



SCHOOL OF ENGINEERING
VANDERBILT UNIVERSITY



Light in Dark Places, Light on Dark Faces

Audrey K Bowden, PhD

Dorothy J Wingfield Phillips Chancellor Faculty Fellow

Associate Professor, Biomedical Engineering

Associate Professor, Electrical Engineering

Vanderbilt University

Stanford University - CS 114/214 - 23 May 2022

Outline

- About You
- About Me
- Light in Dark Places
- Light on Dark Faces
- Discussion / Q&A



What is one thing you think:

1. Everyone else has or has done but you HAVEN'T?
2. No one else has or has done but you HAVE?



Princeton University, BSE
Electrical Engineering
 Research Interest: Optics and Photonics



Duke University, PhD
Biomedical Engineering
 Research Interest: Biophotonics



Ngee Ann Polytechnic,
Singapore
 Lecturer



United States Senate
 Arthur H Guenther
 Congressional Fellow



Harvard University, Postdoc
Chemistry and Chemical Biology
 Research Interest: Microfluidics, Low-cost Diagnostics



Stanford University

Electrical Engineering / Bioengineering

Research Interest: Biophotonics

Teaching Experience: Modern Optics
(examples: Biophotonics)



Vanderbilt University

Biomedical Engineering / Electrical Engineering

Research Interest: Biophotonics and Resource-
Constrained Environments

Teaching Experience: Biomedical Instrumentation,
Optics for Low-Resource Settings, Mobile App
Development for mHealth



Bowden Lab @ Vanderbilt



advancing state-of-the-art

DEVELOP



aiding scientific practice

DISCOVER

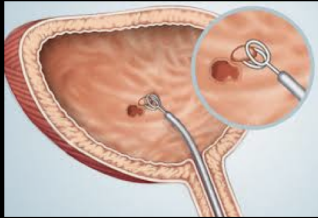


addressing clinical need

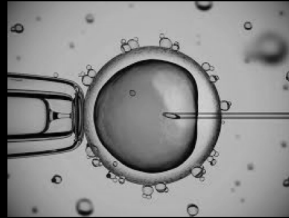
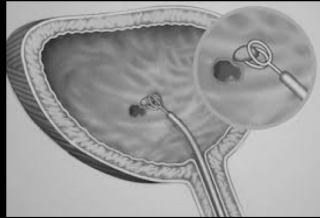
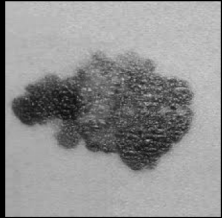
DEPLOY

Leverage the power of light to
Assess health
Detect disease
Monitor treatment

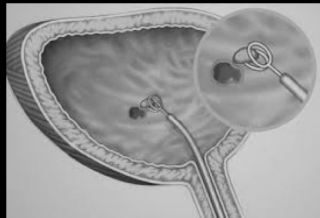
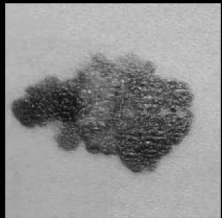
Current projects span several clinical areas



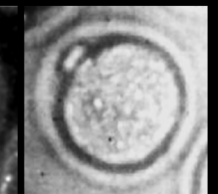
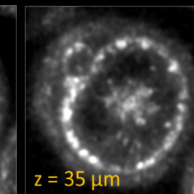
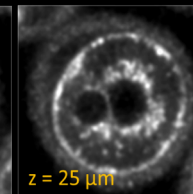
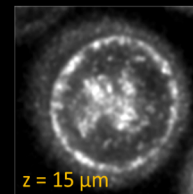
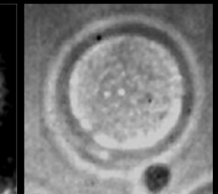
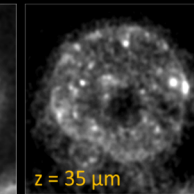
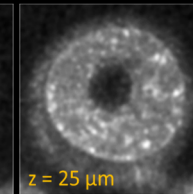
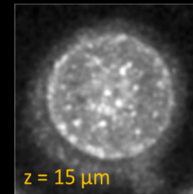
Current projects span several clinical areas



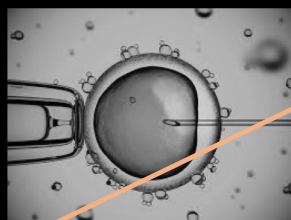
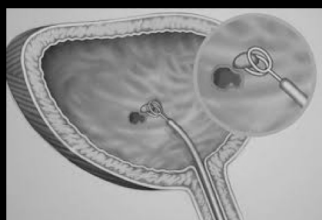
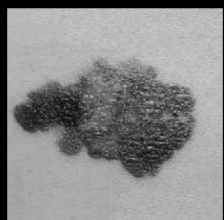
Current projects span several clinical areas



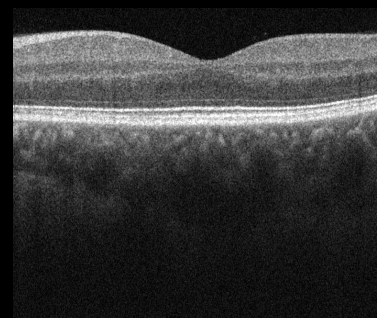
Biomarkers for IVF Embryo Viability



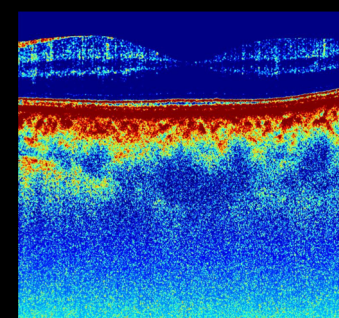
Current projects span several clinical areas



Biomarkers for glaucoma diagnosis

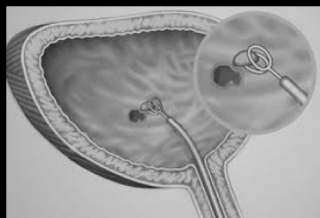
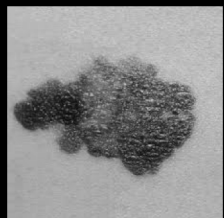


OCT intensity

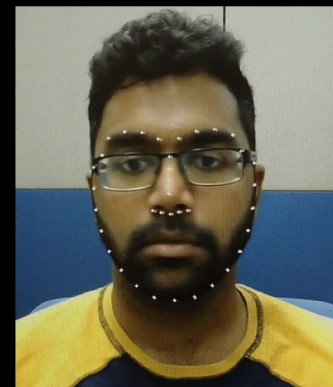


Attenuation coefficient

Current projects span several clinical areas

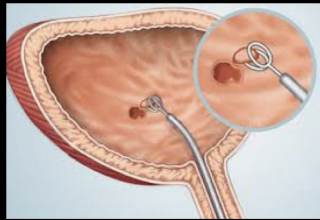


At-home neuromonitoring with fNIRS



Real-time facial
landmark detection

Light in Dark Places



BLADDER HEALTH & THE IMPACT IN AMERICA

BLADDER DISEASES AND CONDITIONS COST

 **\$70**
BILLION
ANNUALLY

MORE THAN
33 MILLION



ADULTS IN THE U.S.
HAVE OVERACTIVE BLADDER

MORE THAN
575,000



AMERICANS LIVE WITH
BLADDER CANCER

URINARY TRACT INFECTIONS
CAUSE MORE THAN
8 MILLION
PROVIDER VISITS ANNUALLY.
OF THOSE, ABOUT



1.3M
ARE
CHILDREN

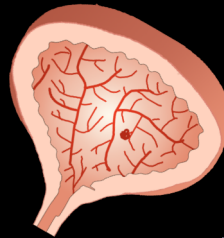


5.3M
ARE
WOMEN



1.2M
ARE
MEN

Copyright UCI Urology | Source: American Urological Association



When we treat disease,
we treat people



Timothy



Timothy, 67 years old

Military veteran

Smoker

Recurrent bladder cancer

Bladder cancer

4th most common cancer in men

74,000 new U.S. cases annually¹

Most costly cancer / patient lifetime

50-90% recurrence rate²

Current clinical practice
has limited ability to detect
and treat cancer

with few, cost-effective procedures

¹Siegel, Rebecca, et al. CA: a cancer journal for clinicians 64.1 (2014): 9-29.

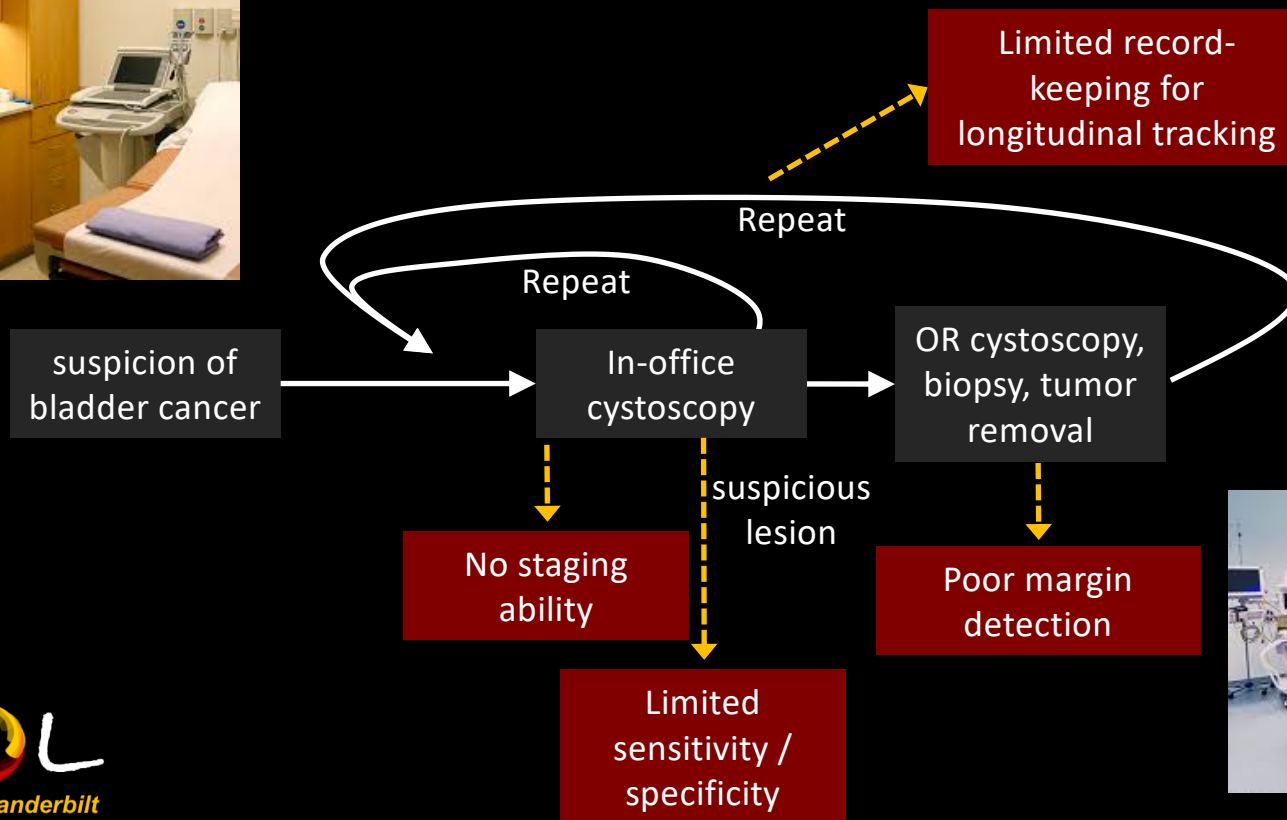
²National Comprehensive Cancer Network

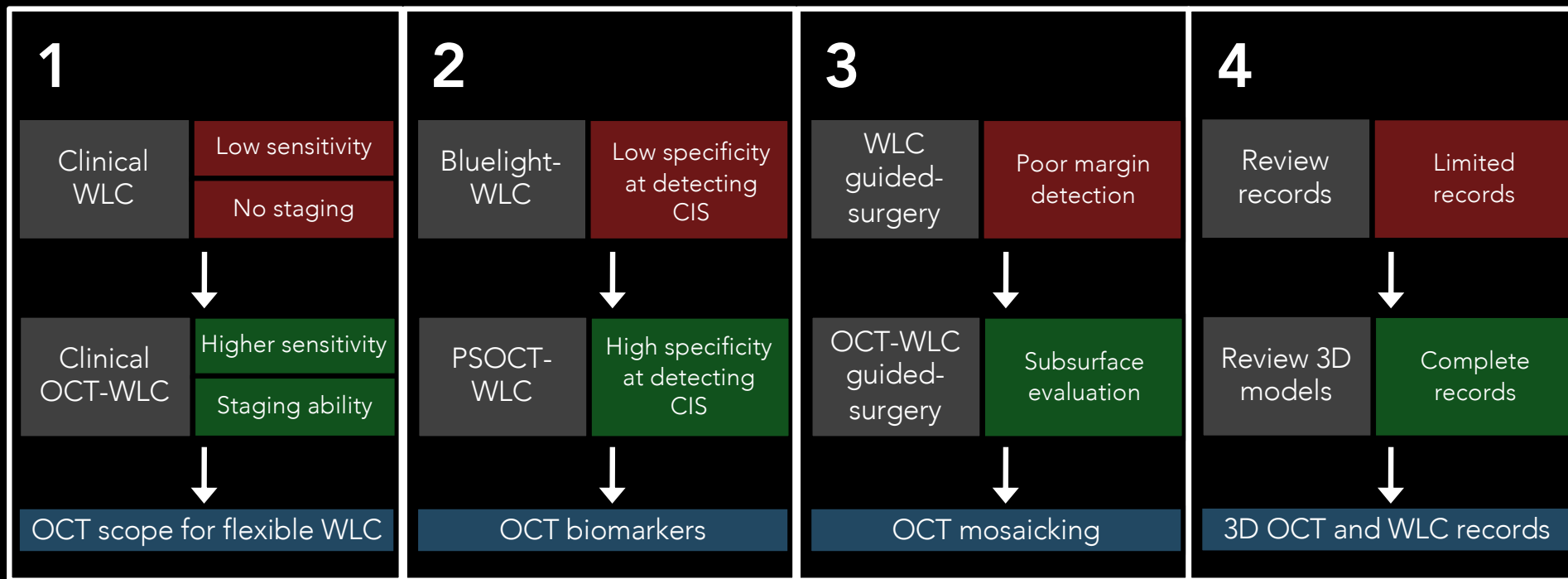
Image adapted from: Fairview Health Services <http://www.fairview.org/healthlibrary/>

