

# Reconstruction in wide-field interferometric microscopy for imaging weakly scattering biological nanoparticles with super-resolution

M. Selim Ünlü

Electrical Engineering,

Physics,

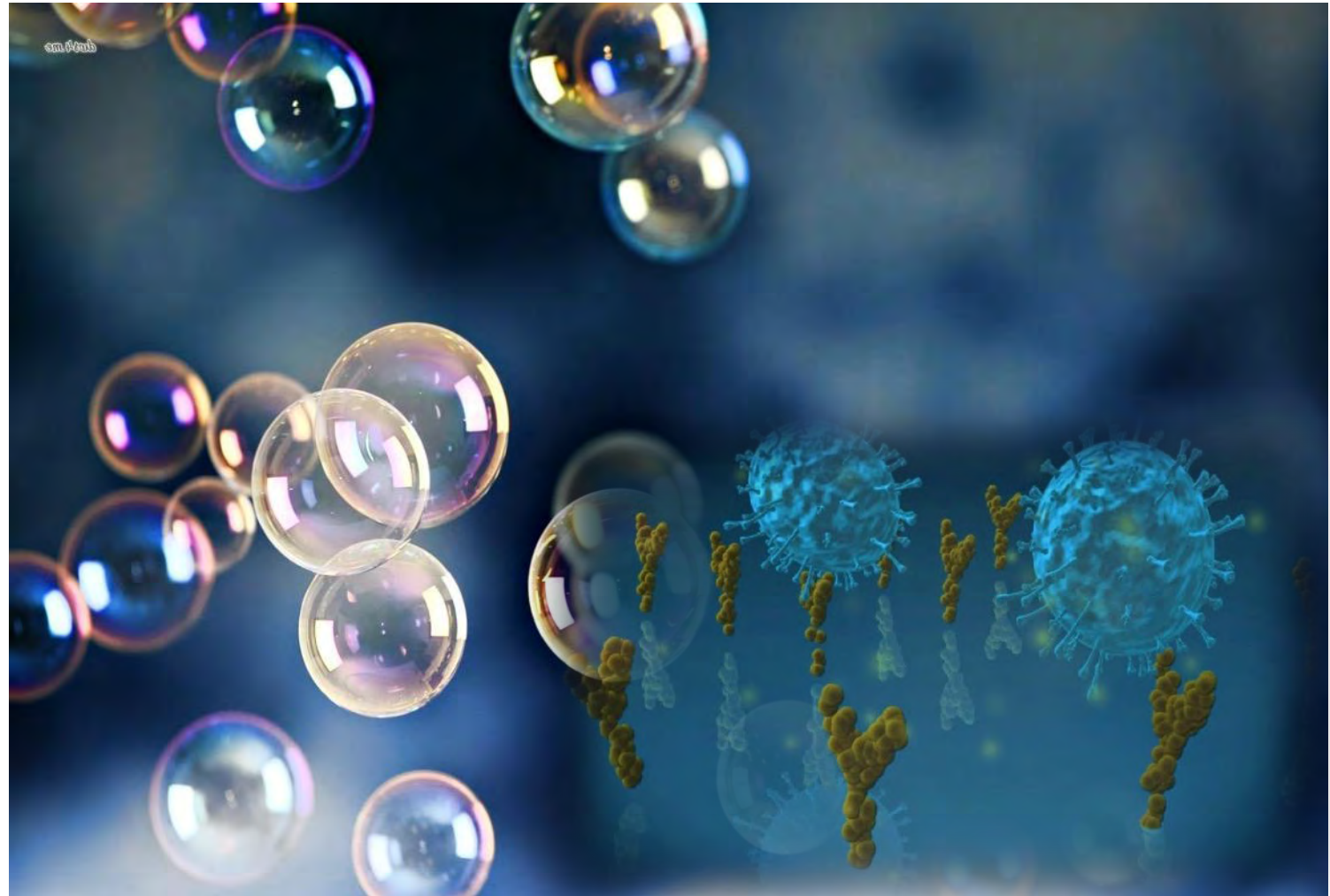
Biomedical Engineering

Graduate Medical Sciences

**BU**Nano

Photonics Center

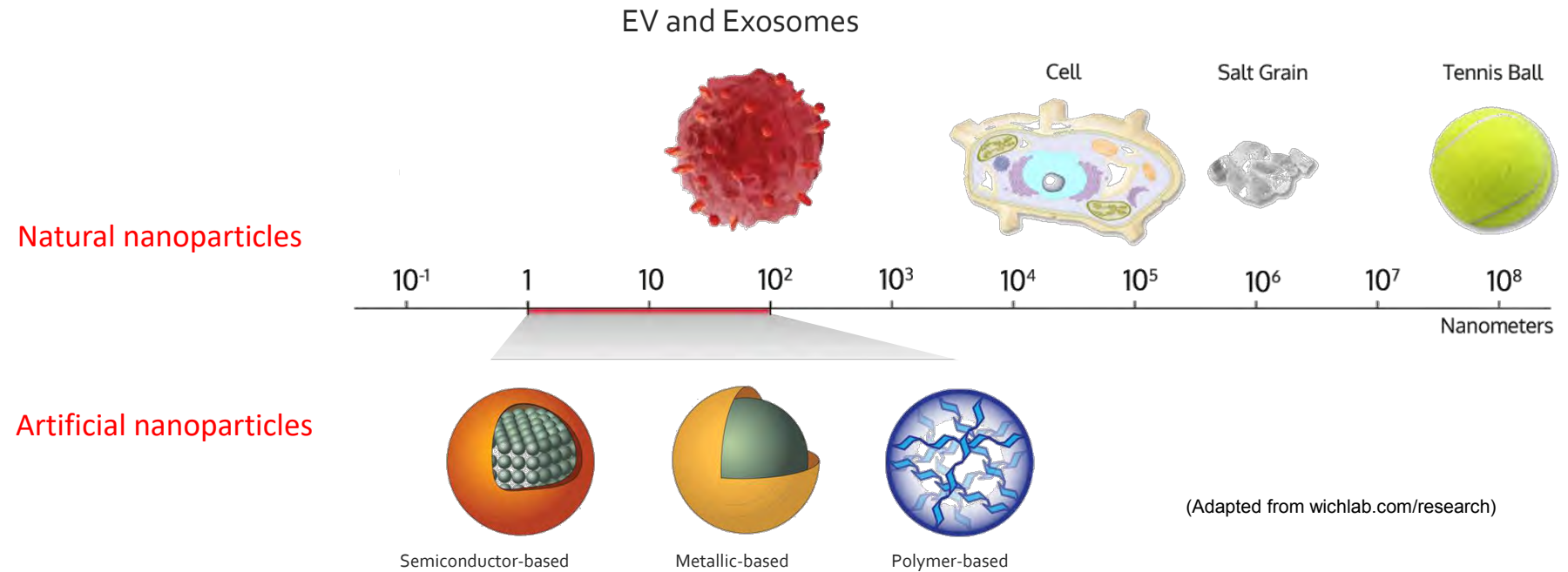
**O. Avci, C. Yurdakul, D. Sevenler,  
F. Ekiz-Kanik, Lei Tian**



# Outline

- Motivation – Biological Nanoparticles everywhere
- Problem definition – contrast and size
- Detection vs. visualization
- Interferometric Reflectance Imaging Sensor
- Biological Nanoparticle Detection and Sizing
- Pupil function engineering
- Resolution improvement by oblique illumination and reconstruction
- Towards 100nm in label-free visible light microscopy
- Conclusions and Future

# Motivation - Nanoparticles



## Artificial nanoparticles

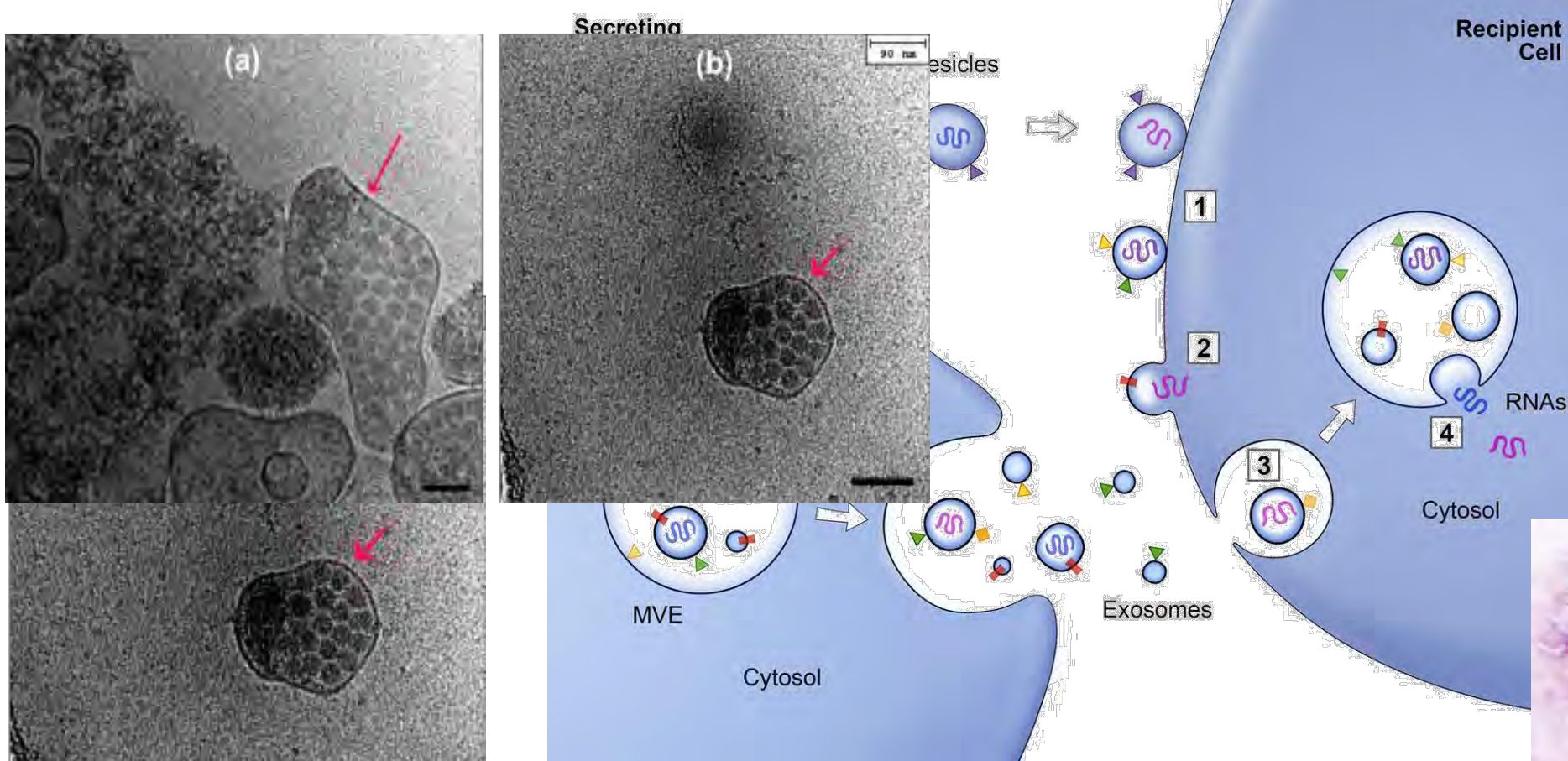
- Optically & physically engineered
- Used as labels or vehicles in diagnostics, therapeutic applications
- Gold, polystyrene NPs, QDs

## Natural nanoparticles

- Low-index, complex-shaped
- Hard to detect without labels
- *Virus* – infectious diseases and cancer
- *Exosome* – secreted from cancer cells



# Extra cellular vesicles, exosomes, and viruses



SEM image of Ebola virion



Example cryo-EM images of infectious extracellular vesicle (Bullitt Lab – BU MED)

Viruses are the most abundant species on earth.  
~ $10^{32}$  phages in the biosphere  
~ $10^7$  viruses on average in a mL of seawater

# Optical microscopy can see small – but ...

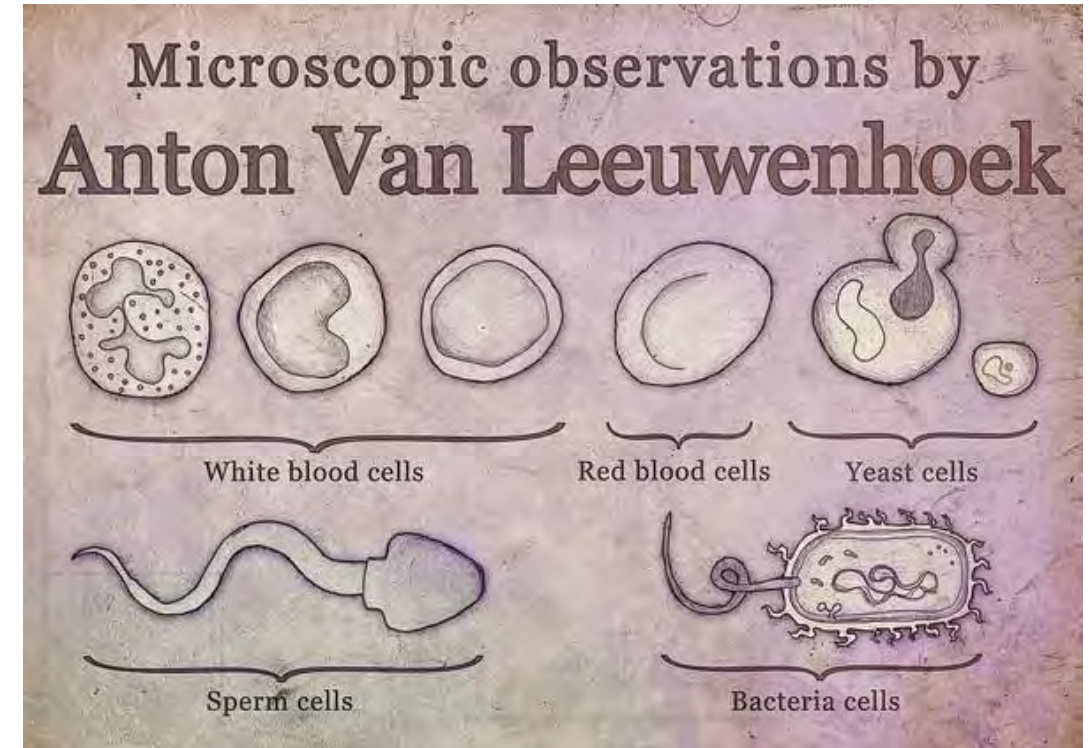
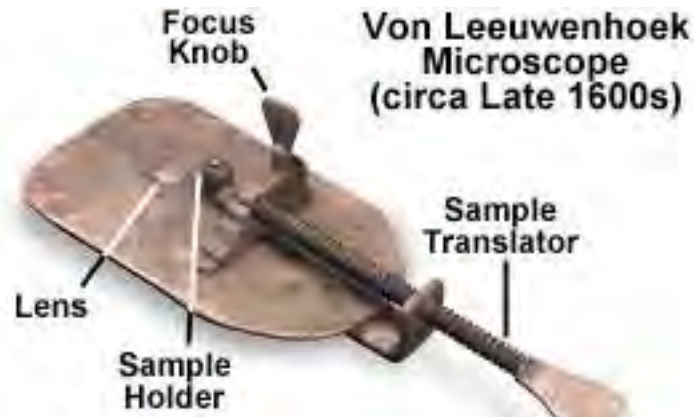
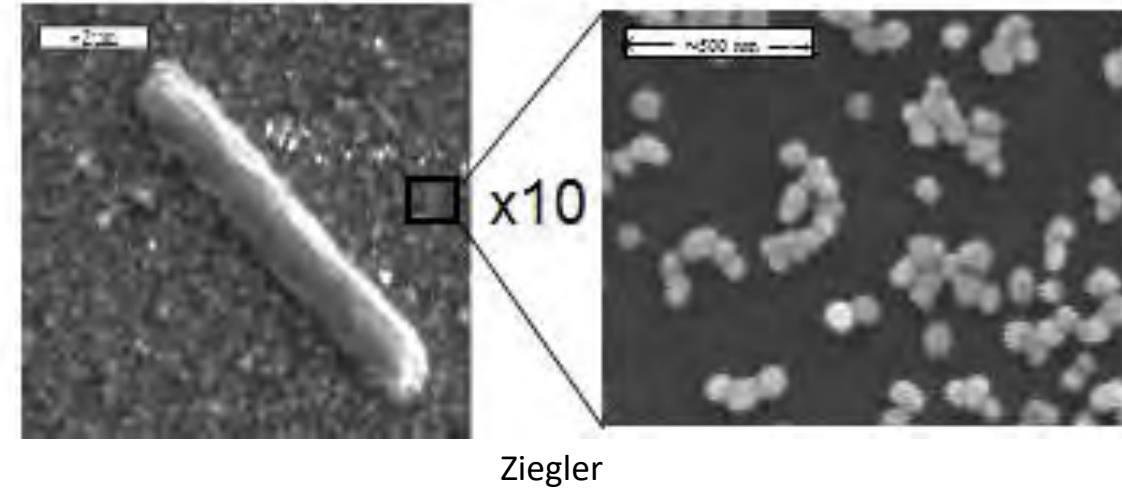
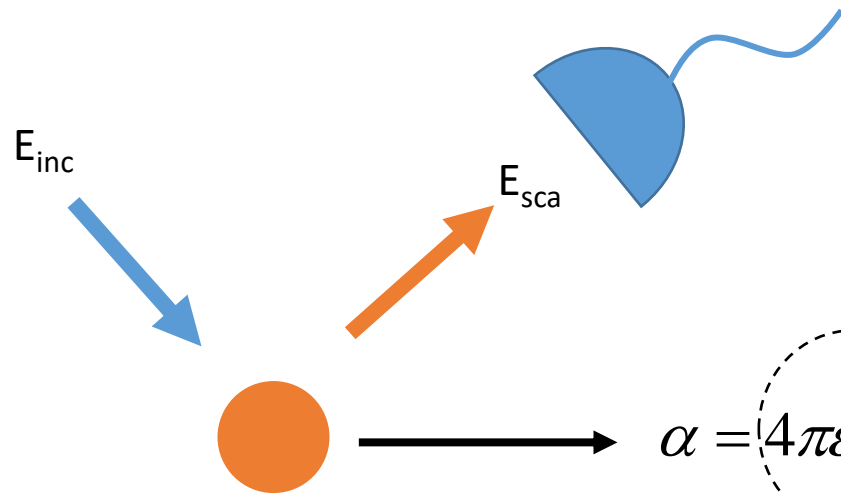


