

Tumor bed inspection... and other technologies for positive margin prevention in breast conserving surgery

Guest Lecture, Computer Integrated Surgery

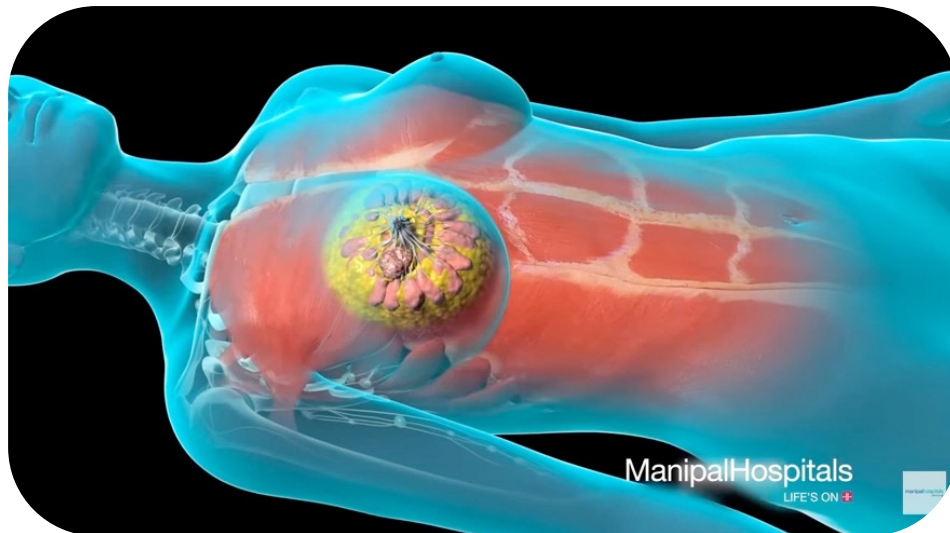
October 9th, 2025

Presented by: Laura Connolly, PhD
Malone Postdoctoral Fellow, JHU



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Clinical Motivation

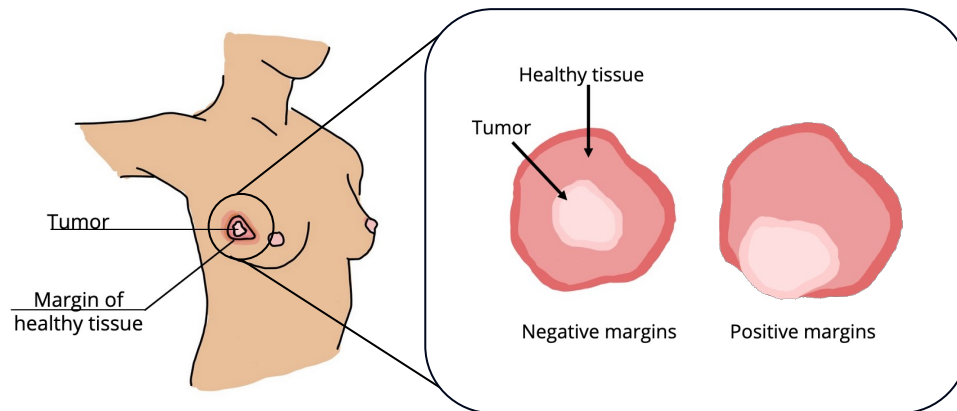


Video credit: Manipal Hospitals. Accessed at: <https://www.youtube.com/watch?v=wh-1b3LR8XY>

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Clinical Motivation

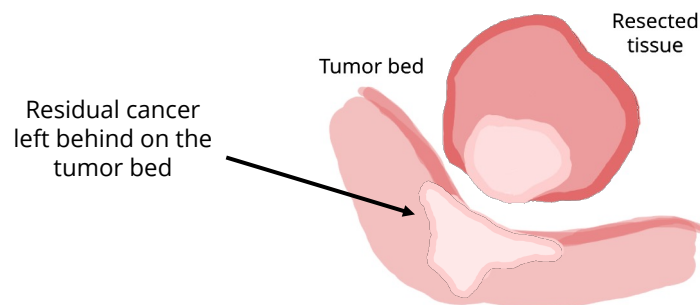
Breast-conserving surgery is a common treatment option for early stage breast cancer patients where the tumor is removed and healthy tissue is preserved



3

Clinical Motivation

Breast-conserving surgery is a common treatment option for early stage breast cancer patients where the tumor is removed and healthy tissue is preserved



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5

Clinical Motivation

Breast-conserving surgery is a common treatment option for early stage breast cancer patients where the tumor is removed and healthy tissue is preserved



Up to 40% of BCS patients experience positive margins^{1,2}

¹Koning S, Peeters M, et. al Tumor resection margin definitions in breast-conserving surgery: systematic review and meta-analysis of the current literature. Clin Breast Cancer, 2018.

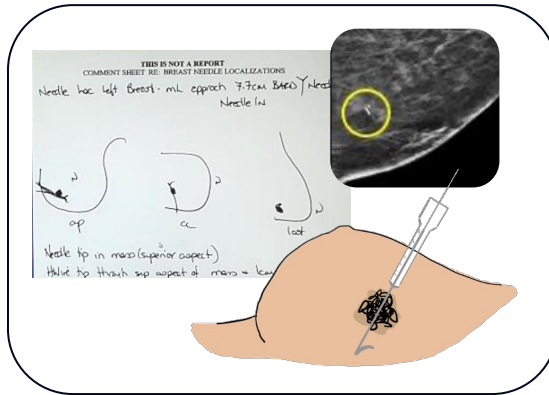
²Racz JM et. Al. Intraoperative pathologic margin analysis and re-excision to minimize reoperation for patients undergoing breast-conserving surgery. Ann Surg Oncol, 2020

6

Why is there such a high failure rate?

Preoperative / intraoperative standard of care

Wire localization or radioactive seed

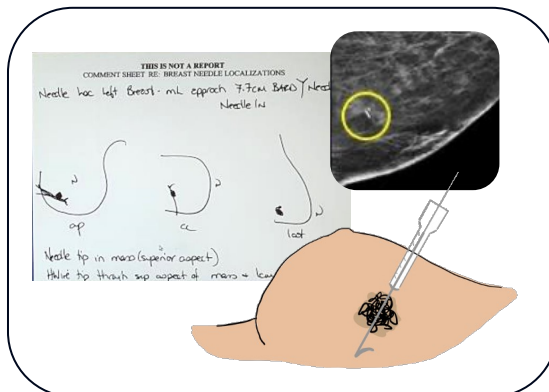


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Why is there such a high failure rate?

Preoperative / intraoperative standard of care

Wire localization or radioactive seed



Surgical navigation

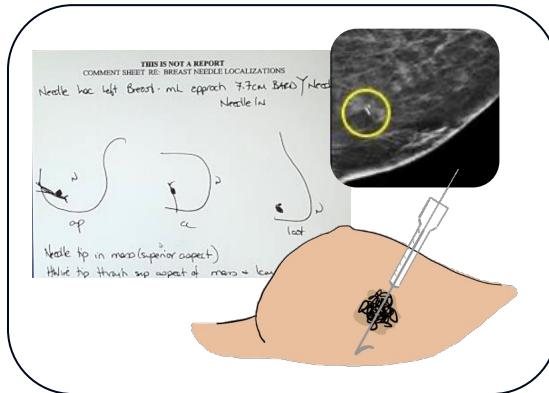


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Why is there such a high failure rate?

Preoperative / intraoperative standard of care

Wire localization or radioactive seed



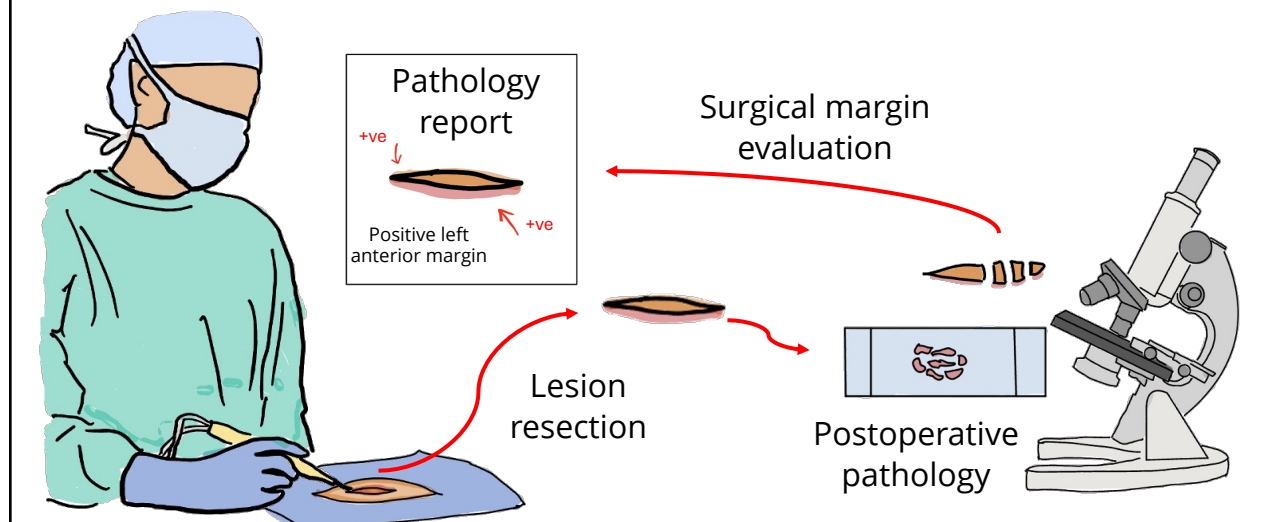
Surgical navigation



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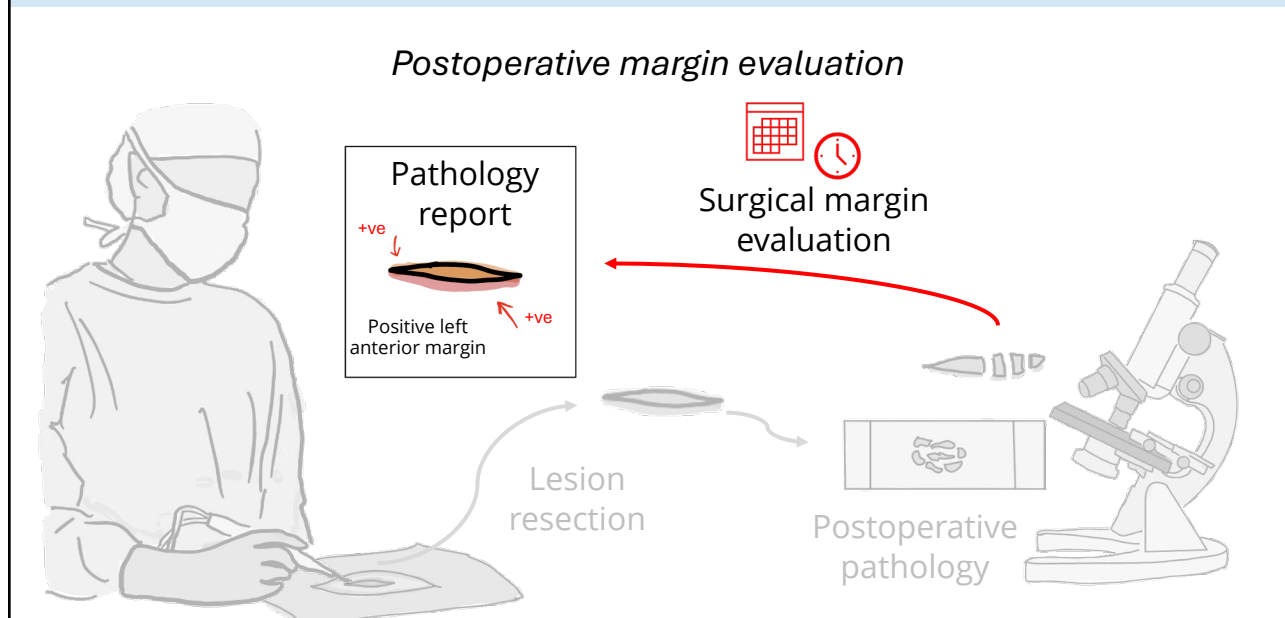
Why is there such a high failure rate?

Postoperative margin evaluation



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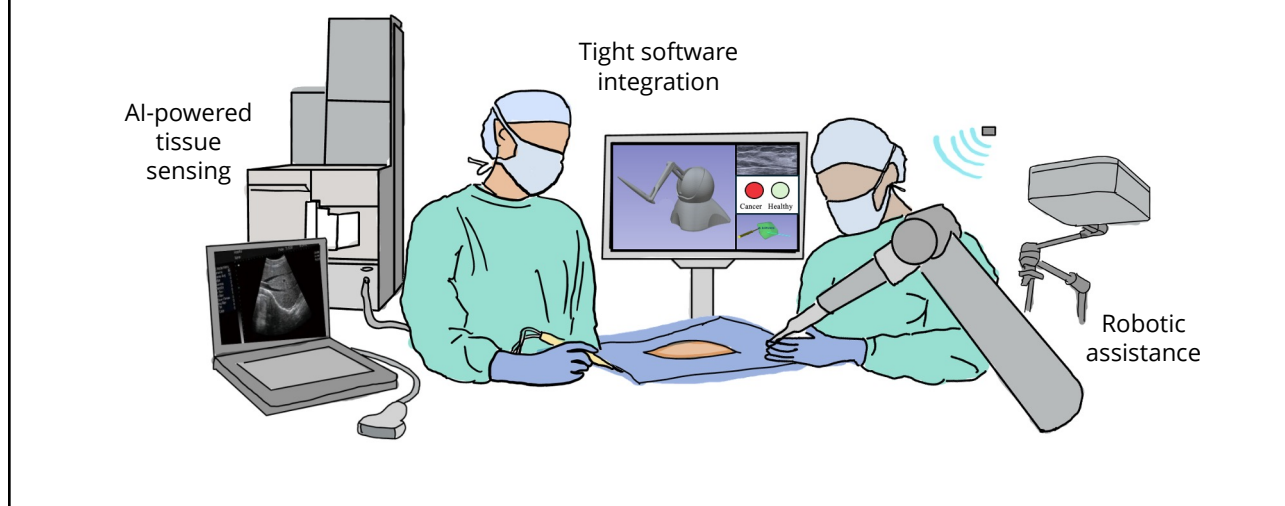
Why is there such a high failure rate?



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Objectives

Investigate how robotics, tissue sensing, and AI can be used to prevent positive margins in BCS



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Investigate how robotics, tissue sensing, and AI can be used to prevent positive margins in BCS



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Cooperative robotics

The surgeon and the robot co-manipulate a surgical instrument

Often used for haptic interfaces such as virtual fixtures*

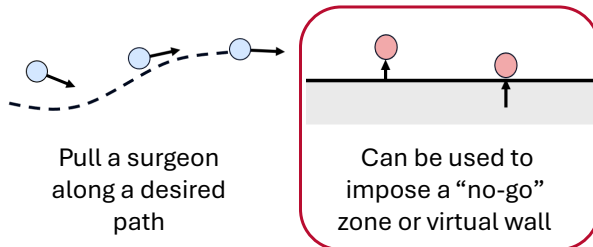


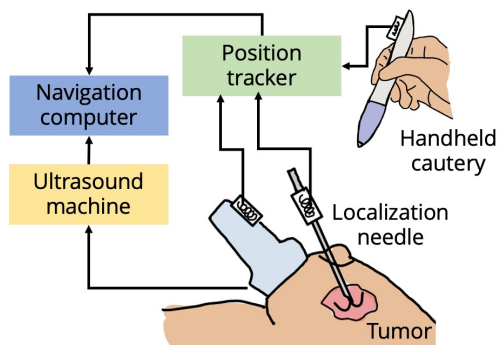
Photo credit: <https://www.docmartinortho.com/mako-smartrobotics/>

*Abbott, Jake J., et al. "Haptic virtual fixtures for robot-assisted manipulation."

