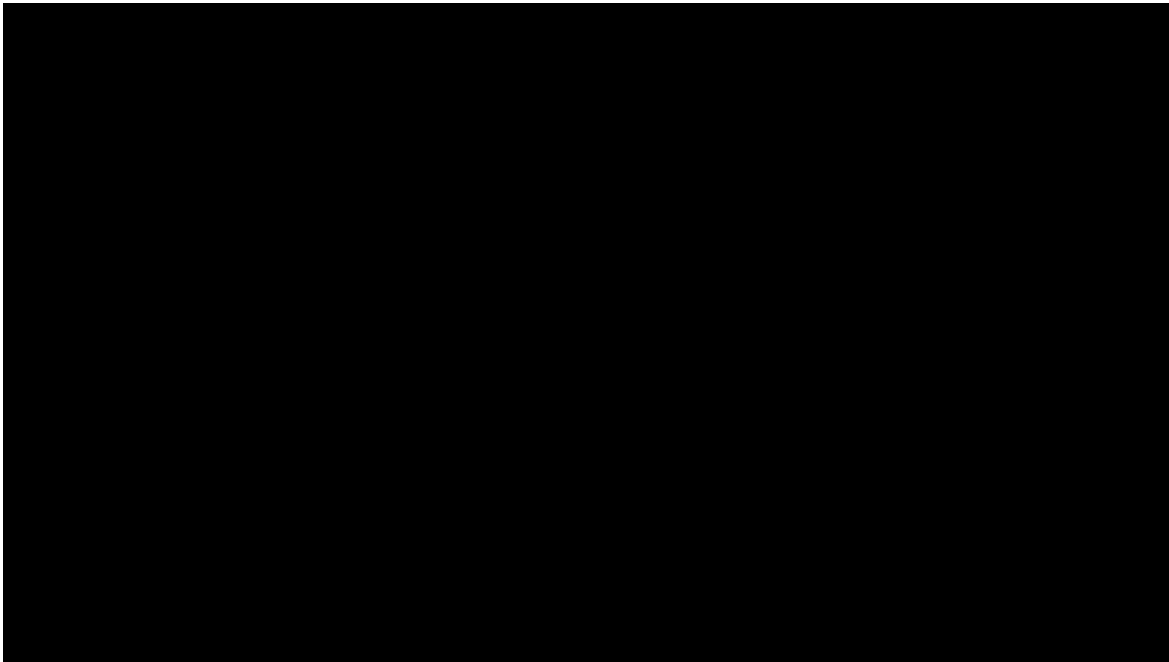
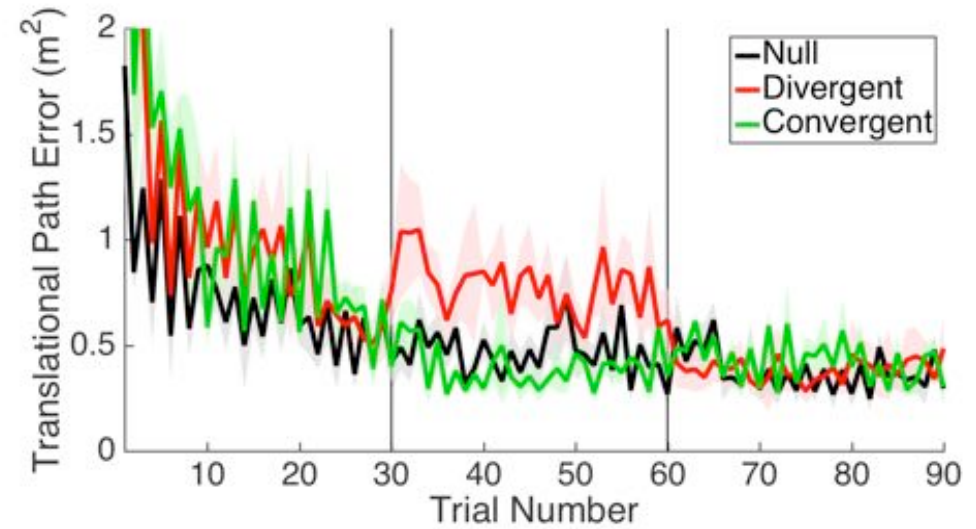
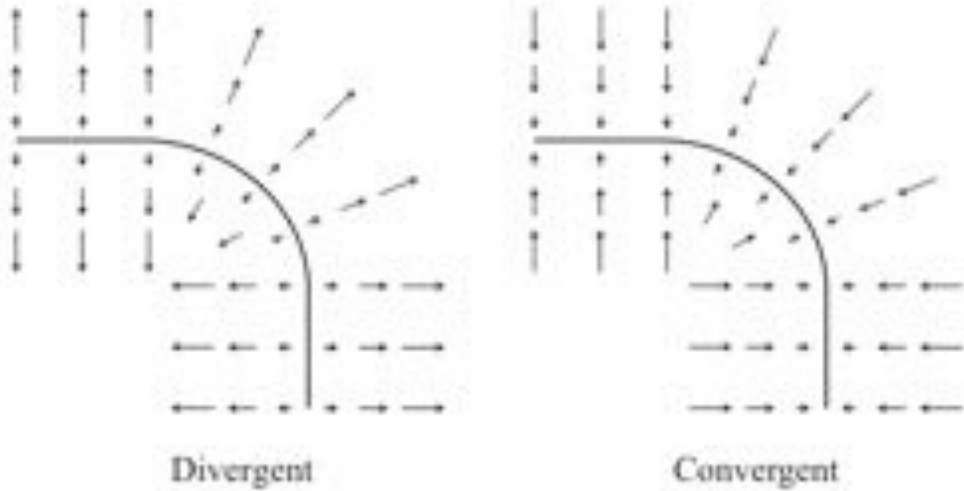
Open needle driving is faster, but with same needle path length

All participants improve movement time

Only novices improve movement length



Training a manipulation task



Coad et al.,
submitted

Conclusions

The dynamics of the master manipulator matter

Experts have adapted and are better

Experts exploit the redundancy of their arm more than novices, especially in teleoperation

Learning trends also exist during manipulation

Resistive training may improve learning and performance

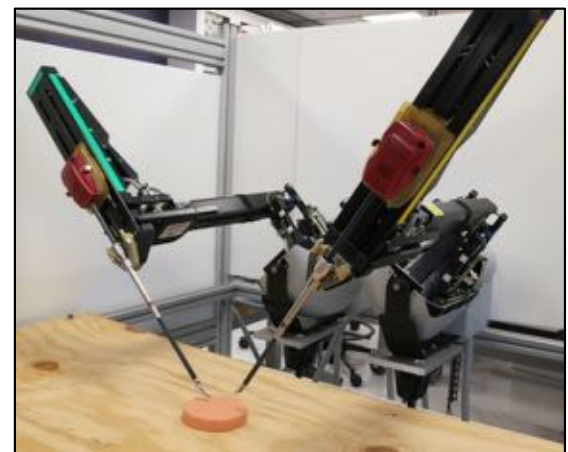


Future Work

Analysis of interaction forces and **dynamic modeling** of user in teleoperation and freehand

Analysis of redundancy exploitation in needle driving experiment

What is the role of haptic feedback?



Take Home

To build robotic systems that are operated by **humans**, we should:

- Study the **human operator**
- Apply findings to design, control, and training

Operators interact with robotic devices

- This allows us to study the **human operator** in unprecedented ways



Thank You



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