Figure 1

[micro.magnet.fsu.edu/primer/](http://micro.magnet.fsu.edu/primer/)



# Biological Nanoparticle Detection Challenges – size and dielectric contrast



$$\alpha = 4\pi\epsilon_0 R^3 \frac{\epsilon_p - \epsilon_m}{\epsilon_p + 2\epsilon_m}$$

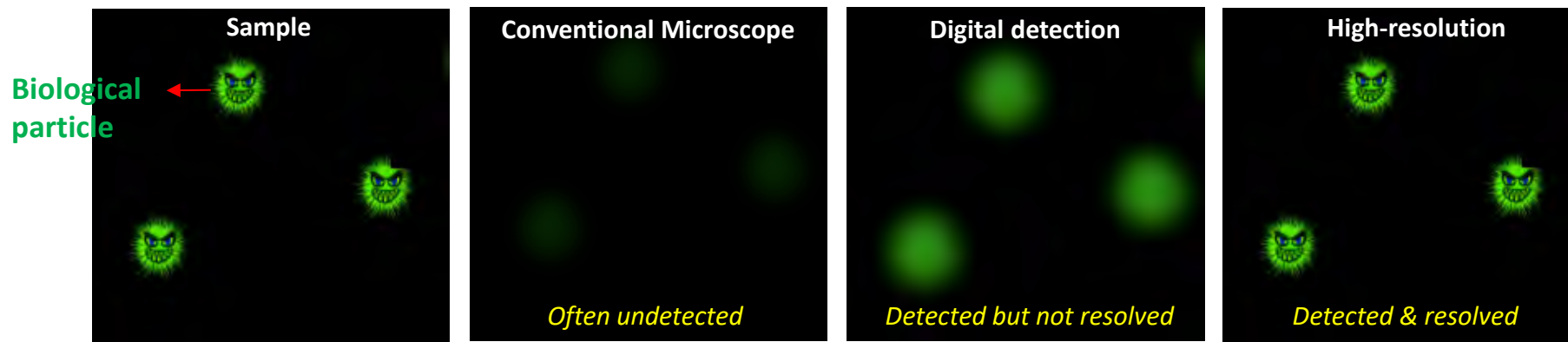
Size

contrast

$$\text{Signal} \sim R^6$$

# Single nanoparticle detection / visualization

- **High-resolution** imaging systems provide visualization of nanoparticles – detailed structural information
  - Low-throughput, expensive and laborious
- **Digital detection** systems provide sensing of nanoparticles without visualization – limited or no structural information
  - High-throughput, often inexpensive and straightforward



# Current State of the Art Technology

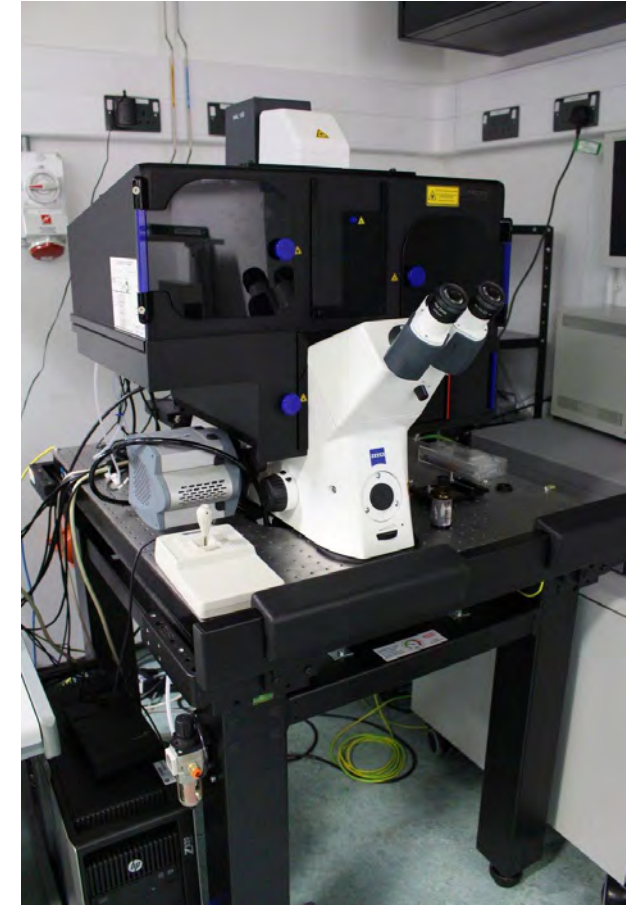
## Electron microscopy



Zeiss Libra 200

- Great resolution
- Laborious
- Sample prep
- Expensive
- Not label-free
- Low-throughput

## Fluorescence microscopy (STED/PALM)



clf.stfc.ac.uk



# Outline – IRIS

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- Conclusions and Future

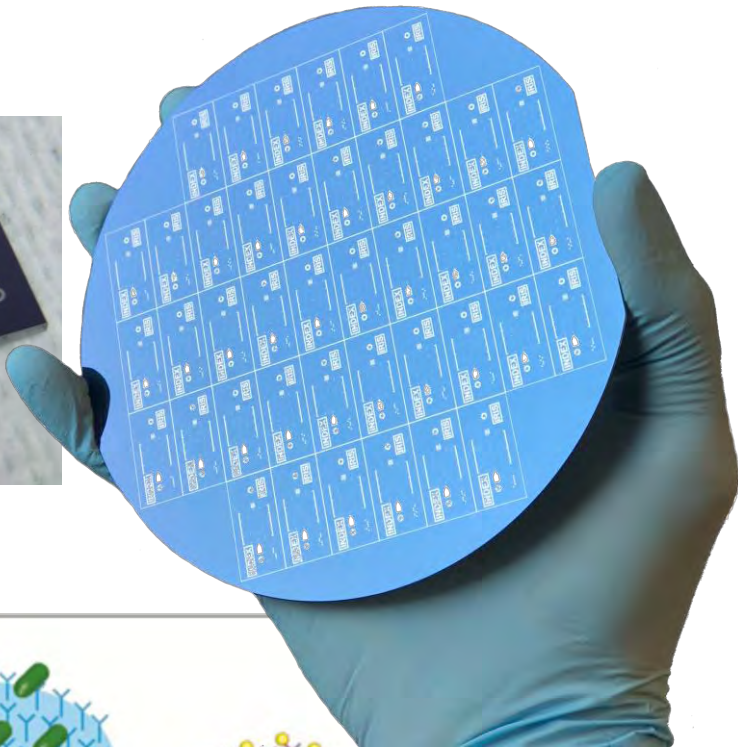
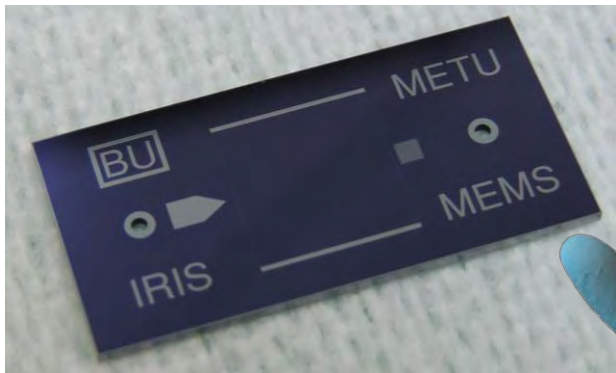
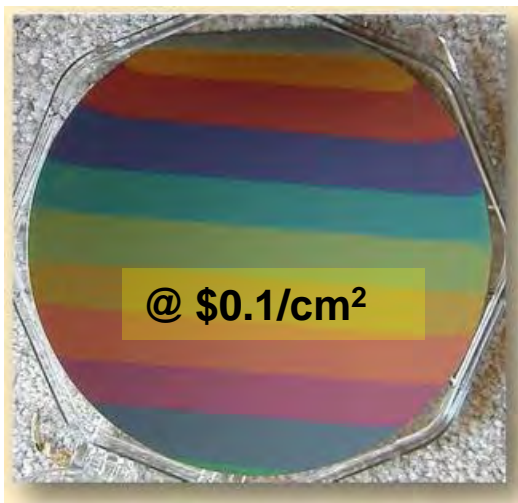
# Interferometric Reflectance Imaging Sensor (IRIS)

a high throughput biosensing platform

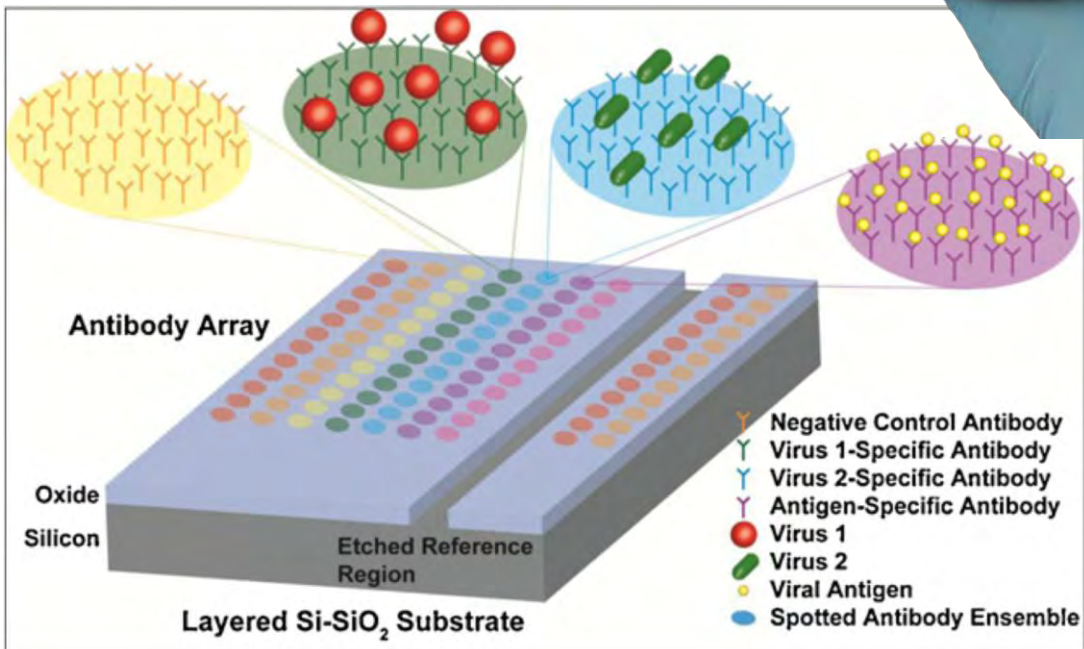
soap film



Oxide coated Si

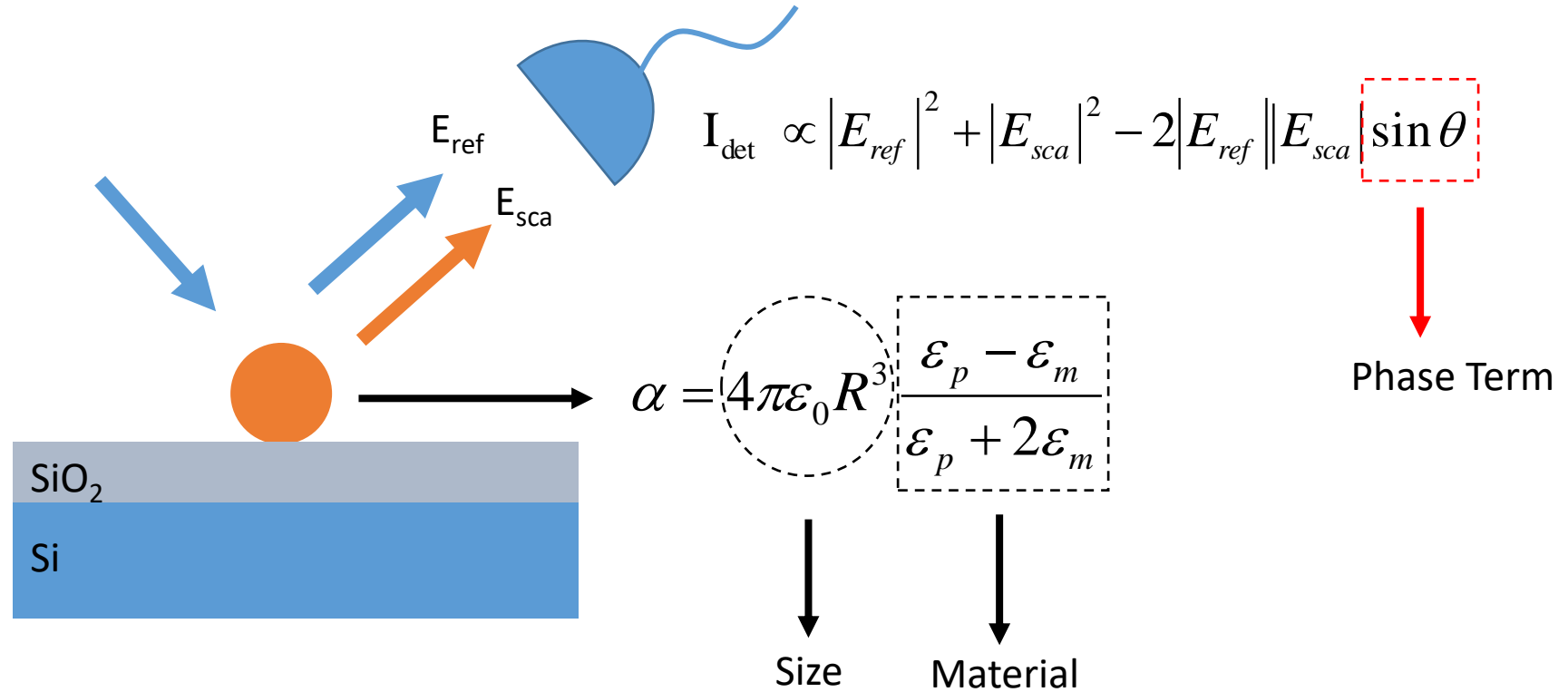


Protein microarray chips with 100s to 1,000s of probe spots



Ünlü et al, "STRUCTURED SUBSTRATES FOR OPTICAL SURFACE PROFILING," US Patent No: 9599611, 2017

