



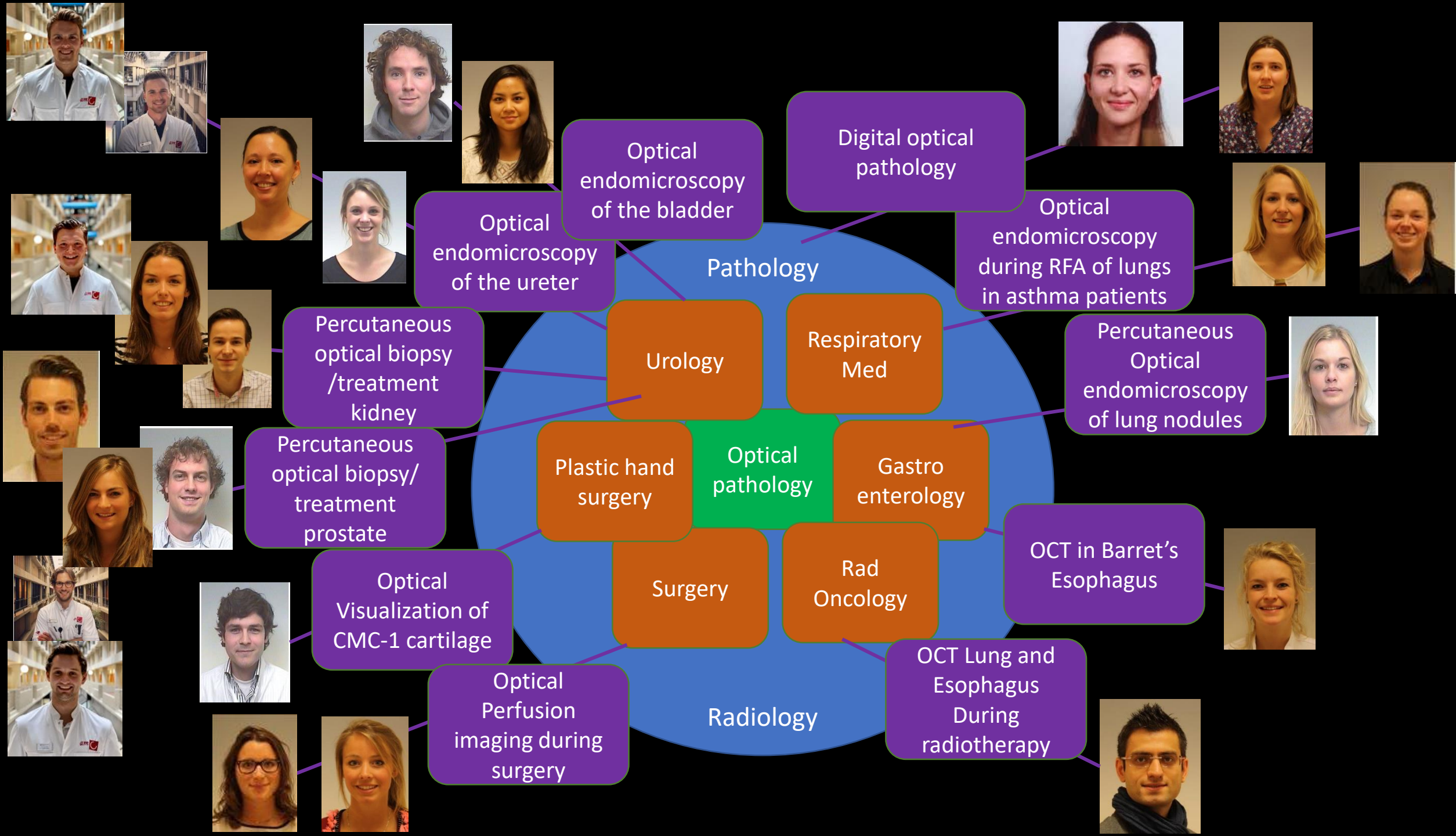
# Optical diagnostics of urinary tract cancer: towards real time finding and grading

Daniel Martijn de Bruin

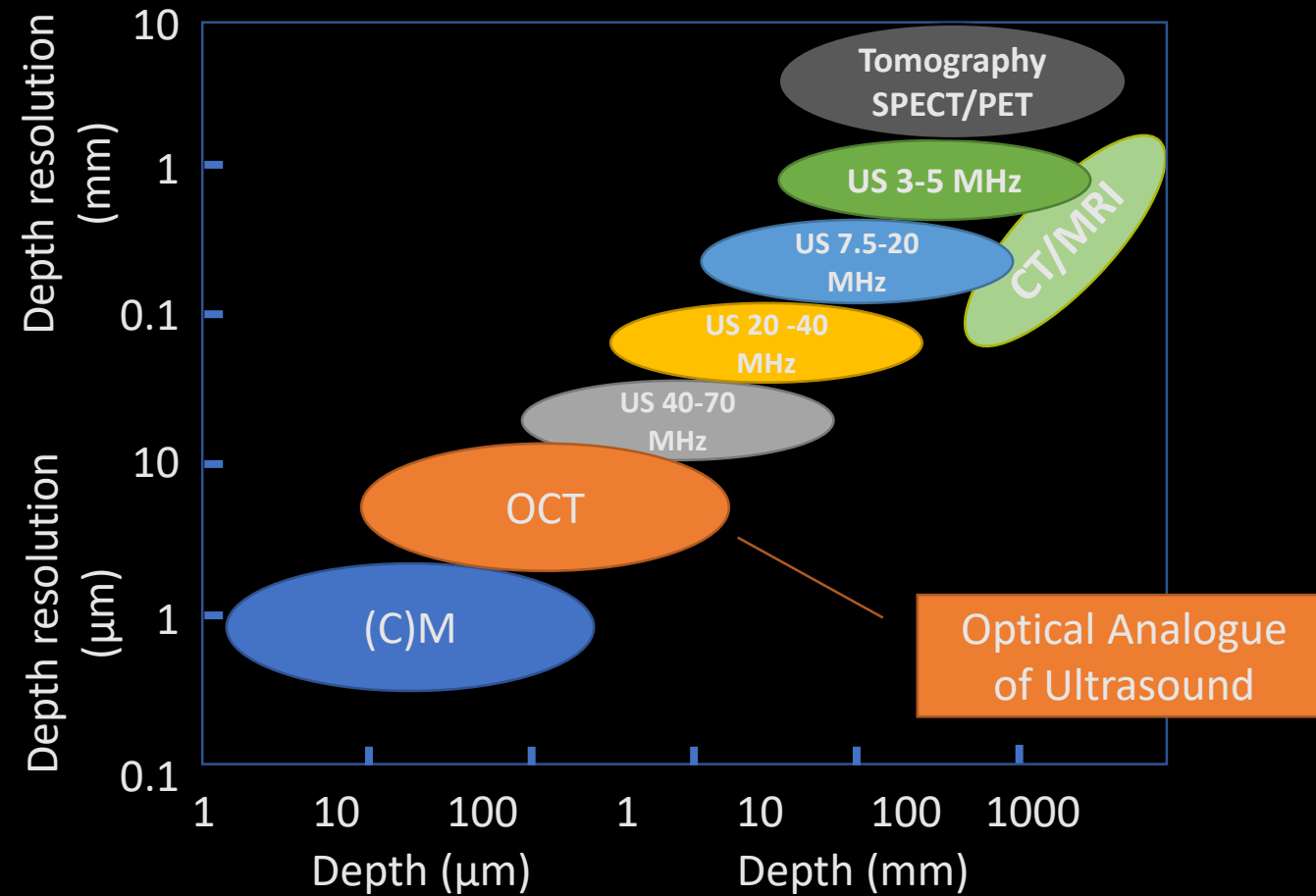
**Group leader urological research**

*Dept of urology*

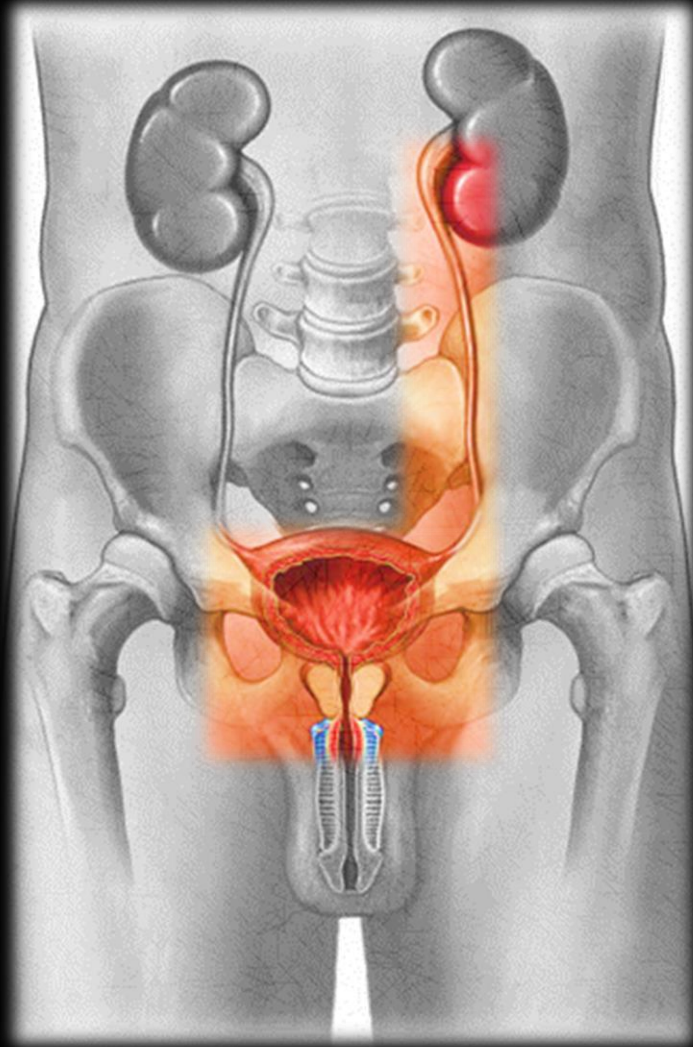
*Dept of Biomedical Engineering & Physics*



# Medical Imaging

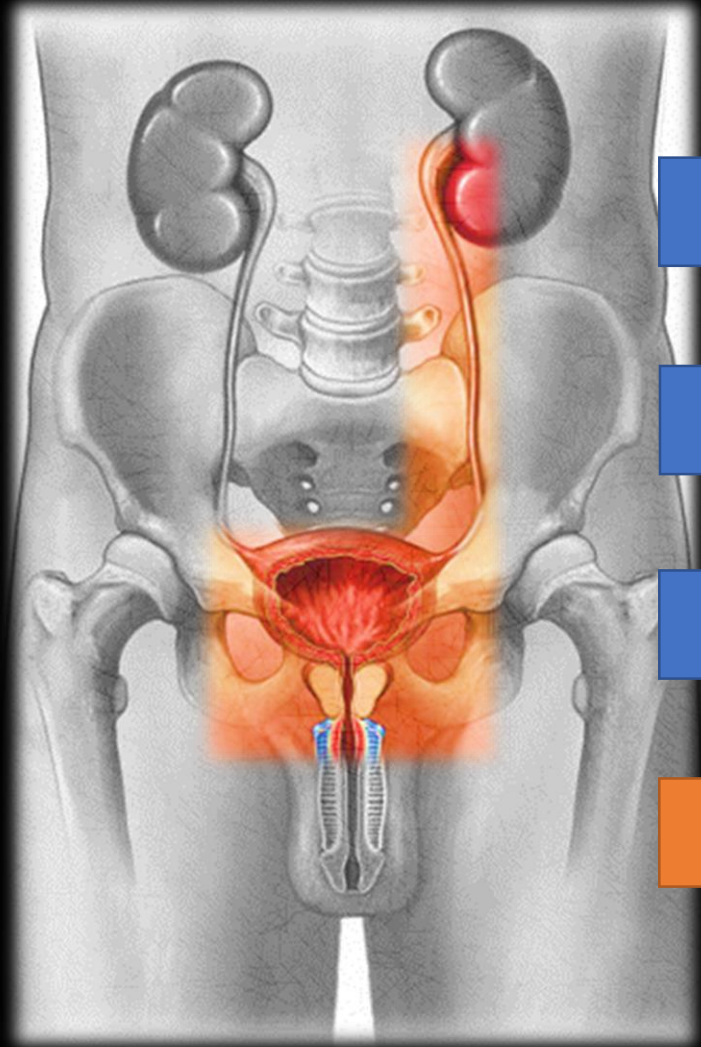


# ENDOUROLOGY - ENDOUROLOGIST



- **Urinary tract tumor 4<sup>th</sup> most common**
- **90-95% bladder**
- **60% recurrence**
- **Lifetime follow-up**
- **Highest economic burden of all cancers**

# ENDOUROLOGY - ENDOUROLOGIST



stones

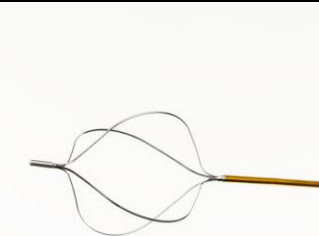
enlarged benign  
prostate

stricture

cancer



Dr. Jay Store



# (OPTICAL) DIAGNOSTICS IN THE URINARY TRACT

➤ Narrow Band Imaging (NBI, Olympus)

➤ Storz Profesional Image Enhancement System (SPIES, Storz)

