

# Digital Holographic Microscopy Techniques for Applications in Cytometry and Histology

Björn Kemper

1.6.2021



**Biomedical Technology Center of the Medical Faculty  
University of Muenster  
Mendelstr. 17, D-48149 Muenster, Germany**

- **Digital holographic microscopy (DHM)**
  - Principles
  - Setups
- **Extraction of biophysical parameters (illustrated by selected applications)**
  - Adherent cell cultures
  - Suspended cells
  - Histological tissues

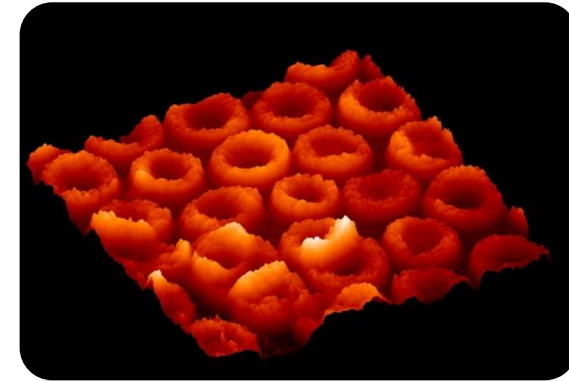
# **Quantitative phase imaging with digital holographic microscopy (DHM)**

# Digital Holographic Microscopy

## Features

- non-contact / non-destructive
- label-free
- full-field (no scanning)
- on-line ( $t_{\text{exp}} < 1 \text{ ms}$ )
- multi-focus, autofocus, subsequent numerical refocusing
- resolution:
  - axial  $< 3 \text{ nm}$  (depends on sample/setup)
  - lateral  $< 300 \text{ nm}$  (diffraction limited)
  - $\approx 70 \text{ nm}$  (synthetic aperture microscopy)

→ 3D nanoscopy)

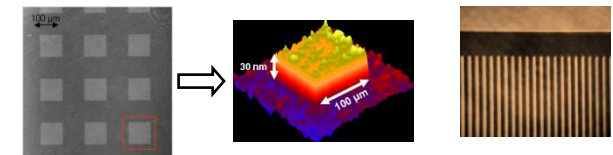
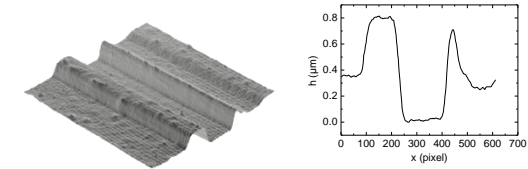


**quantitative  
phase imaging  
(QPI)**

# Applications of quantitative phase imaging

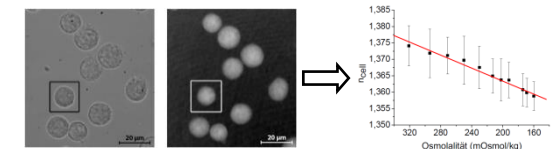
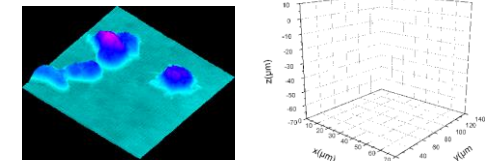
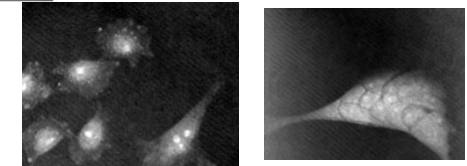
## Non-destructive testing

- surface metrology / topography measurements
- deformation analysis
- monitoring of photo disruption



## Quantitative imaging of cells and tissue

- morphology analysis  $\rightarrow$  reaction on drugs and toxins, cellular mechanics
- online growth analysis  $\rightarrow$  proliferation monitoring
- 2D, 3D cell tracking  $\rightarrow$  migration, motility
- refractive index  $\rightarrow$  intracellular (protein) concentrations, dry mass, label-free tomography, (optical) density of tissue sections



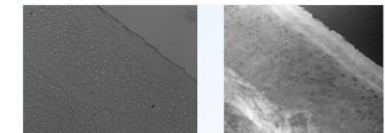
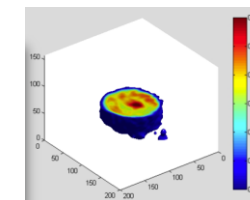
Recent review publications:

Y. K. Park, C. Depeursinge, G. Popescu, *Nat. Photon.* 12, 578-589 (2018).

B. Kemper et. al, *Bioanalytical Reviews* (2019), Ed.: J. Wegener, *BIOREV* (2019) 2: 219–272, Springer Nature)

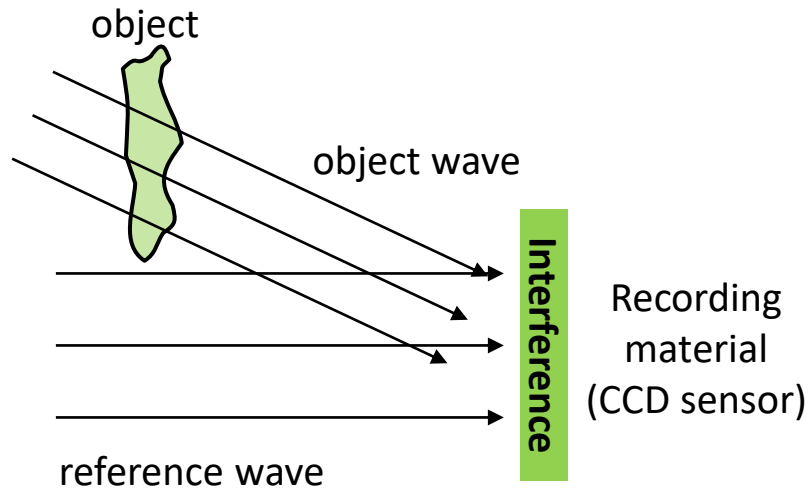
T. Cacace, V. Bianco, P. Ferraro, *Opt. Lasers Eng.*, 135. 106188 (2020)

...



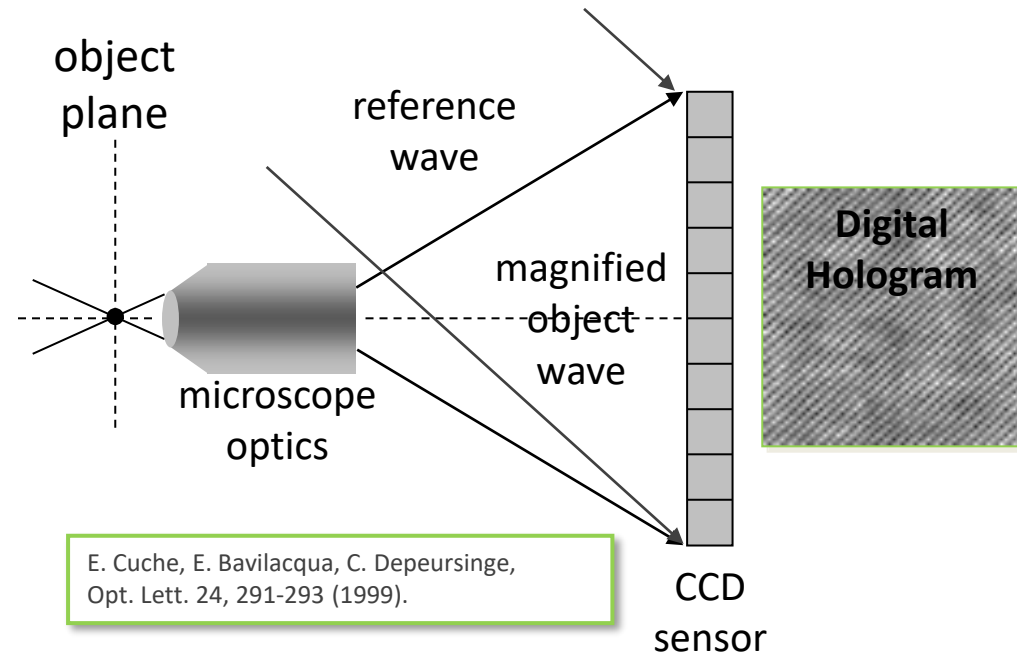
# Digital Holographic Microscopy (DHM)

