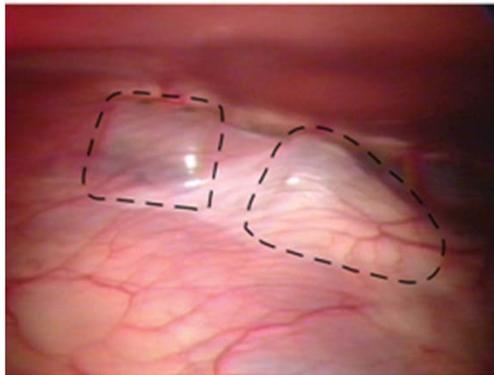


# Compensation of Physiological Motion for Enhanced Surgical Accuracy



**Cameron Riviere, Ph.D.**

Director, Surgical Mechatronics Laboratory  
The Robotics Institute  
Carnegie Mellon University



# Assistive interfaces for surgery

---

## Goal:

- Improve surgical performance
  - accuracy
  - access
- as unobtrusively as possible
  - ease of use
  - minimal disruption of existing clinical practice



# Compensating biological motion for accuracy enhancement

---

- Surgeon
  - Physiological hand tremor
- Patient
  - Heartbeat
  - Respiration



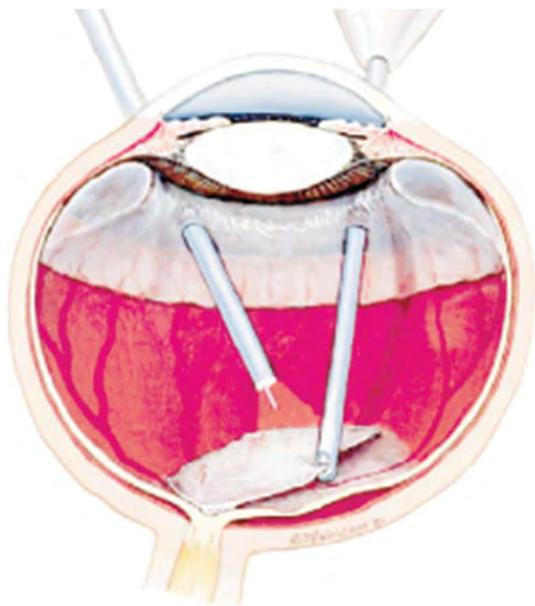
# Physiological Hand Tremor



# Vitreoretinal Microsurgery: difficult

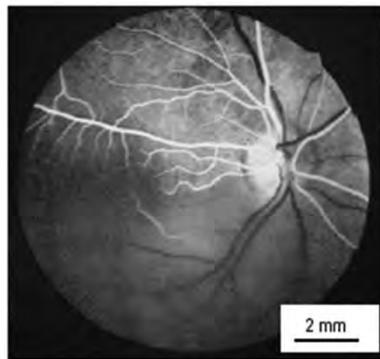
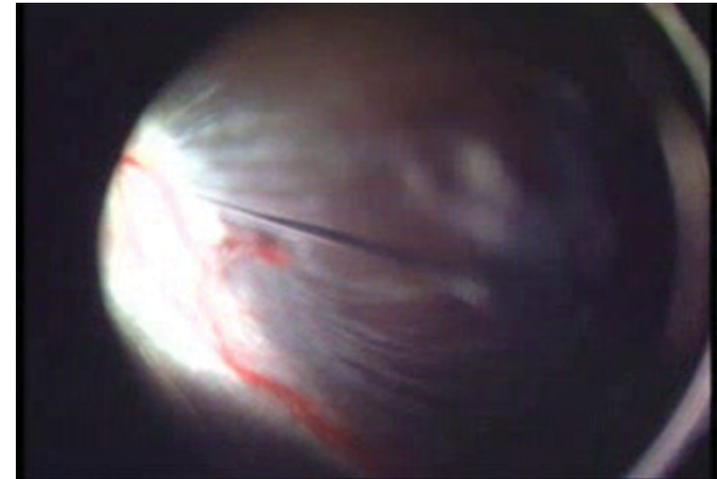
---

- Removal of membranes  $\leq 20$   $\mu\text{m}$  thick from retina

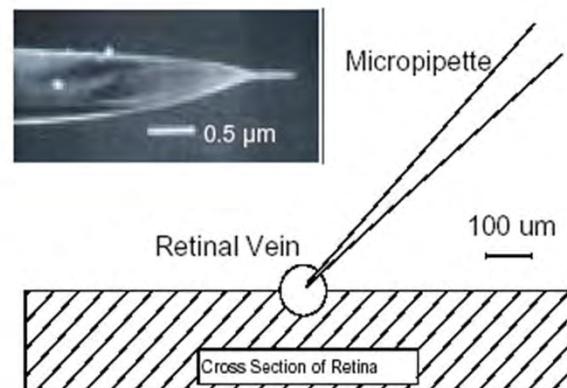


# Vitreoretinal microsurgery: beyond difficult

- Injection of anticoagulant using intraocular cannulation to treat retinal vein occlusion ( $\varnothing < 100 \mu\text{m}$ )
- Presently no effective treatment



Retina with occluded retinal vein



# Tremor Suppression

---

- Teleoperation
- Shared control
- Active compensation



# Tremor Suppression

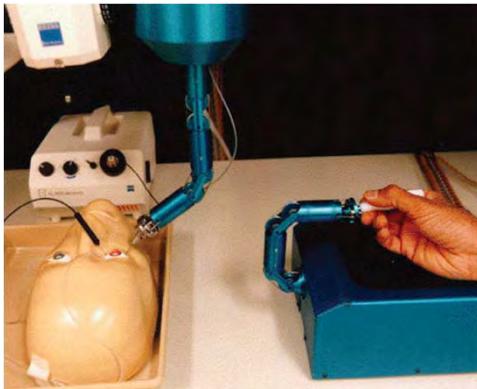
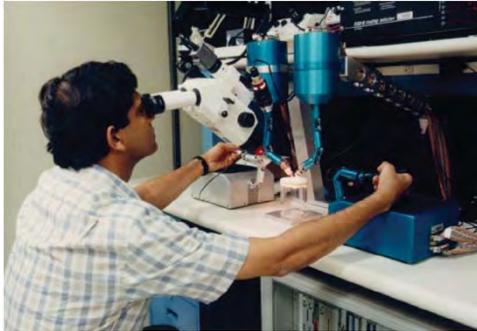
---

- Teleoperation
- Shared control
- Active compensation



# RAMS (JPL)

---



# Tremor Suppression

---

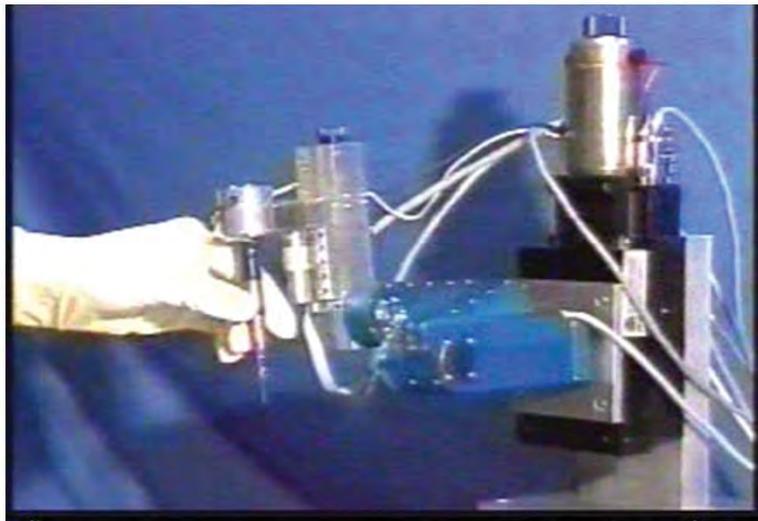
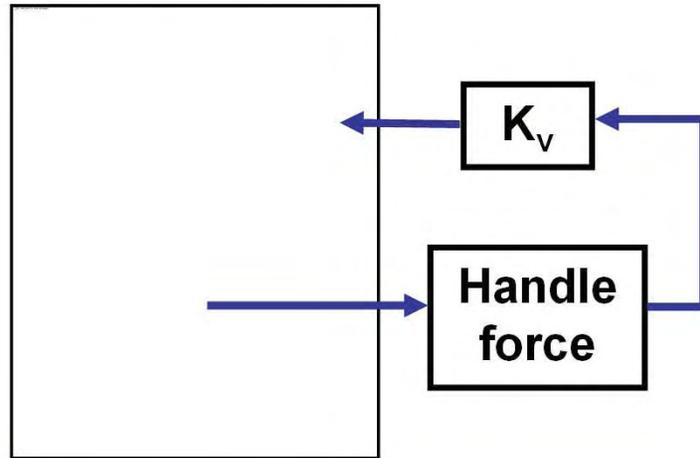
- Teleoperation
- Shared control
- Active compensation



# Steady-hand robot

Iordachita, Kapoor, Kazanzides, Taylor (Johns Hopkins)

## Shared control



# Tremor Suppression

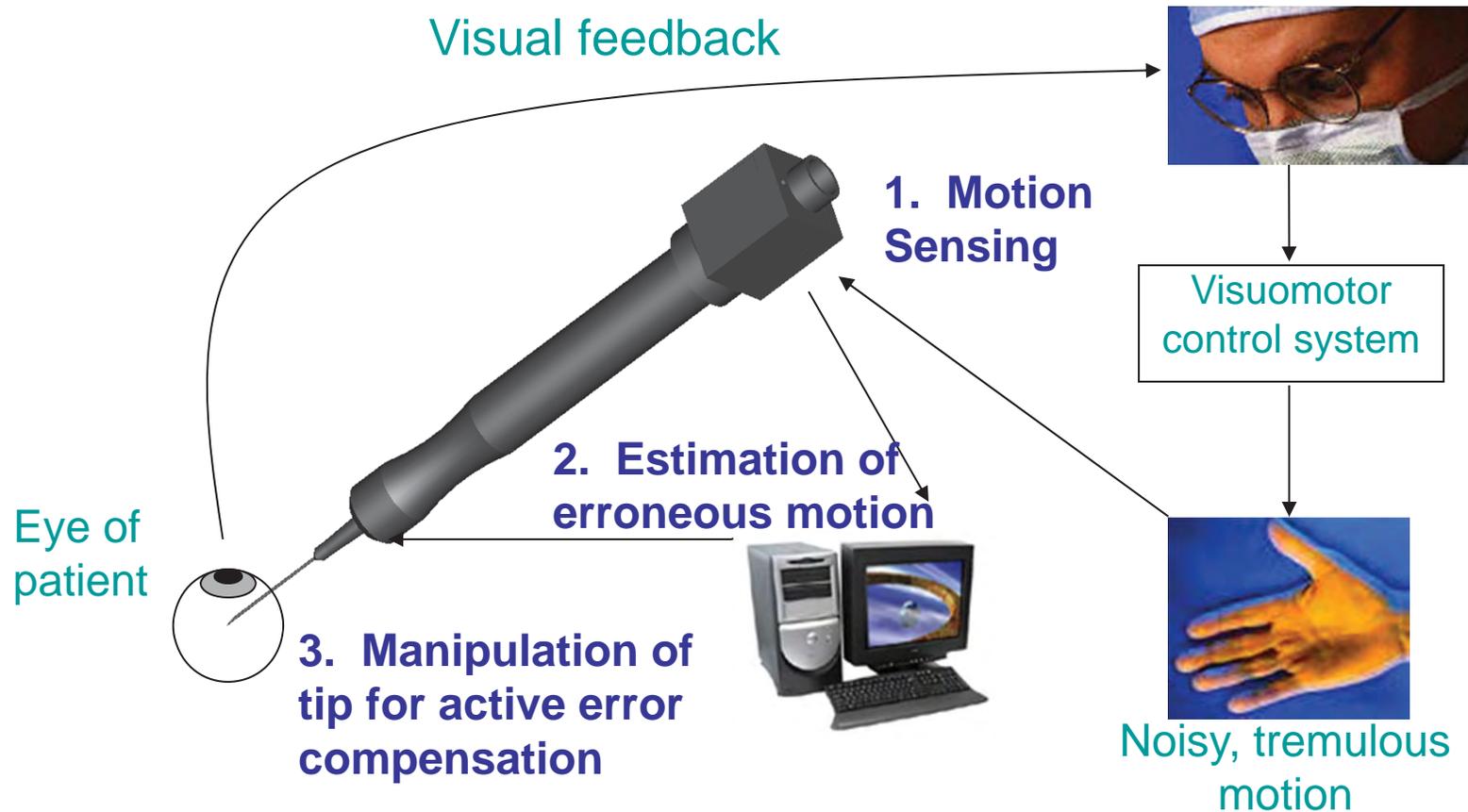
---

- Teleoperation
- Shared control
- Active compensation

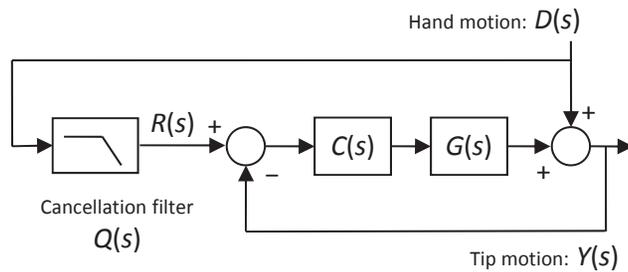
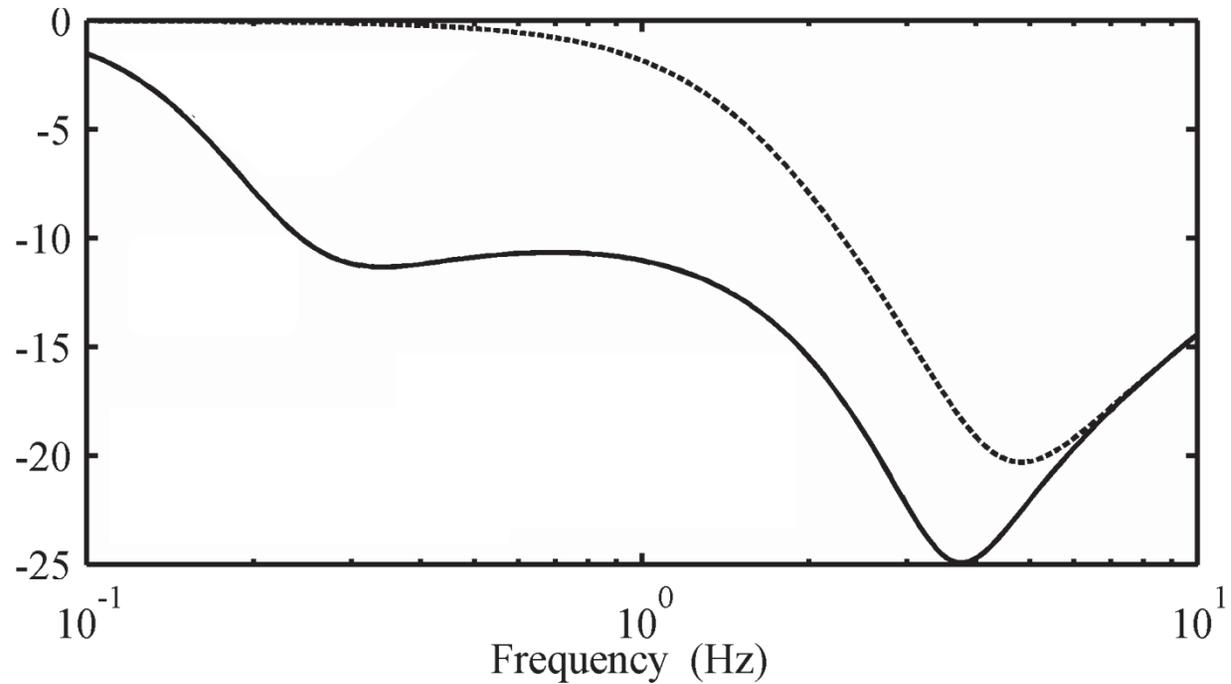


# Micron

Active handheld micromanipulator



# Cancellation filter



## 2 prototypes

---



- 6DOF optical tracking
- 3DOF actuation
- Piezoelectric benders
- ROM = 0.4 mm

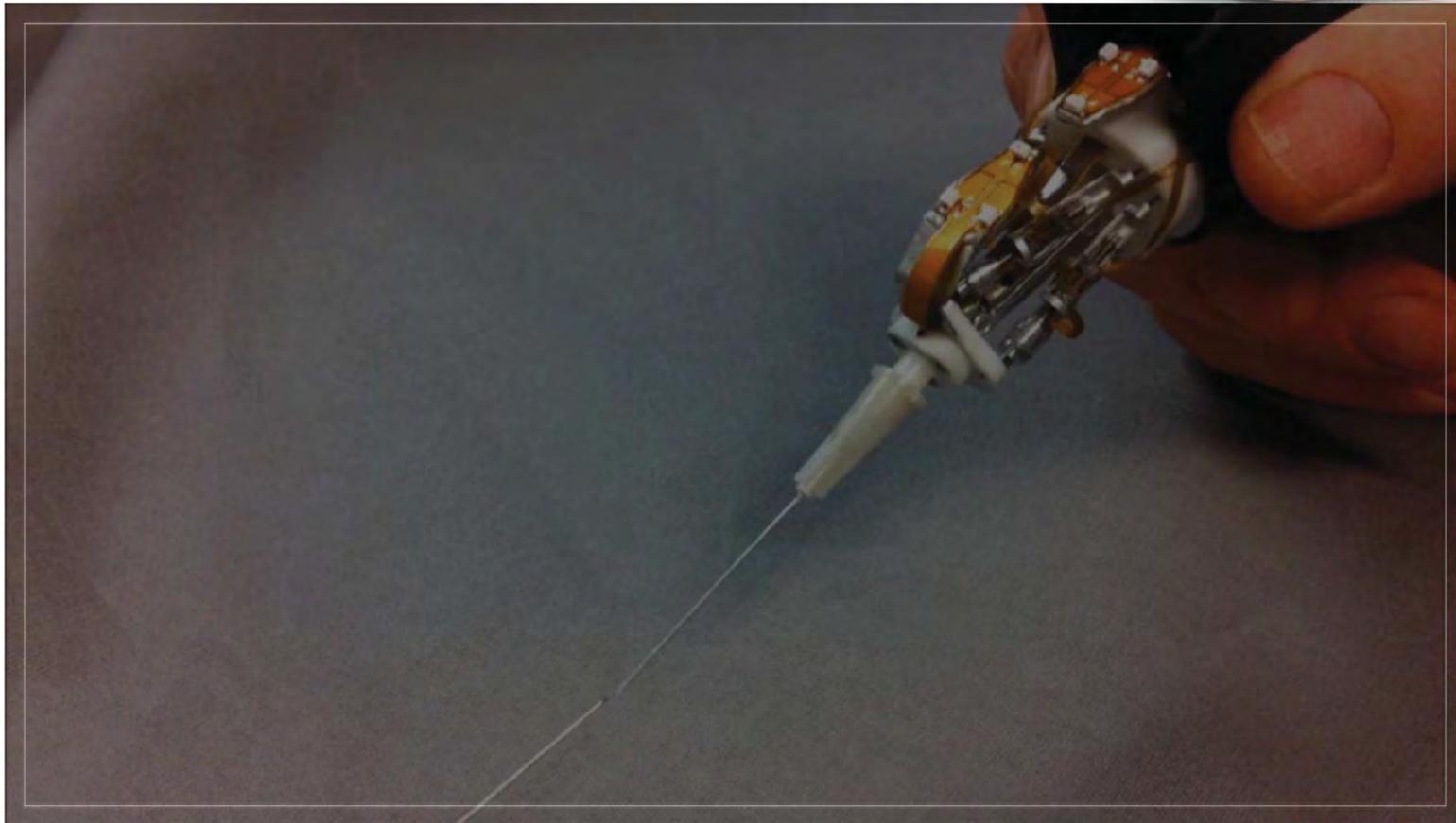


- 6DOF optical tracking
- 6DOF actuation
- Ultrasonic linear motors
- ROM = 4 mm



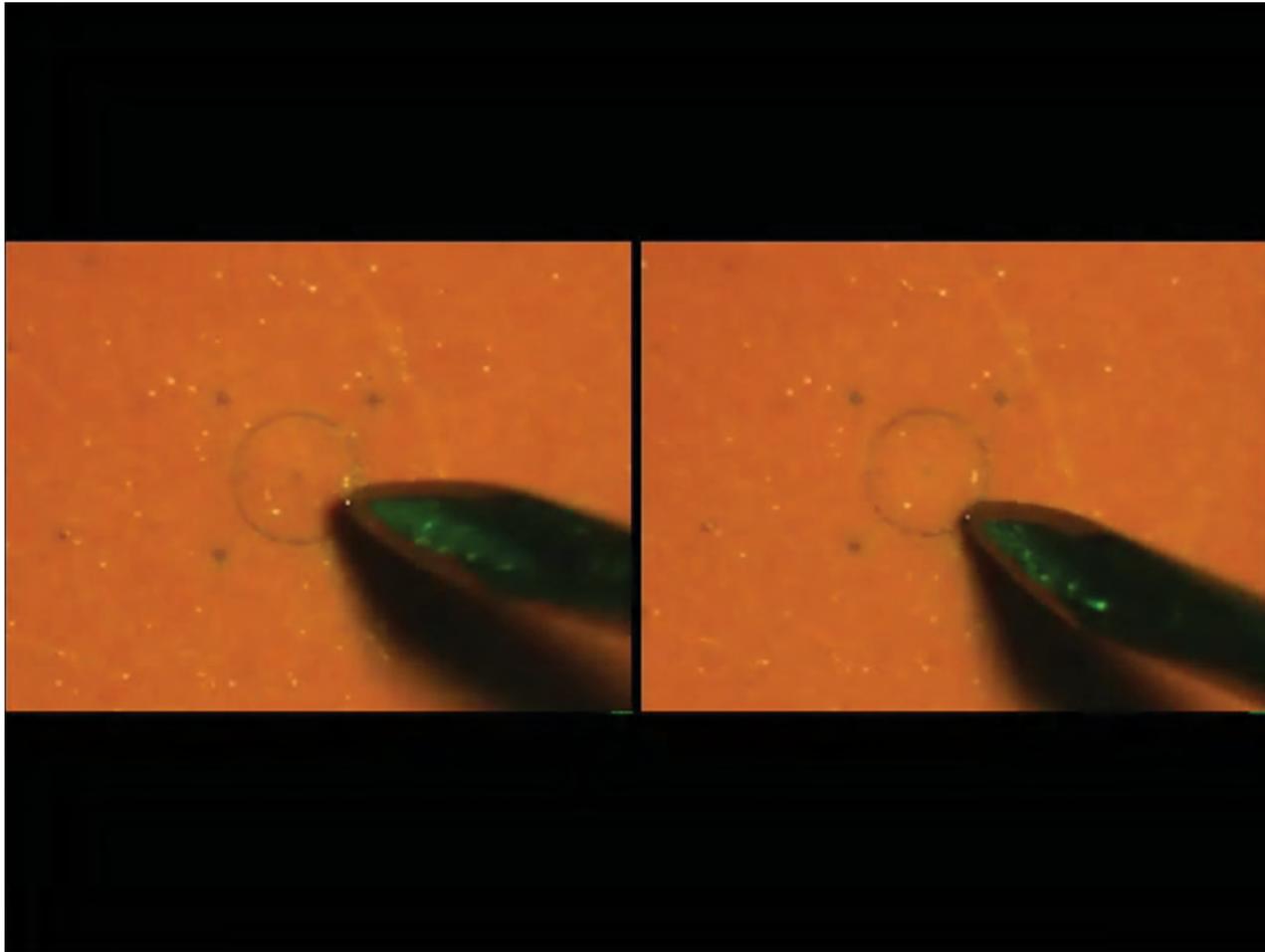
# Handheld Performance

---



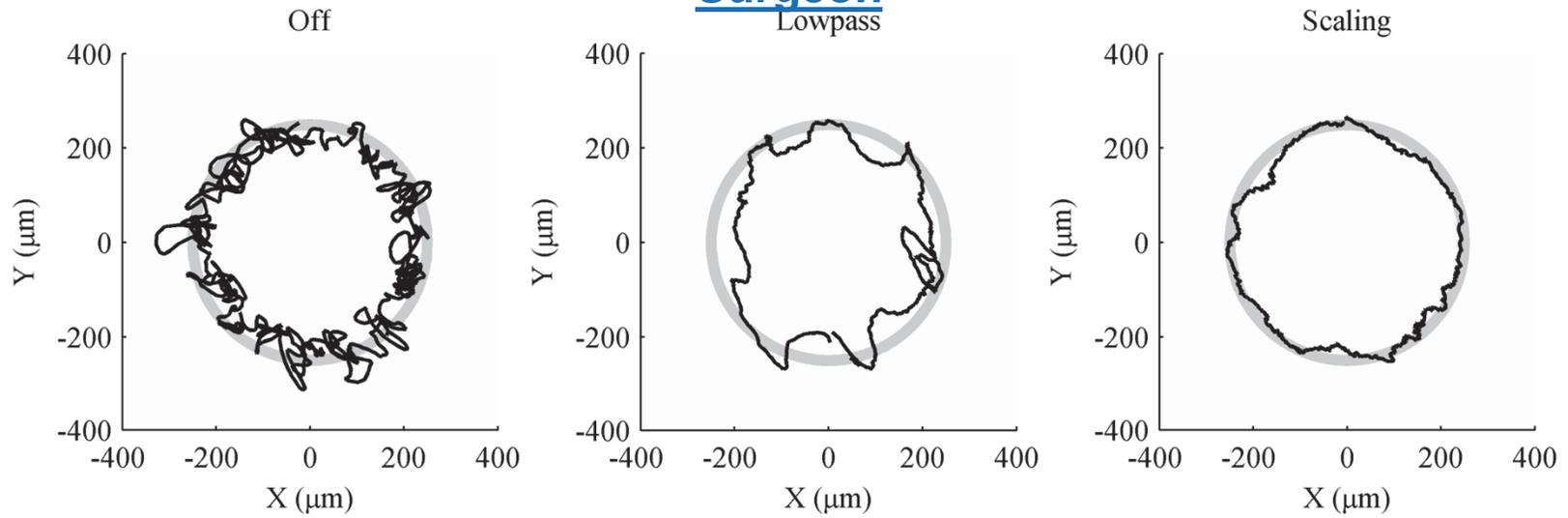
# Circle-Tracing Performance

---

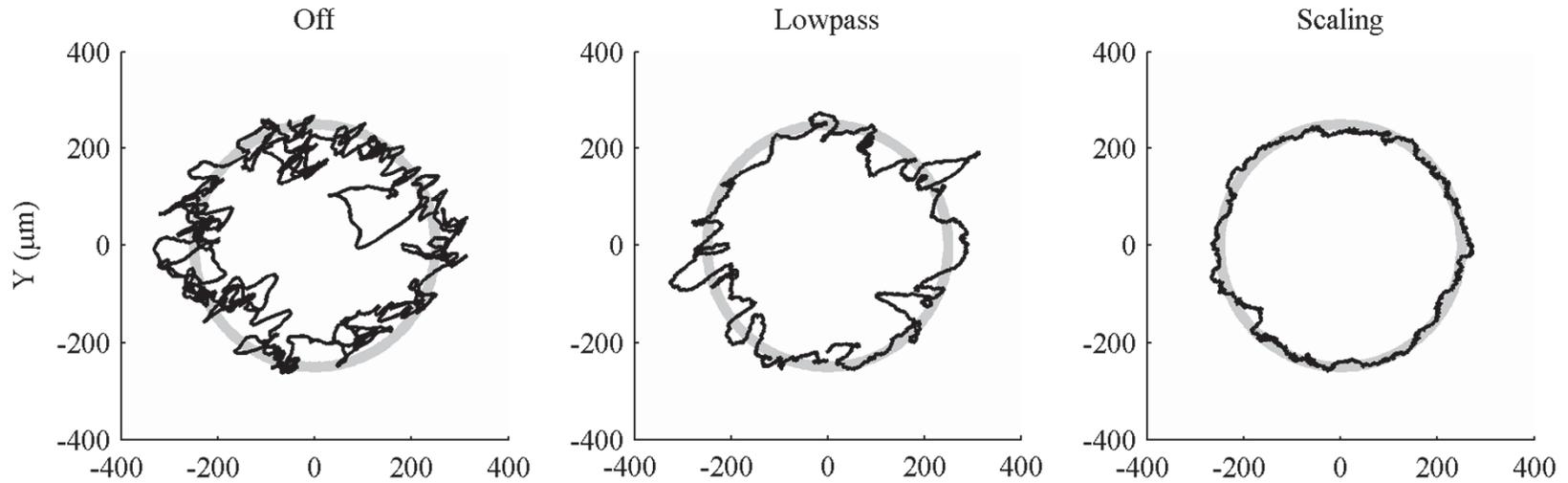


# Tracing results

## Surgeon



## Non-surgeon



# Comparison of approaches

COMPARISON OF MICROSURGERY MANIPULATION AIDS

	Unaided	Master/slave	Cooperative	Micron
<b>Motion scaling:</b>	No	Yes	No	Yes
<b>Workspace intrusion:</b>	No	Slave arm & master	Arm	Active tool, sensor sightlines
<b>Force feedback:</b>	1:1	Research area	Yes (superimposed on damping)	1:1
<b>Set and forget hold:</b>	No	Yes	Yes	No
<b>Features:</b>	Current practice	Could combine all of the above features, telemedicine	Inexpensive position-output actuators and simple control	Hand-held operation improves user acceptance and safety, mechanical simplicity
<b>Challenges/costs:</b>	Tremor limits accuracy & repeatability	Unproven force feedback performance / greatest mechanical and control complexity (high cost)	Dexterity fundamentally limited by force → rate user interface and low control bandwidth	Manipulator size and range, high bandwidth control / measurement subsystem cost



# Stereo Visual Tracking

---



# Control Modes

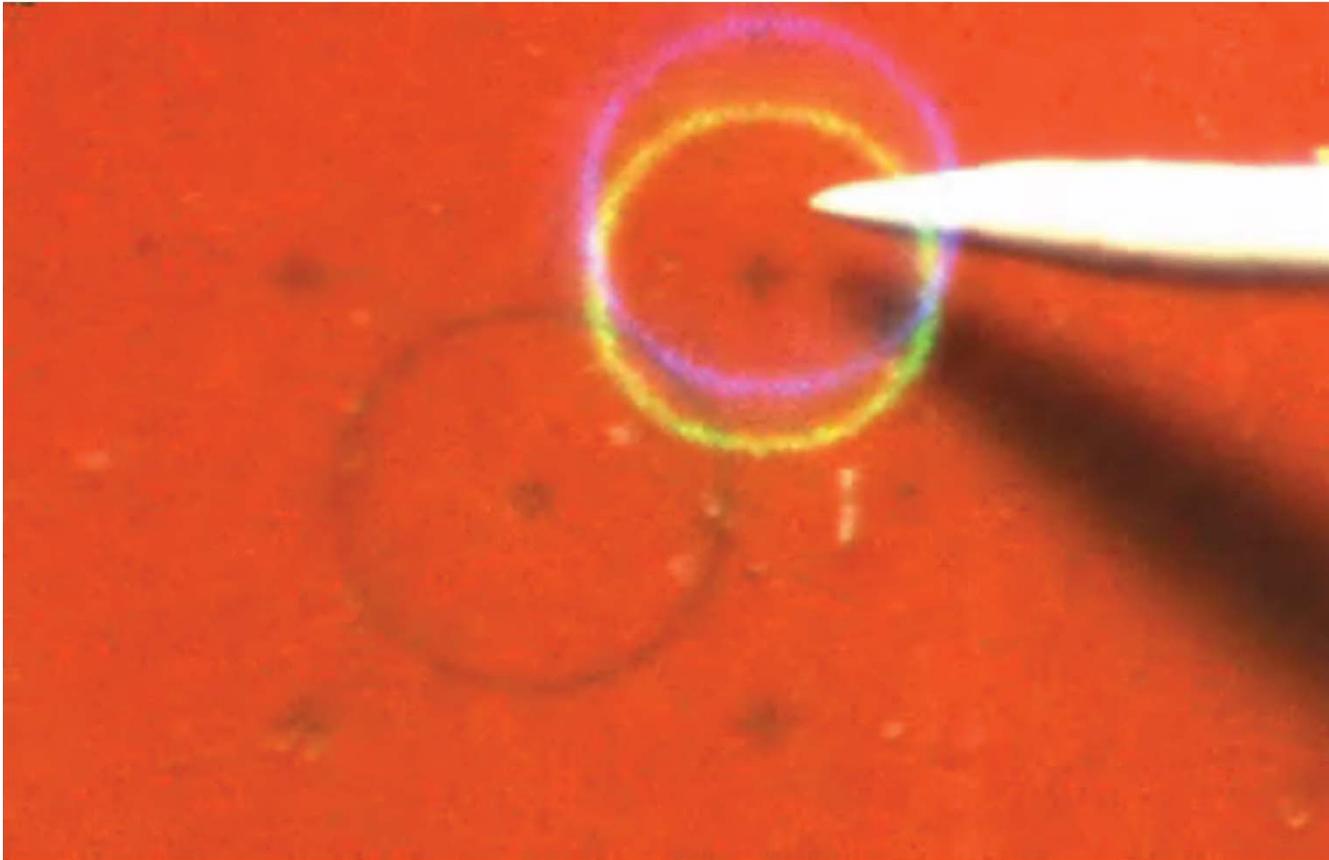
---

- Active compensation of tremor
- Motion scaling
- Semiautomated scanning
- Visual servoing
- Avoidance zones
- Position-based virtual fixtures

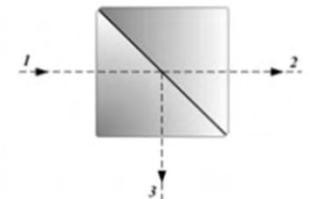
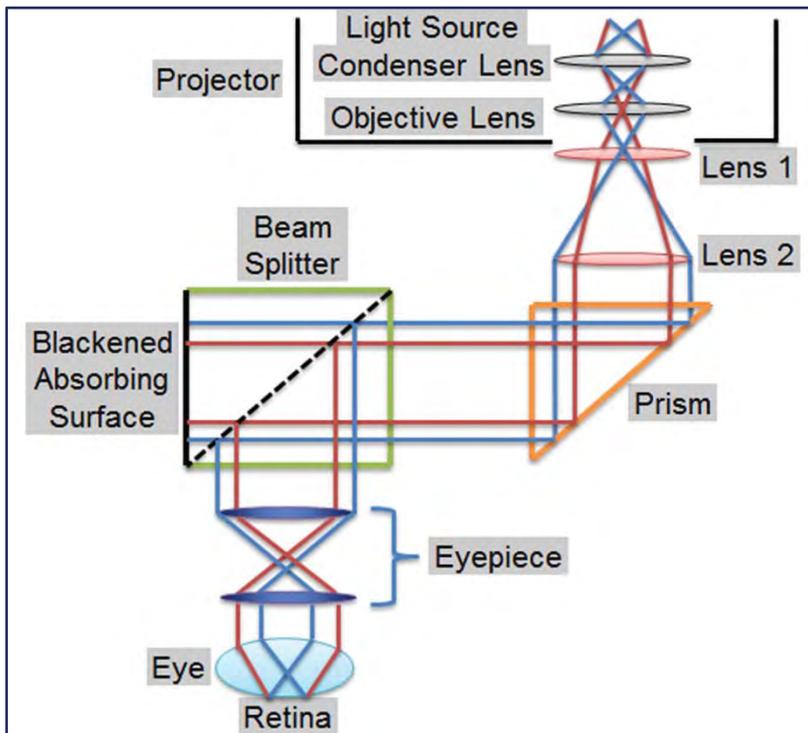