Bladder cancer detection and treatment: State of the art and limitations

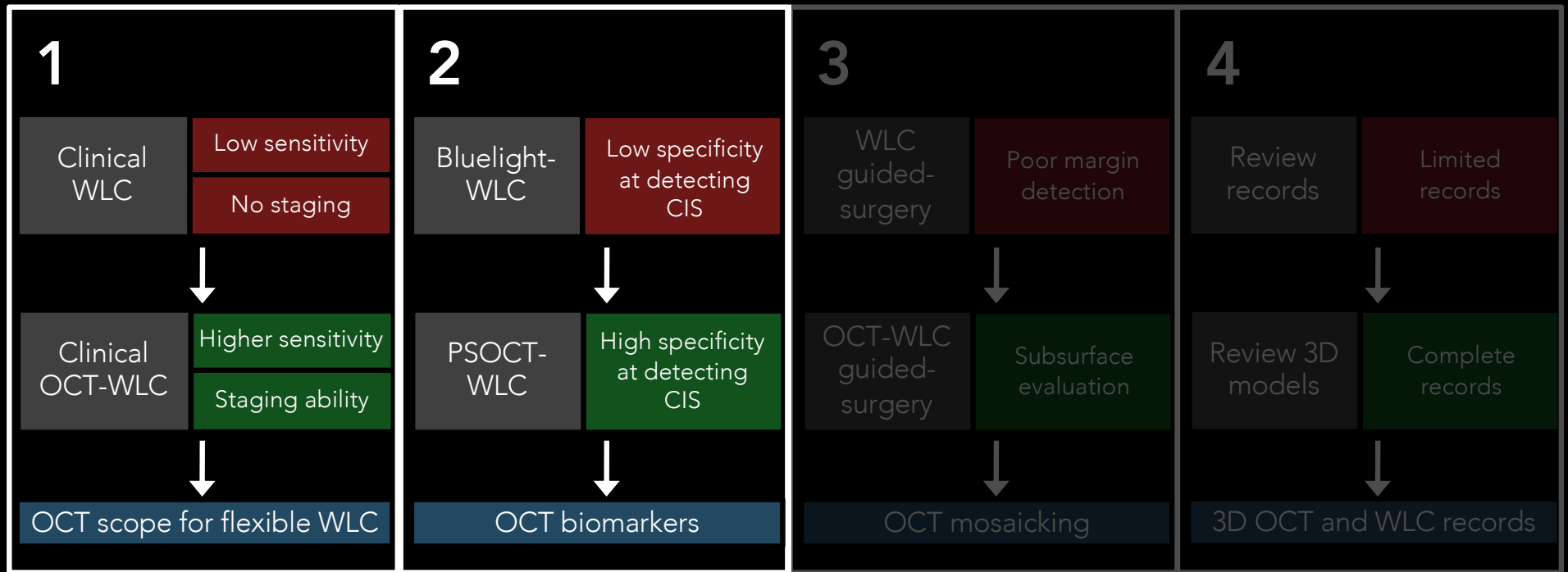


BBOL
Bowden Lab @ Vanderbilt



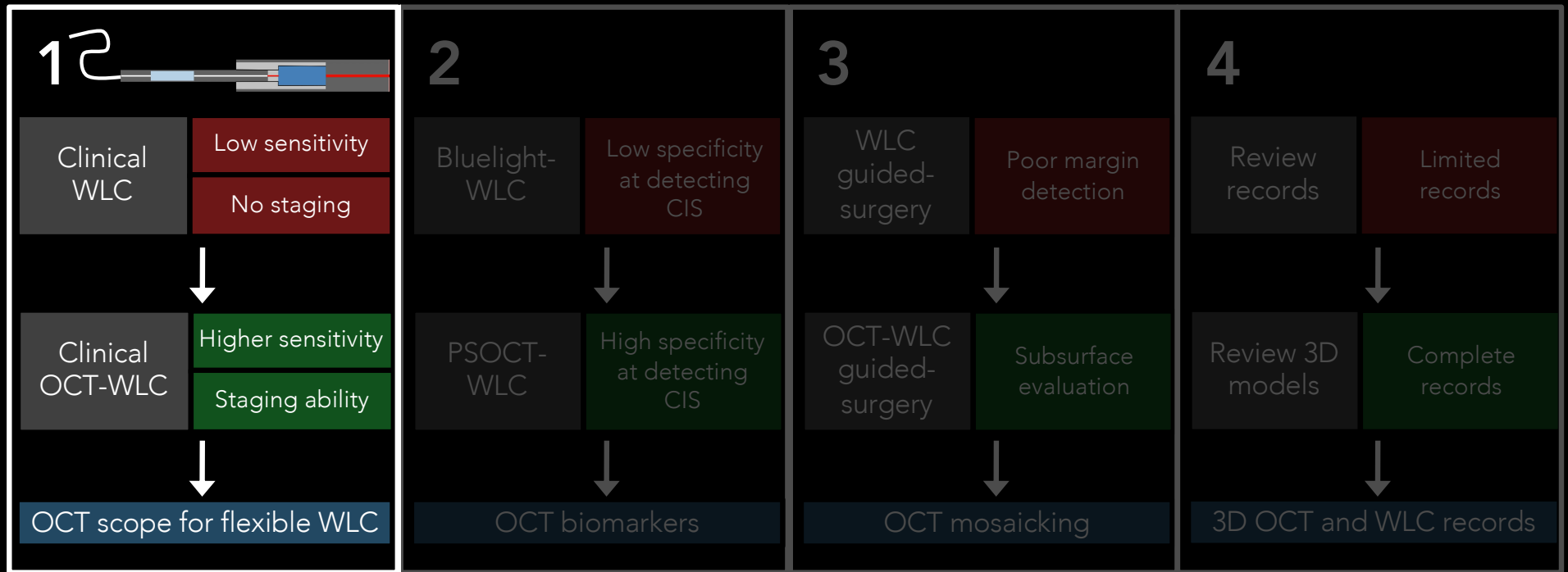


New optical tools



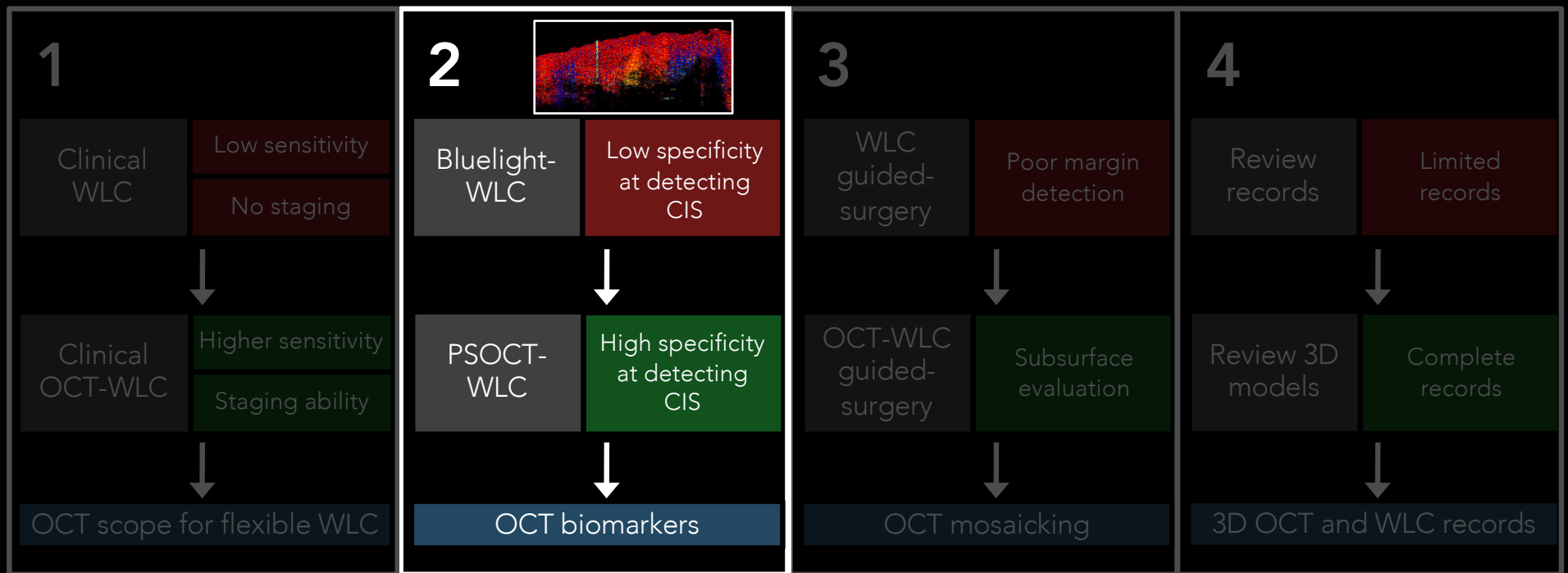
New optical tools

Optical coherence tomography (OCT)
High-resolution, non-invasive imaging

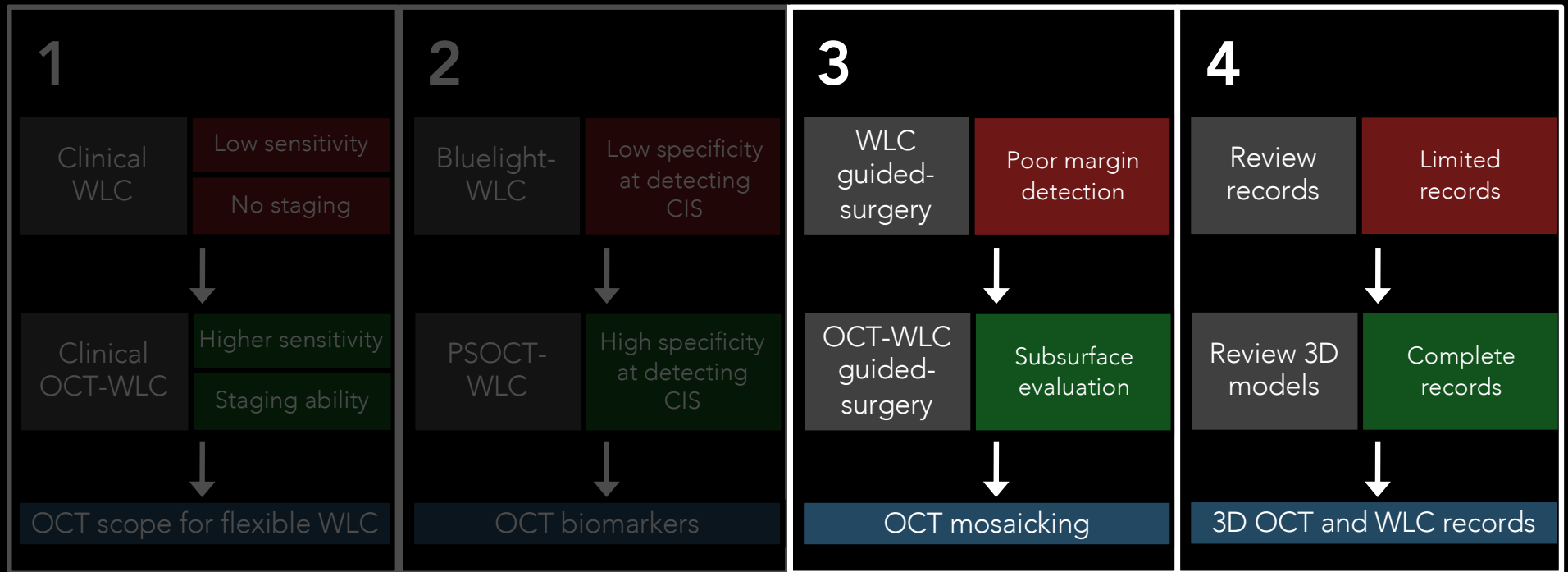


New optical tools

Polarization sensitive OCT (PS-OCT);
Label-free, enhanced contrast

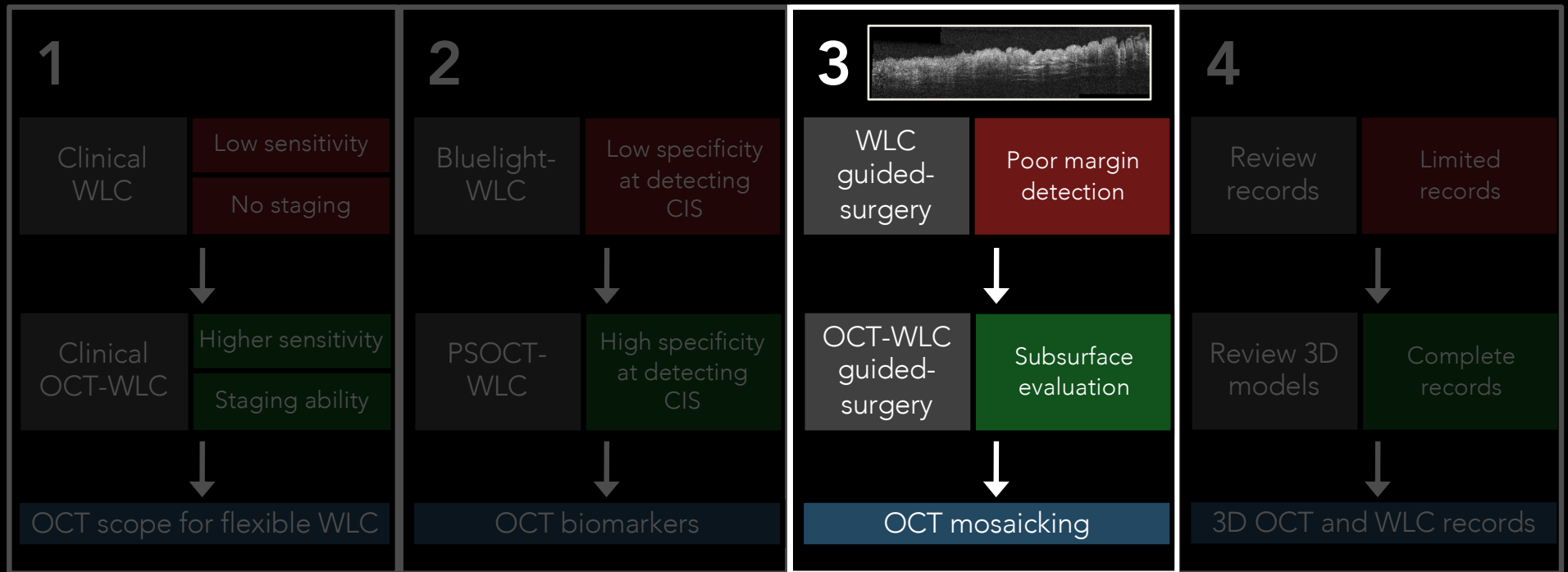


New image reconstruction methods

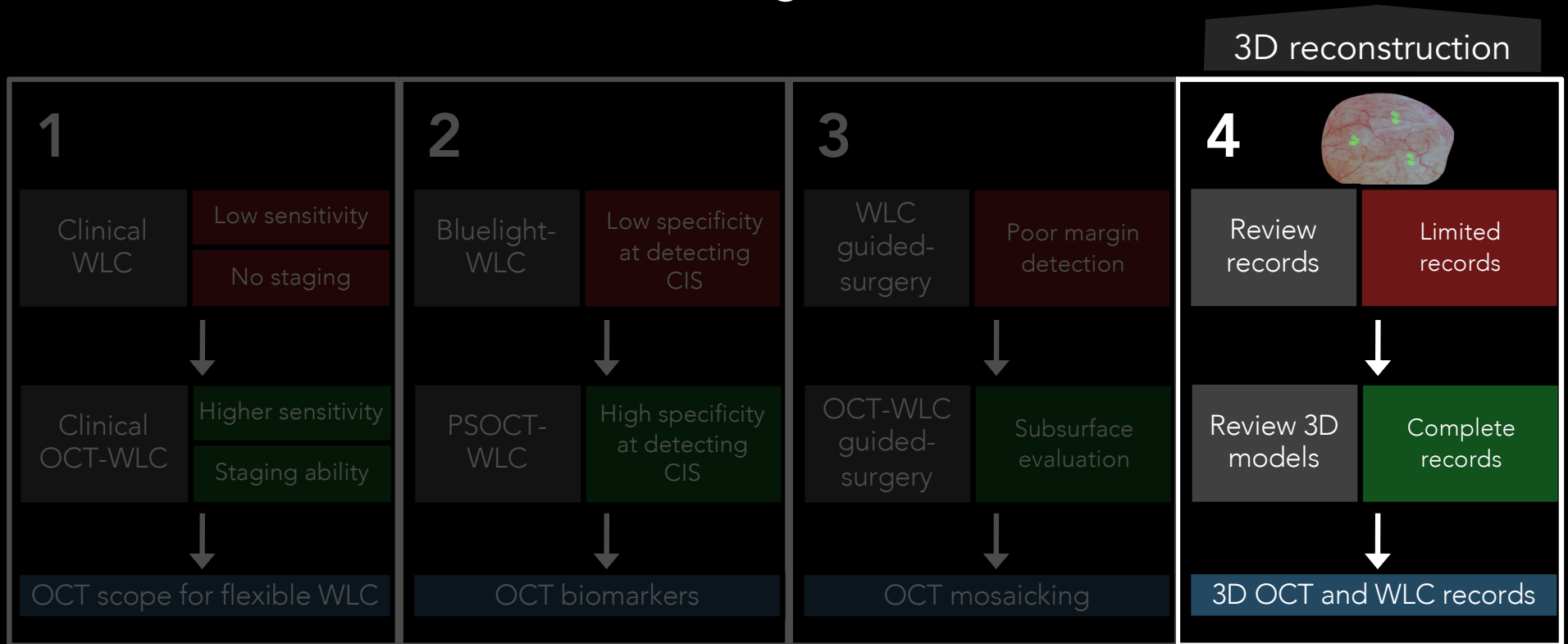


New image reconstruction methods

Mosaicking

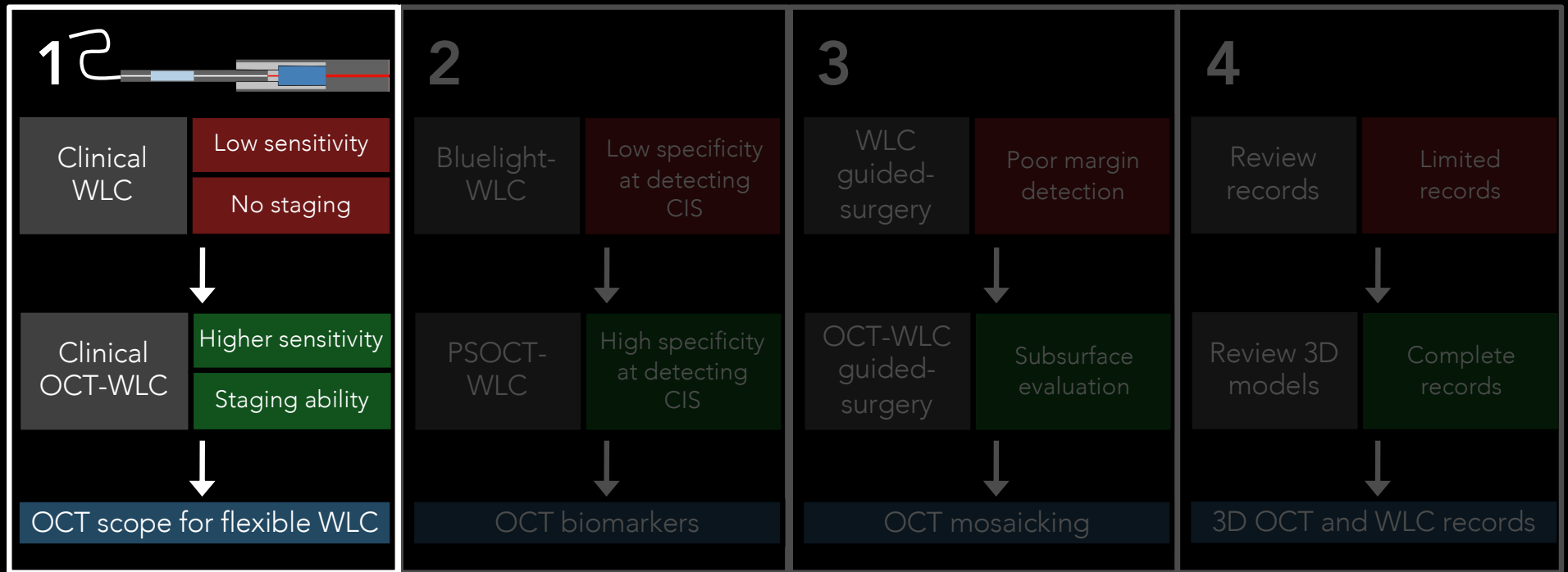


New image reconstruction methods



New optical tools

Optical coherence tomography (OCT)
High-resolution, non-invasive technique



Limitations of White Light Cystoscopy (WLC)

Low sensitivity

No staging

Optical coherence tomography (OCT)
is a promising complement to WLC



Urothelium (U)
Lamina propria (LP)
Muscle (M)
Fat (F)

CIS

T1

T2

BBOL
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¹Siegel, Rebecca, et al. (2014)

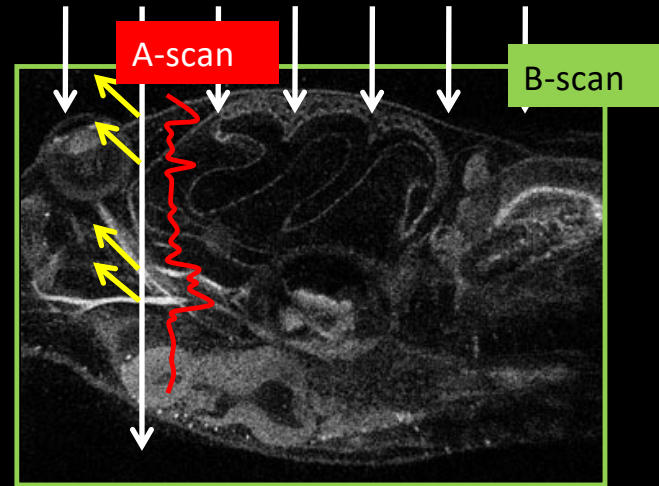
²National Comprehensive Cancer Network

Image credit: Jeong Byong C. *Bladder Cancer*, 135-144 (2018)

Image credit: Knowles, Margaret A., et. al. *Nat. Rev. Cancer*, 15, 25-41 (2015)