## Lens less setup



E. N. Leith, and J. Upatnieks, J. Opt. Soc. Am. 52, 1123-1130 (1962).

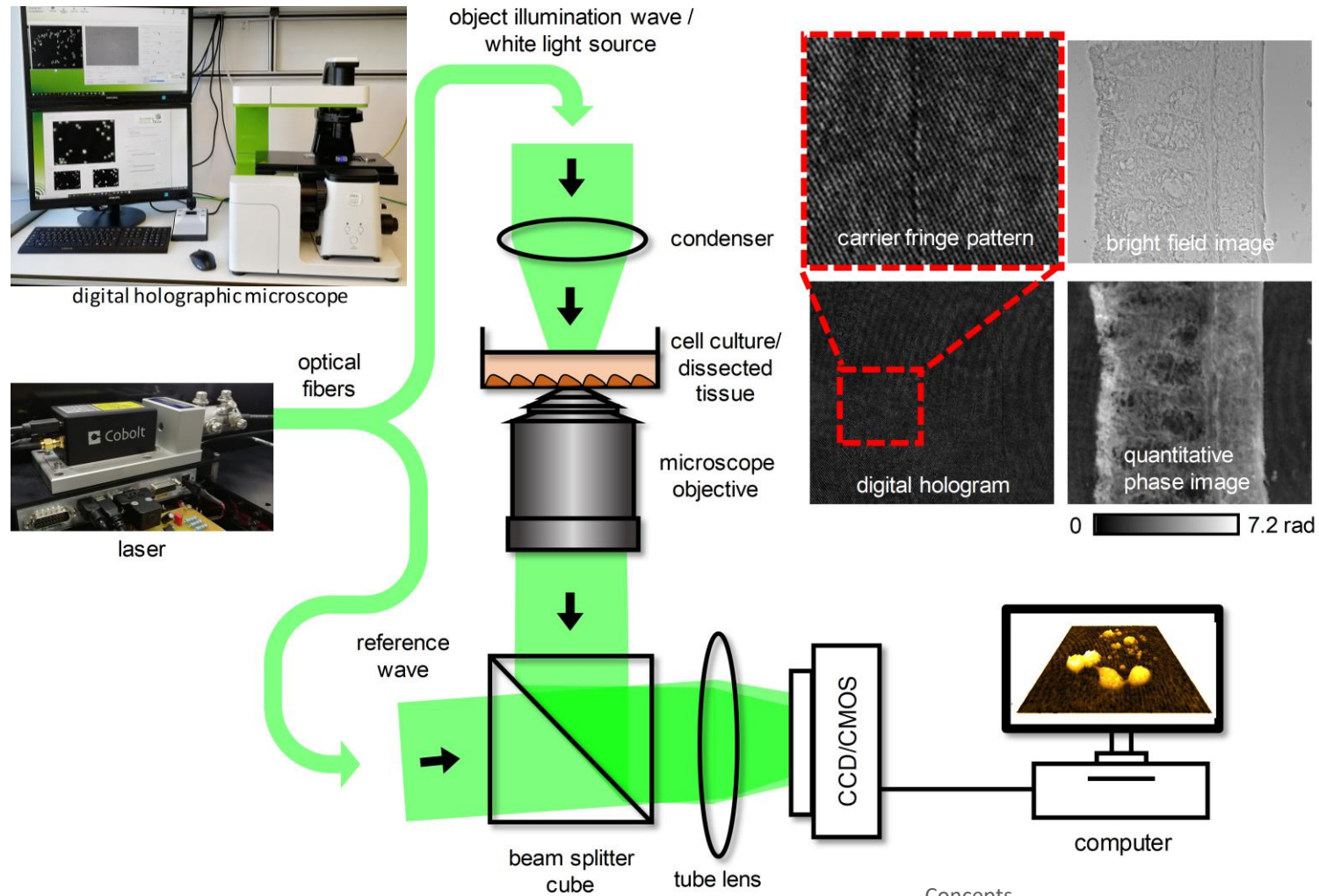
## Utilization of optical imaging systems



E. Cuhe, E. Baviacqua, C. Depeursinge, Opt. Lett. 24, 291-293 (1999).

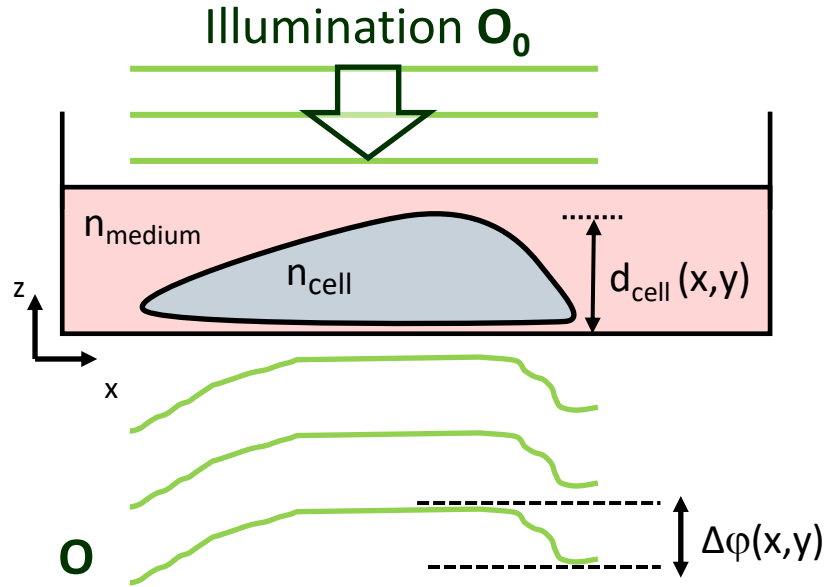
following Gabor, Nature 161, 777-778 (1948) Nobel Prize in Physics (1971) shortly  
 after the invention of the laser, Maiman, Nature, 187, 493-494 (1960)

# Modular DHM for quantitative phase imaging of living cell cultures and *ex vivo* tissues



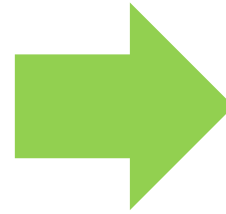
# Recording and numerical reconstruction of digital off-axis holograms

Living cell in a petri dish (phase object)