**pg/mm<sup>2</sup> sensitivity 1,000s of spots**

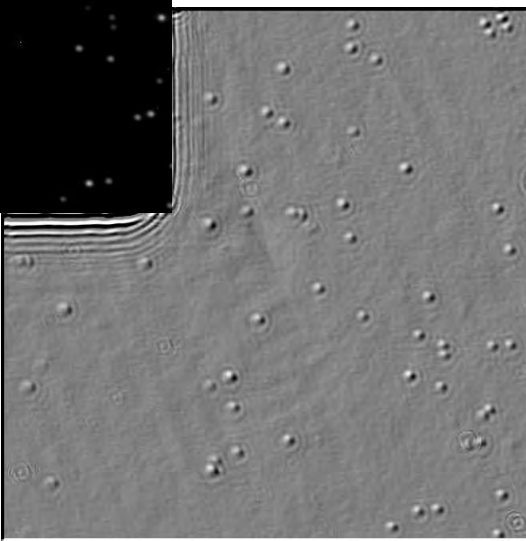
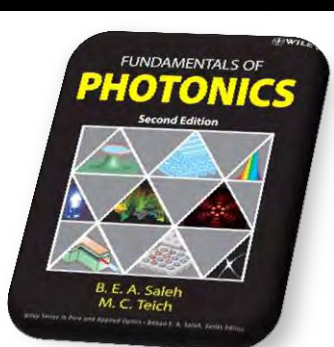
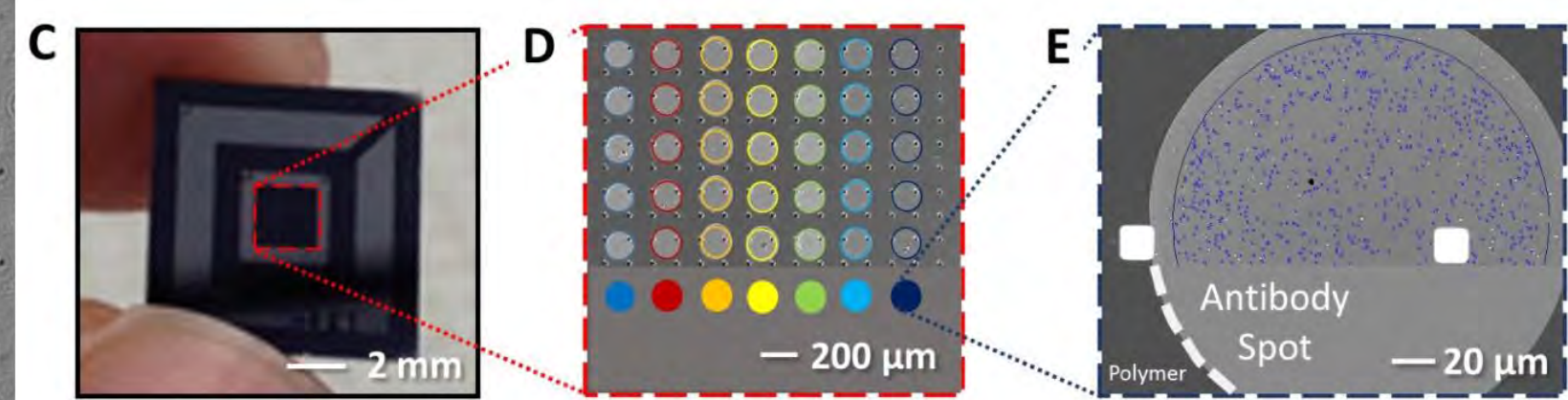
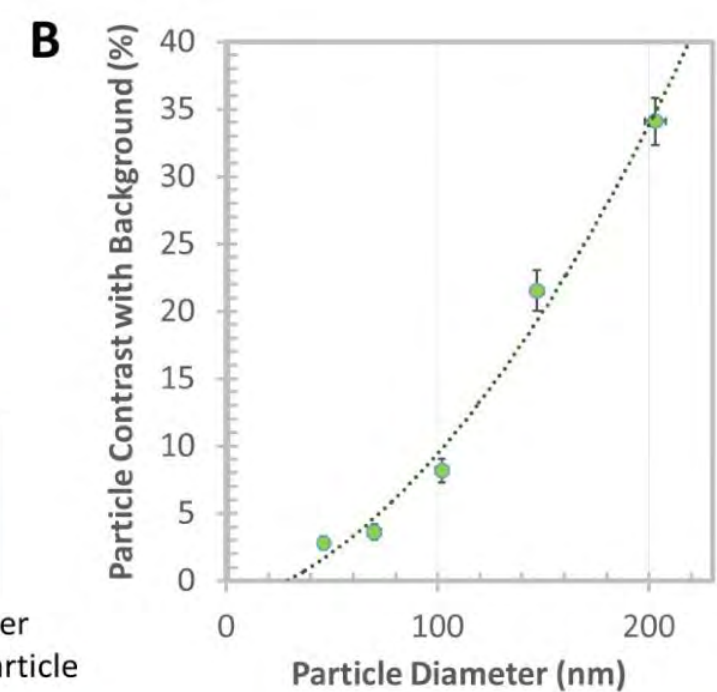
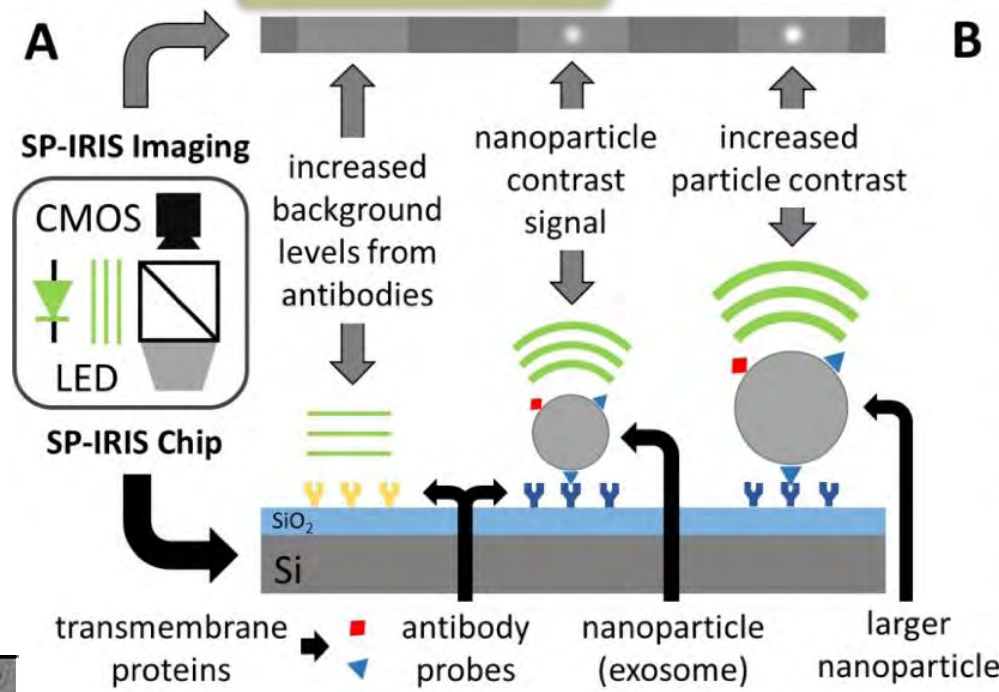


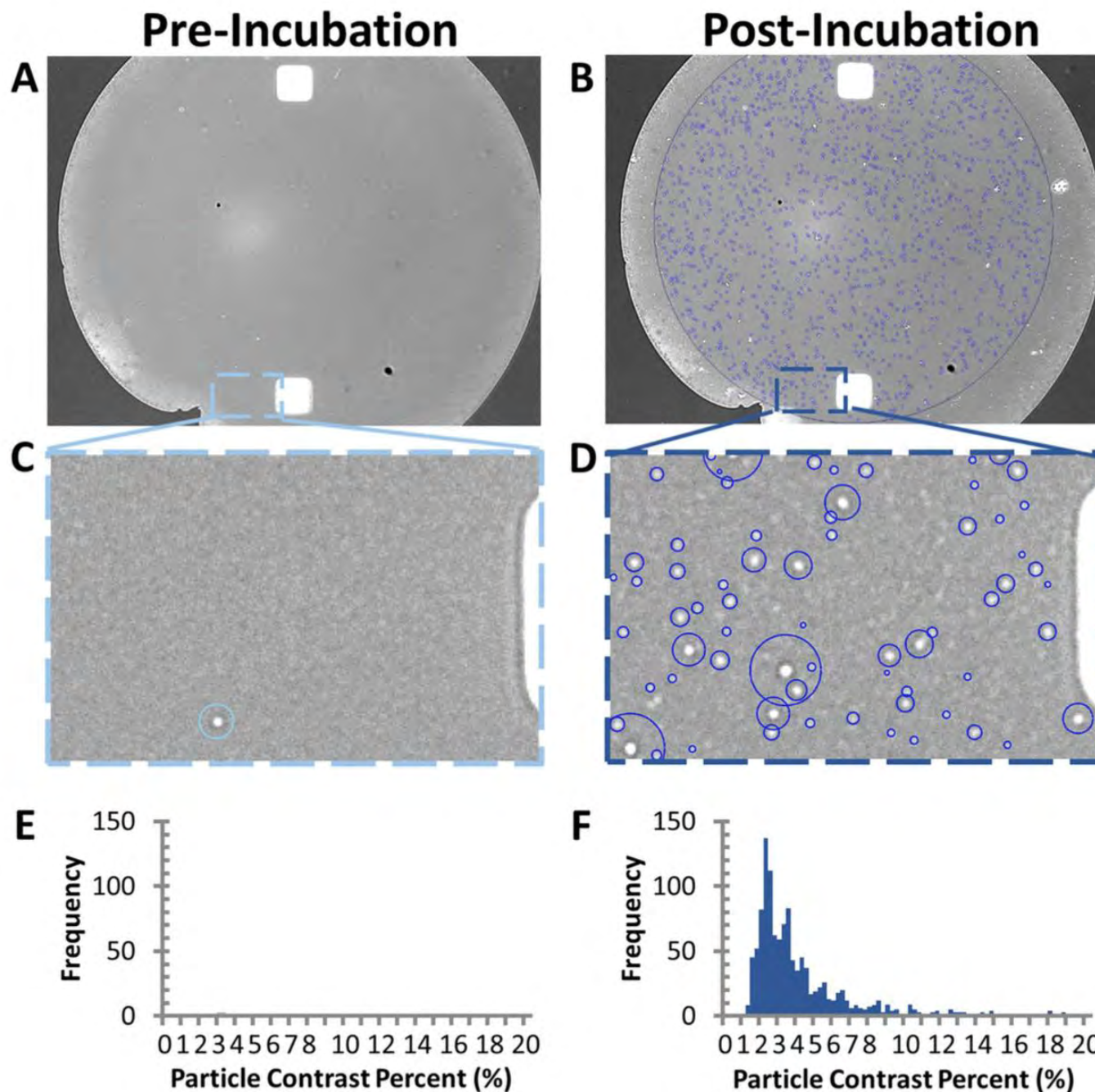




Rahul Vedula(MD) and George Daaboul, PhD '13

# Simple Particle Detection





# Exosome detection

Anti-CD81 capture probe image acquired before and after incubation with purified HEK293 cells derived exosomes.

SCIENTIFIC REPORTS

OPEN

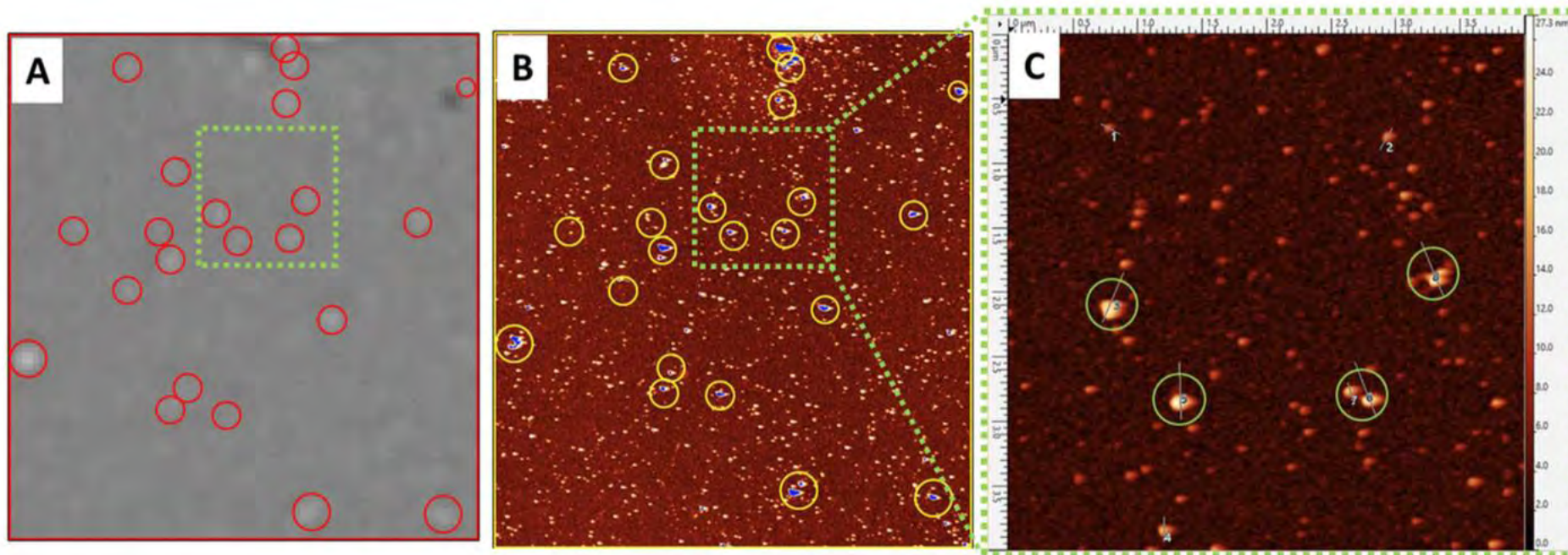
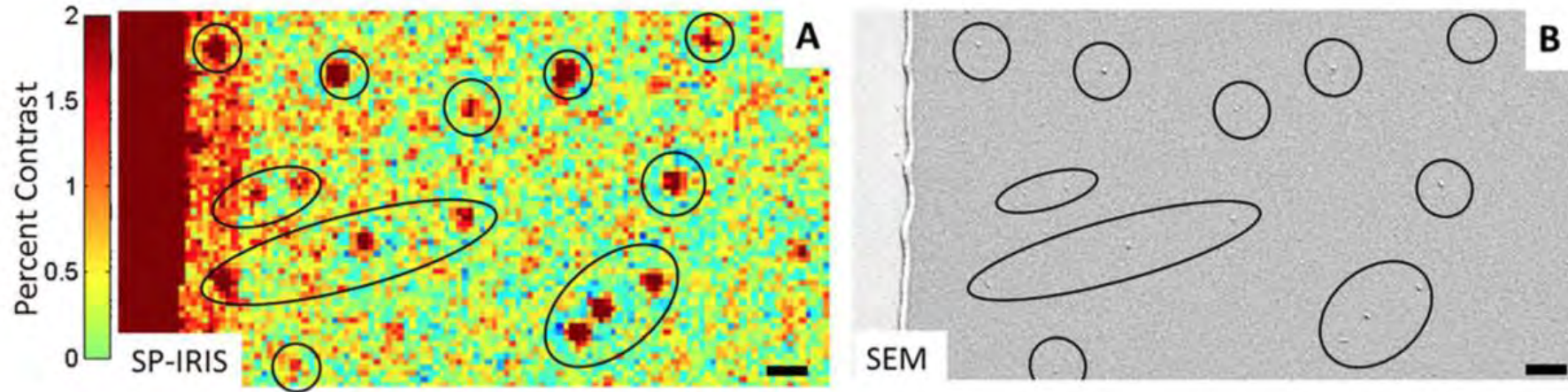
## Digital Detection of Exosomes by Interferometric Imaging