**FINDING**  
**A SUSPECTED LESION**

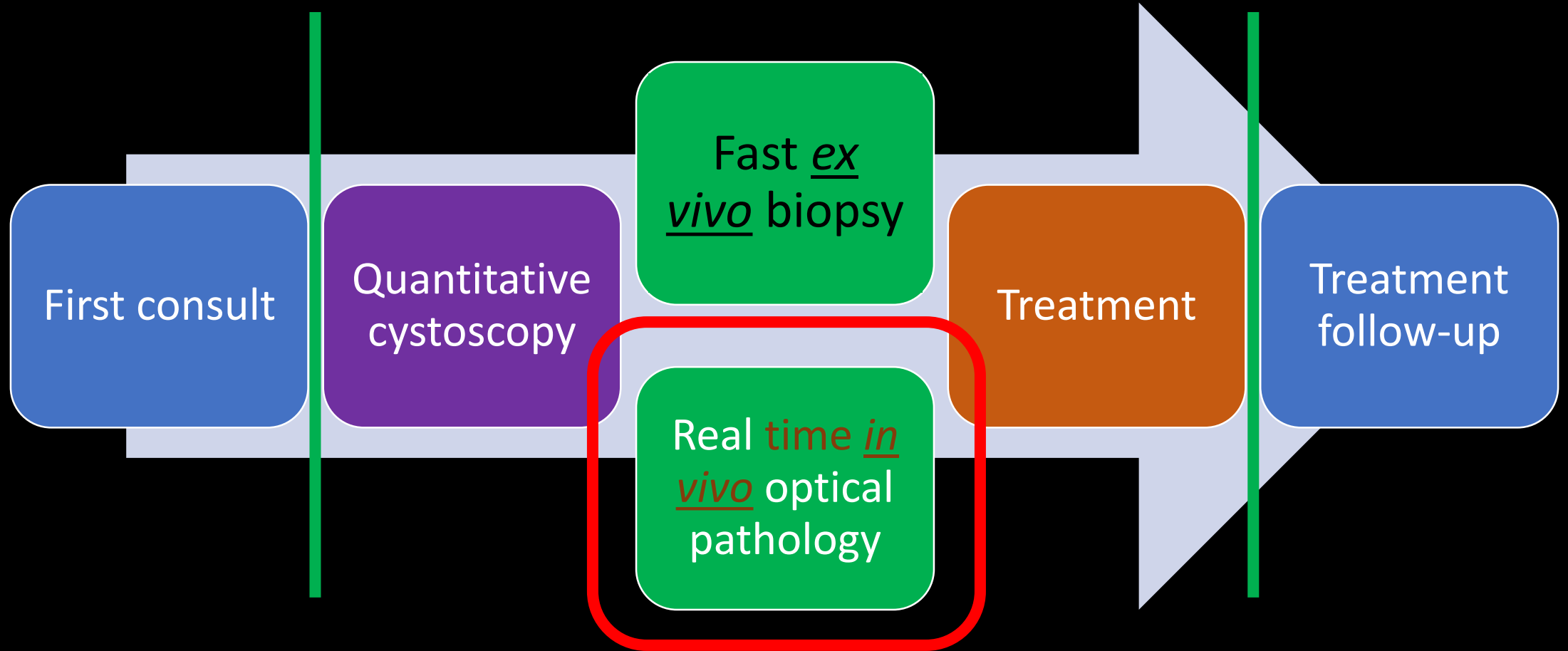
➤ Confocal Laser Endomicroscopy (CLE, Mauna Kea Tech)

➤ Optical Coherence Tomography (OCT, St. Jude)

➤ Endoluminal Ultrasound (ELUS, Volcano)

**DIFFERENTIATING**  
**A SUSPECTED LESION**

# THE OVER ALL SCOPE



# (OPTICAL) DIAGNOSTICS IN THE URINARY TRACT



➤ **Narrow Band Imaging (NBI, Olympus)**

➤ **Storz Profesional Image Enhancement System (SPIES, Storz)**

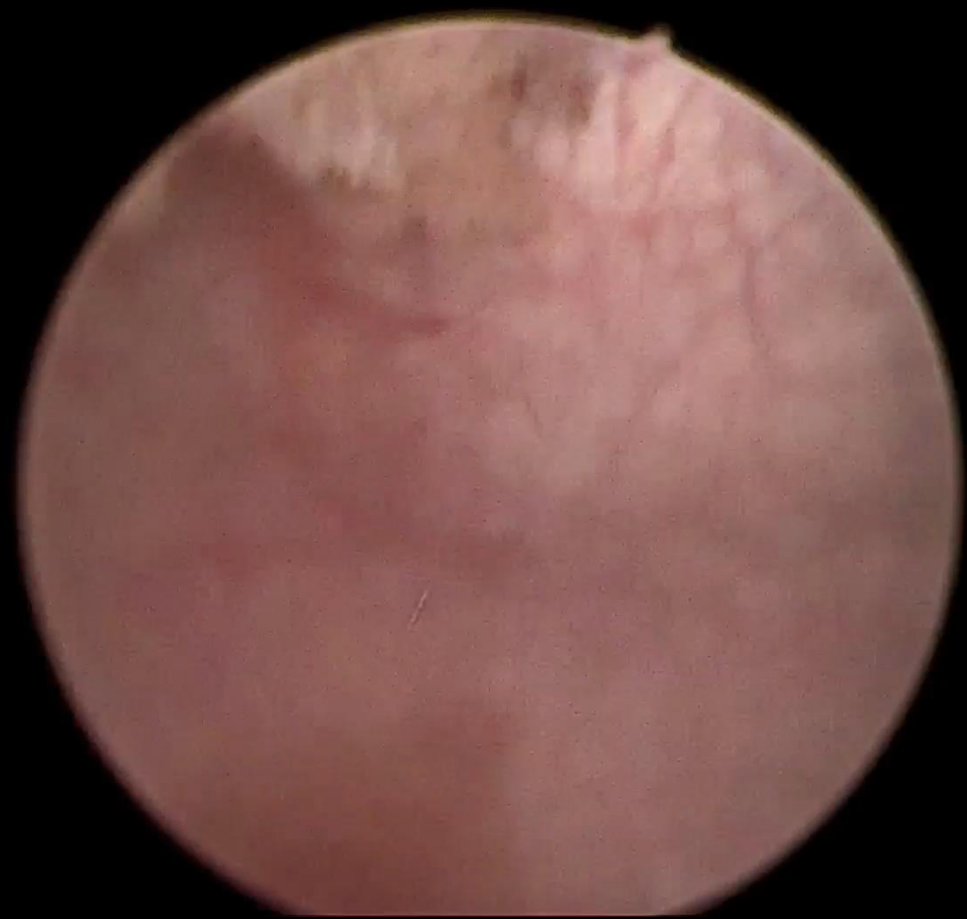
**FINDING**  
**A SUSPECTED LESION**

➤ **Confocal Laser Endomicroscopy (CLE, Mauna Kea Tech)**

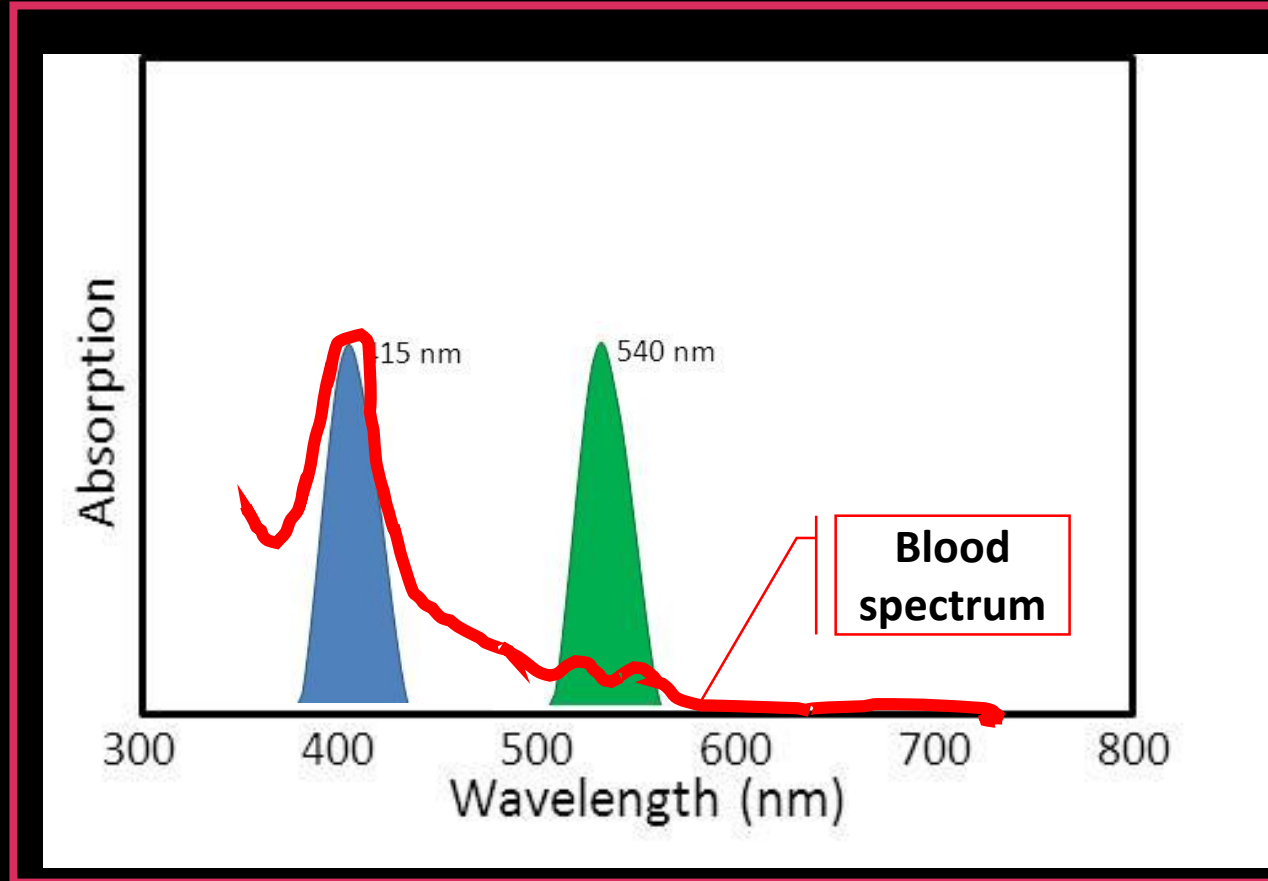
➤ **Optical Coherence Tomography (OCT, St. Jude)**

➤ **Endoluminal Ultrasound (ELUS, Volcano)**

**DIFFERENTIATING**  
**A SUSPECTED LESION**



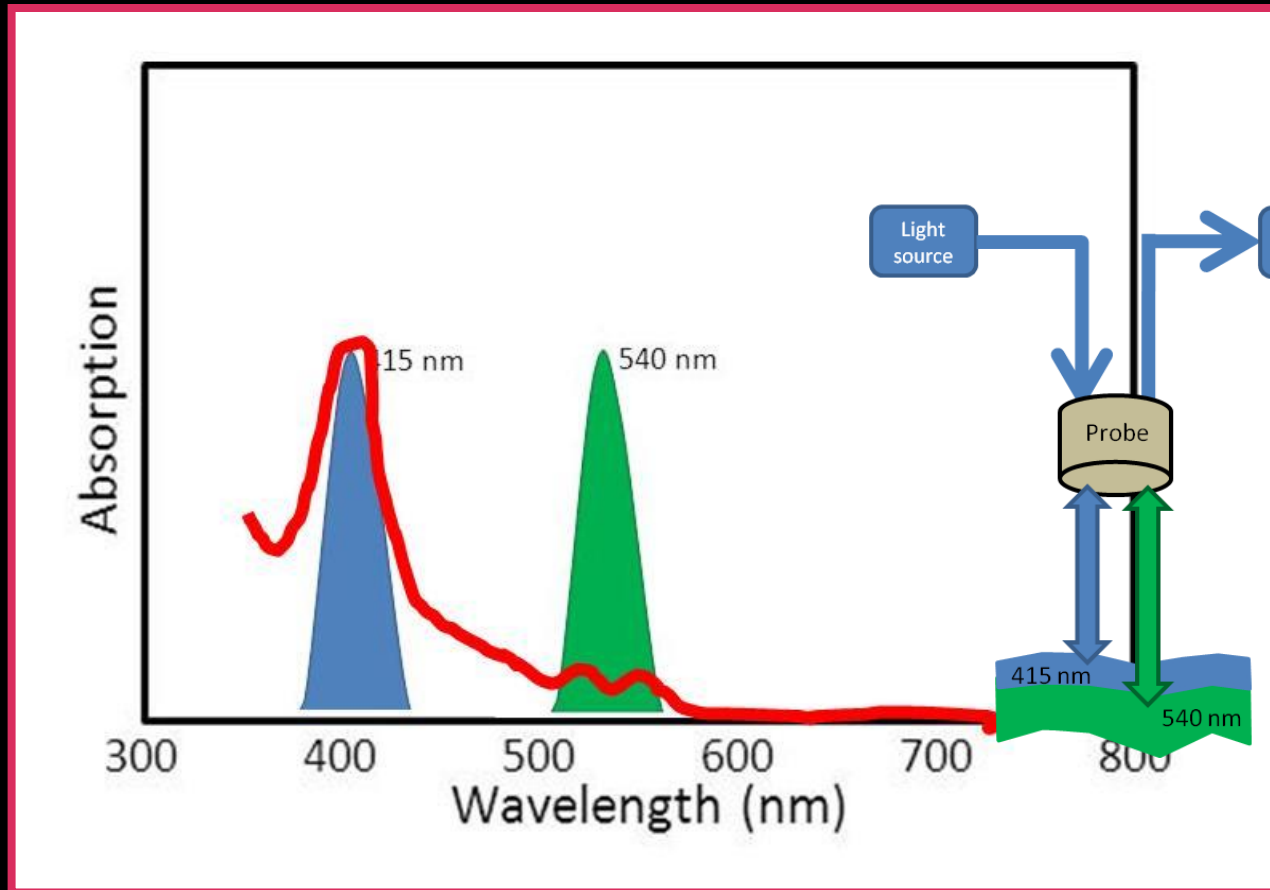
# Narrow band imaging



- Two colors (wavelengths) are used (415 & 540 nm)
- Both colors are absorbed by Blood



# Narrow band imaging

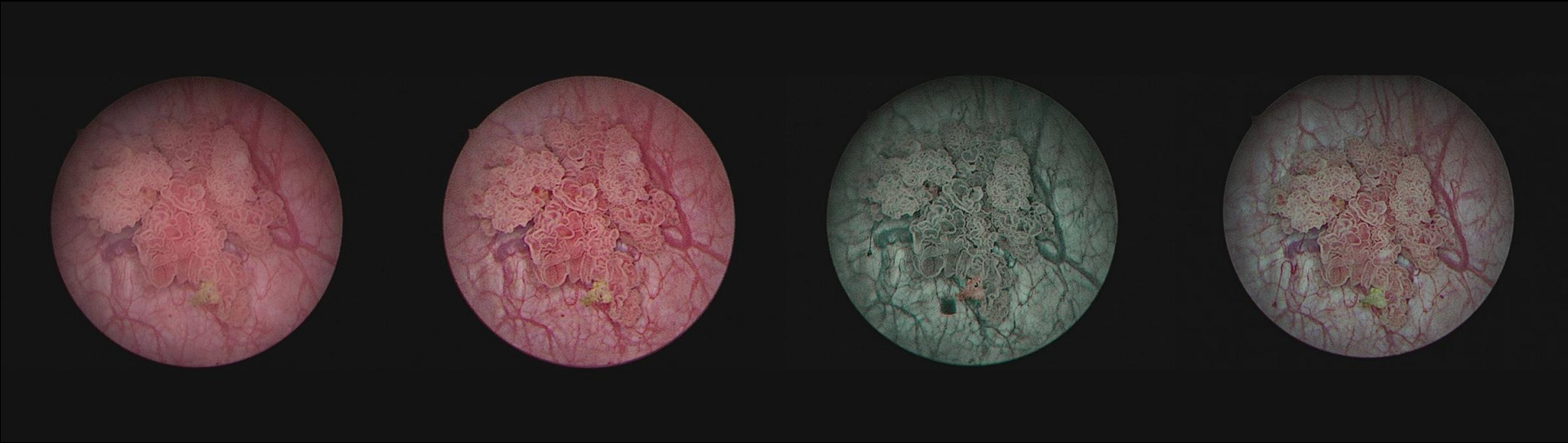


- Two colors (wavelengths) are used (415 & 540 nm)
- Both colors are absorbed by Blood
- Green light penetrates deeper, revealing deeper bloodvessels