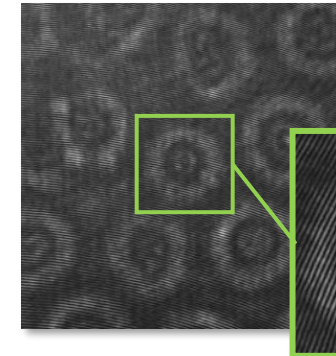


$$\Delta\varphi = \frac{2\pi}{\lambda} d_{\text{cell}} \cdot (n_{\text{cell}} - n_{\text{medium}})$$

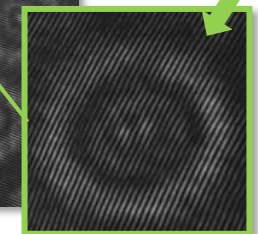
Carl et al., *Appl. Opt.* 43, 6536-6544 (2004)  
 Kemper et al., *J. Biomed. Opt.* 11 034005 (2006)  
 Langehanenberg et al., *Appl. Opt.* 47, D176-D182 (2008)  
 Kemper et al., *Appl. Opt.* 47, A52-A61 (2008)  
 Min et al., *Opt. Lett.* 42, 227-230 (2017).



digital off- axis hologram  
(red blood cells)



spatial  
carrier fringes



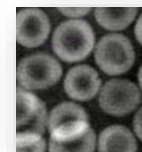
$$I_H \propto |O + R|^2 = |O|^2 + |R|^2 + O^*R + R^*O$$

numerical  
propagation of  $O$   
(optional)

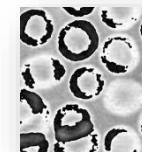
$O$ (hologram plane)  $\rightarrow$   $O'$ (image plane)

$$\Delta\varphi = \arctan(\text{Im}(O')/\text{Re}(O'))$$

(mod  $2\pi$ )