George G. Daaboul<sup>1,\*</sup>, Paola Gagni<sup>2,\*</sup>, Luisa Benussi<sup>3</sup>, Paolo Bettotti<sup>4</sup>, Miriam Ciani<sup>3</sup>, Marina Cretich<sup>2</sup>, David S. Freedman<sup>1</sup>, Roberta Ghidoni<sup>3</sup>, Ayca Yalcin Ozkumur<sup>5</sup>, Chiara Piotto<sup>4</sup>, Davide Prosperi<sup>6</sup>, Benedetta Santini<sup>6</sup>, M. Selim Ünlü<sup>7</sup> & Marcella Chiari<sup>2</sup>

Received: 20 June 2016

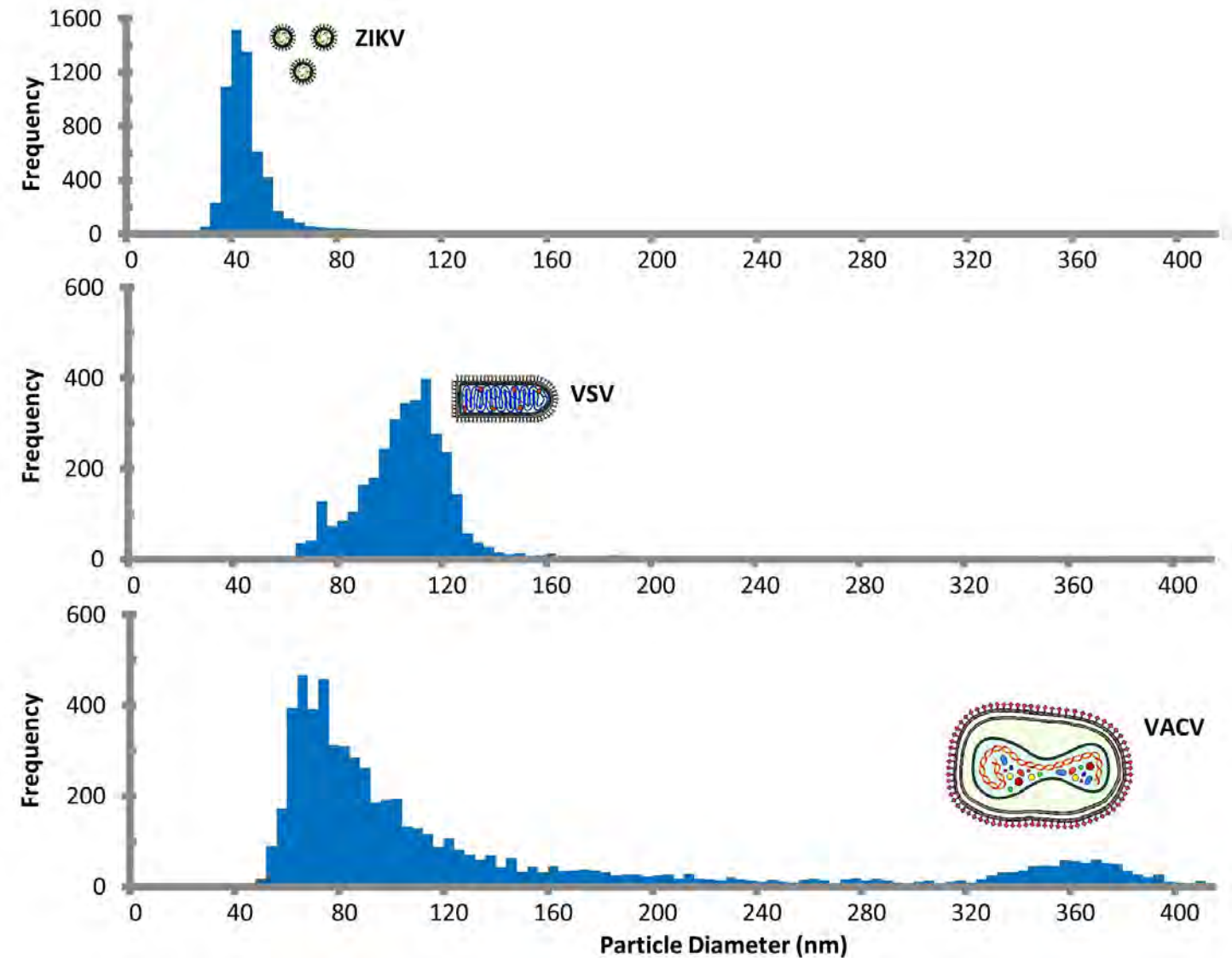
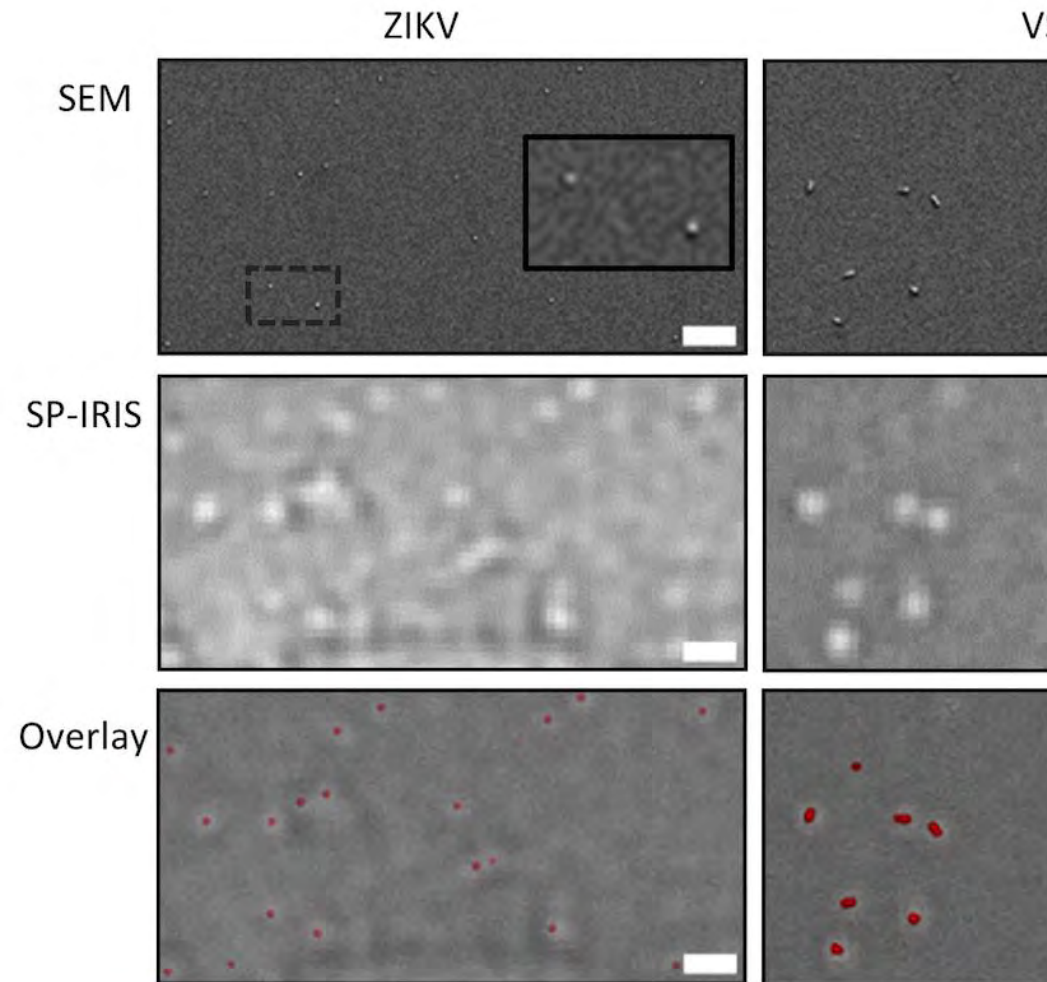


# Verification by SEM and AFM – down to $r=30\text{nm}$ dry

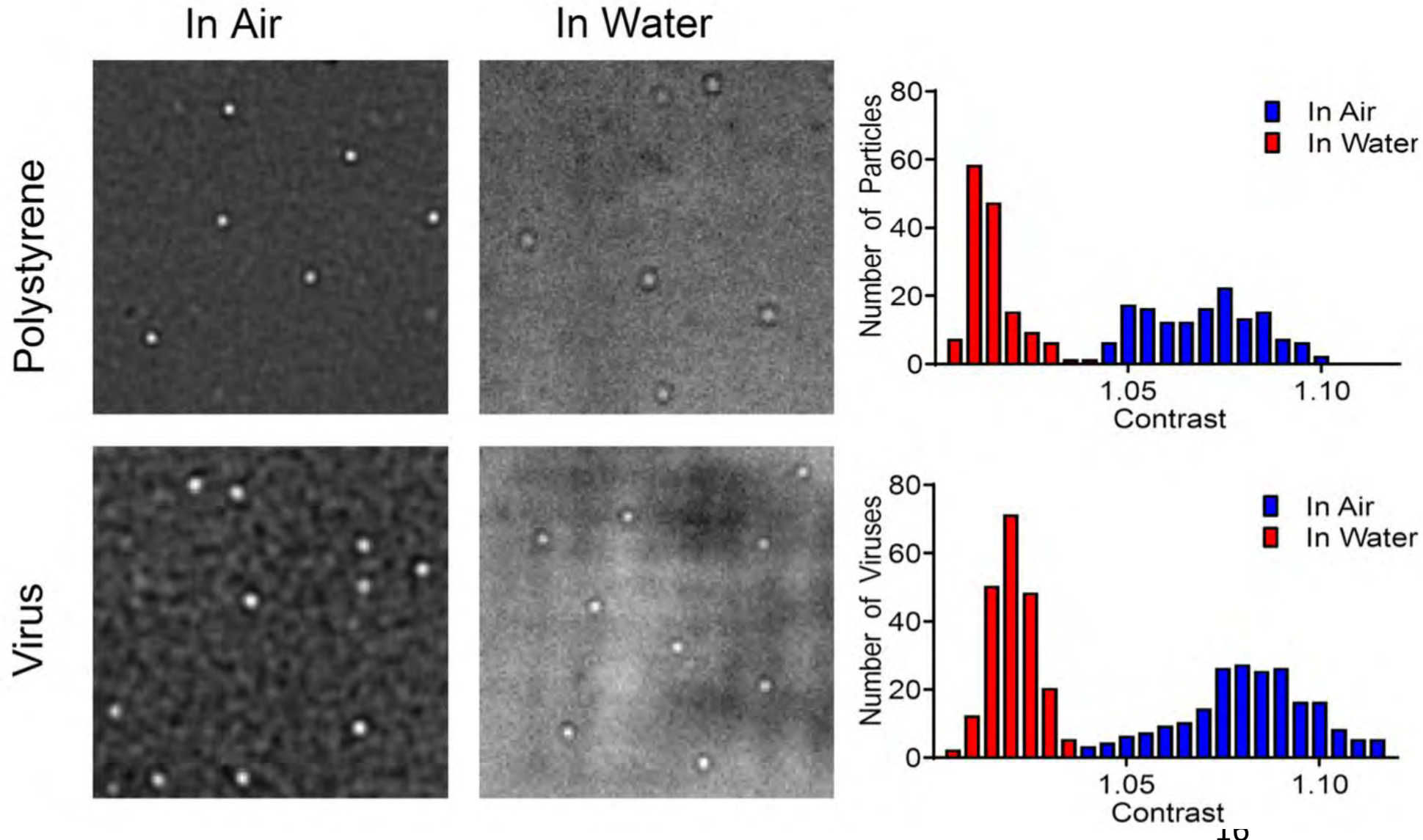




# Various viruses



# In-liquid detection to simplify the assay





# Passive Cartridge - Simple Workflow

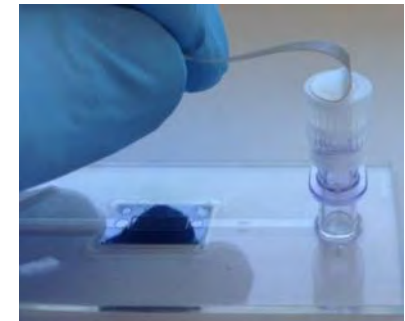
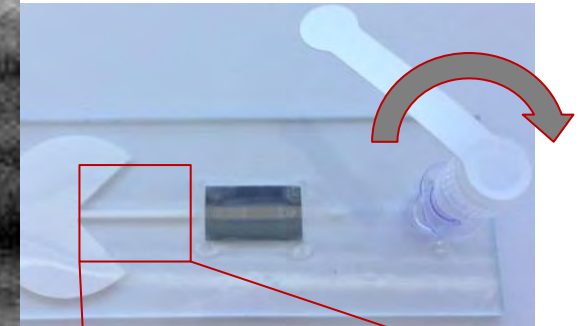
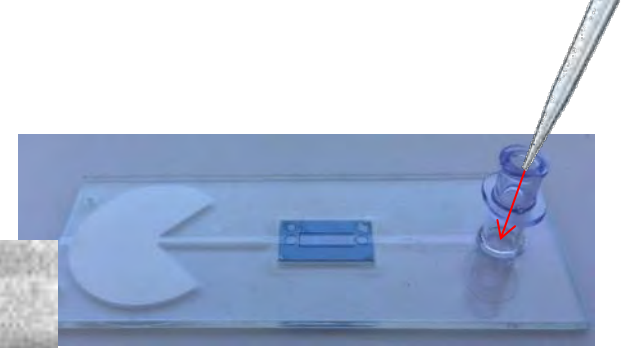
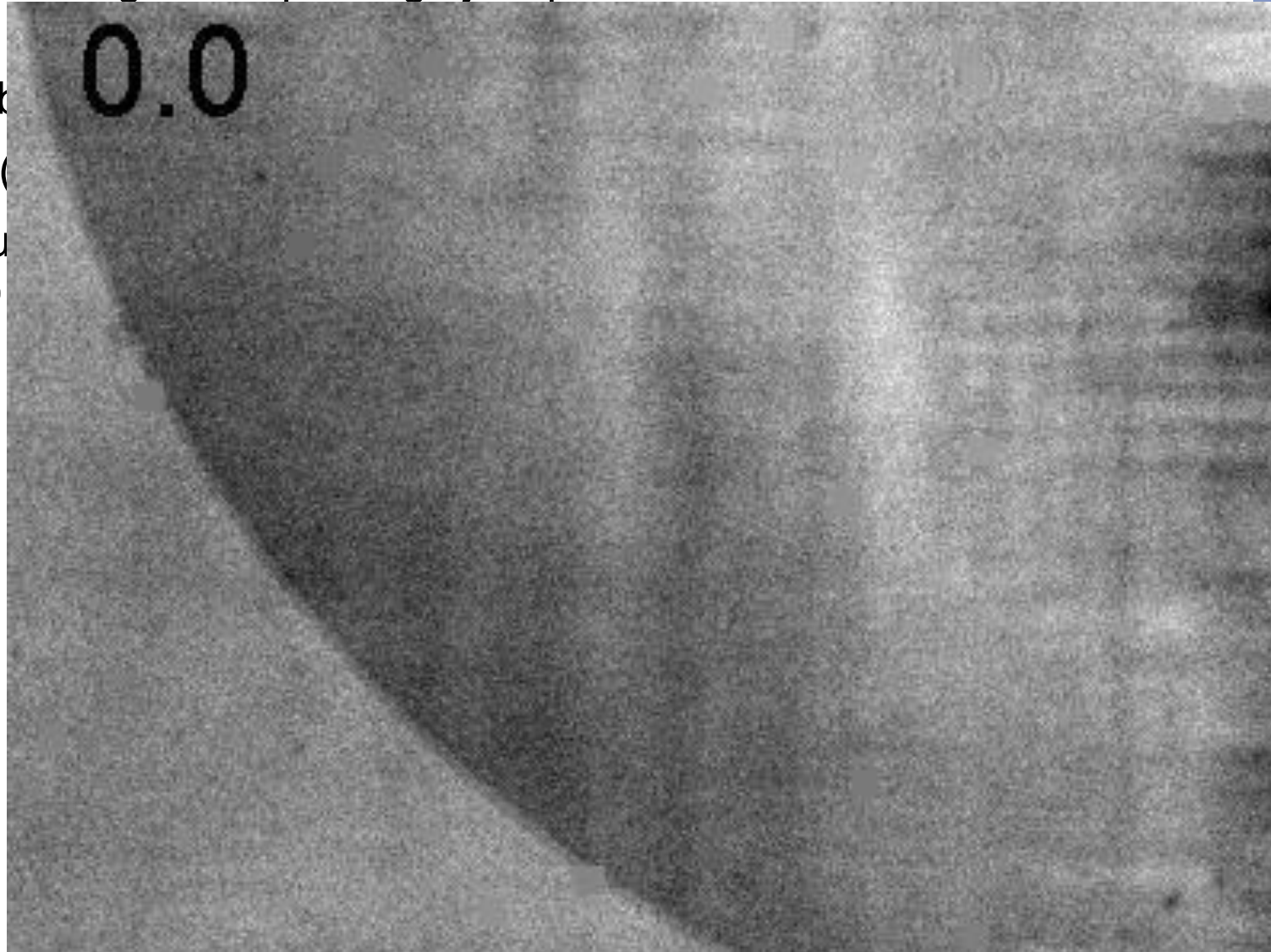
1. Remove cartridge from package just prior to use
2. 100  $\mu$ L of  
needs to be
3. Luer cap (
4. When liquid  
removed)
5. Cartridge