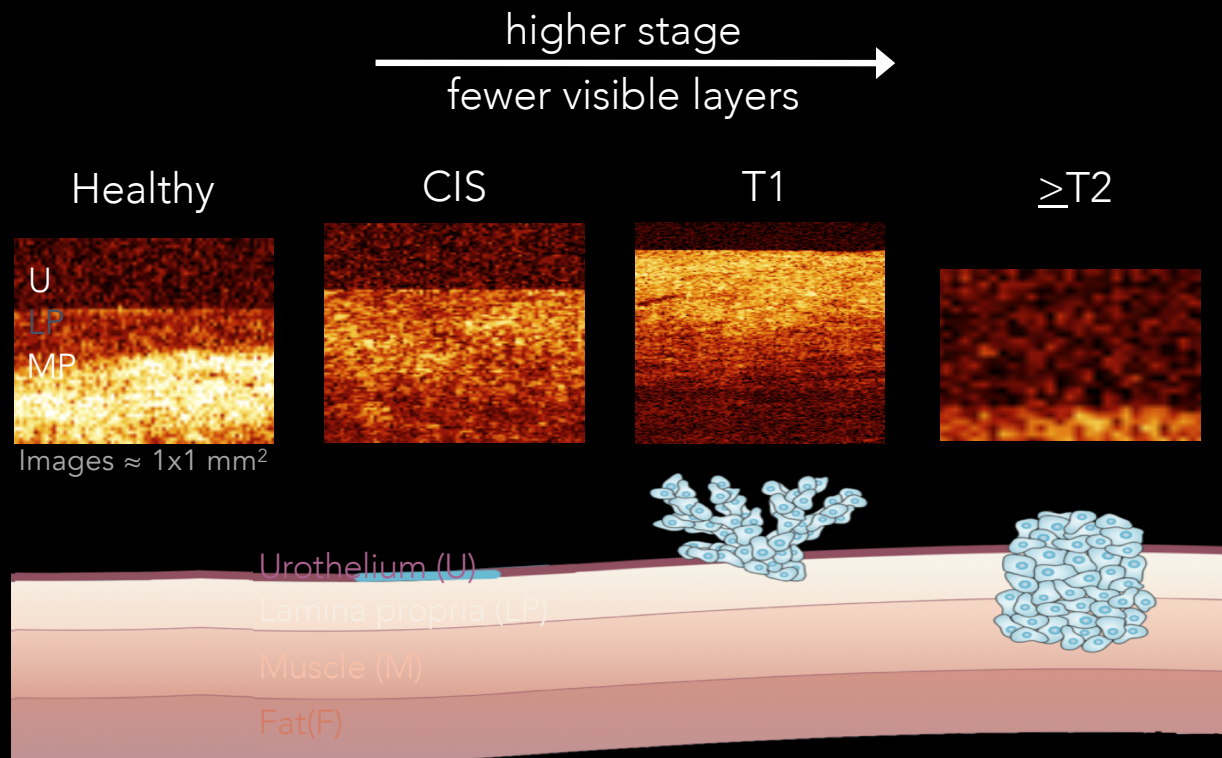
OCT: How it works

- Source of signal
 - Optical back scattering
- How it works
 - Time of flight
 - Interferometry
- Typical light sources:
 - Near-infrared (830nm, 1060nm, and 1310nm)
 - Broad bandwidth ($\sim 100\text{nm}$) \rightarrow high resolution ($< 10\mu\text{m}$)

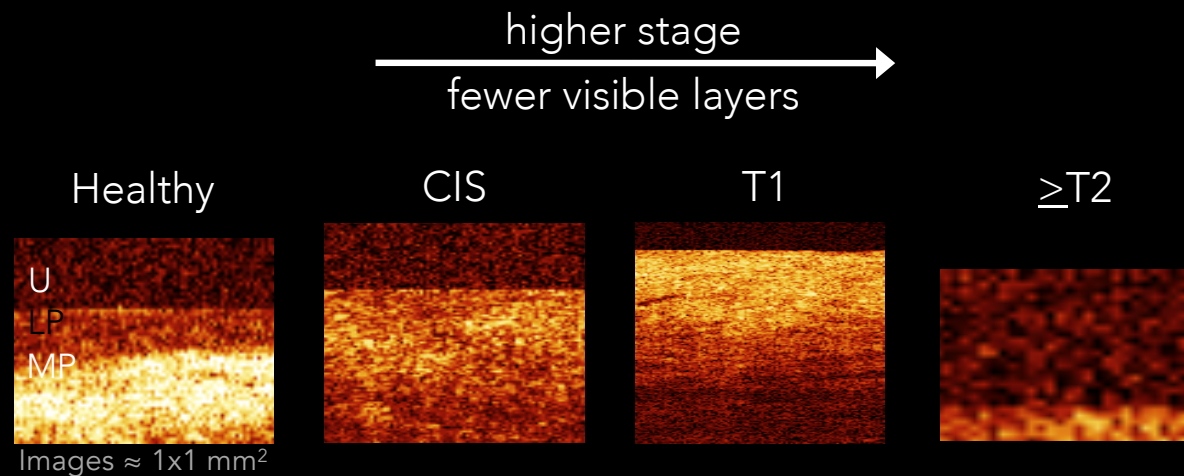


Cross-sectional image of a frog tadpole
(<http://www.thorlabs.com/OCT/>)

OCT images can distinguish tumor stages



OCT images can distinguish tumor stages



Several studies in humans report 90-100% sensitivity¹⁻³

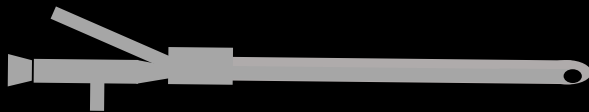
1. Manyak, M.J., et al. J. Endourology 19.5 (2005): 570-574.
2. Lingley-Papadopoulos, C.A., et al. J. of Biomed. Optics 13.2 (2008): 024003-024003.
3. Lerner, S.P., et al. Urology 72.1 (2008): 133-137.

Existing OCT endoscopes are **too large** and **too slow** to integrate with clinical cystoscopies

OCT endoscope miniaturization permits use in clinical settings



rigid cystoscope

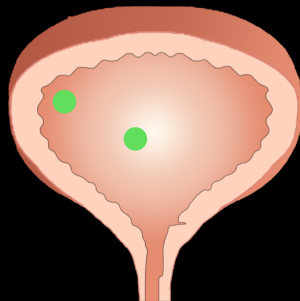


flexible cystoscope

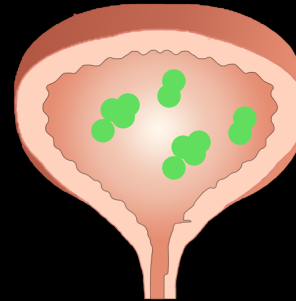


OCT acquisition speed-up permits viewing larger tissue volume

slow acquisition



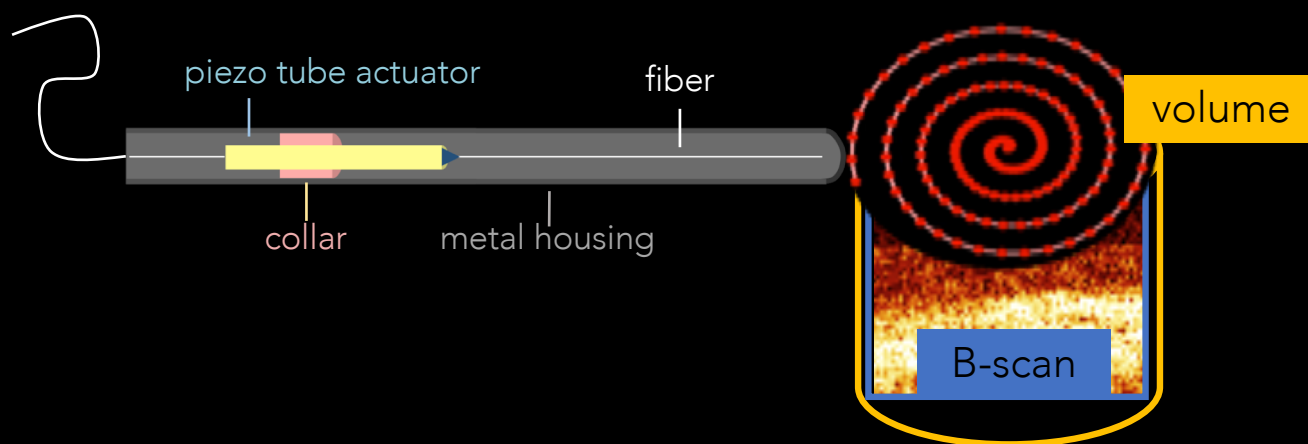
fast acquisition



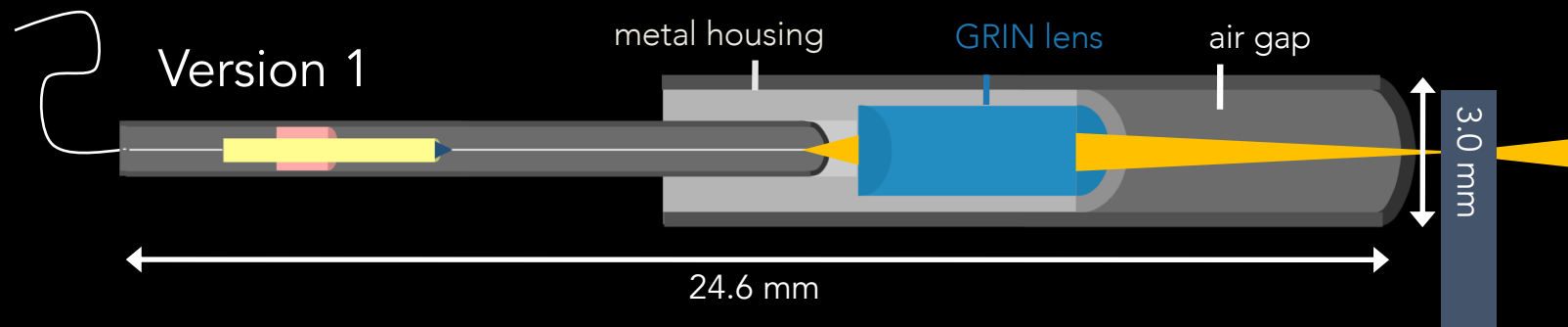


Eric Seibel, UW

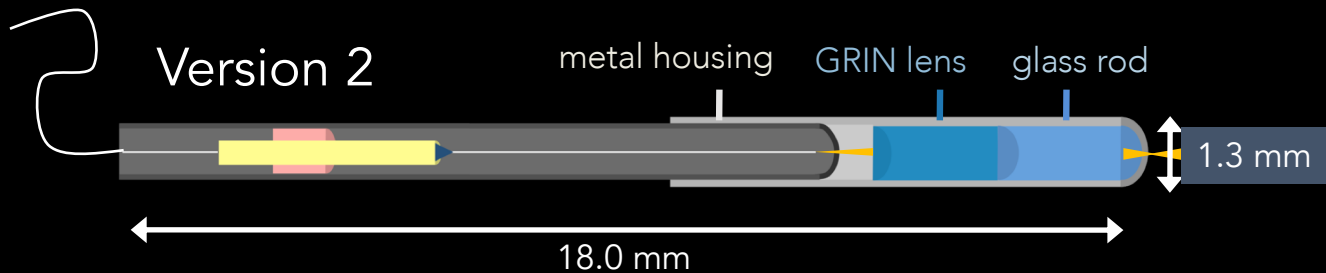
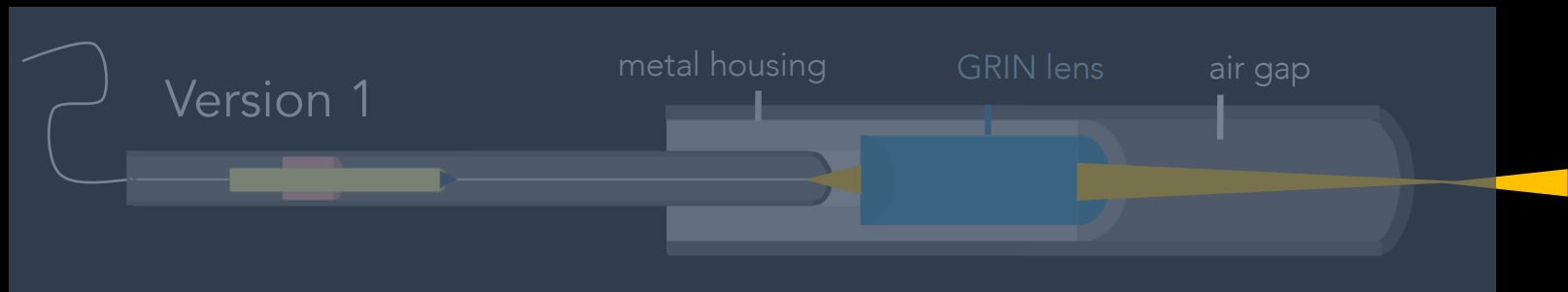
Scanning fiber endoscopy (SFE) Lens assembly for OCT imaging



Scanning fiber endoscopy (SFE) Lens assembly for OCT imaging



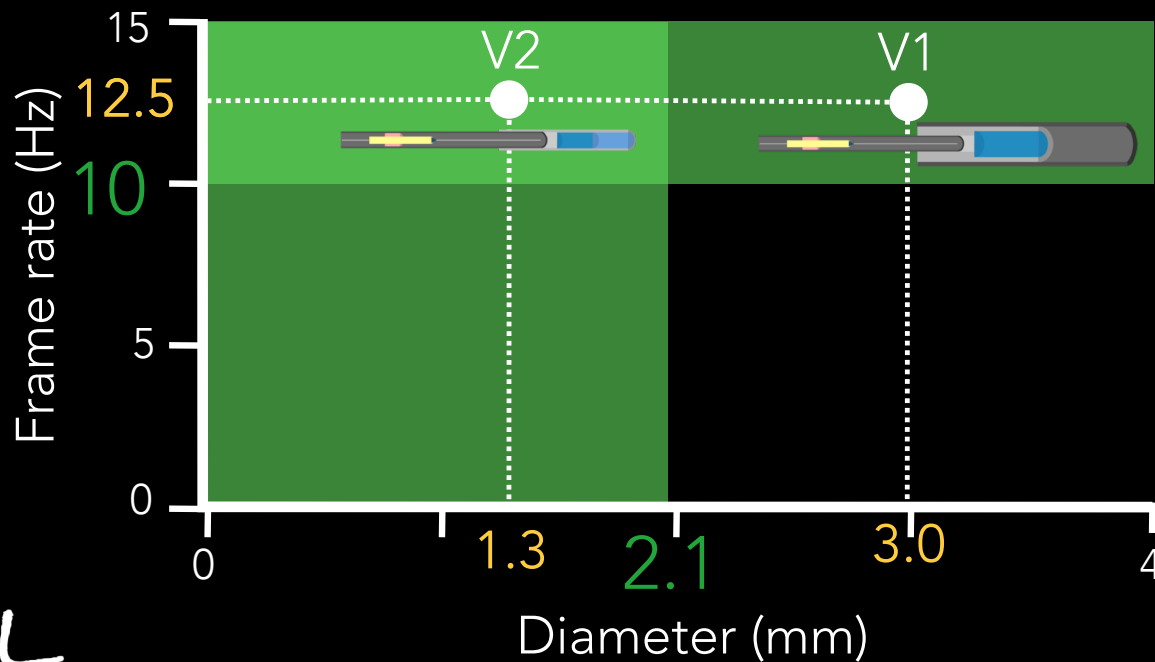
Scanning fiber endoscopy (SFE) Lens assembly for OCT imaging



Smallest, fastest, forward-viewing OCT probe
for 3D volumetric imaging

OCT scope integration with flexible WLC

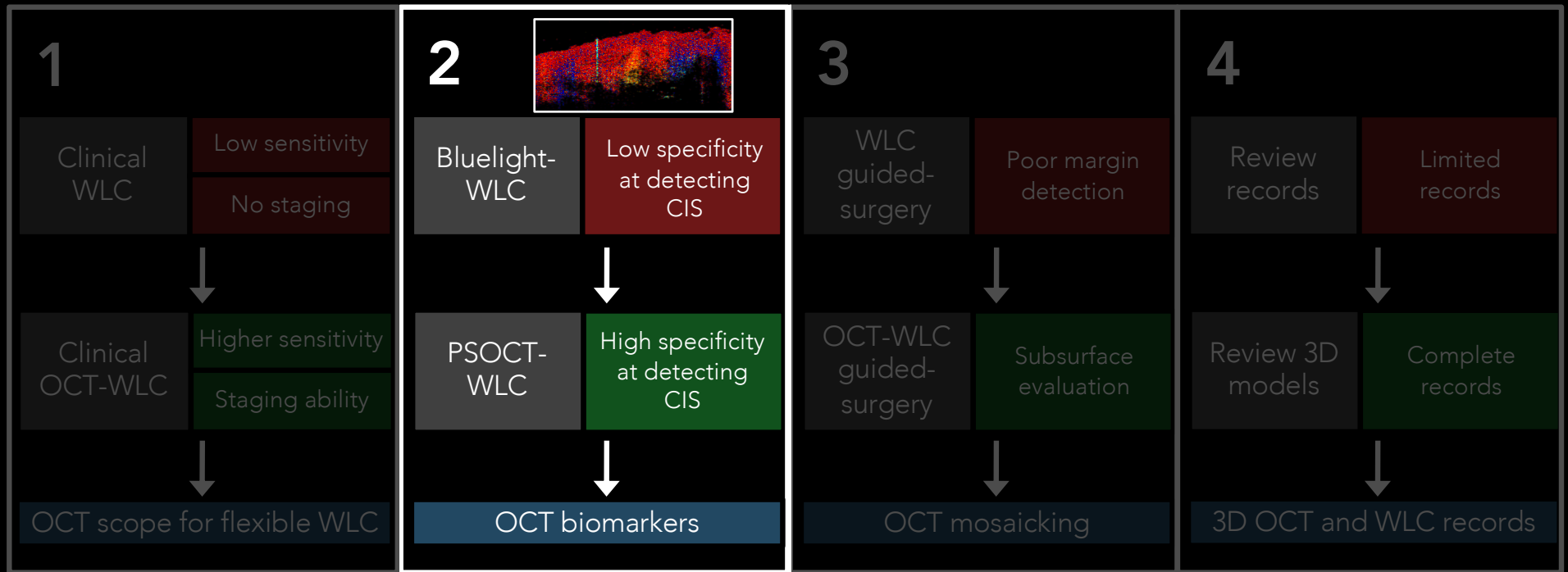
Achieving design requirements



Current plans for V3 will push our new design off the chart

New optical tools

Polarization sensitive OCT (PS-OCT)
Label-free, enhanced contrast



CIS is responsible for 75% of BC recurrence

CIS



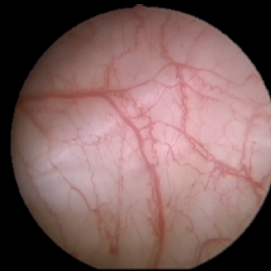
Carcinoma in situ (CIS) is a flat tumor with high risk of recurrence and progression