phase  
unwrapping



quantitative phase image

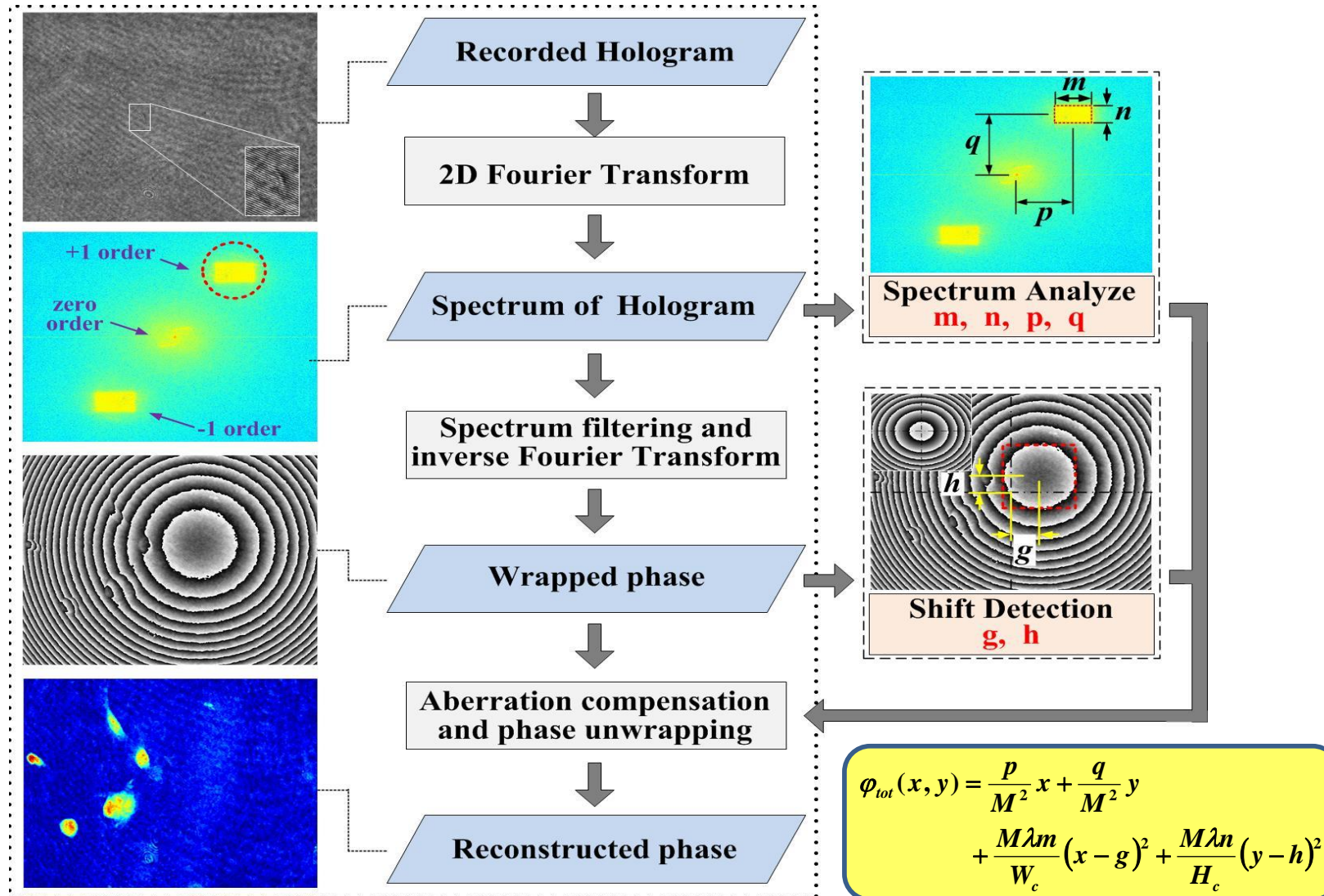


$|O'|$

amplitude image

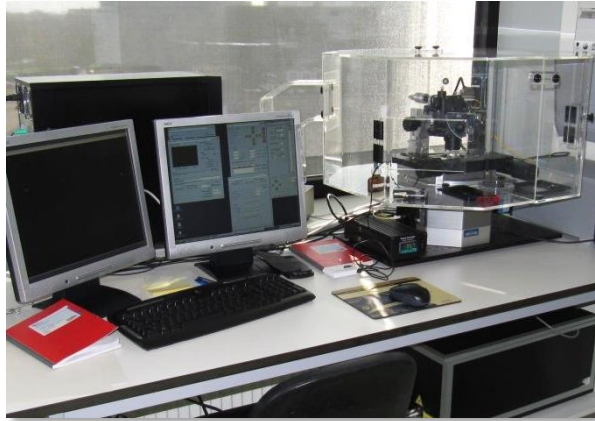


# Fourier transformation-based evaluation of off-axis holograms with simultaneous compensation of spherical aberrations

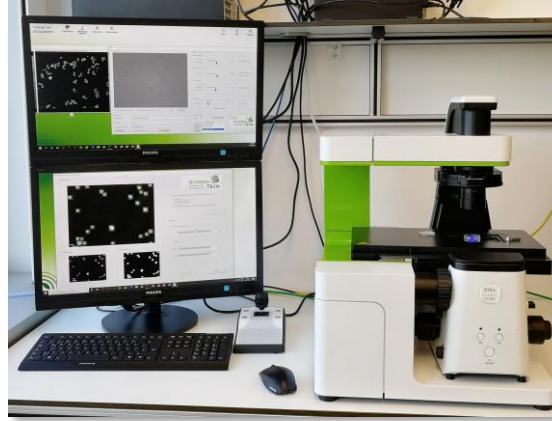


# Modular DHM @ BMTZ

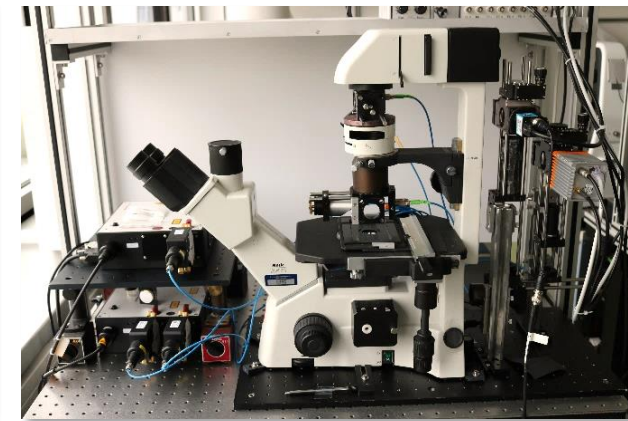
Flexible “general purpose” system



Automated live cell imaging

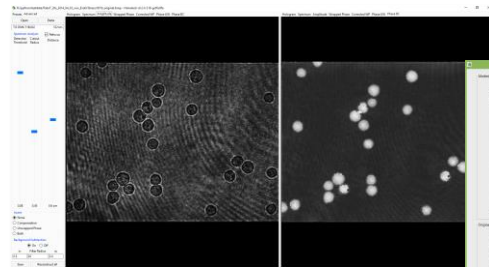


Multi-spectral DHM (450-1700nm)



Physiological Environment: CO<sub>2</sub> atmosphere, T = 37 °C

## Software

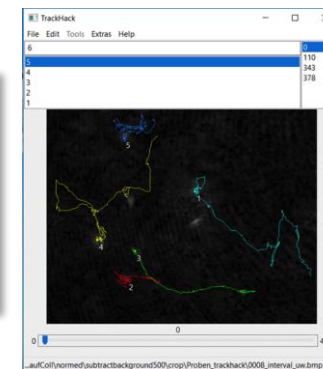


reconstruction



segmentation

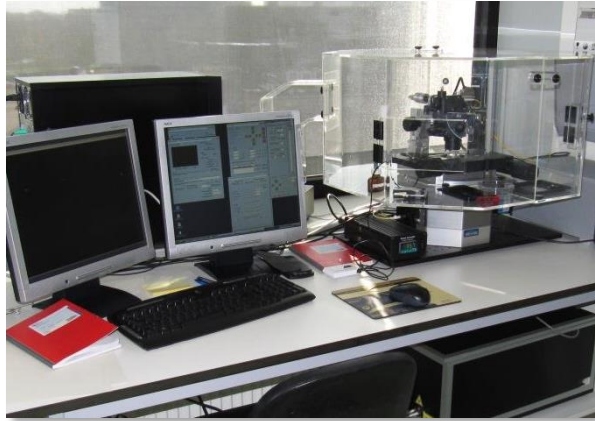
parameter retrieval  
(refractive index,  
volume, dry mass,...)



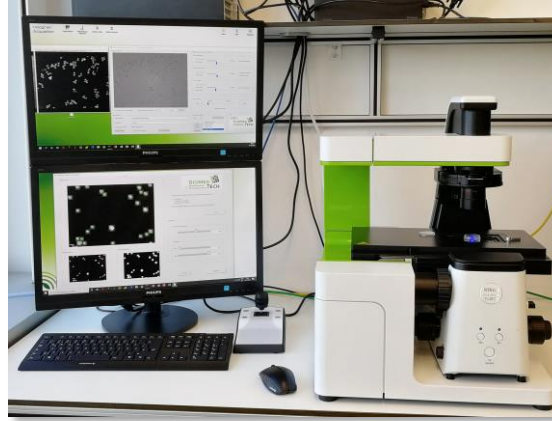
cell tracking

# Modular DHM @ BMTZ

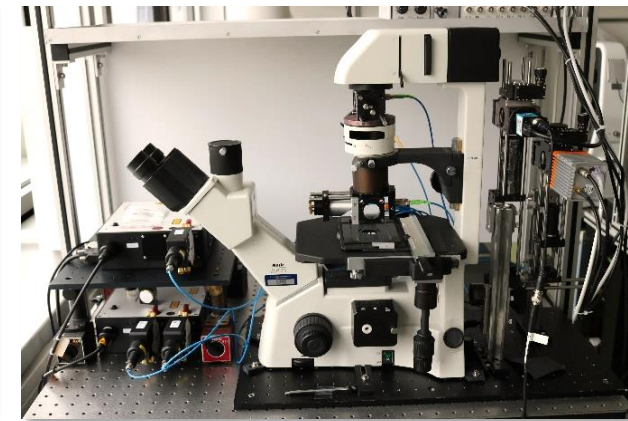
Flexible “general purpose” system



automated live cell imaging



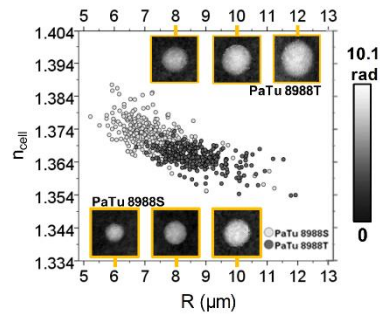
Multi-spectral DHM (450-1700nm)



Physiological Environment: CO<sub>2</sub> atmosphere, T = 37 °C

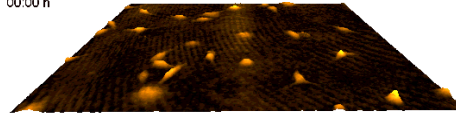
**suspended cells**

phenotyping,  
cell culture quality control

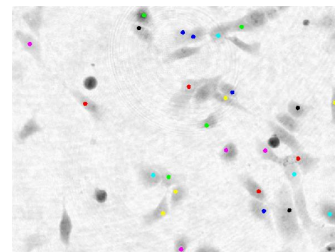


**adherend cells**

dynamic morphology imaging  
00:00h

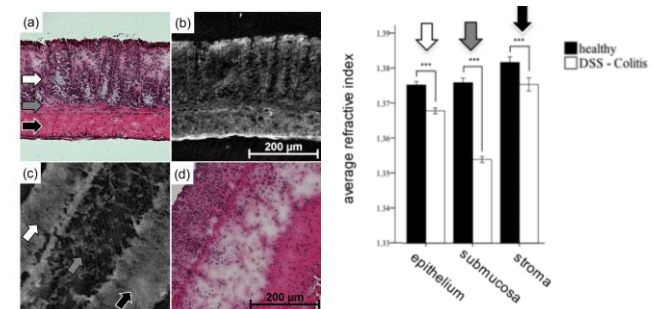


automated cell tracking



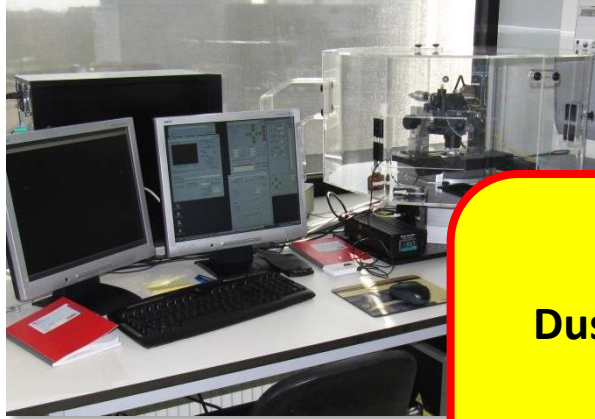
**tissue slices**

quantification of inflammation  
mediated tissue sections

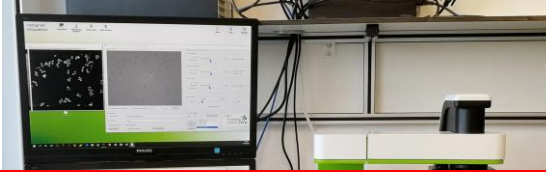


# Modular DHM @ BMTZ

Flexible “general purpose” system



automated live cell imaging



Multi-spectral DHM (450-1700nm)