# storz professional imaging enhancement system (SPIES)

Example in the bladder II



White light

Clara & Chroma

Spectra A

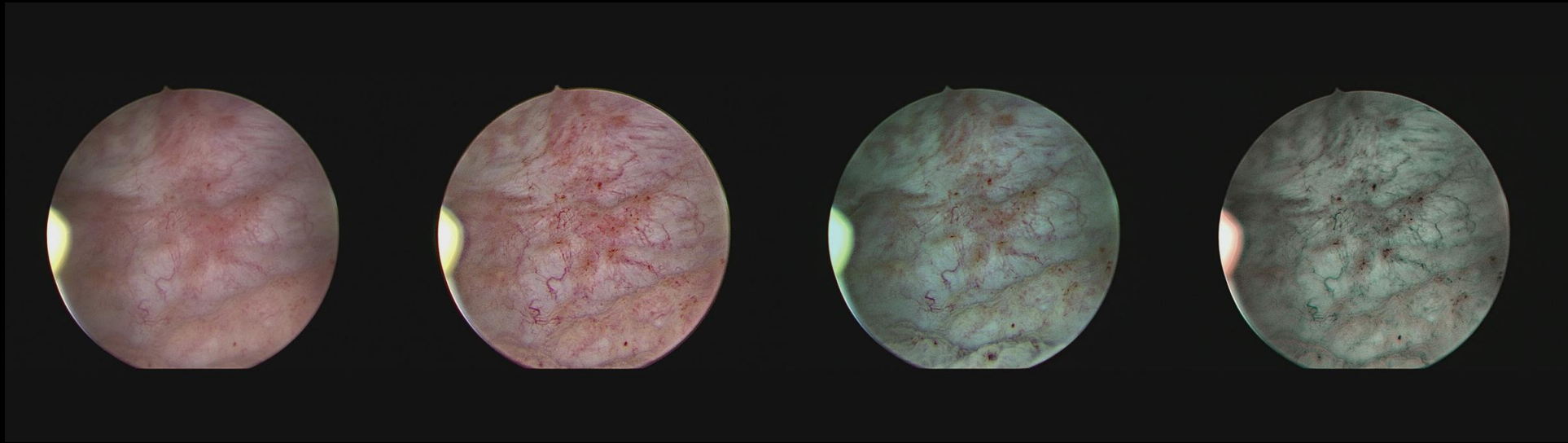
Spectra B

*Guido M Kamphuis et al, Journal of endourology 2016*

*Guido M Kamphuis et al, J Cancer Sci Ther , 2016*

# storz professional imaging enhancement system (SPIES)

Example in the bladder I



White light

Clara & Chroma

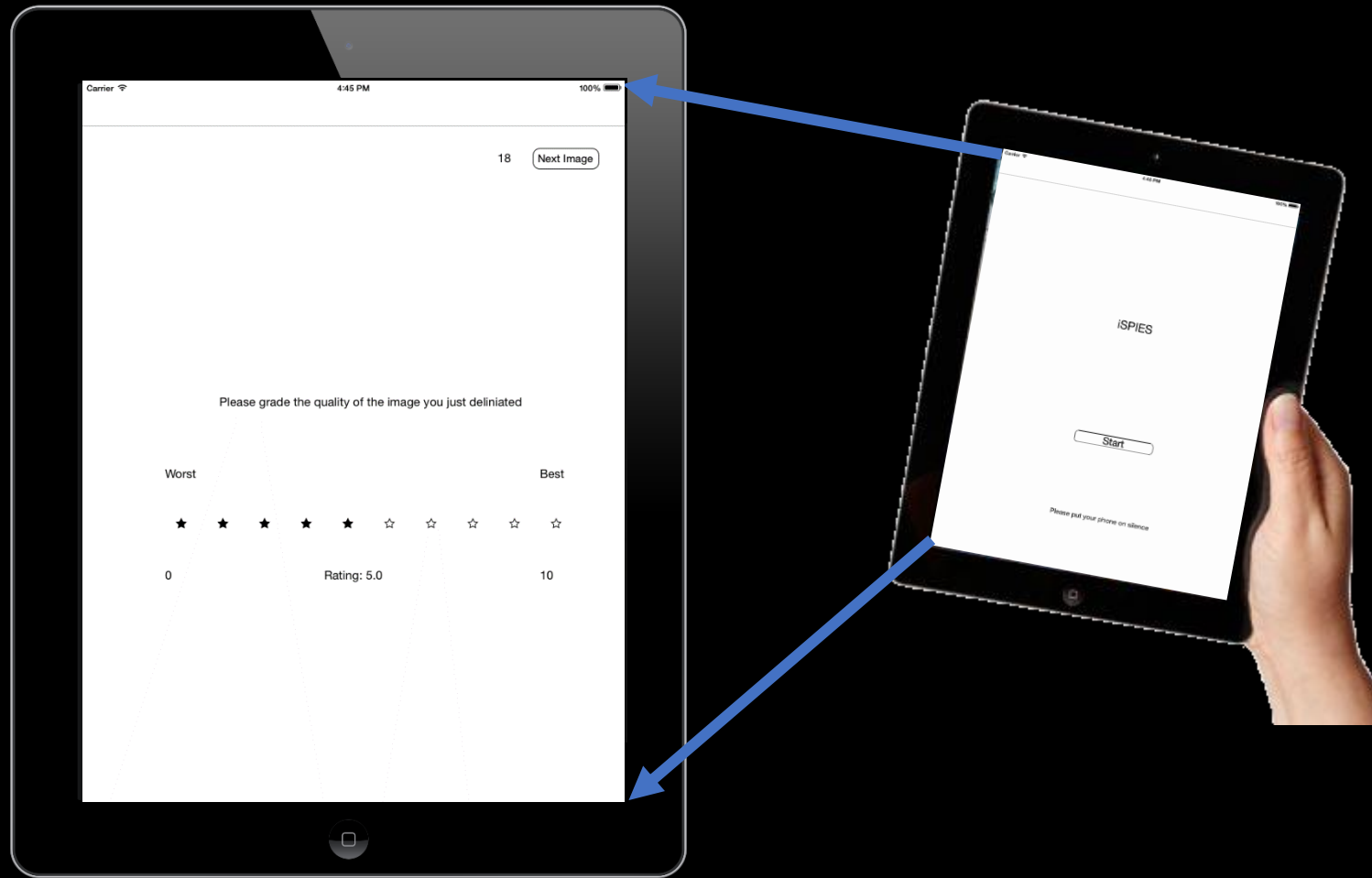
Spectra A

Spectra B

*Guido M Kamphuis et al, Journal of endourology 2016*

*Guido M Kamphuis et al, J Cancer Sci Ther , 2016*

# iSPIES iPad App



*Guido M Kamphuis et al, Journal of endourology 2016*  
*Guido M Kamphuis et al, J Cancer Sci Ther , 2016*

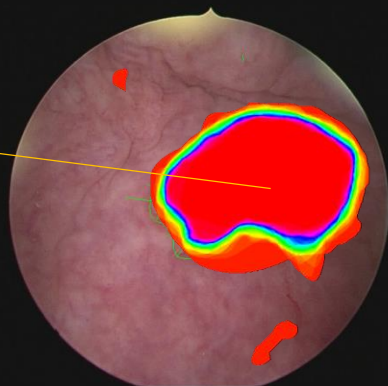
# PARTICIPATION BY $\pm$ 90 UROLOGISTS



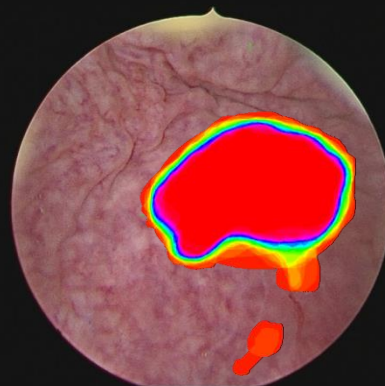
*Guido M Kamphuis et al, Journal of endourology 2016*  
*Guido M Kamphuis et al, J Cancer Sci Ther , 2016*

# DELINEATON RESULTS FROM 90+ UROLOGISTS

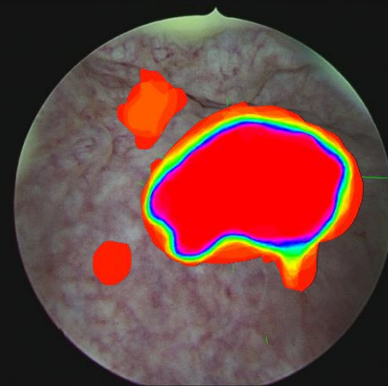
From all delineations  
we calculate the  
overlap and standard  
deviation



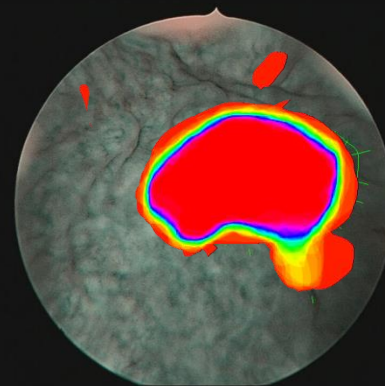
NORMAL



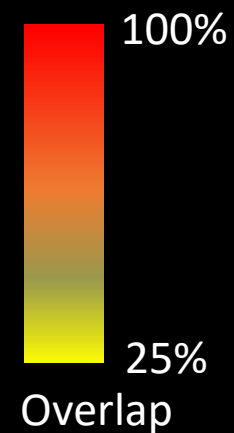
CLARA CHROMA



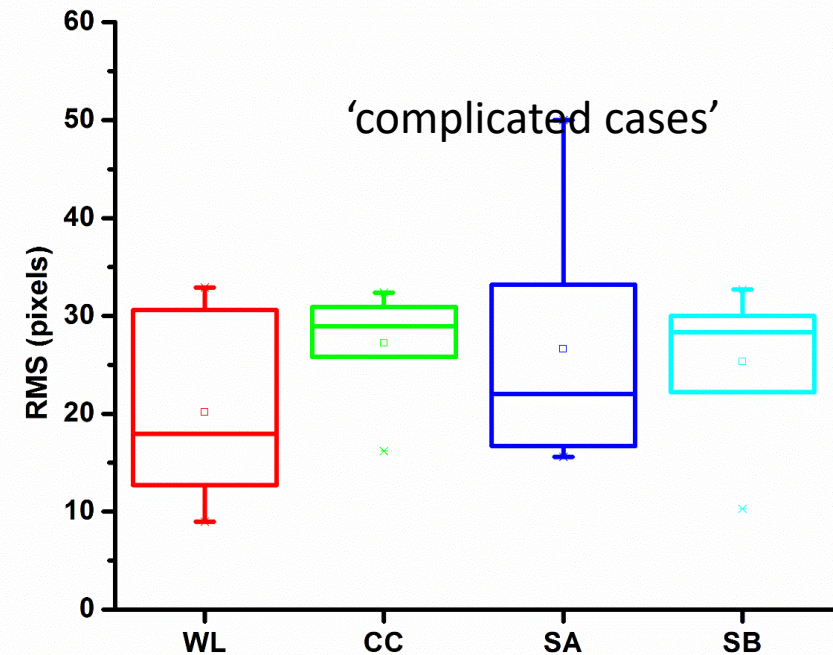
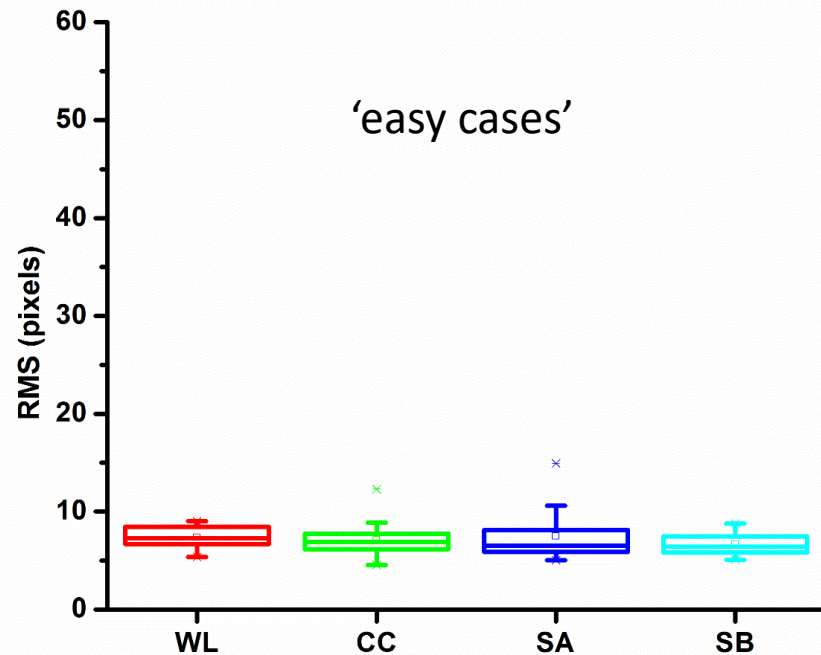
SPECTRA A



SPECTRA B



# DELINEATON RESULTS FROM 90+ UROLOGISTS



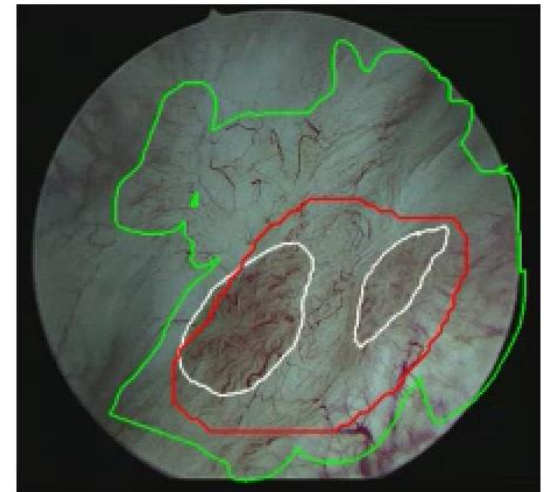
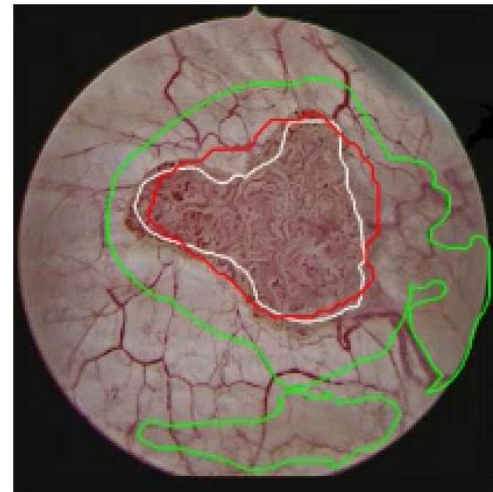
# Automatic recognition