# Image Guidance

---

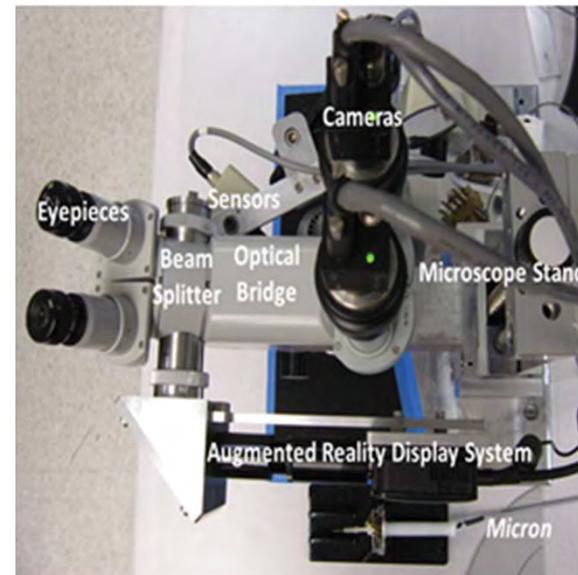
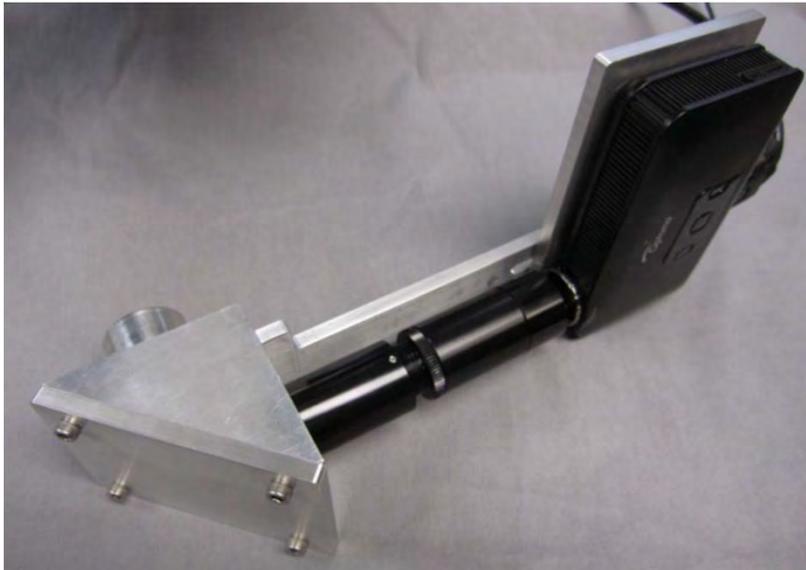


# Augmented-Reality Display: Design



# Assembled System

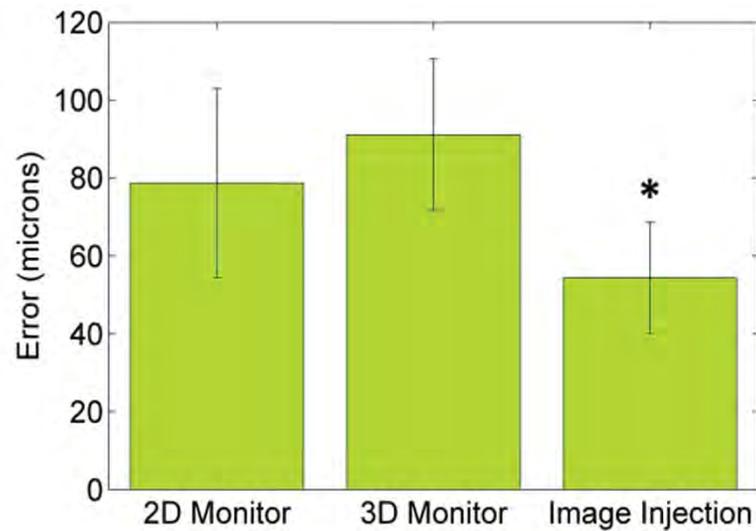
---



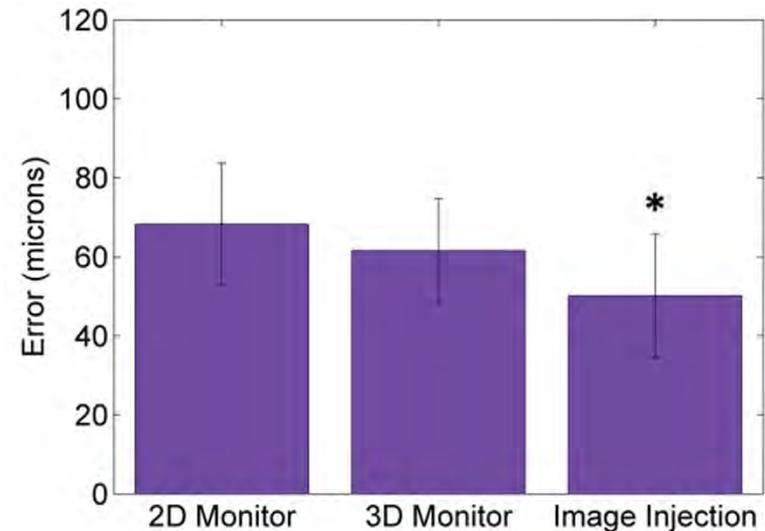
# Comparison with 2D and 3D Monitors

## Circle tracing

### Surgeon

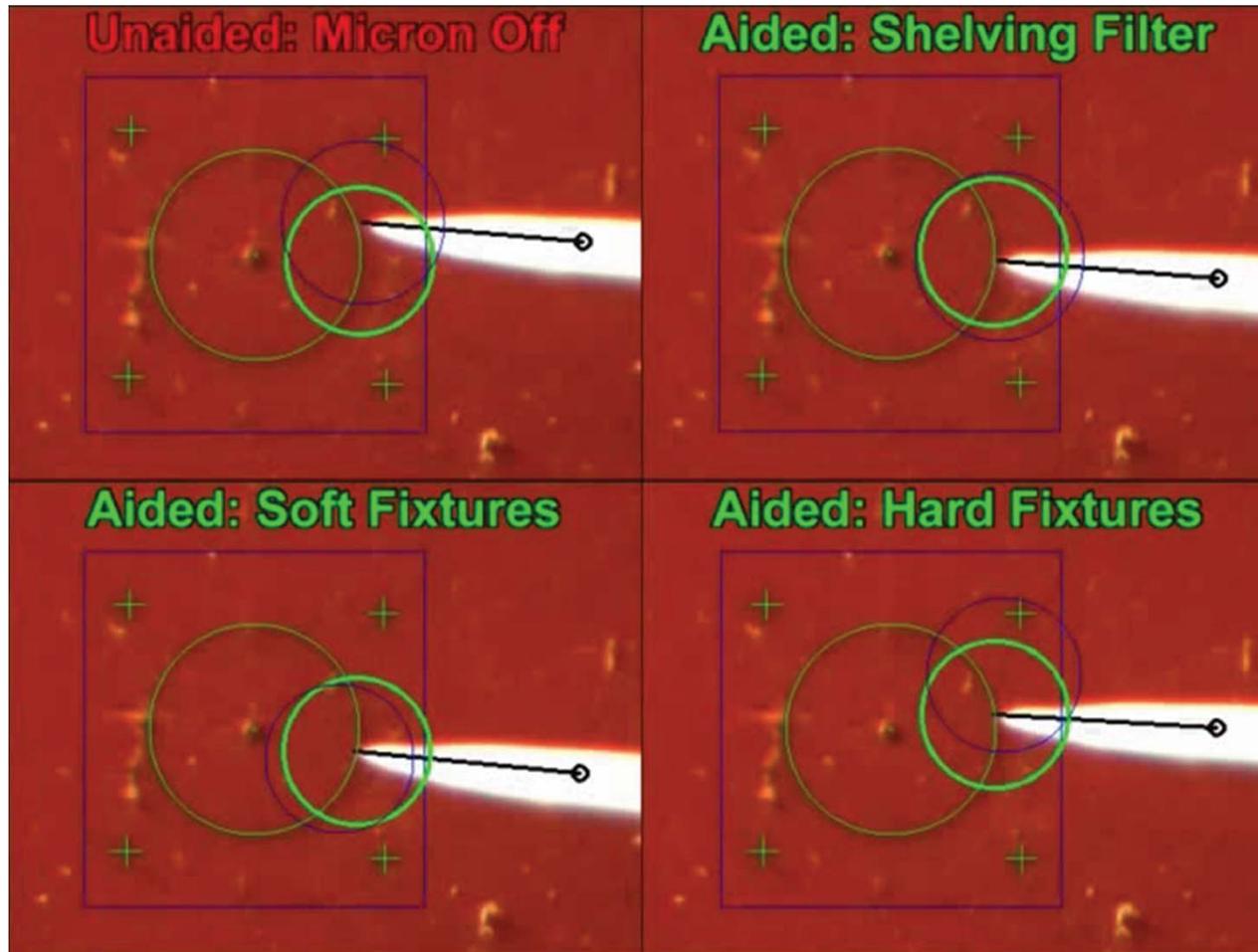


### Novices



# Circle Tracing

4 different control modes



# Semiautomated scanning

for patterned laser photocoagulation

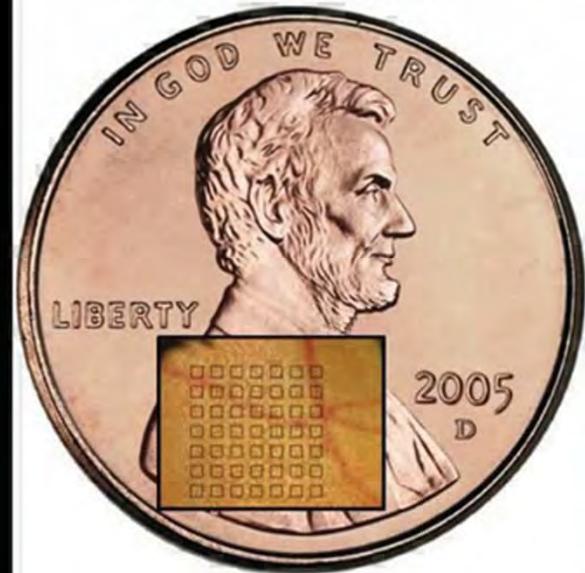
---

**Micron Photocoagulation**  
Placing laser burns on 7x7 paper grid

**Carnegie Mellon University**

Brian C. Becker, Robert A. MacLachlan, Louis A. Lobes, Cameron N. Riviere

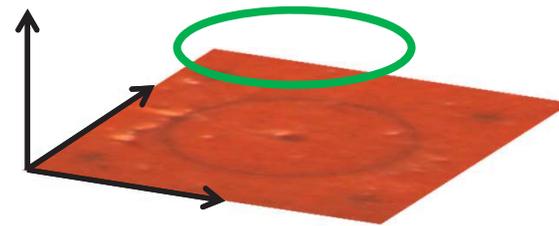
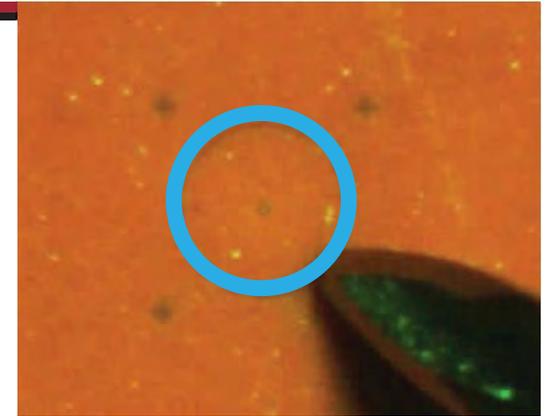
7x7 Grid to Scale



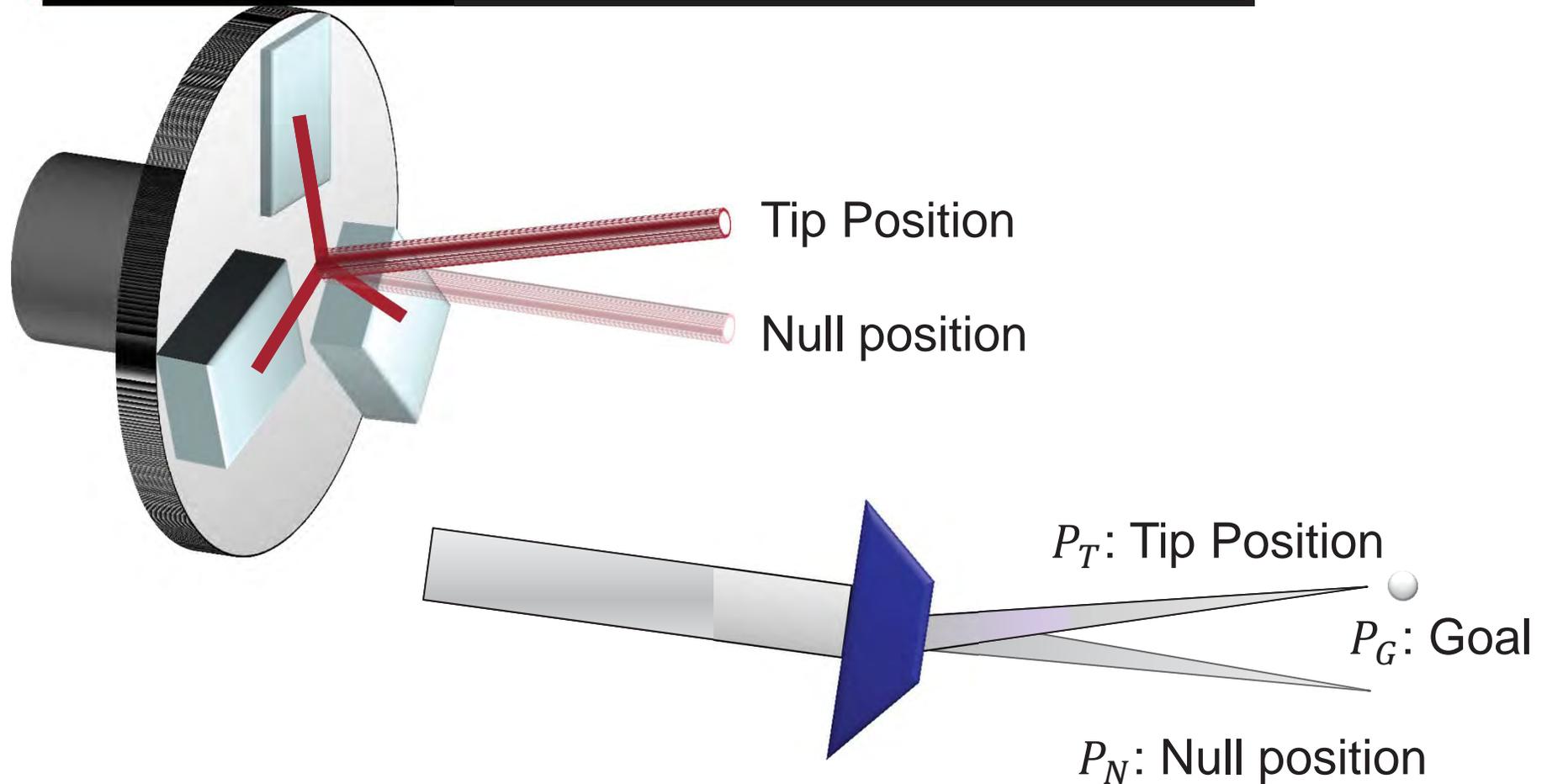
**Carnegie Mellon**  
**THE ROBOTICS INSTITUTE**

# Research Hypotheses

1. *Tip constraints increase accuracy and safety*
2. *Visual feedback provides context for tip constraints*
3. *Task-specific tip constraints aid surgical procedures*



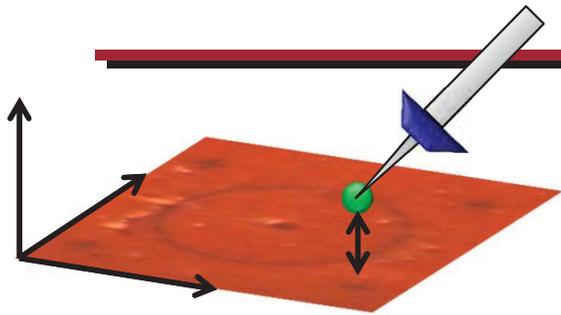
# Position-Based Virtual Fixtures



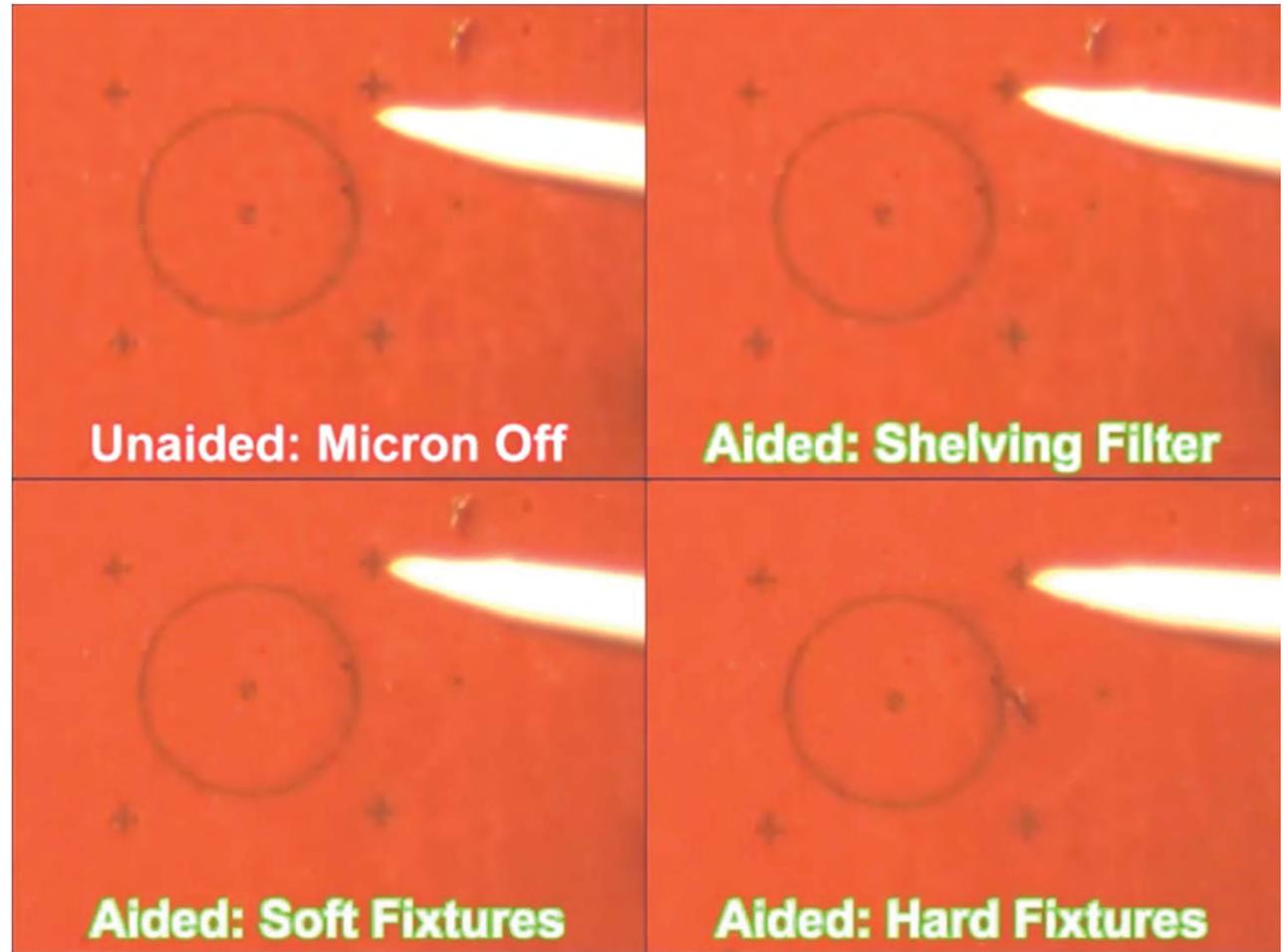
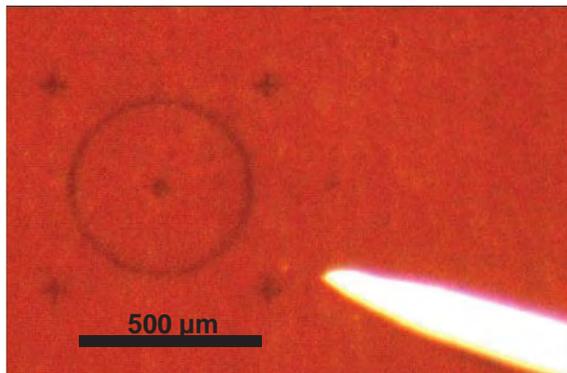
***Key assumption: surgeon attempts to place null position on target***



# Point Virtual Fixture



Hold Still



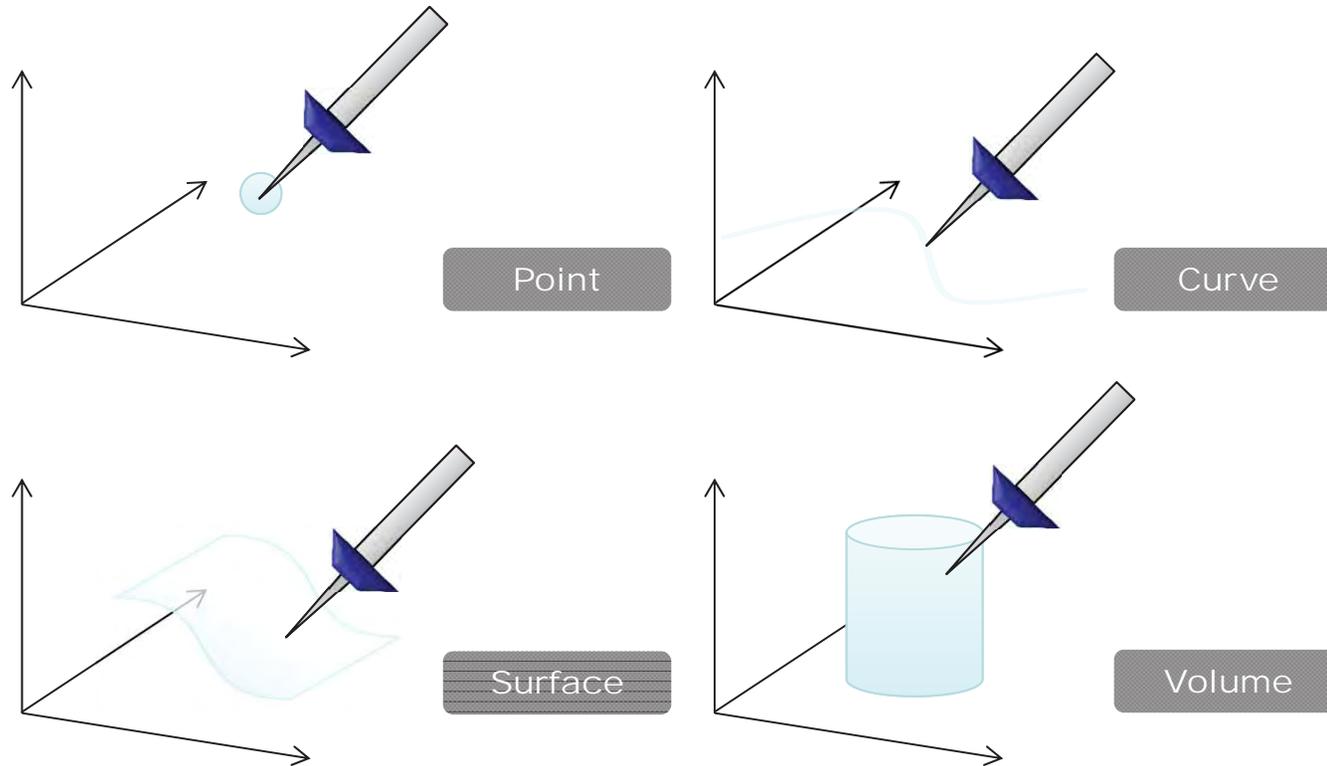
500 μm

Surgeon Results



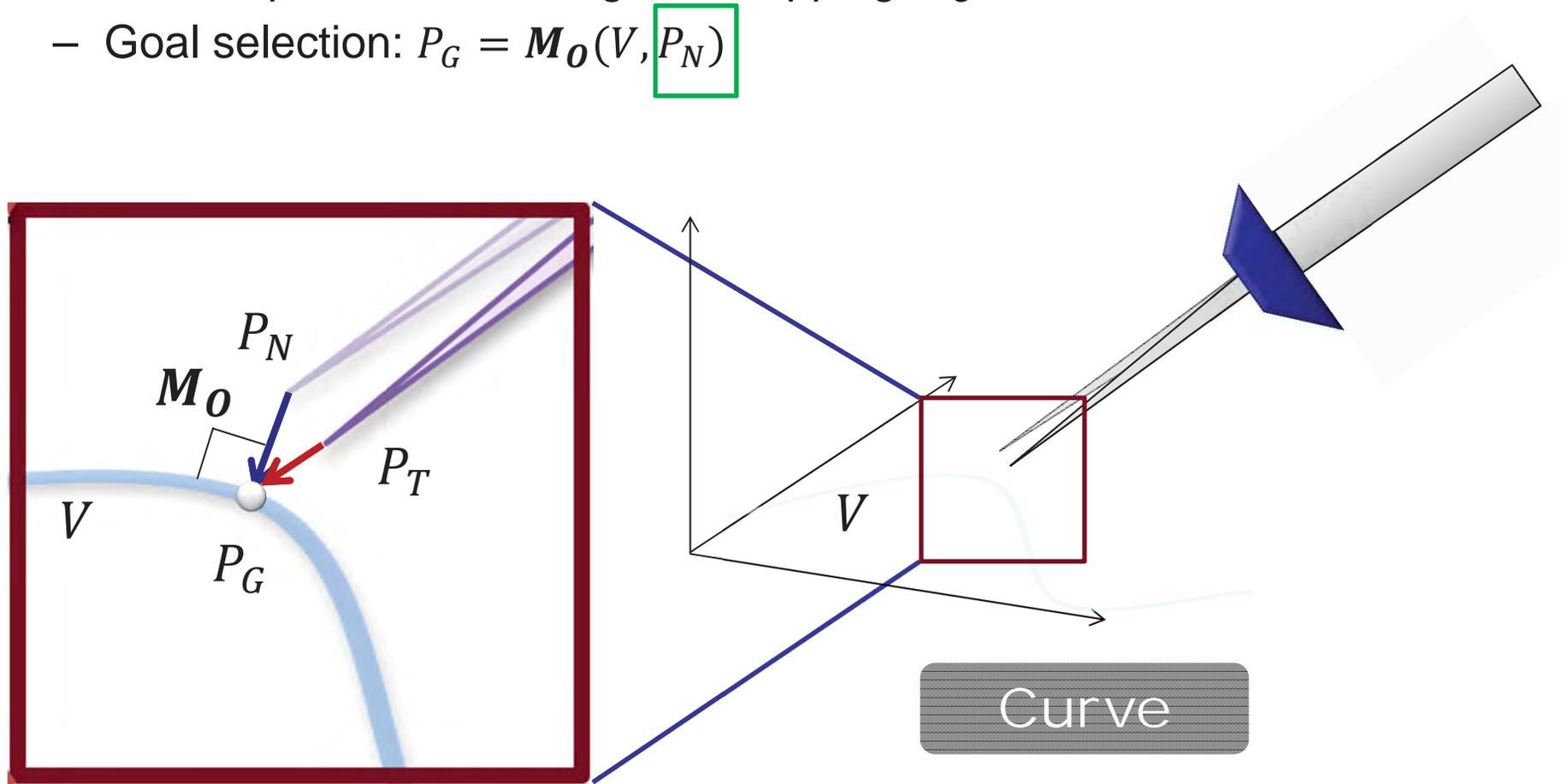
# Higher-Order Virtual Fixtures

- Virtual fixture  $V$ 
  - Higher DOF subspace
  - Tip to lie on subspace
- Implement as moving point virtual fixture



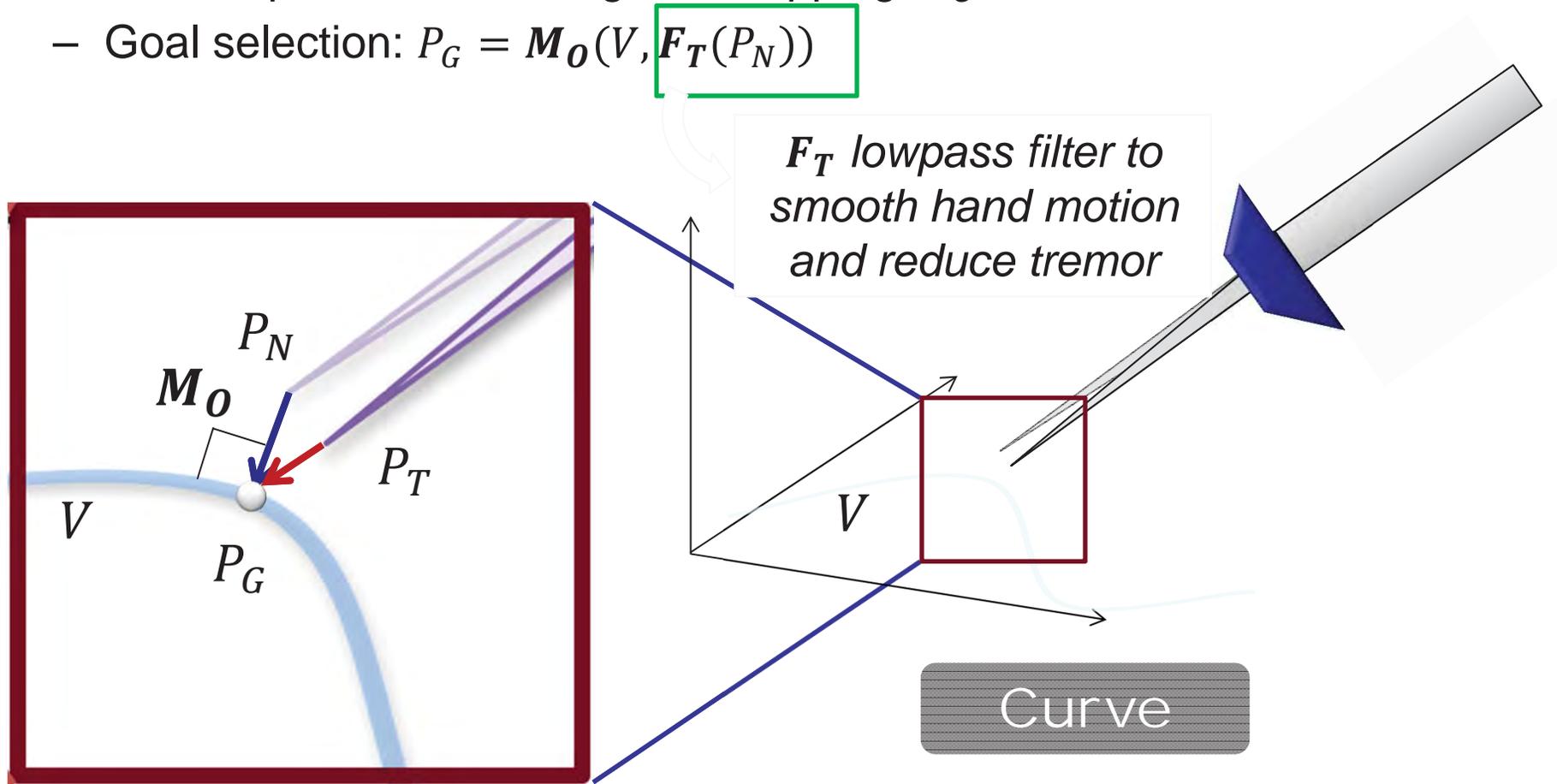
# Higher-Order Virtual Fixtures

- Mapping to fixture
  - Closest point on  $V$ : orthogonal mapping  $M_O$
  - Goal selection:  $P_G = M_O(V, P_N)$



# Higher-Order Virtual Fixtures

- Mapping to fixture
  - Closest point on  $V$ : orthogonal mapping  $M_O$
  - Goal selection:  $P_G = M_O(V, F_T(P_N))$