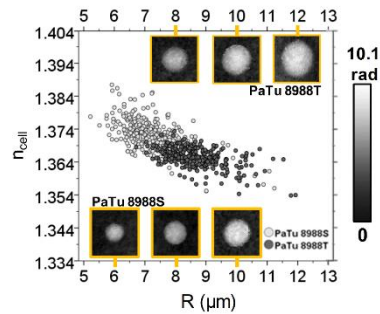
**Laser-based DHM**

**Dust, particles and imperfections in the optical imaging system**

**→ Cause parasitic interference patterns and coherence induced noise**

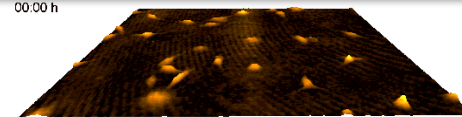
suspended cells

phenotyping,  
cell culture quality control

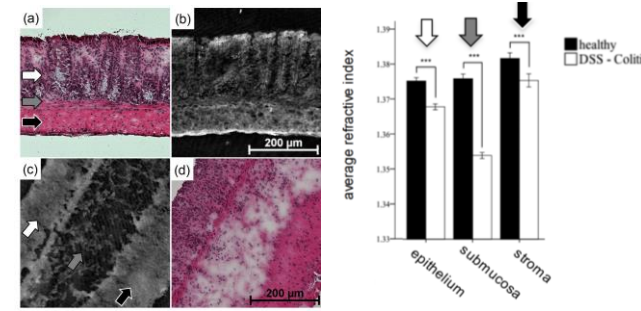
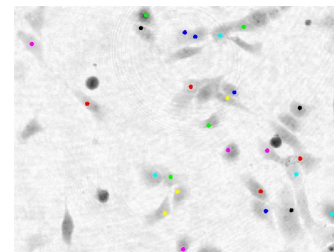