- GOAL: AUTOMATIC regimentation of lesions
  - Support Vector Machine (SVM)
  - Decision Tree (DT)
  - Random Forest (RF) classifier

# First results using Automatic recognition

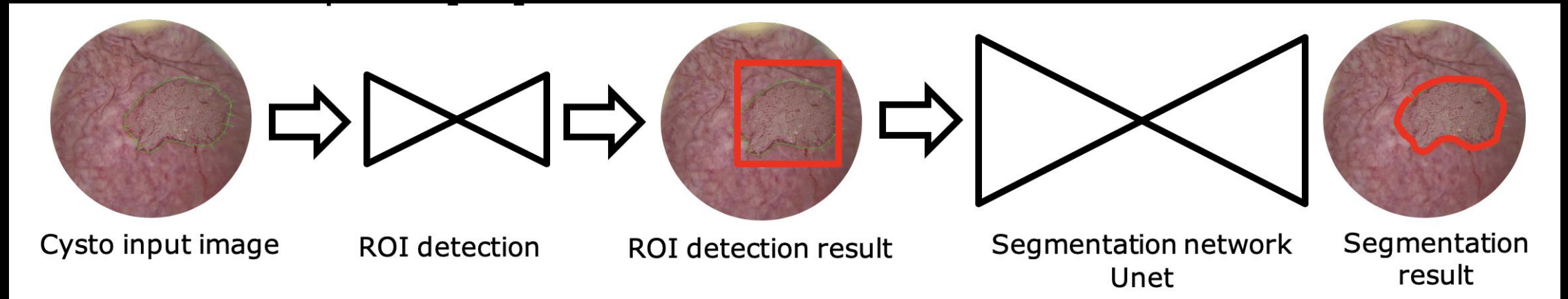
Metric	"AUC all"			"AUC no ambiguous"			JIGS		
Classifier	SVM	RF	DT	SVM	RF	DT	SVM	RF	DT
CC	0.69	0.70	0.64	0.74	0.79	0.68	60%	56%	56%
SA	0.66	0.59	0.52	0.74	0.64	0.57	53%	44%	48%
SB	<b>0.81</b>	0.71	0.70	<b>0.90</b>	0.79	0.77	<b>65%</b>	52%	59%
WL	0.73	0.71	0.72	0.80	0.77	0.76	61%	54%	61%

**Table 2: Segmentation comparison of the different modalities and classifiers.**



# Neural network for segmentation

## The ENDURO project



# NOVEL DIAGNOSTICS IN THE BLADDER AND UPPER TRACT

➤ Narrow Band Imaging (NBI, Olympus)

➤ Storz Profesional Image Enhancement System (SPIES, Storz)

**FINDING**  
**A SUSPECTED LESION**

➤ Confocal Laser Endomicroscopy (CLE, Mauna Kea Tech)

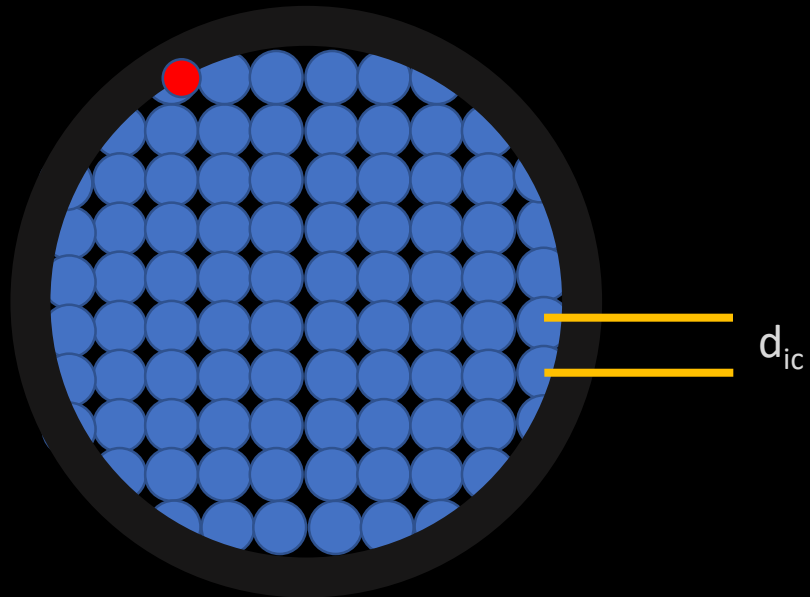
➤ Optical Coherence Tomography (OCT, St. Jude)

➤ Endoluminal Ultrasound (ELUS, Volcano)

**DIFFERENTIATING**  
**A SUSPECTED LESION**



# Background



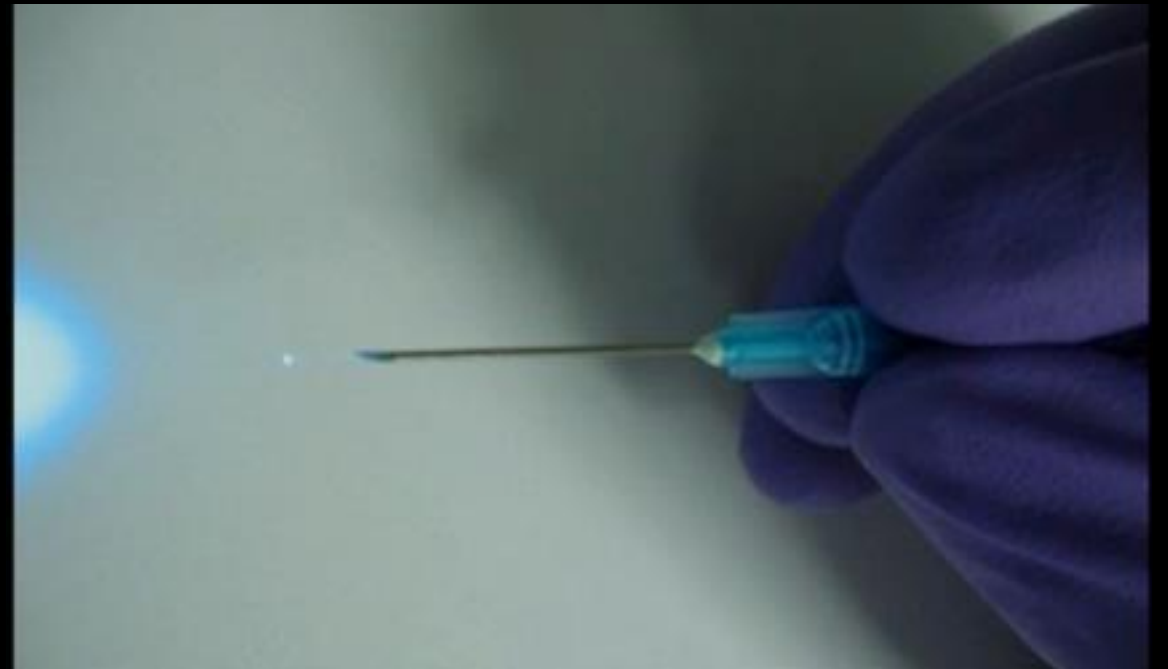
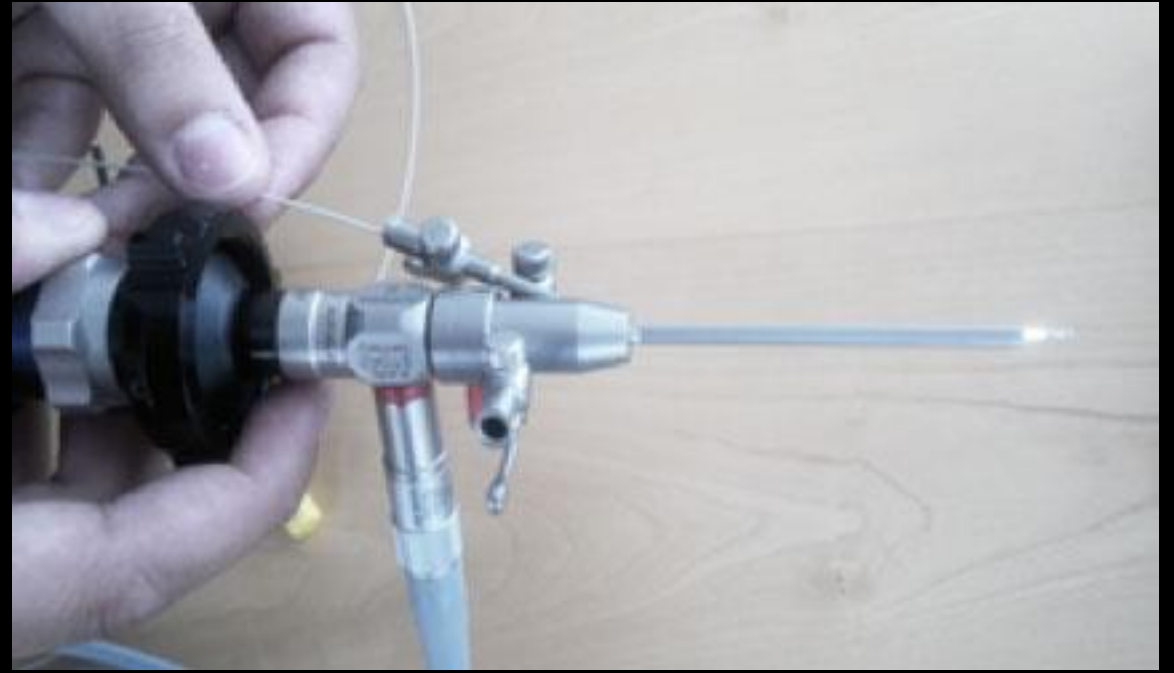
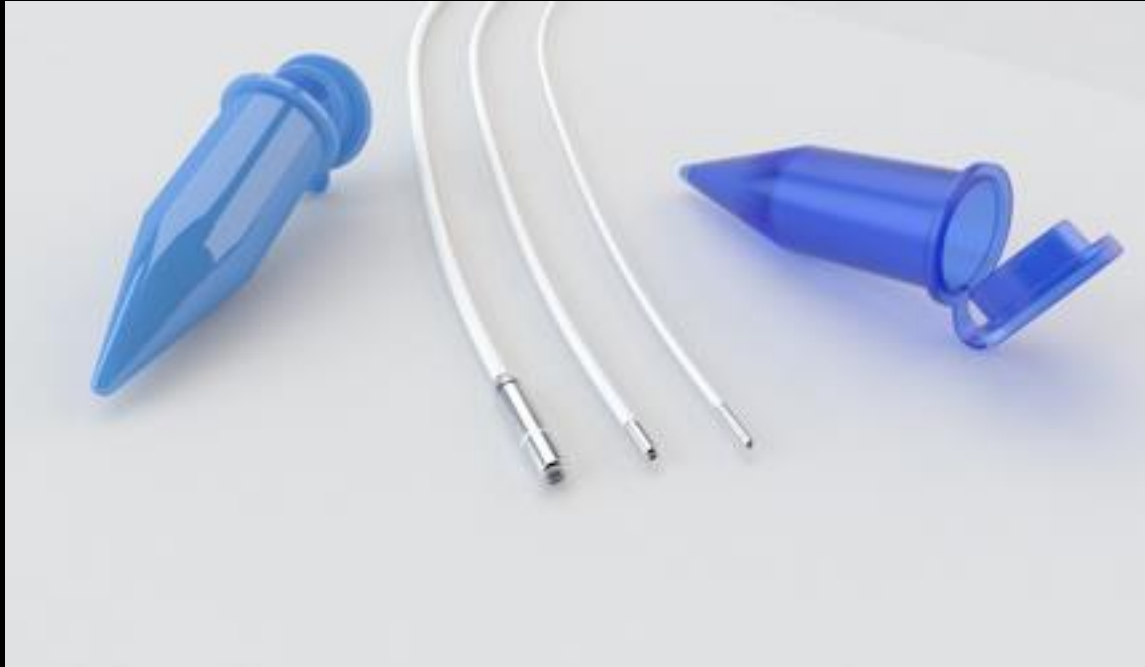
$$\text{Lateral resolution} = \frac{2 \times d_{ic}}{M}$$