Blue light cystoscopy increases sensitivity at detecting CIS

CIS



Normal

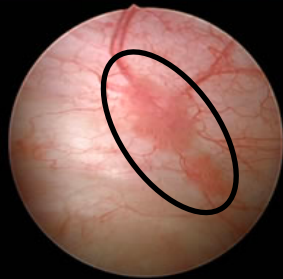


Cancerous regions
light up as a bright
pink patch under
blue light

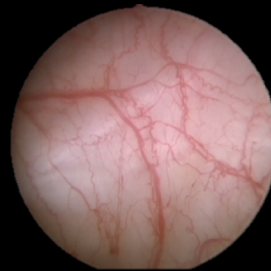


...but it lacks **specificity**

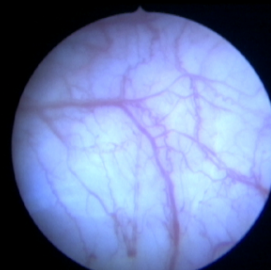
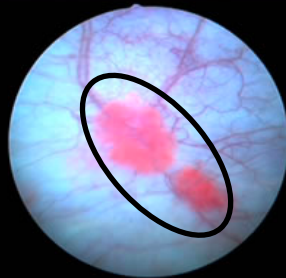
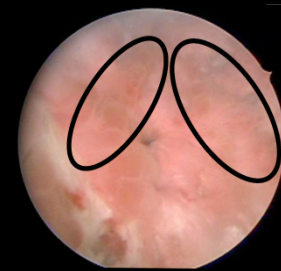
CIS



Normal



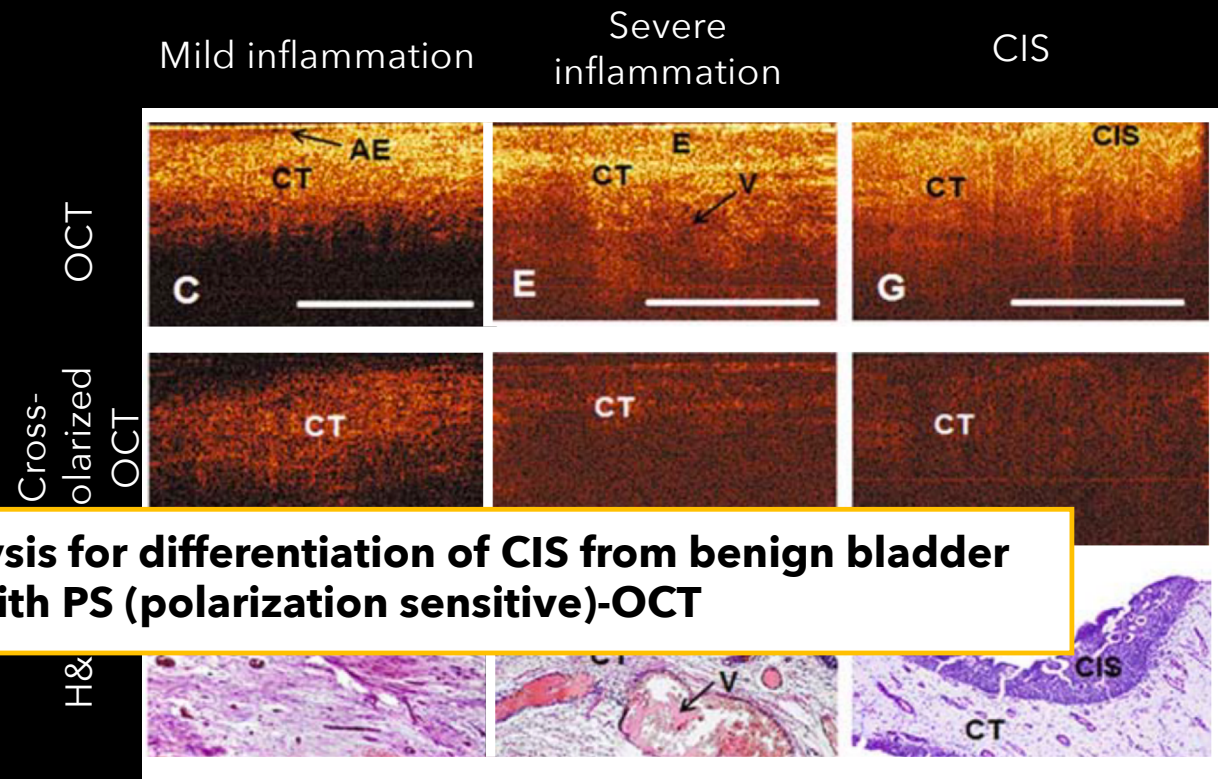
Inflammation



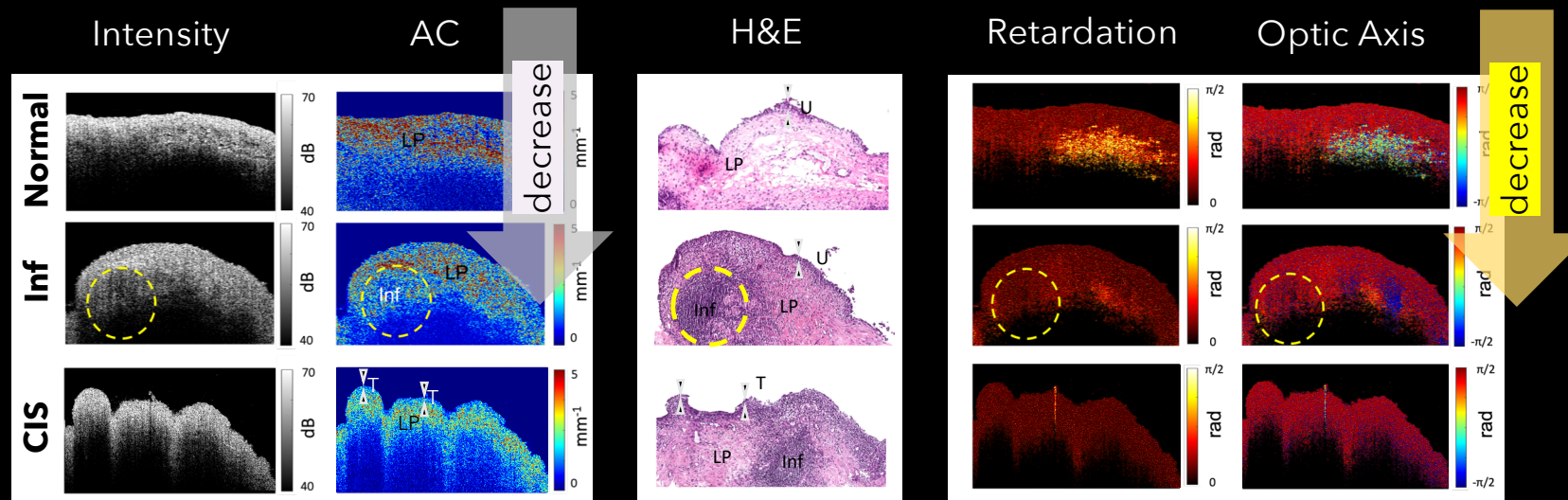
Polarized light improves differentiation of tumor against inflammation

- Polarized light: additional contrast
- Lamina propria layer of the bladder is rich in **collagen**¹
- Cross-polarization OCT has been shown effective for **inflammation vs. CIS**² – qualitative, only depolarizing effect

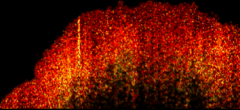
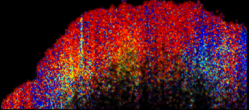
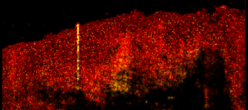
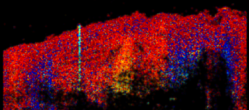
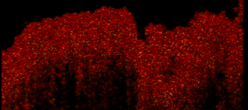
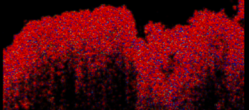
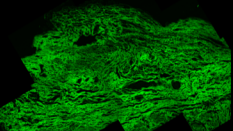
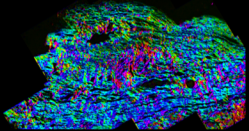
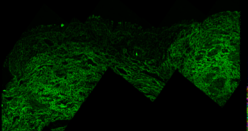
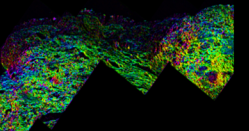
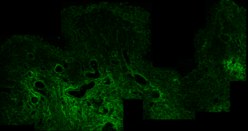
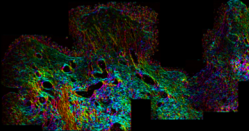
Goal: Quantitative analysis for differentiation of CIS from benign bladder tissues with PS (polarization sensitive)-OCT



Matched PS-OCT – histology image pairs

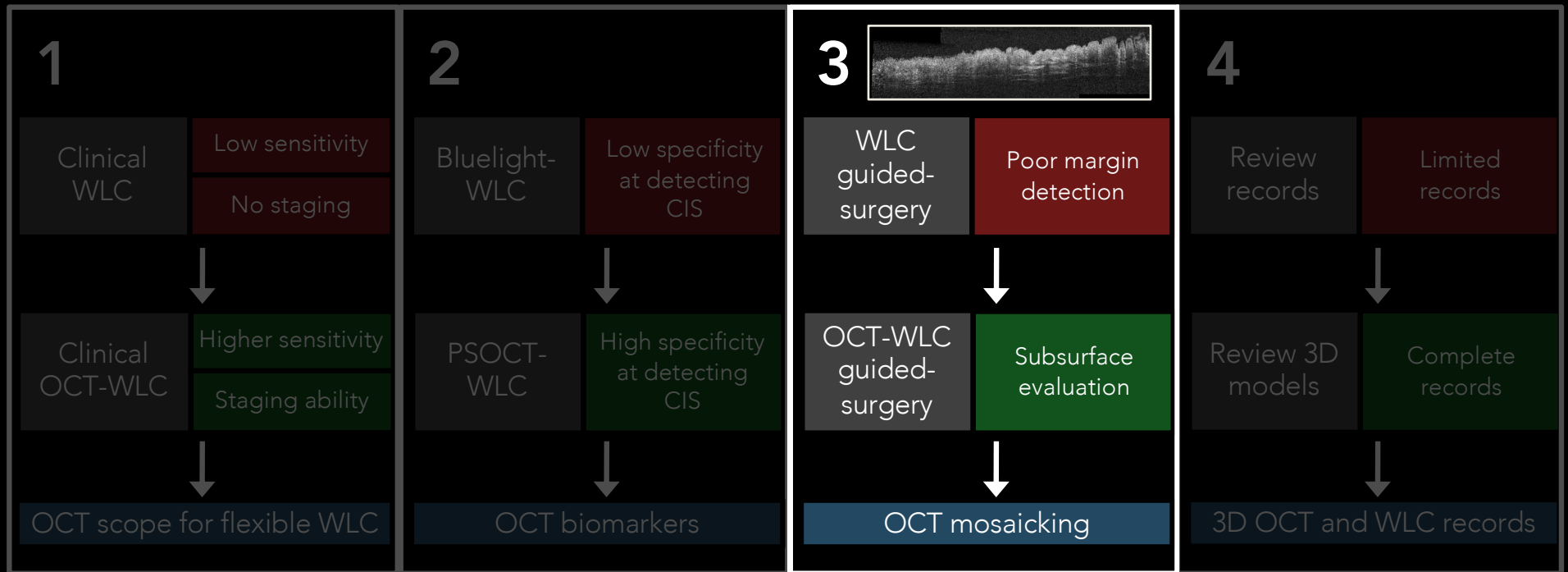


Alteration in collagen causes decrease in measured birefringence

	Normal		Inflammation		CIS	
	<ul style="list-style-type: none"> • Birefringent LP • Strong collagen signal • Aligned collagen fibers 		<ul style="list-style-type: none"> • Reduced birefringence • Decreased collagen signal at inflamed region • Aligned collagen fibers 		<ul style="list-style-type: none"> • Minimal birefringence • Diminished collagen signal in LP; thinner fiber • Loss of fiber alignment 	
PS-OCT	Retardation 	Optic axis 	Retardation 	Optic axis 	Retardation 	Optic axis 
SHG	SHG 	Orientation 	SHG 	Orientation 	SHG 	Orientation 

New image reconstruction methods

Mosaicking

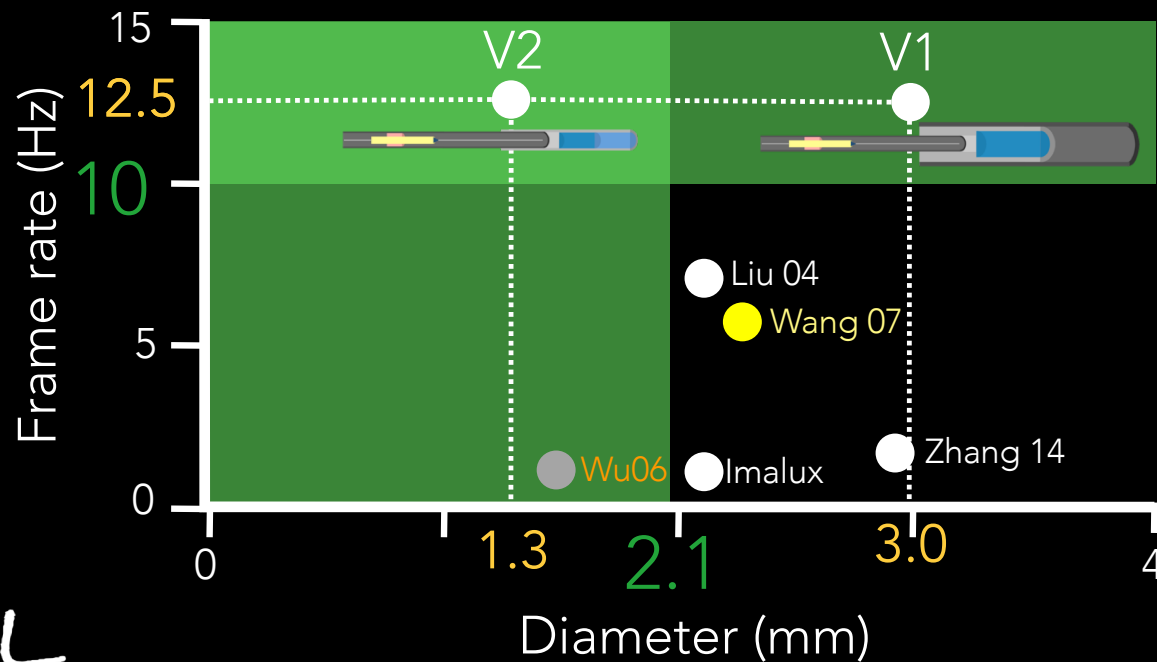


OCT scope integration with flexible WLC

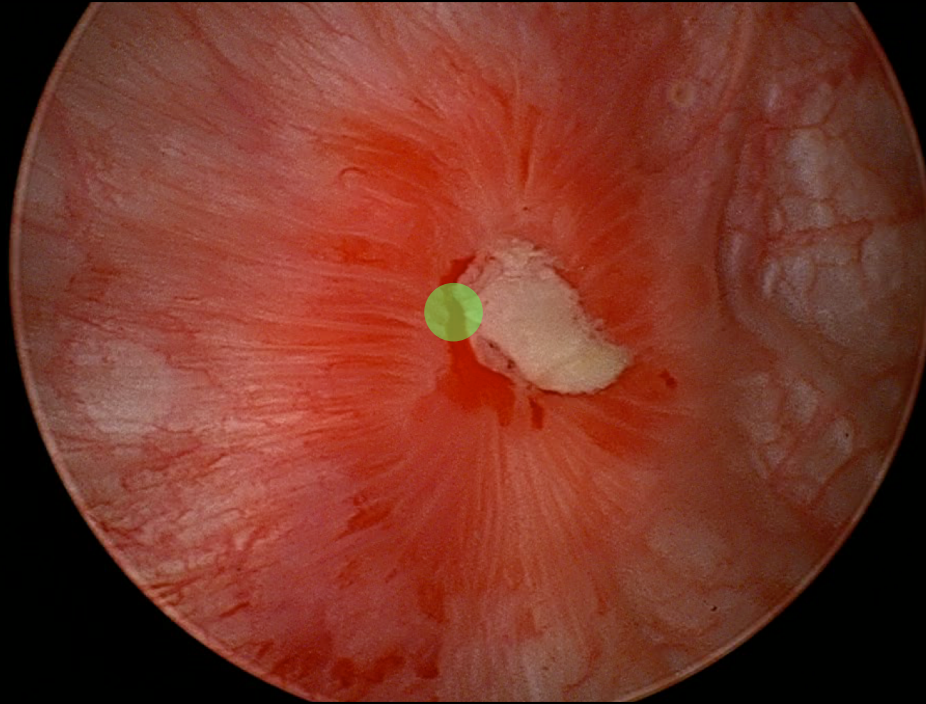
Tradeoffs

Smaller parts, **but** smaller field of view

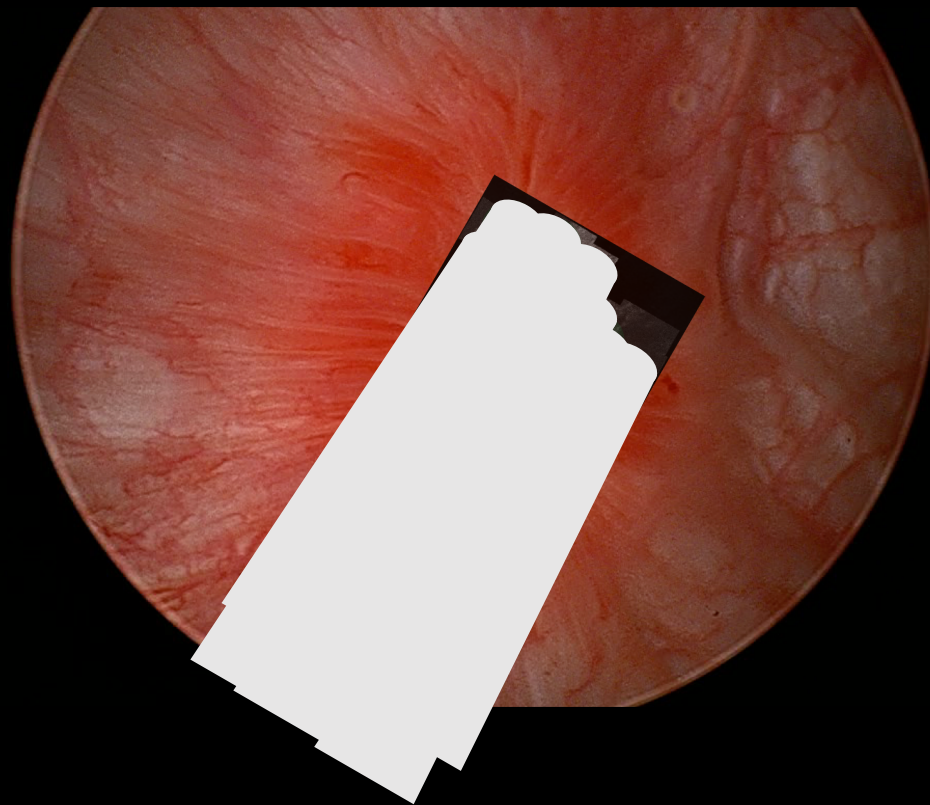
Higher resonance frequency, **but** sparse volume sampling