# Motion Scaling

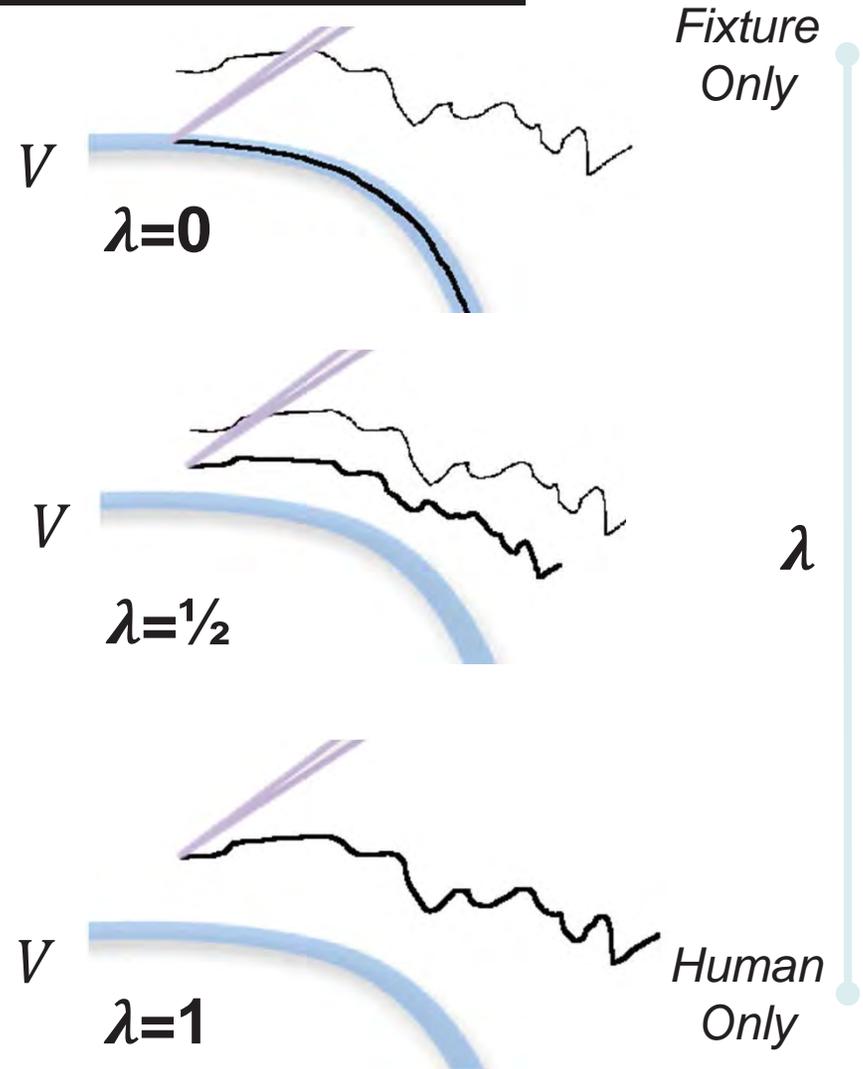
- Scale motion near fixture
  - $\lambda$ : Scaling parameter
  - $e$ : Error between human  $P_N$  and virtual fixture  $P_G$

- Soft virtual fixture

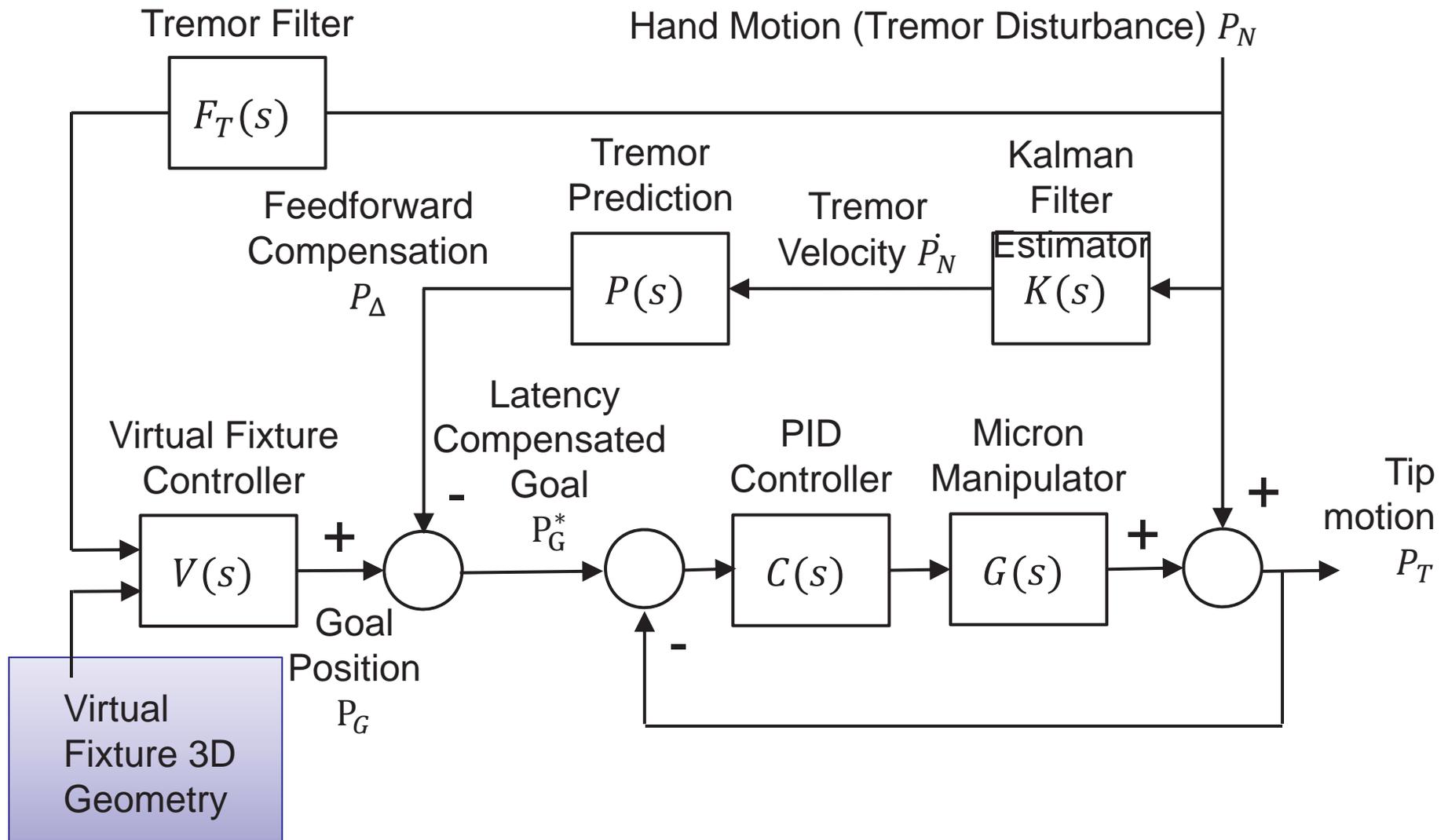
- Goal:  $P_T = P_G + \lambda e$

Fixture  
goal point

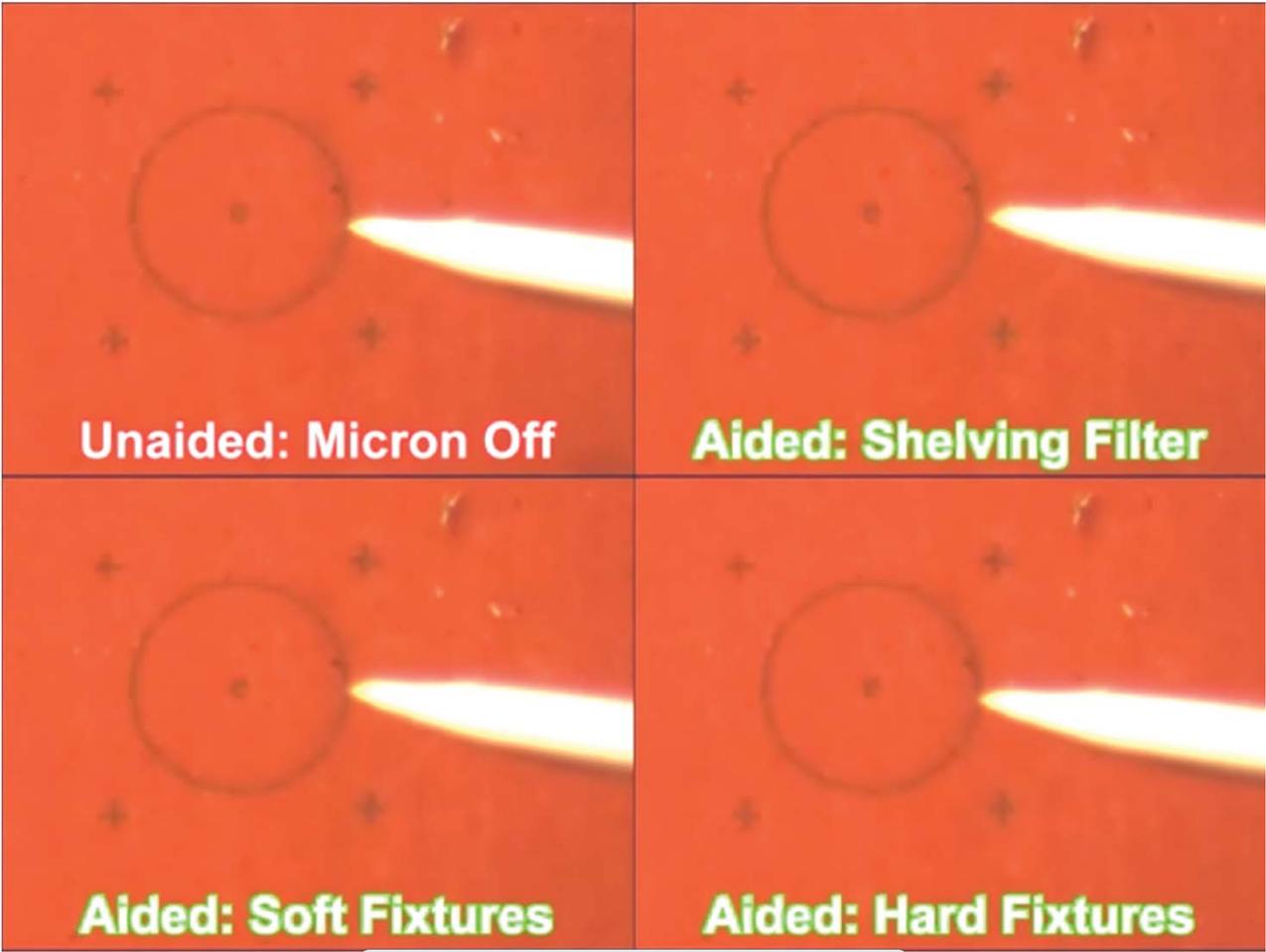
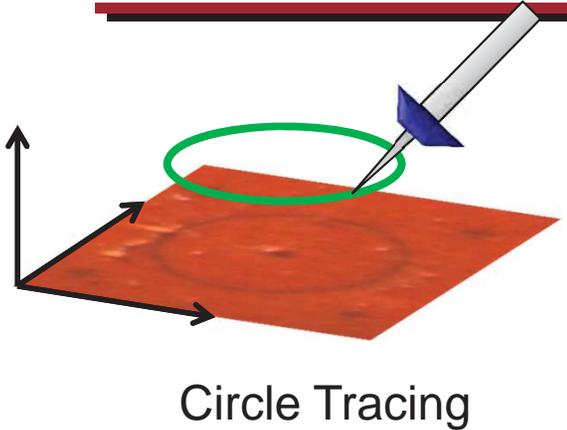
Use some  
of the  
human  
input



# Virtual Fixture Generation



# Circle Tracing

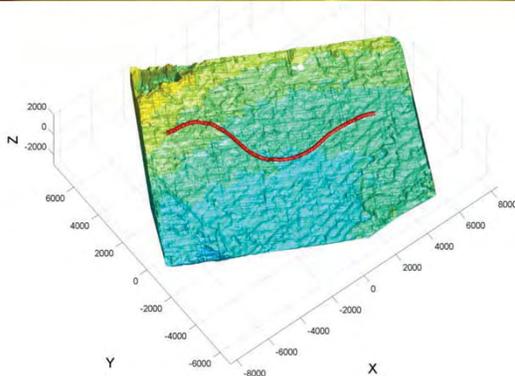
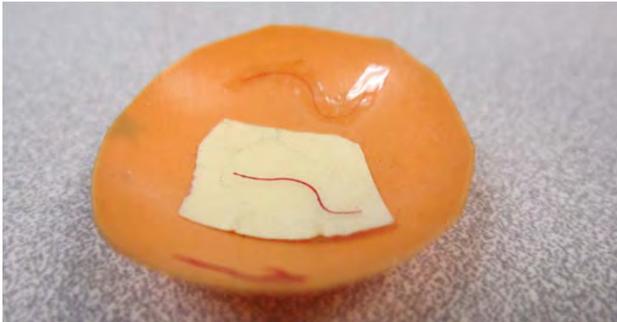


500 μm

Surgeon Results



# Vein Tracing

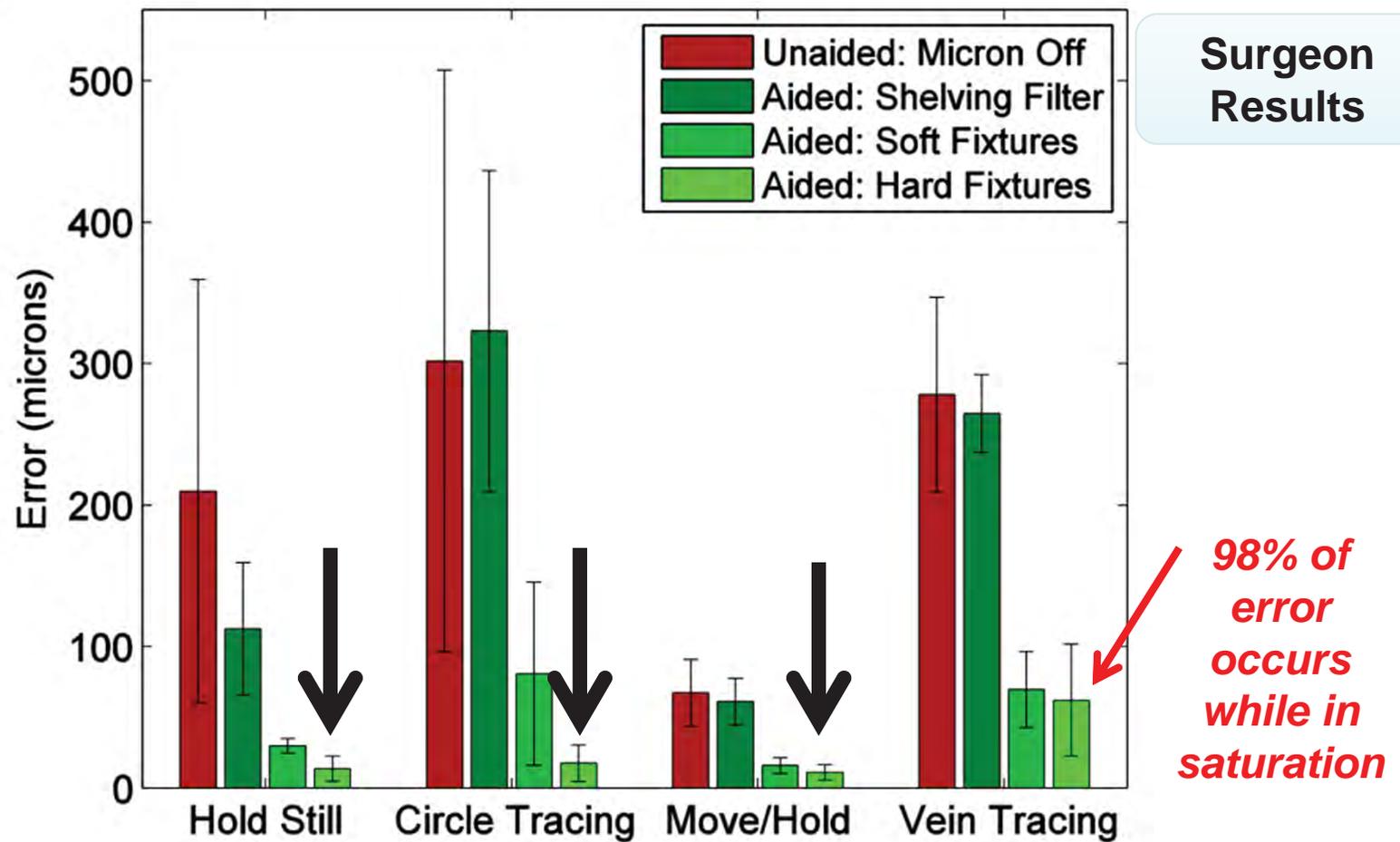


5.0 mm

Surgeon Results



# Virtual Fixtures Results

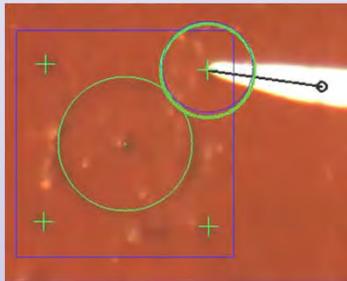


*Virtual fixtures significantly reduce positioning error ( $p < 0.05$ )*

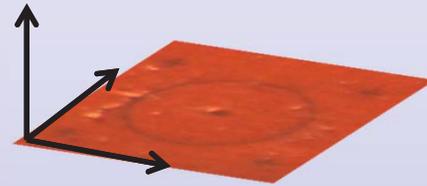


# 30 Hz Real-Time Vision

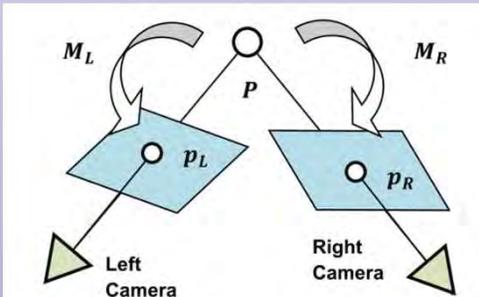
## Multi-threaded CPU



Template/tip tracking



Surface reconstruction

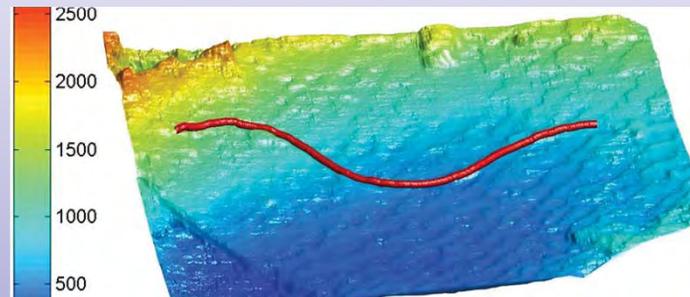


Adaptive Camera Calibration



3D fitting

## GPU-Accelerated



Dense Stereo

Reconstruction

## ASIC-Accelerated

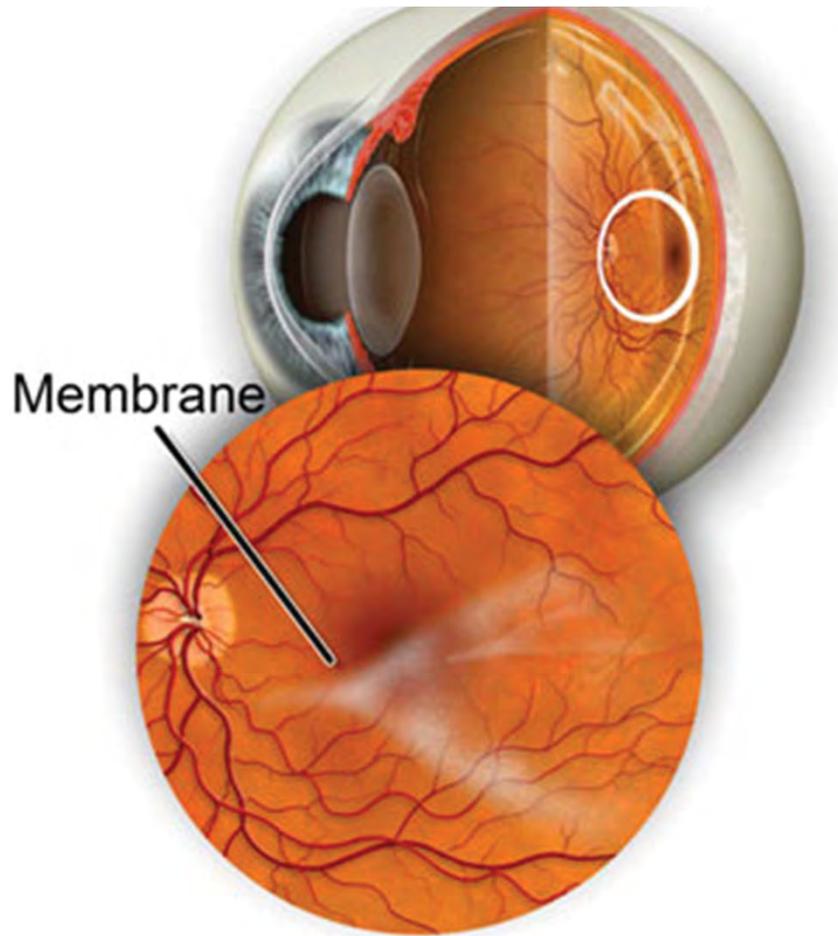


Video Encoding

H.264



# Retinal Membrane Peeling



*Procedure: Remove membrane  $< 5 \mu\text{m}$  thick*



***Problem:***

*Retina tears at 5-8 mN*

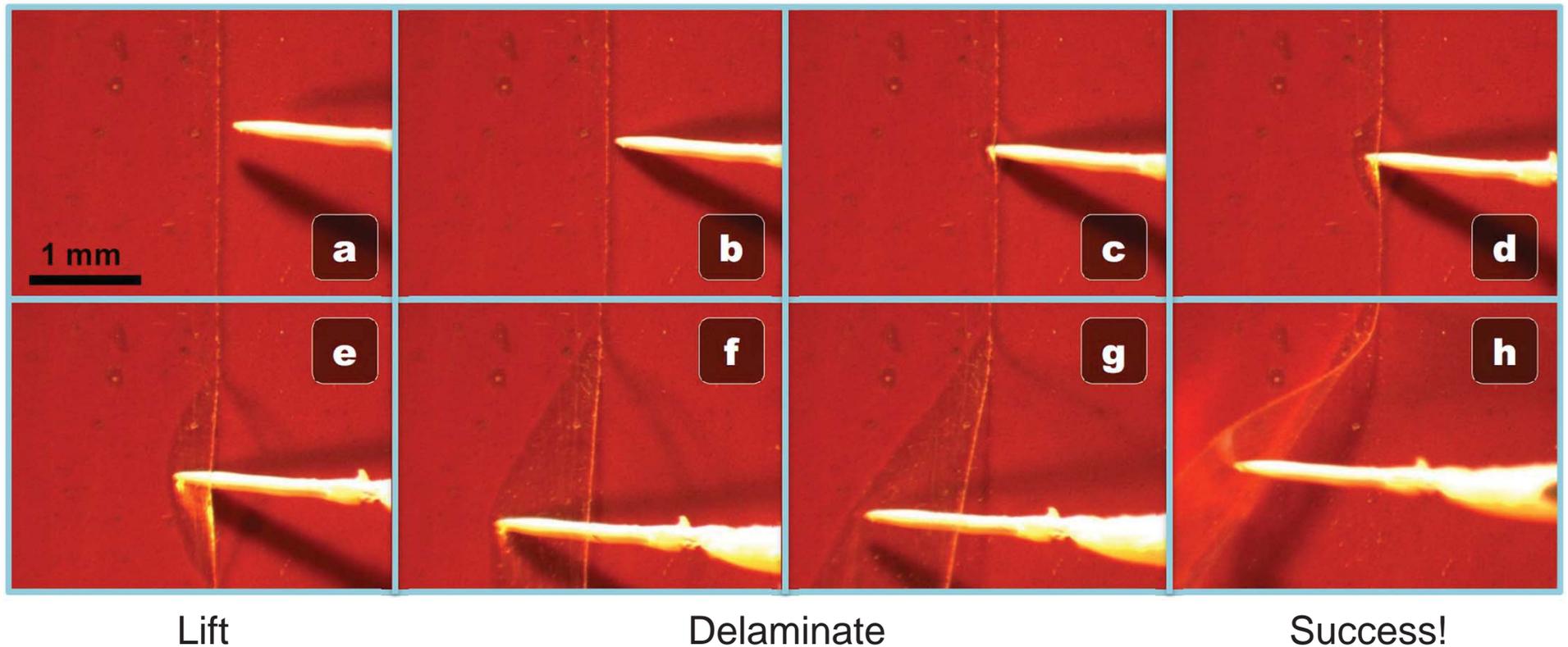
***Goal:***

*Limits on force and speed*



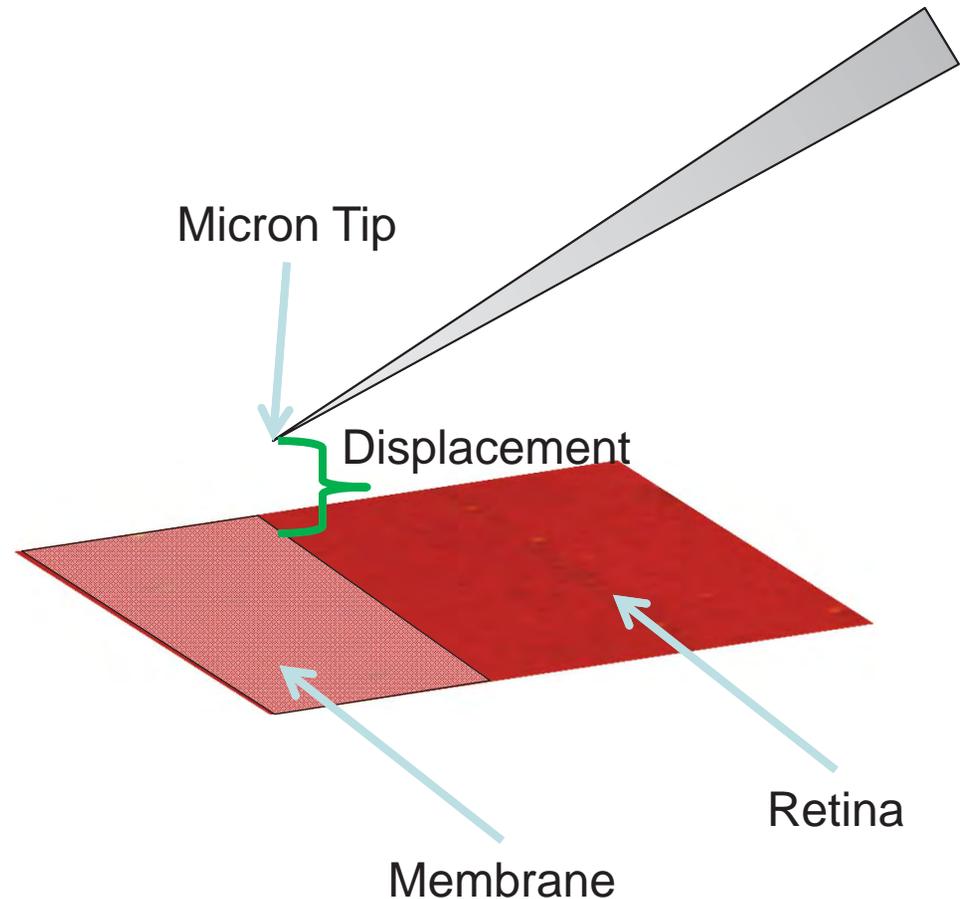
# Peeling Procedure

- Plastic wrap (12  $\mu\text{m}$ ) on top of rubber/sorbothane



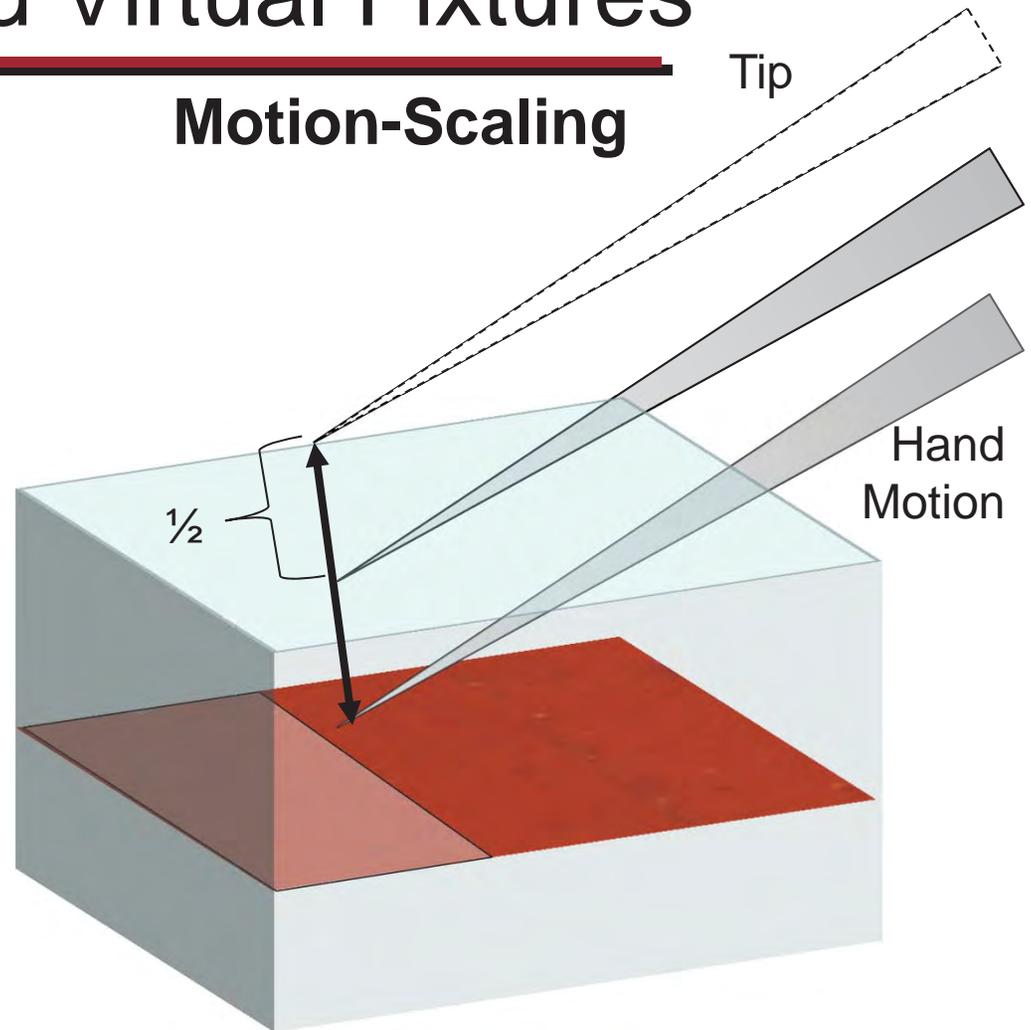
# Vision-Based Virtual Fixtures

- Goals
  - Increase precision
  - Limit force
  - Prevent retina tearing
- Vision-Based Behaviors
  - Motion-scaling
  - Hard-stop
  - Velocity Limiting



# Vision-Based Virtual Fixtures

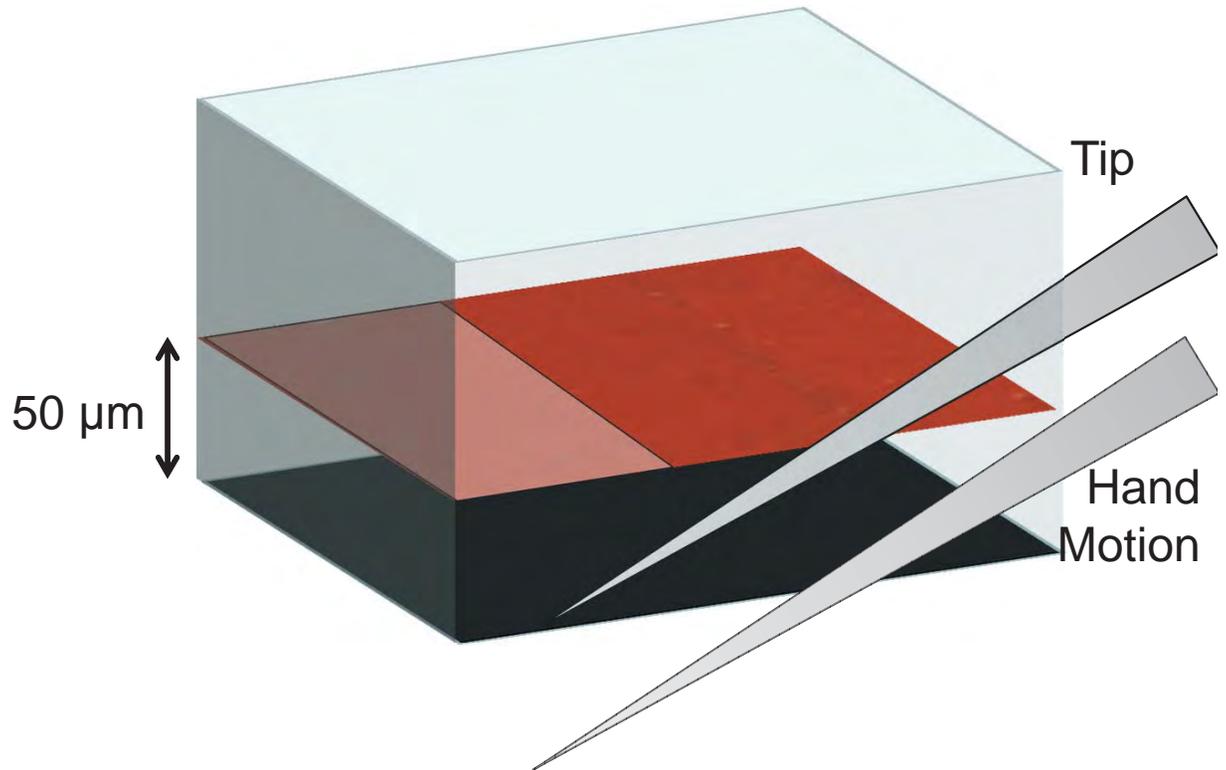
- Goals
  - Increase precision
  - Limit force
  - Prevent retina tearing
- Behaviors
  - **Motion-scaling**
  - Hard-stop
  - Velocity Limiting



# Vision-Based Virtual Fixtures

- Goals
  - Increase precision
  - Limit force
  - Prevent retina tearing
- Behaviors
  - Motion-scaling
  - **Hard-stop**
  - Velocity Limiting

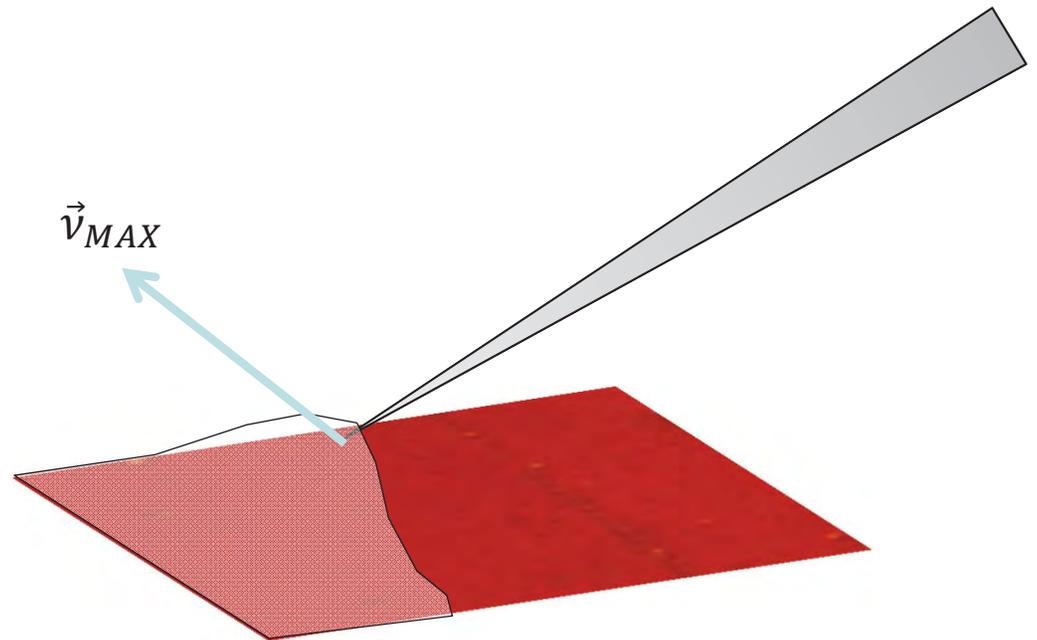
## Hard Stop



# Vision-Based Virtual Fixtures

- Goals
  - Increase precision
  - Limit force
  - Prevent retina tearing
- Behaviors
  - Motion-scaling
  - Hard-stop
  - **Velocity Limiting**