Operating wavelength = 488 nm

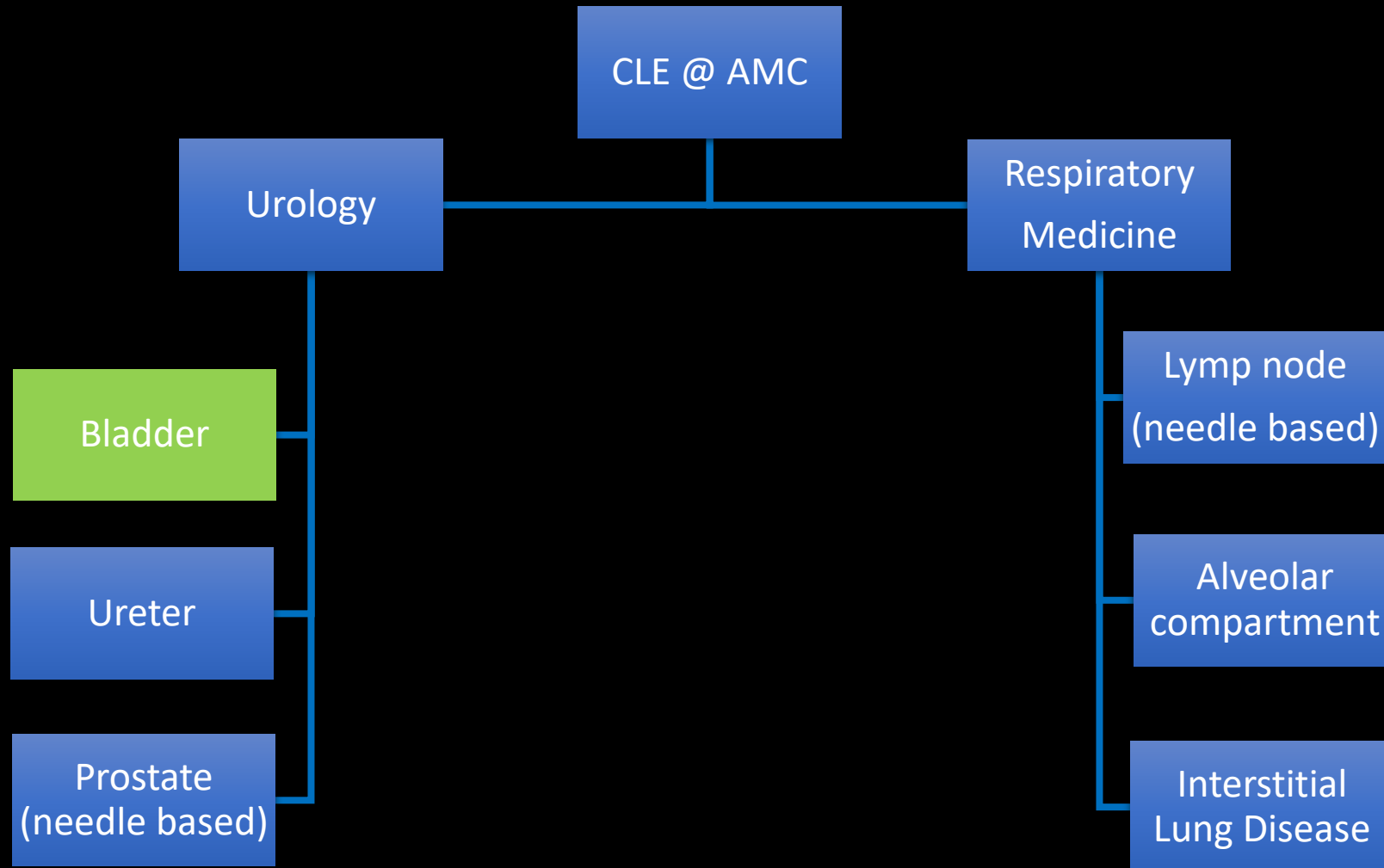
Scanning frequency = 4 kHz

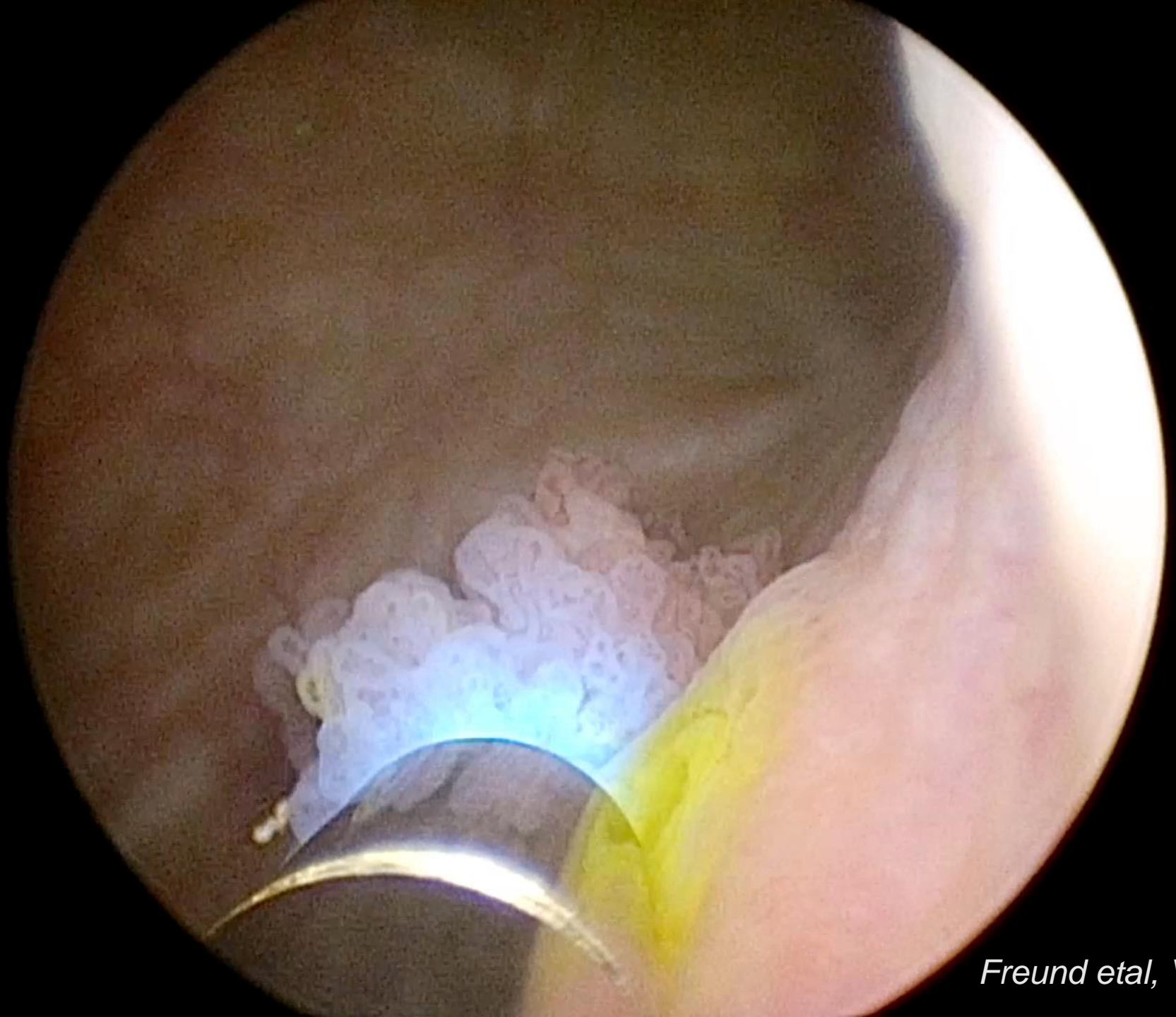


# Background



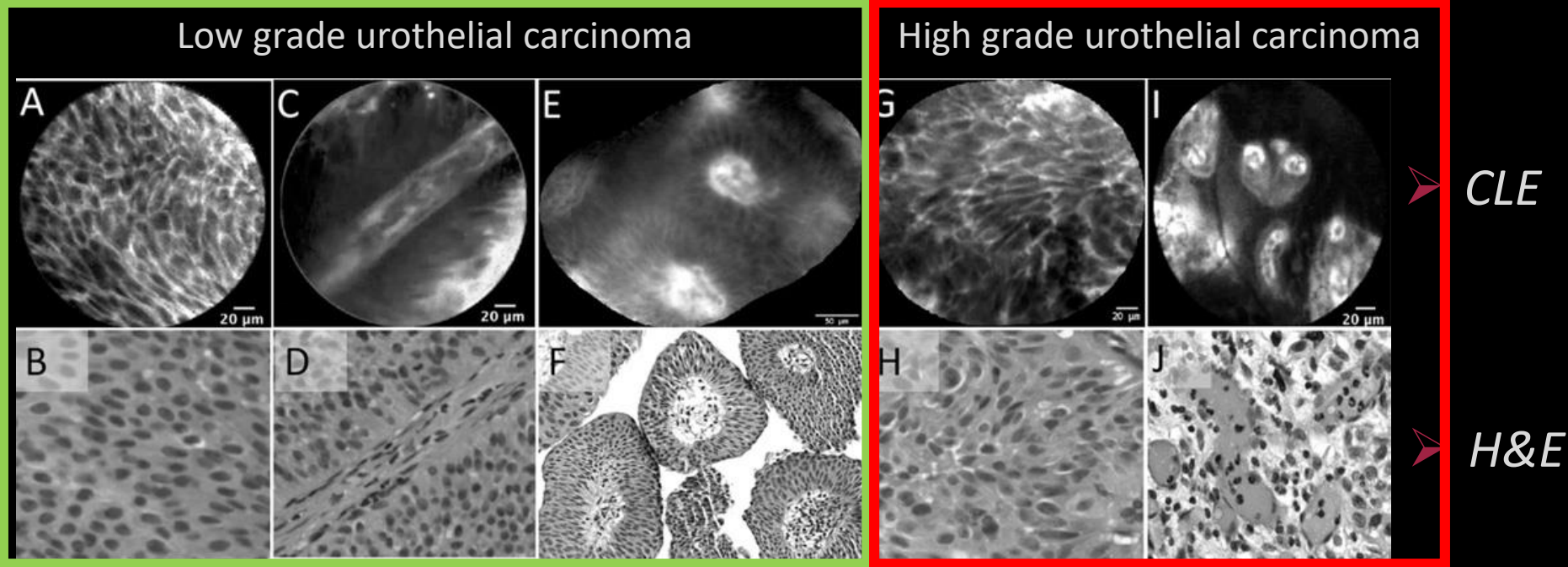
# Studies @ AMC





# confocal laser endomicroscopy (CLE)

Liem et al, JMIR research protocols, 2018  
Liem et al, Eur Uro Focus, 2018



Papillary
Polarity
Organisation
Cohesiveness
Morphology
Borders
Vasculature

Yes / No

Crowding of uniform-appearing cells

Fibrovascular stalk with a thickened endothelial layer

fibrovascular stalk containing erythrocytes in the vascular core

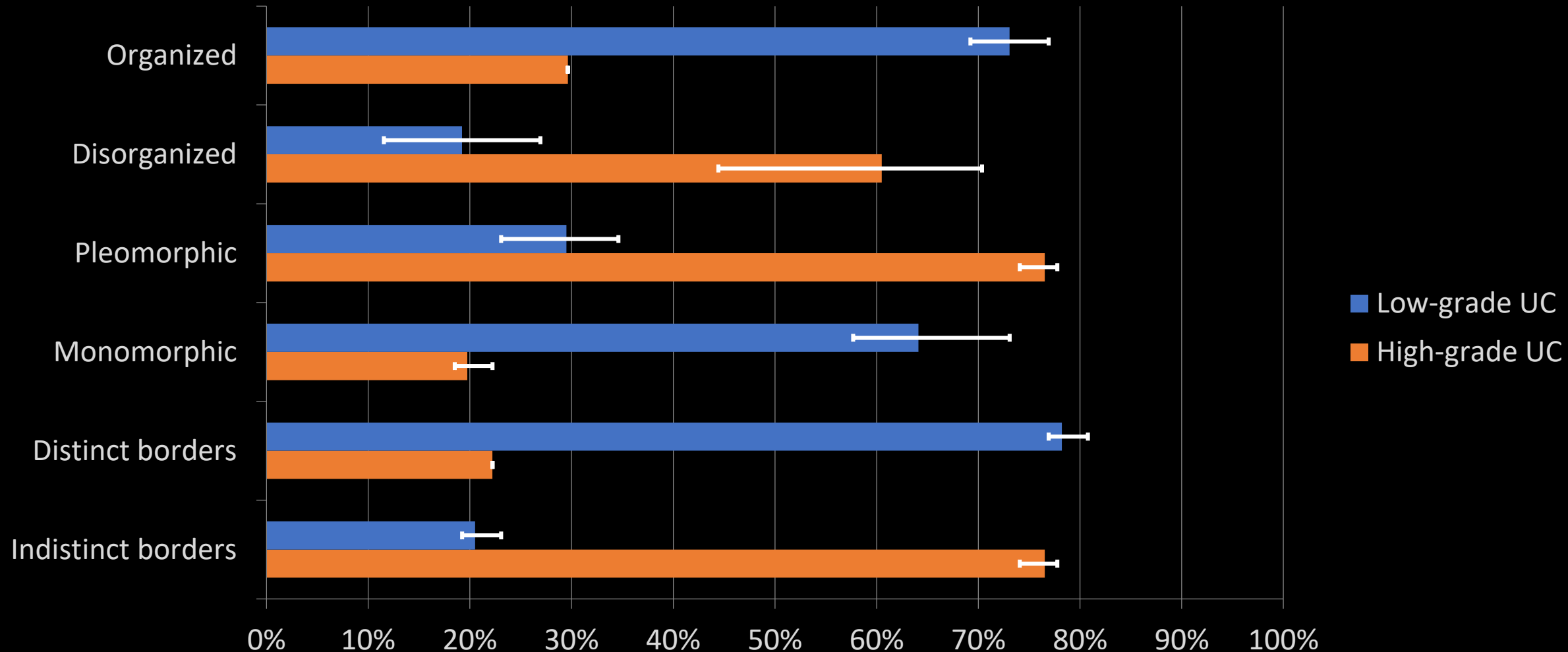
Pleomorphic and distorted sheet of cells

Distorted fibrovascular stalk with variably sized vascular cores.

Wu et al, Urology. Jul 2011; 78(1): 225–231.