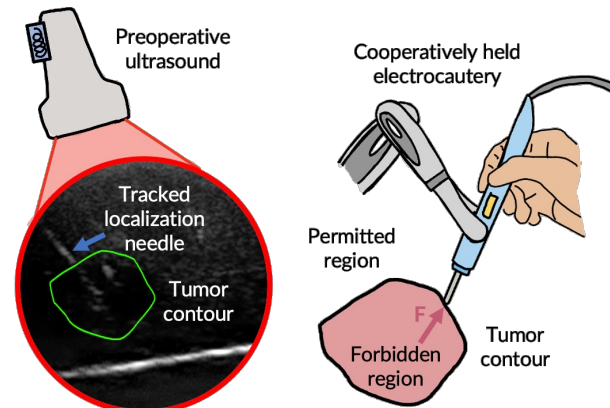
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Methodology

LumpNav system



Virtual fixture integration



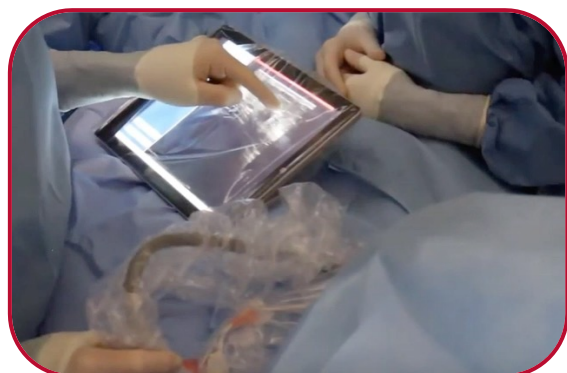
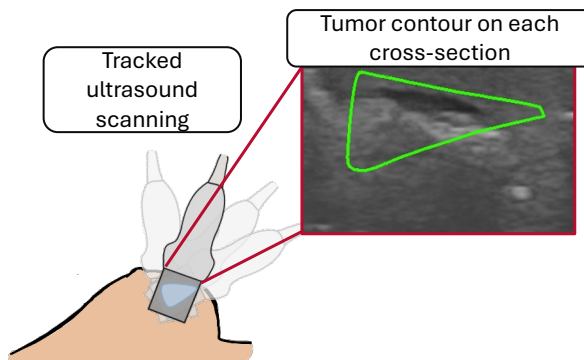
15

Forbidden region definition

Scan for
paper



Method 1: Hand-drawn boundaries

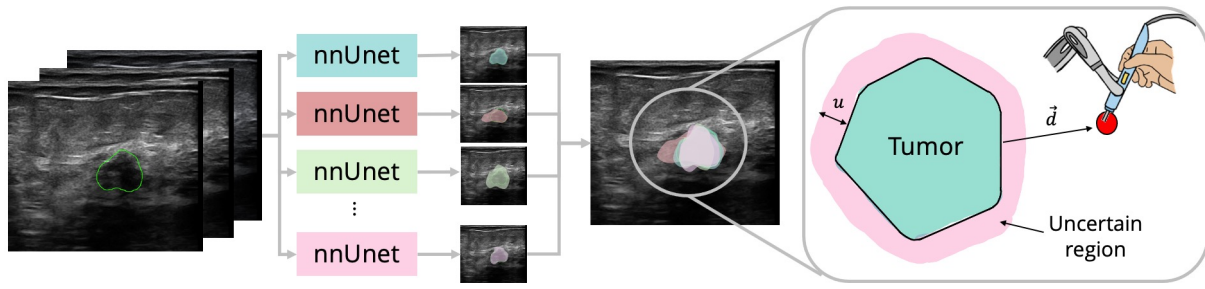


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Forbidden region definition

Paper in
review

Method 2: AI-augmented boundaries

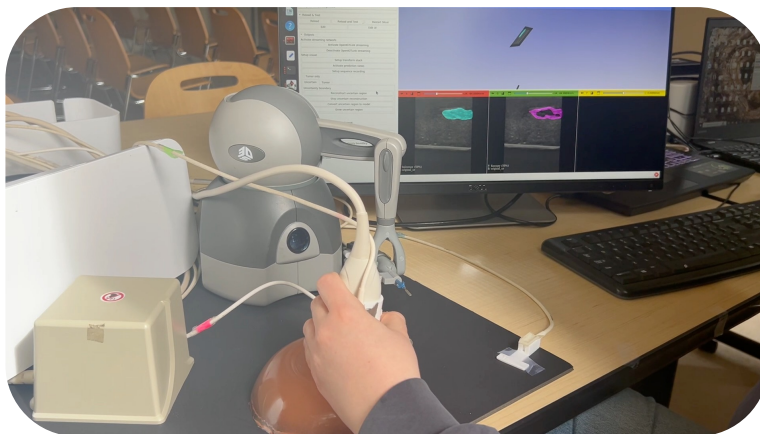


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Forbidden region definition

Paper in
review

Method 2: AI-augmented boundaries

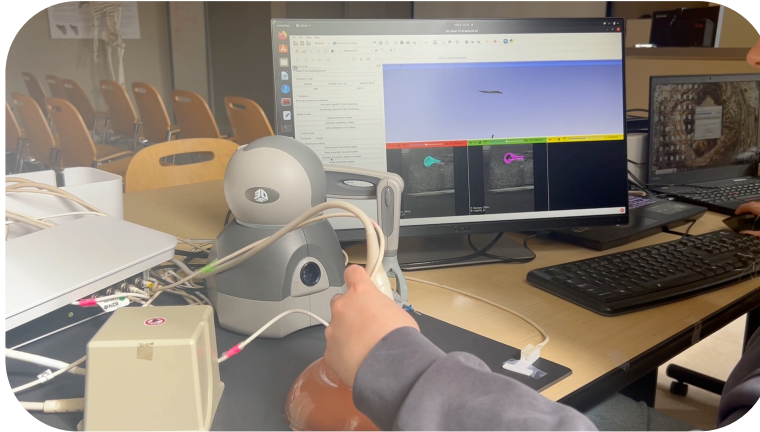


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Forbidden region definition

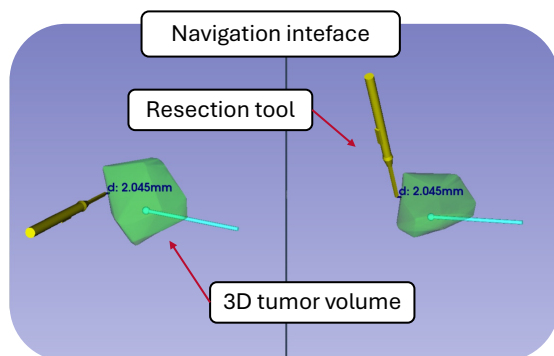
Paper in
review

Method 2: AI-augmented boundaries



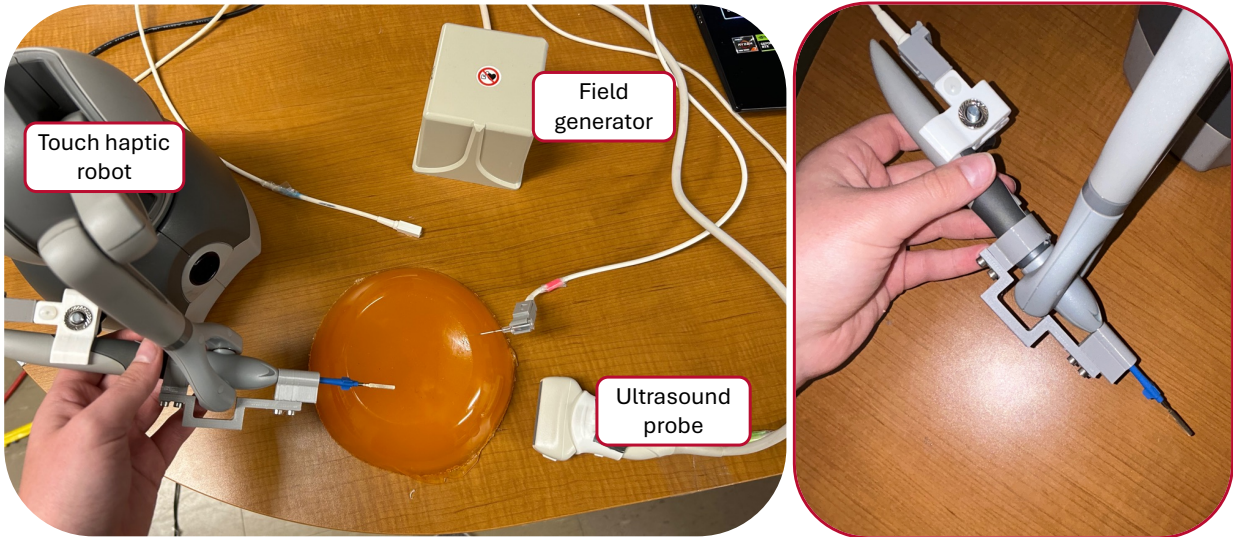
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Forbidden region definition



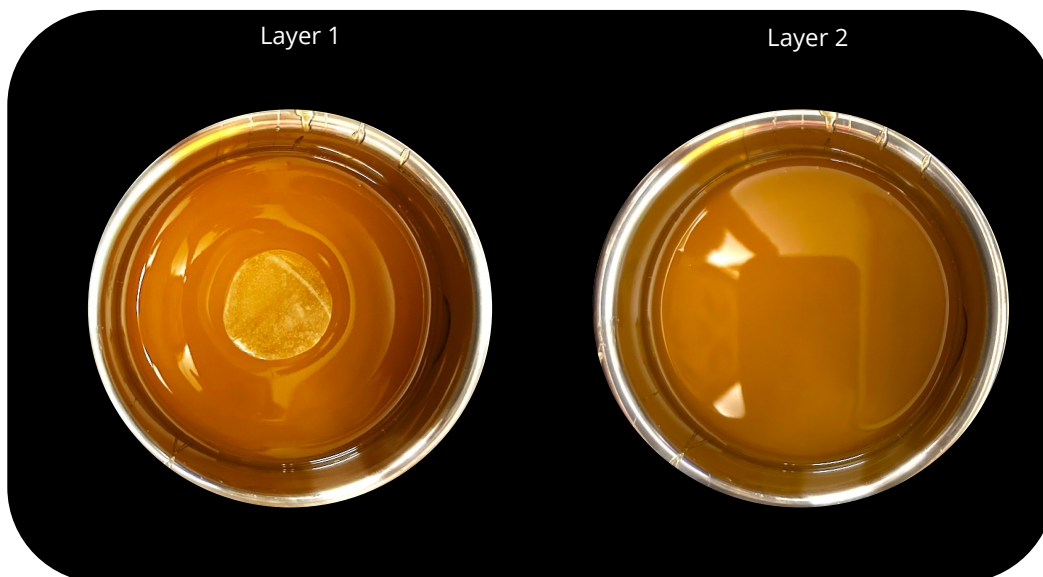
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Benchtop testing system



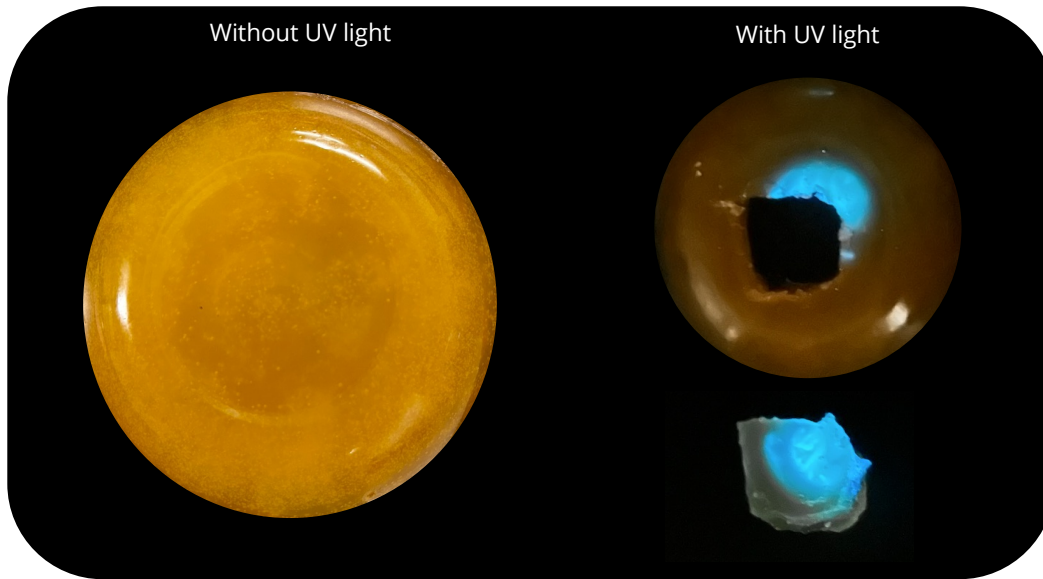
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Breast cancer simulants



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Breast cancer simulants



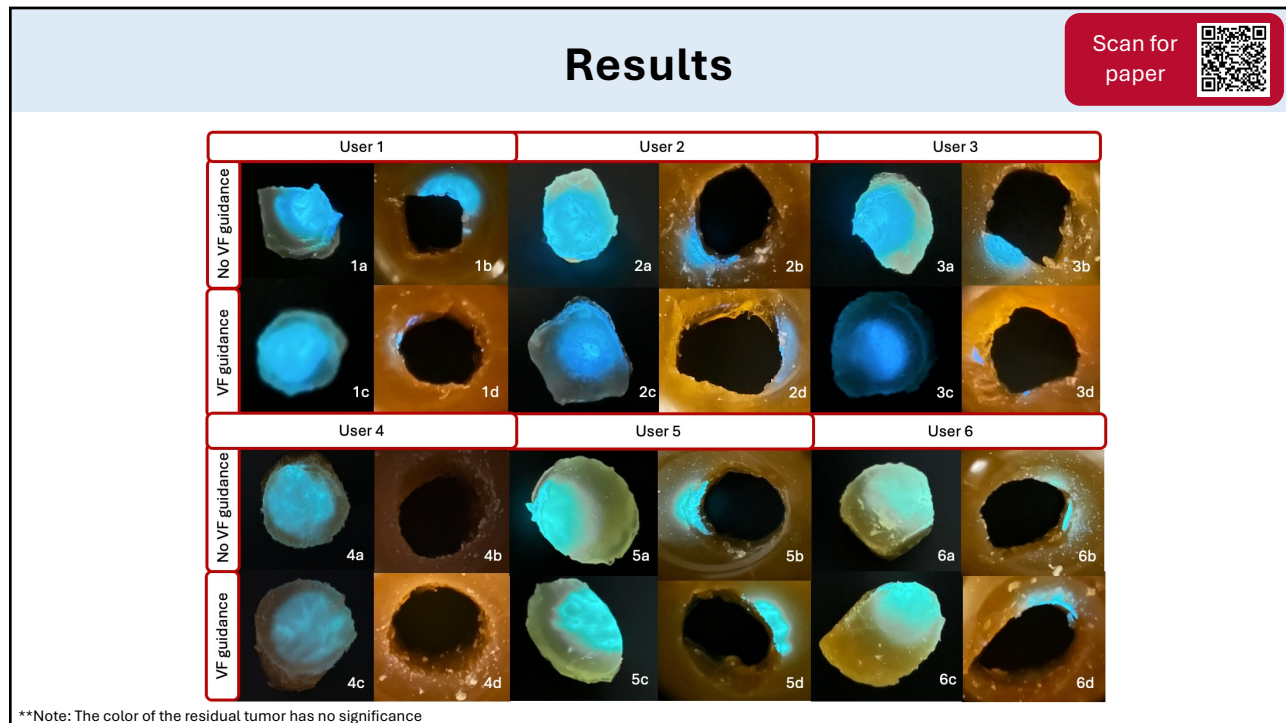
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Pilot study