'17



'15





# Lab on a Chip

PAPER

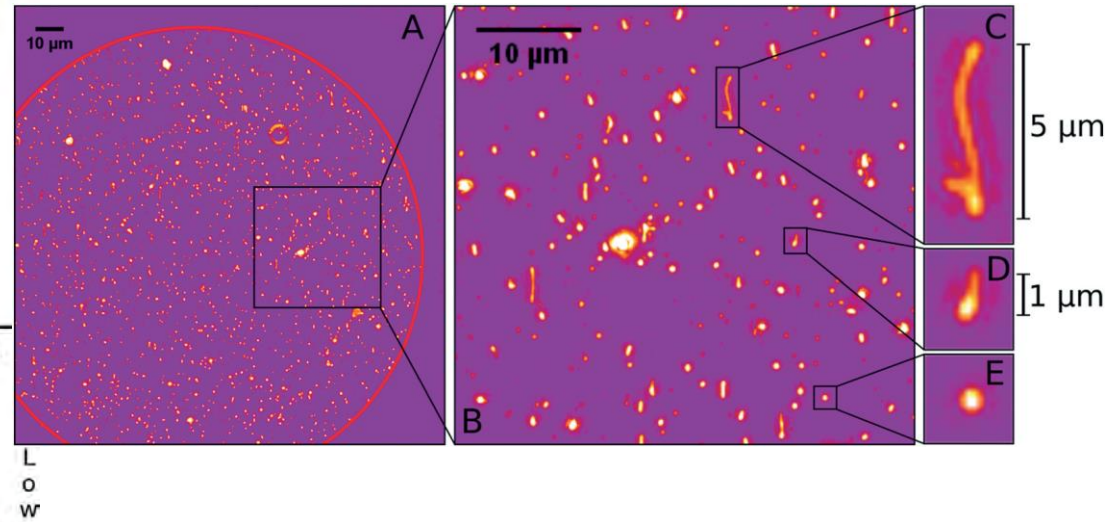
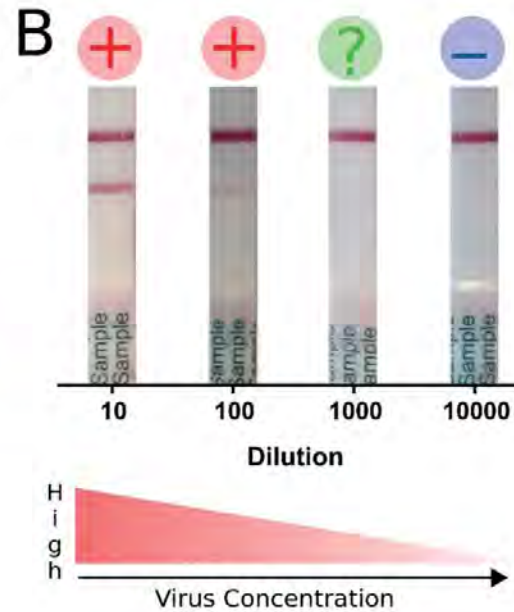
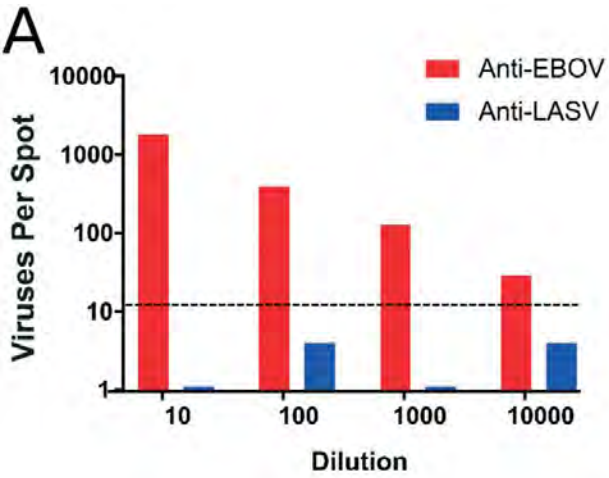
[View Article Online](#)  
[View Journal](#)



Cite this: DOI: 10.1039/c6lc01528j

## Disposable cartridge platform for rapid detection of viral hemorrhagic fever viruses†

Steven M. Scherr,<sup>a</sup> David S. Freedman,<sup>b</sup> Krystle N. Agans,<sup>cd</sup> Alexandru Rosca,<sup>b</sup> Erik Carter,<sup>e</sup> Melody Kuroda,<sup>f</sup> Helen E. Fawcett,<sup>a</sup> Chad E. Mire,<sup>cd</sup> Thomas W. Geisbert,<sup>cd</sup> M. Selim Ünlü<sup>ghi</sup> and John H. Connor<sup>\*eh</sup>

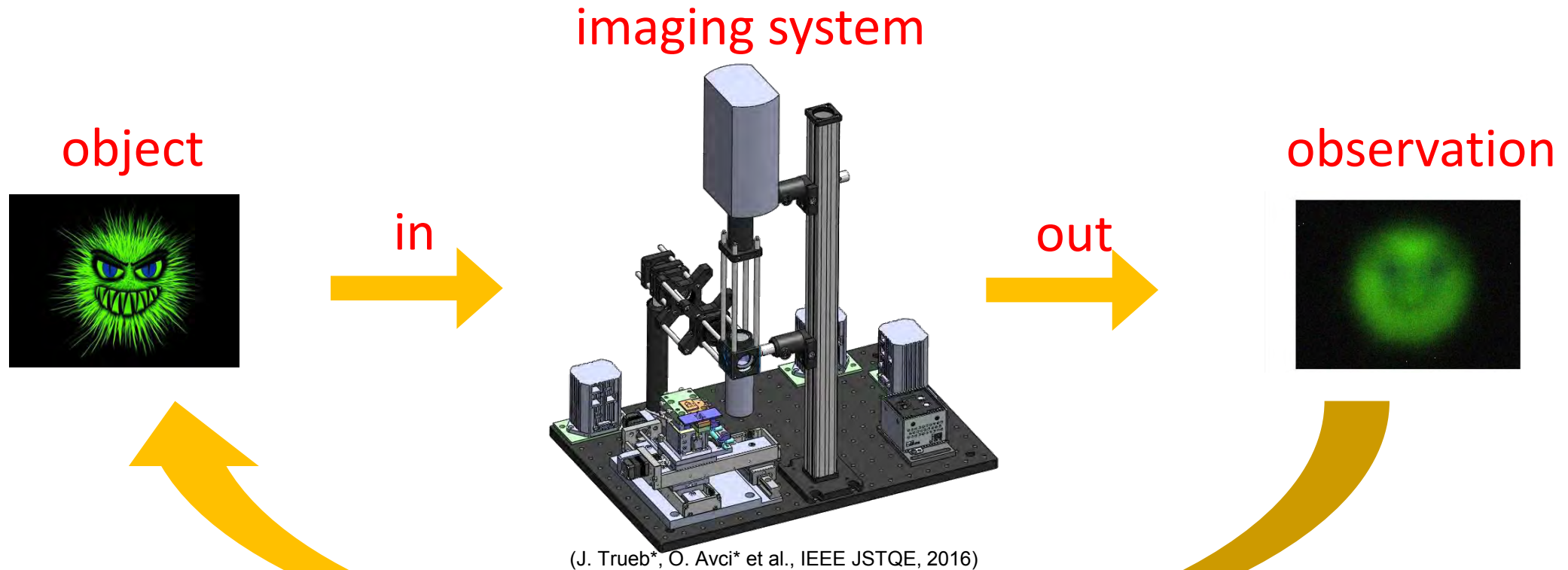


Dilution	SP-IRIS Anti-EBOV (Viruses Per Spot)	SP-IRIS Anti-LASV (Viruses Per Spot)	ReEbov Test Strip
1:10	1824	**	+
1:100	393	4	+
1:1000	126	~4	?
1:10000	29	4	-

# Outline – Going Beyond Detection and Sizing

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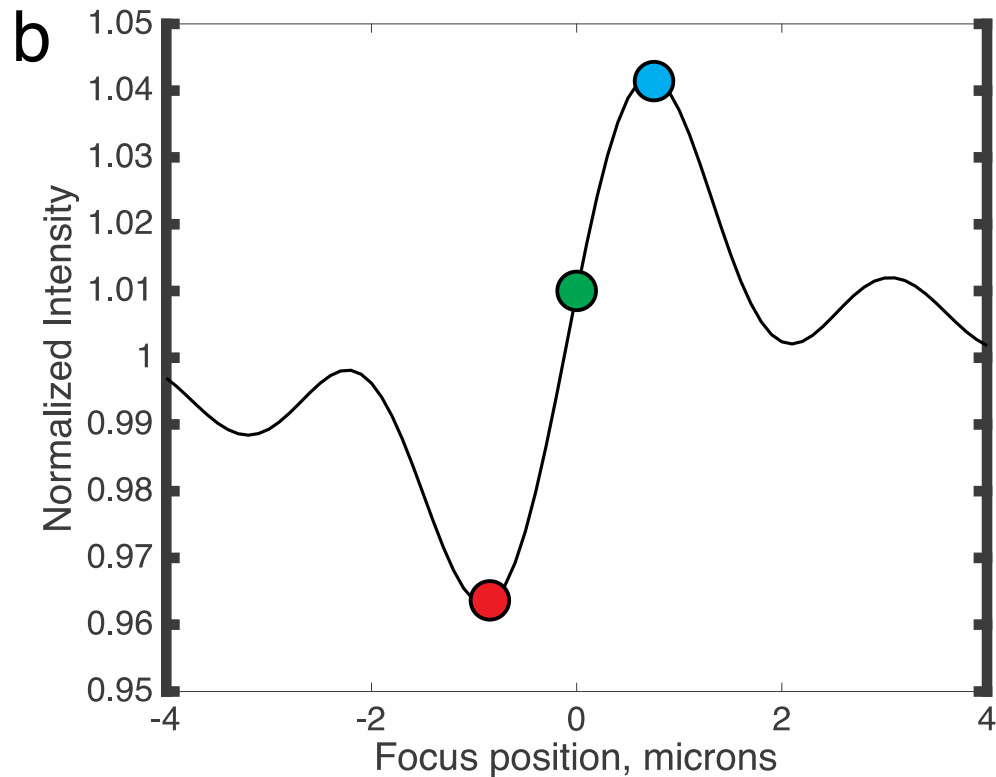
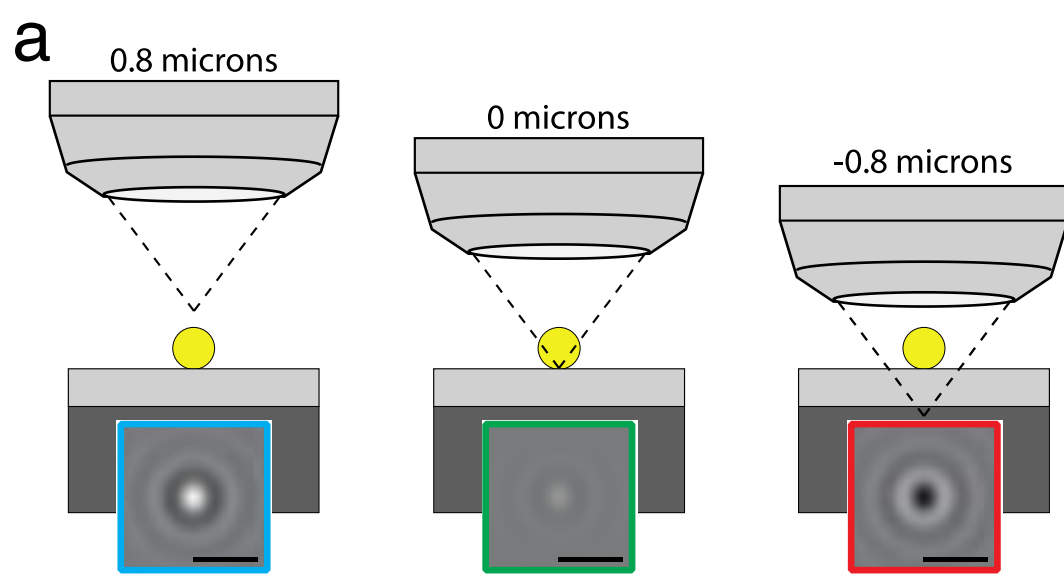
# Reconstruction in Interference Microscopy



$$y = Ax + e$$

observation ←  $y$        $A$  ← system response convolution matrix       $x$  ← object       $e$  ← noise





# Interferometric fringes – defocus profile

Changing the focus position changes the path length to the detector differently for reference reflection and scattered light



D. Sevenler et al, "Quantitative interferometric reflectance imaging for the detection and measurement of biological nanoparticles," *Biomedical Optics Express*, 2017

O. Avci, et al., "Physical Modeling of Interference Enhanced Imaging and Characterization of Single Nanoparticles," *Optics Express*, 2016