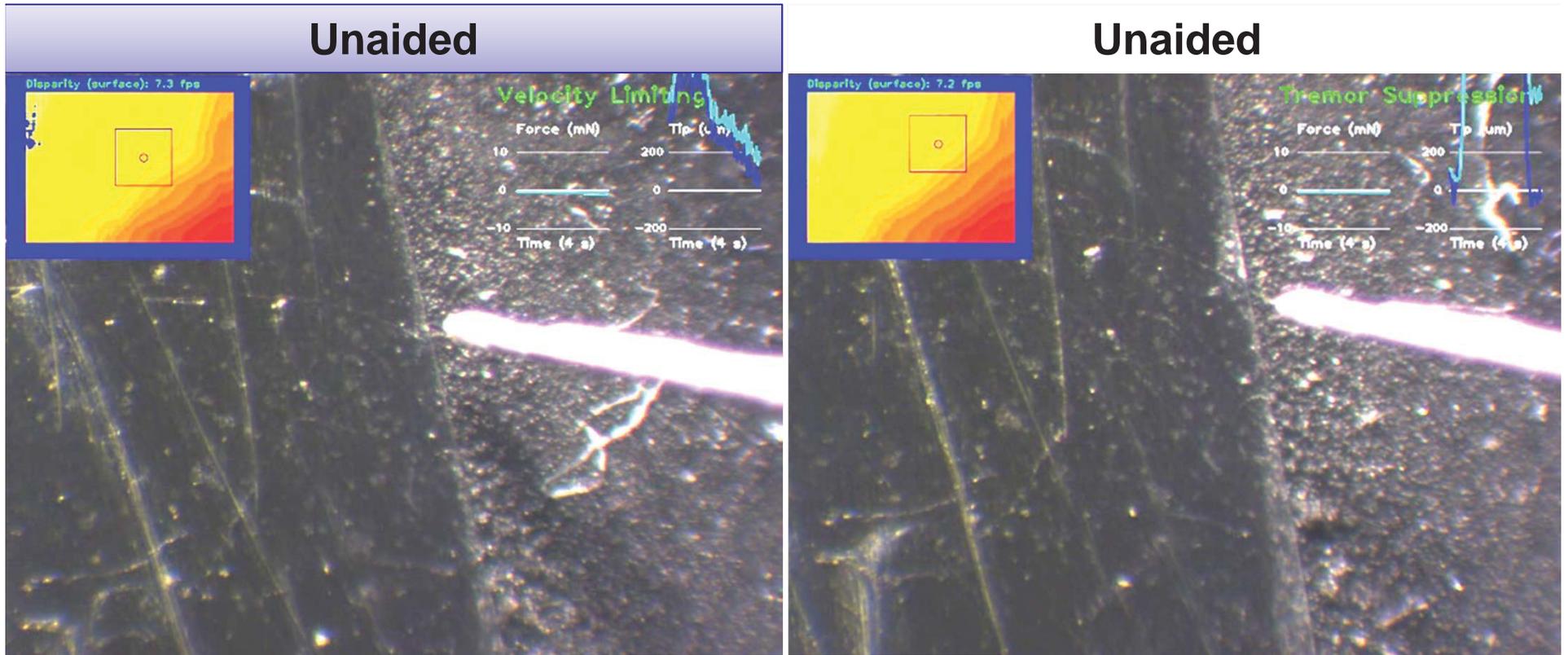
## Velocity Limiting



# Results: Qualitative

---

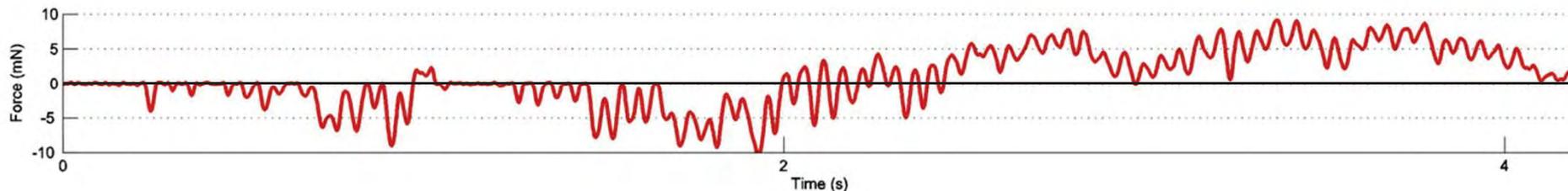
## Peeling Plastic Wrap from Sorbothane



Surgeon Results



# Results: Forces

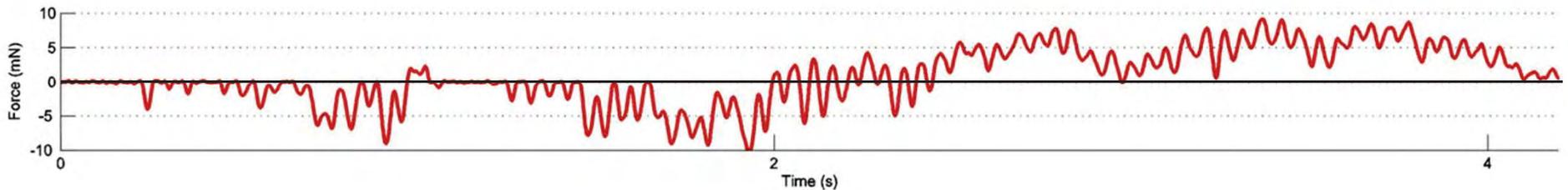


○ Force magnitude  $> 8$  mN

○ Jerky force from tremor

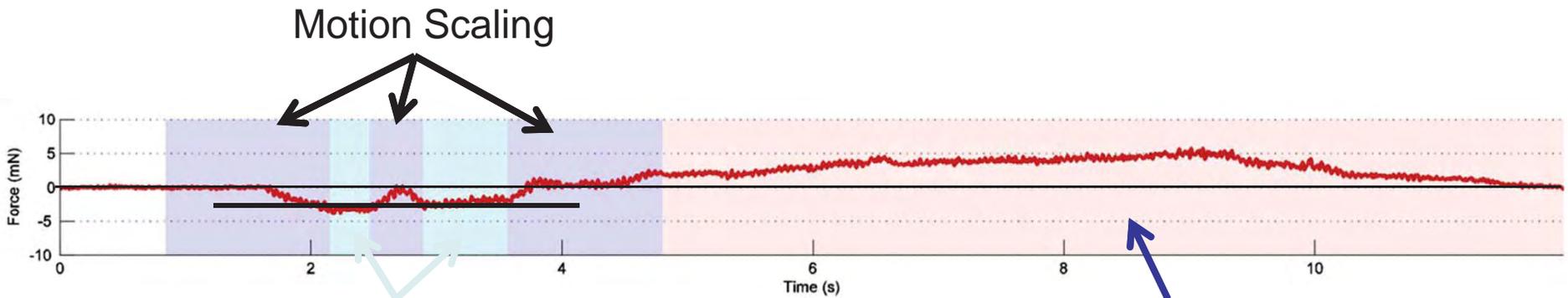


# Results: Forces



- Force magnitude  $> 8$  mN
- Jerky force from tremor

- Aided

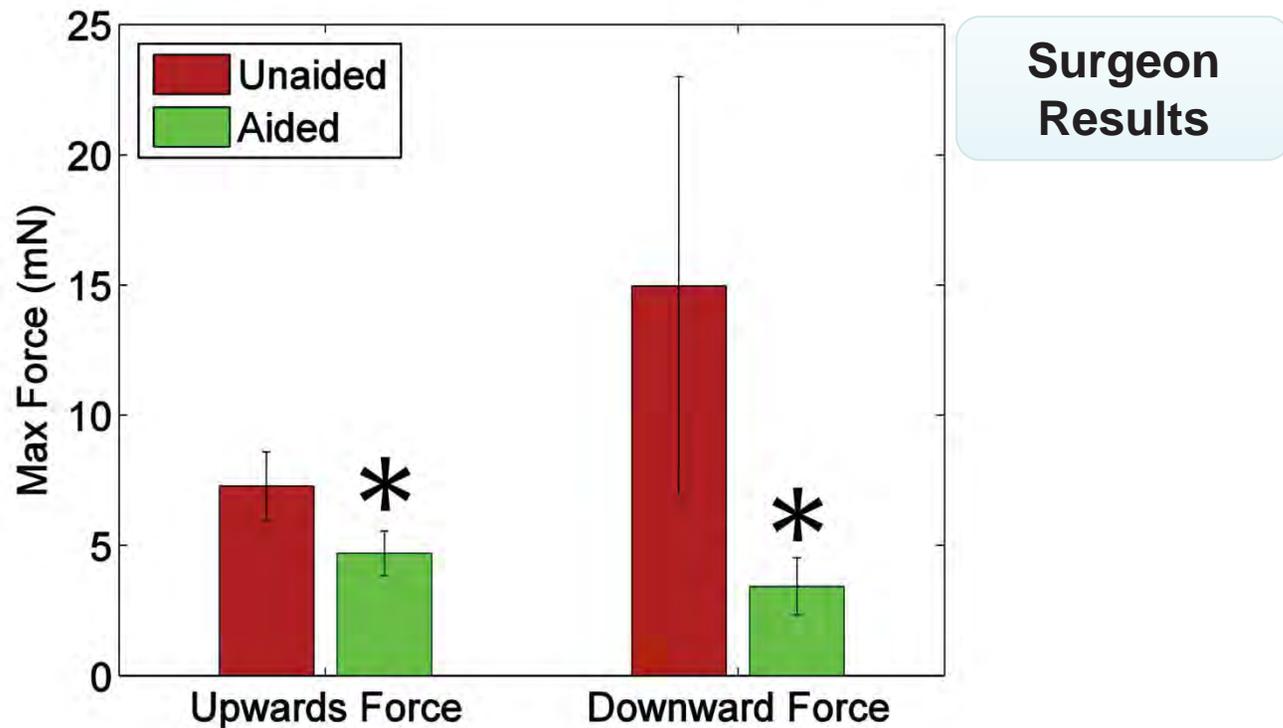


- Hard stop limits force
- Velocity limiting smooths force



# Results: Quantitative

Experienced retinal surgeon: 20 randomized trials

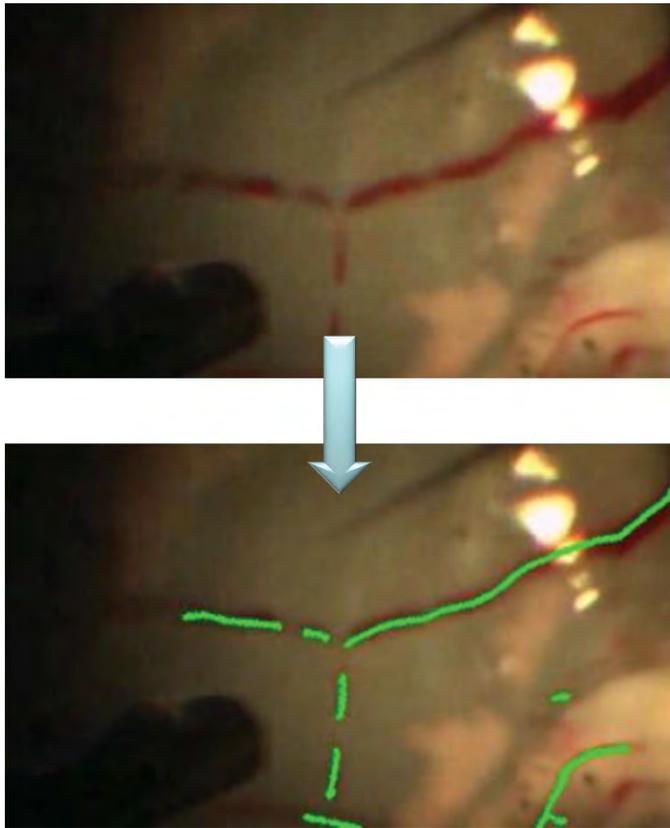


*Significantly reduces max force  $^*(p < 0.05)$*



# Retinal Vessel Detection

**Goal: detecting and tracking vessels in challenging retinal environment for input to surgical robots**



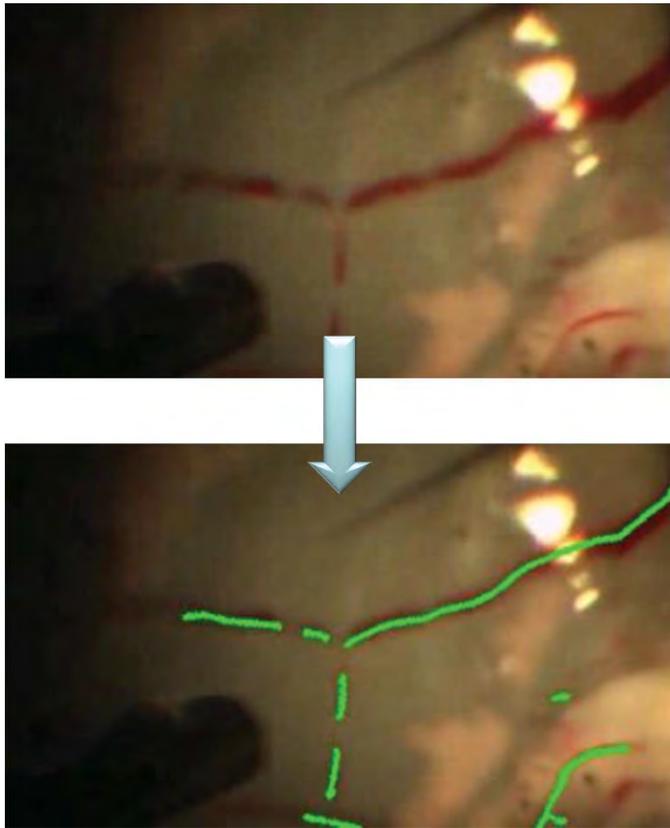
## General Approaches

- **Vessel detection:** finds thin skeleton structures in images
- **Retinal registration:** finds transformations between images
  - **Sparse key-points:** SIFT/SURF
  - **Vasculature:** bifurcations
  - **Dense pixels:** cross-correlation
- **SLAM:** localizes and builds a map at the same time from observations



# Retinal Vessel Detection

**Goal: detecting and tracking vessels in challenging retinal environment for input to surgical robots**



Algorithm	Year	Time
Chaudhuri et al.	1989	50 s
Can et al.	1999	0.03 s
Charvillat et al.	2002	2 min
Jian et al.		s
Staal et al.		min
Soares et al.		min
Sofka et al.		s
Menon et al.		min
Alonso-Montes et al.	2008	0.5 s
Lupascu et al.	2010	2 min
Bankhead et al.	2012	0.2 s

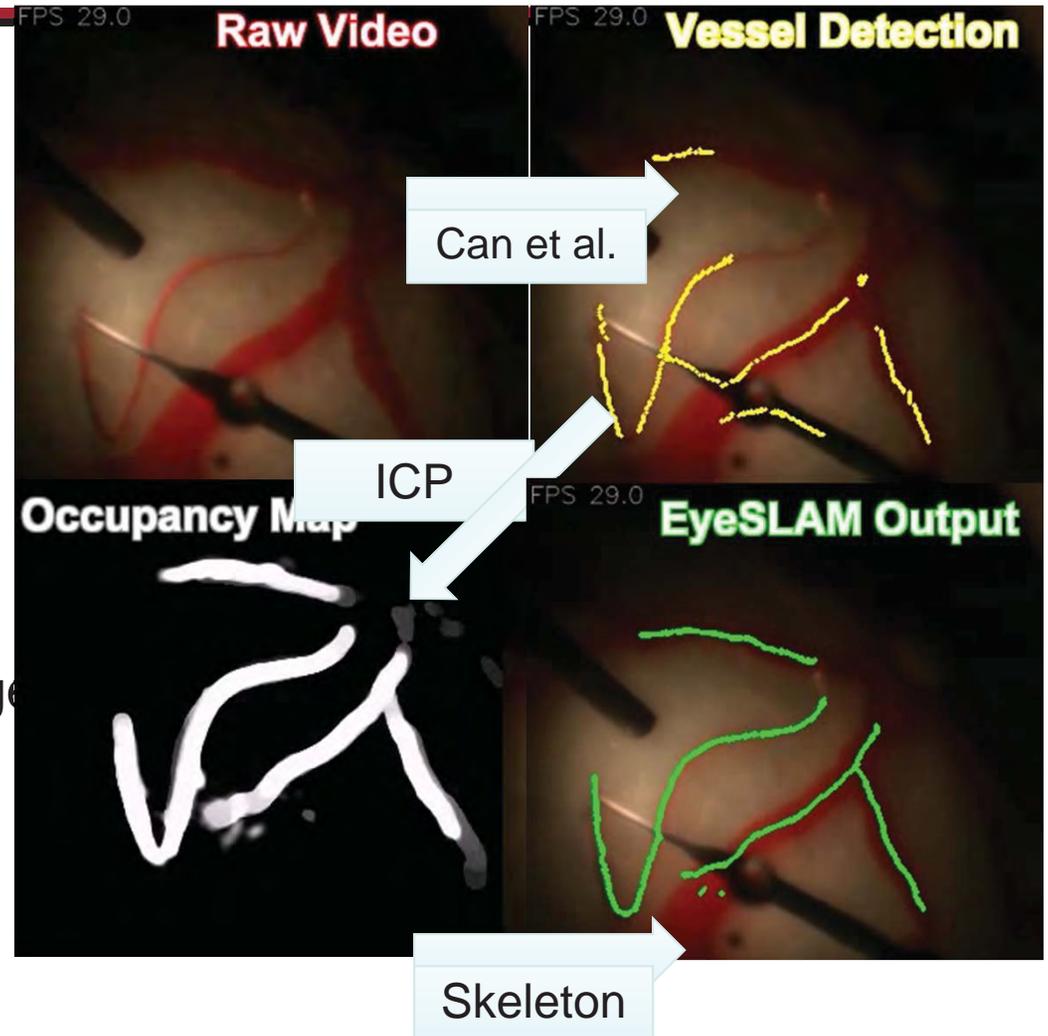
### Missing features:

- Robustness to illumination changes
- Occlusions by lightpipe or instrument
- Localization of the retina movements

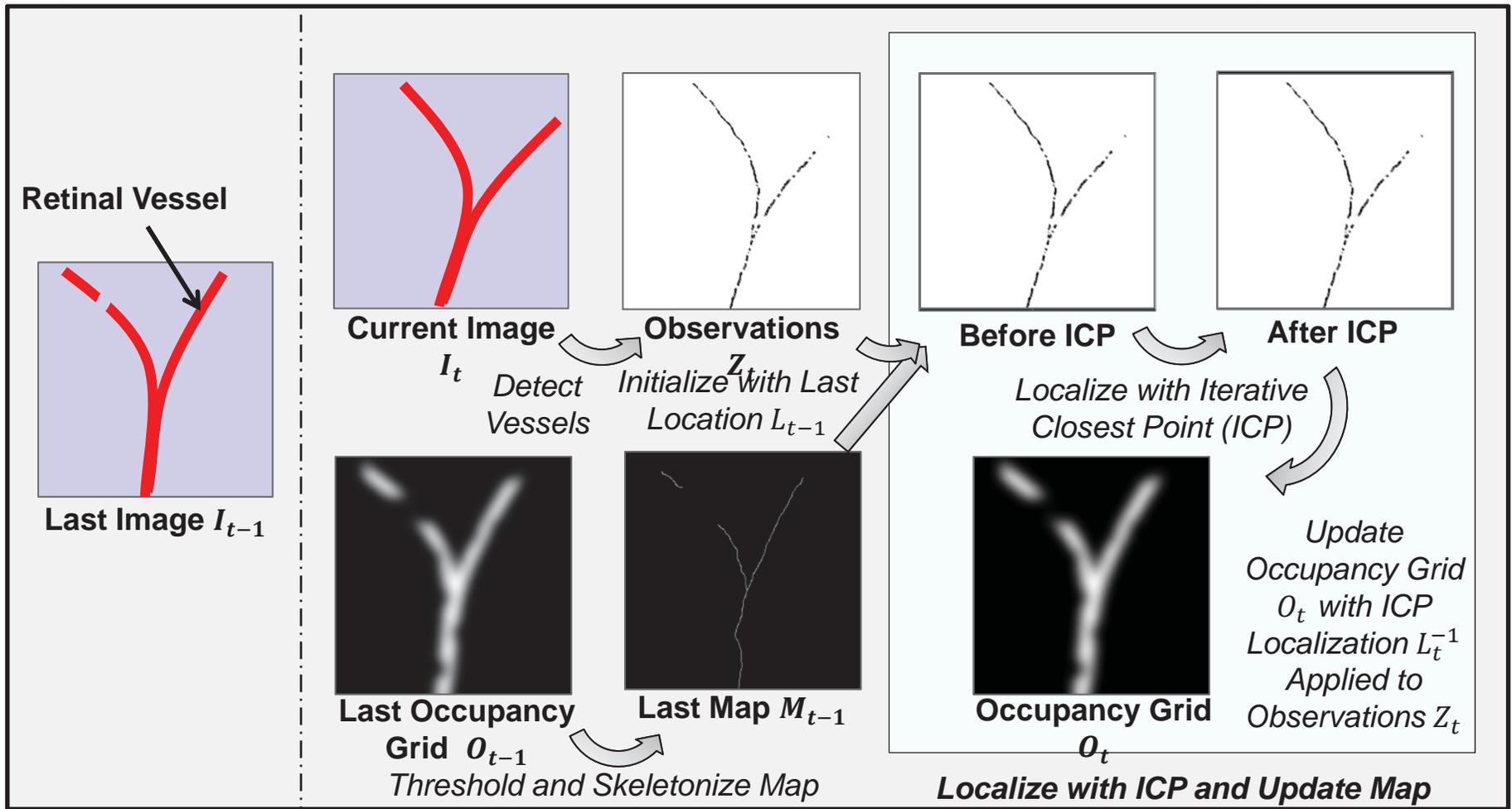


# EyeSLAM Introduction

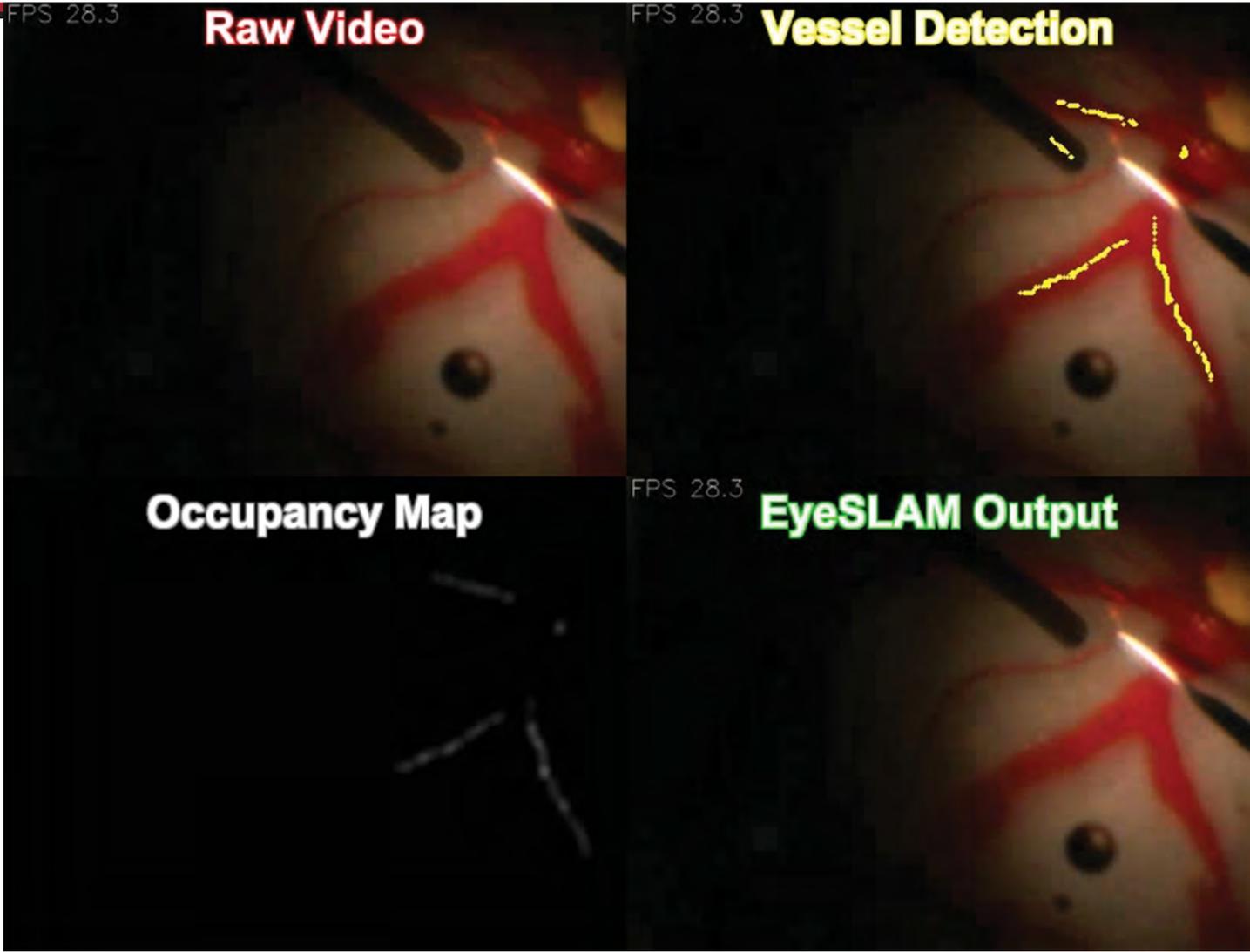
- Simultaneous Localization And Mapping (SLAM)
  - Features are vessels
  - Map is occupancy grid
  - Localization is ICP
- Pros
  - Fast: 30-40 Hz
  - Temporally consistent
  - Robust to illumination change and occlusion



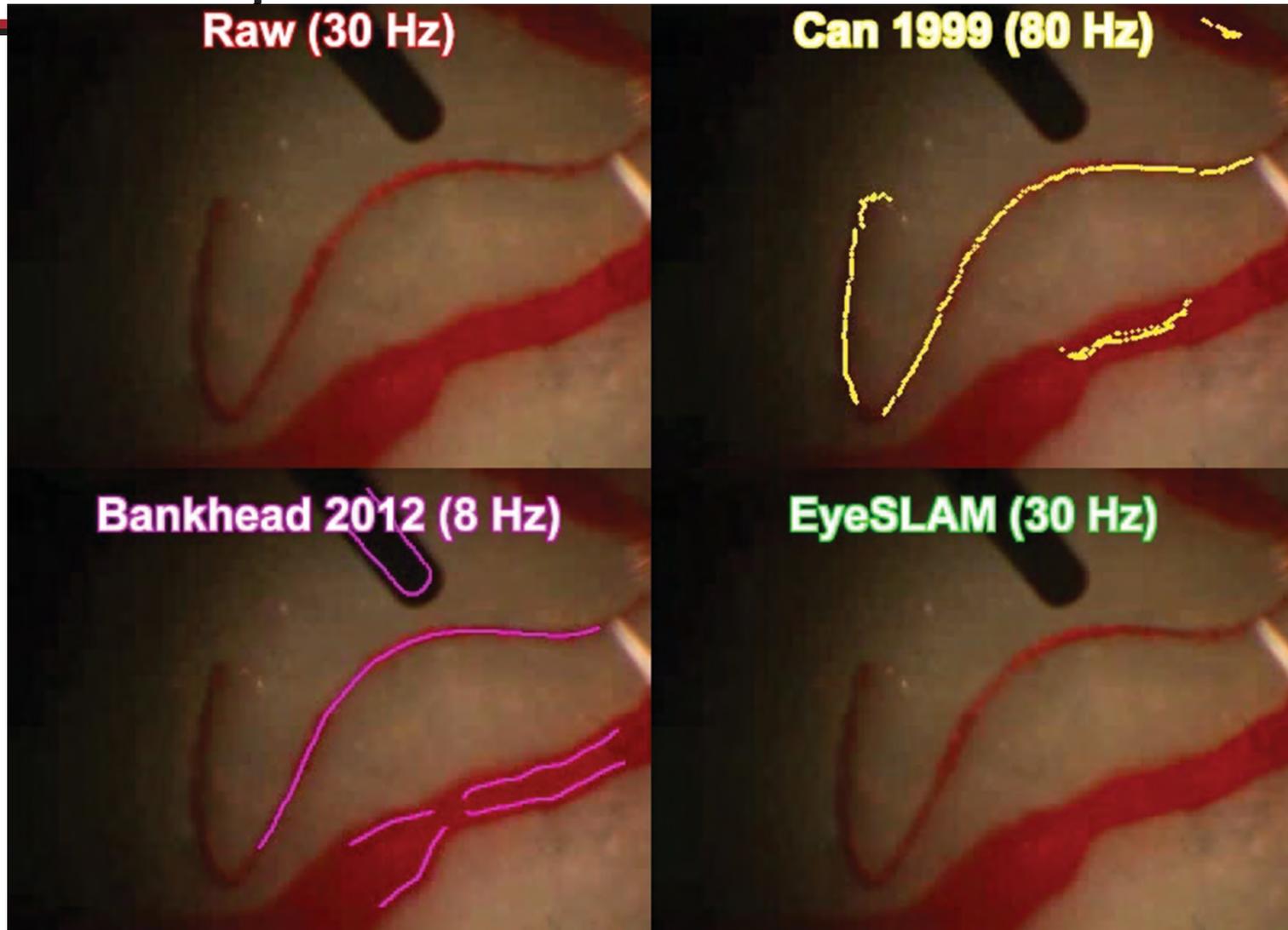
# EyeSLAM Algorithm



# EyeSLAM Internals: Eyeball Phantom



# Comparison to Vessel Detection



# EyeSLAM Results in Porcine Retina

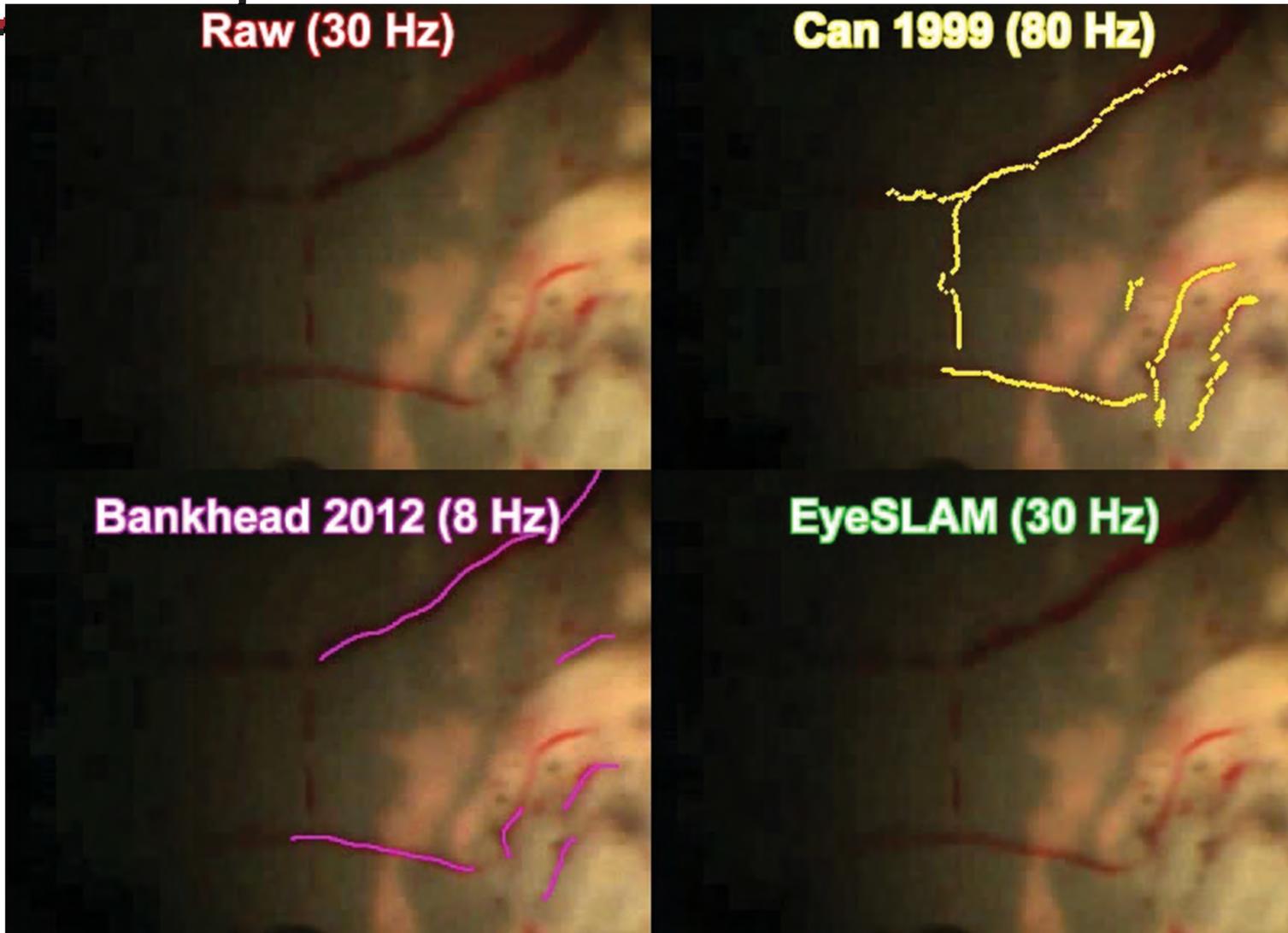
---



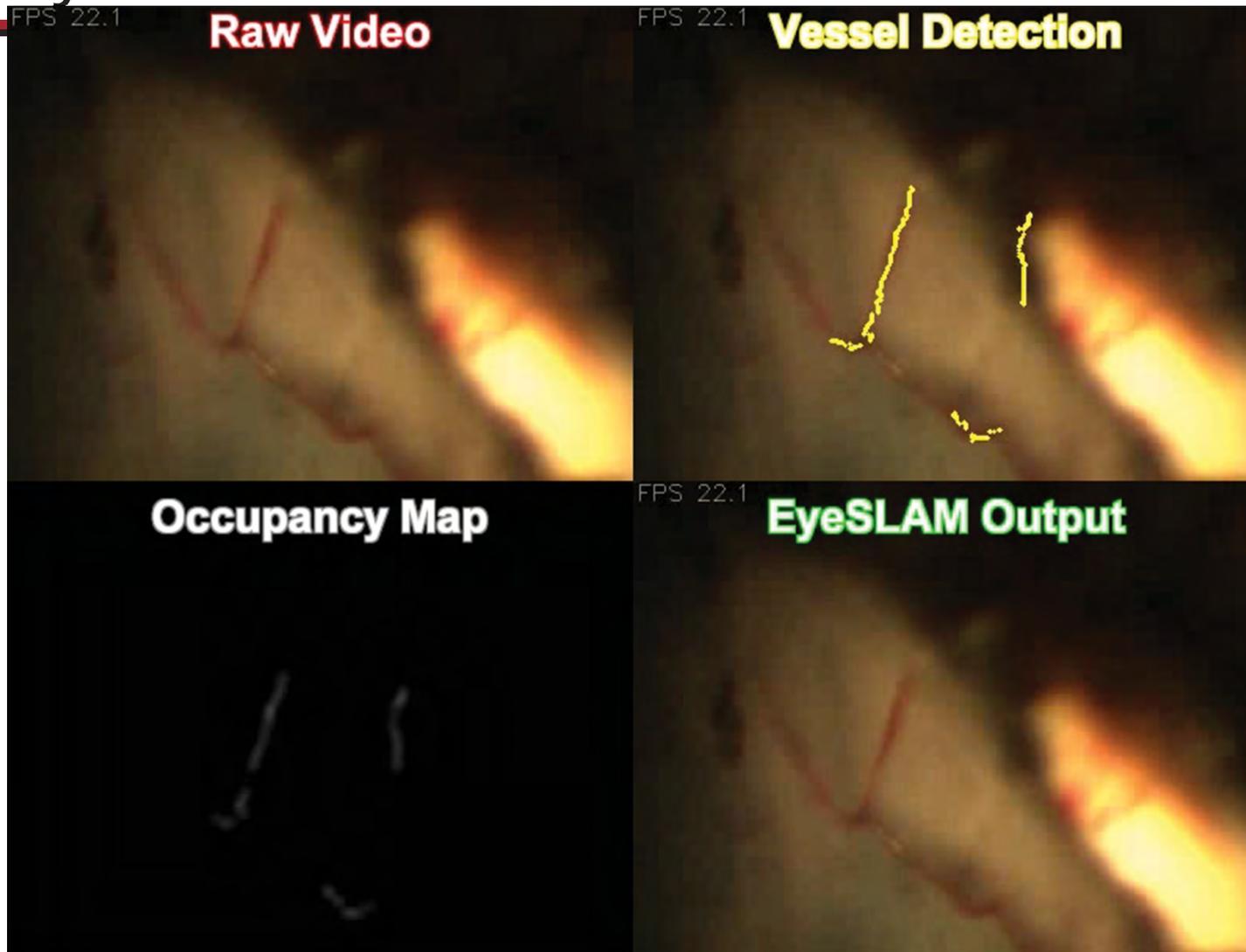
Surgeon Result: Attempted  
Cannulation in Porcine Retina