# Most Prominent features differentiating LG from HG (n=67)

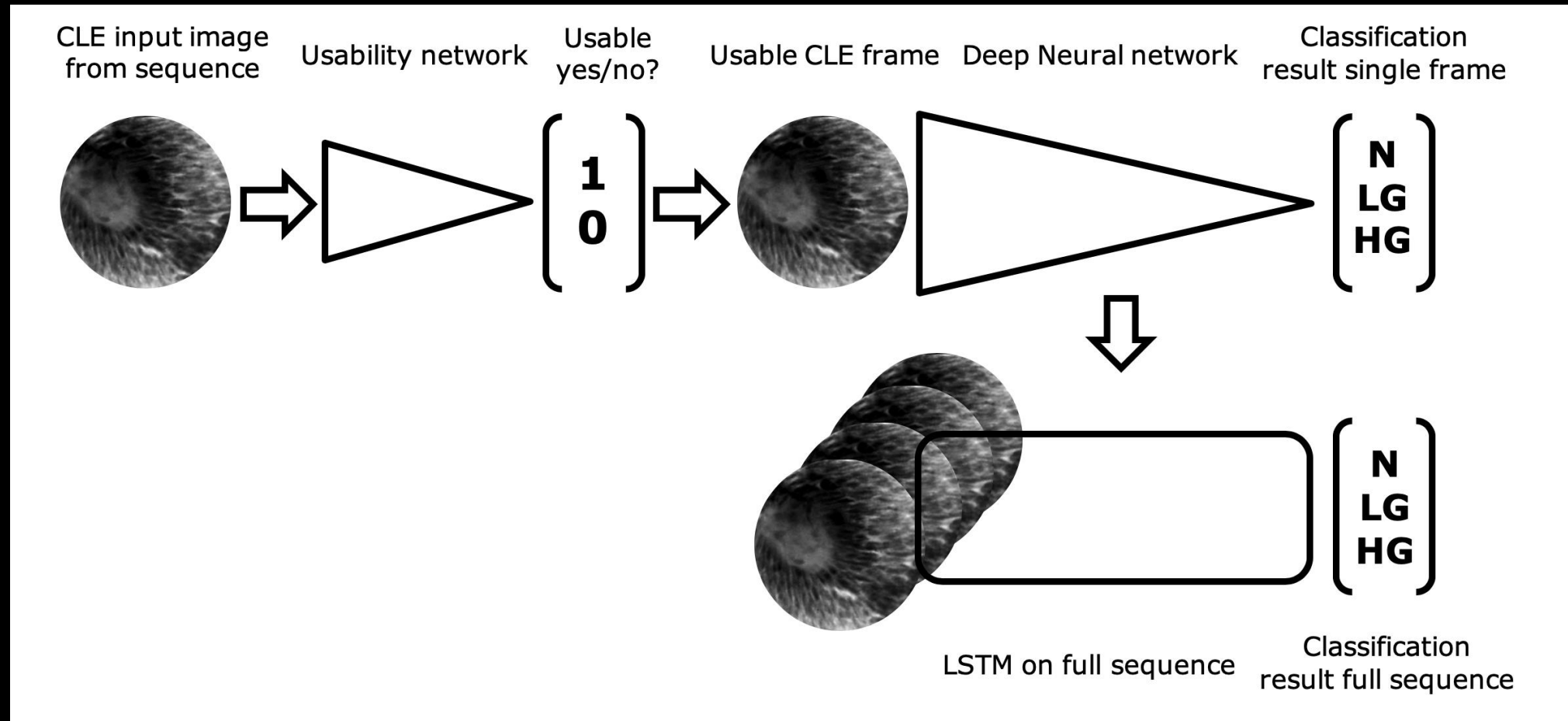
*Liem et al, Eur Uro Focus, 2018*



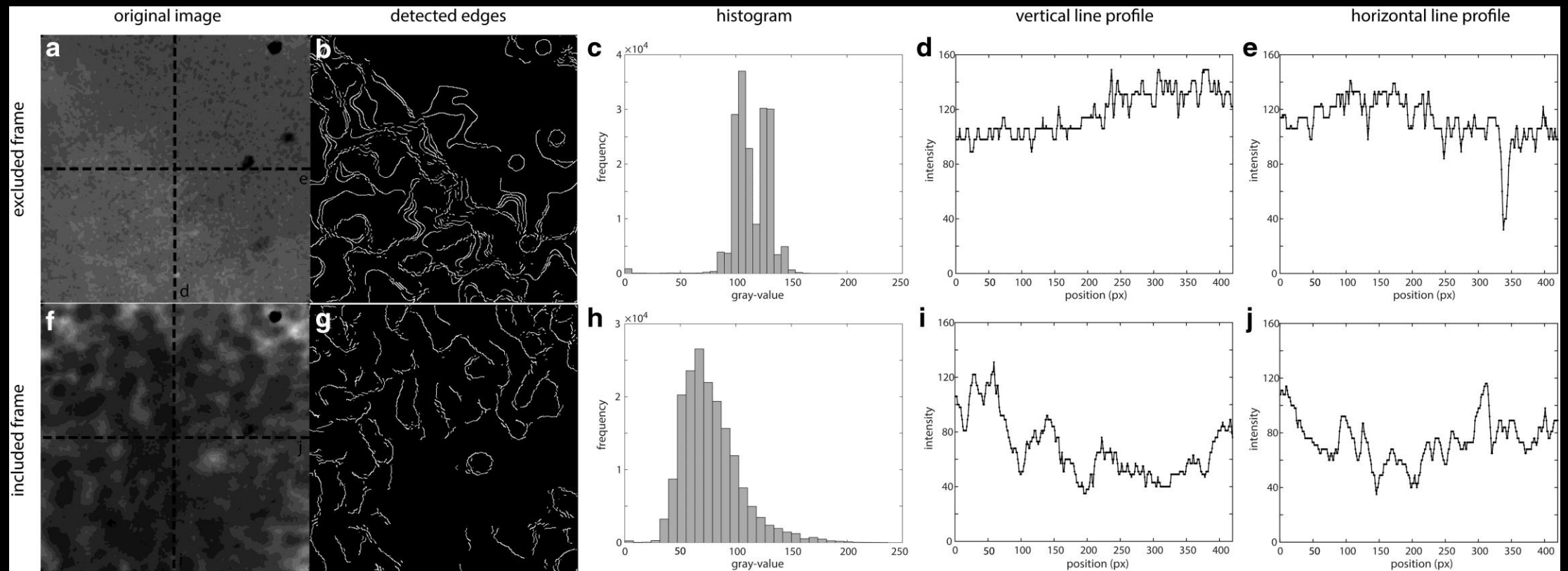
# Reducing subjectivity: Artificial Intelligence

- All available CLE bladder data is used
  1. Image preprocessing
  2. Automatic Frame selection
  3. Classification using a recurrent neural network (RNN)
    - a) Healthy and benign vs tumor
  4. Feature extraction using Imagenet pretrained networks
    - a) Inception V3
    - b) Xception
    - c) Inception Resnet V2
  5. Sequence analysis using a long-short-term-memory (LSTM)
    - a) Low grade vs High Grade

# Reducing subjectivity: Artificial Intelligence



# Reducing subjectivity: Artificial Intelligence



# Reducing subjectivity: Healthy and benign vs tumor

Table 1. Results of Differentiation of Healthy Tissue and Benign Tumors from Malignant Tissue

	Sensitivity (%)			Specificity (%)			Accuracy (%)			AUC		
	#1	#2	#3	#1	#2	#3	#1	#2	#3	#1	#2	#3
Inception	82	77	71	55	88	100	68	81	83	0.66	0.91	0.89
V3	77			81			77			0.82		
Inception ResNet	82	85	79	55	75	100	68	81	87	0.76	0.74	0.92
V2	82			77			79			0.81		
Xception	73	69	57	73	88	89	73	76	70	0.74	0.88	0.84
	66			83			73			0.82		

# Reducing subjectivity: Low grade vs High Grade

Table 2. Results of the Classification of Low-Grade and High-Grade Papillary Urothelial Carcinoma of the Bladder

<i>Experiment (# of lesions)</i>	<i>Sens (%)</i>	<i>Spec (%)</i>	<i>Acc (%)</i>	<i>PPV (%)</i>	<i>NPV (%)</i>	<i>AUC</i>
1 (4HG 8LG)	75	88	83	75	88	0.94
2 (4HG 8LG)	100	88	92	80	100	0.88
3 (6HG 8LG)	67	75	71	67	75	0.75
<b>Average</b>	<b>81</b>	<b>84</b>	<b>82</b>	<b>74</b>	<b>88</b>	<b>0.86</b>

Sensitivity (Sens), specificity (Spec), and accuracy (Acc) are given for each experiment, together with the PPV, NPV, and AUC. The average of all the experiments is also given.

HG = high-grade; LG = low-grade; NPV = negative predictive value; PPV = positive predictive value.

# NOVEL DIAGNOSTICS IN THE BLADDER AND UPPER TRACT

➤ Narrow Band Imaging (NBI, Olympus)

➤ Storz Profesional Image Enhancement System (SPIES, Storz)

**FINDING**  
**A SUSPECTED LESION**

➤ Confocal Laser Endomicroscopy (CLE, Mauna Kea Tech)

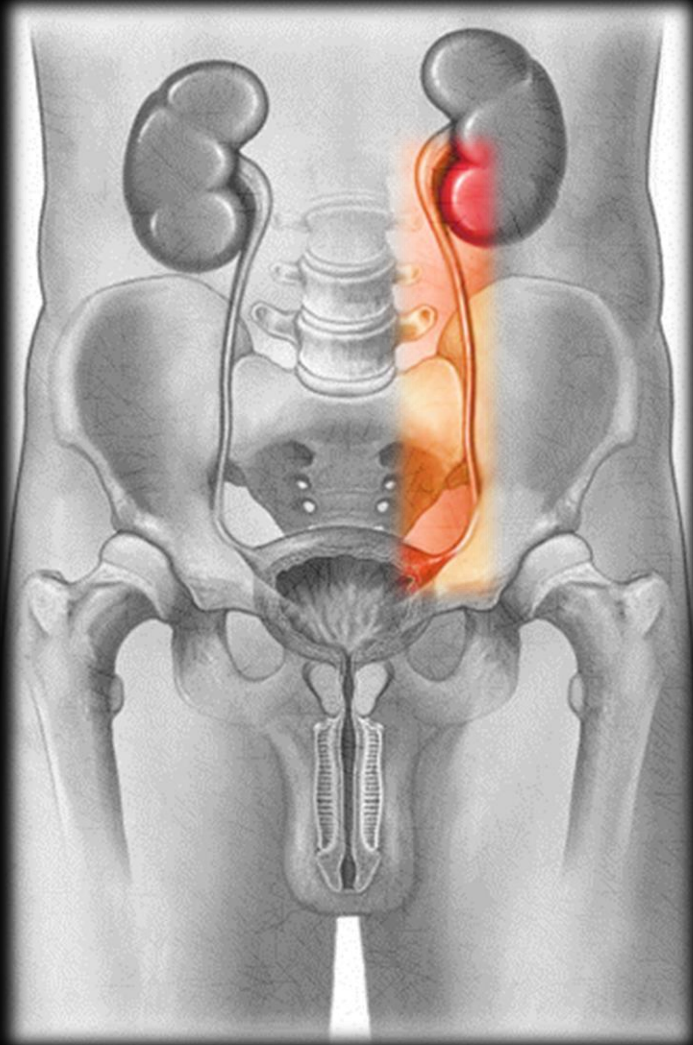
➤ Optical Coherence Tomography (OCT, St. Jude)

➤ Endoluminal Ultrasound (ELUS, Volcano)