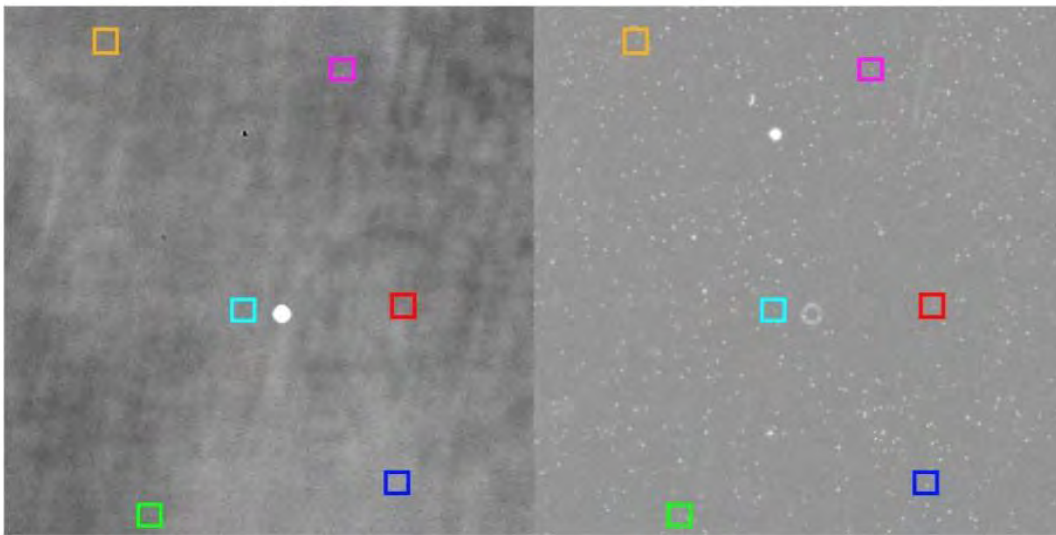
O. Avci, et al. "Pupil function engineering for enhanced nanoparticle visibility in wide-field interferometric microscopy," *Optica* 2017

# Robust Visualization and Discrimination of Nanoparticles by Interferometric Imaging

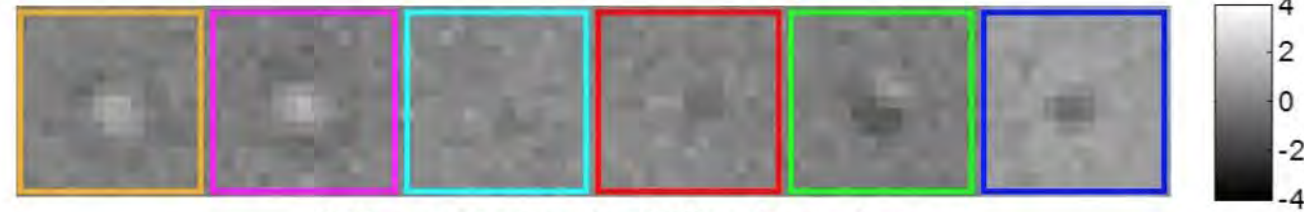
Jacob Trueb <sup>‡</sup>, Oguzhan Avci <sup>‡</sup>, *Student Member, IEEE*, Derin Sevenler, John H. Connor, and M. Selim Ünlü, *Fellow, IEEE*

A) Nominally Focused Single Plane Image

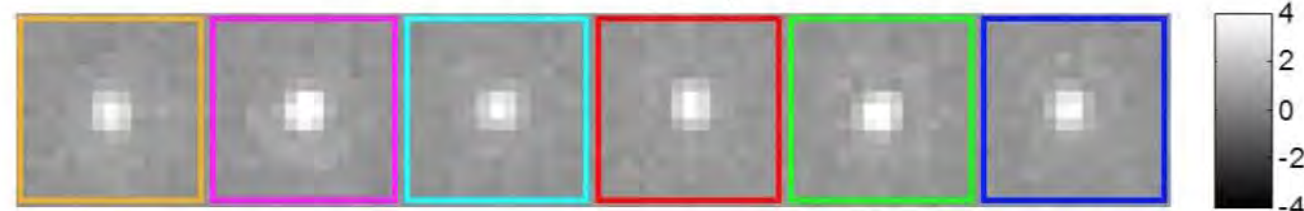
B) Differential Intensity Image



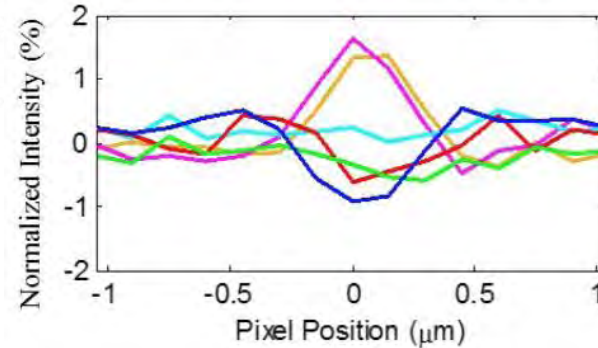
C) Nanoparticle Crops from Single Plane Image



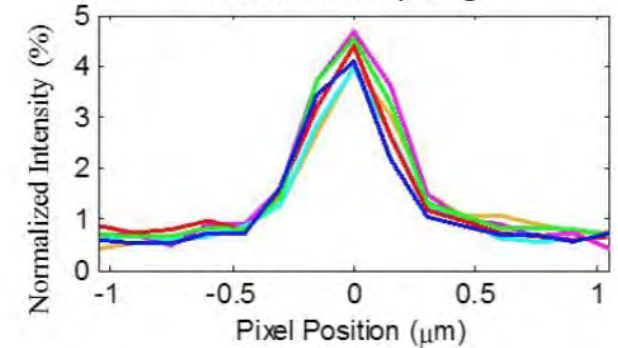
D) Nanoparticle Crops from Differential Intensity Image



E) Centerline Profiles from Nominal Focus Plane Image



F) Centerline Profiles from Differential Intensity Image



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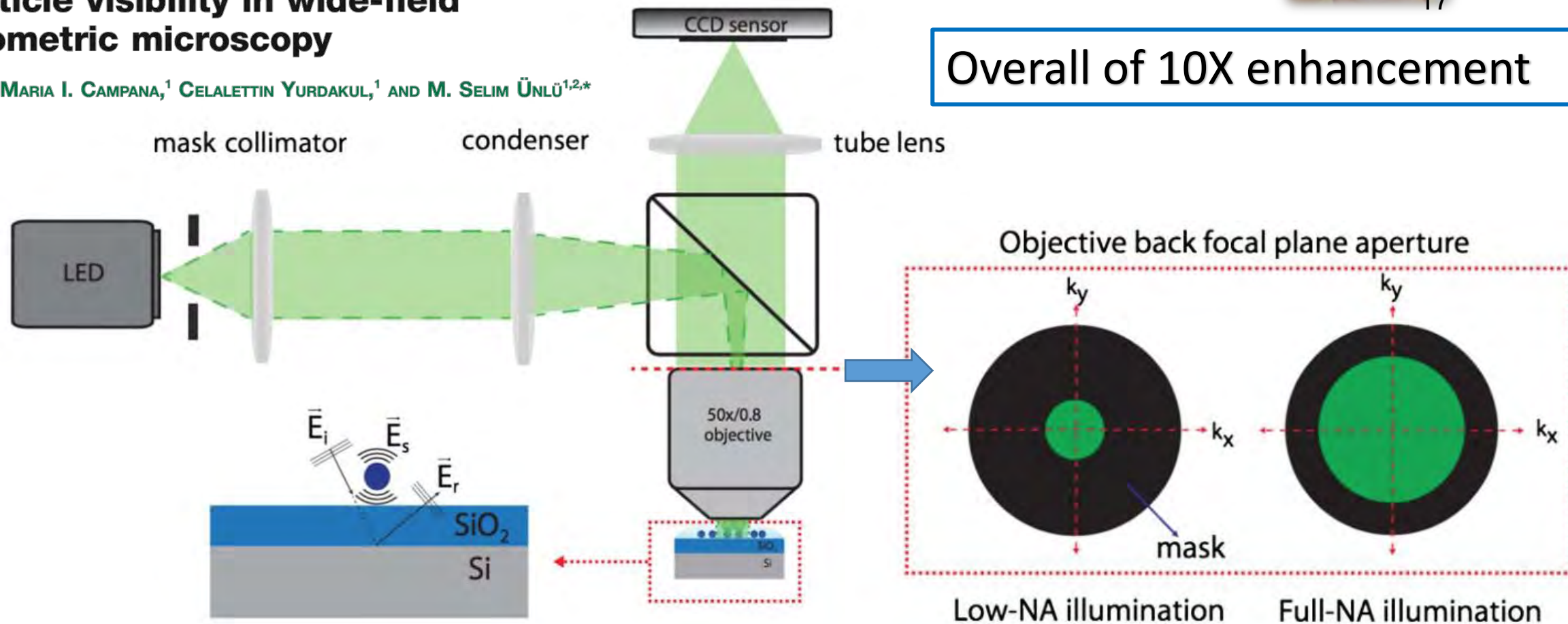
# Pupil function engineering for enhanced nanoparticle visibility in wide-field interferometric microscopy

OGUZHAN AVCI,<sup>1</sup> MARIA I. CAMPANA,<sup>1</sup> CELALETTIN YURDAKUL,<sup>1</sup> AND M. SELIM ÜNLÜ<sup>1,2,\*</sup>



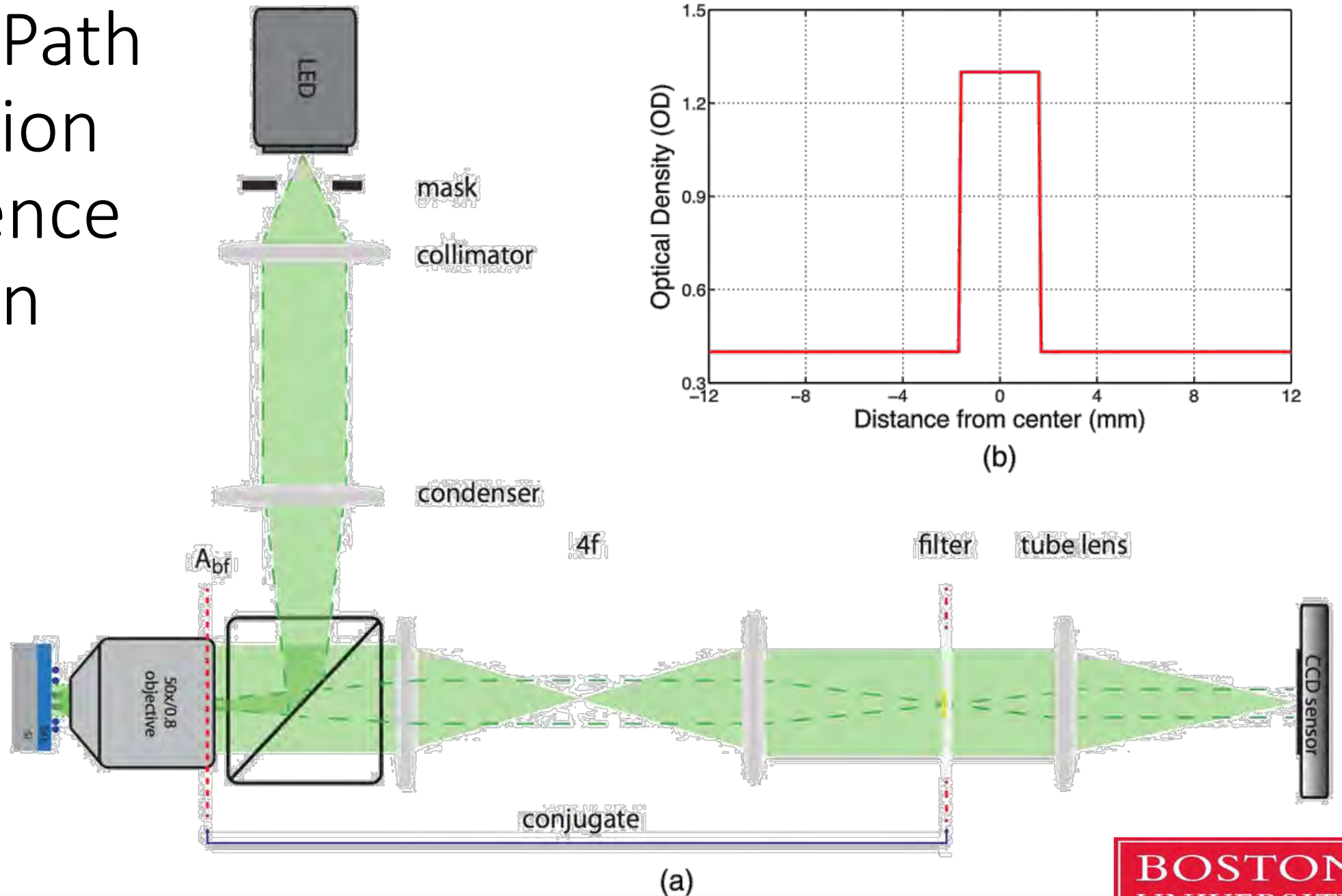
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Overall of 10X enhancement

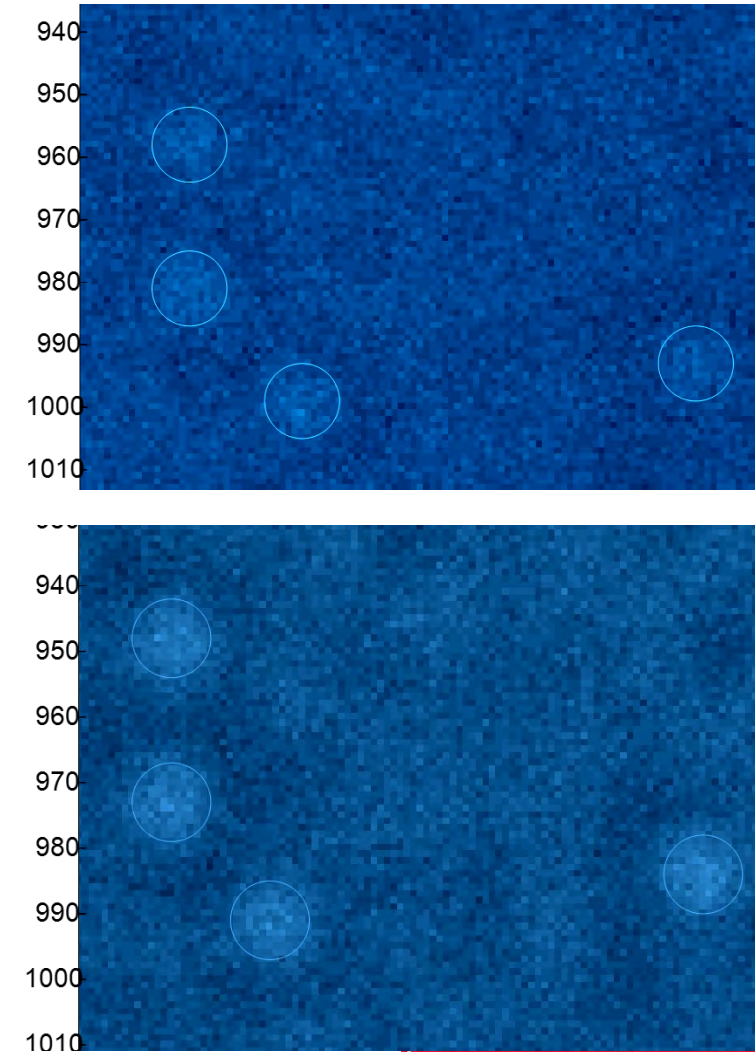
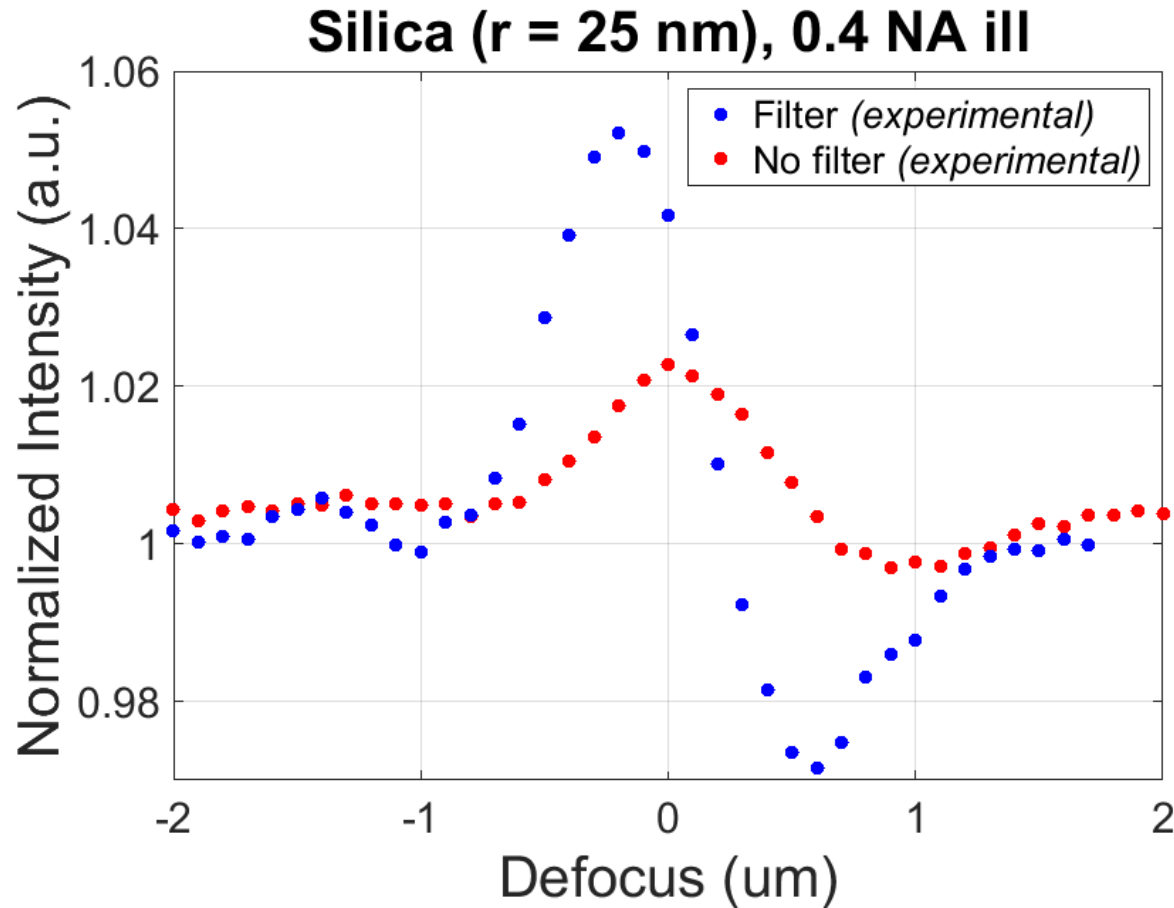