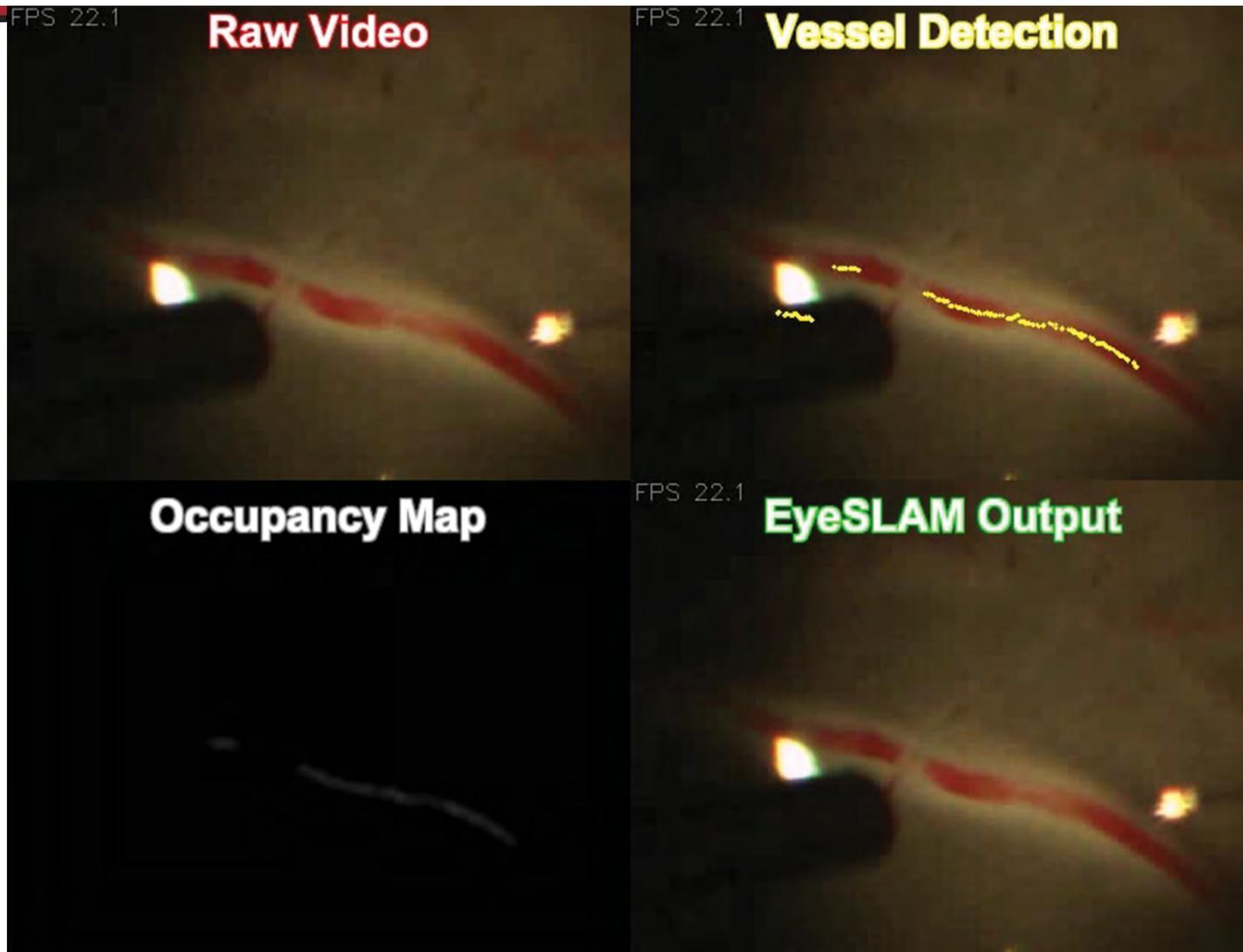
# Comparison to Vessel Detection



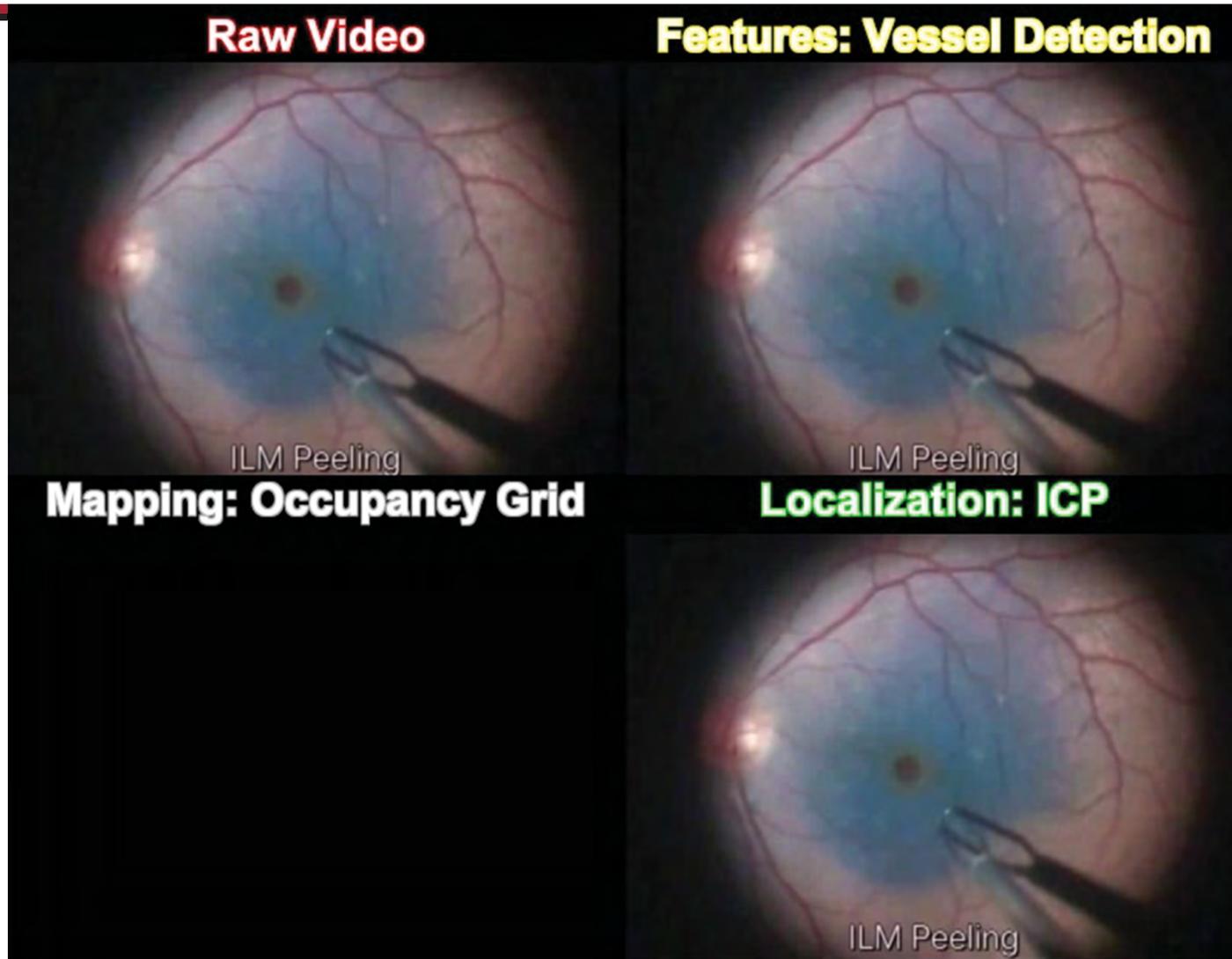
# EyeSLAM Illumination Robustness



# EyeSLAM with Occlusion



# EyeSLAM on Retinal Procedure Video

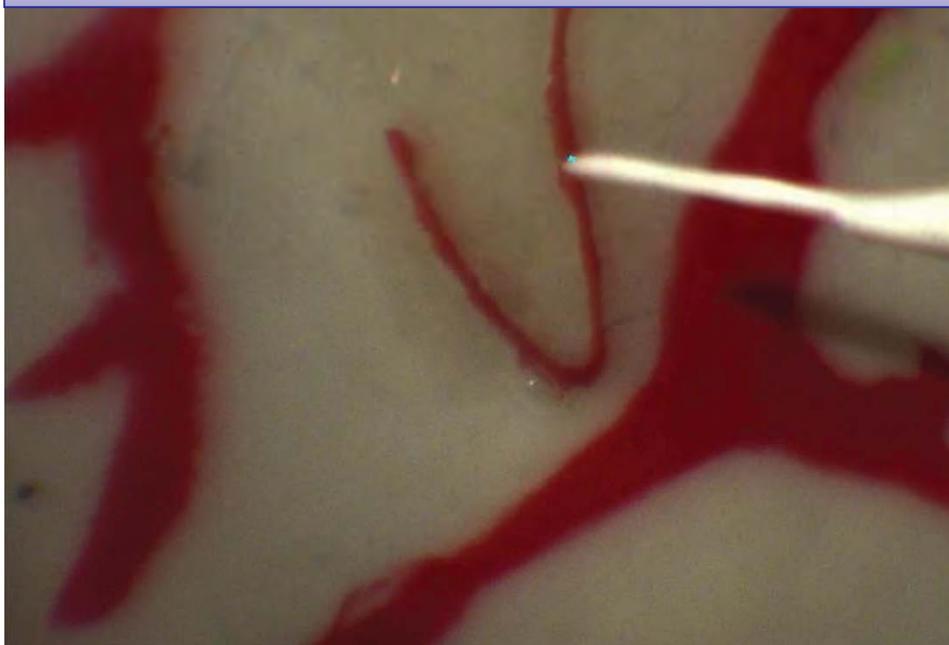


# EyeSLAM with Micron Robot

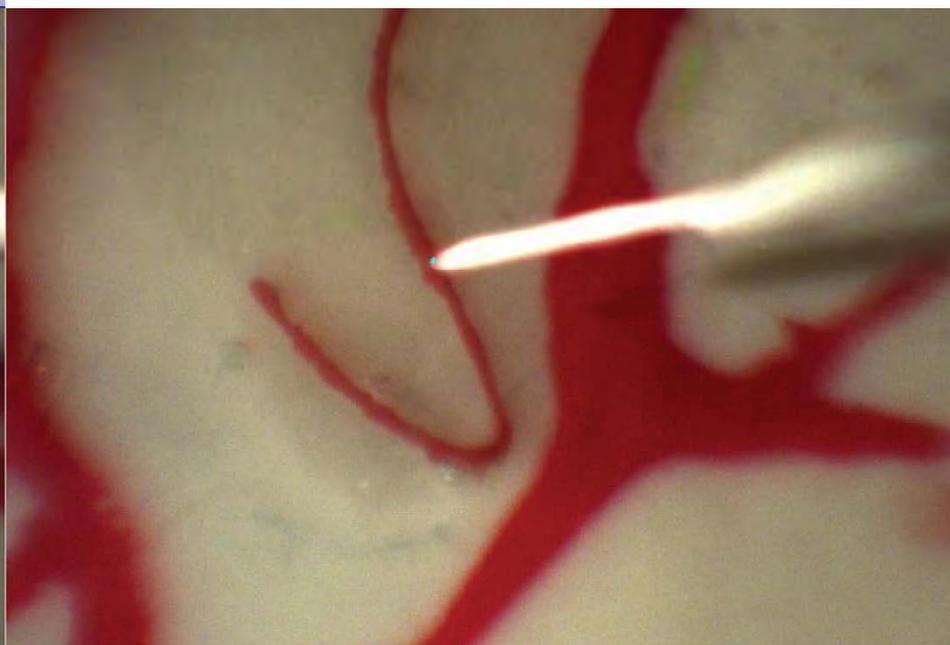
- EyeSLAM tracks vein in eyeball phantom
- Micron enforces virtual fixture, keeping the instrument tip on the vein



Unaided – Micron Off



Aided – Hard Virtual Fixture



# EyeSLAM Summary

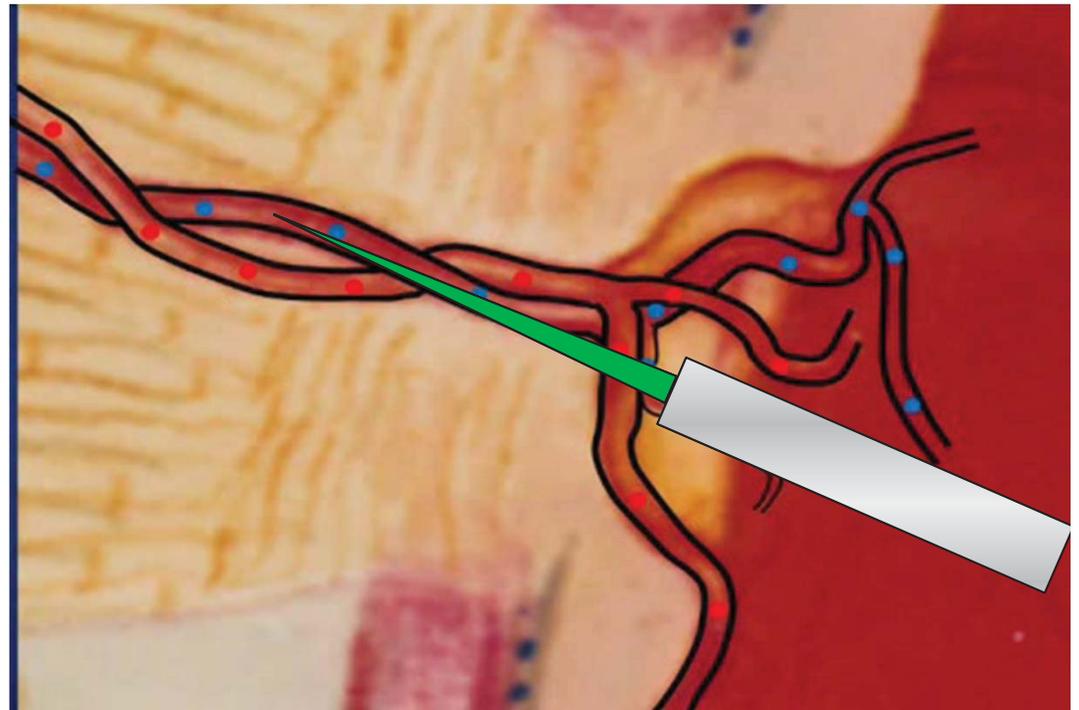
---

- EyeSLAM is a real-time algorithm that:
  - Builds a map of the vasculature
  - Localizes the retinal movements
  - Handles occlusion and moving instruments
  - Robust to illumination changes
- Future work for EyeSLAM improvements
  - More sophisticated motion model (e.g. spherical)
  - Quantitative evaluation of accuracy
  - More robust vessel detection
  - Improve uncertainty to reduce jitter



# Vessel Cannulation

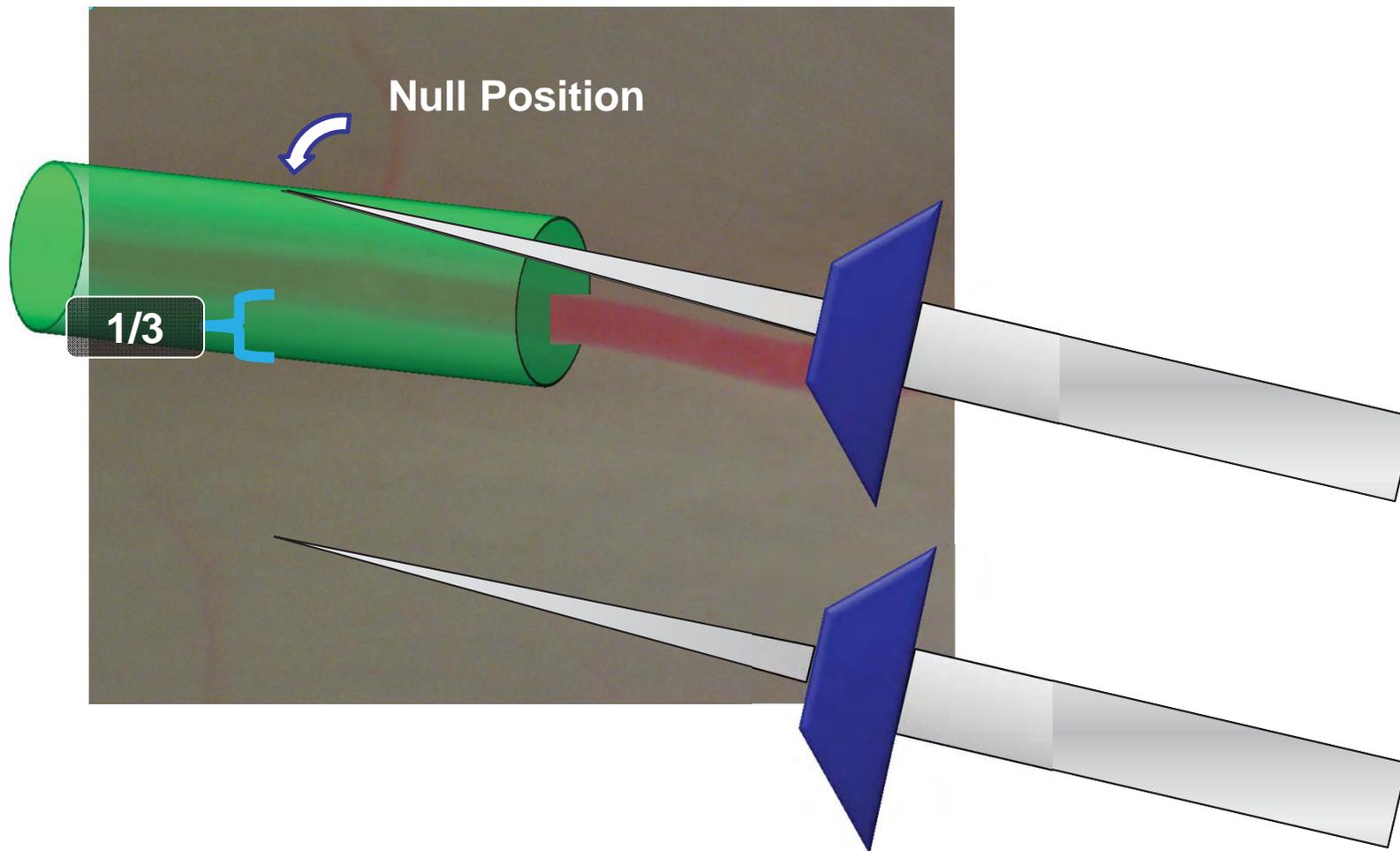
- Inject thrombolytic drugs (Weiss01, Bynoe05, Feltgen07)
- Very difficult (Joussen07)
- Behavior Aids
  - Steady approach
  - Motion scaling
  - Maintain position
  - Prevention zones



Retinal Vessel Occlusion (RVO)

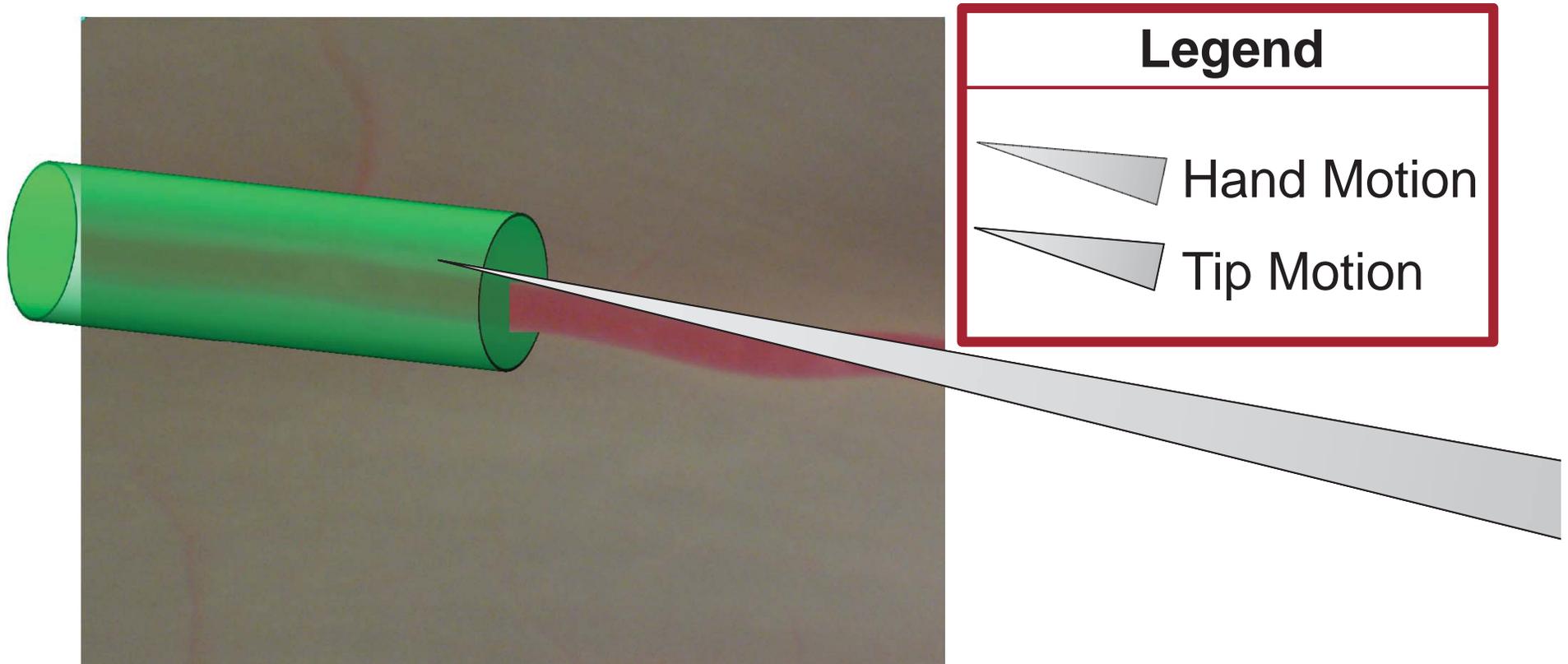


# Anisotropic Motion Scaling



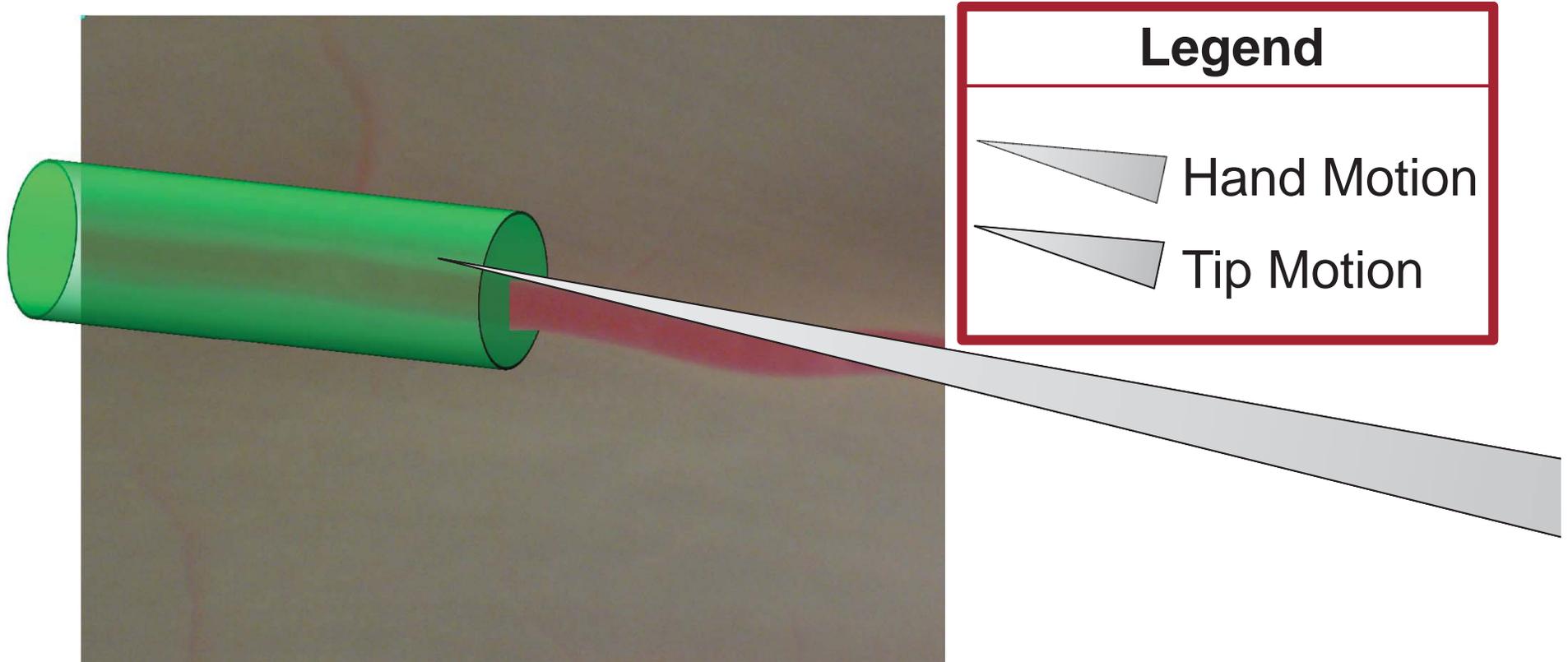
# ...Plus Tremor Suppression

*Combined with low pass filter to reduce tremor in axial direction*



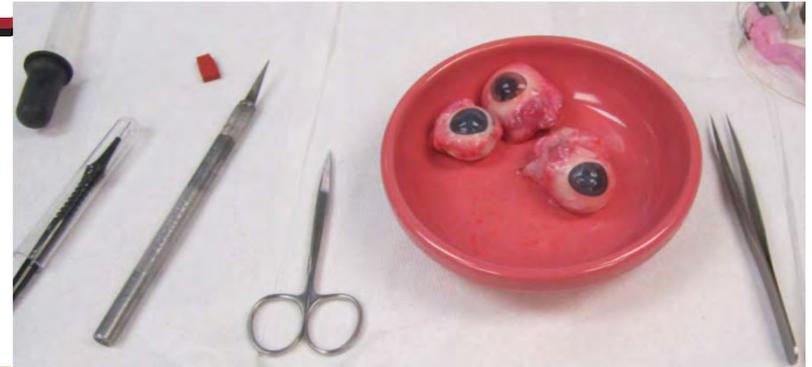
# ...Plus Tremor Suppression

*Combined with low pass filter to reduce tremor in axial direction*



# Results: Porcine Retina

- Surgeon injecting air into vessel in “open-sky” setup



**Unaided Cannulation**  
In Porcine Retina



**Aided Cannulation**  
In Porcine Retina



Surgeon Results



# Results: Chick Eggs

---

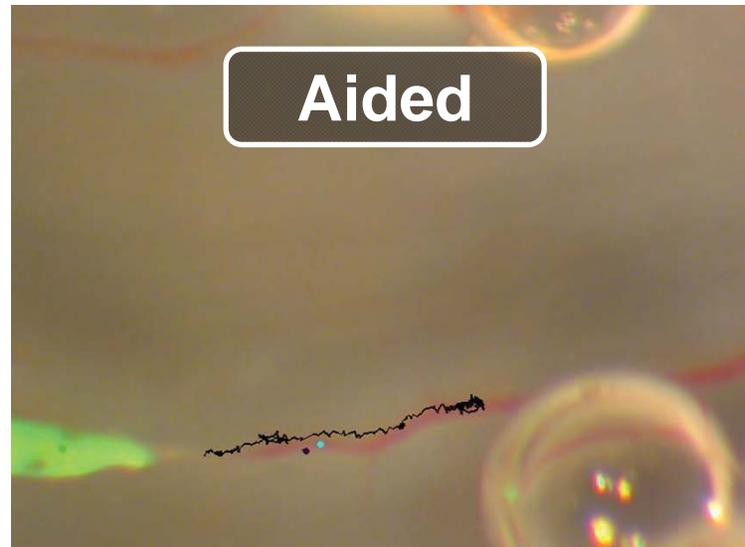
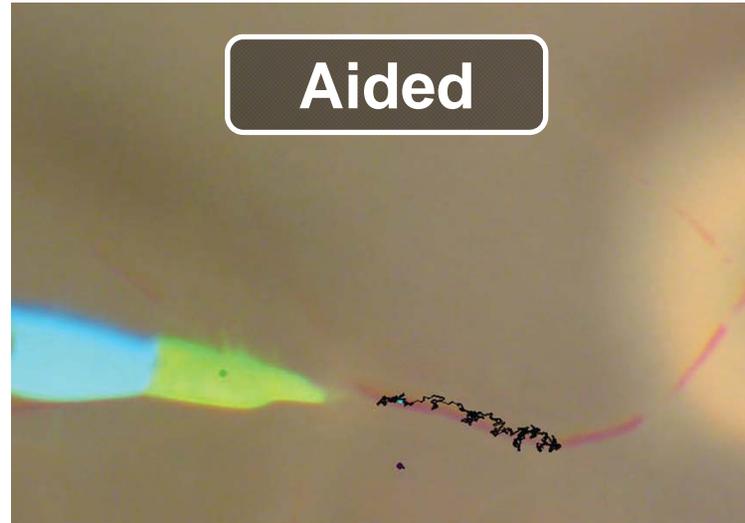
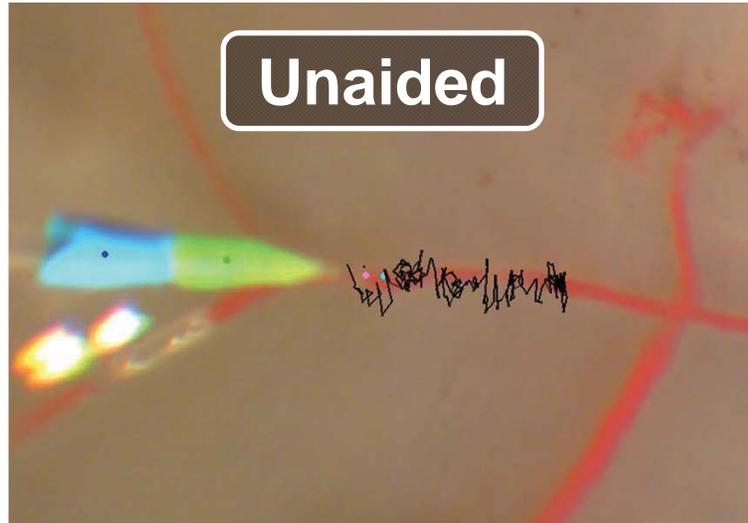
**Unaided Cannulation**  
In Chick Egg