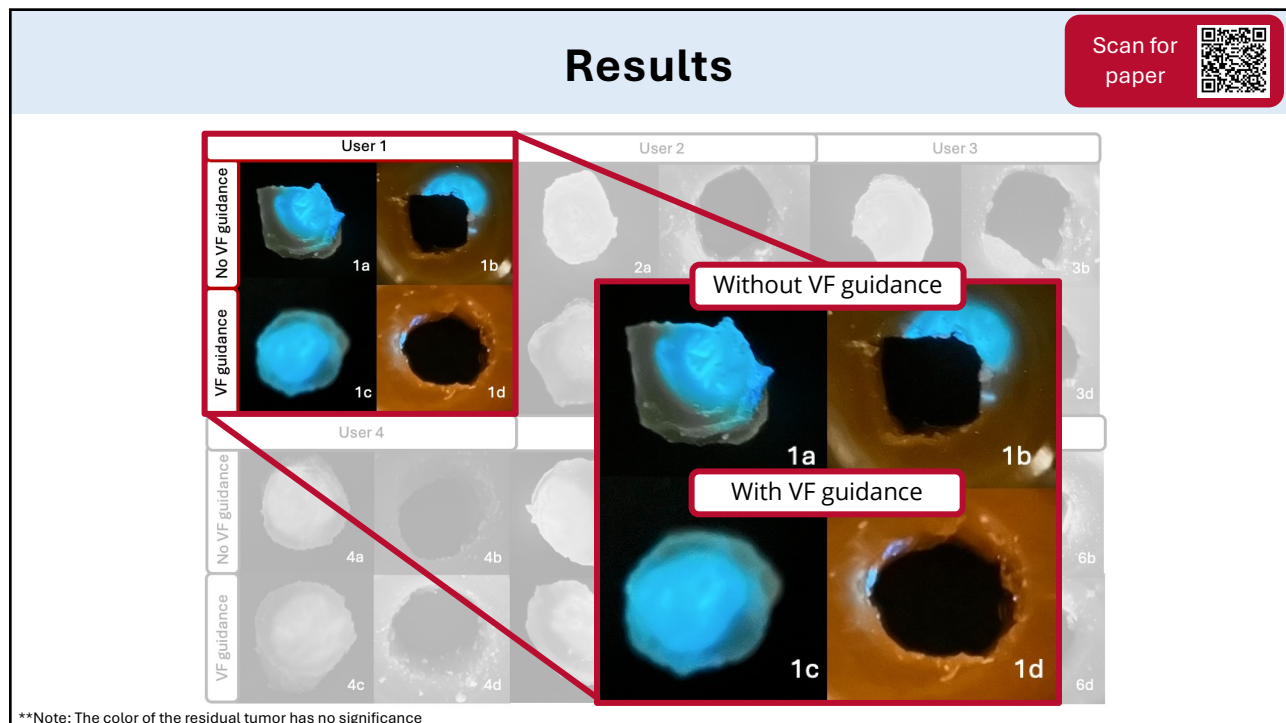
Scan for
paper



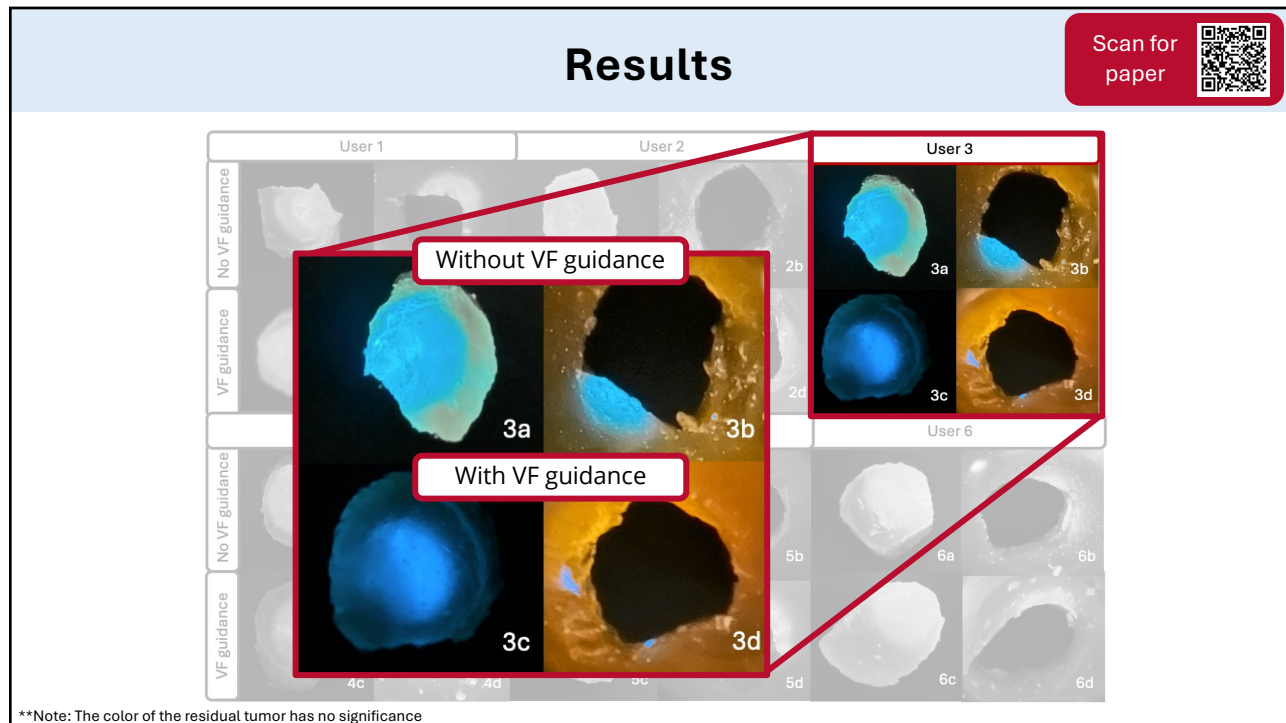
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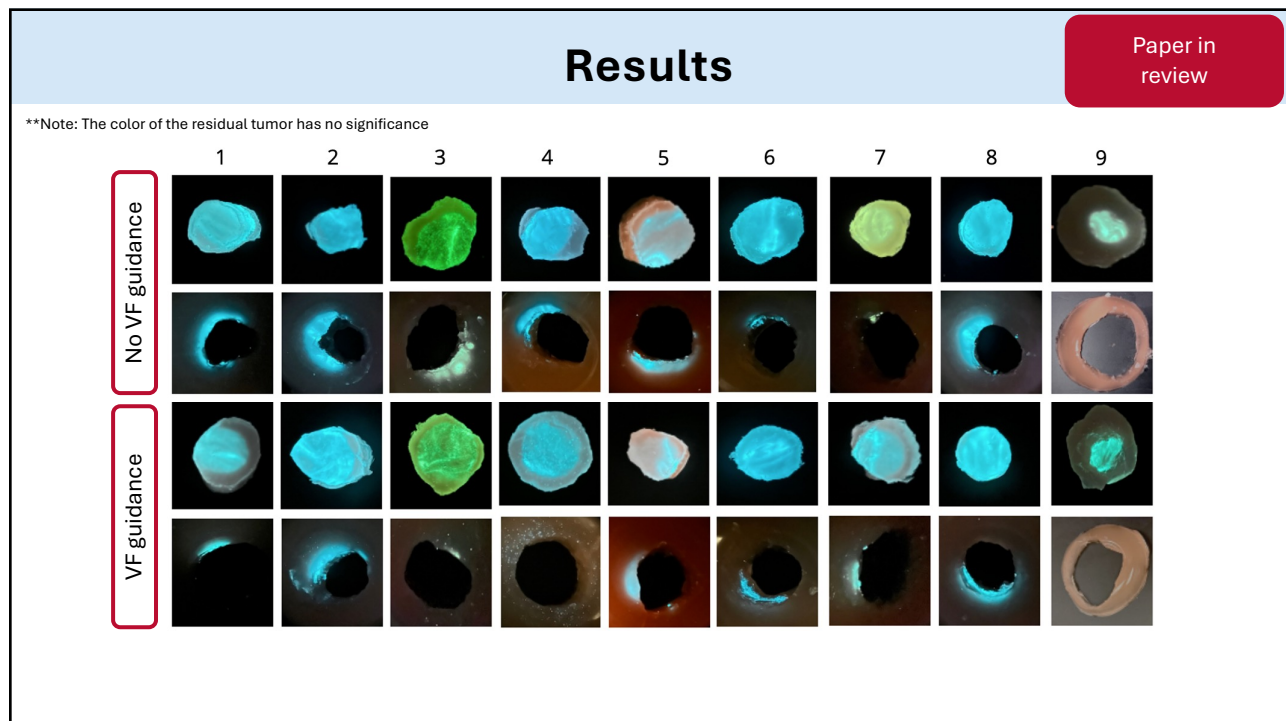
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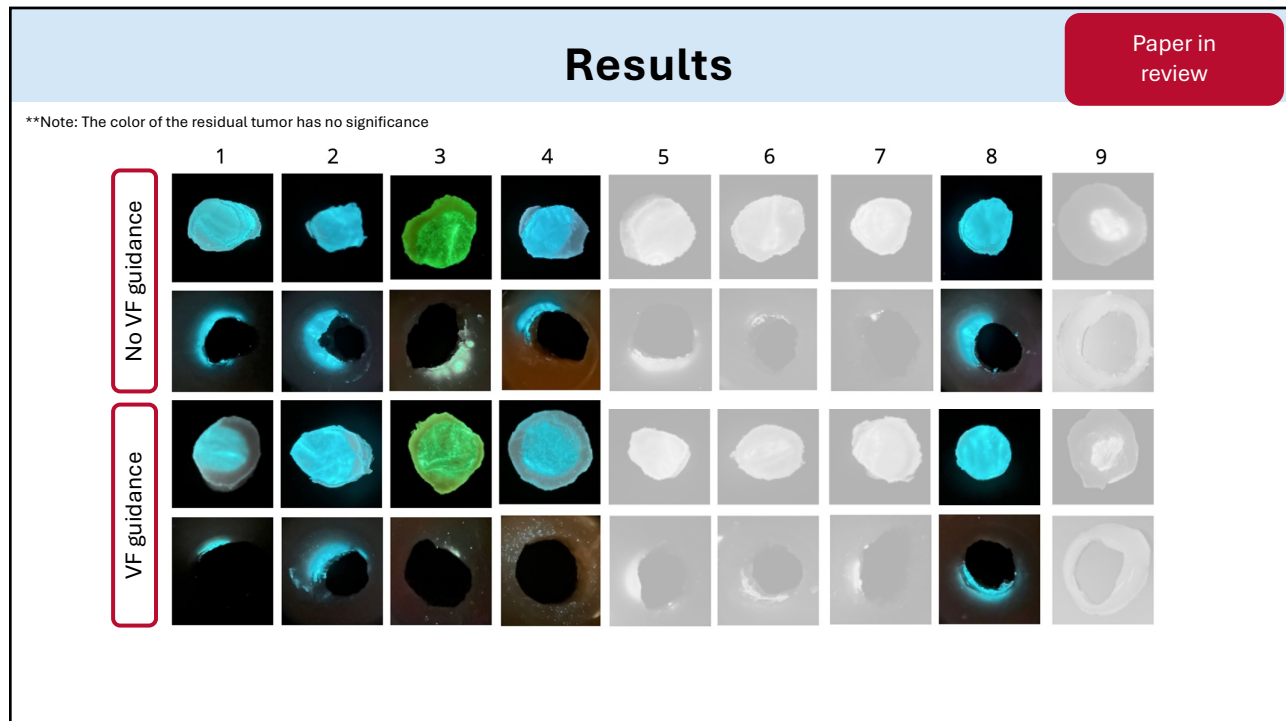
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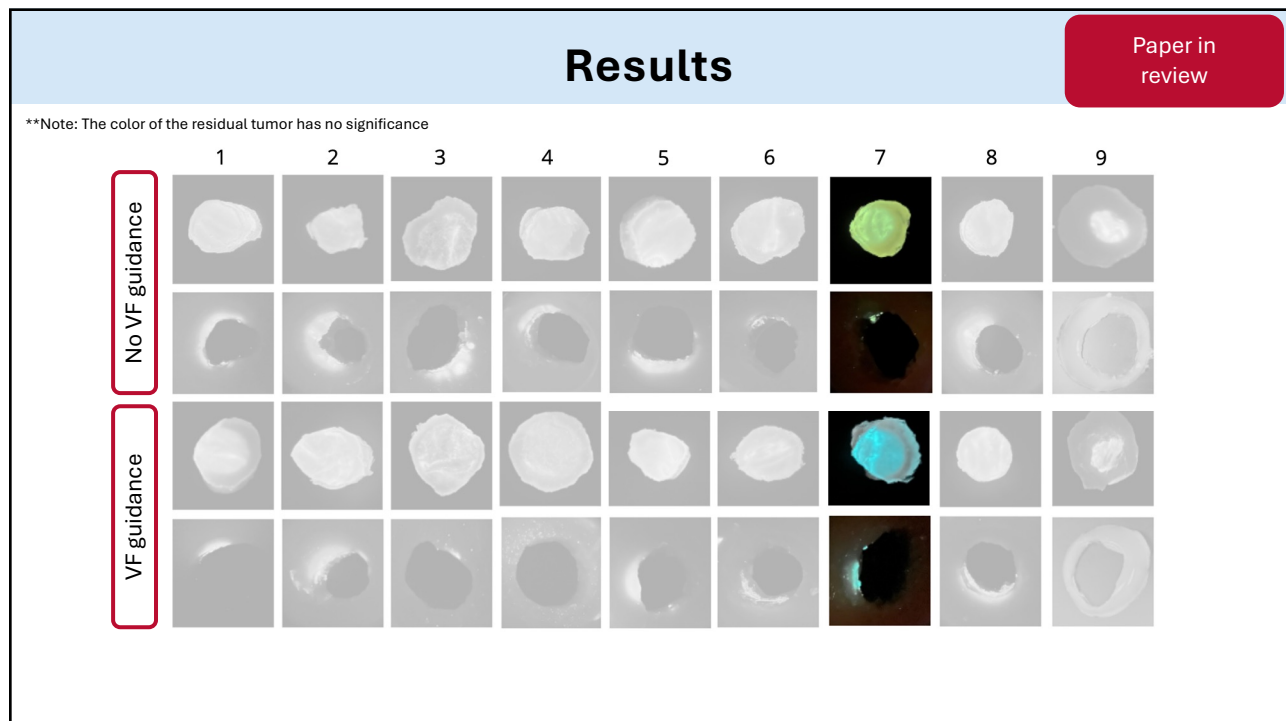
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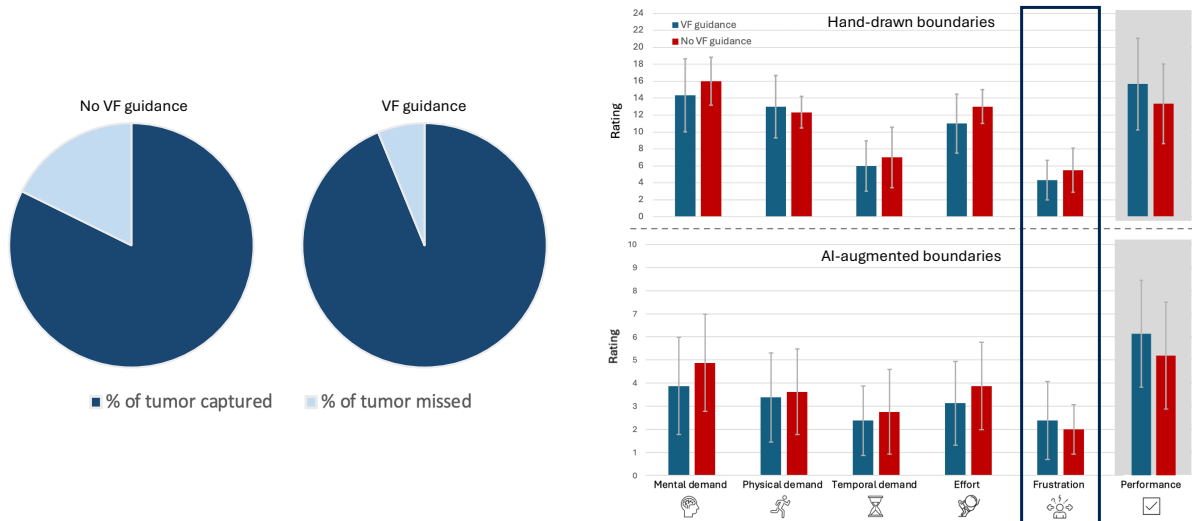