# Collection Path – Apodization and Reference Attenuation



# Registered silica particles defocus curve ~4X enhancement (2.2% → 8%)

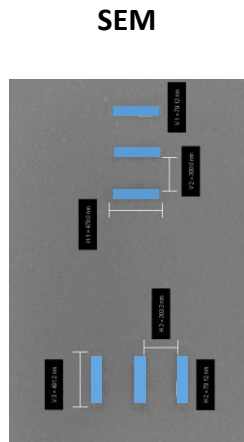
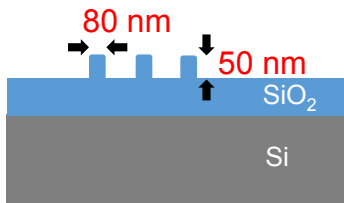
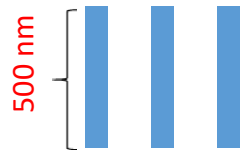
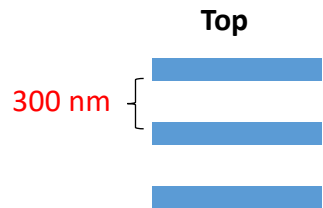


# Reconstruction – first with defocus

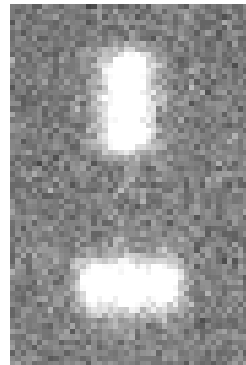
- **Tikhonov regularization:** Least-squares cost function with quadratic side-constraint

$$\min_x \sum_{j=1}^N \|A_j x - y_j\|_2^2 + \alpha \|x\|_2^2$$

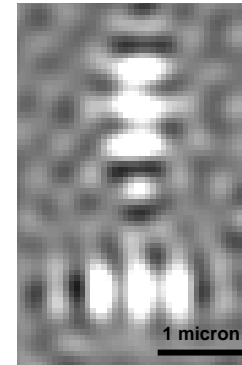
- **Defocus based reconstruction**



(conventional)



(reconstruction)



50x/0.8NA 525nm

$$x = \mathcal{F}^{-1} \left\{ \frac{\sum_{j=1}^N H_j^* y_j}{\sum_{j=1}^N |H_j|^2 + \alpha} \right\}$$



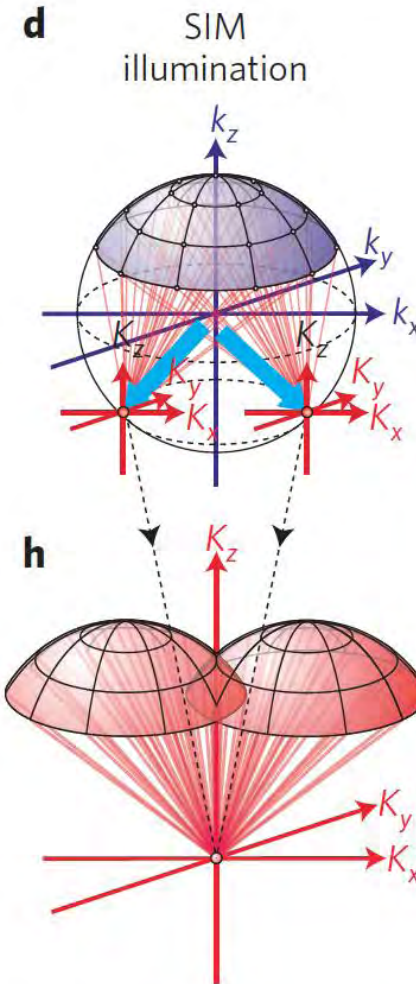
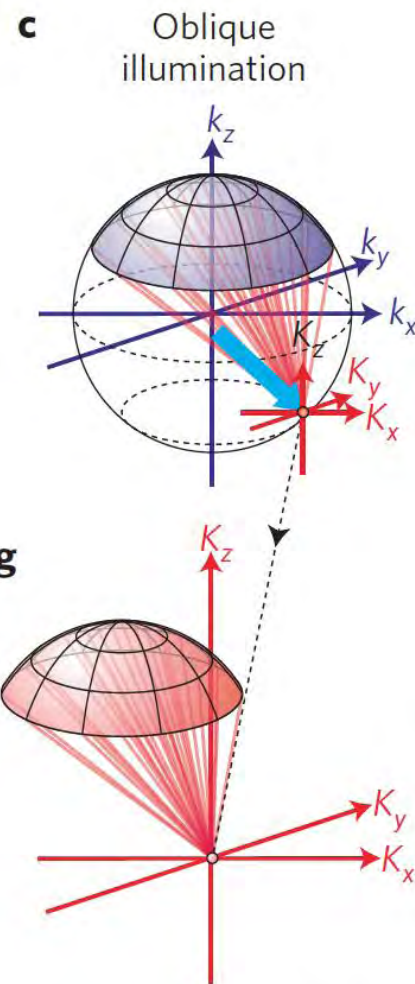
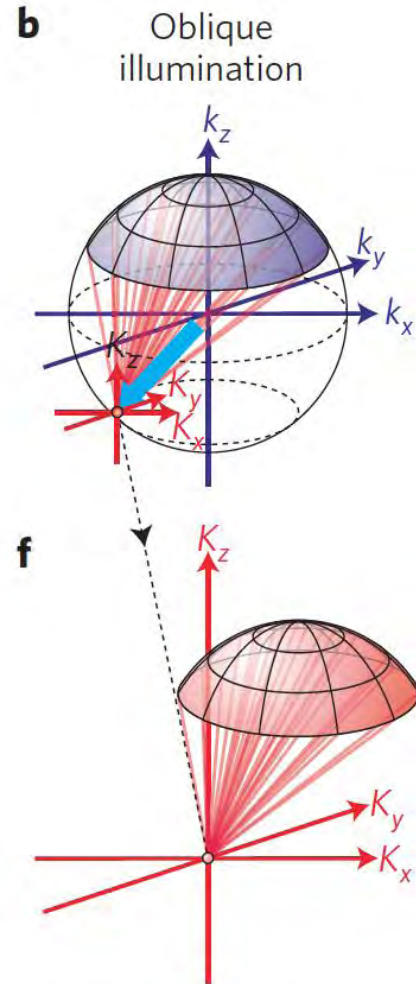
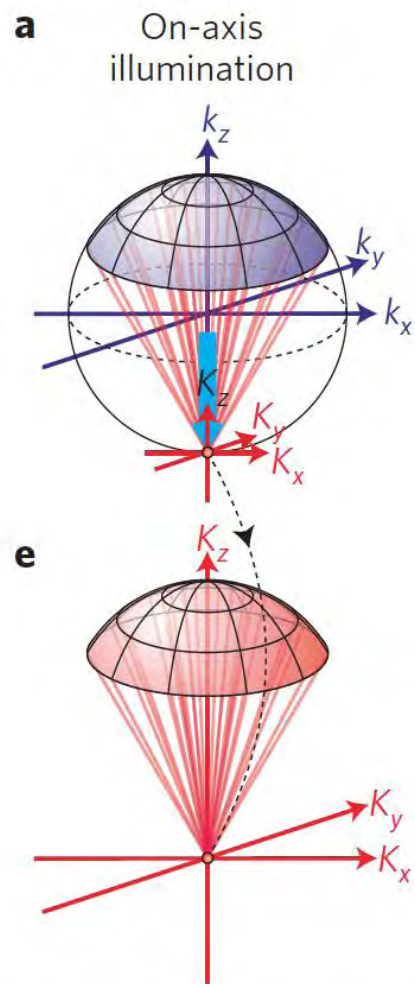
# Reconstruction – Structured Illumination (?)

## Resolving a misconception about structured illumination

Kai Wicker and Rainer Heintzmann

Applying structured illumination microscopy to coherent imaging modalities such as scattering does not yield any additional information beyond that provided by oblique illumination. It thus yields no resolution enhancement over the Abbe diffraction limit, which was derived precisely for that case.

NATURE PHOTONICS | VOL 8 | MAY 2014 |



Optical frequencies  
 Sample frequencies

Detectable optical frequencies  
 Detectable sample frequencies

Possible optical frequencies ( $2\pi n/\lambda$ )  
 Illumination frequency

# Super-resolution in wide-field interferometric microscopy

- Enhancing low-index nanoparticle resolution via reconstruction schemes

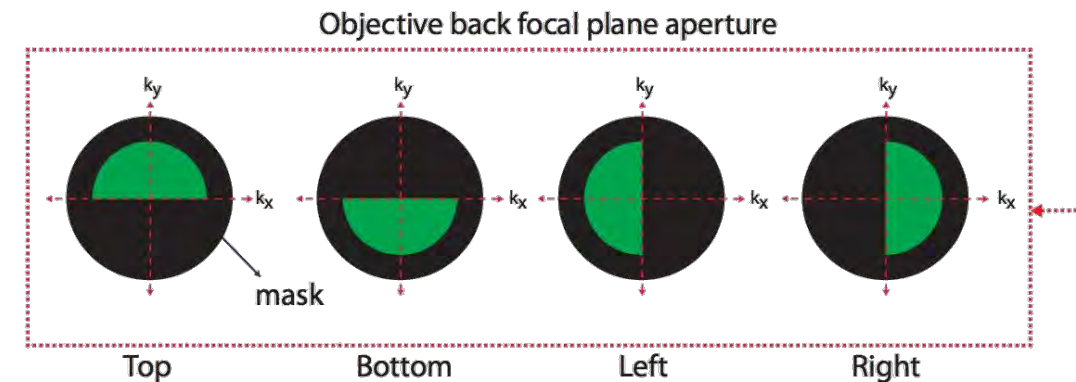
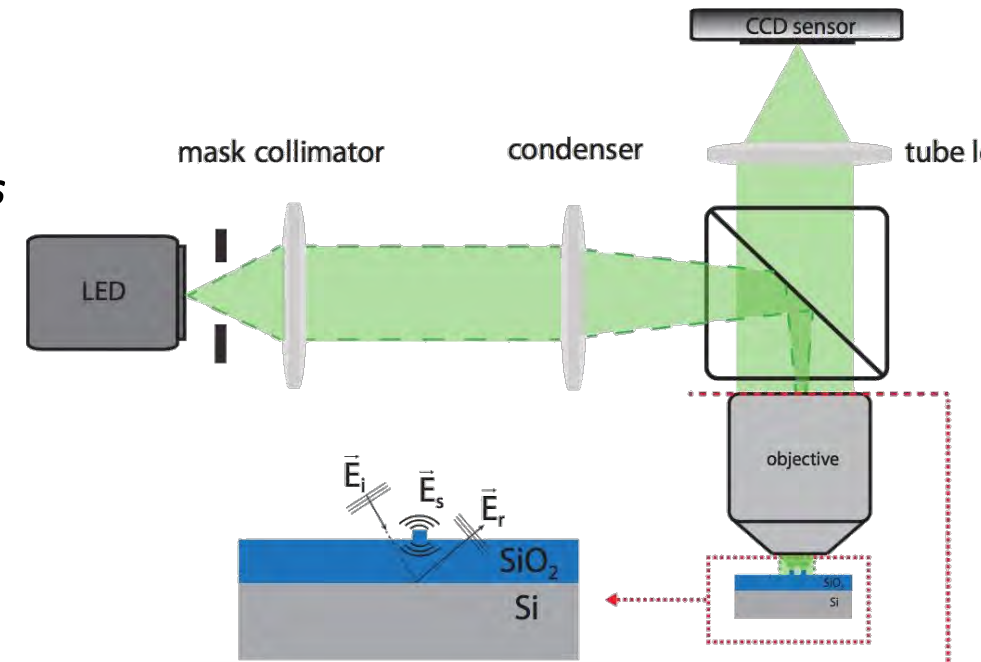
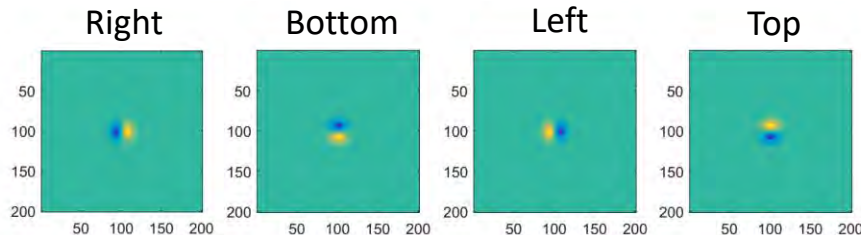
Asymmetric illumination based reconstruction for super resolution

(with Lei Tian)

$$\min_x \sum_{j=1}^N \|A_j x - y_j\|_2^2 + \alpha \|x\|_2^2$$

$$x = \mathcal{F}^{-1} \left\{ \frac{\sum_{j=1}^N H_j^* y_j}{\sum_{j=1}^N |H_j|^2 + \alpha} \right\}$$