tissue slices

quantification of inflammation  
mediated tissue sections

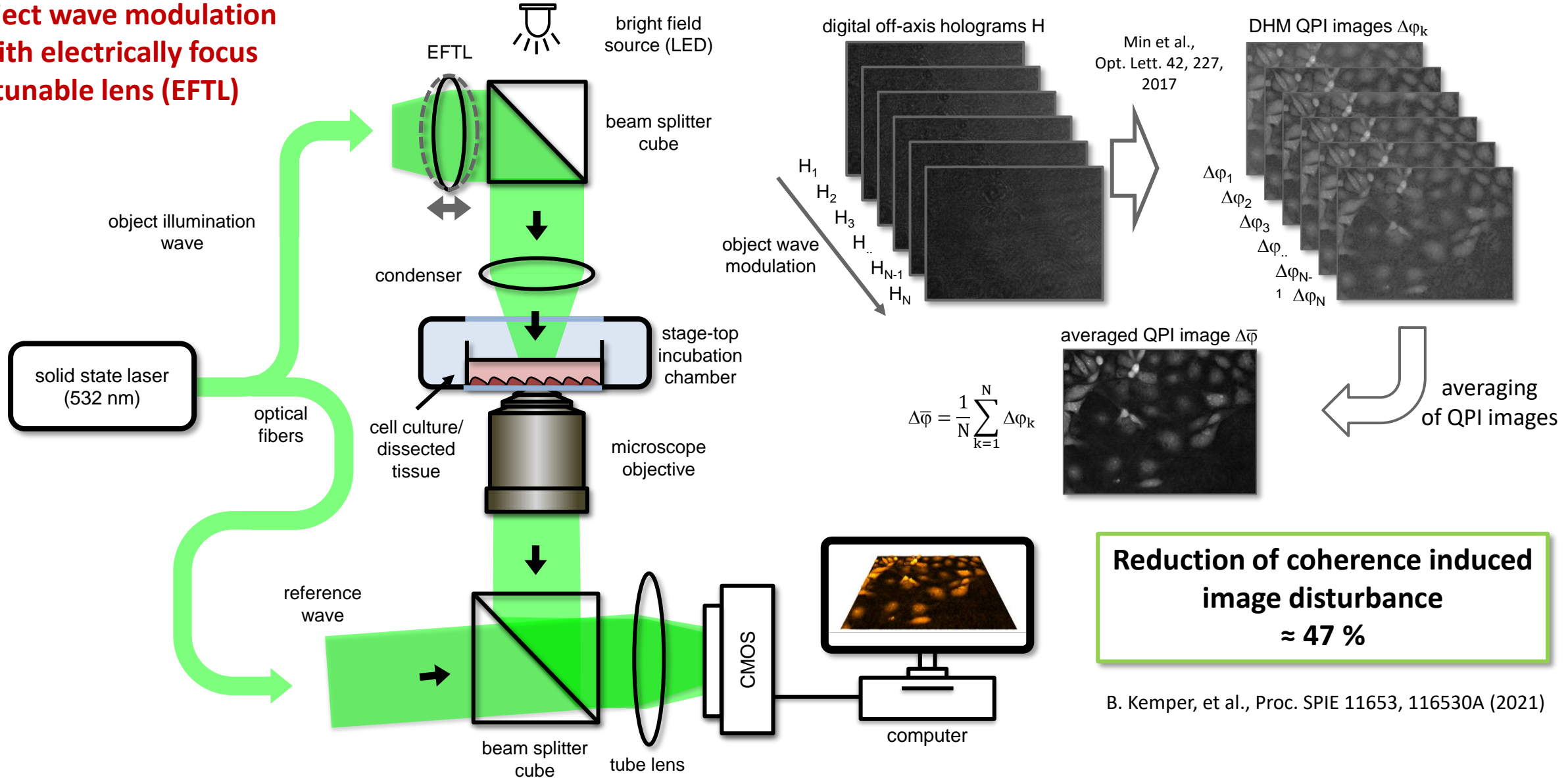


automated cell tracking



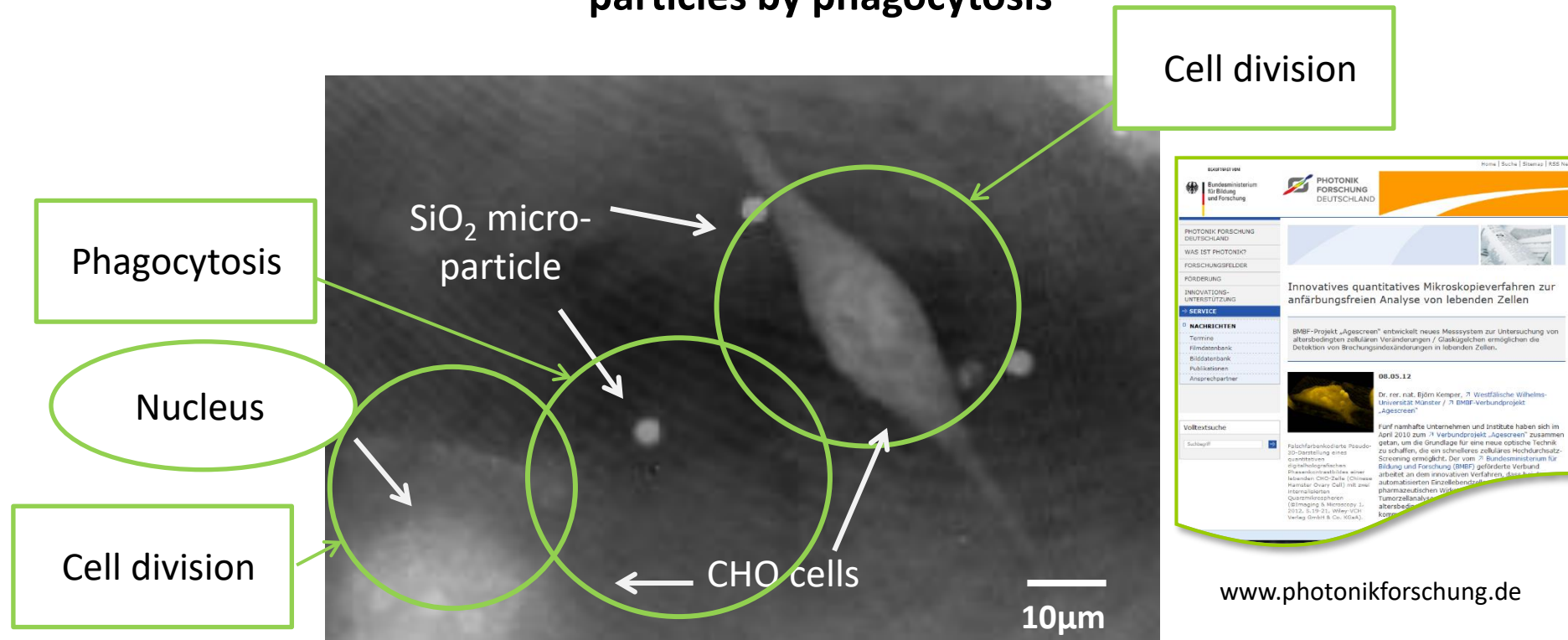
# Concept for enhancement of QPI (compatible with off-axis DHM and inverted research microscopes)

## Object wave modulation with electrically focus tunable lens (EFTL)



# DHM QPI of living cells

## Chinese hamster ovary (CHO) cells internalize silica $\text{SiO}_2$ particles by phagocytosis



Cell division

Phagocytosis

Nucleus

Cell division

$\text{SiO}_2$  micro-particle

CHO cells

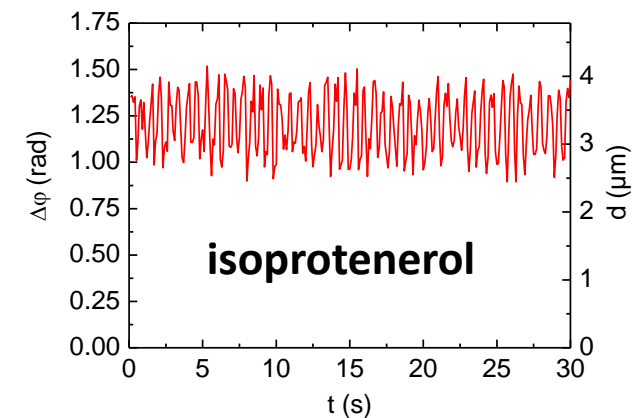
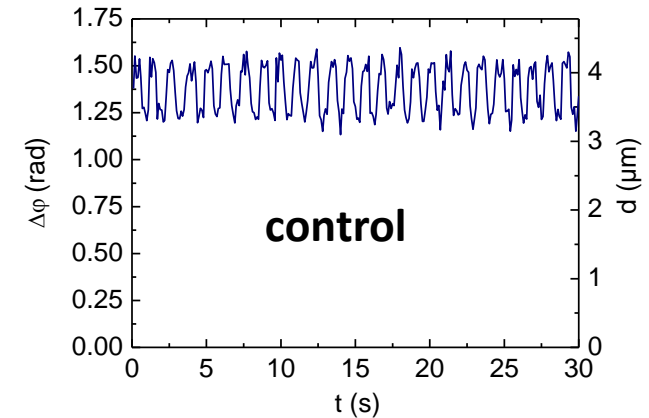
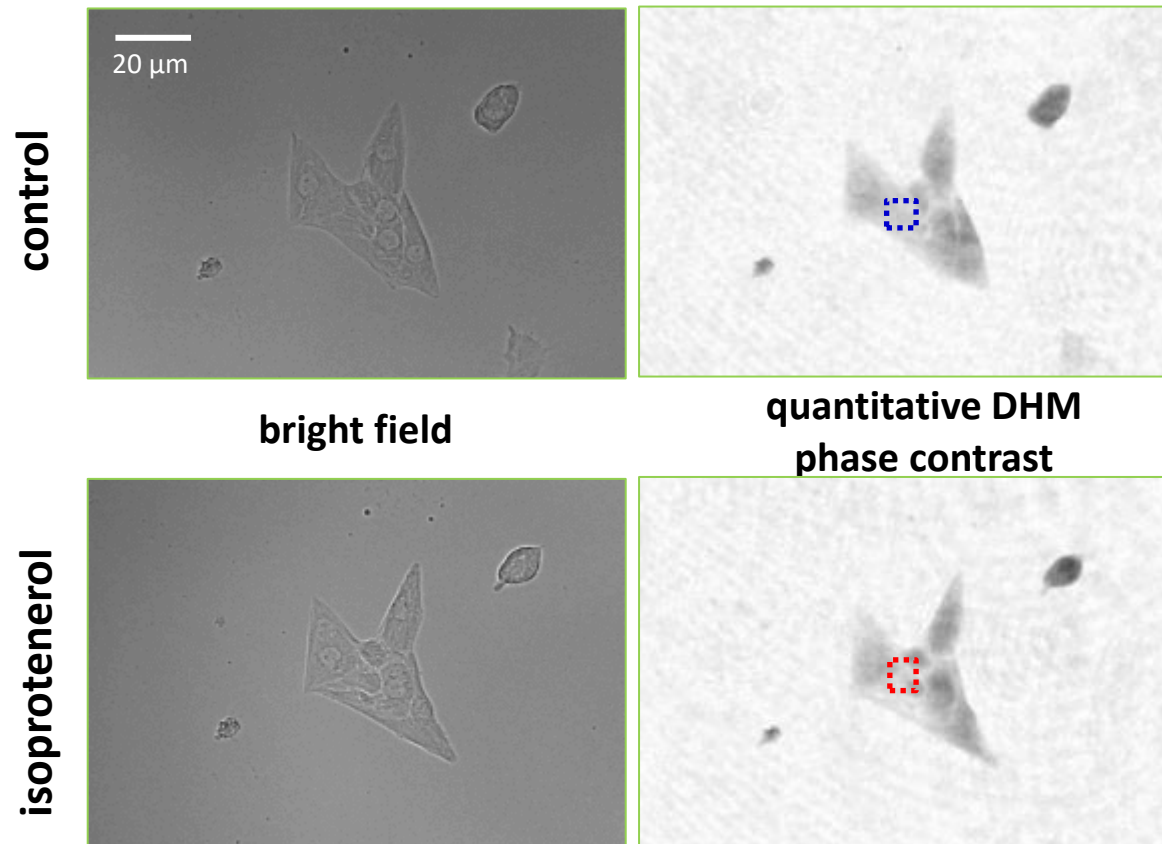
10  $\mu\text{m}$