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Results



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Limitations and ongoing work

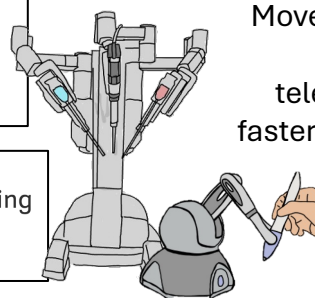
Article | [Open access](#) | Published: 02 January 2025

Use of the Da Vinci SP surgical system in robot-assisted nipple-sparing mastectomy: a single-center, retrospective study

ABSTRACT · Volume 10, Supplement 4, 104709 May 2025 Open Access

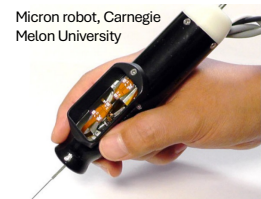
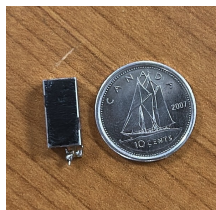
155P Initial experience of robot-assisted breast conserving surgery: A multicenter study

H.J. Choi¹ · S.H. Paek² · H.S. Park³ · J.M. Ryu⁴



Move from cooperative robotics to a telemanipulator for faster clinical translation

Move to a vibrotactile on-board motor – simpler clinical integration!

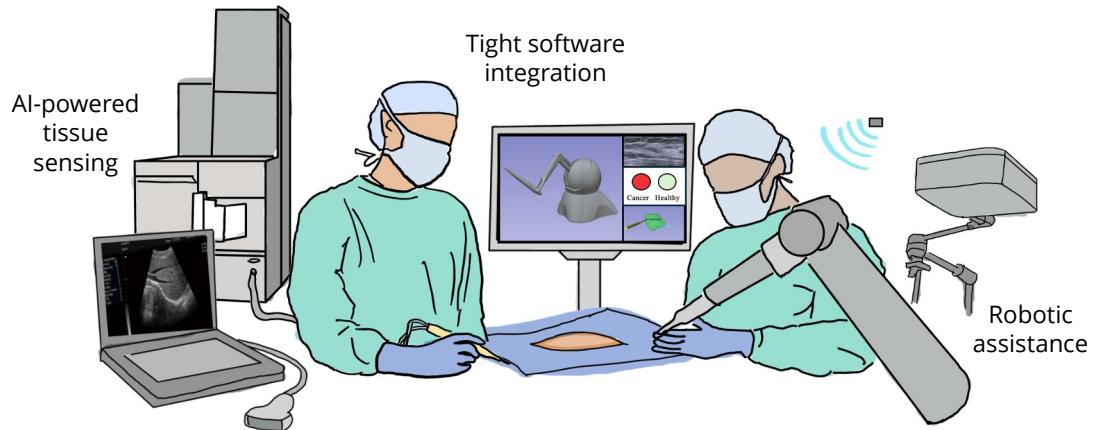


Feasibility study in review at SPIE Medical Imaging 2026

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Objectives

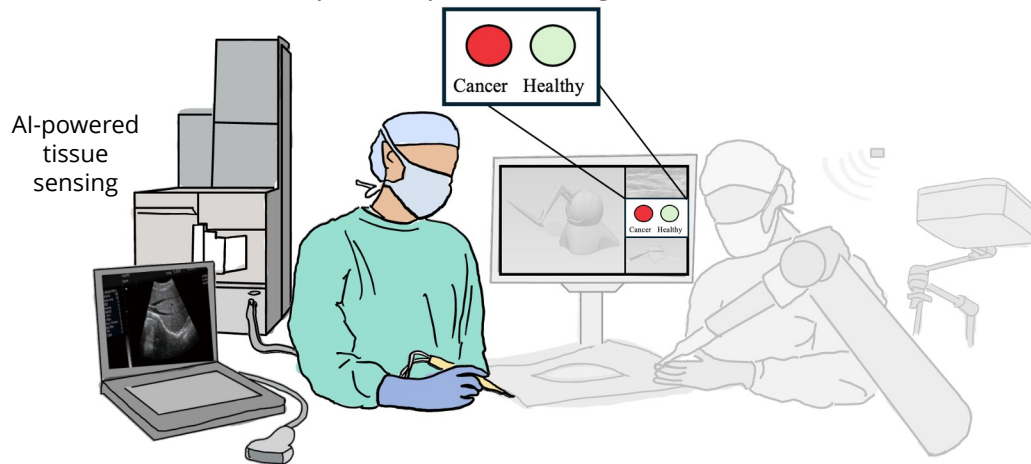
Investigate how robotics, tissue sensing, and AI can be used to prevent positive margins in BCS



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Objectives

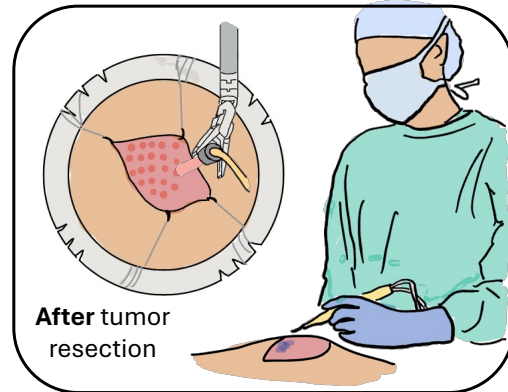
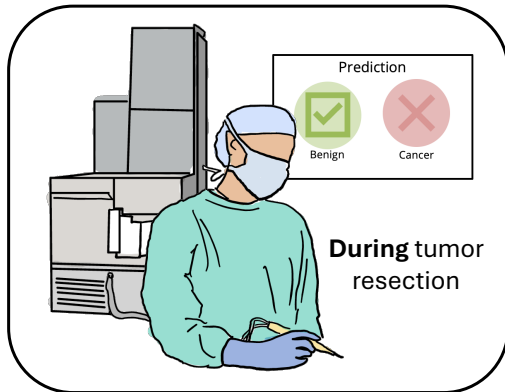
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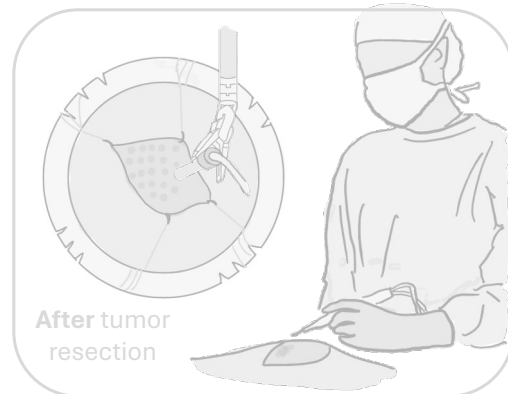
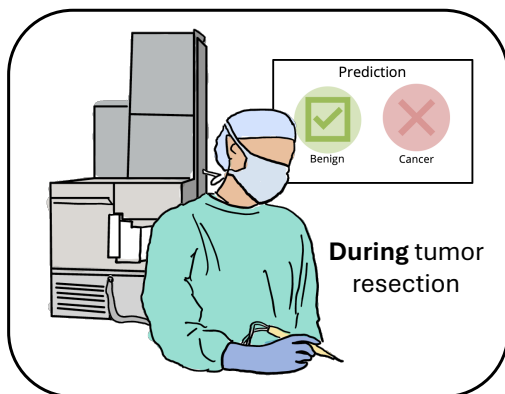
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Objectives

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Mass spectrometry imaging

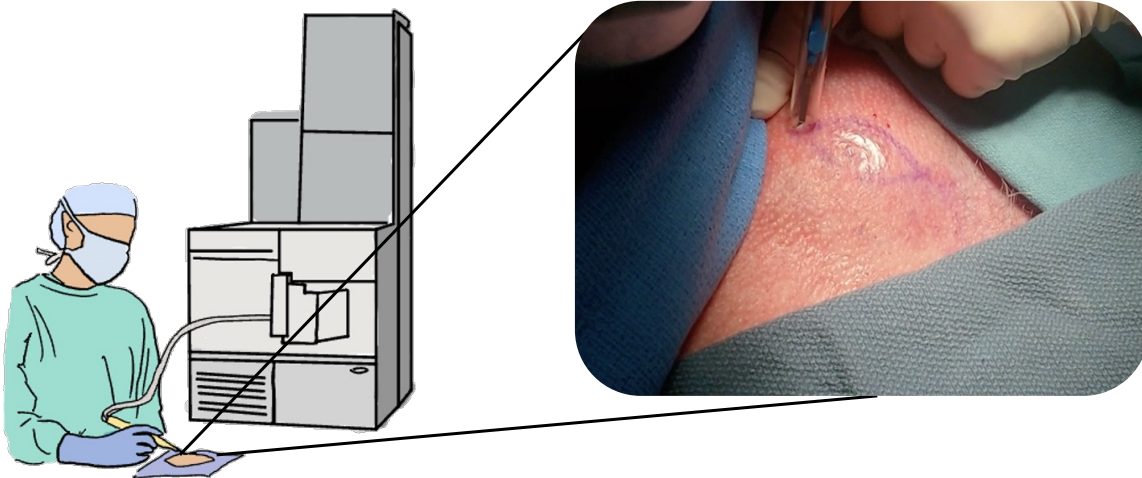
Intraoperative margin evaluation with mass spectrometry imaging



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Mass spectrometry imaging

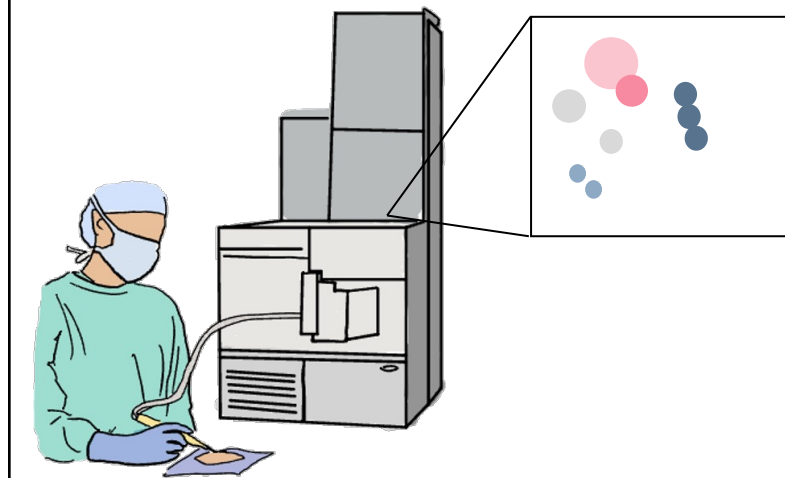
Intraoperative margin evaluation with mass spectrometry imaging



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Mass spectrometry imaging

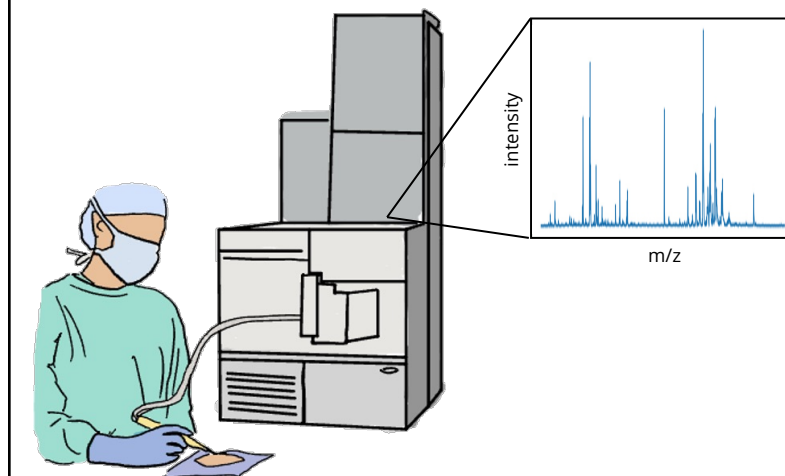
Intraoperative margin evaluation with mass spectrometry imaging



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Mass spectrometry imaging

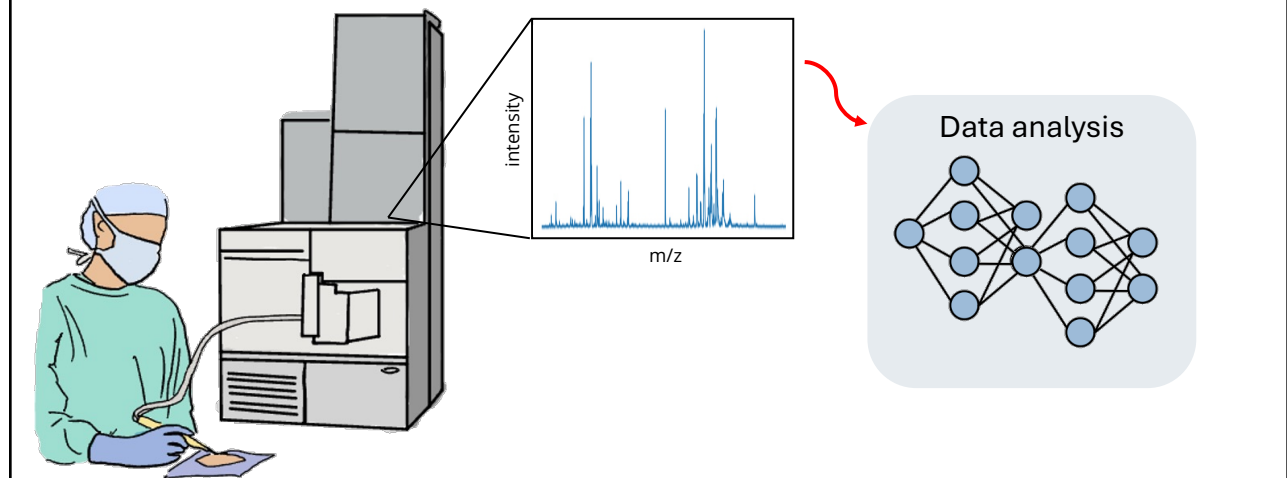
Intraoperative margin evaluation with mass spectrometry imaging