Challenge with OCT for subsurface evaluation:
OCT's small field of view



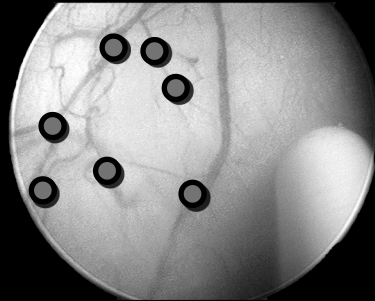
Mosaicking:
overcoming OCT's small field of view



Standard mosaicking approaches cannot be directly applied to bladder OCT data

Limited features
(distinct regions)

WL image

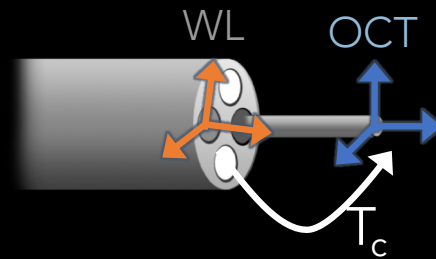
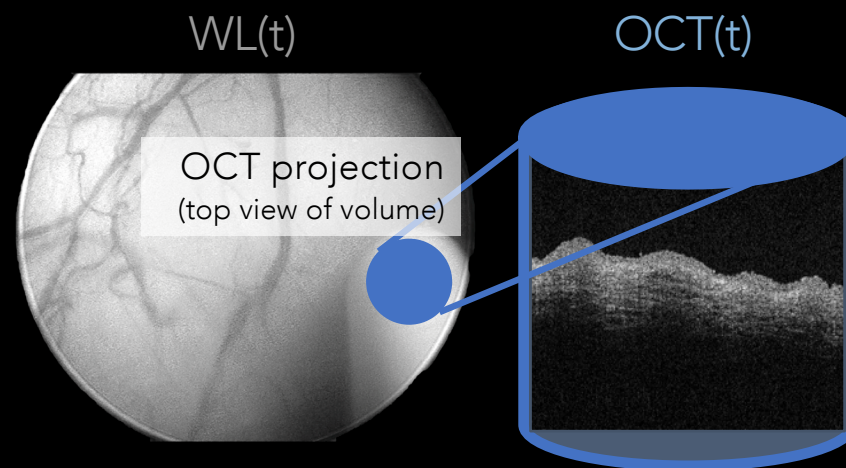


En face
OCT image



OCT-WLC system

Acquired data



OCT(t)



OCT(t+1)



Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

OCT(t)



OCT(t+1)

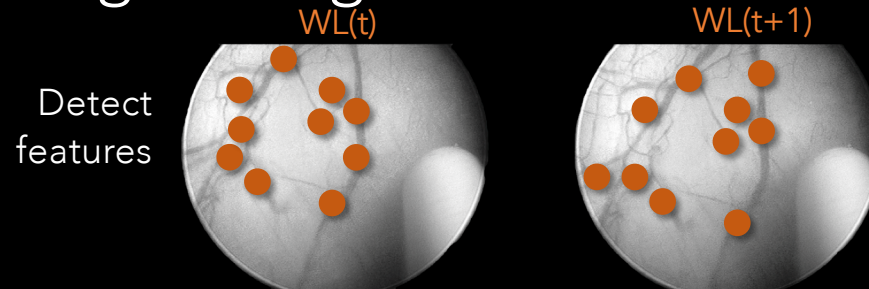


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

Align white light images

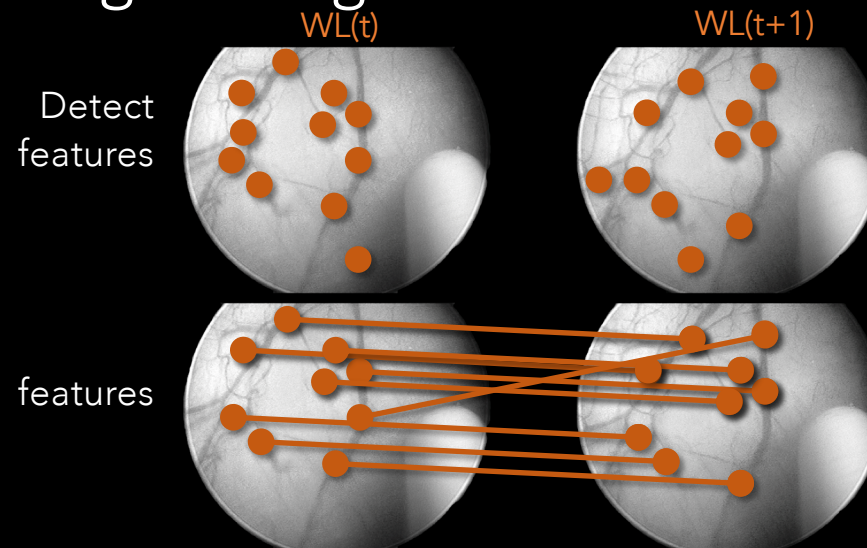


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

Align white light images

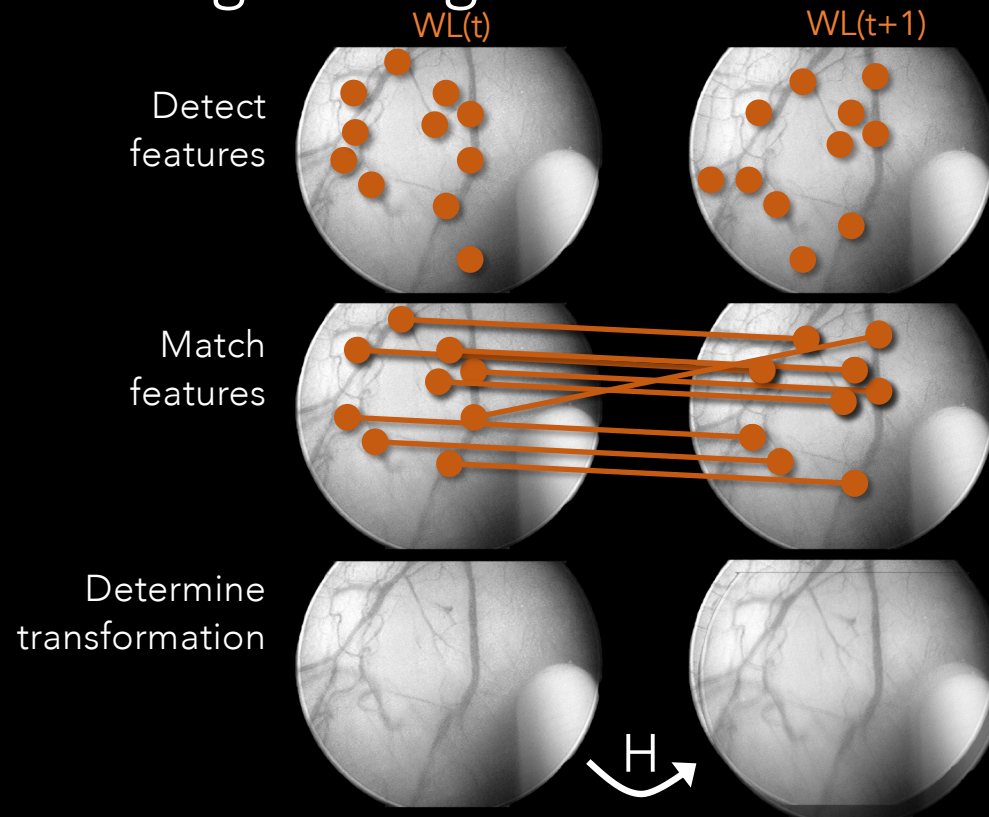


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

Align white light images

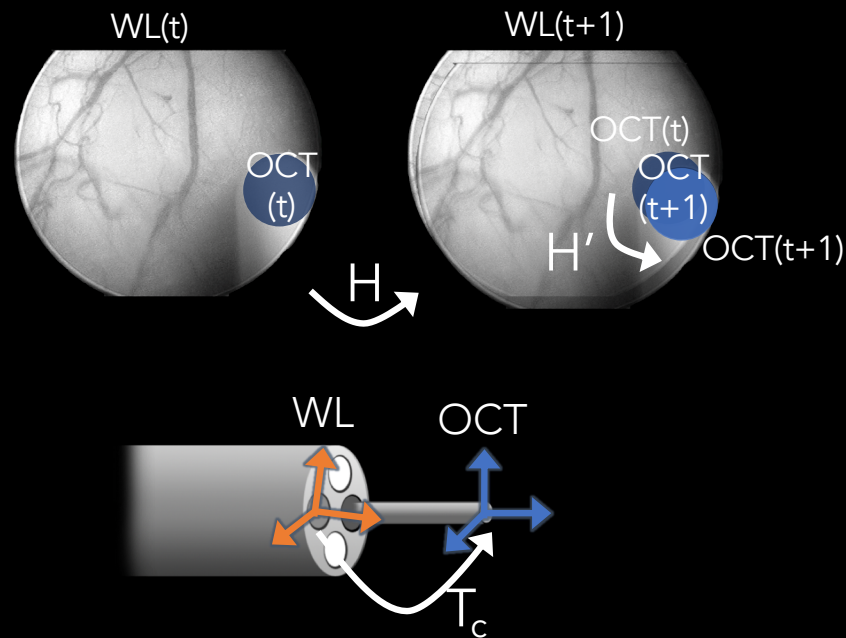


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

Initialize alignment of OCT volumes using white light transformation and relationship between coordinate systems



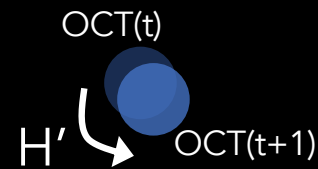
Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

Initial alignment only aligns OCT
projections (2D)

Need 3D information to align
volumes in 3D



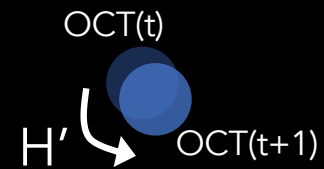
Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

Initial alignment only aligns OCT
projections (2D)