**DIFFERENTIATING**  
**A SUSPECTED LESION**

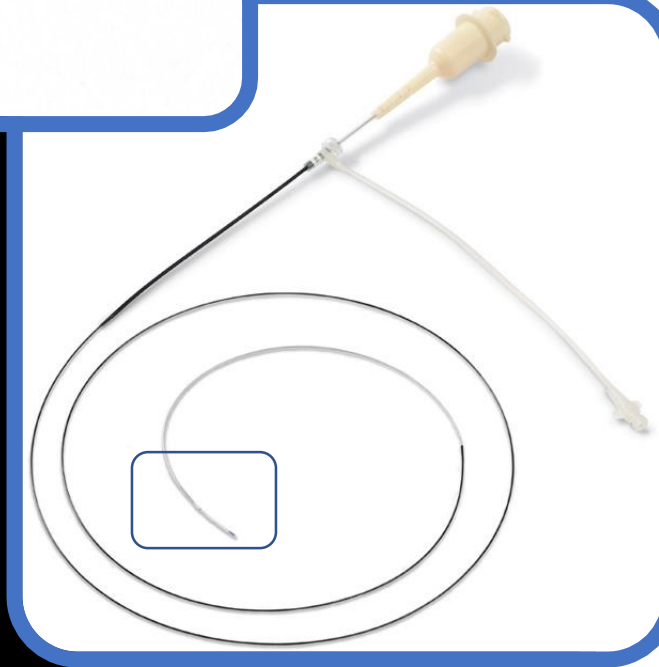


# OCT in Urology: Ureter



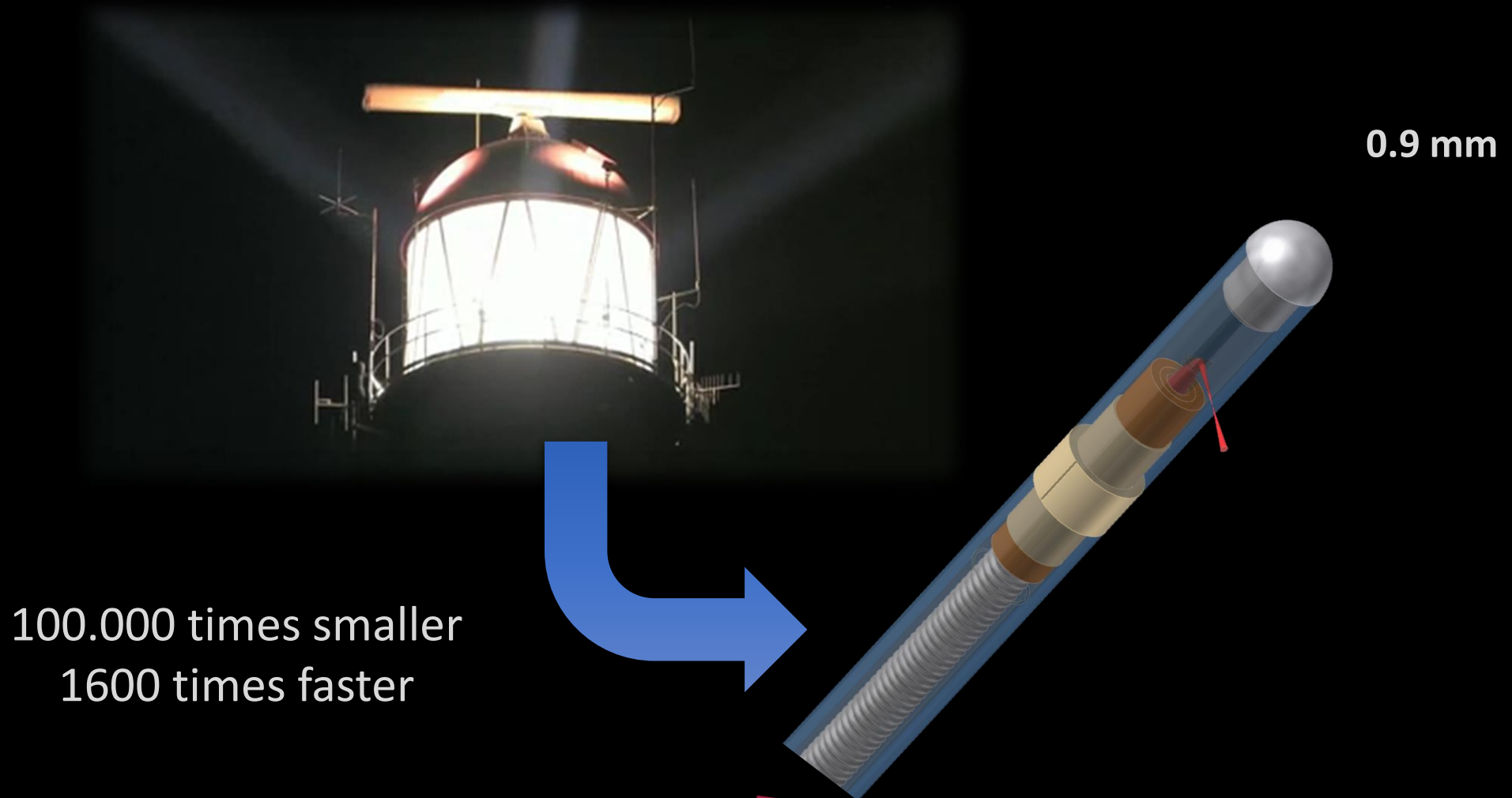
*Bus et al, Jour of Uro, 2016*

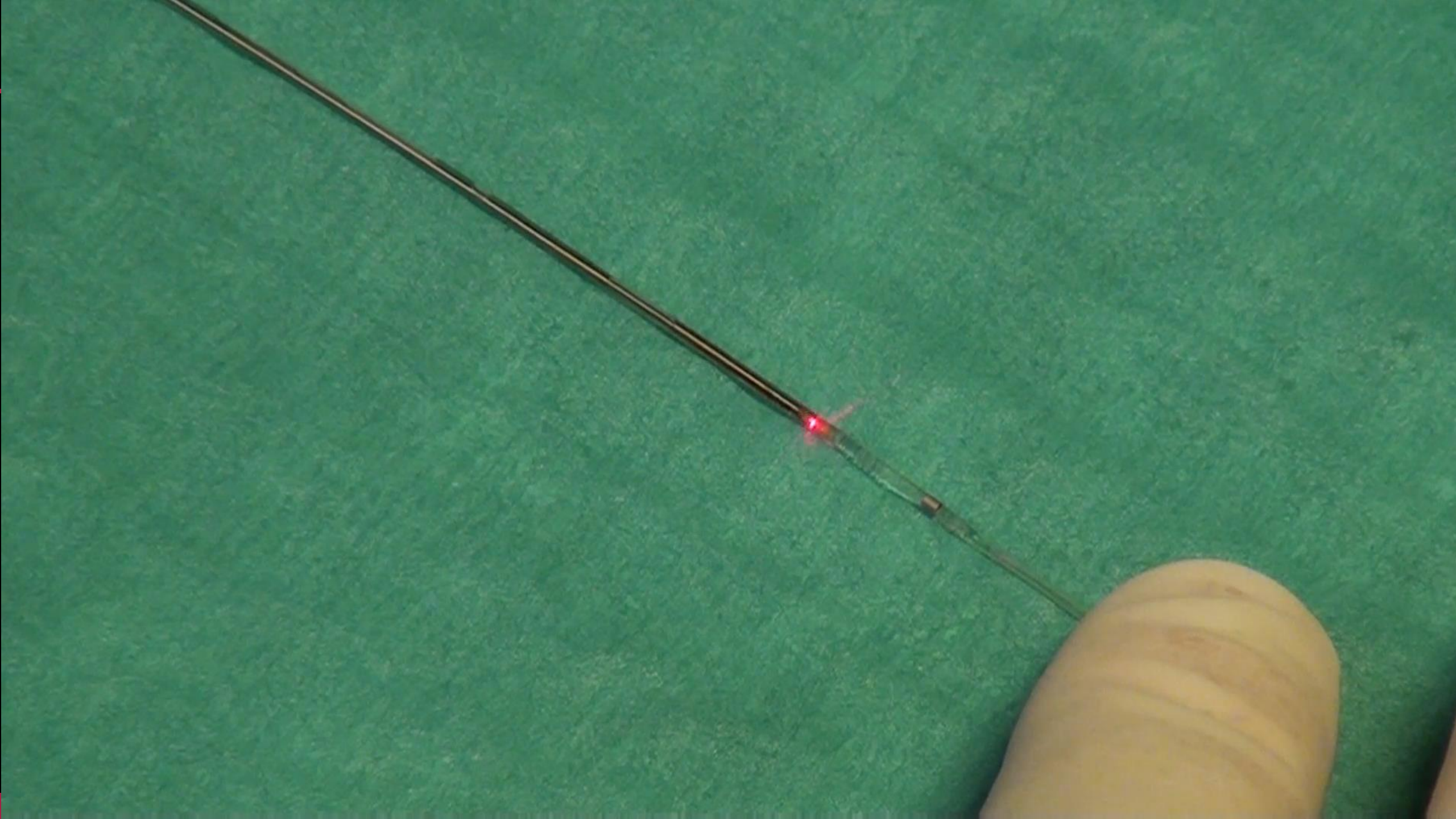
# OCT in Urology: Ureter



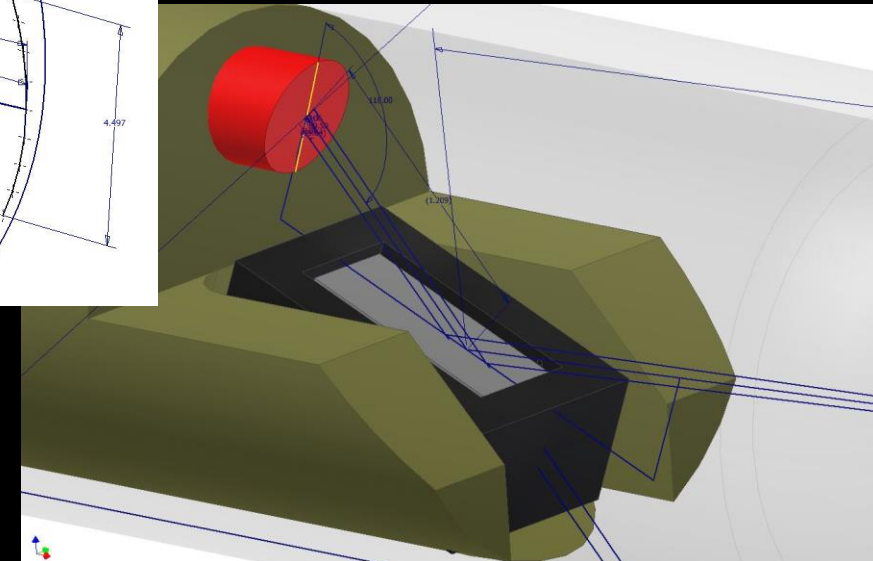
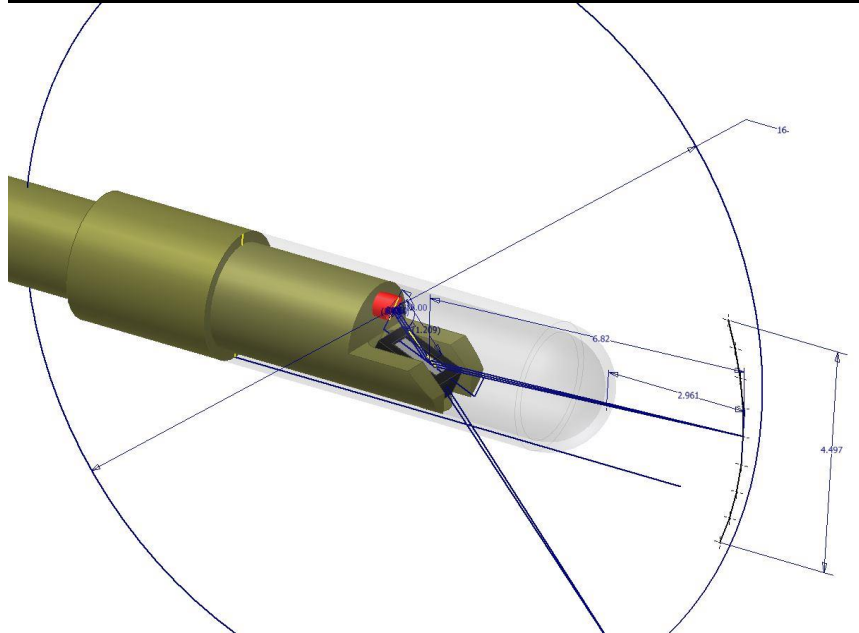
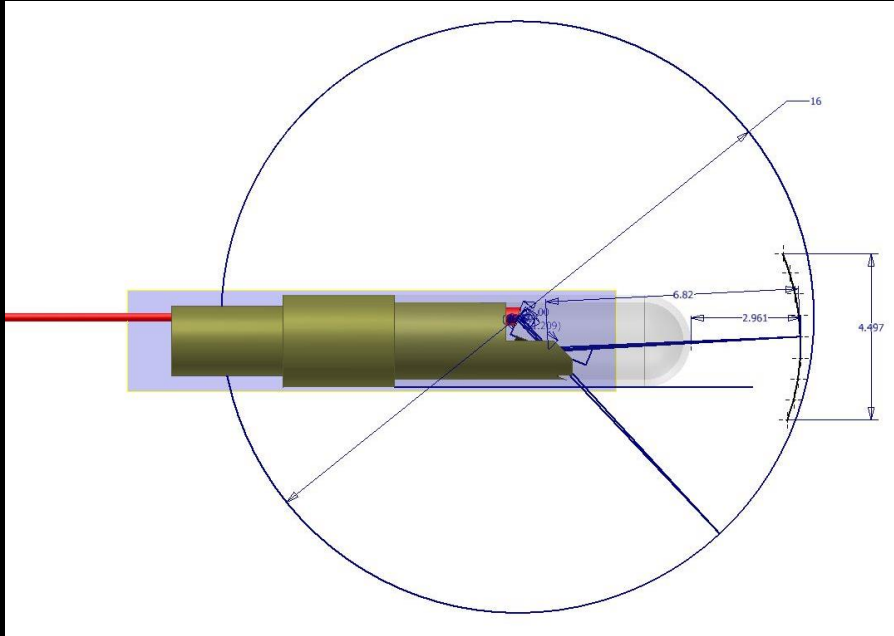
# Going endoscopic

## Development of small scale catheters

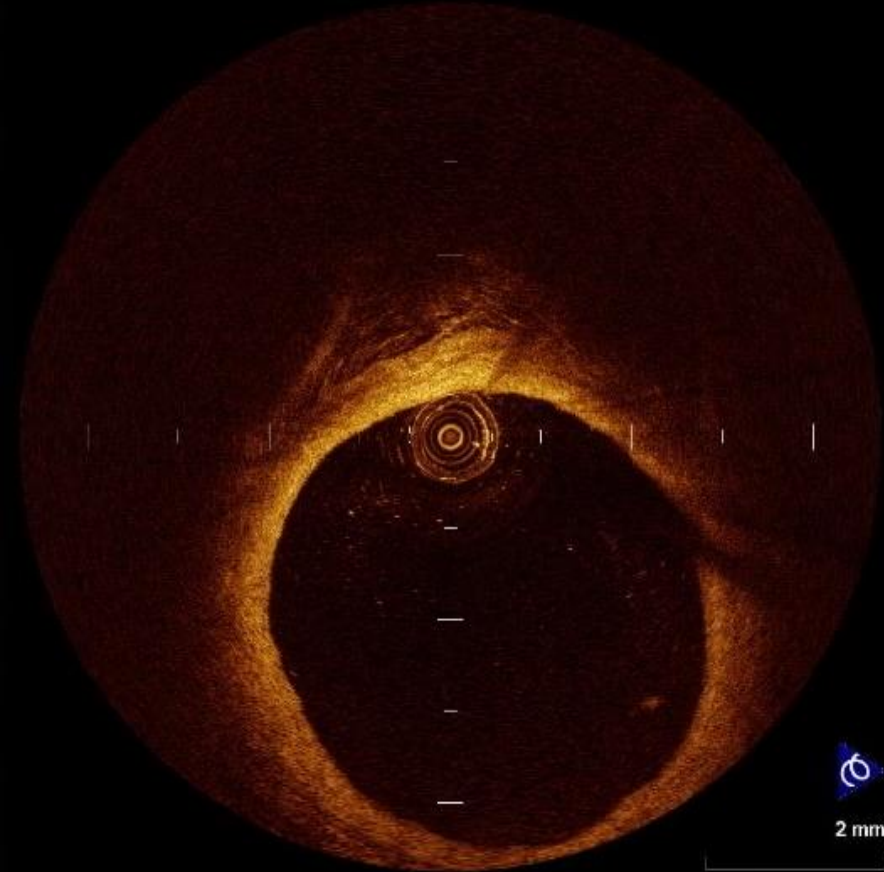




# FORWARD LOOKING PROBE DEVELOPMENT FOR THE BLADDER

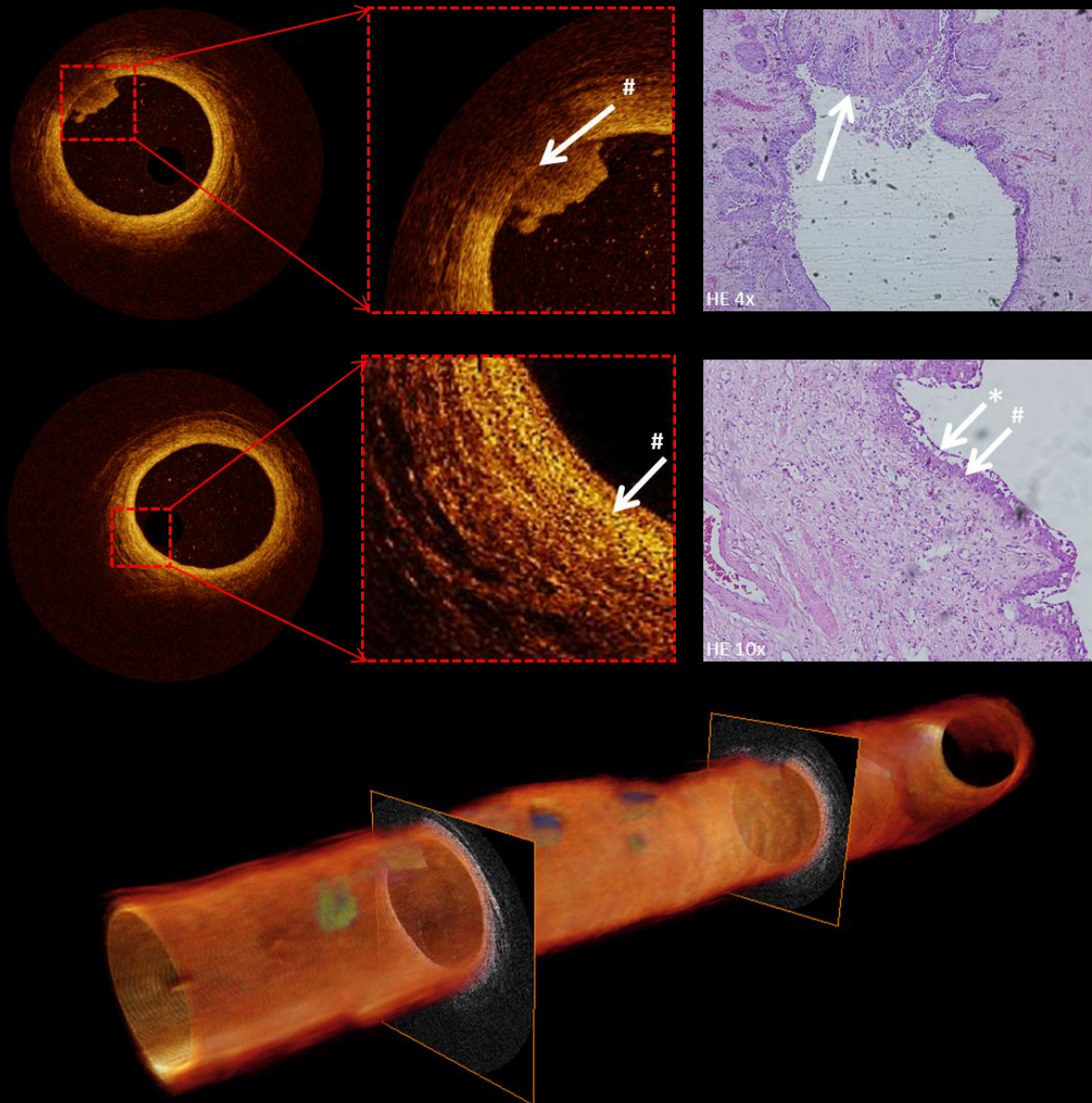


# OCT in Urology: Ureter



*Bus et al, Jour of Uro, 2016*

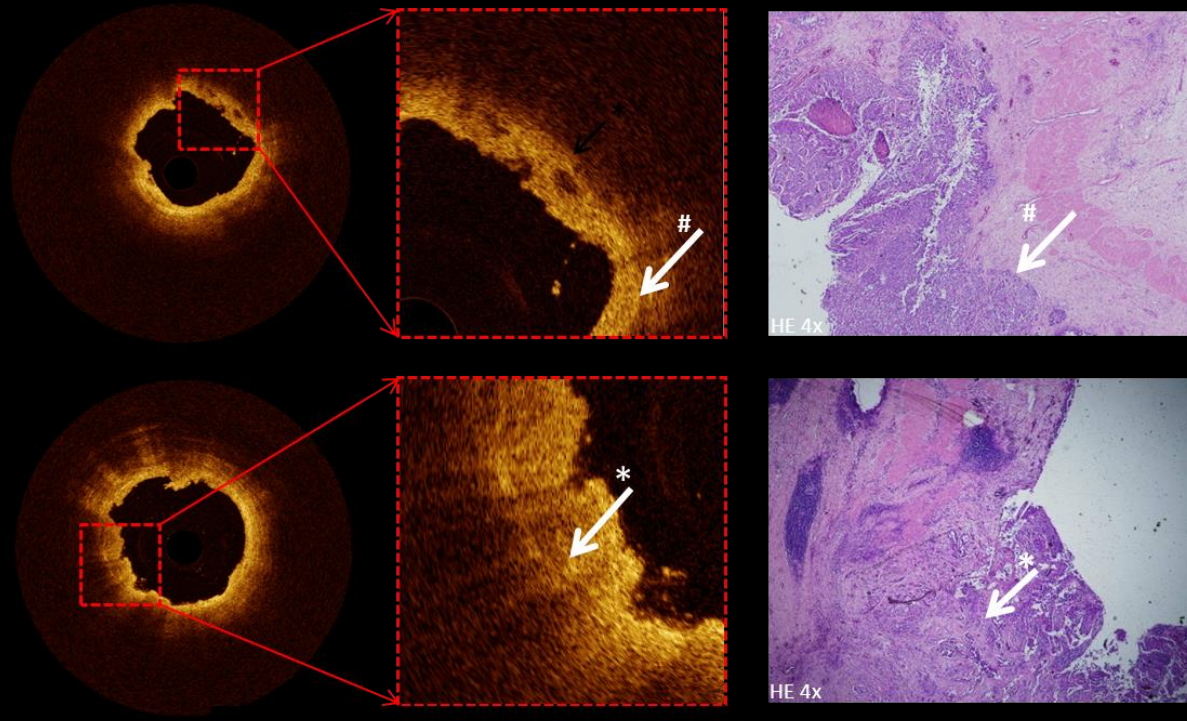
# optical coherence tomography (OCT)