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Mass spectrometry imaging

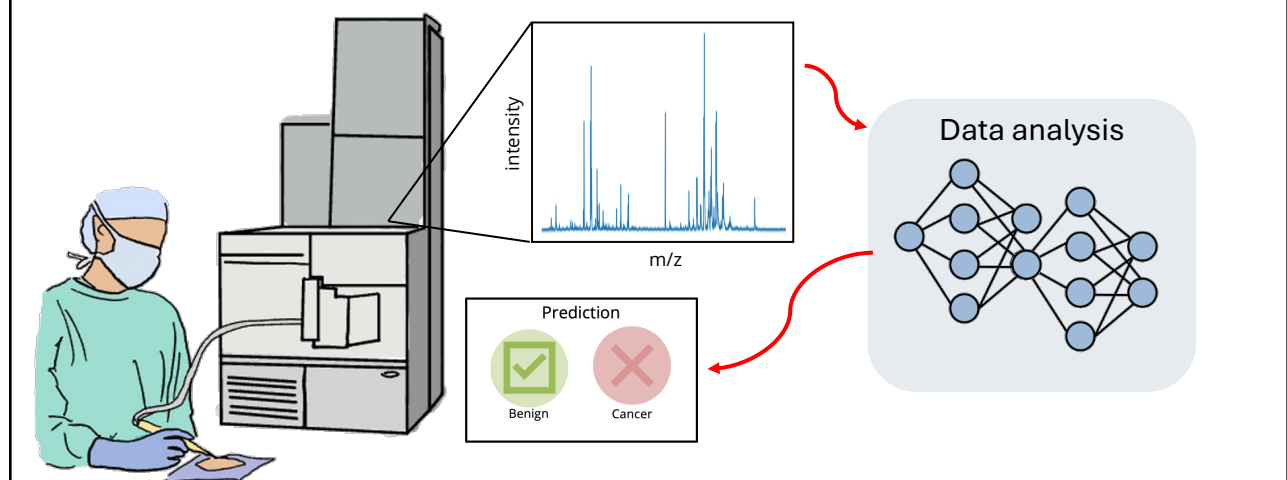
Intraoperative margin evaluation with mass spectrometry imaging



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Mass spectrometry imaging

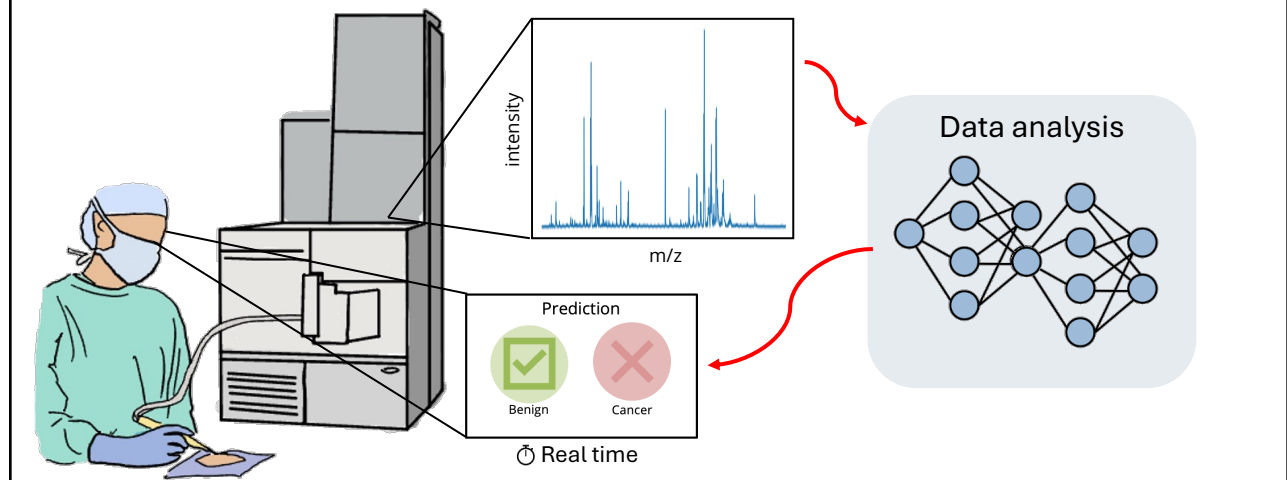
Intraoperative margin evaluation with mass spectrometry imaging



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Mass spectrometry imaging

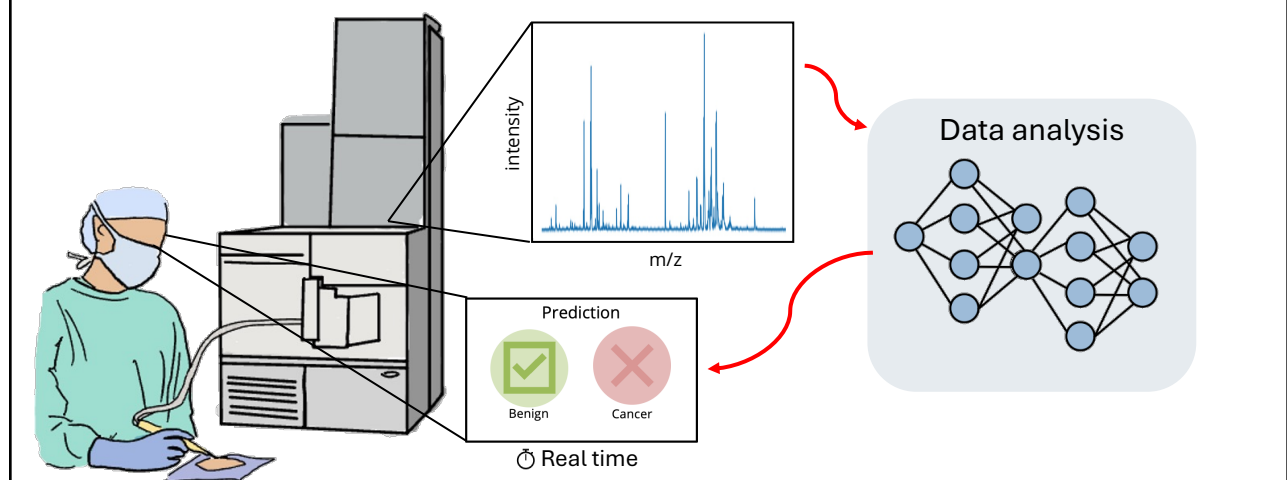
Intraoperative margin evaluation with mass spectrometry imaging



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Mass spectrometry imaging

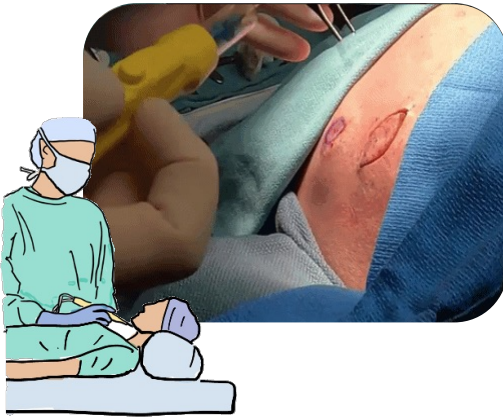
Intraoperative margin evaluation with mass spectrometry imaging



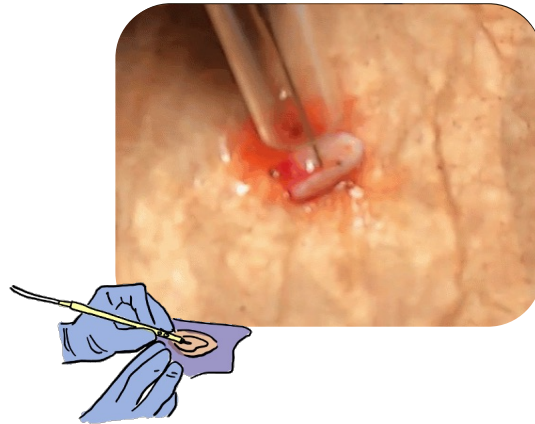
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Data

In vivo data
10 407 spectra, 43 resections



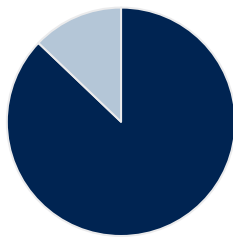
Ex vivo data
693 spectra (252 BCC, 441 benign), 91 patients



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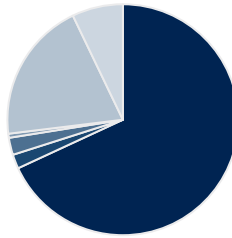
Motivation

Search results on Google Scholar



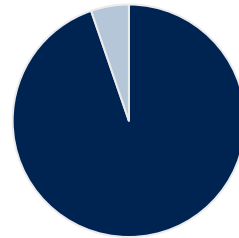
■ Image classification ■ Signal classification

State-of-the-art on Papers with Code



■ Image classification ■ Time series prediction
■ Audio classification ■ ECG classification
■ Text classification ■ EEG analysis

Available Datasets on Kaggle



■ Image classification ■ Signal classification

Signal classification

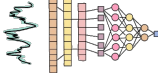
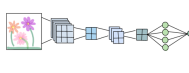


Image classification



Updated on May 8th, 2024

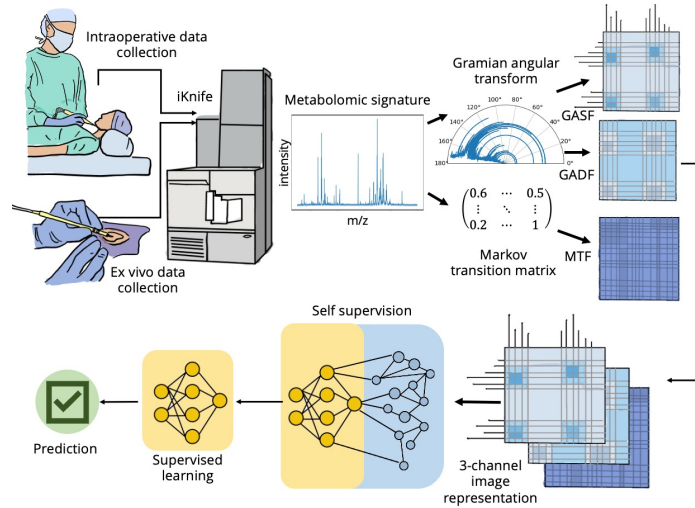
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Methodology

Scan for
paper



- Technical challenges: real-time data analysis, out of distribution or noisy data, intraoperative deployment
- Leveraged self-supervised learning and image-conversion to improve iKnife classification models



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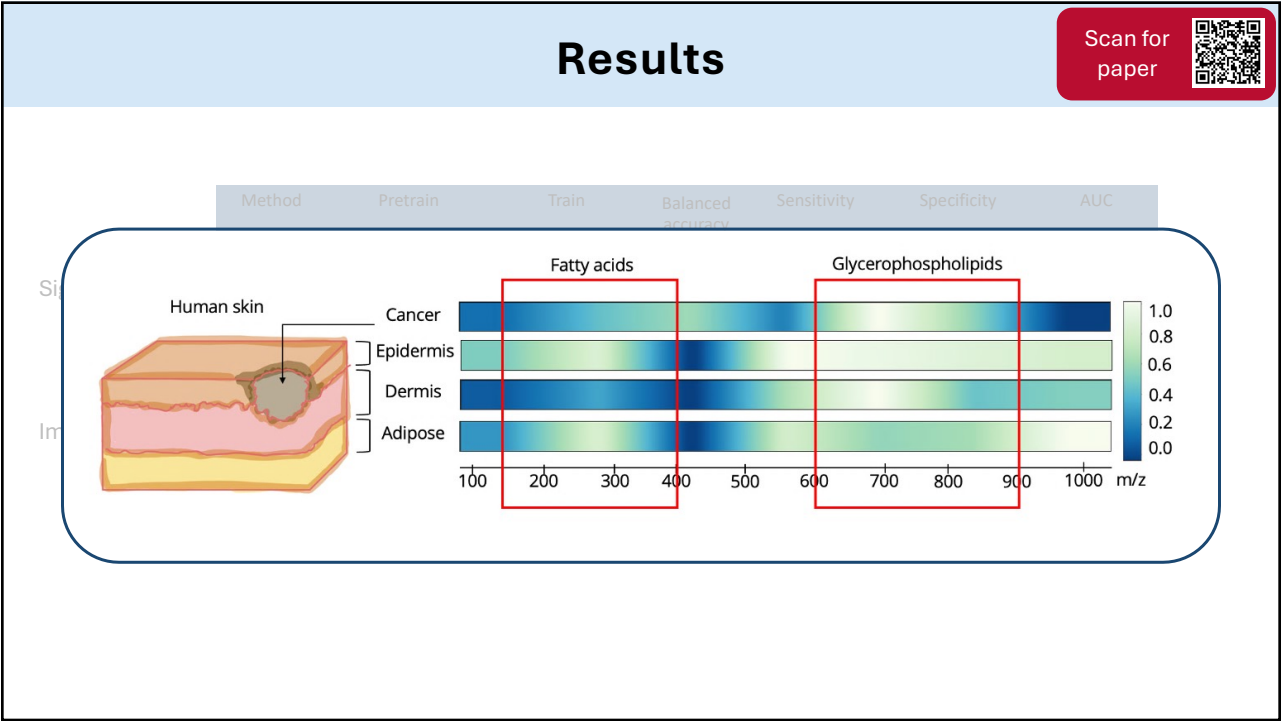
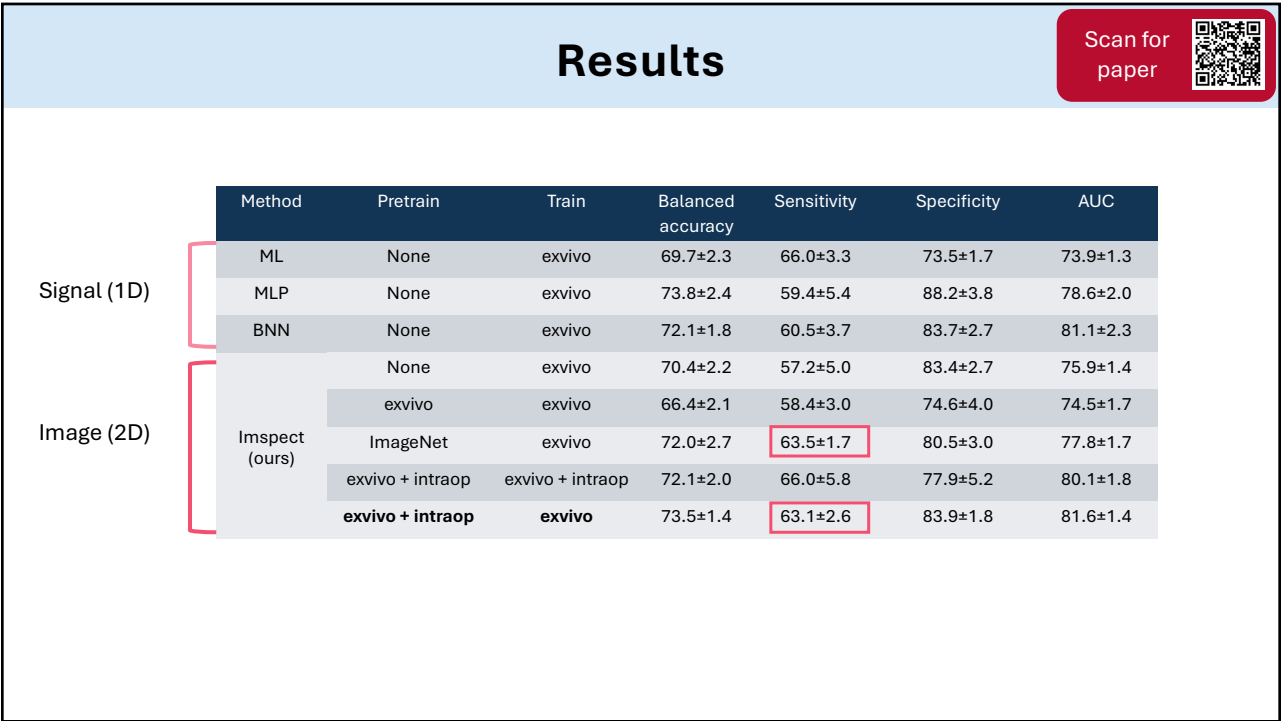
Results