[www.photonikforschung.de](http://www.photonikforschung.de)

# Example: Dynamic label-free DHM imaging of cardiomyocytes

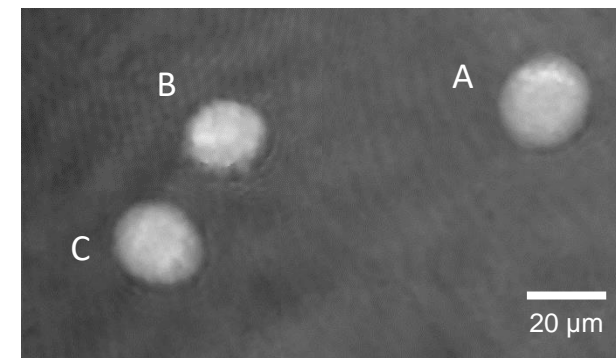
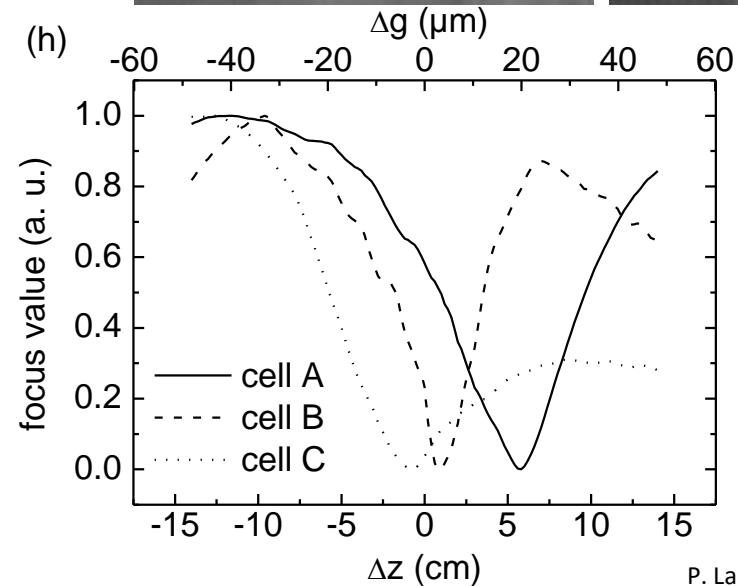
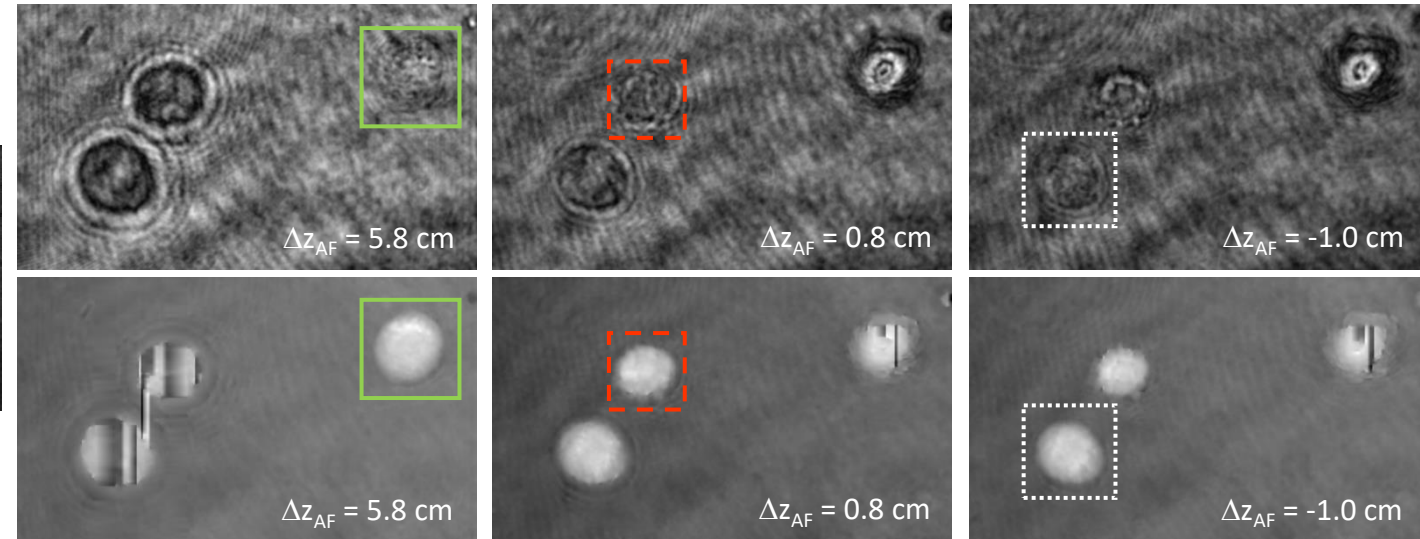
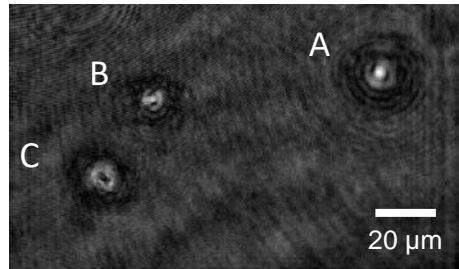
## Stimulation with isoprotenerol



➔ **Increased contractility**

# Multi-focus imaging and z-location of cells in suspension

amplitude stack  
from a single hologram



merged phase contrast image  
→ “enhanced depth of field”



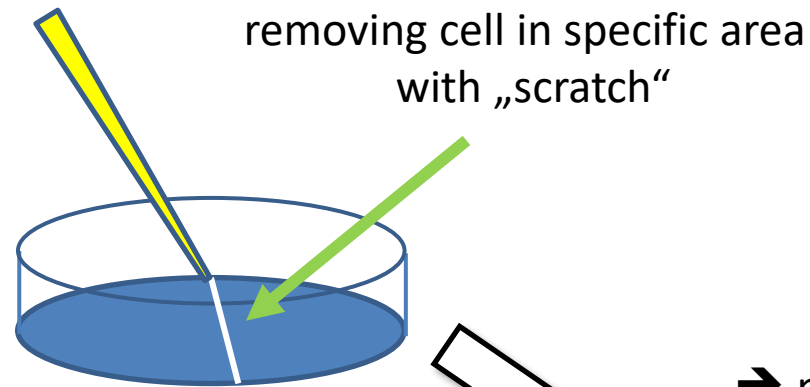
# **Extraction of biophysical parameters (illustrated by selected applications)**