Need 3D information to align
volumes in 3D

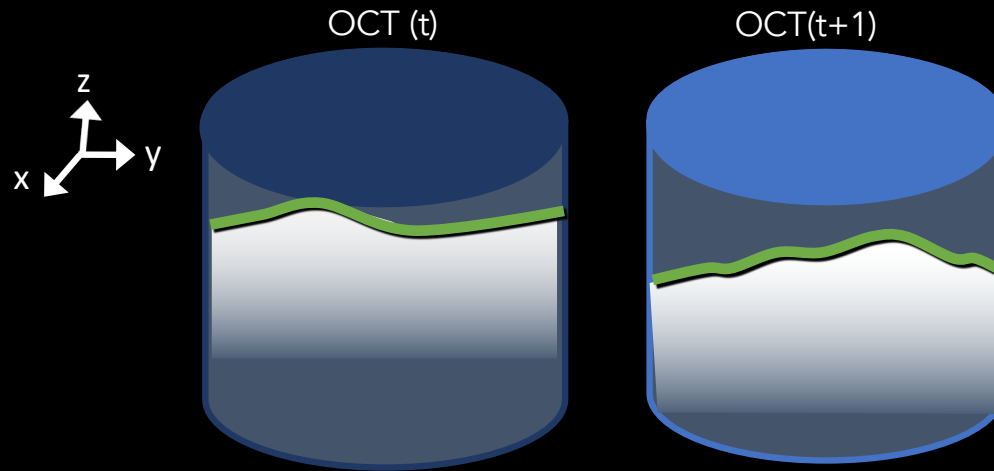


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

3D information comes from tissue surface

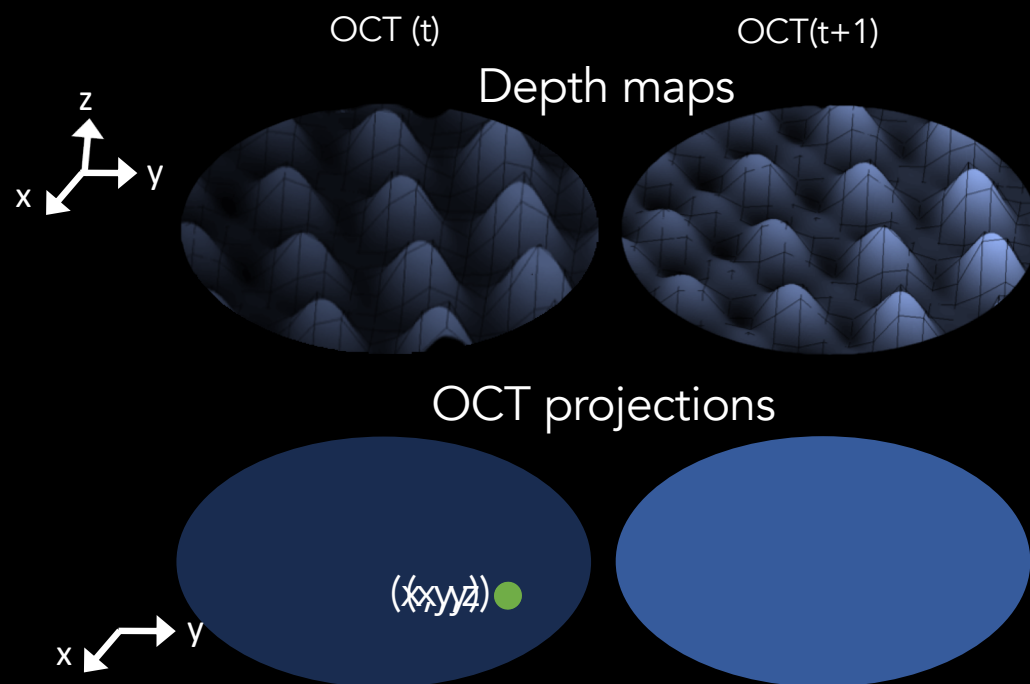


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

3D transformation is initialized using surface depths

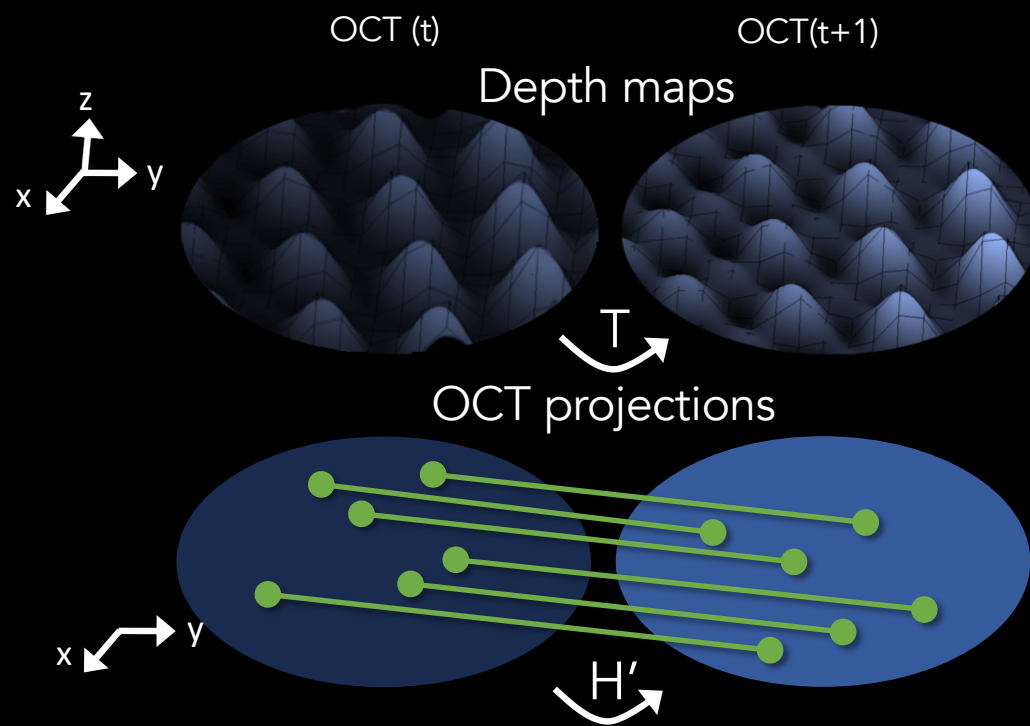


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

3D transformation is initialized using surface depths

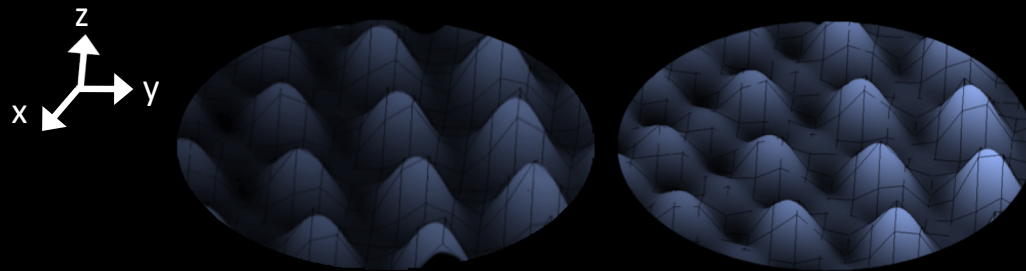


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

3D transformation is initialized using surface depths

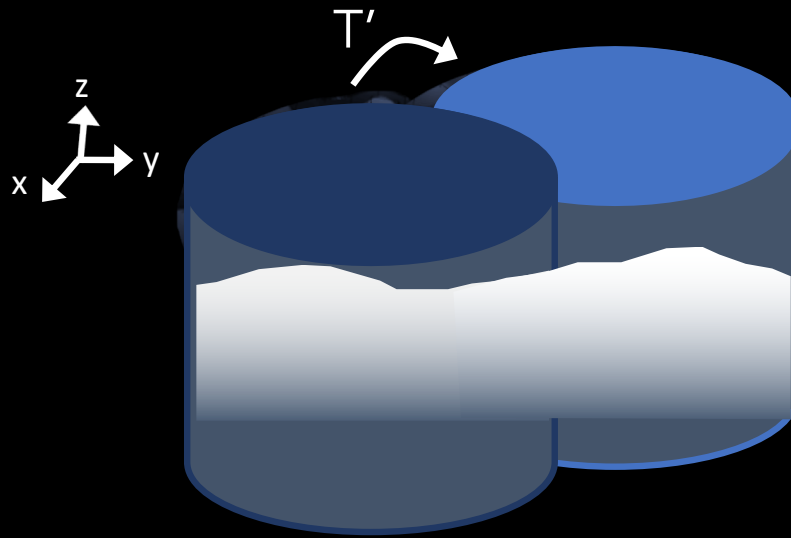


Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

Surfaces are aligned
to achieve final volume alignment



Bowden Lab @ Vanderbilt

Utilize WL data to initialize alignment

Extract surface to refine alignment

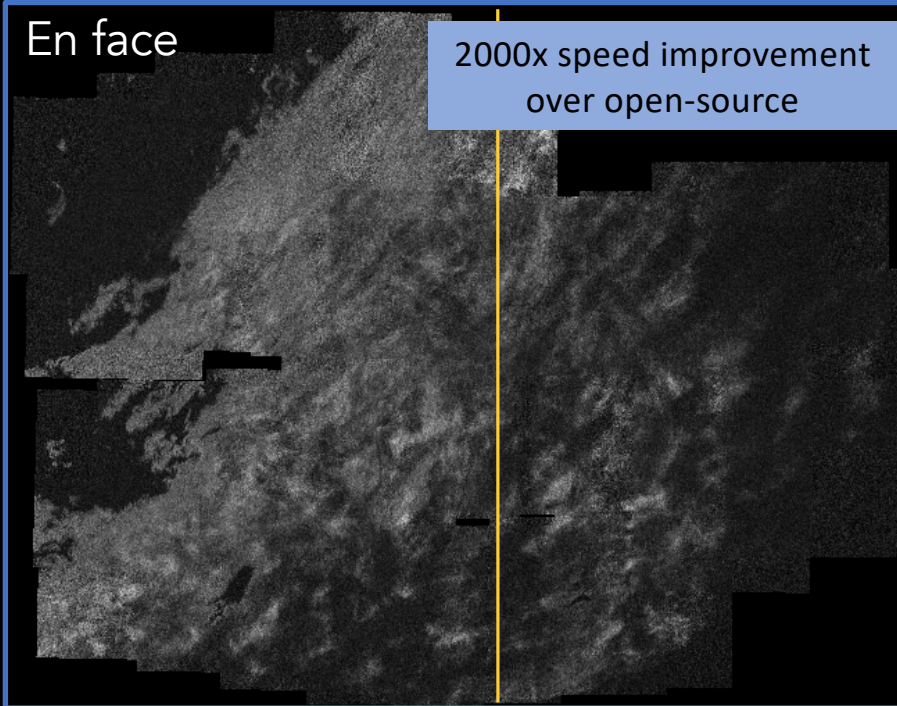
Bladder mosaic

Mosaicked volumes
33

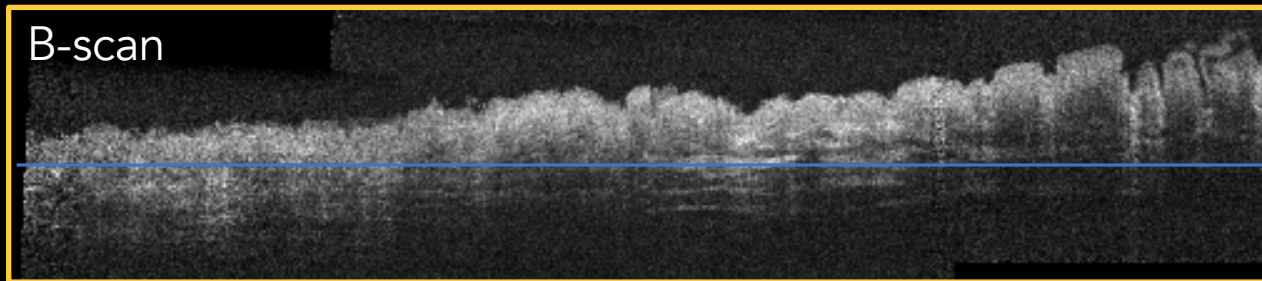
Total volume (cm³)
1.3 x 1.0 x 0.4

En face

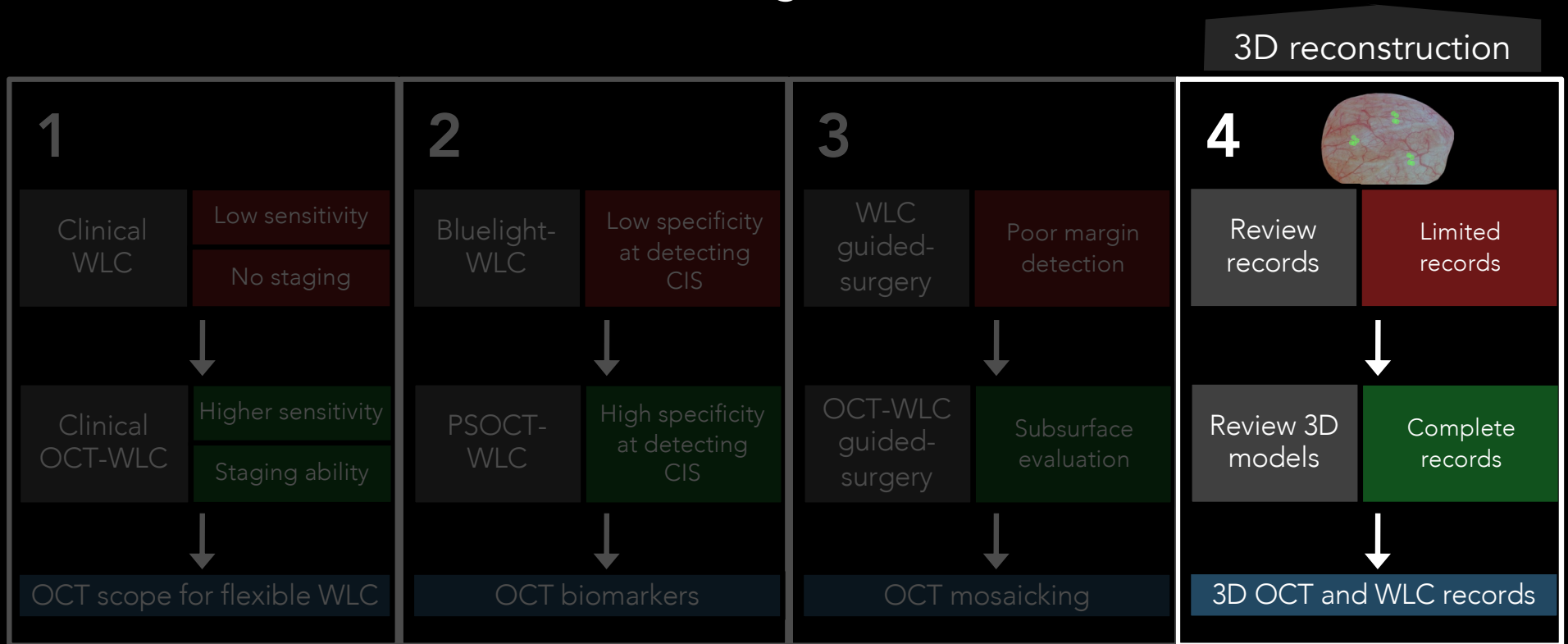
2000x speed improvement
over open-source



B-scan

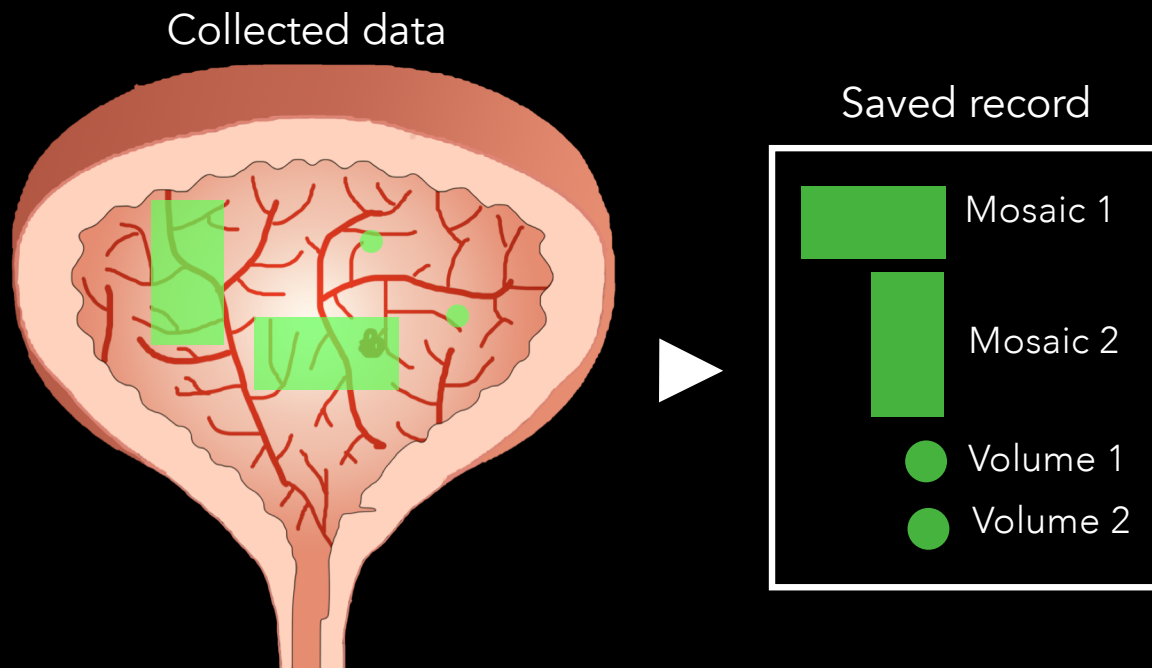


New image reconstruction methods



Limitation of mosaics

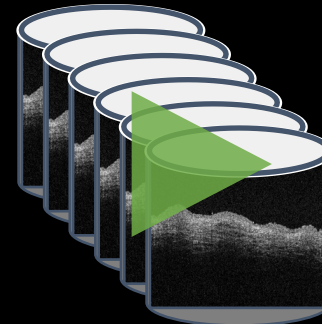
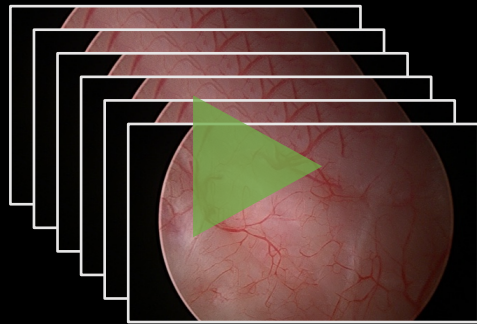
Detailed record of small region, but no global location



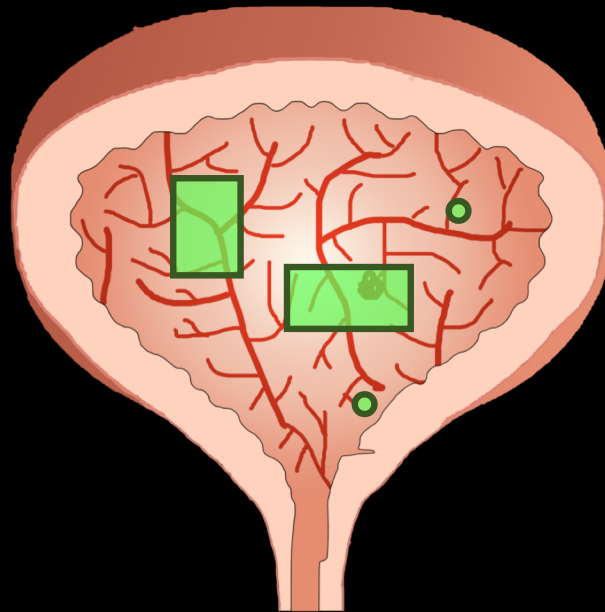
Bladder location of OCT data can be used to relocalize tumors

Cystoscopy data collection

Acquired data



1. Reconstruct 3D model from WLC
2. Register OCT to model



Feature detection between pairs of images

Hampered by lighting artifacts and low contrast

WLC image stream

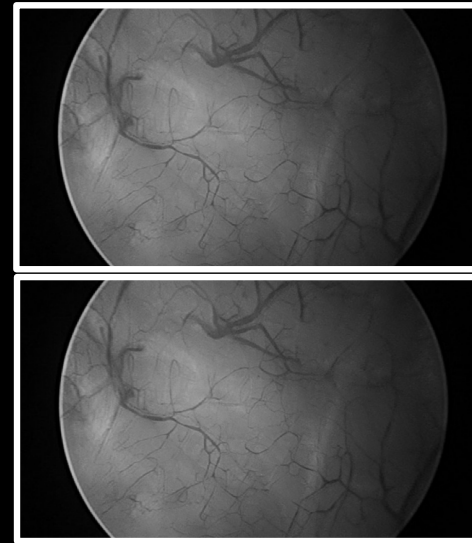
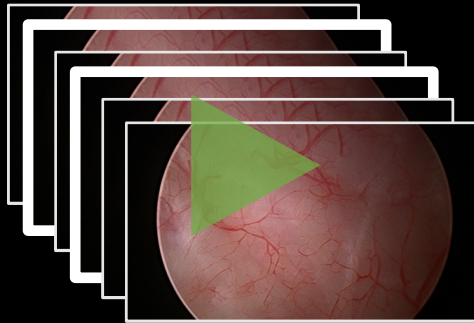


Image preprocessing aids robust feature detection

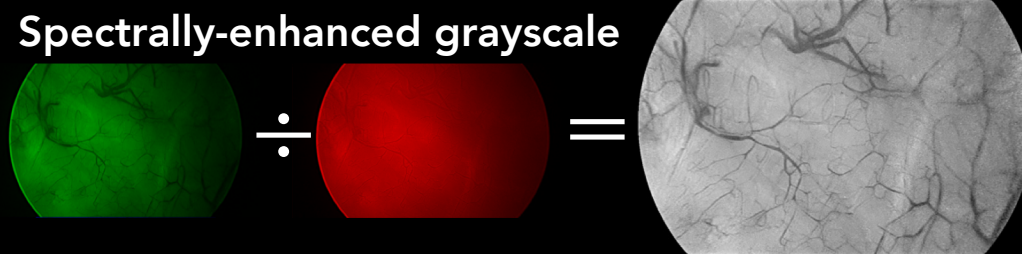
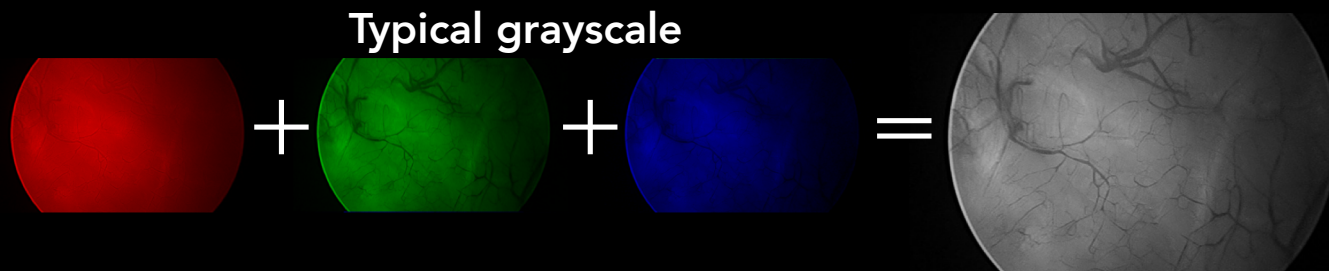
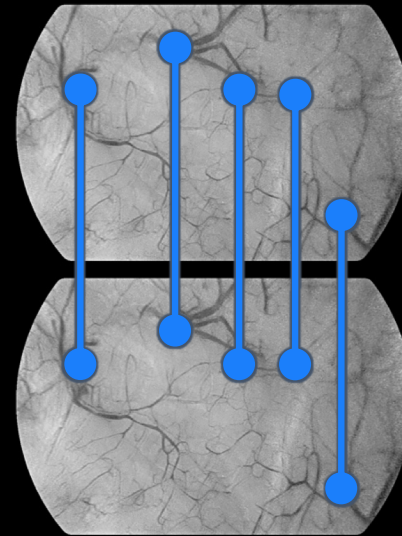
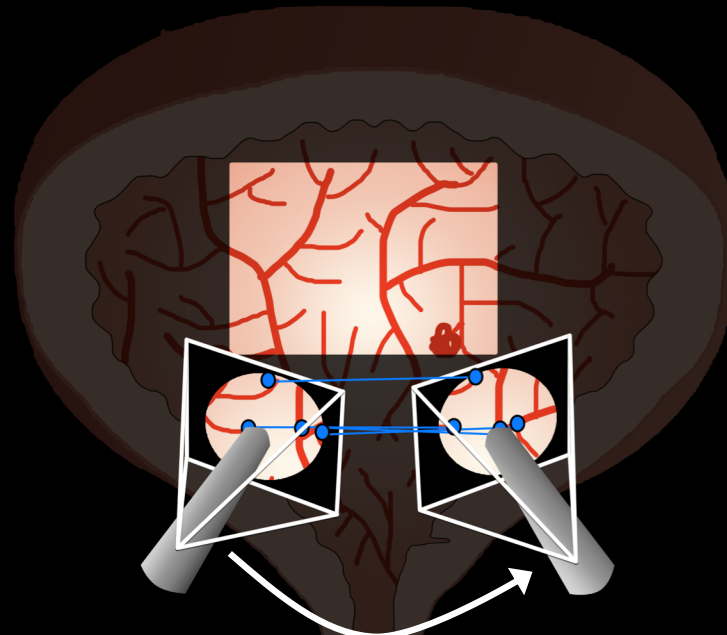