Scan for
paper



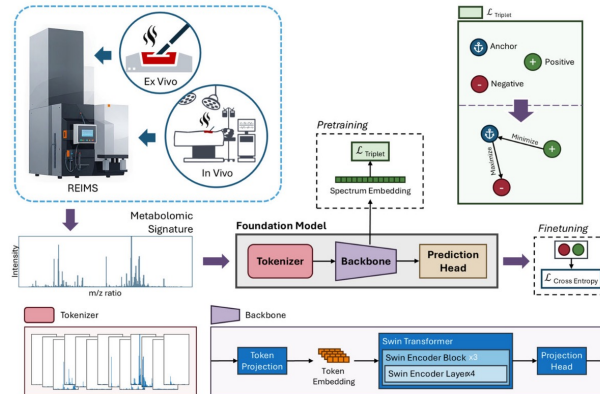
	Method	Pretrain	Train	Balanced accuracy	Sensitivity	Specificity	AUC
Signal (1D)	ML	None	exvivo	69.7±2.3	66.0±3.3	73.5±1.7	73.9±1.3
	MLP	None	exvivo	73.8±2.4	59.4±5.4	88.2±3.8	78.6±2.0
	BNN	None	exvivo	72.1±1.8	60.5±3.7	83.7±2.7	81.1±2.3
Image (2D)	Inspect (ours)	None	exvivo	70.4±2.2	57.2±5.0	83.4±2.7	75.9±1.4
		exvivo	exvivo	66.4±2.1	58.4±3.0	74.6±4.0	74.5±1.7
		ImageNet	exvivo	72.0±2.7	63.5±1.7	80.5±3.0	77.8±1.7
		exvivo + intraop	exvivo + intraop	72.1±2.0	66.0±5.8	77.9±5.2	80.1±1.8
		exvivo + intraop	exvivo	73.5±1.4	63.1±2.6	83.9±1.8	81.6±1.4

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Limitations and ongoing work

- Limited number of patients and samples, should be extended to a larger dataset
- Translate from surrogate tissue dataset to breast tissue
- Explore how these representations can be used for new foundation models



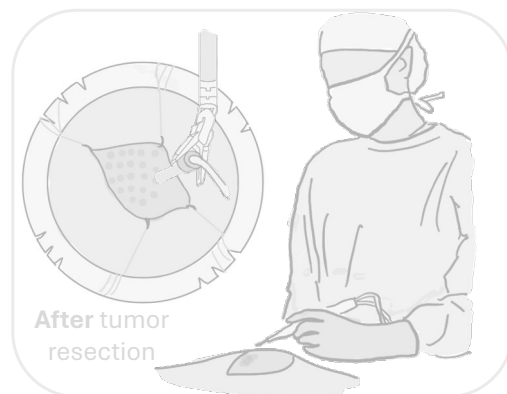
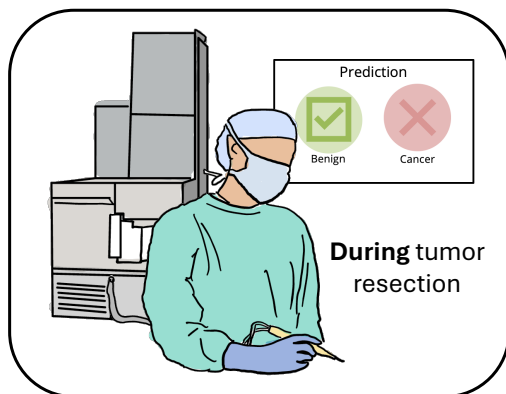
Scan for
paper



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Objectives

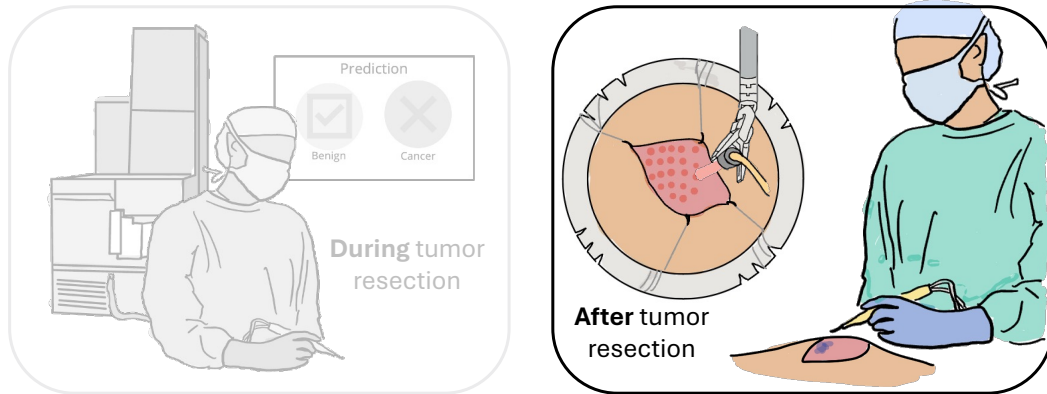
Investigate how robotics, tissue sensing, and AI can be used to prevent positive margins in BCS



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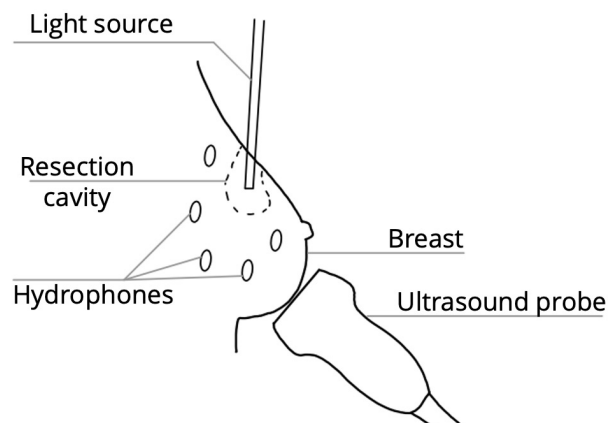
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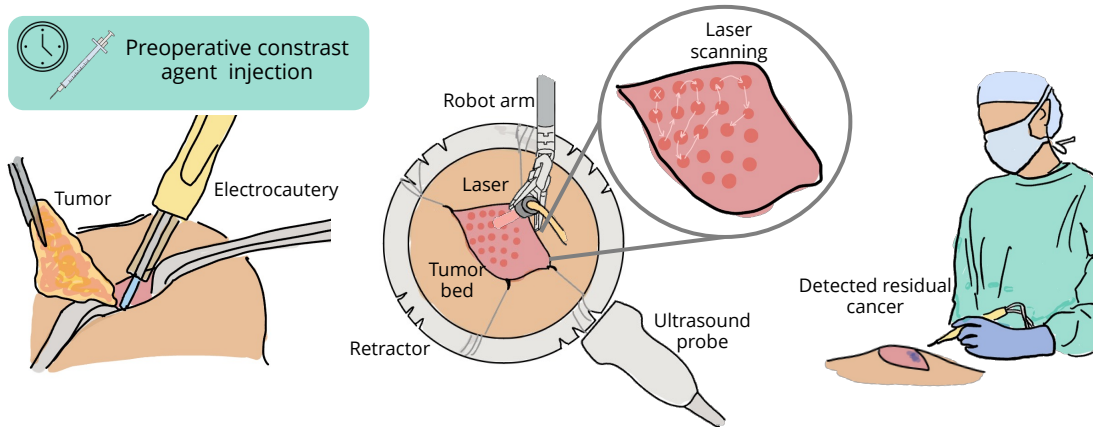
Photoacoustic tumor bed inspection

- **Photoacoustic imaging:** Pulses of laser light are used to induce localized, optical absorption-based thermal expansion
- **Contrast agents** that are PA sensitive can be used to target specific tissue



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Photoacoustic tumor bed inspection



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Tumor bed models

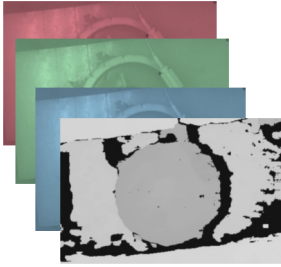


3 different cavity geometries for evaluation

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Tumor bed inspection

Part 1: Cavity sensing



Part 2: Registration

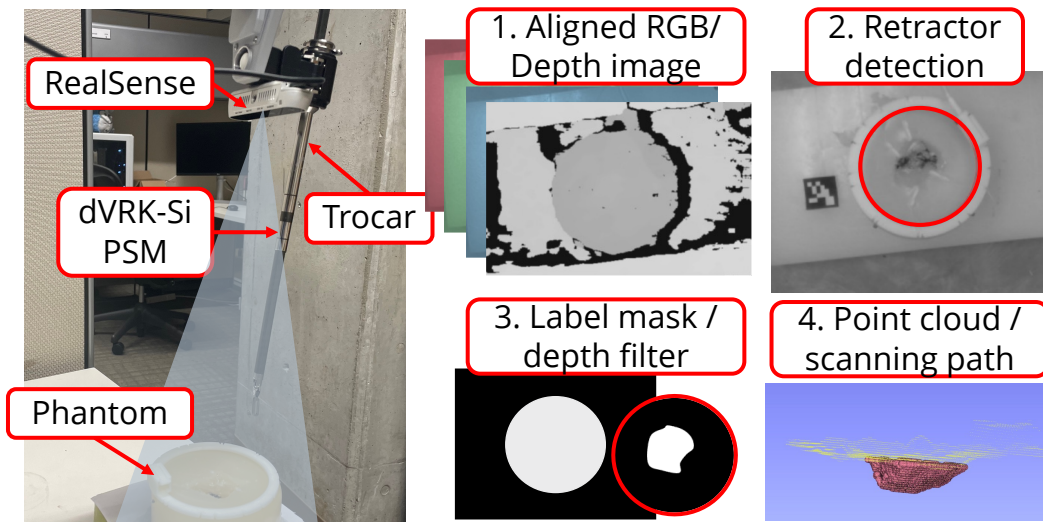


Part 3: Scanning



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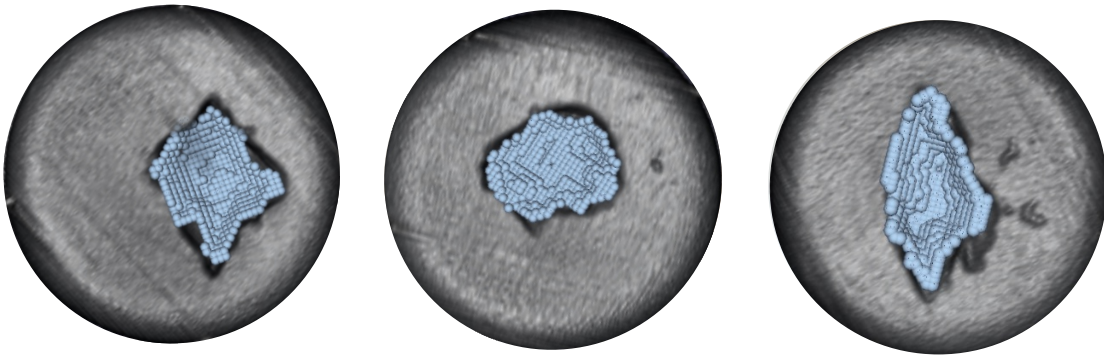
Cavity sensing



<https://github.com/PerkLab/DepthImageToPointCloud>

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Cavity sensing

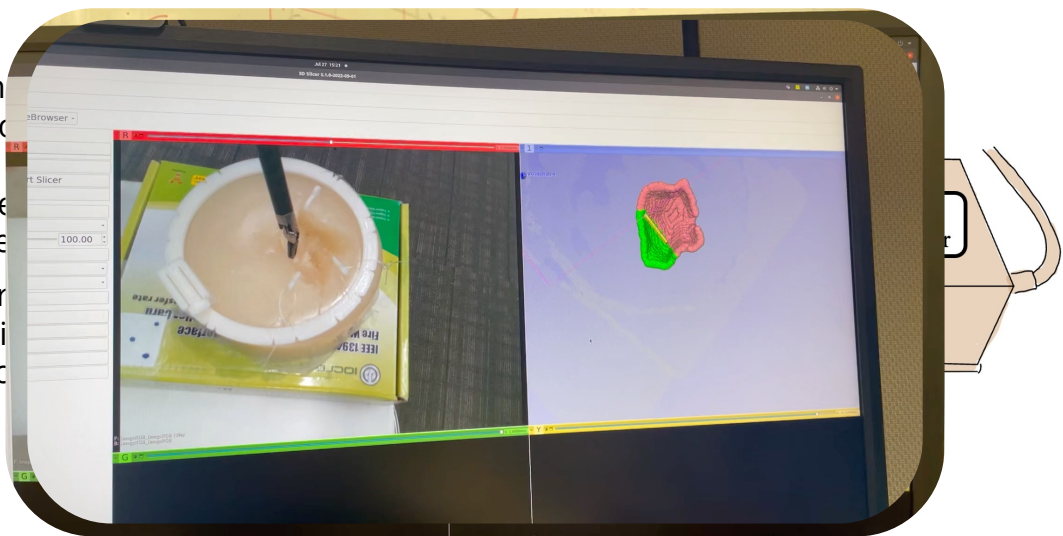


Sensed cavities on tumor bed (overlaid on volume reconstruction of CT)

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Registration

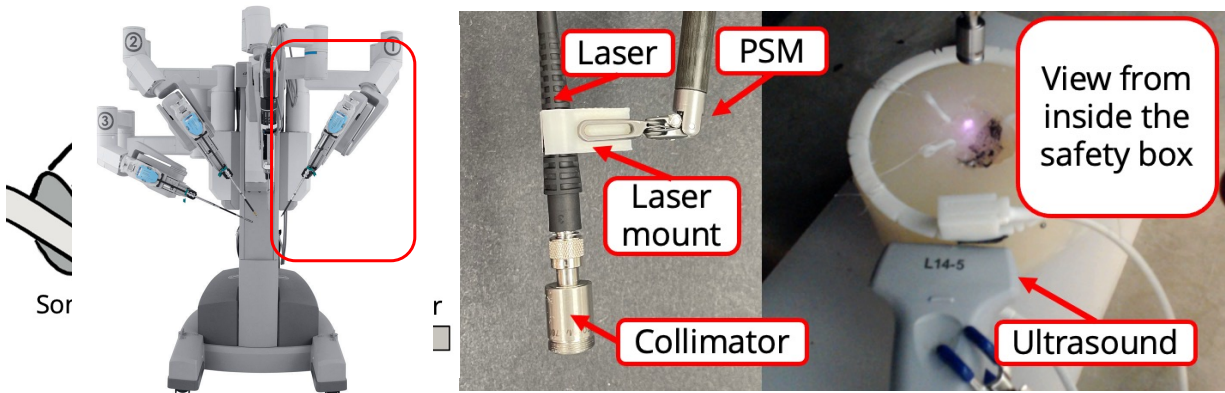
- Track the point cloud relative to the sensor in the robot's coordinate system
- Register everything to the robot's coordinate system