**Aided Cannulation**  
In Chick Egg

Surgeon Results



# Results: Tremor Traces



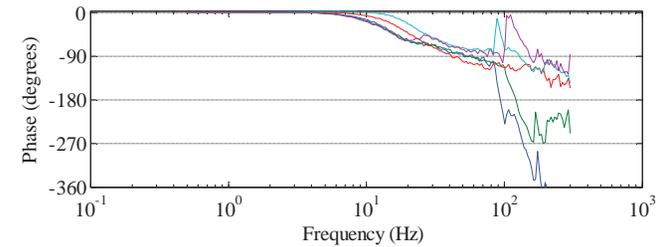
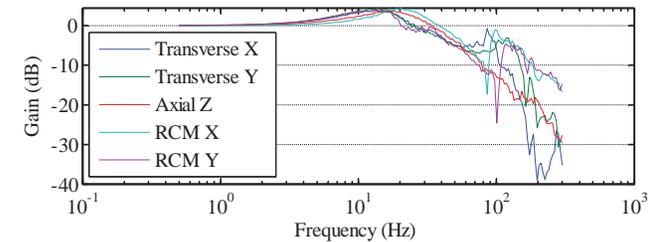
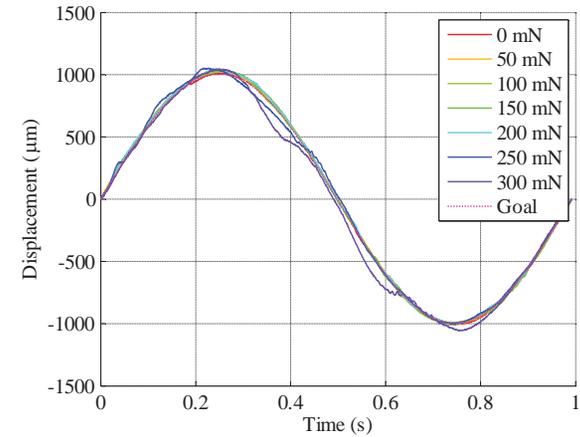
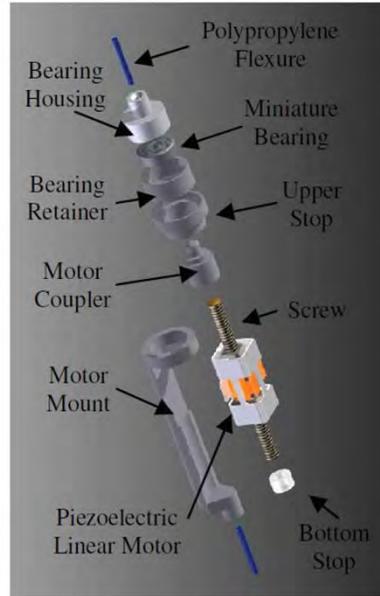
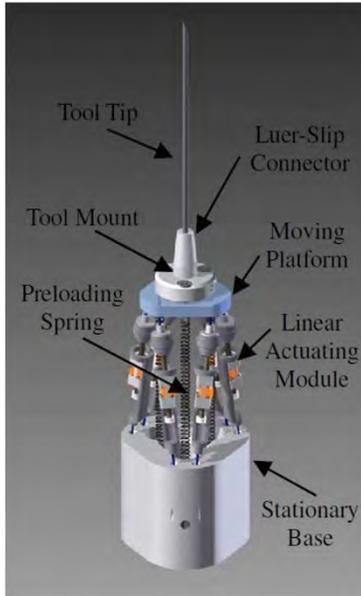
Surgeon  
Results

*Reduce  
Side-to-side  
Positioning  
Error*

*Reduce  
Collateral  
Damage*



# 6DOF Micron



# 6DOF Micron

- Design Goal

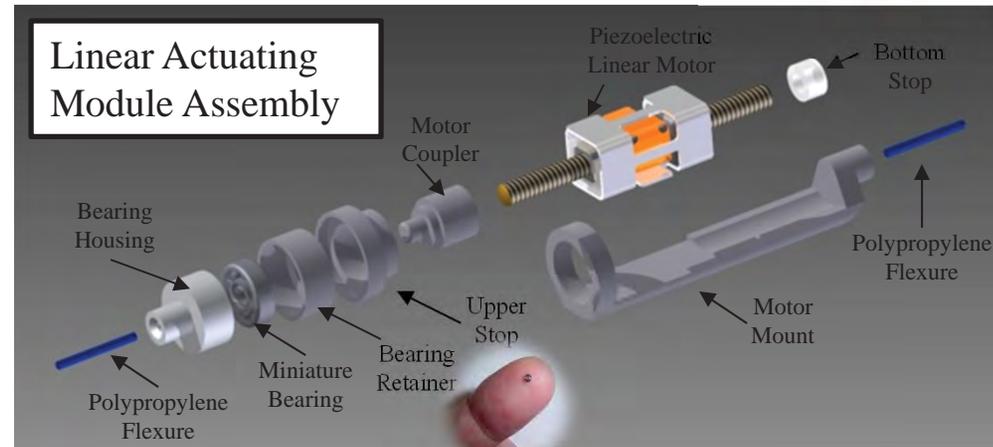
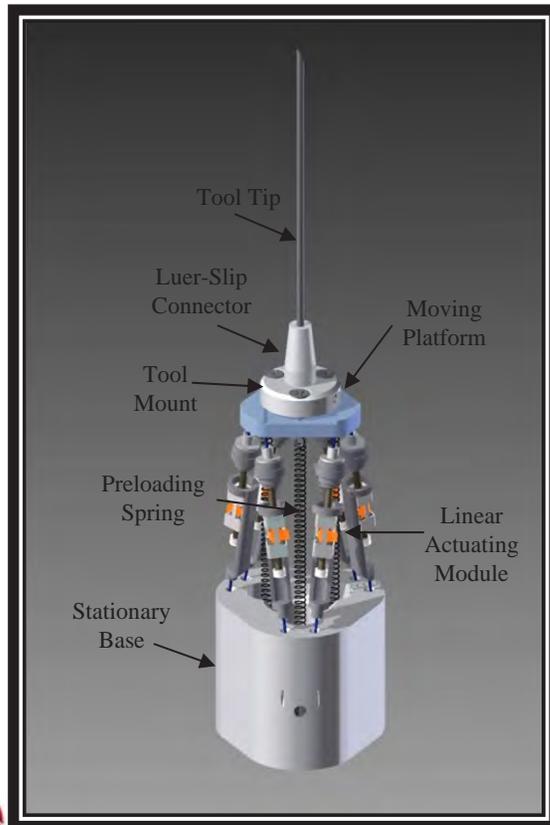
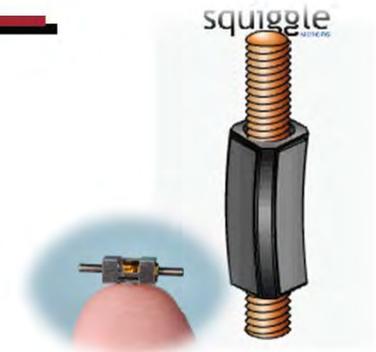


- Higher DOF (~6 DOF)
  - Translation in XYZ at End-Effector (3DOF)
  - Translation in XY at RCM (2 DOF)
  - Axial Rotation (1 DOF)
- Larger Workspace (~4 mm)
- Overall Diameter (~ 25 mm)
- External Load Capability
  - Side Load: Ideally 0.5 N (at least 0.2 N)
  - Normal Load: Ideally 3.0 N



# Mechanical Design

- 6 DOF Parallel Micromanipulator

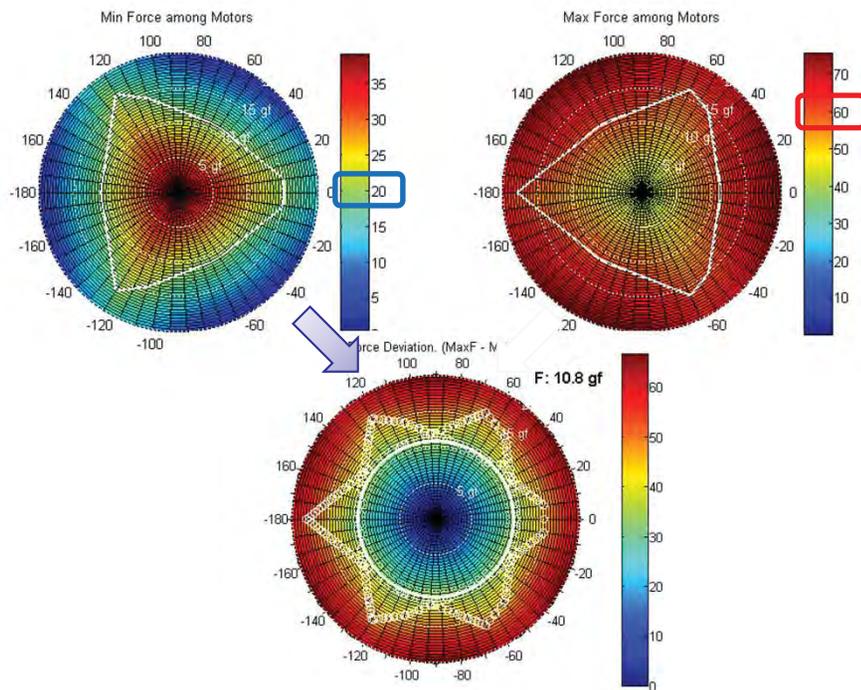


- Dimension:
  - Diameter: 23 mm, Height: 40 mm
- Actuator: SQUIGGLE® motor
  - Dimension: 2.8 mm x 2.8 mm x 6 mm
  - Stall Force: >80 gf at 4.5 V
  - Custom Screw of 14.5 mm
- Flexure Joint: #1-0 polypropylene suture, 1.5 mm length

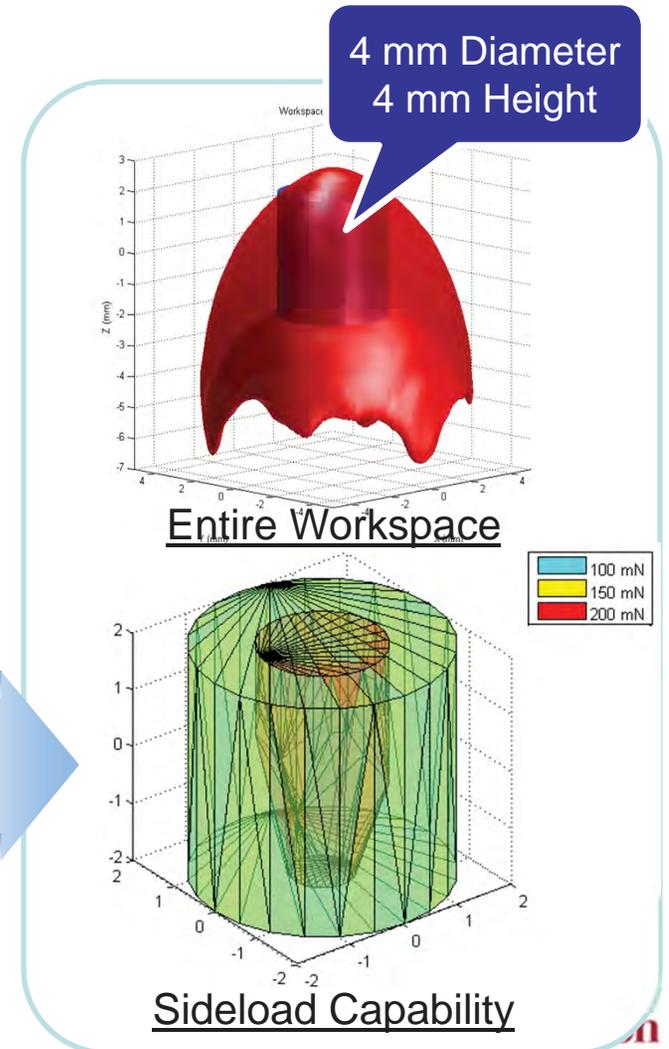


# Workspace Analysis

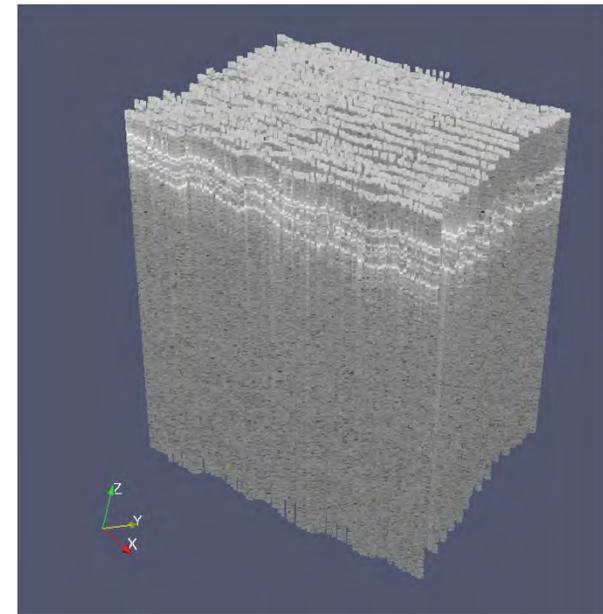
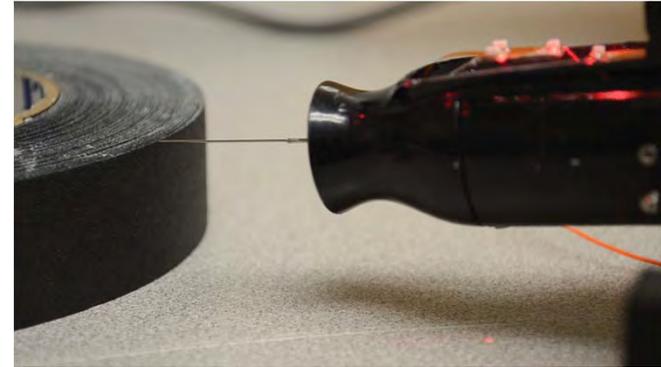
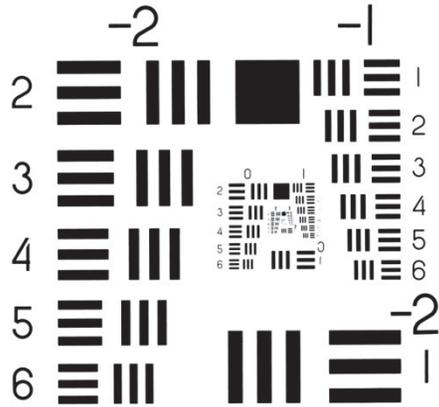
- Sideload Capability



Sideload capability determined by available force range of the motor.



# OCT Scanning



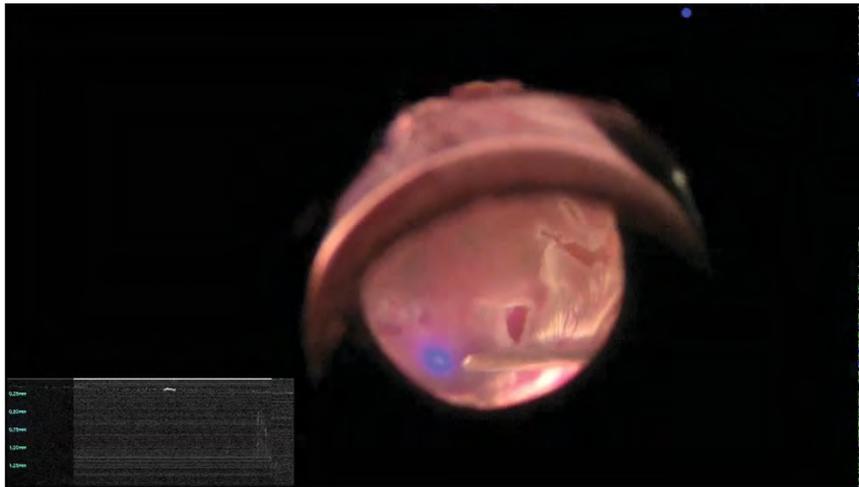
Yang et al., EMBC 2012.

**Carnegie Mellon**  
**THE ROBOTICS INSTITUTE**

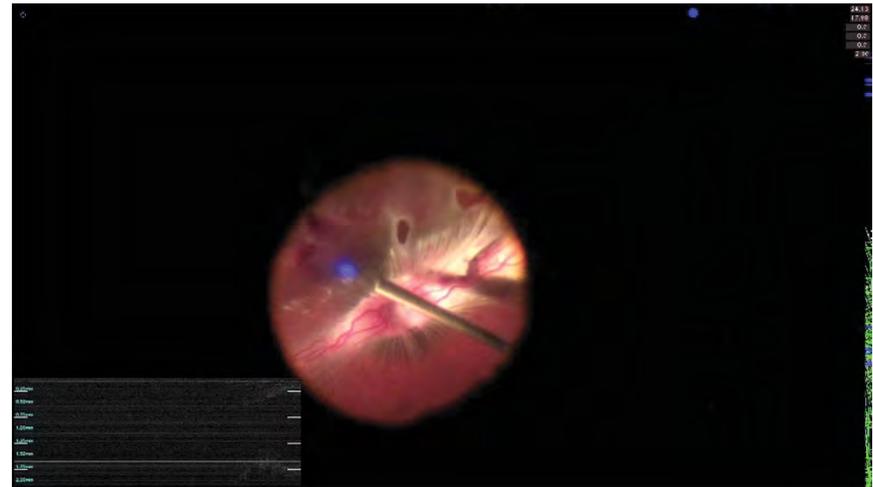
# OCT Scanning *in vivo*

---

B-scan



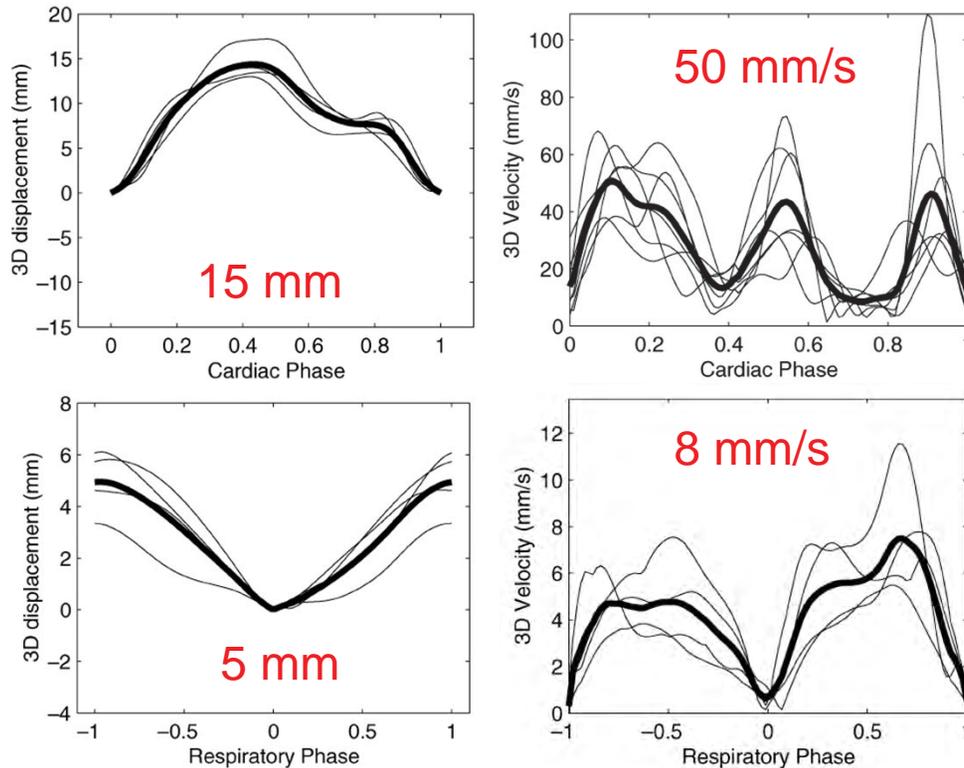
“M-scan”



# Heartbeat and Respiration

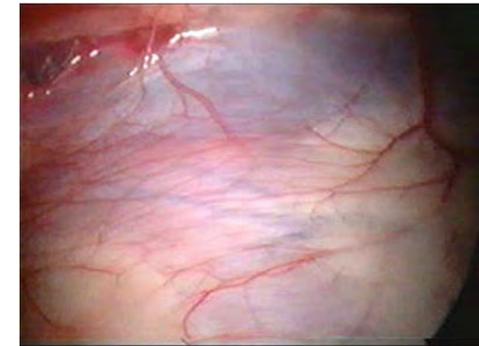


# The heart moves a lot...



Figures from Shecter et al. (2006)

- organs surround heart
- pericardium forms virtual space
- large displacements
- high velocities



# Heartbeat and Respiration Suppression

---

- Active compensation
- Passive compensation



# Heartbeat and Respiration Suppression

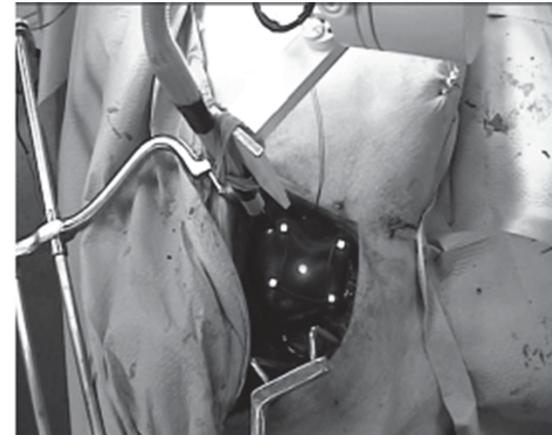
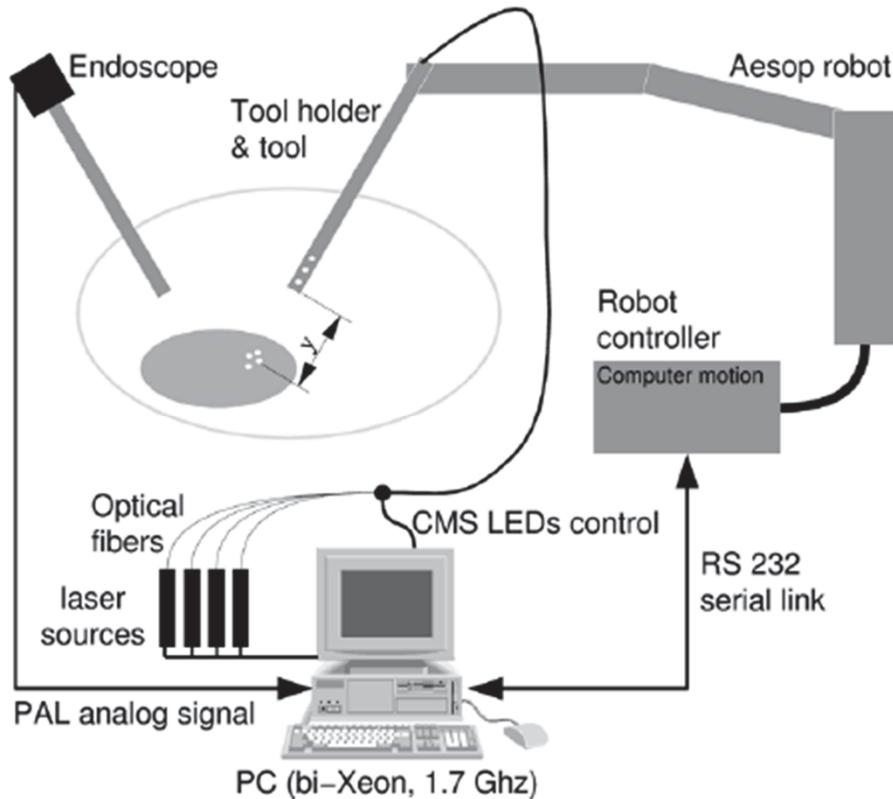
---

- Active compensation
- Passive compensation



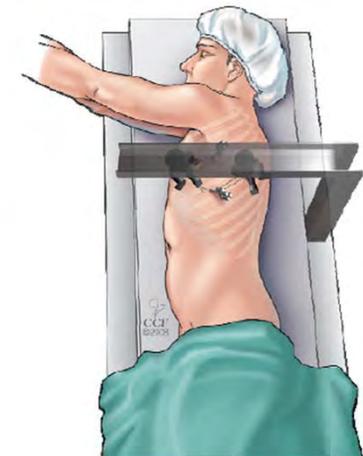
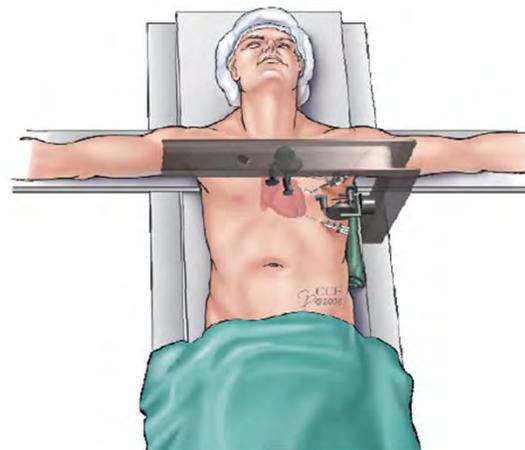
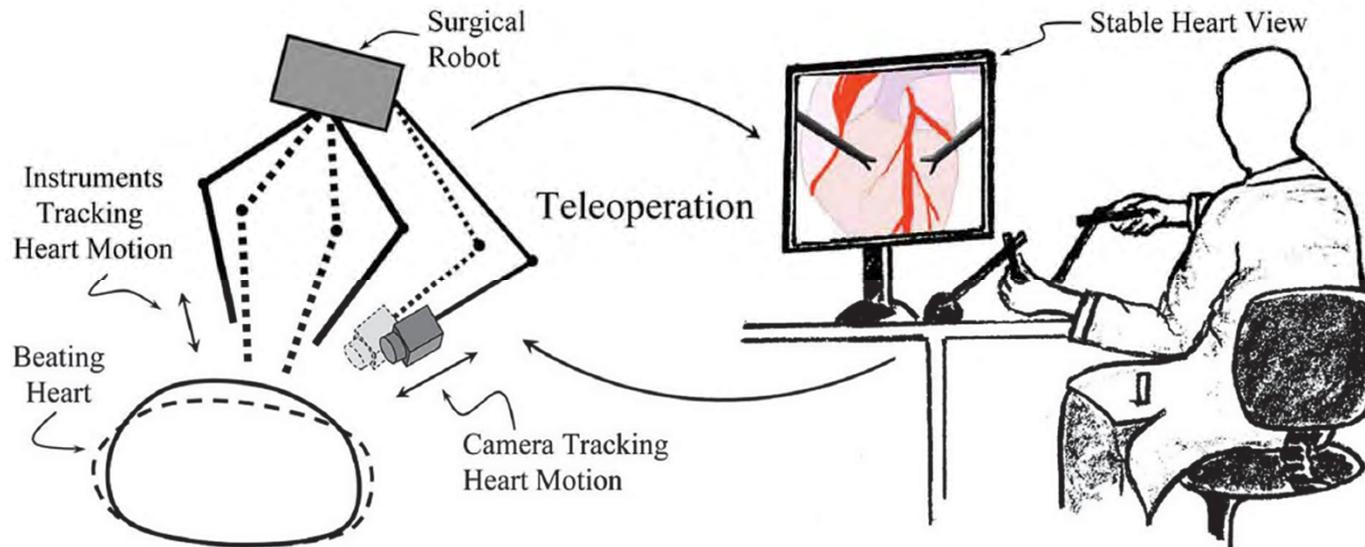
# Vision-based 3D active compensation

Ginhoux, Gangloff, de Mathelin, et al. (U. Strasbourg)



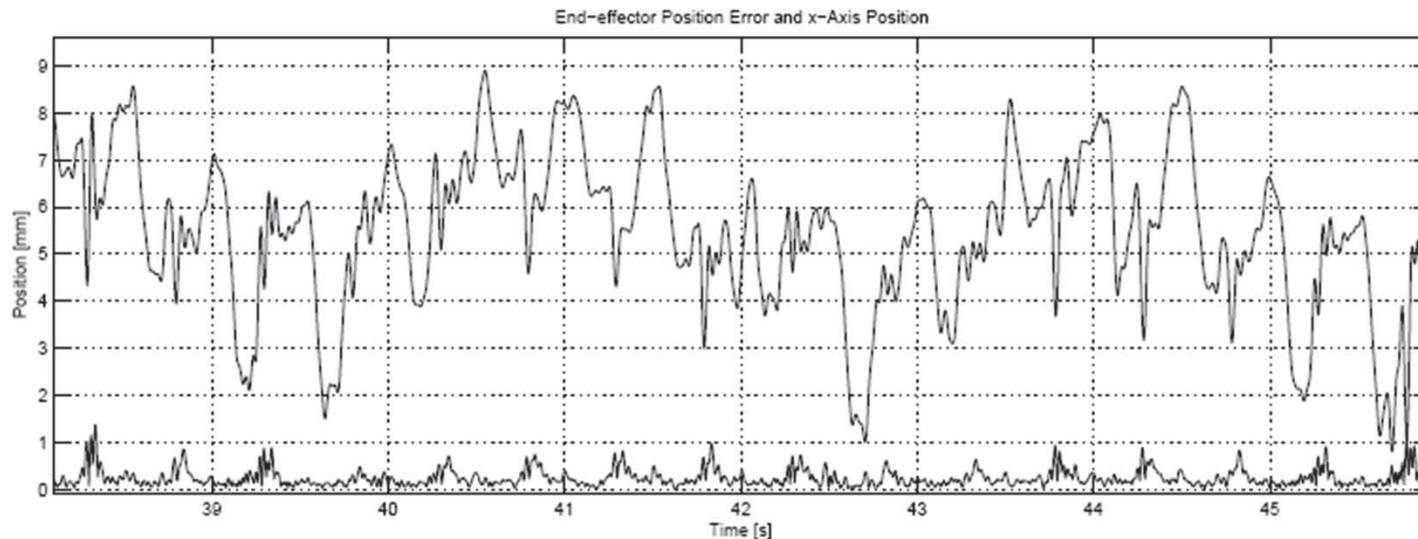
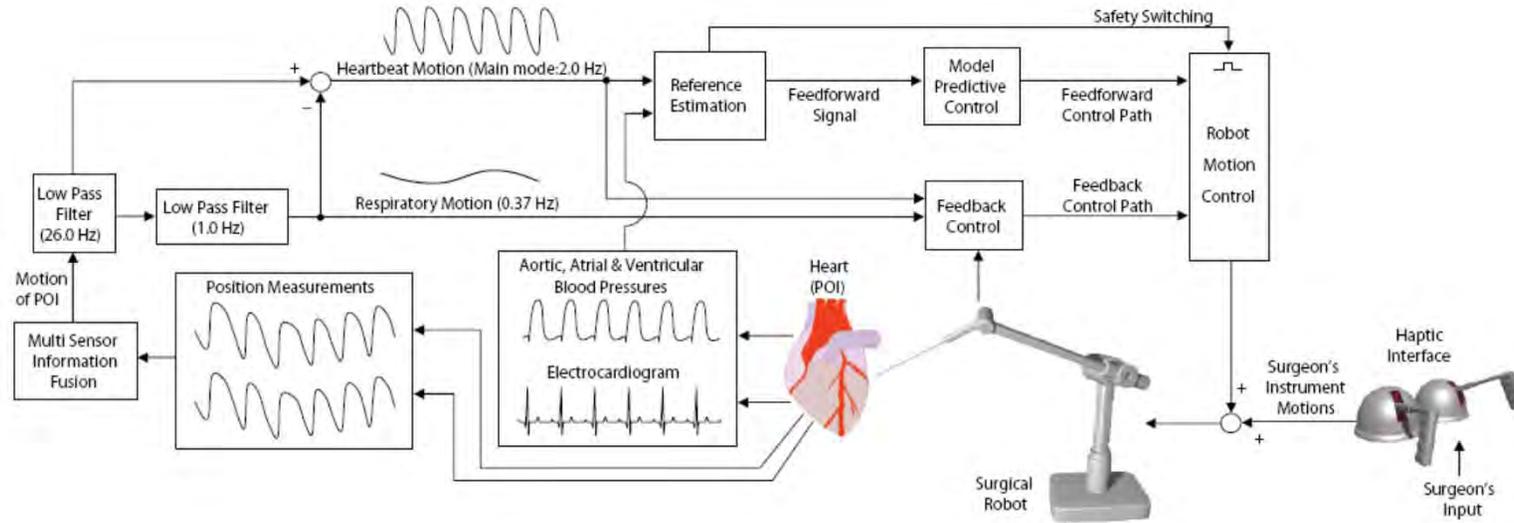
# Telerobotic beating heart surgery

Çavuşoğlu et al. (Case Western Reserve U.)

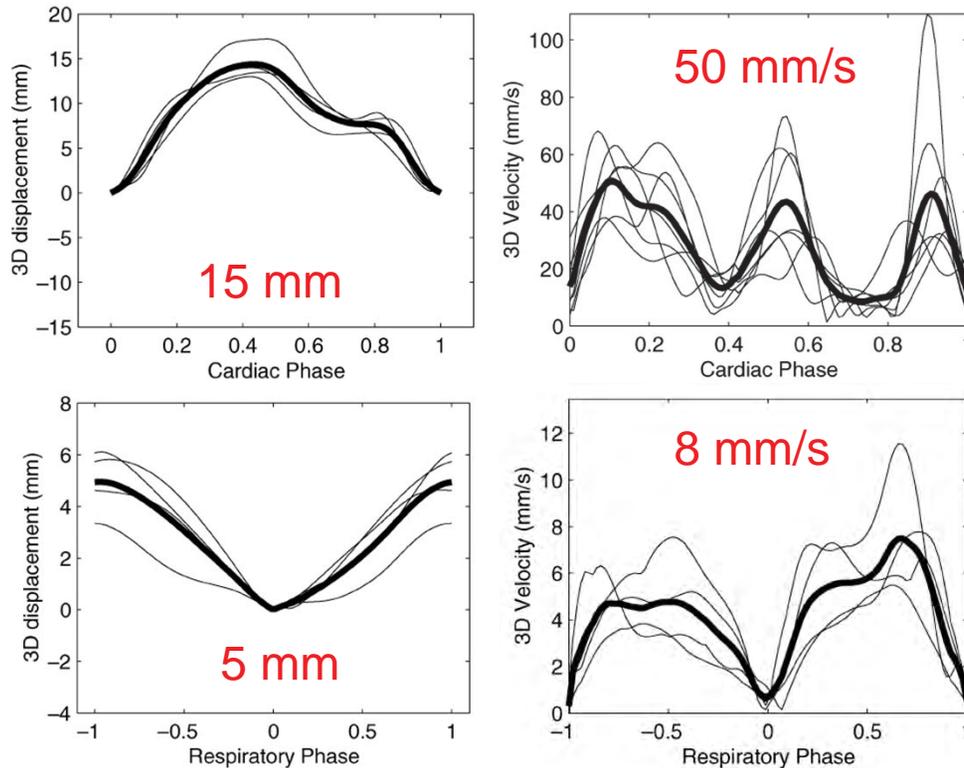


# Telerobotic beating heart surgery

Çavuşoğlu et al. (Case Western Reserve U.)