Image preprocessing aids robust feature detection

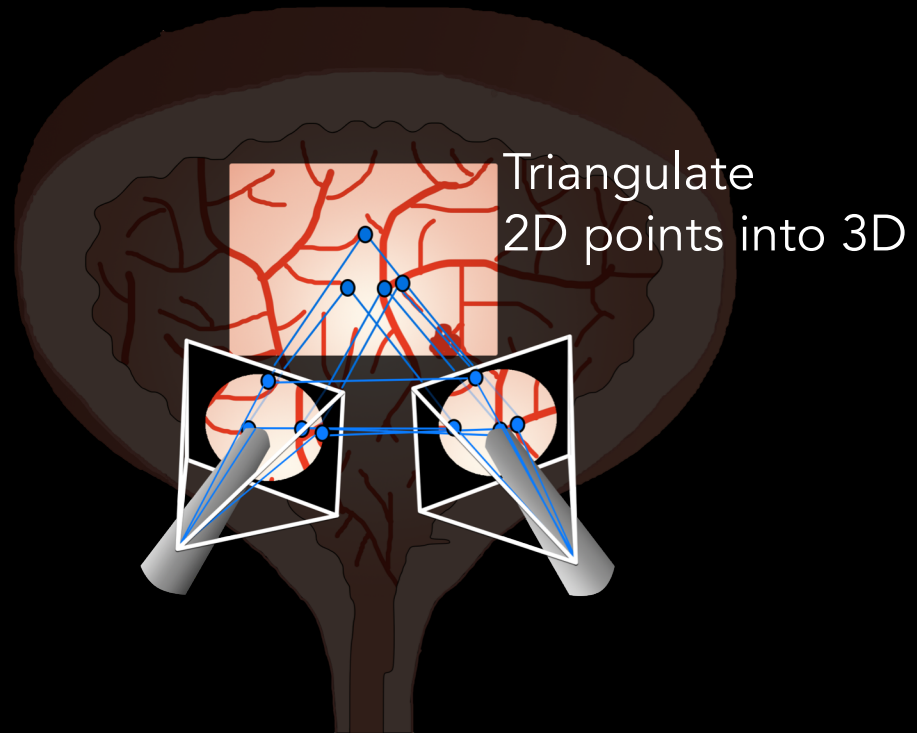


Structure from motion



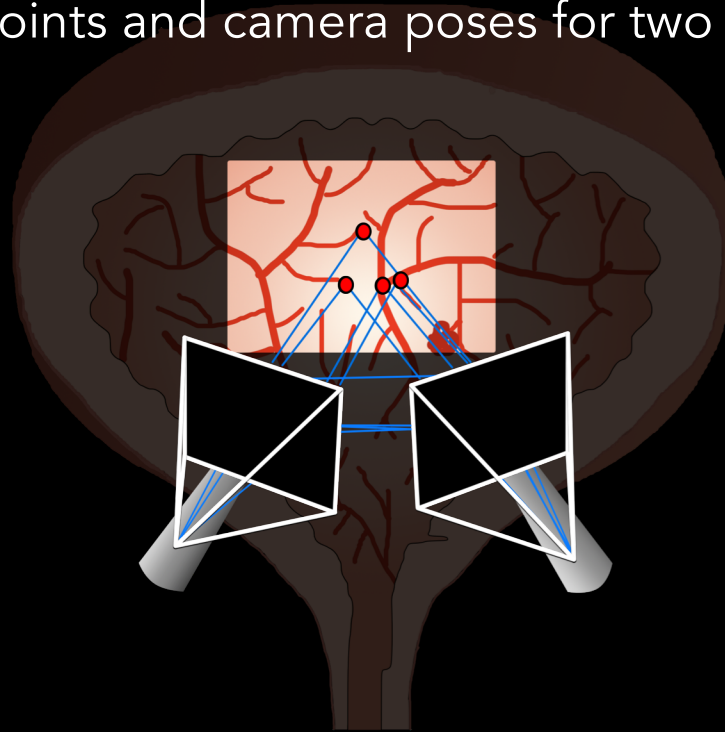
Recover cystoscope pose
(position and orientation)

Structure from motion



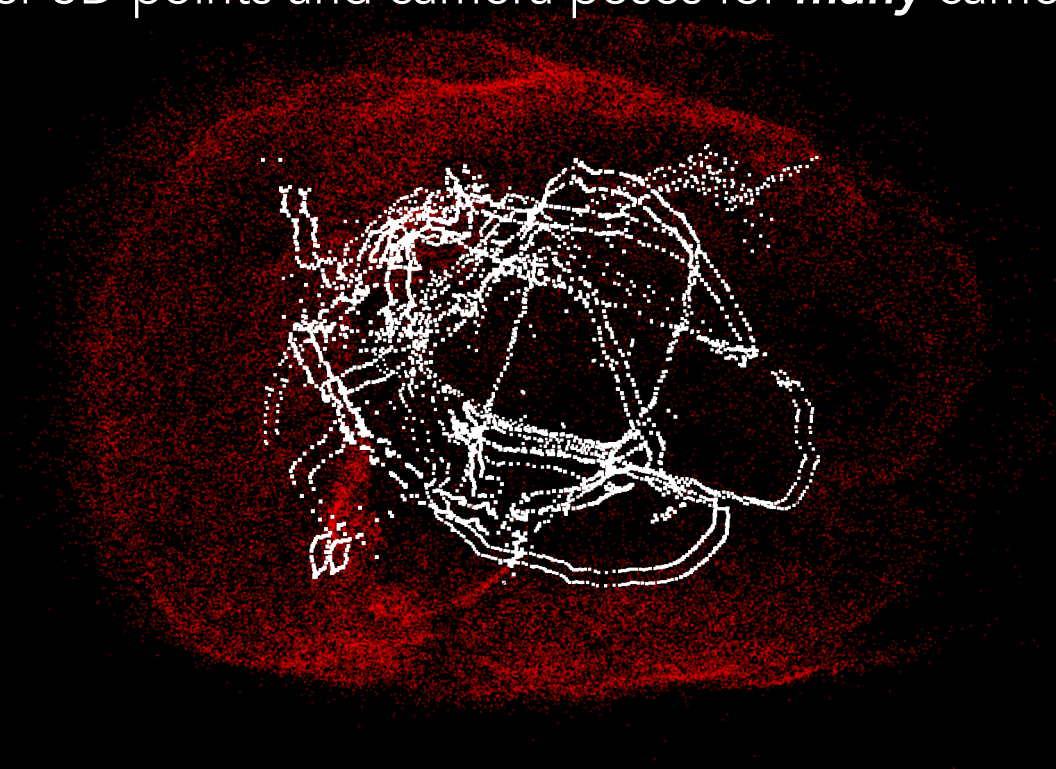
Structure from motion

Recover 3D points and camera poses for two cameras

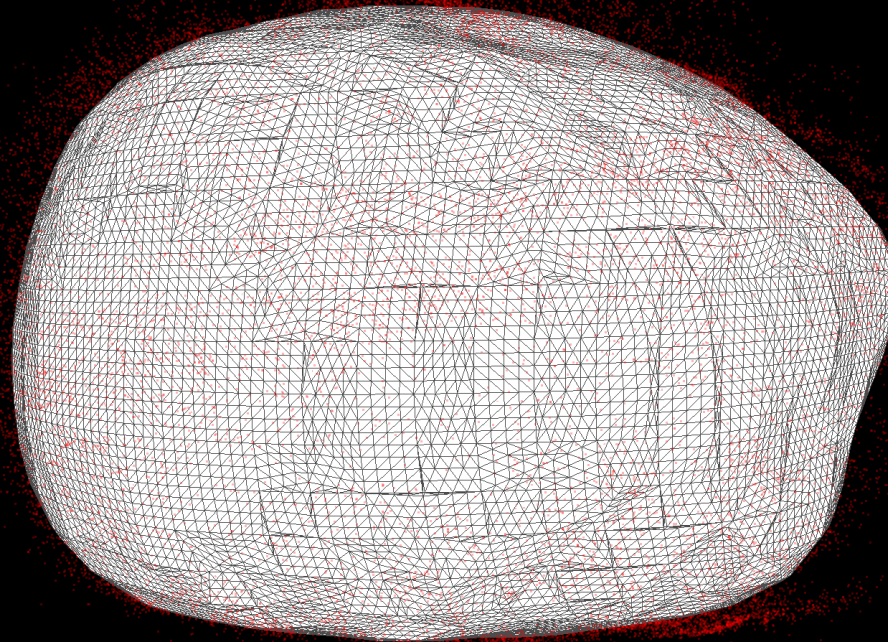


Structure from motion

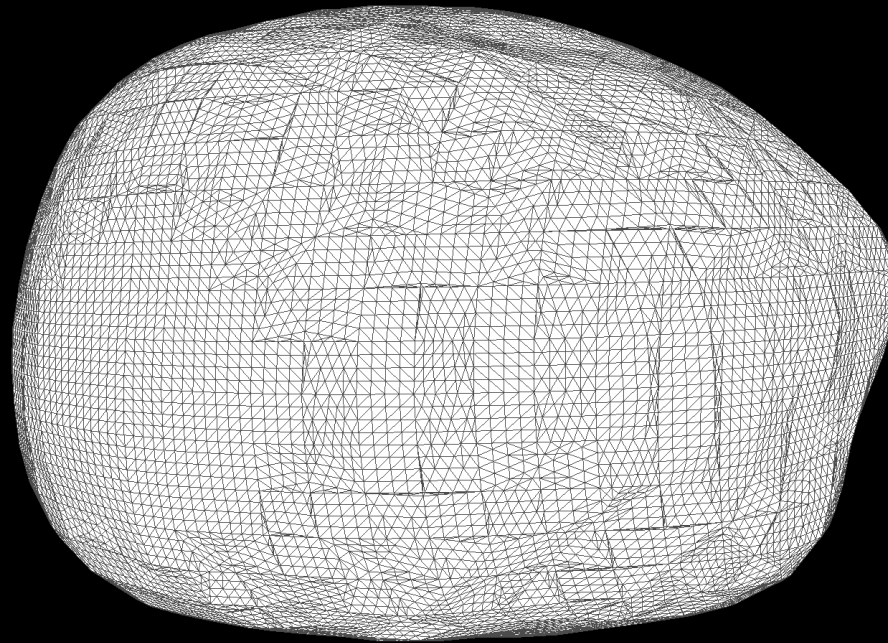
Recover 3D points and camera poses for *many* cameras



Convert point cloud to bladder shape

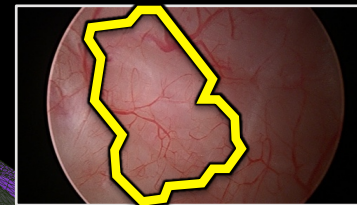
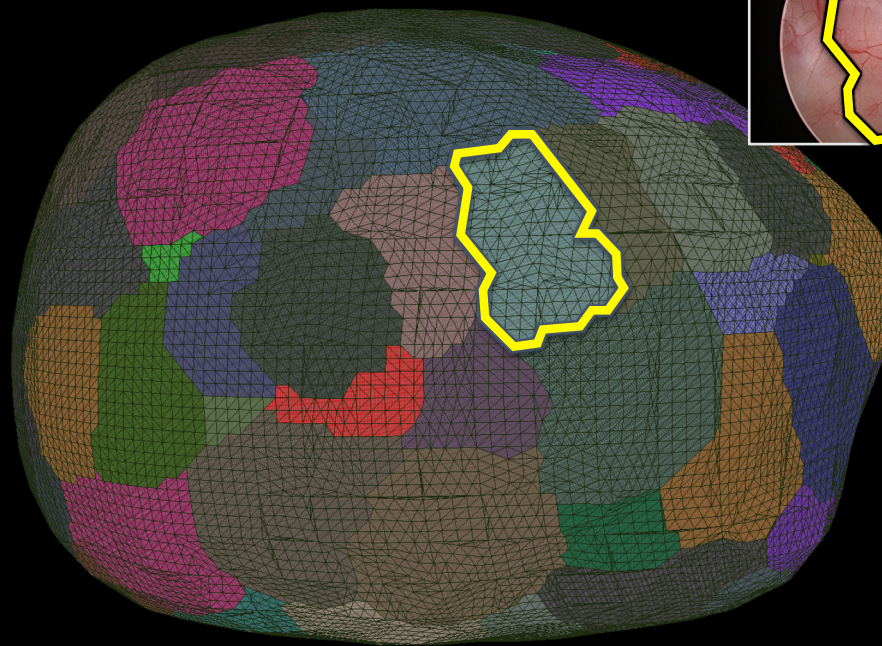


Convert point cloud to bladder shape



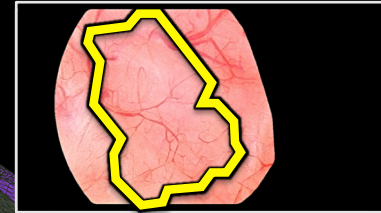
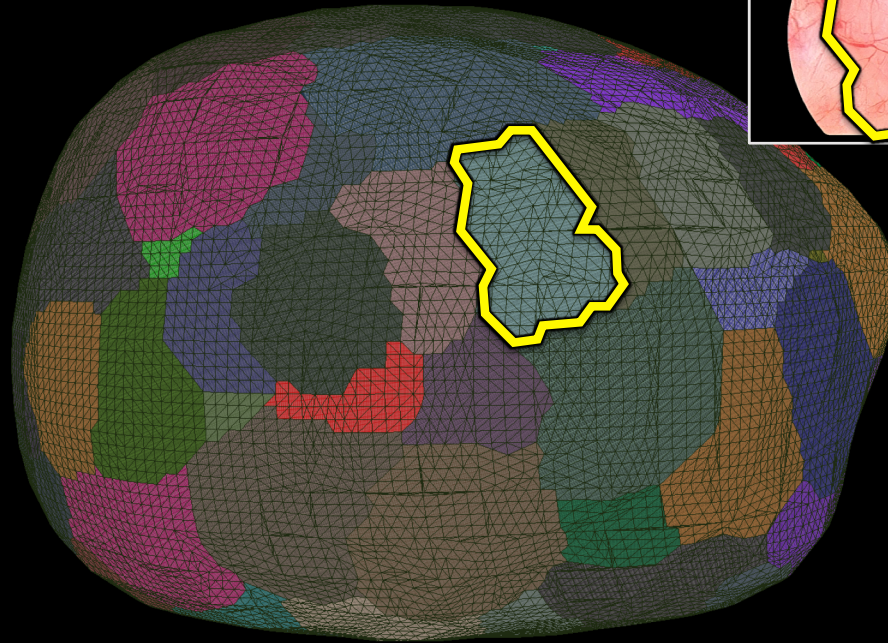
Add bladder appearance

Select images



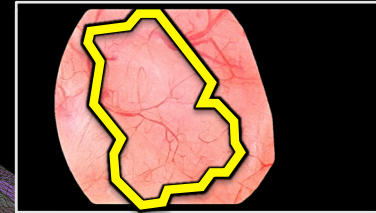
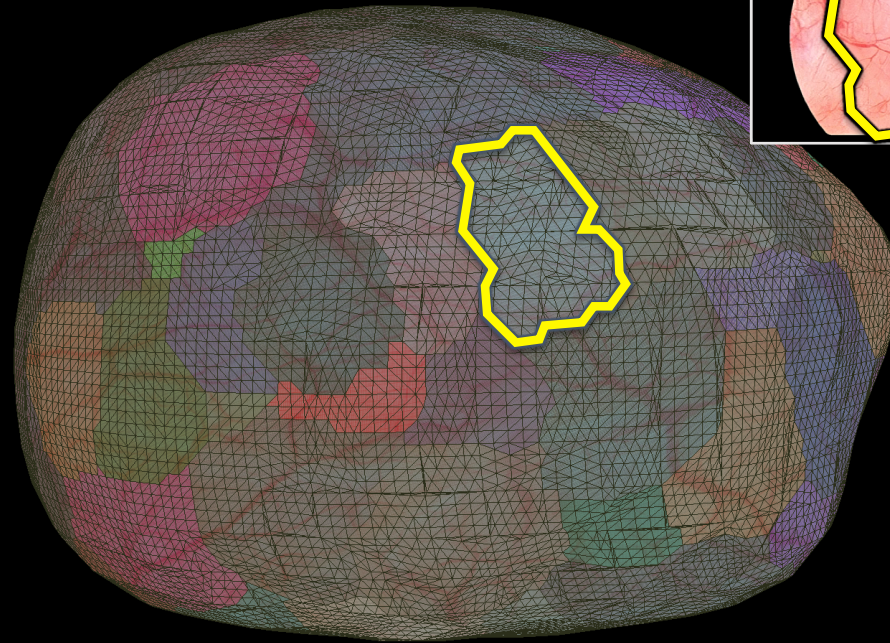
Add bladder appearance