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Scanning

Paper in review

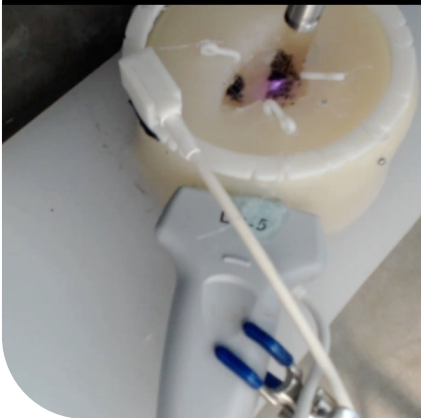


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Results

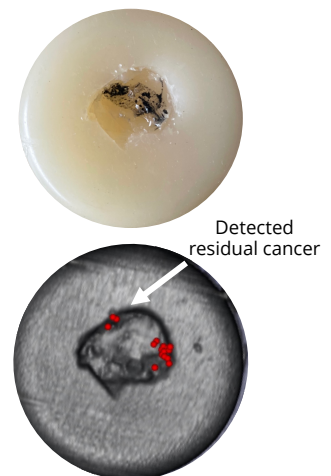
Paper in review

Webcam view

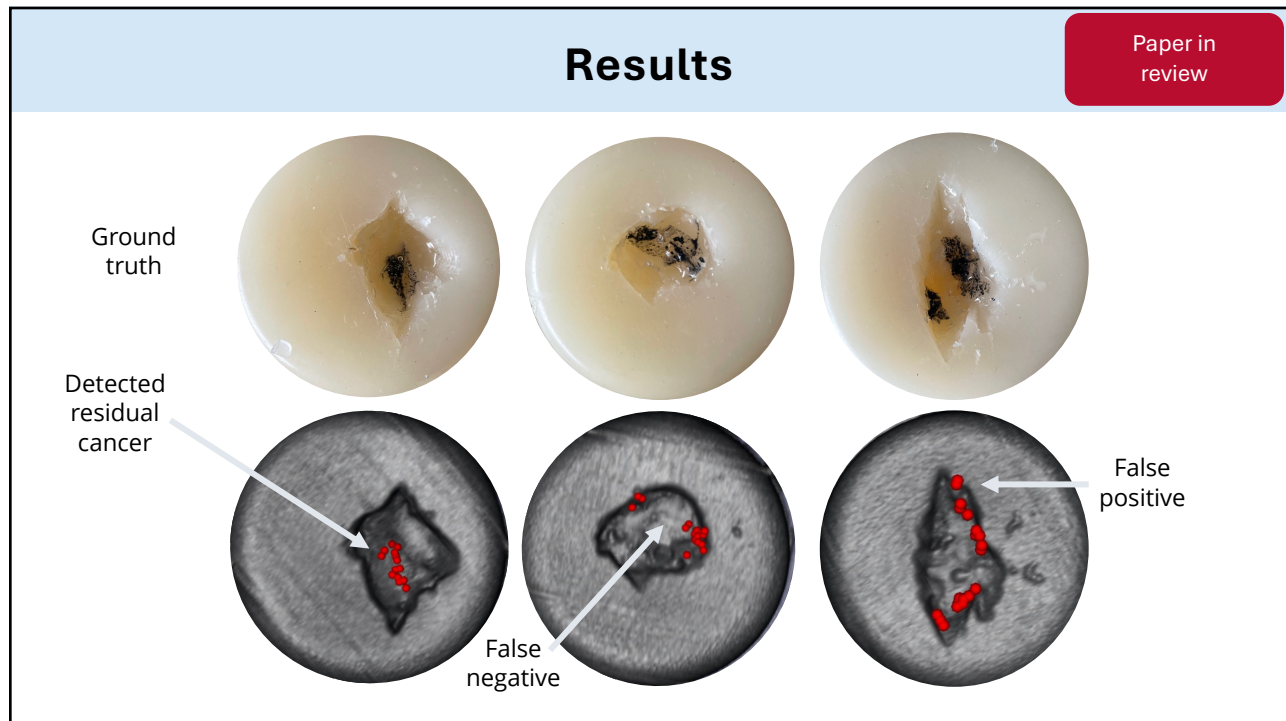


Raw channel data

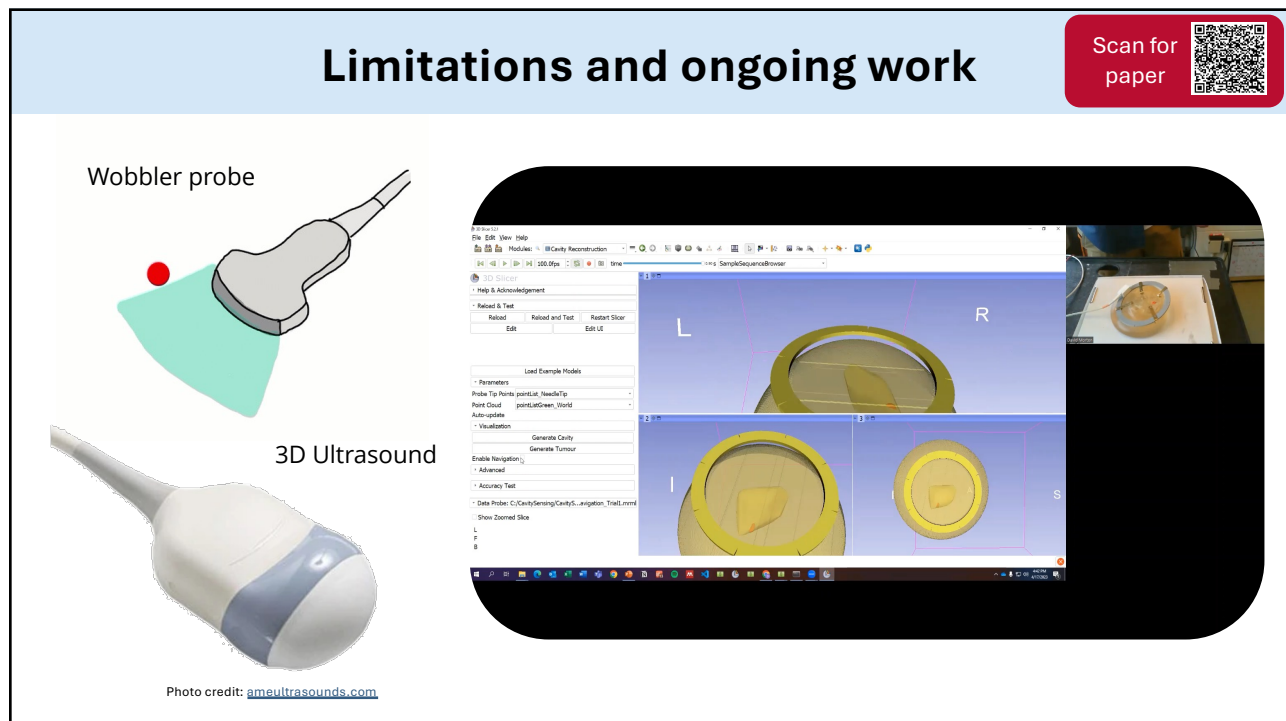
Here we can see a clear photoacoustic signal when the laser illuminates the ink



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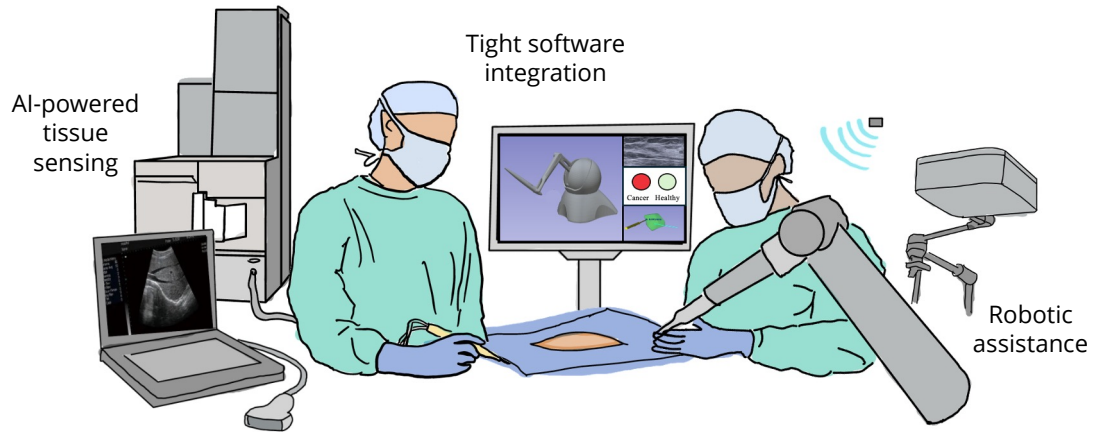
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Objectives

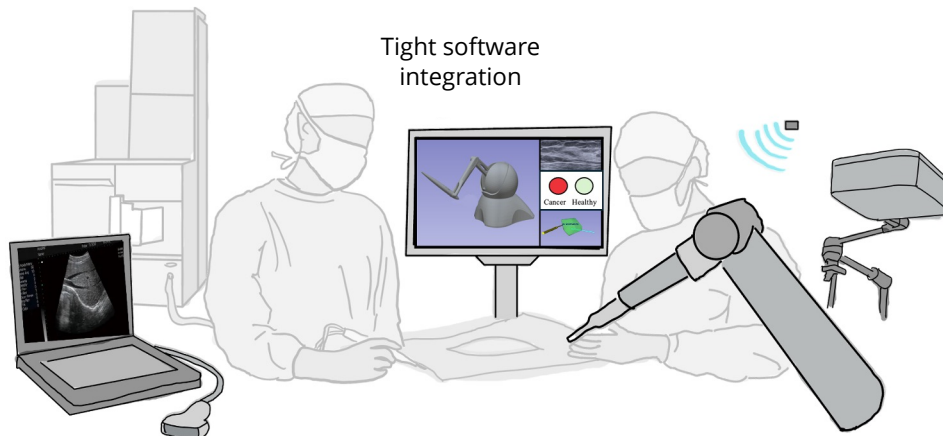
Investigate how robotics, tissue sensing, and AI can be used to prevent positive margins in BCS



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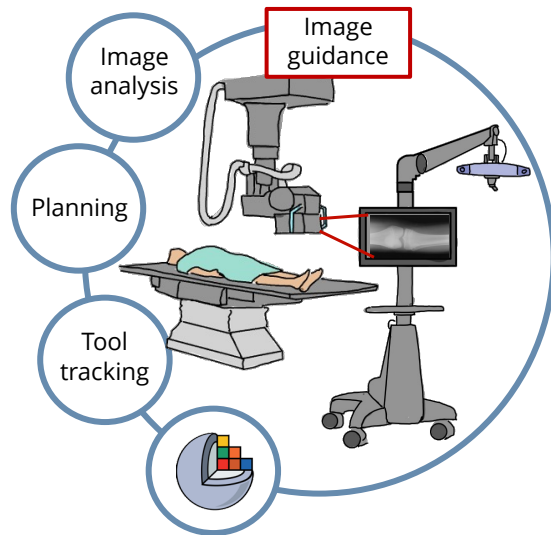
Objectives

Investigate how robotics, tissue sensing, and AI can be used to prevent positive margins in BCS



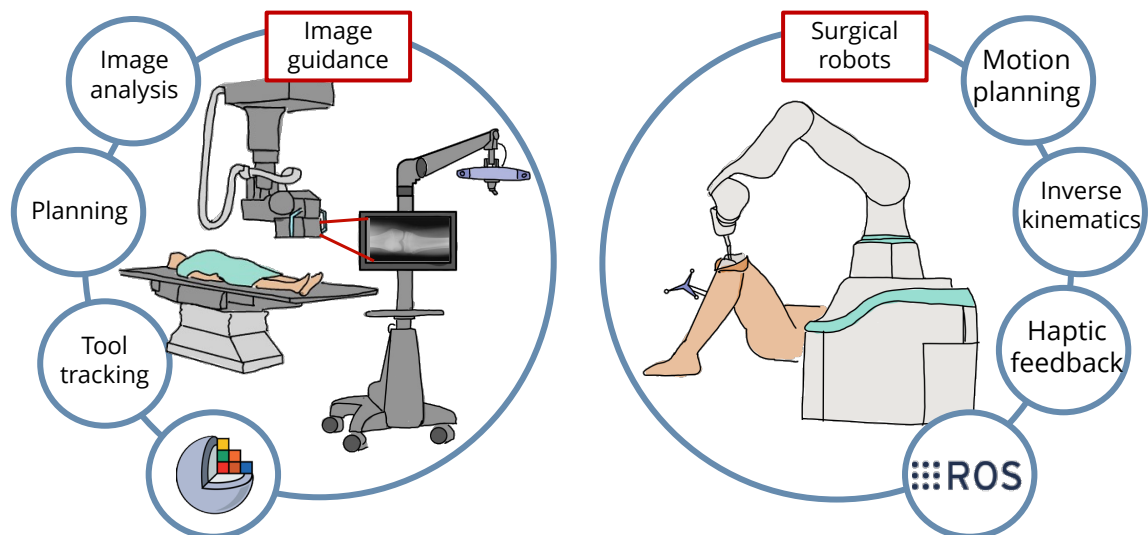
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Image-guided robotics