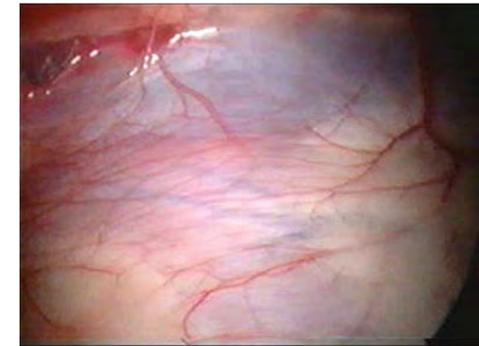


# The heart moves a lot...



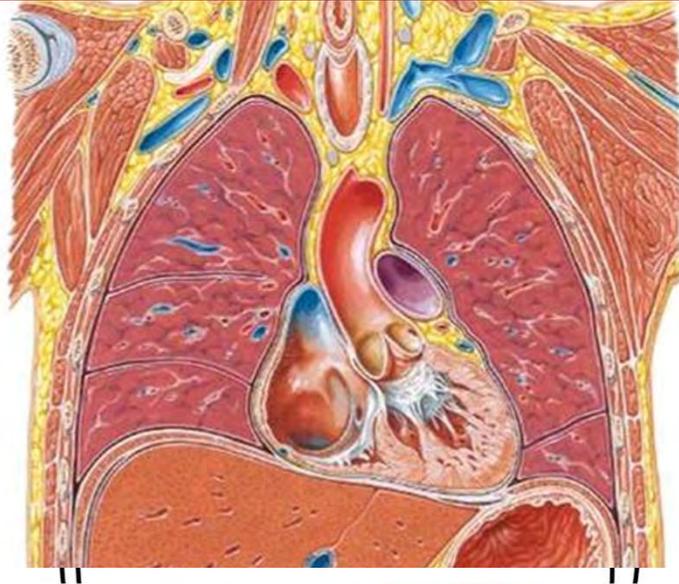
Figures from Shecter et al. (2006)

- organs surround heart
- pericardium forms virtual space
- large displacements
- high velocities

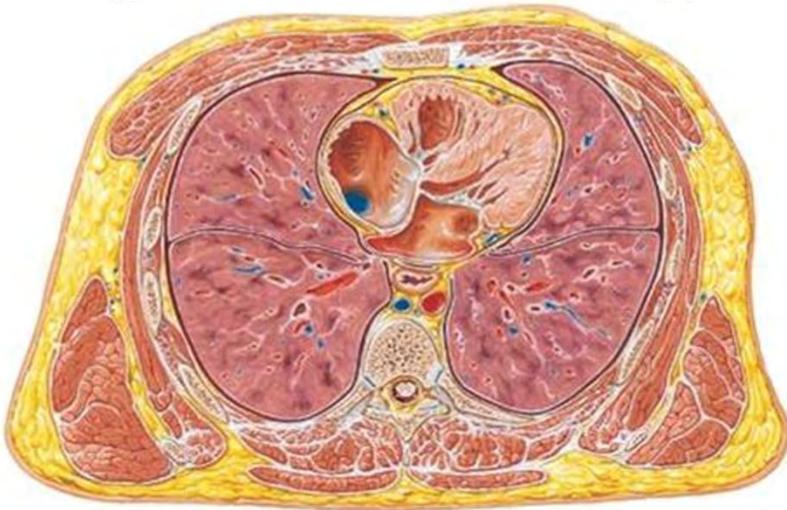


...and there is little room to move on the surface.

---



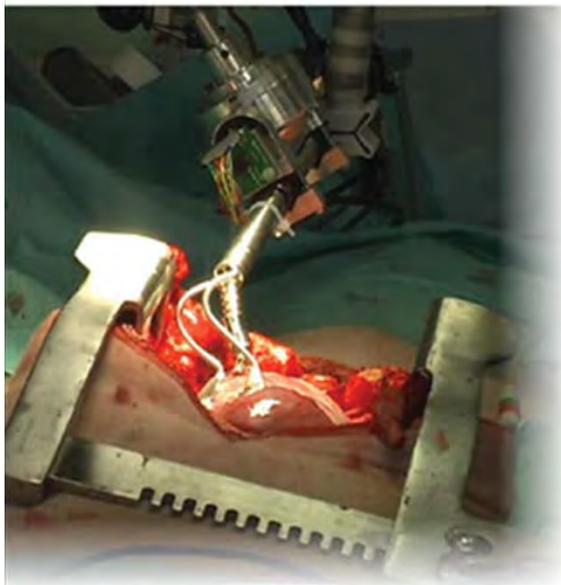
- organs surround heart
- pericardium forms virtual space



# GyroLock cardiac stabilizer

Gagne, Piccin, Laroche, Gangloff, Diana (U. Strasbourg)

## Gyrolock - First *In Vivo* Experiments of Active Heart Stabilization Using Control Moment Gyro (CMG)

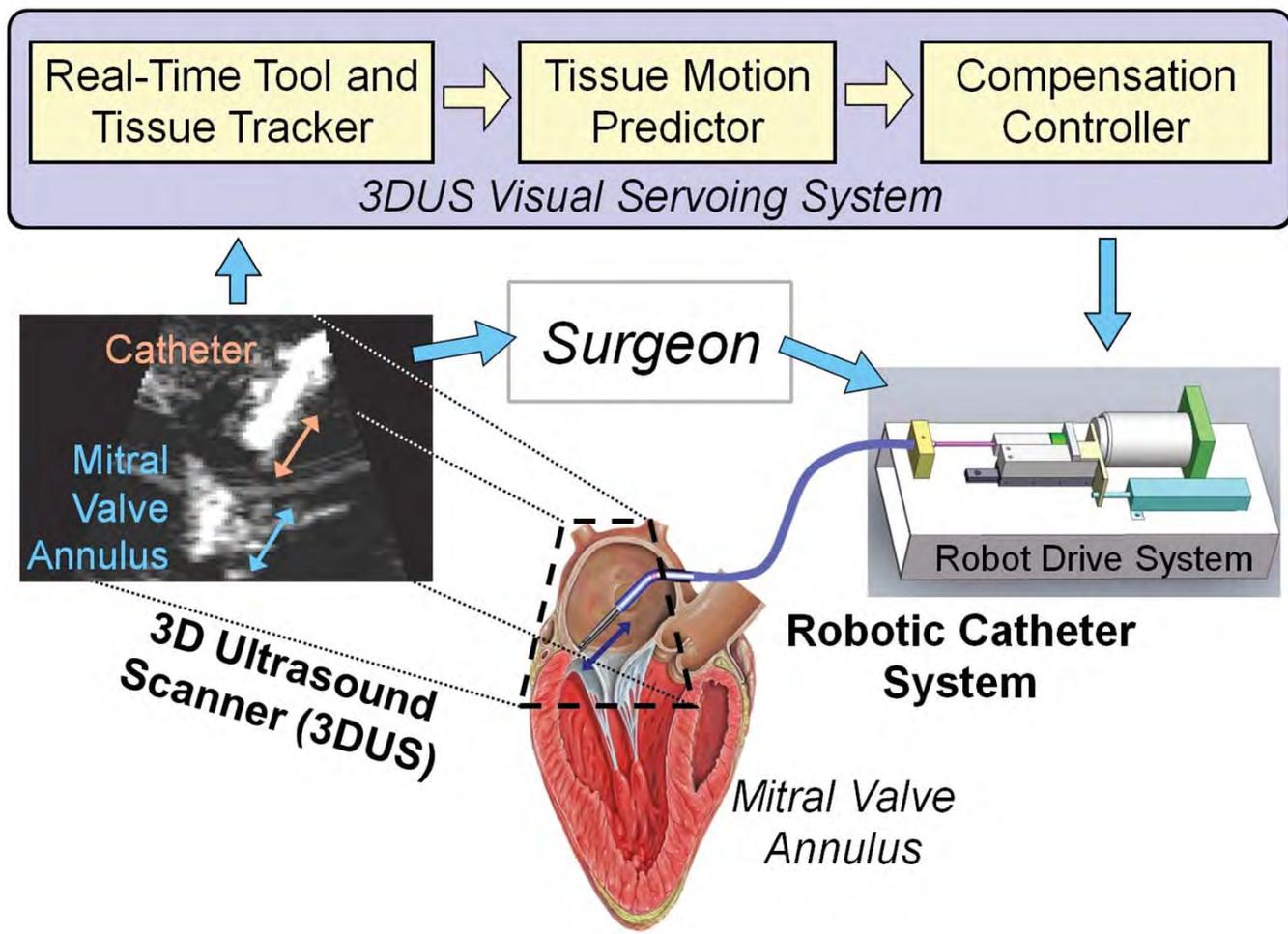


Julien Gagne  
Olivier Piccin  
Edouard Laroche  
Jacques Gangloff  
Michele Diana



# 1DOF motion-compensated cardiac catheter

Kesner, Howe (Harvard)



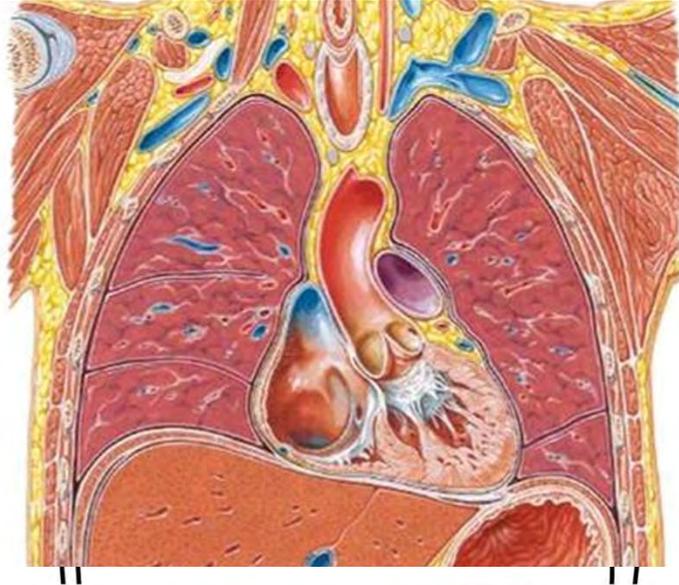
# Heartbeat and Respiration Suppression

---

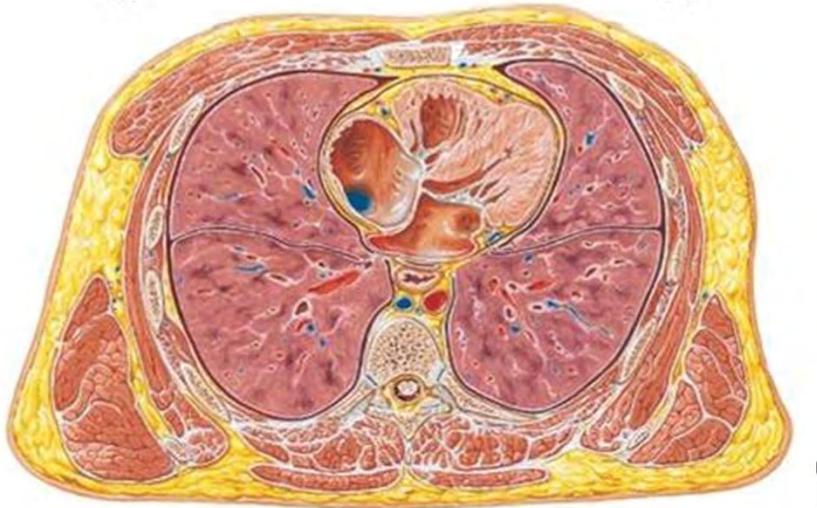
- Active compensation
- Passive compensation



...and there is little room to move on the surface.

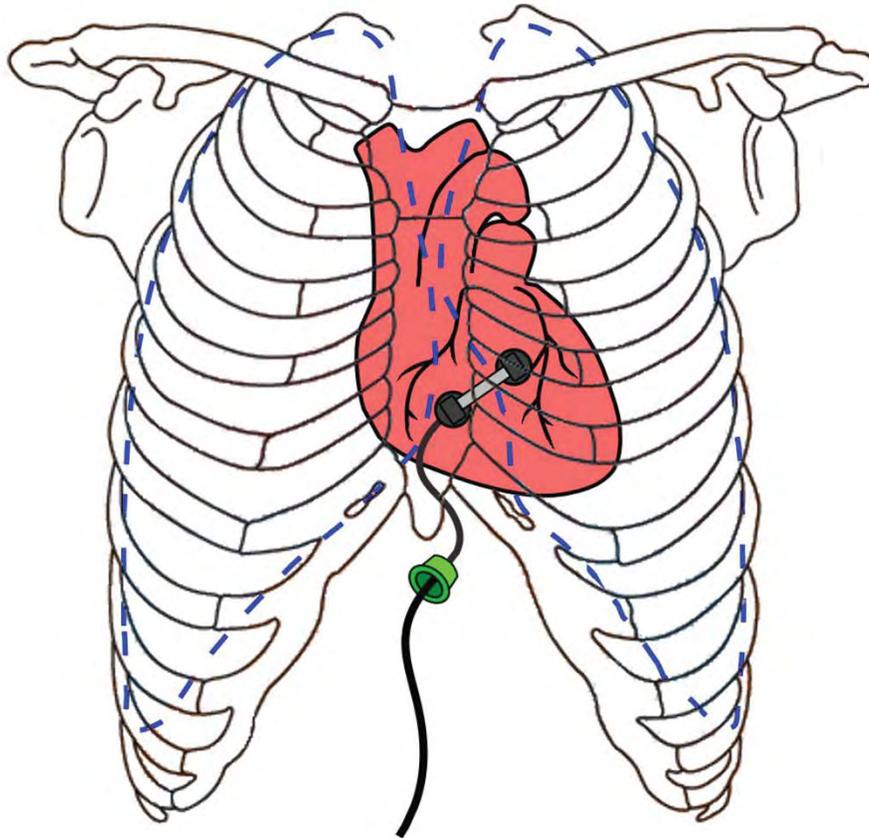


- organs surround heart
- pericardium forms virtual space



# Advantages of HeartLander paradigm

---



- ① flexibility  
→ **no lung deflation**
- ② epicardial prehension  
→ **no stabilization**
- ③ locomotion  
→ **no access limitation**



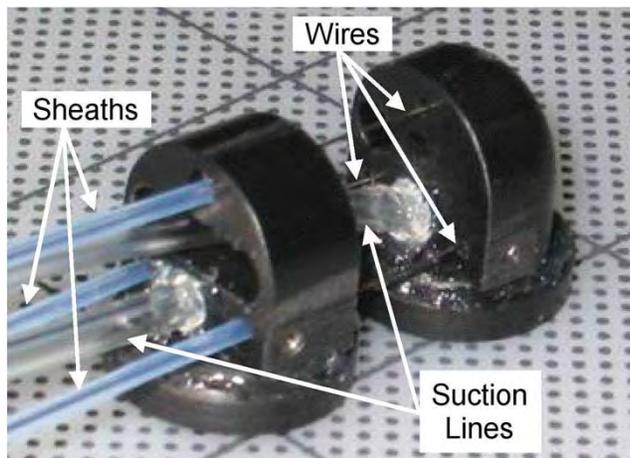
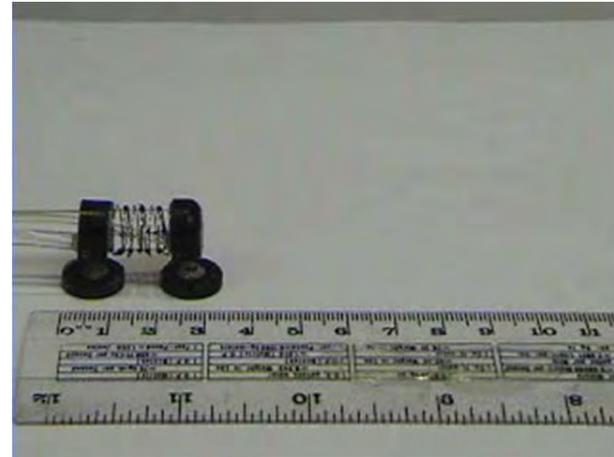
# Potential interventions

---

- Surgical Applications
  - epicardial electrode placement (screw, suture)
  - intrapericardial drug delivery (needle)
  - cell transplantation (needle)
  - gene therapy for angiogenesis (needle)
  - epicardial atrial ablation (laser, electrode)
- Interventional Cardiology
- Electrophysiology

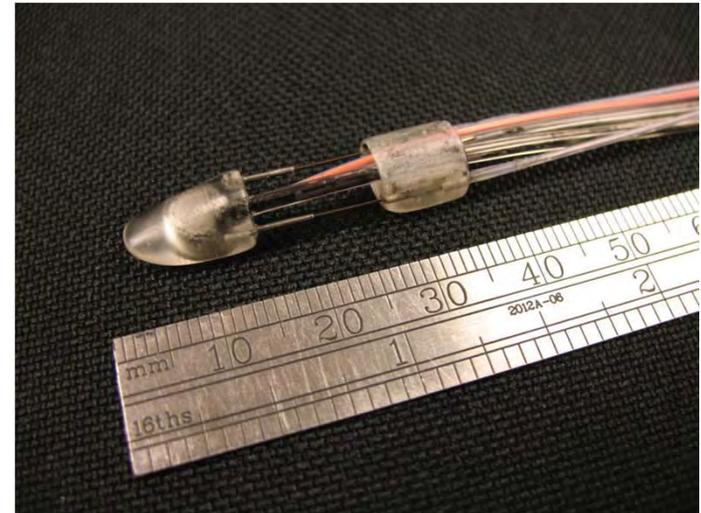
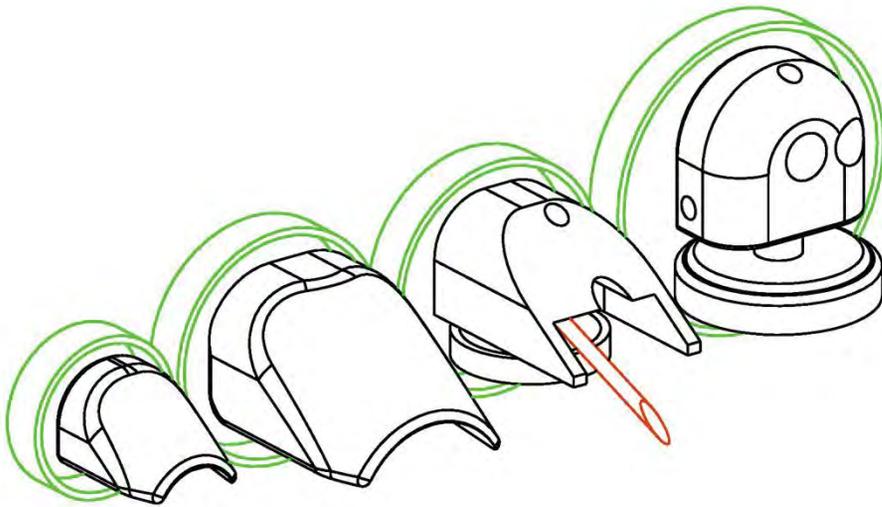


# Inchworm locomotion



# Prototypes

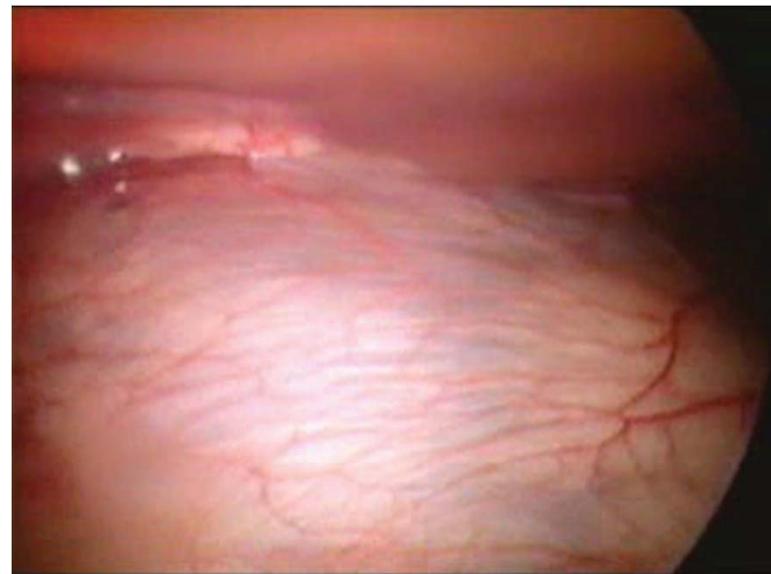
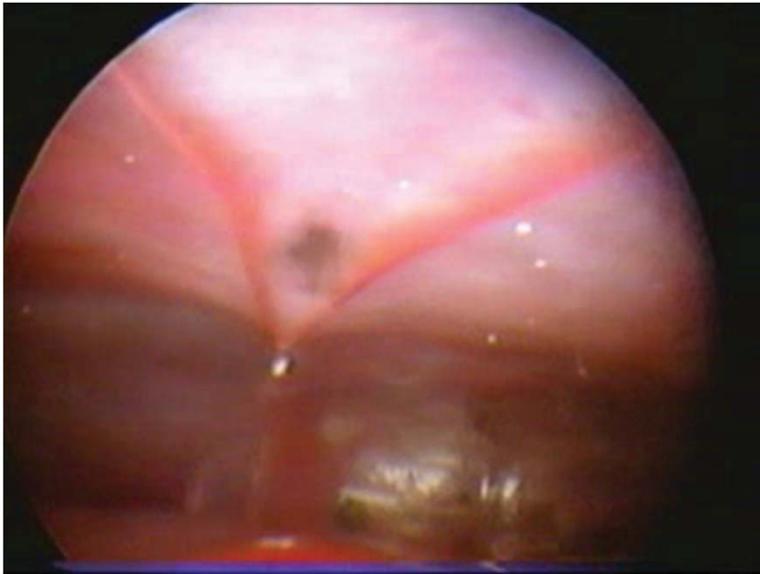
---



# Intrapericardial locomotion *in vivo*

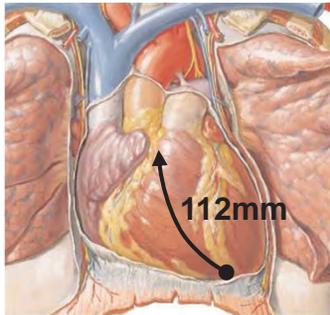
## in porcine model

---



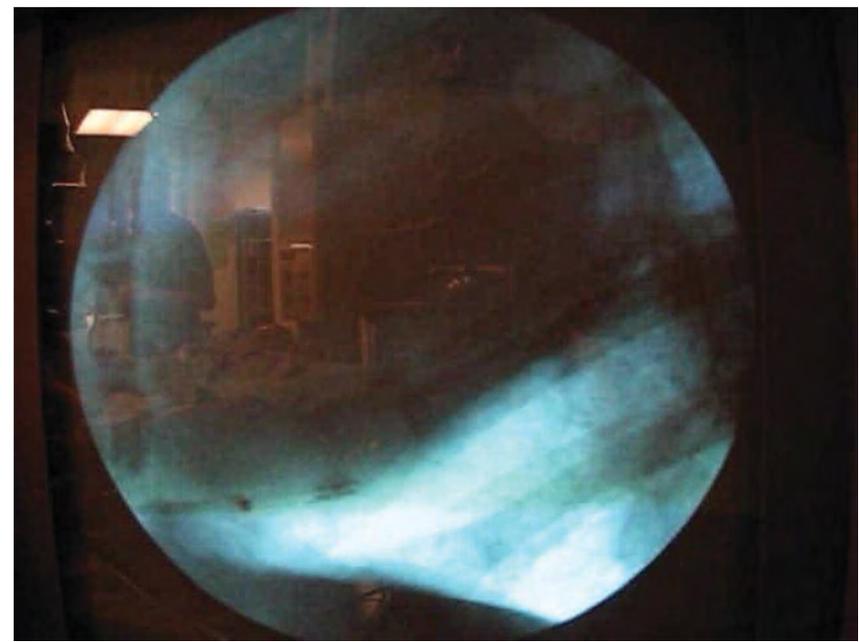
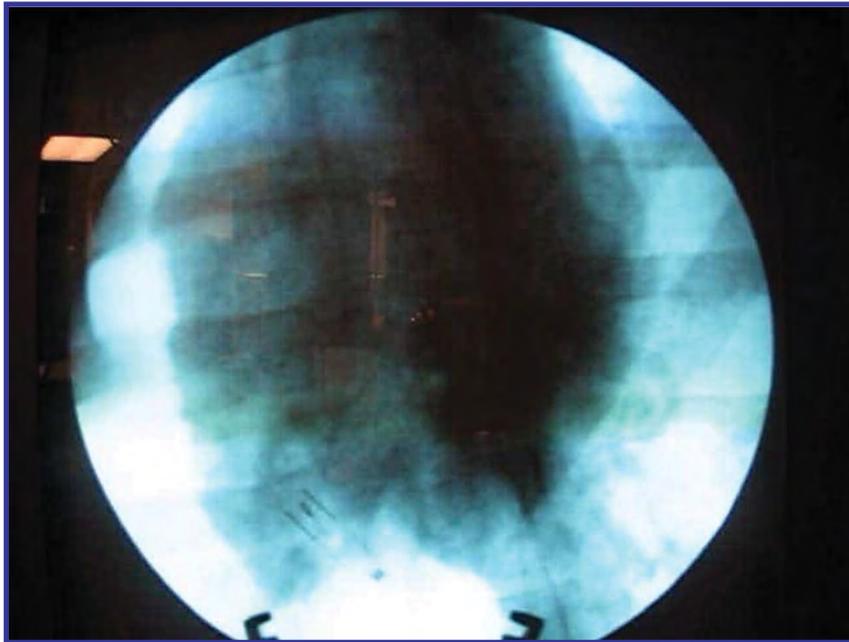
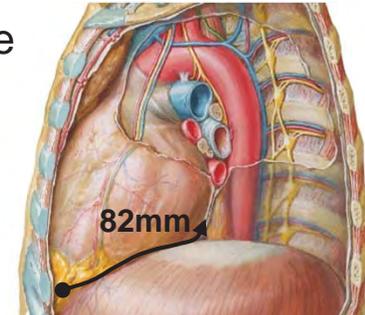
# Locomotion: Anterior and Posterior Surfaces

---



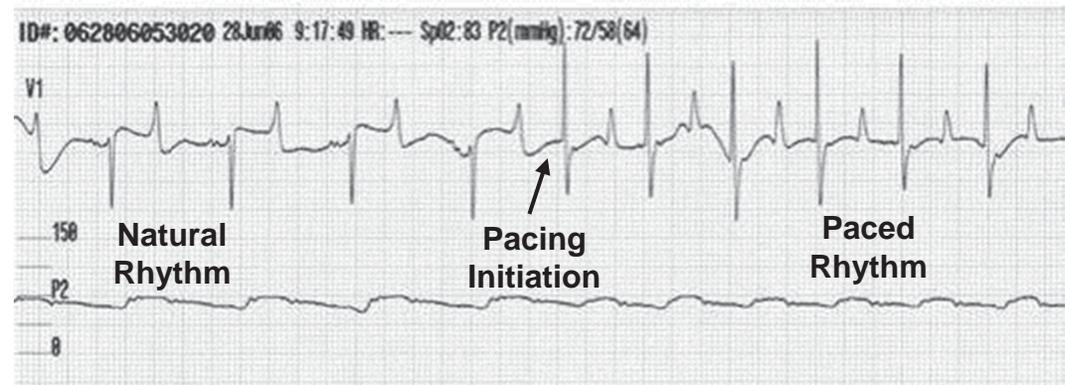
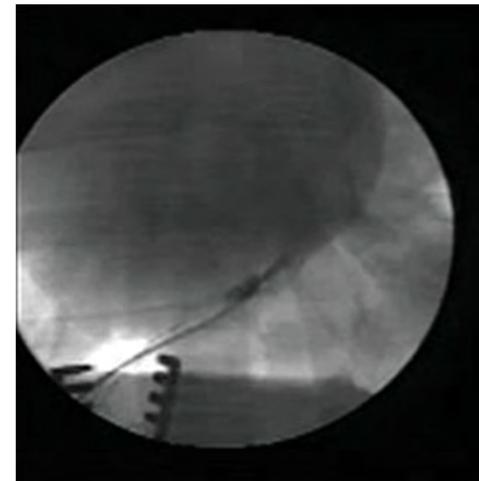
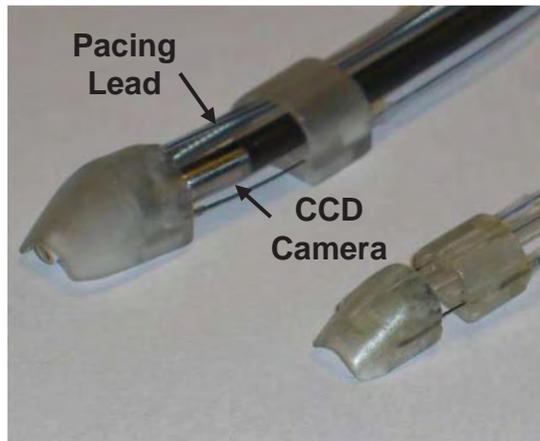
Anterior Right Ventricle

Posterior Left Ventricle



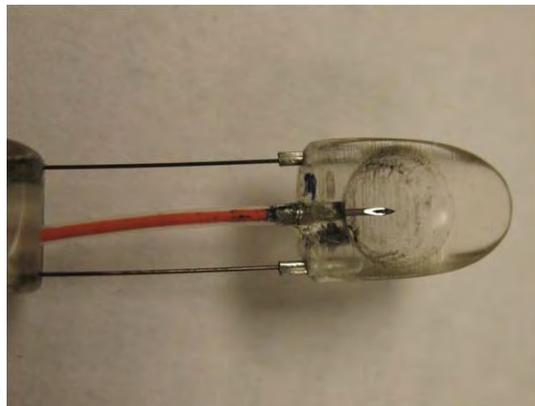
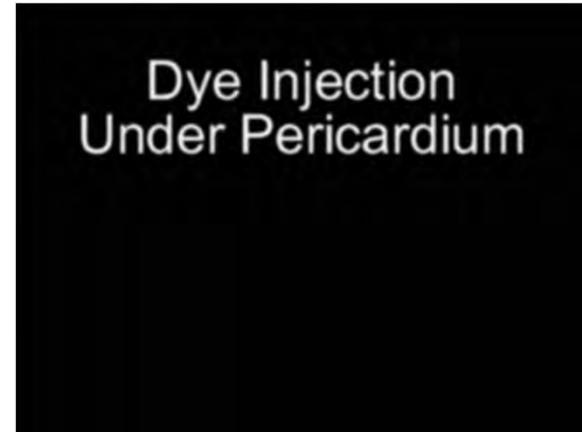
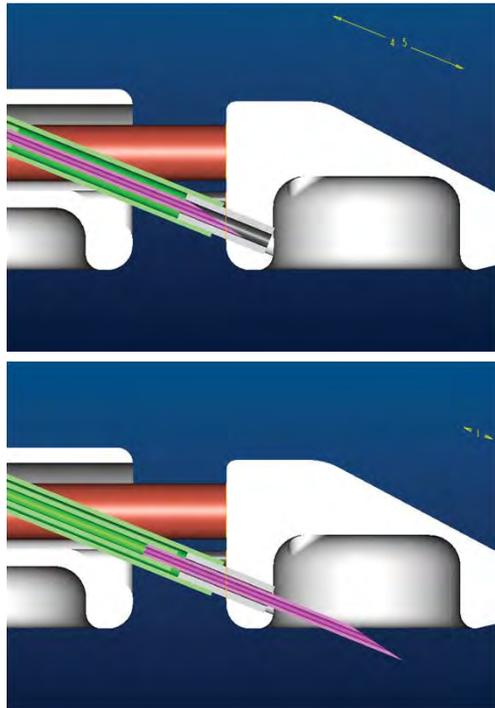
# Epicardial lead placement via subxiphoid access

- Successful lead placement on posterior left ventricle

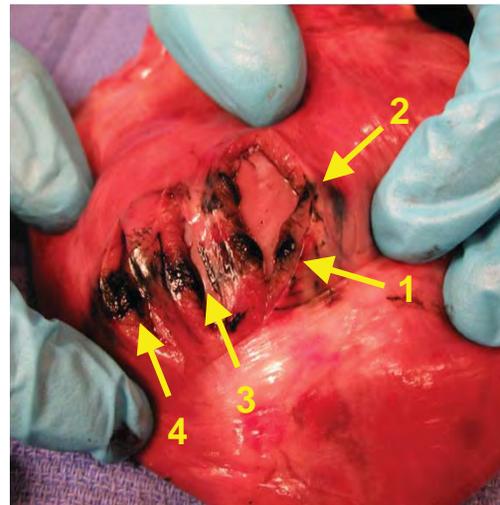


# Dye Injection

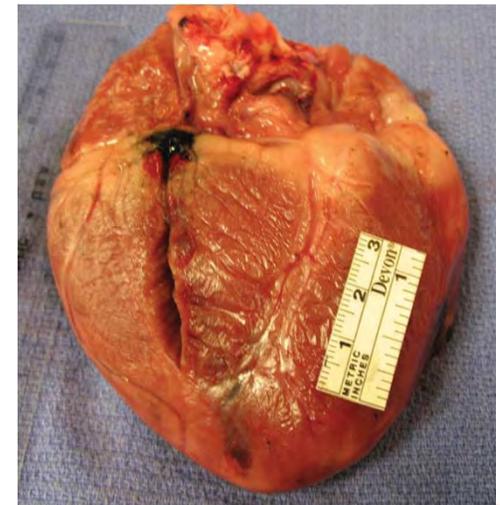
via subxiphoid access



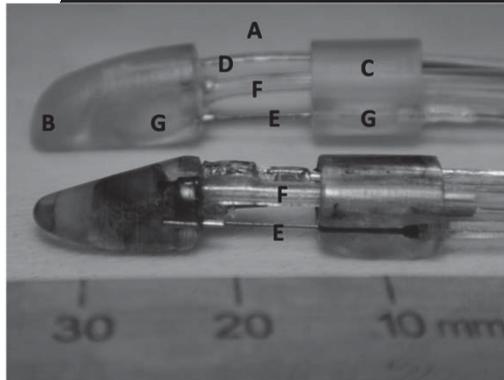
Anterior Right Ventricle



Posterior Left Ventricle



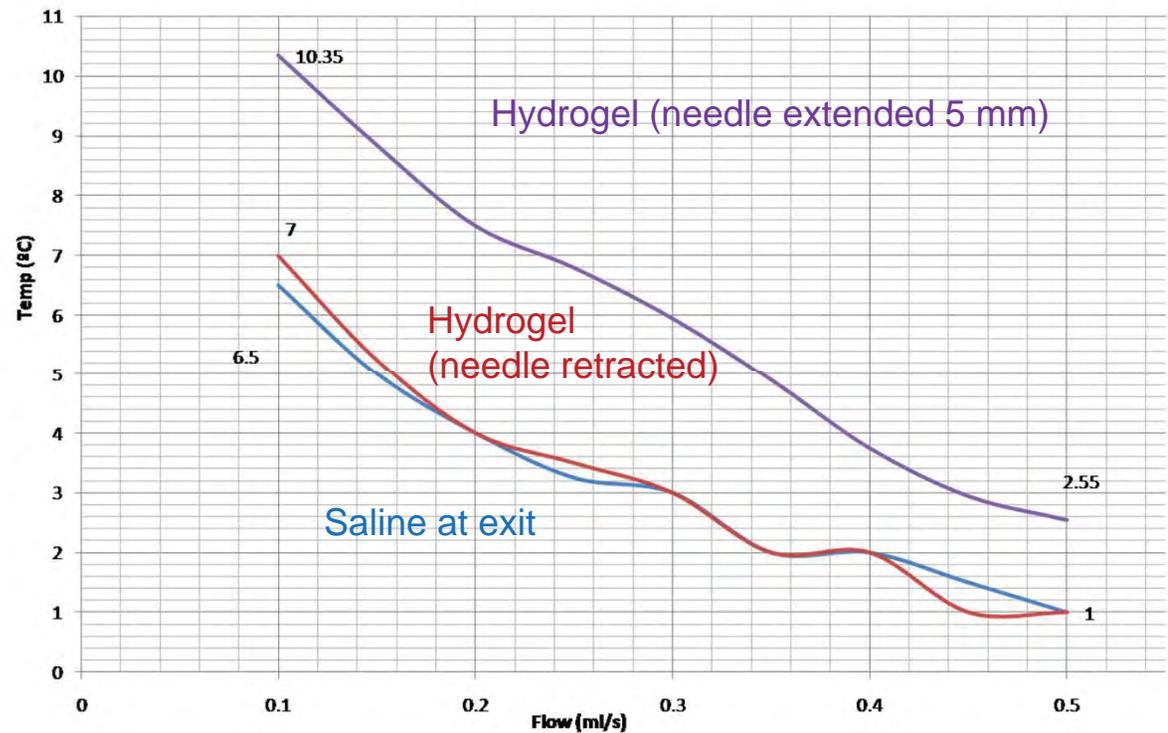
# Injection of cooled anti-remodeling hydrogel