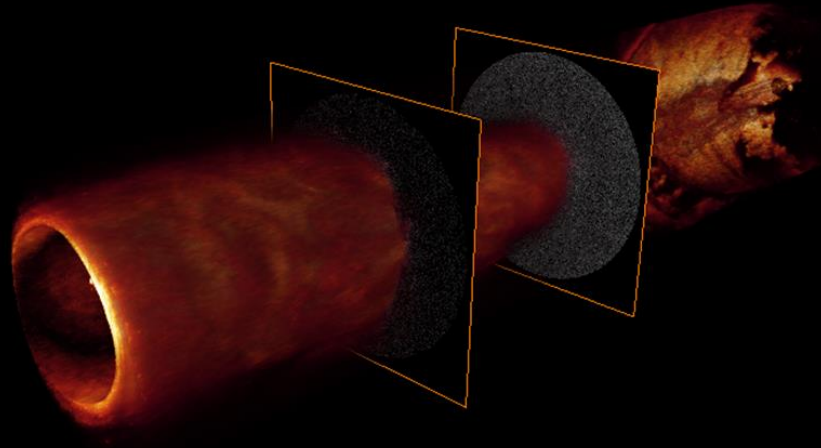
**LOW STAGE: TA, G1-2**

*Bus et al, Jour of Uro, 2016*

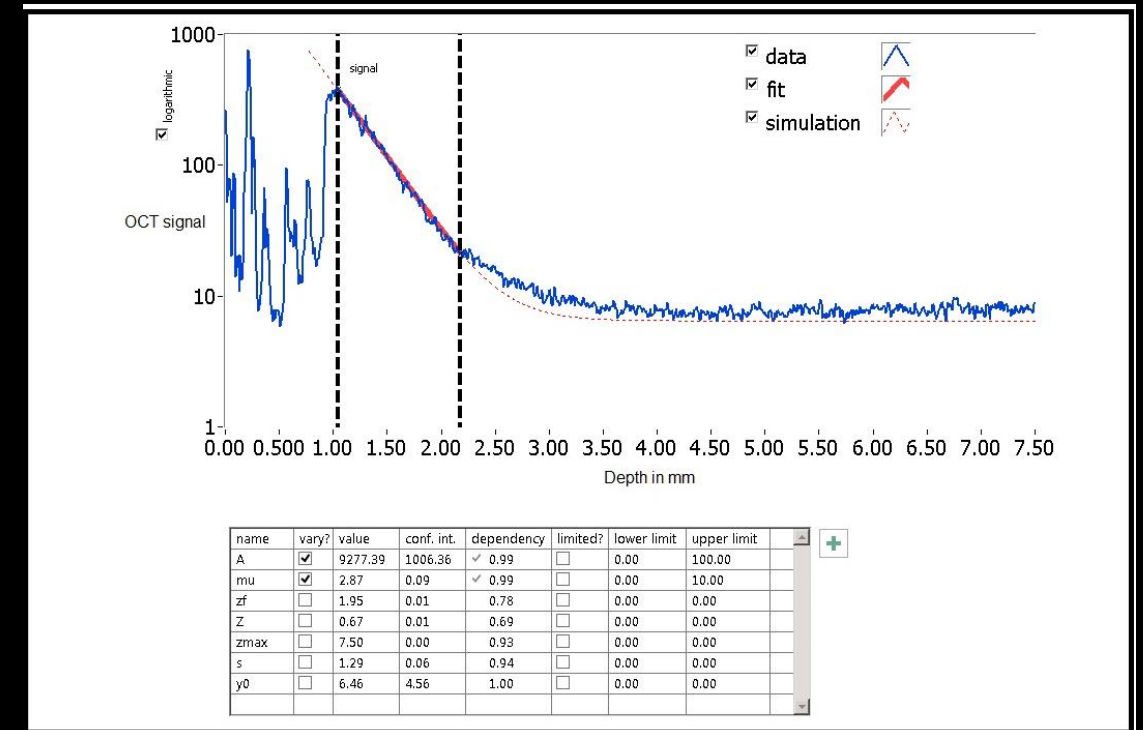
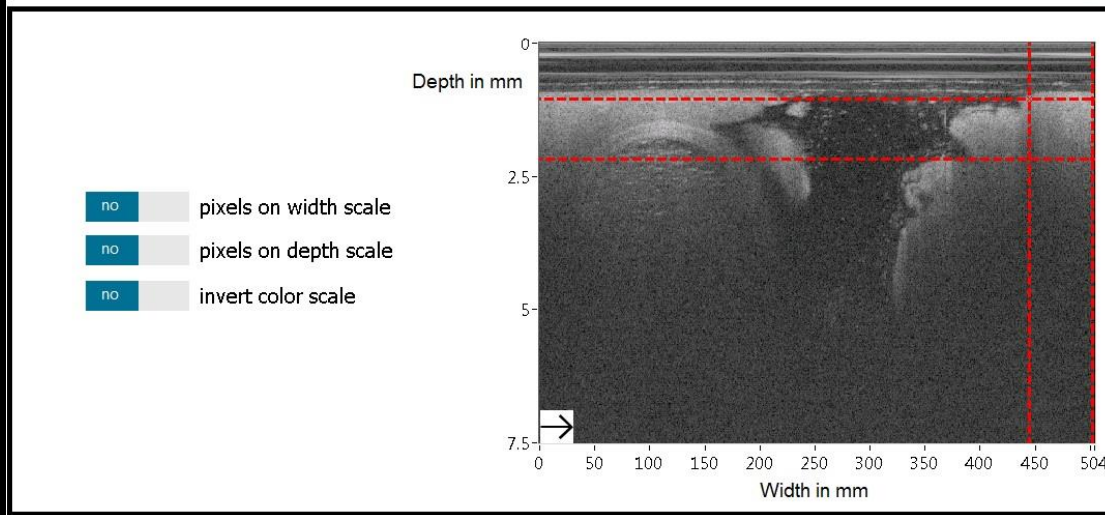
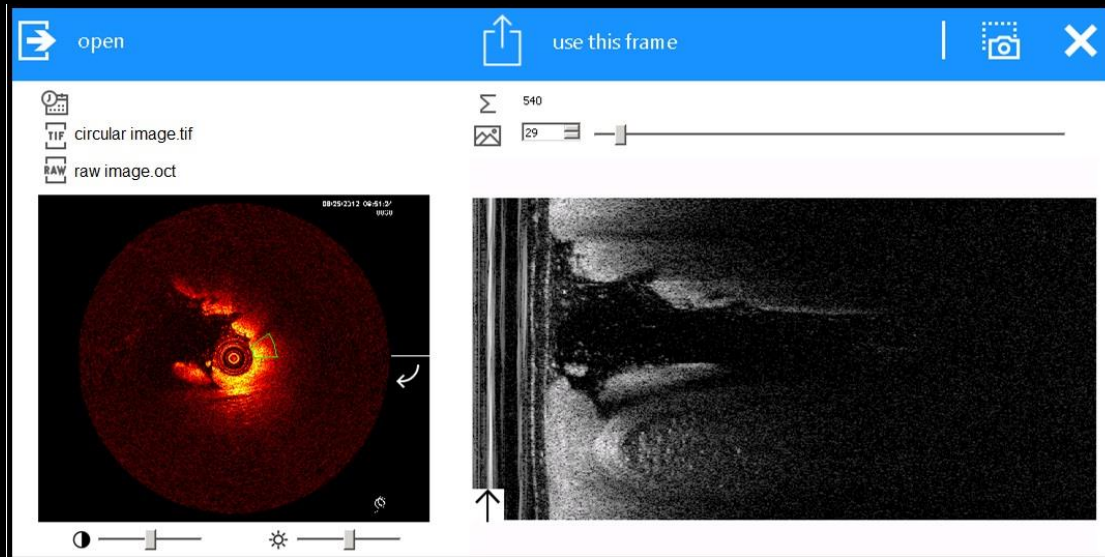
# optical coherence tomography (OCT)



**HIGH STAGE: T3, G3**



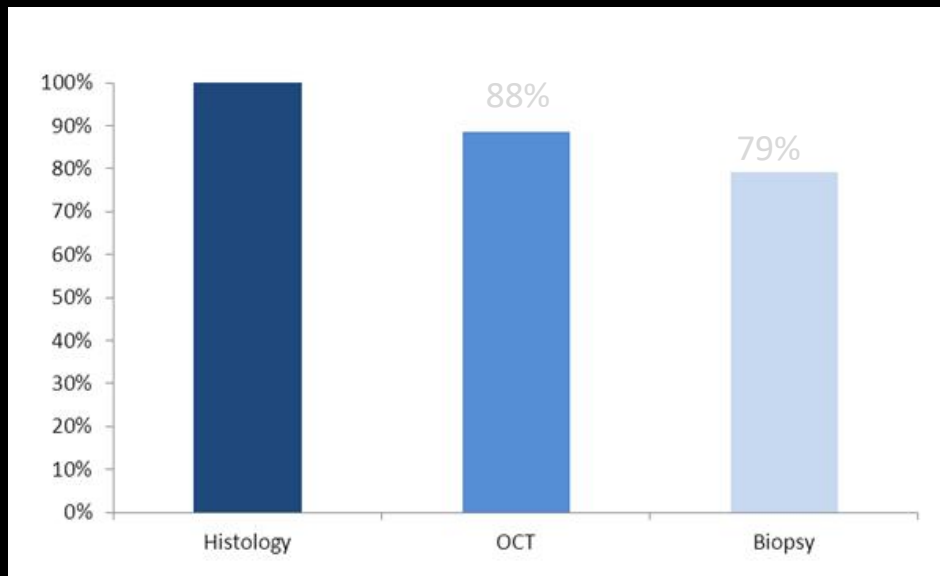
*Bus et al, Jour of Uro, 2016*



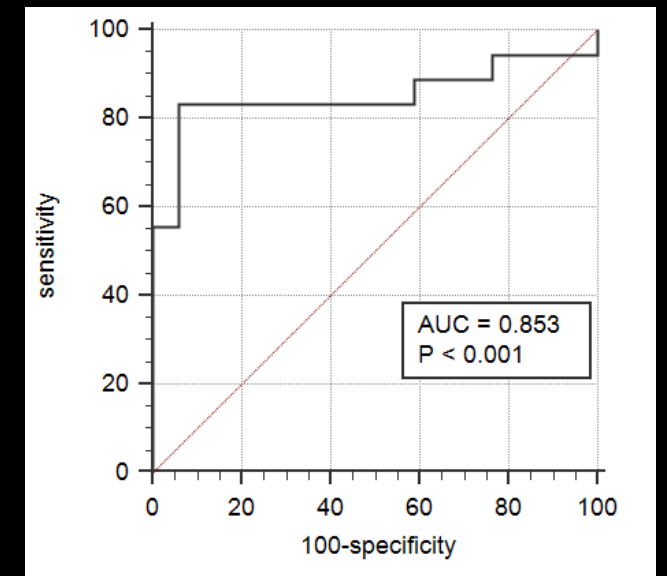
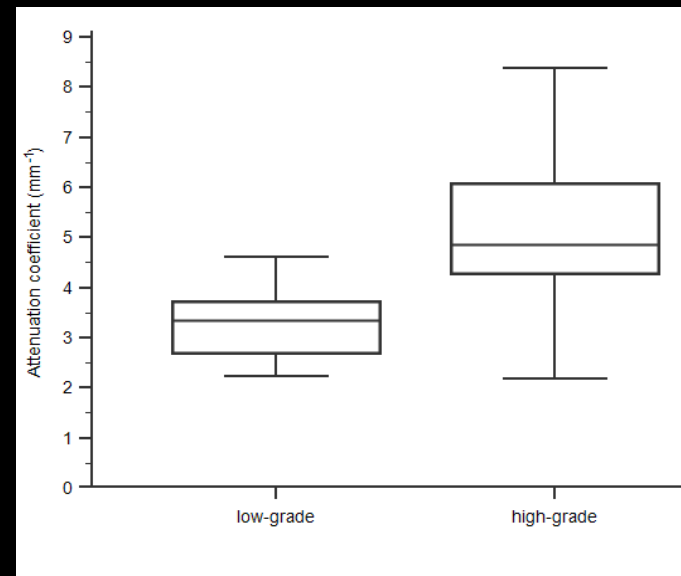
*Bus et al, Jour of Uro, 2016*  
*Freund et al, LISM, 2019 inpress*

# RESULTS ON GRADING

Non diagnostic vs diagnostic



Low grade vs high grade



*Bus et al, Jour of Uro, 2016*  
*Freund et al, LISM, 2019 in press*

# OCT END CLE IN THE EAU GUIDELINES FOR UTUC

Optical coherence tomography and confocal laser endomicroscopy (Cellvizio®) have been used *in vivo* to evaluate tumour grade and/or for staging purposes, with a promising correlation with definitive histology in high-grade UTUC [68,69]. Recommendations are listed in Section 5.5.

THE END

# This presentation was presented at EPIC Meeting on Photonics for Cancer Diagnostics and Treatment 2019

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