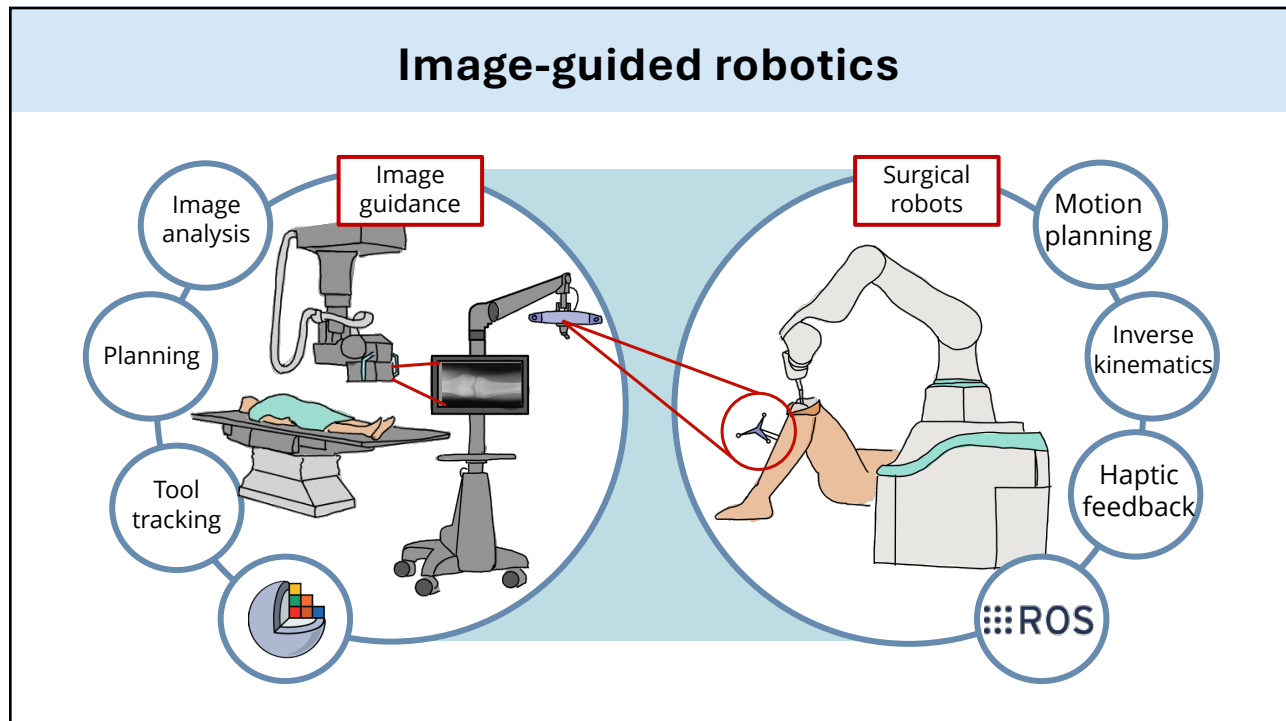


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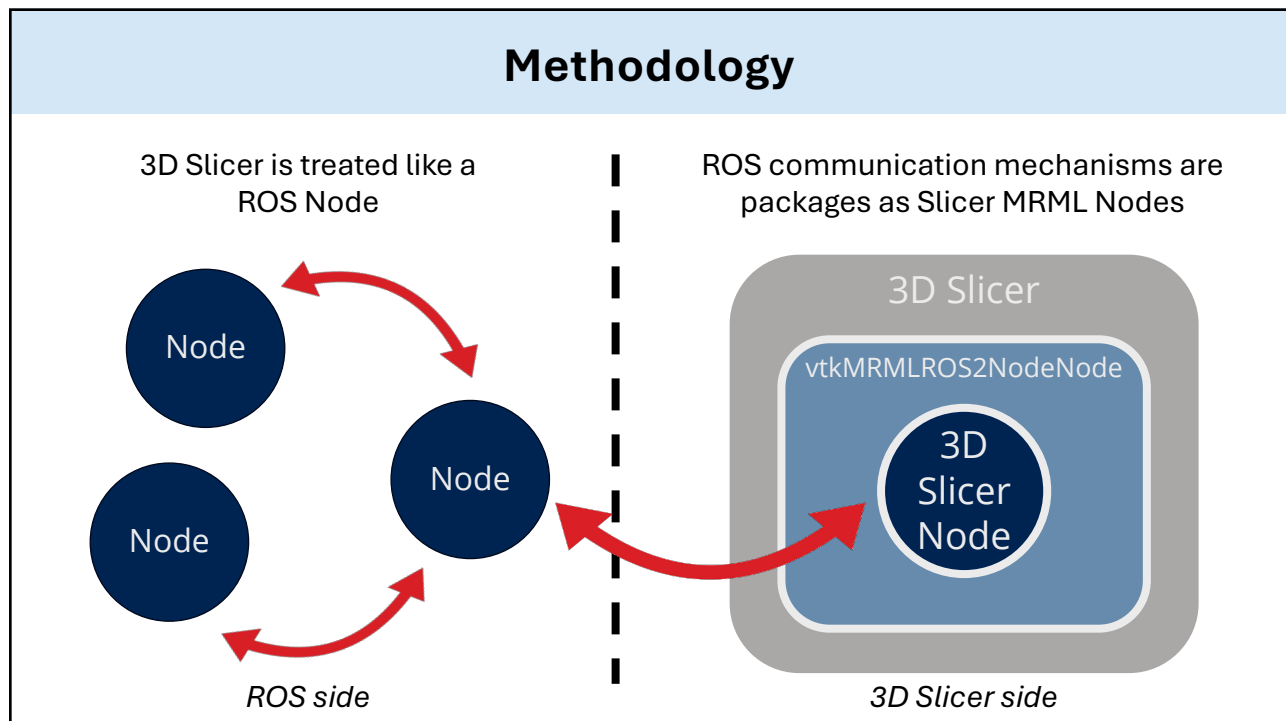
Image-guided robotics



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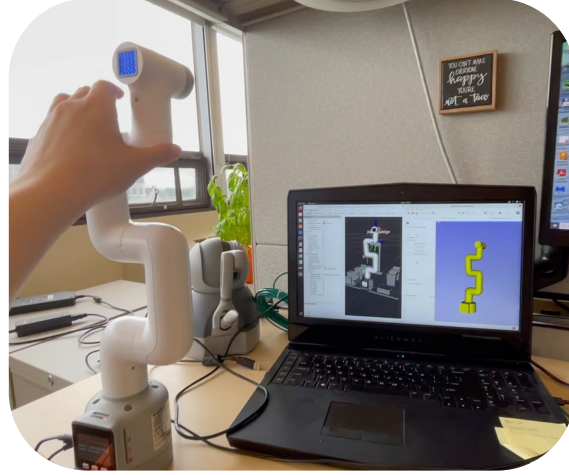
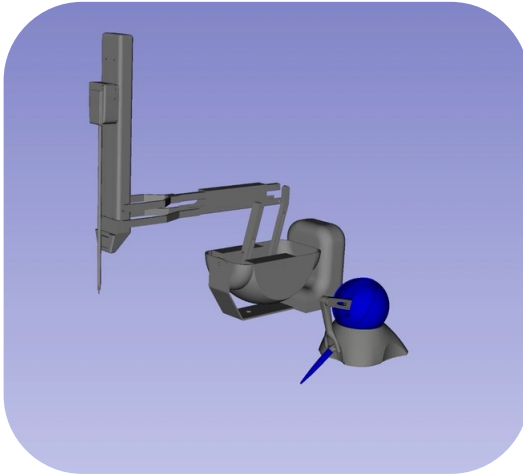
71

Results - SlicerROS2

Scan for
paper



Load and visualize ROS2 compatible robots



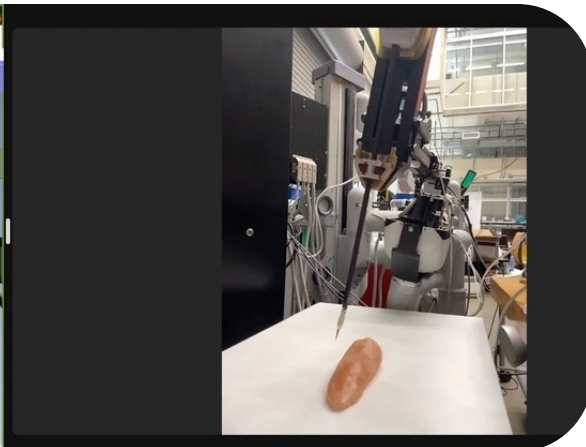
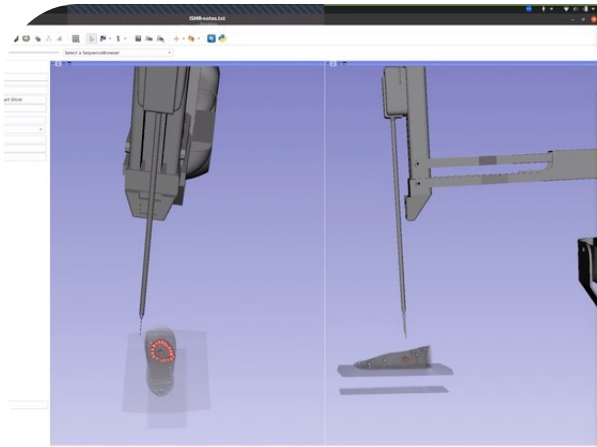
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Results - SlicerROS2

Scan for
paper



Register medical images and robots



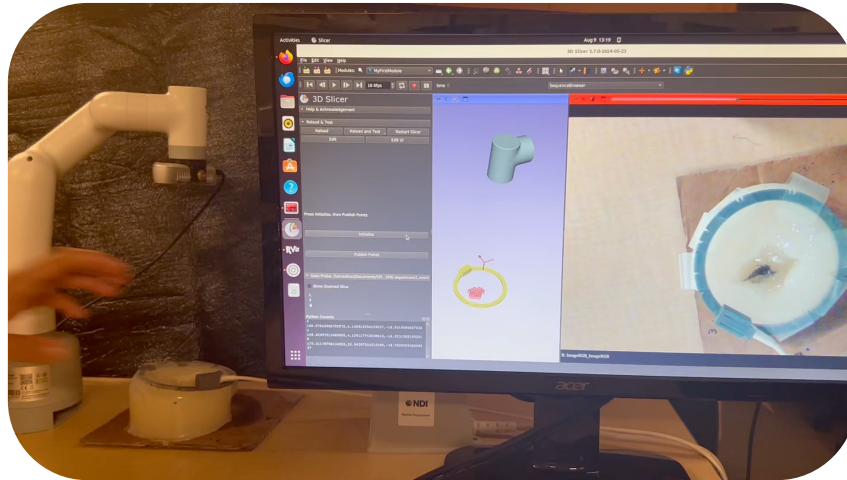
73

Results - SlicerROS2

Scan for
paper

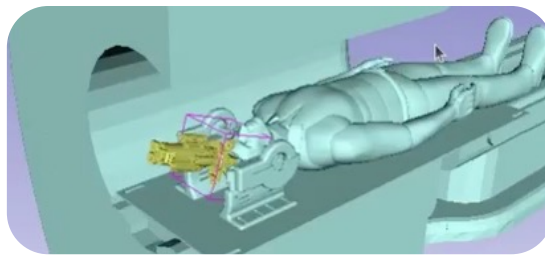


Integrate with tracking systems

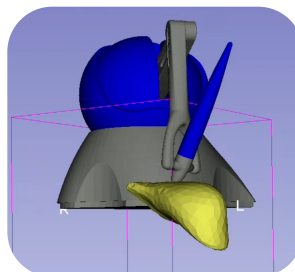
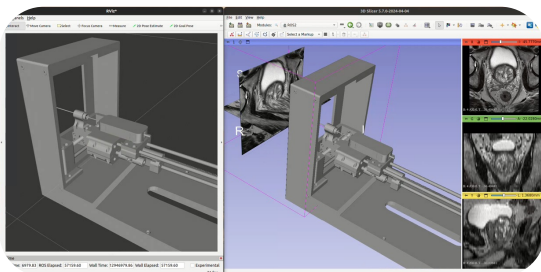


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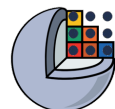
Preliminary user-base and future potential



- Brigham and Women's Hospital, Boston, USA
- Oslo University Hospital, Oslo, Norway
- University of Texas at Austin, Texas, USA
- Georgia Institute of Technology, Atlanta, USA
- Johns Hopkins University, Baltimore, USA

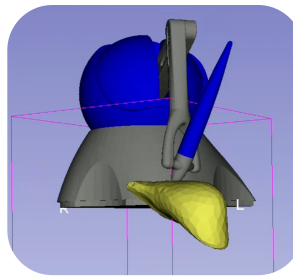
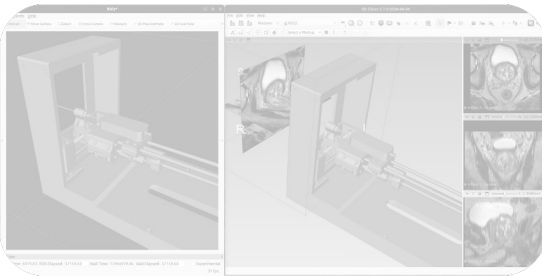
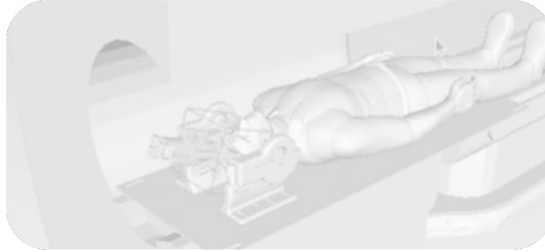


☆ 37 stars
👁 3 watching
🍴 6 forks



75

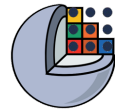
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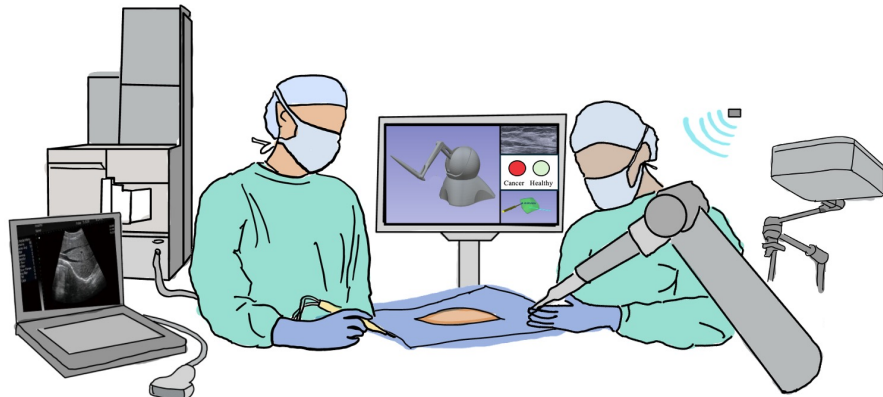
...and growing!



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Conclusions and summary

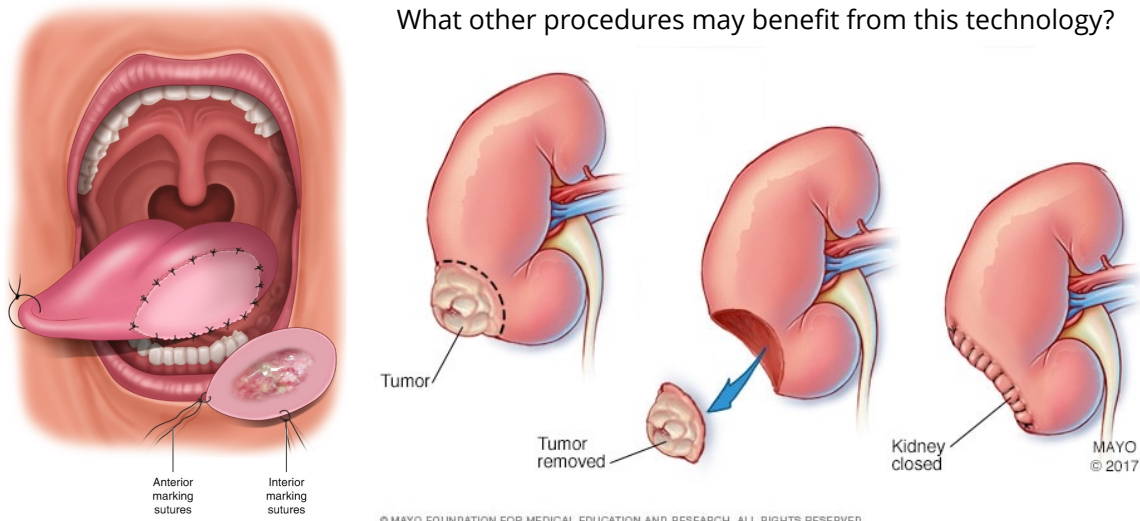
- Preliminary results for margin prevention are encouraging
- Future work will include translation efforts, simplifying systems for clinical translation, and discussions with surgeons on the most effective embodiments



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Future work

What other procedures may benefit from this technology?



Transoral Partial Glossectomy, Atlas of Head and Neck Surgery.

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Acknowledgments

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