Remove lighting artifacts



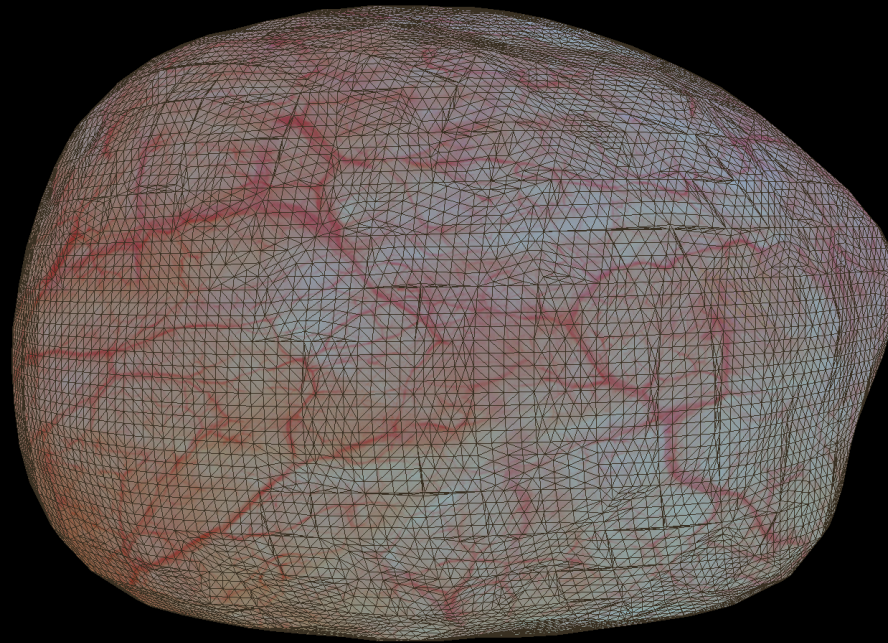
Add bladder appearance

Overlay images



Final 3D bladder model

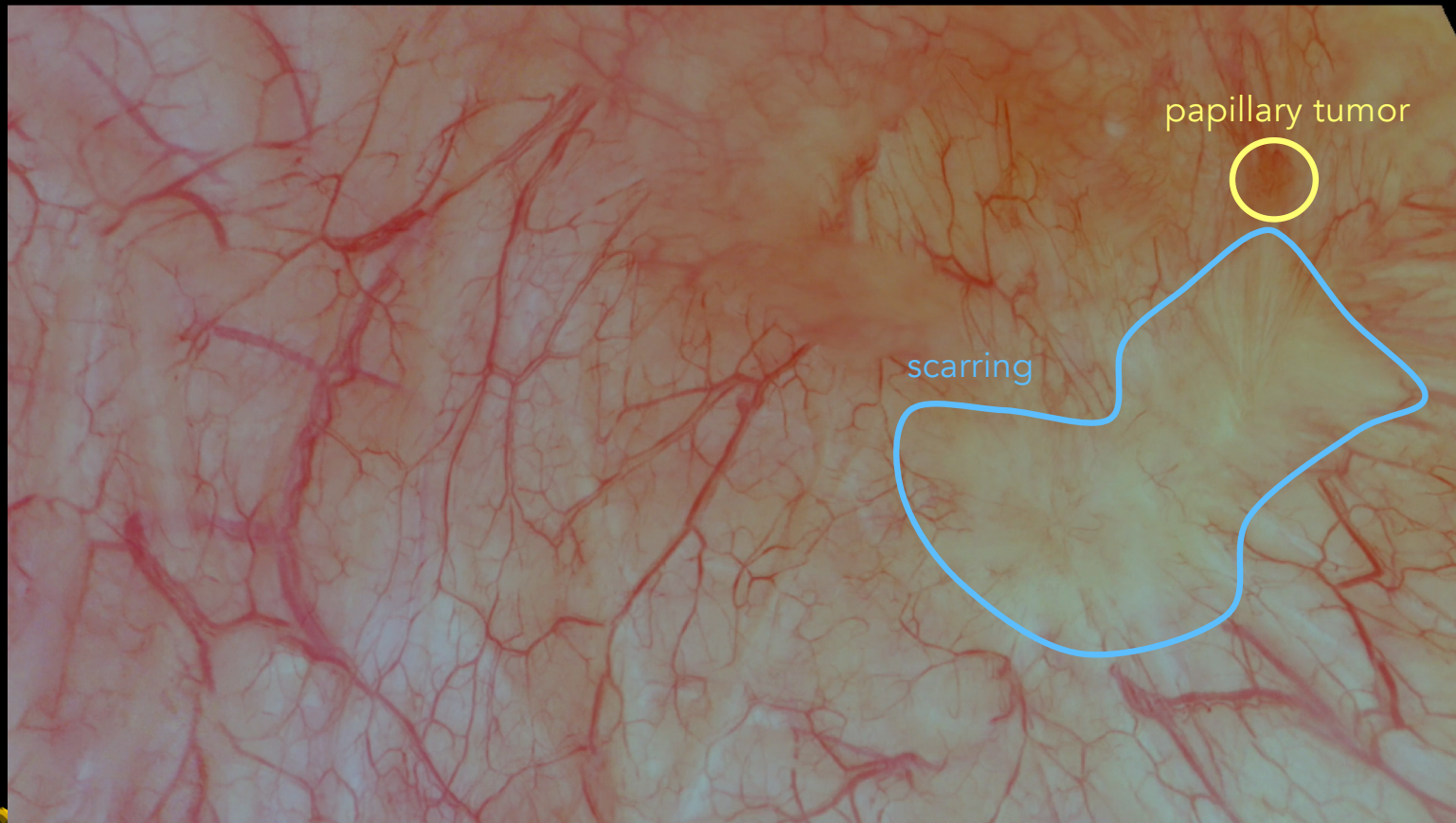
captures shape and appearance of bladder



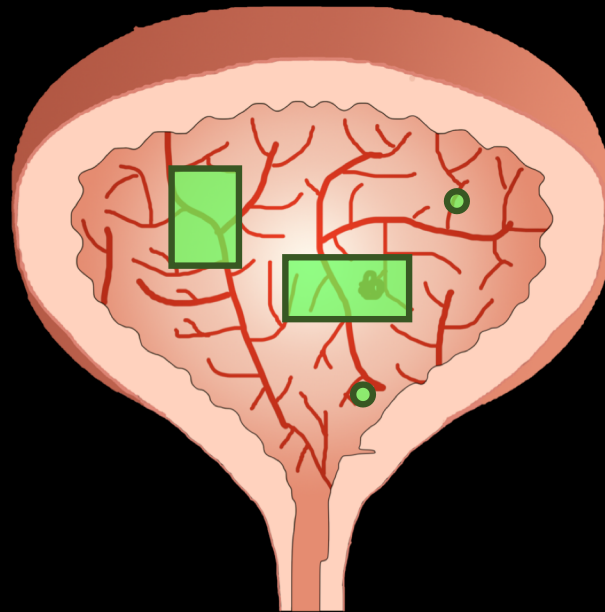
Virtual cystoscopy



Virtual cystoscopy



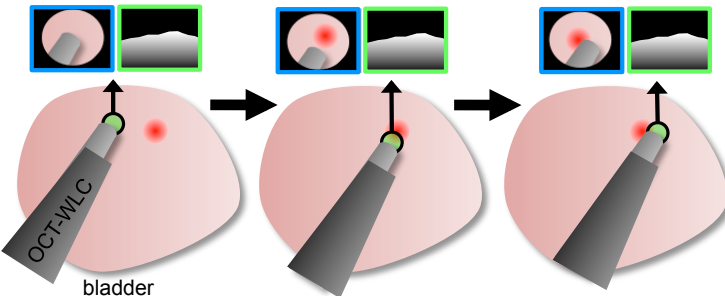
1. Reconstruct 3D model from WLC
2. Register OCT to model



(a) DATA COLLECTION

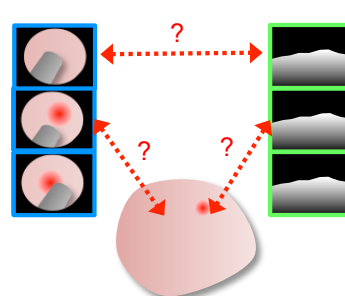
Collect WL and OCT data by scanning cystoscope over the bladder

WL image OCT volume



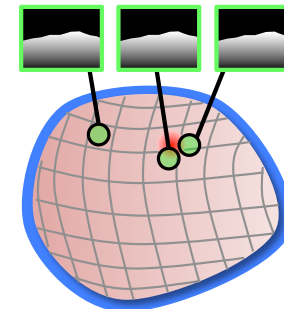
(b) EXISTING DATA REVIEW

Recall how to map individual OCT and WL images to each other and anatomical locations

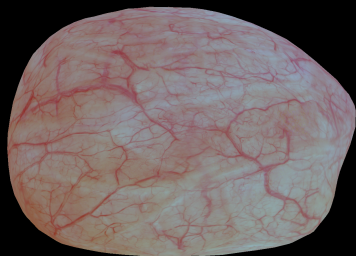


(c) PROPOSED DATA REVIEW

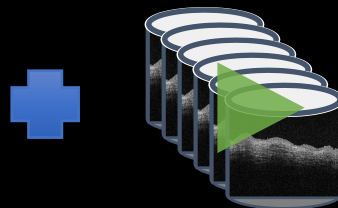
Directly map OCT volumes to bladder using 3D model reconstructed from WL images



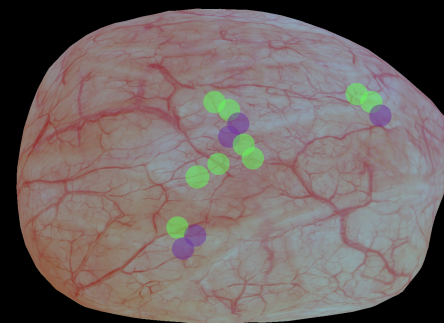
3D bladder model



PS-OCT volume stream



PS-OCT volumes registered to 3D model



Related Lab publications

Three-dimensional, distendable bladder phantom for optical coherence tomography and white light cystoscopy [Lurie et. al, JBO 19\(3\), 2014.](#)

Multimodal 3D cancer-mimicking optical phantom [Smith et. al, Biomed Opt. Exp, 7\(2\), 2015.](#)

Automated mosaicing of feature-poor optical coherence tomography volumes with a freehand dual-modality probe [Lurie et. al, IEEE Trans. in Biomed. Eng. 61\(7\), 2014.](#)

Rapid scanning catherscope for expanded forward-view volumetric imaging with optical coherence tomography [Lurie et. al, Optics Lett 40\(13\), 2015.](#)

Automated, Depth-resolved Estimation of the Attenuation Coefficient From Optical Coherence Tomography Data [Smith et al, IEEE TMI 34\(12\), \(2015\).](#)

3D reconstruction and co-registration of cystoscopic video sequences for longitudinal Studies [Lurie et. al, BOE 8\(4\), 2017.](#)

Registration of optical coherence tomography data to 3D bladder models [Lurie et. al, BOE 7\(12\), 2016.](#)

A review of methods and applications of attenuation coefficient measurements with optical coherence tomography [Chang and Bowden, JBO 24\(0\), 2019.](#)

Automatically determining the confocal parameters from OCT B-scans for quantification of the attenuation coefficients [Dwork et al, IEEE TMI 38\(1\), 2019.](#)

Cost-efficient video synthesis and evaluation for development of virtual 3D endoscopy [Zhou et al, IEEE JTEHM 9\(12\), \(2021\).](#)

Light on Dark Faces

Personal experiences in Academia

- On being Black ...
 - At Photonics West
 - At the Faculty Club
- On being “young” ...
- On being a woman ...
- On being ...



Systemic racism: “...living in a system not designed with you in mind”

-- Bishop T D Jakes

The Best Algorithms Struggle to Recognize Black Faces Equally

US government tests find even top-performing facial recognition systems misidentify blacks at rates five to 10 times higher than they do whites.

Personal experiences in Academia

Pulse Oximeters are Important for Keeping all Patients Safe

On December 17, 2020, Sjoding *et al.* published a retrospective analysis of pulse oximetry (SpO₂) data from two patient cohorts indicating that in some patients, occult hypoxemia was not detected when compared to paired oxyhemoglobin saturation measured by laboratory co-oximetry (SaO₂).¹ Occult hypoxemia was defined as an SaO₂ of < 90% when the paired SpO₂ measurements were 92% or greater. The authors compared sub-groups from the cohorts self-identifying as Black and White, and found that the incidence of occult hypoxemia was three times greater in Black patients (11.7%) compared with White patients (3.6%). As the authors noted, these findings, if correct, have **important patient safety implications since patient triage based upon pulse oximeter measurements could fail to lead to appropriate escalation of care.** As a retrospective, uncontrolled study without objective measurements of skin tone, the analysis



FDA warns pulse oximeters less accurate for people with darker skin

An article in NEJM reports that pulse oximeters missed occult hypoxemia in more



An unequal burden...



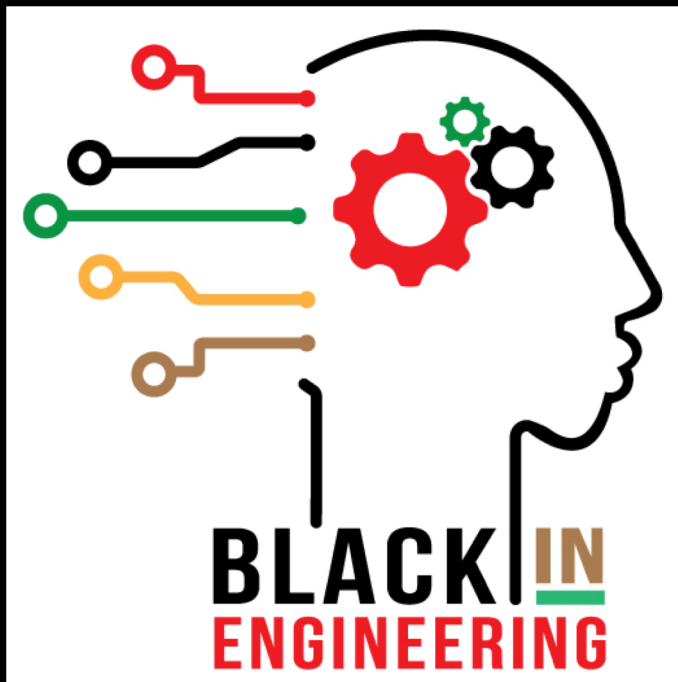
- the unequal burden of service we have to help our universities have diverse committees
- the unequal burden of extra activities we take on -- going to professional conferences like NSBE/ARL to be around people who actually support us, talking to students of color on campus to serve as informal mentors and support, etc. -- all which take additional time directly from our research and also require funding that our universities usually don't give us
- the unfair scrutiny we get from entitled students who question our qualifications because of what they see (sometimes leading to lower teaching evaluations and seriously disrespectful comments that take a mental and emotional toll)
- the unequal anxiety we face when we go into a room full of people who don't look like us, not sure if we will be heard or acknowledged (even though everyone can see us), or if our picture will be used without permission on the cover of some university propaganda
- the unequal rates of success with grant proposals because our name tips reviewers (with unconscious bias) off that we may not be white.
- the unequal fear we face in working late at night on campus because of who might stop us or think we're suspicious

An unequal burden...



- the unequal burden of service we have to help our universities have diverse committees
- the unequal burden of extra activities we take on -- going to professional conferences like ARL to be around people who actually support us, talking to students of color on campus to serve as informal mentors and support, etc. -- all which take additional time directly from our research and also require funding that our universities usually don't give us
- the unfair scrutiny we get ... none of which are acknowledged in the tenure or promotion process or in any way, nor do they often bear compensation of any kind.
(sometimes leading to low morale and a heavy emotional toll)
- the unequal anxiety we face if what they see take a mental and emotional toll. We're not sure if we will be covered without permission on the cover of some university publication
- the unequal rates of success with grant proposals because our name tips reviewers (with unconscious bias) off that we may not be white.
- the unequal fear we face in working late at night on campus because of who might stop us or think we're suspicious

Black in Engineering Call to Action: On Becoming An Anti-Racist University



5 Principles

1. Attitude
2. Clarity
3. Institutional Accountability
4. Personal Accountability
5. Commitment and Resources

5 Constituencies

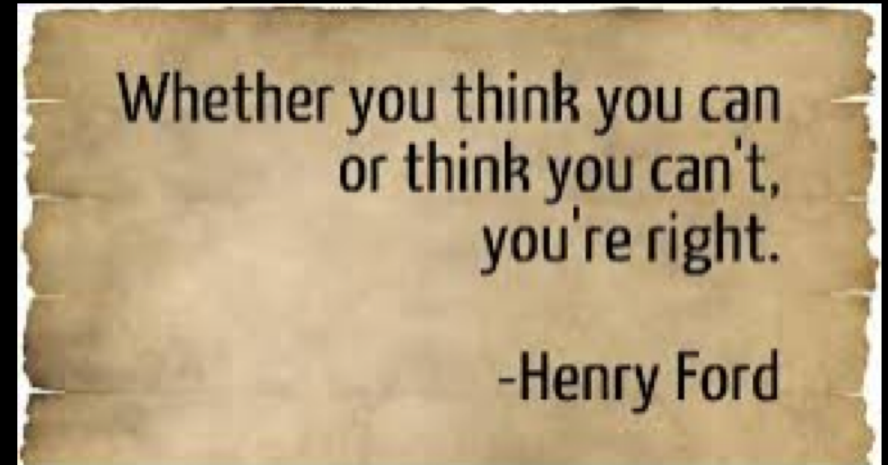
1. System-wide
2. Faculty
3. Staff
4. Graduate Students
5. Undergraduate Students

<https://blackinengineering.org/action-item-list>

Bowden and Buie, "Anti-Black racism in academia and what you can do about it," Nat Rev. Mat (2021)

1. Attitude

- If you don't approach this problem with the idea that you and your institution have work to do, you will find that nothing needs to be done.
- Whatever our history, the future is ours to affect. The system is *us*.
- Refusal to acknowledge this responsibility makes you complicit in perpetuating systemic racism.



Call To Action: Recommendations on How To Become An Anti-Racist Institution



System-
wide



Faculty



Staff



Graduate
students



Undergraduate
students

Education - training - recruitment - retention - policing - disaggregation - tokenism - community-building - funding - fundraising - accountability - promotion - mental health - admissions - networking ...

How to Become An Anti-Racist Individual

Honestly acknowledge and repair my university's and society's racial histories

What aspects of my society or design of my university's policies and structures do I routinely overlook as contributing to racism?

In what ways do I benefit from systems where the "rich get richer" or that perpetuate intellectual impoverishment?

How does my scholarship or area of interest overlook the impacts on or contributions of Black individuals?

How to Become An Anti-Racist Individual

Examine my biases and begin to unlearn them

Acknowledge that a student's success should not be dependent on their identity, high school, or their knowledge of "the hidden curriculum"

What knowledge or expectations do I assume students have to succeed in my classroom or profession?

What process can I undertake to reveal and unlearn my personal biases?

How to Become An Anti-Racist Individual

Acknowledge, applaud, and reward the efforts of Black staff, faculty, and students in building and improving the institution.

Administrators: commit resources and people to actionable goals in recruiting, retaining, and supporting Black faculty, staff, and students.

Welcome Black members of the university as full participants, rather than treat them as tokens.

What Black staff, faculty or student can I acknowledge, applaud or reward this week?

What committees or people have I failed to adequately resource to take immediate action to achieve our goals?

In what way have I failed to include Black members of the university as a vital partner in our institution's aspirations for greatness?

Acknowledgements

- **Current trainees**

- Grace Chang
- Yunqin Zhao
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- Seth Crawford
- Yaxuan Zhou
- Danielle Liu
- Dr. Iftak Hussain
- Dr. Prasobh Puthupaddy

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- Soheil Kohlouri, PhD
- Ipek Oguz, PhD
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- Laura Waller, PhD
- Jennifer Dionne, PhD
- Sam Chang, MD
- Kristen Scarpato, MD
- Sylvia Groth, MD
- Eric Brown, MD
- Jaime Vasquez, MD
- Robert Webster, PhD
- Ashish Shah, MD
- Mayur Patel, MD



Thank you!