- A. HeartLander
- B. Front foot
- C. Rear foot
- D. Injection needle
- E. Drive wires
- F. Front suction line
- G. Suction chambers



Hydrogel injected into chicken muscle ex vivo



# Clinical advantages

---

*...over conventional surgery*

- no sternotomy
- no cardiopulmonary bypass

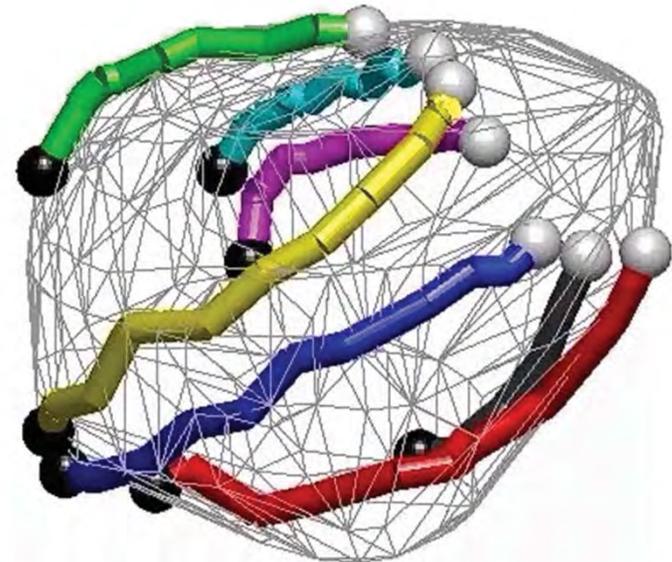
*...over current MIS*

- no immobilization of heart
- inexpensive, possibly disposable
- no lung deflation
- obviates general endotracheal anesthesia
- **outpatient heart surgery?**



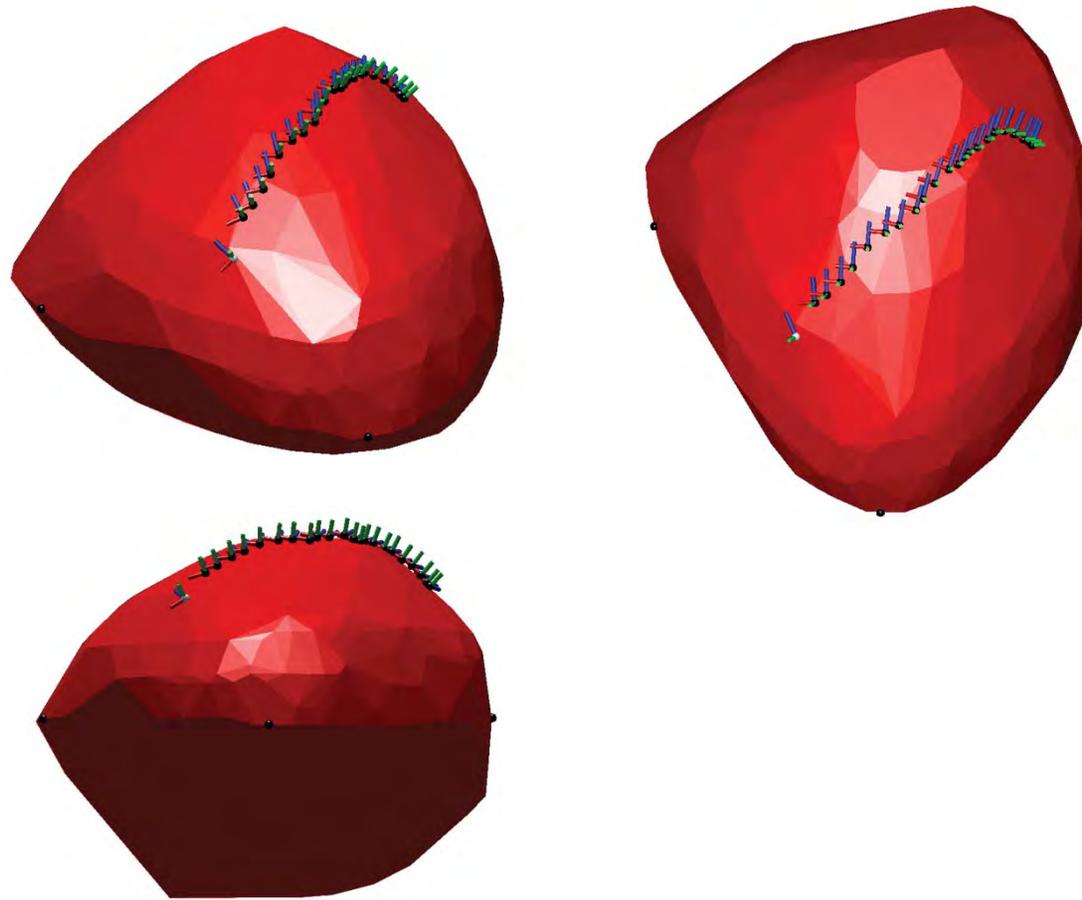
# Access to all aspects of heart

Trial No.	Anatomical Location	Path Length (mm)	Time (s)	Average Speed (mm/min)	Number Of Steps	Step Efficiency (%)
3 ( <i>green</i> )	anterior midline	73	50	88	8	45
6 ( <i>yellow</i> )	right wall	100	84	71	13	38
4 ( <i>cyan</i> )	left lateral	52	77	40	12	21
7 ( <i>blue</i> )	right lateral	110	63	104	10	54
8 ( <i>magenta</i> )	left lateral	61	77	48	12	25
9 ( <i>red</i> )	right posterior	115	99	70	15	38
2 ( <i>black</i> )	left posterior	53	22	143	4	65
mean		81	67	81	11	41
st. dev.		27	25	35	4	15



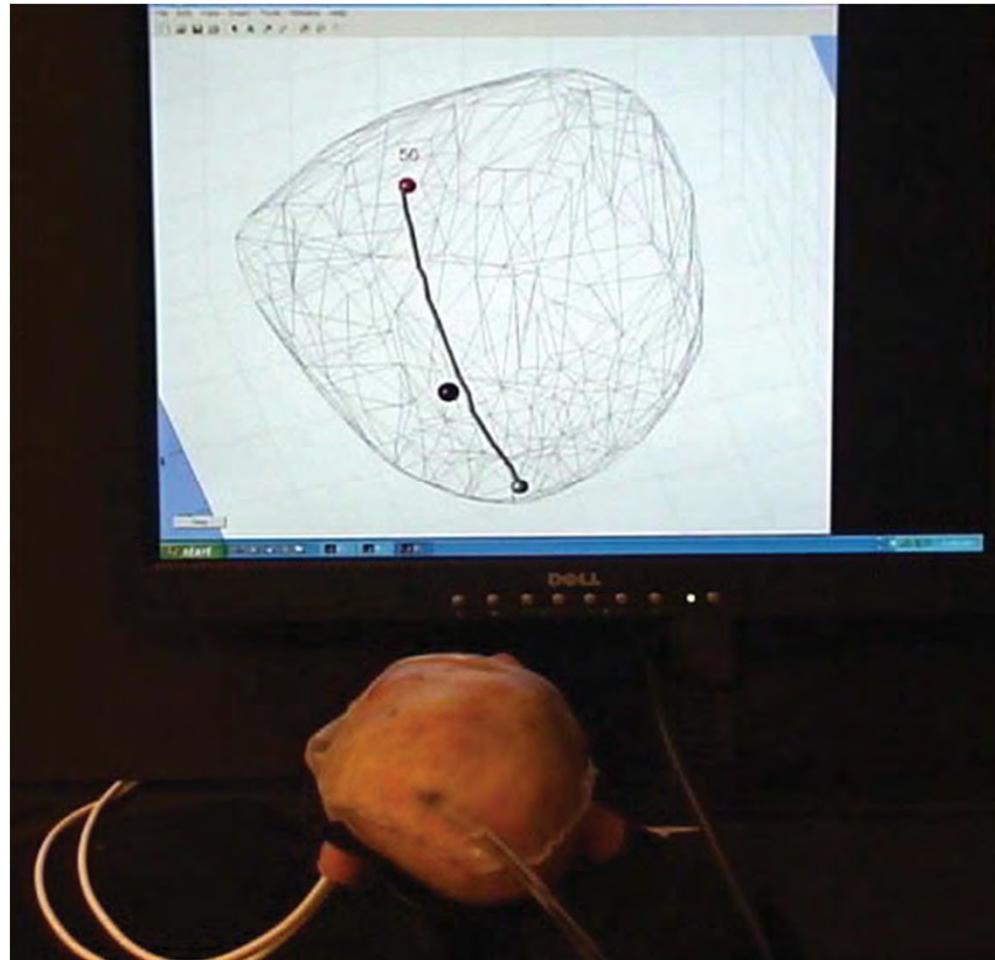
# Lateral locomotion on beating heart phantom

---

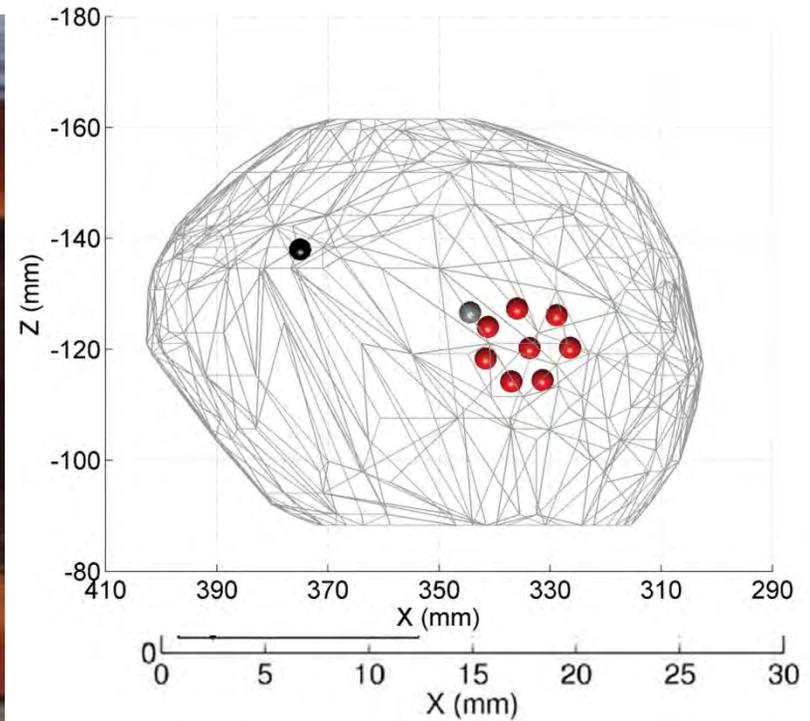
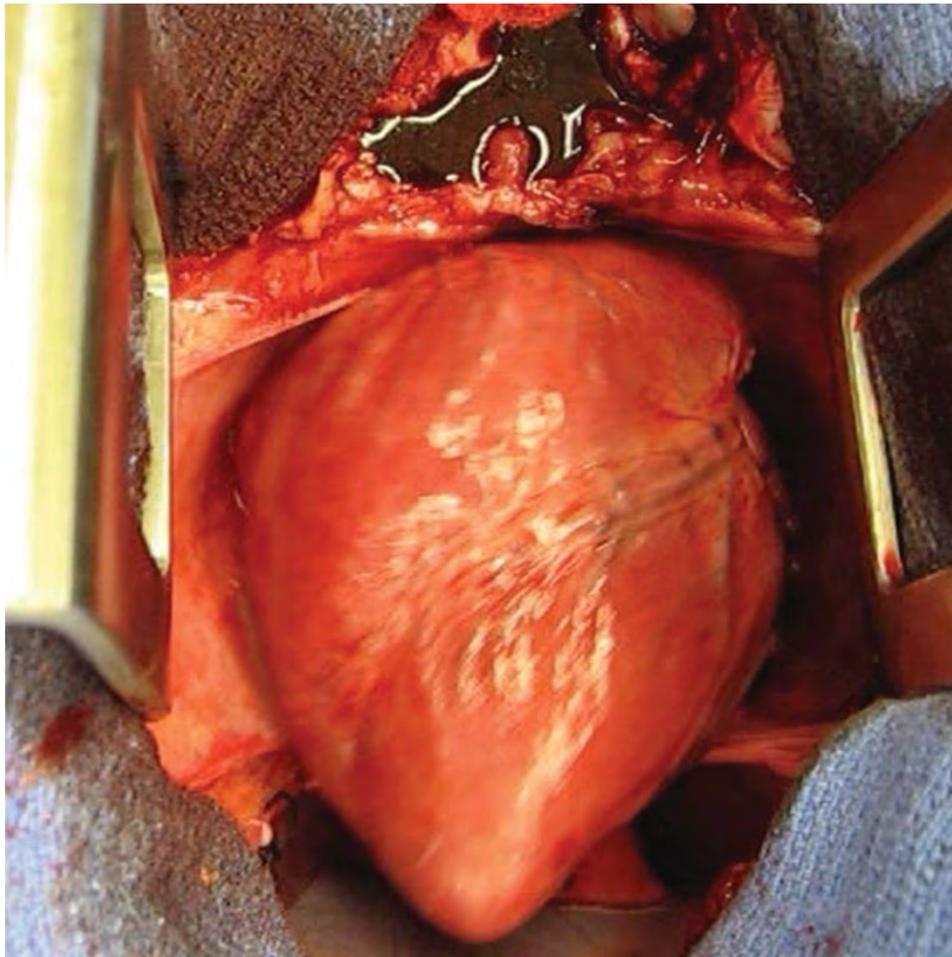


# Locomotion accuracy/path following closed loop

---



# Fine Positioning: Posterior Surface



Overall error =  $1.7 \pm 1.0$  mm



# Efficiency Improvement

---

- Locomotion efficiency  $< 50\%$  due to slippage
- Intrapericardial pressure varies significantly due to physiological cycles
- Approaches:
  - Synchronization: Detect phase of physiological cycles and synchronize stepping with minimum intrapericardial pressure
    - Extended Kalman-filter-based model of physiological motion
  - Improved traction: Apply gecko-foot-inspired adhesive fibers (Prof. M. Sitti) in combination with suction



# Physiological Motion Modeling

---

Measurement

=

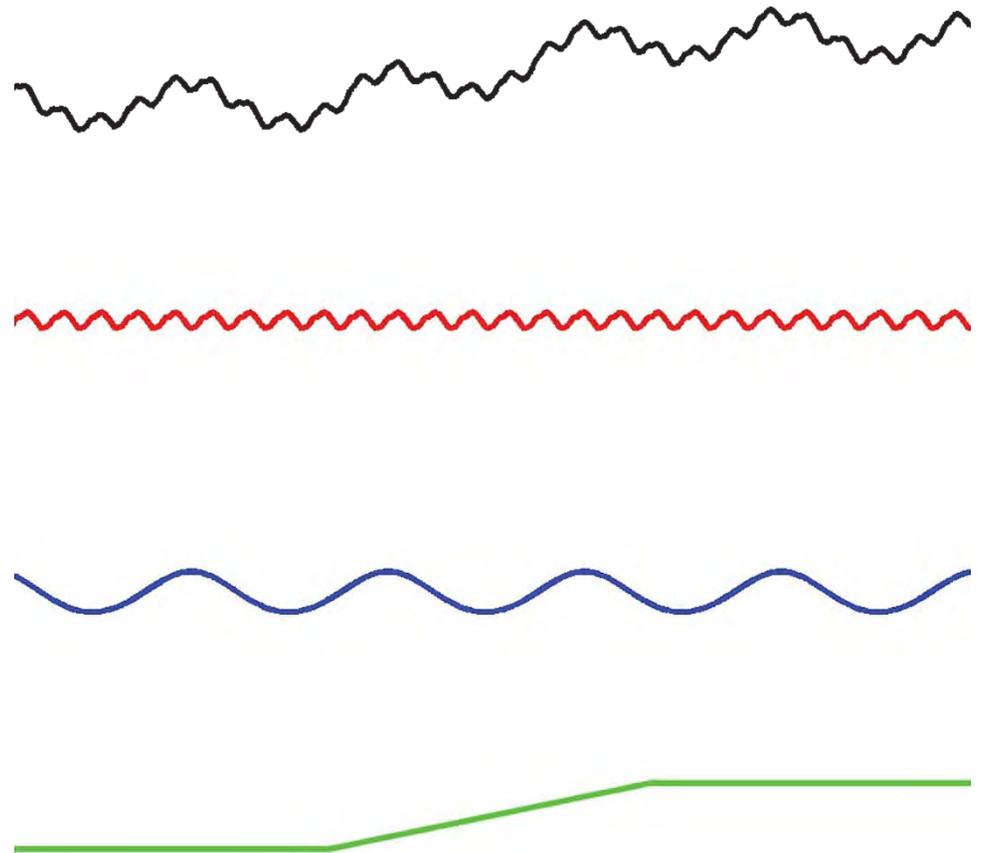
Cardiac Motion

+

Respiratory Motion

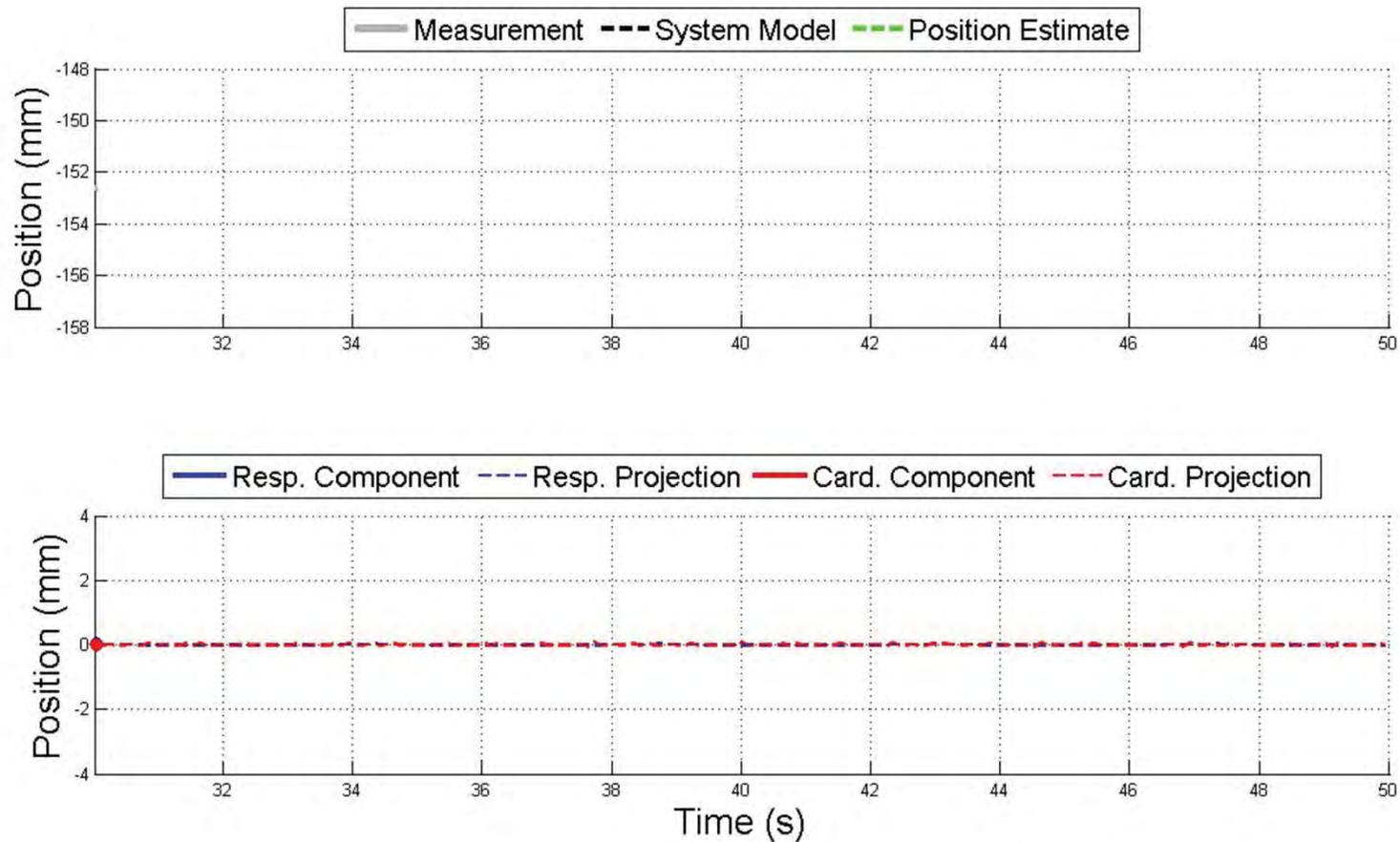
+

Robot Position

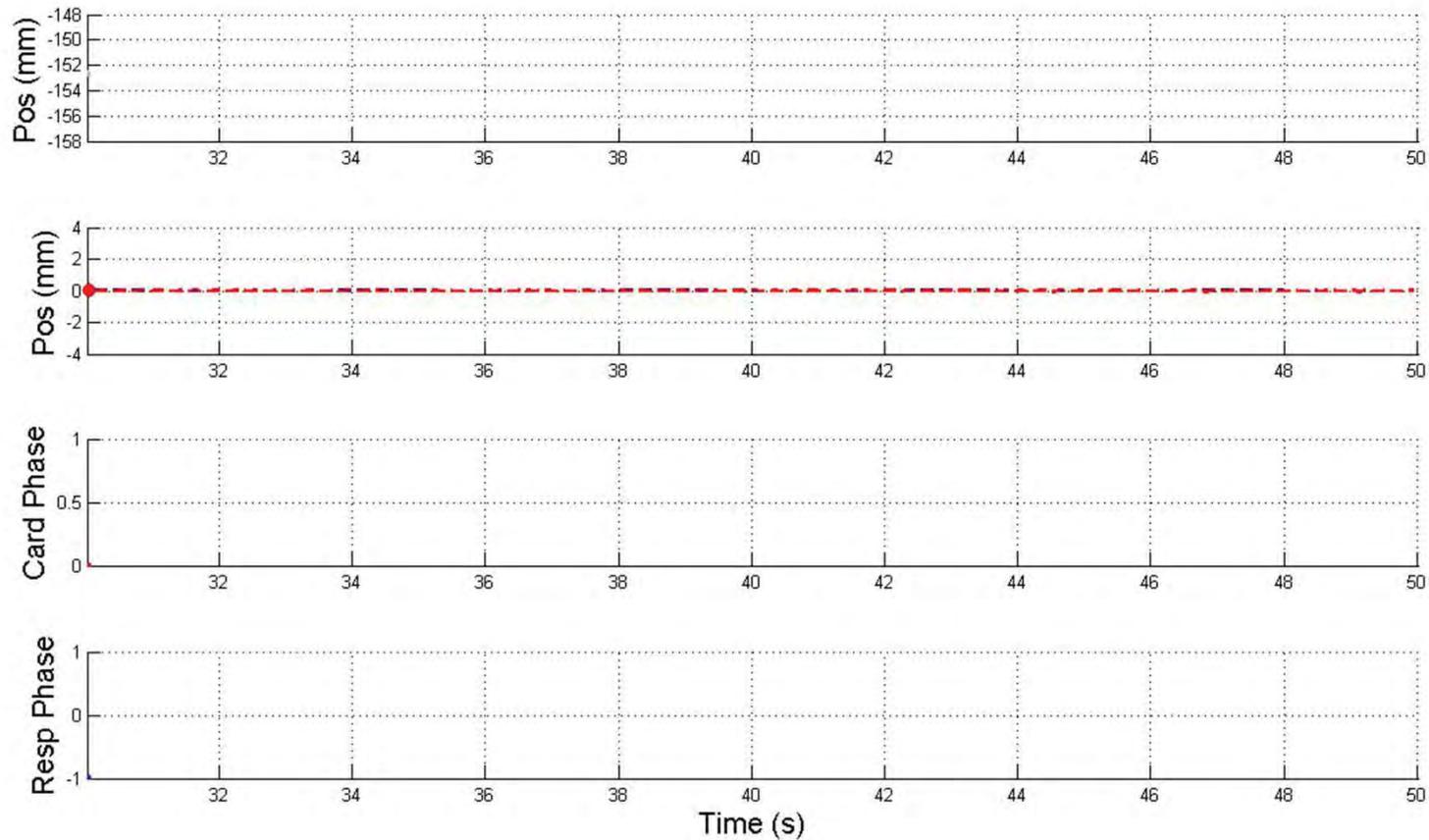


# Performance – Live Model

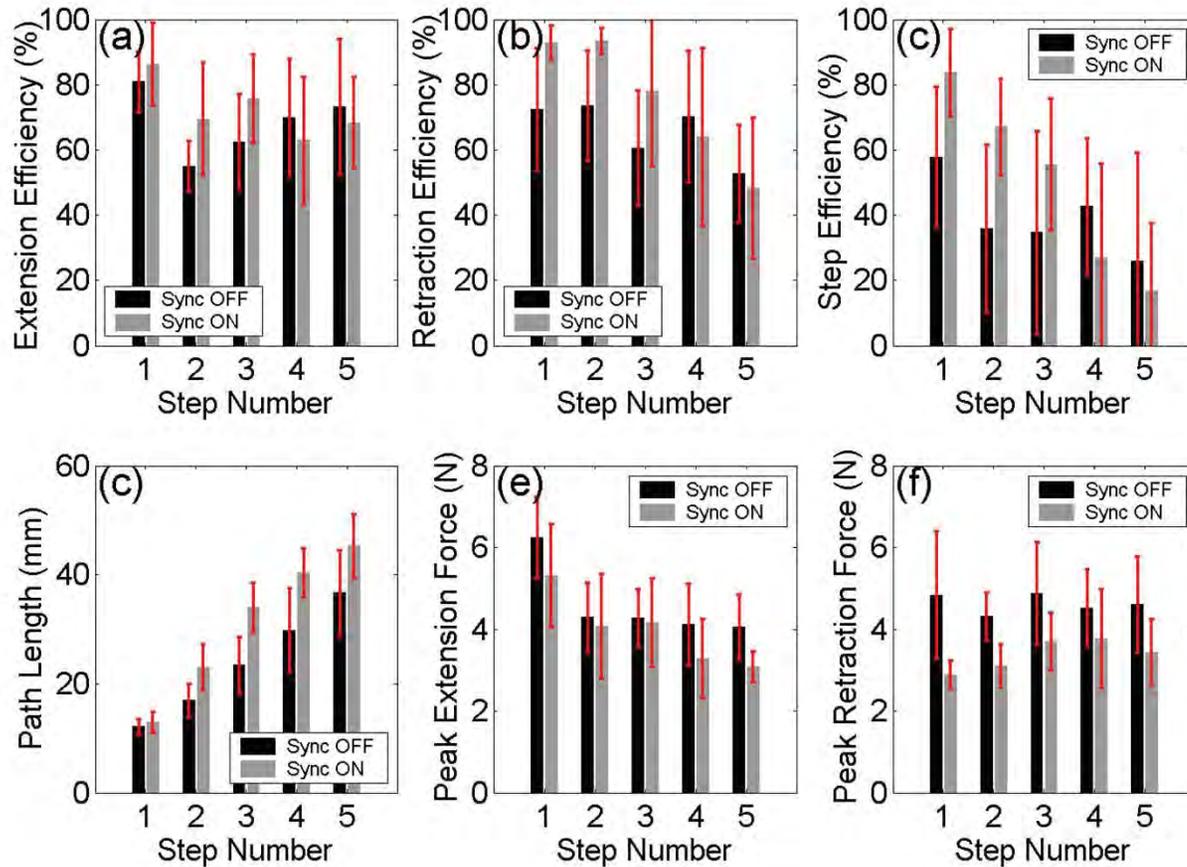
Fourier model similar to Poignet et al.



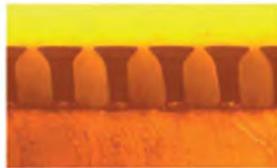
# Results – Phase Estimation



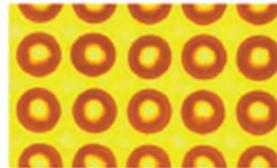
# Efficiency Improvement with Synchronization



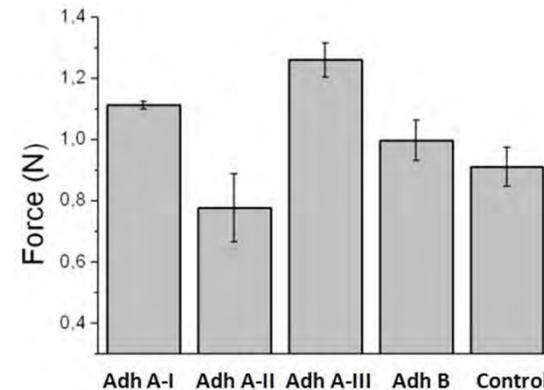
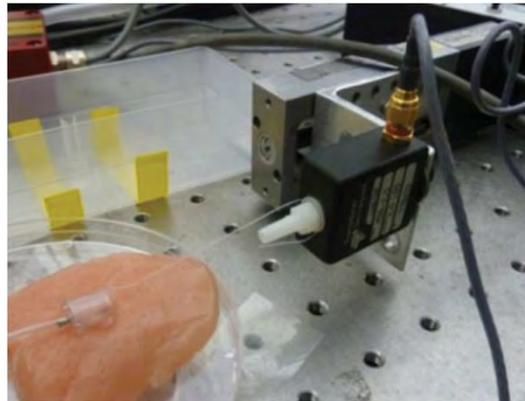
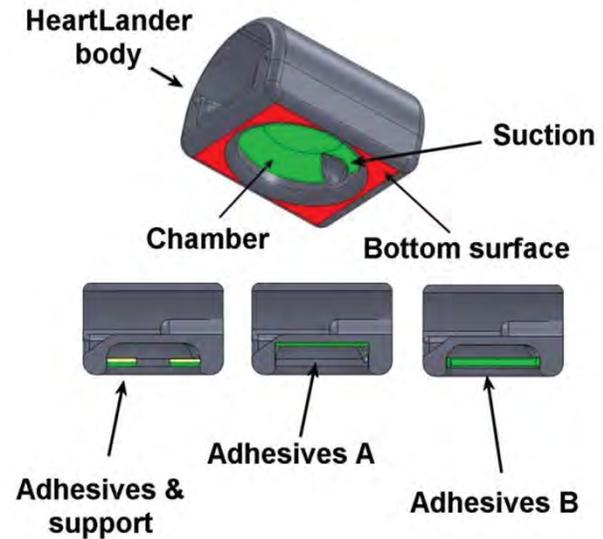
# Bio-inspired adhesive to improve traction



Microscopy side view



Microscopy top view



# Localization on the Beating Heart

---

- Given a preoperative dynamic map and a series of noisy position observations in the world frame,  $T_R^W$

- Solve for:

- Registration
- Localization
- Cardiac Phase

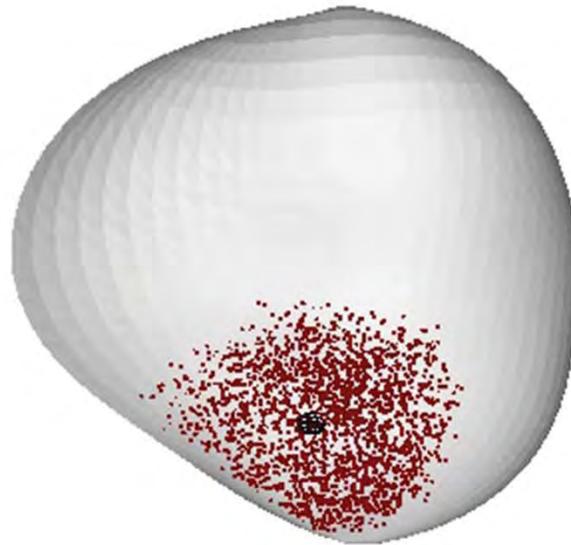
$$S = \begin{bmatrix} T_M^W \\ T_R^M \\ \phi \end{bmatrix}$$

- Particle filter implemented for state estimation:
  - Initialized to region near initial tracker reading
  - Surface constraints
  - Exploit structure / constraints to limit # particles



# Localization on the Beating Heart

---



# Acknowledgments

---

## Collaborators

Robert MacLachlan  
Brian C. Becker, Ph.D.  
Sungwook Yang, M.S.  
Louis Lobes, M.D.  
Gregory Hager, Ph.D.  
Iulian Iordachita, Ph.D.  
James Handa, M.D.  
Peter Gehlbach, M.D.  
Nathan Wood, M.S.  
Kevin Fok  
Marco Zenati, M.D.  
David Schwartzman, M.D.  
Giuseppe Tortora, Ph.D.  
Metin Sitti, Ph.D.  
Arianna Menciassi, Ph.D.  
Marcin Balicki  
Russell Taylor, Ph.D.  
Jin Kang, Ph.D.  
Xuan Liu

## Funding



R01 EB000526  
R01 EB007969  
R01 HL078839  
R01 HL105911



American Society for  
Laser Medicine and  
Surgery