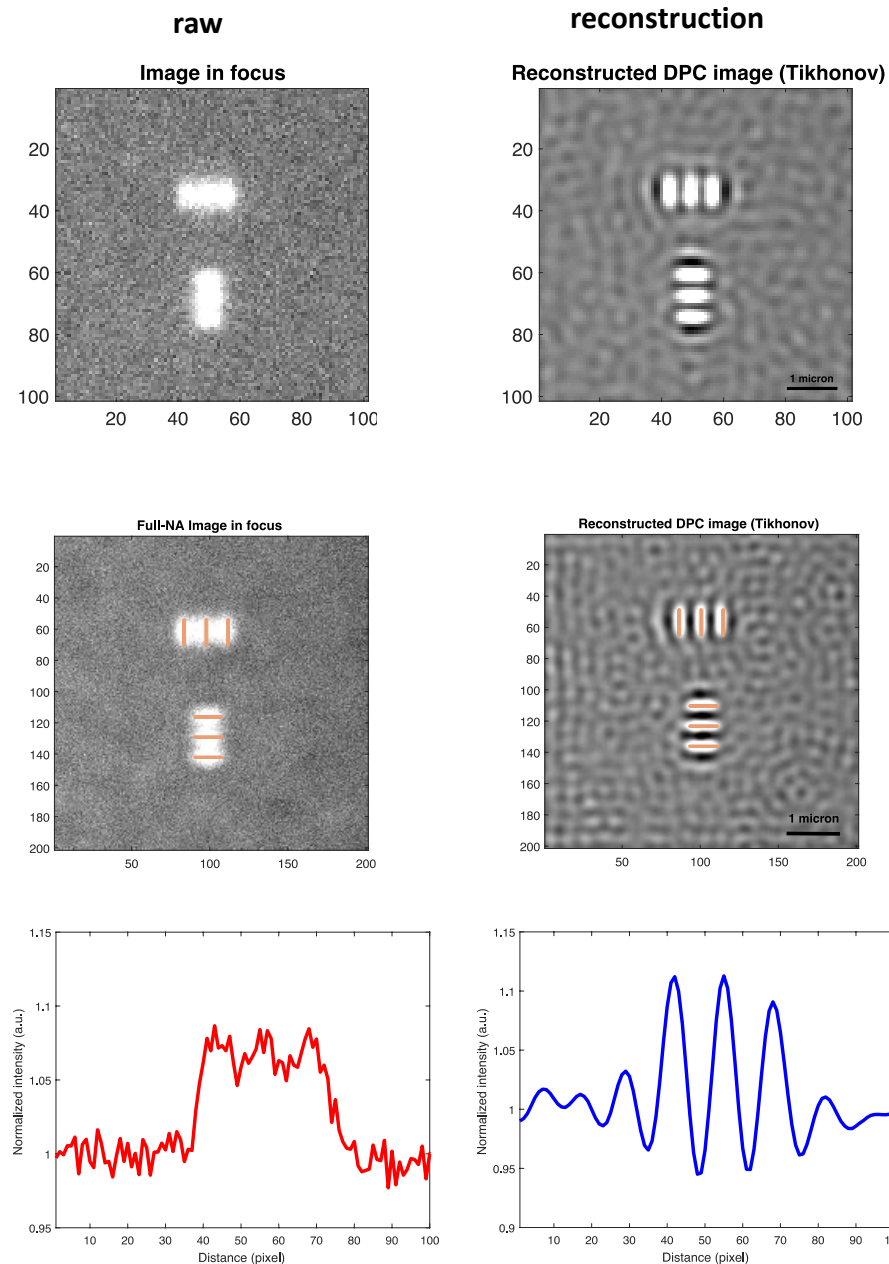
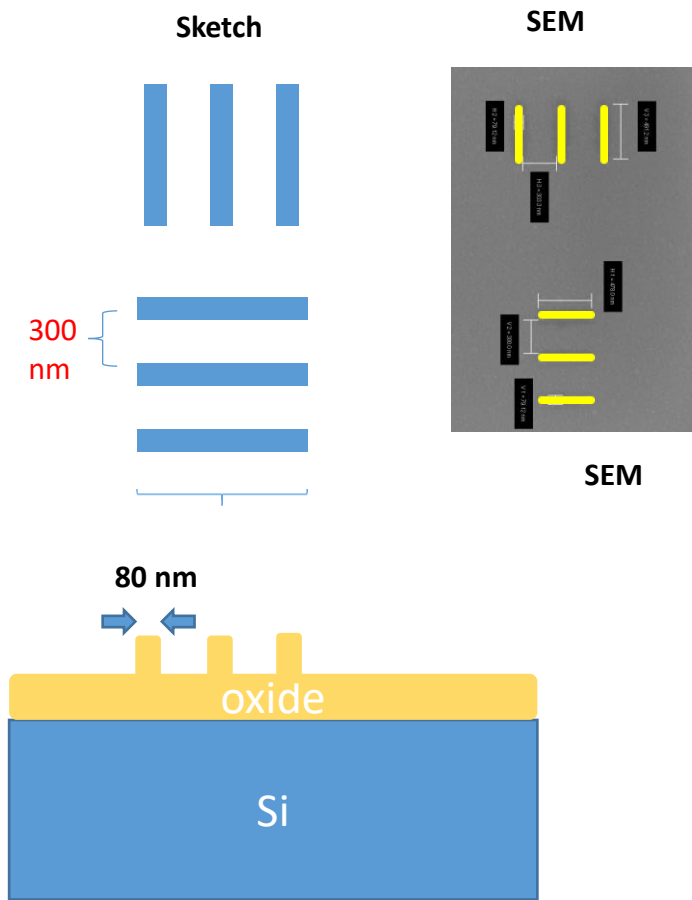
Fourier transforms of the transfer functions (H) for each asymmetric illumination configuration



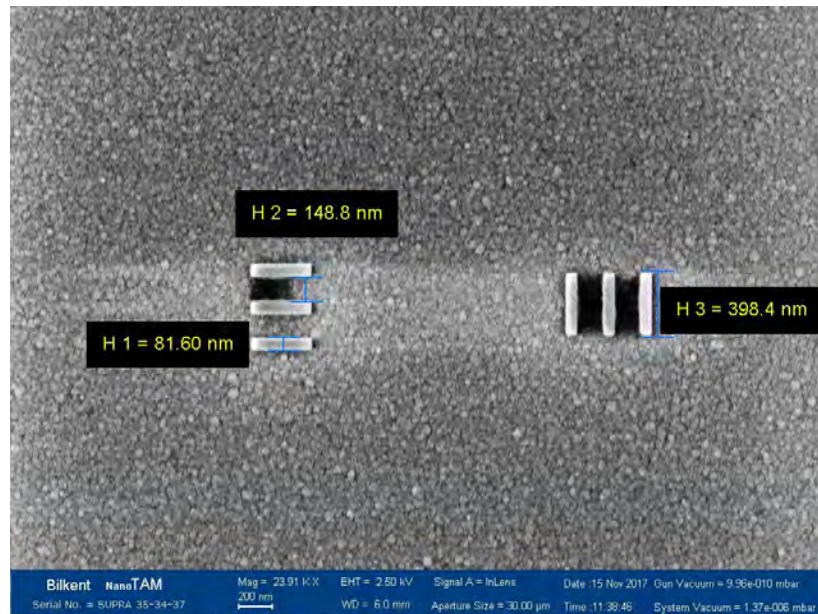


# Experimental Results

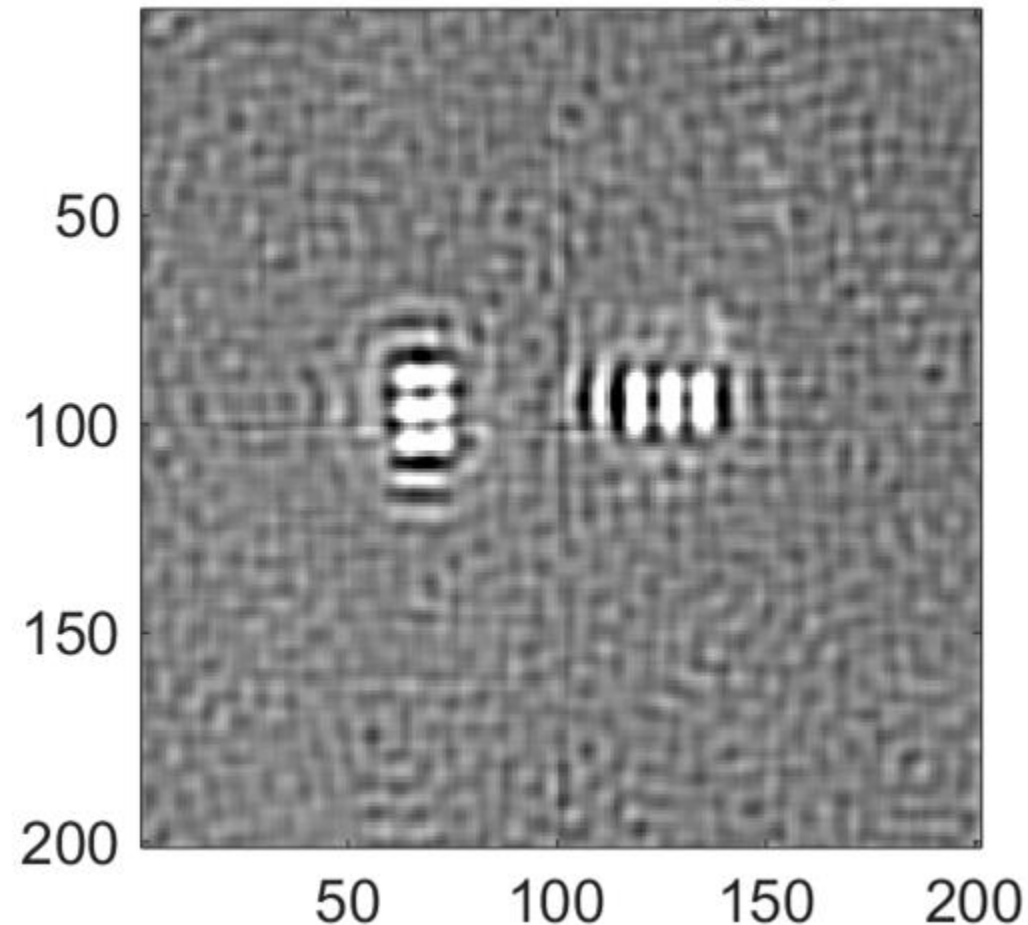
Sample – E-beam fabricated



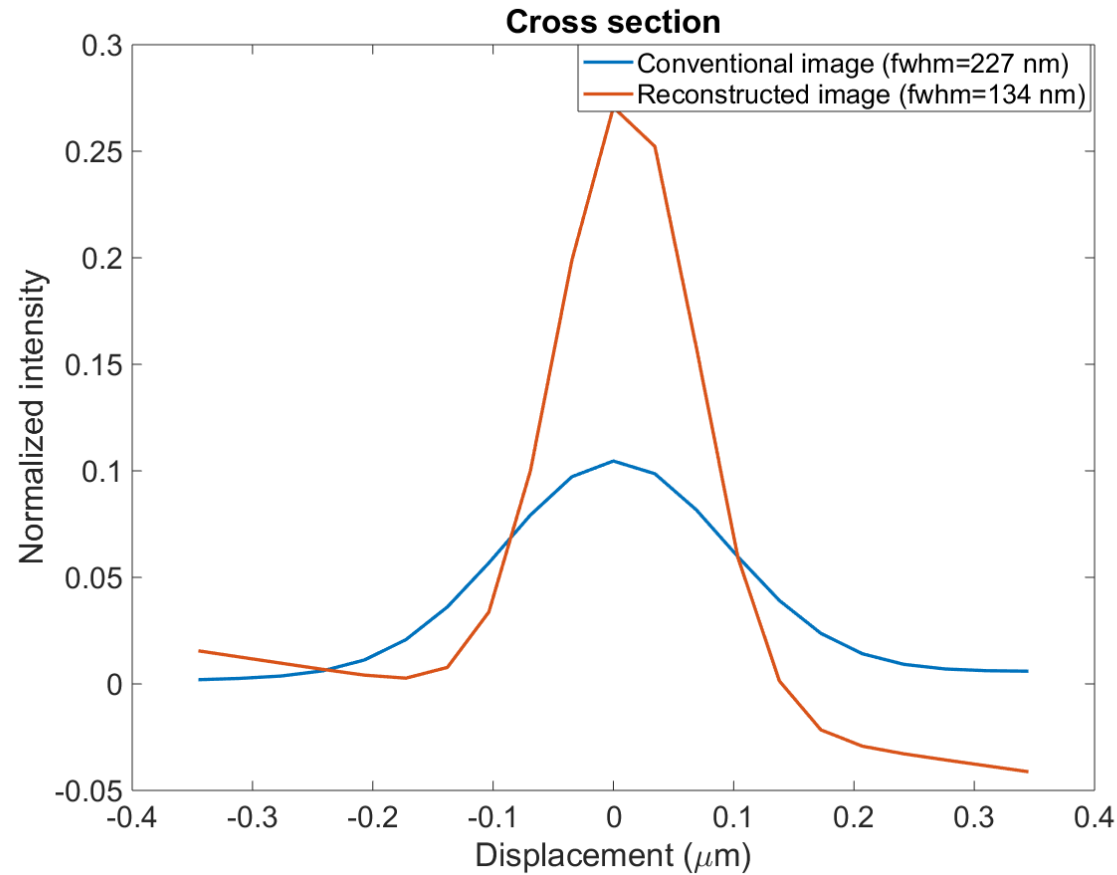
# 150 nm separation, 0.9 NA, $\lambda=420\text{nm}$



Reconstructed DPC image (Tikhonov)



# FWHM $\sim 130\text{nm} < (\lambda / 3)$



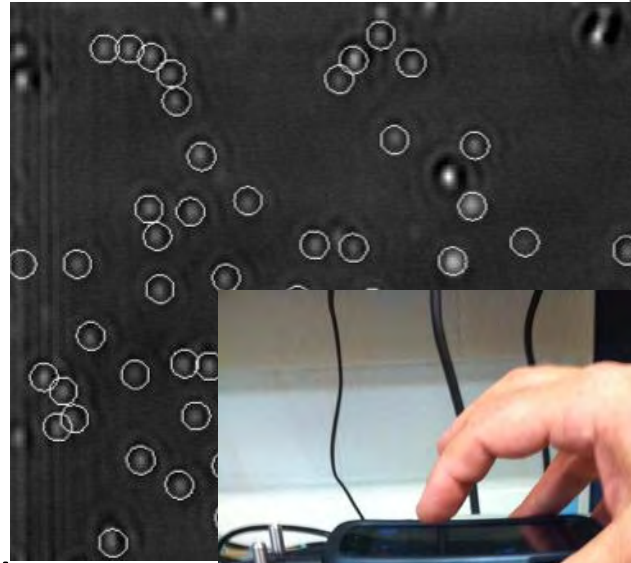


# CONCLUSIONS & FUTURE

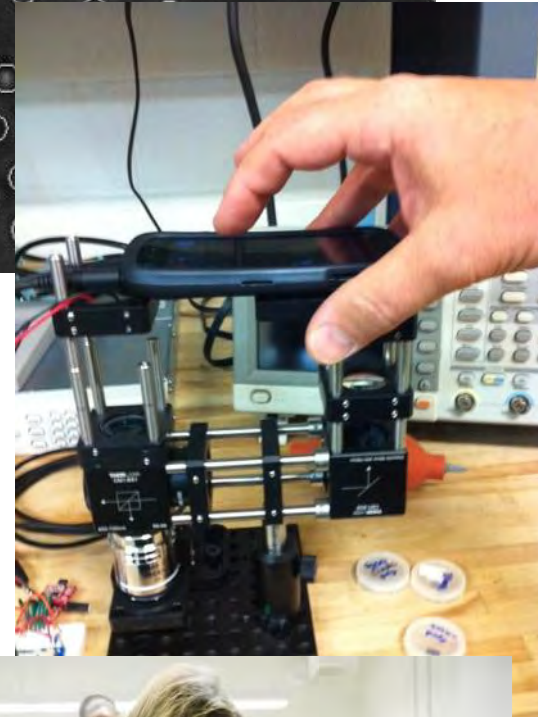
- Optical interference is a very powerful sensing technique.
- Multi-disciplinary innovation
- Single biological nanoparticle detection / counting / size and shape discrimination / visualization
- **Goals:** Down to  $r=20\text{nm}$  Biological nanoparticle detection in liquid
- Lateral resolution of  $\sim 100\text{nm}$  without labeling



INTEGRATED NANOPARTICLE ISOLATION AND  
DETECTION SYSTEM FOR COMPLETE ON-CHIP  
ANALYSIS OF EXOSOMES



50



Reconstructed DPC image