# QPI-based label-free quantitative monitoring in-vitro migration / wound healing assays

## Examples for preparation

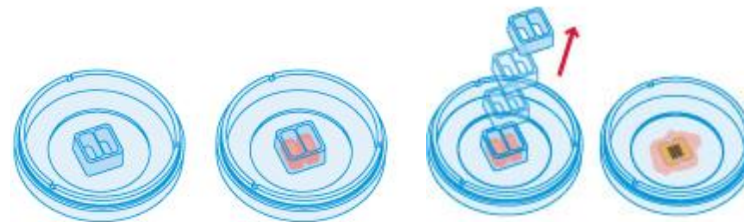
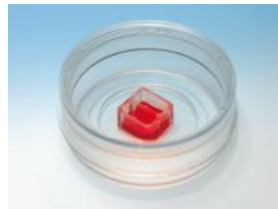
1

Petri dish  
with confluent  
cell layer

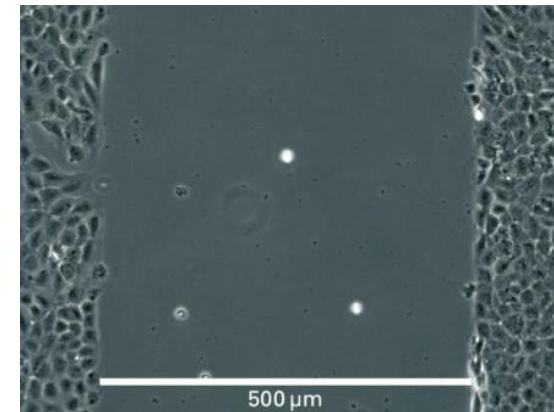


→ monitoring of  
cell migration into tissue gap

2



[www.ibidi.com](http://www.ibidi.com)



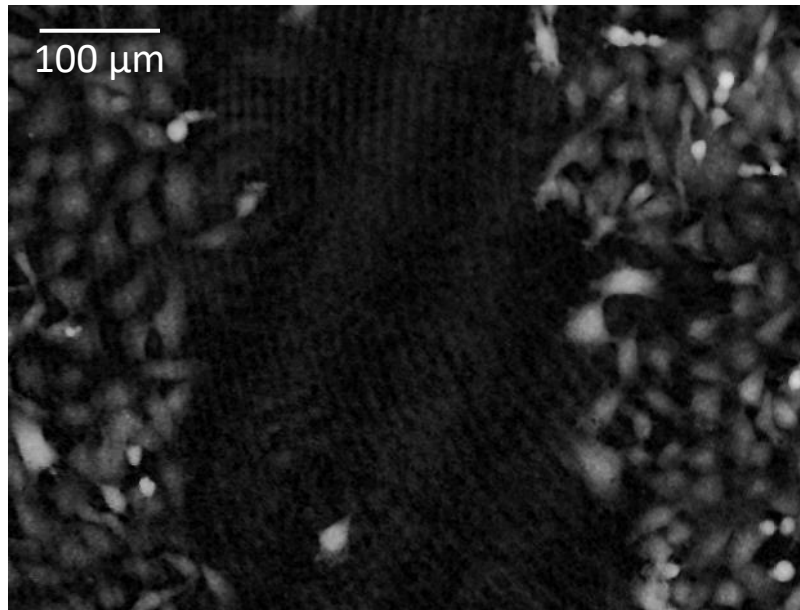
bright field Zernike phase contrast

[www.ibidi.com](http://www.ibidi.com)

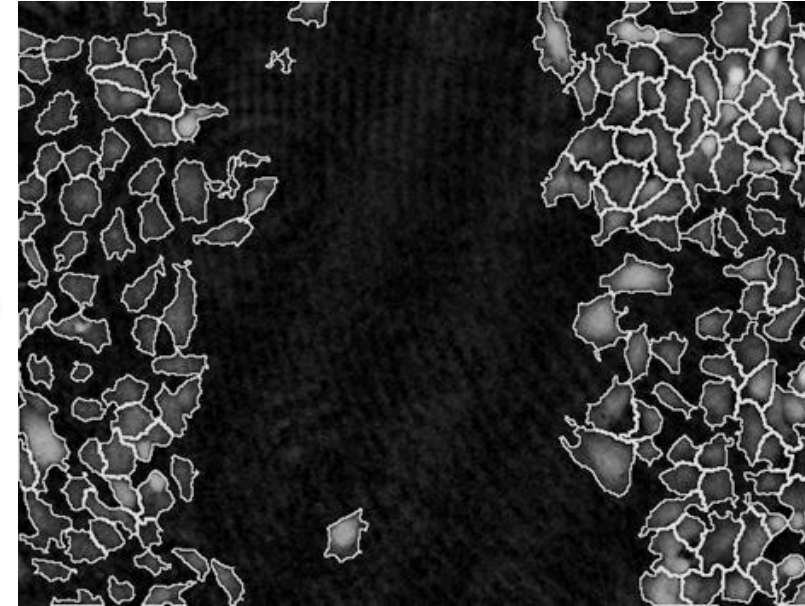
# QPI-based label-free quantitative monitoring in-vitro migration / wound healing assays

Example: human fibro sarcoma cells, HT1080

phase contrast image:  $\Delta\varphi_{\text{cell}}(x, y)$



segmentation  $\rightarrow S_c, \Delta\bar{\varphi}_{\text{cell}}$



area covered  
by cells

$$S_c$$

dry mass

$$\text{DM} = \frac{10\lambda}{2\pi\alpha} \int_{S_c} \Delta\varphi_{\text{cell}} ds = \frac{10\lambda}{2\pi\alpha} \Delta\bar{\varphi}_{\text{cell}} S_c$$

$$\alpha \approx 0,0002 \text{ m}^3/\text{kg}$$

average cell thickness

$$\bar{d}_{\text{cell}} = \frac{\lambda\Delta\bar{\varphi}_{\text{cell}}}{2\pi} \cdot \frac{1}{|n_{\text{cell}} - n_{\text{medium}}|}$$

10x,  $\lambda = 532 \text{ nm}$

# QPI-based label-free quantitative monitoring of in-vitro migration / wound healing assays

quantitative DHM phase images

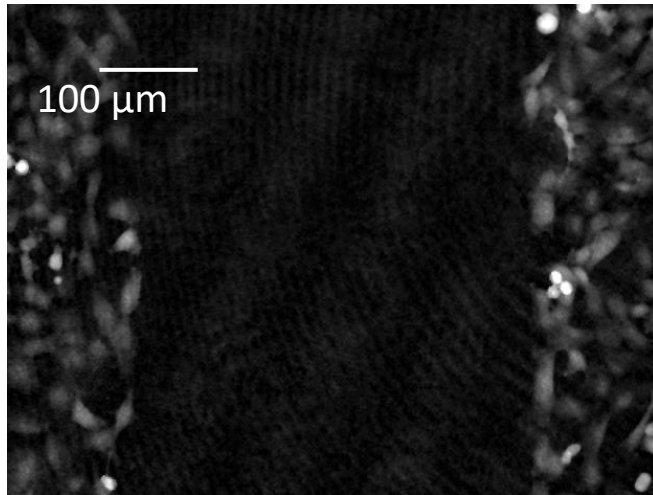
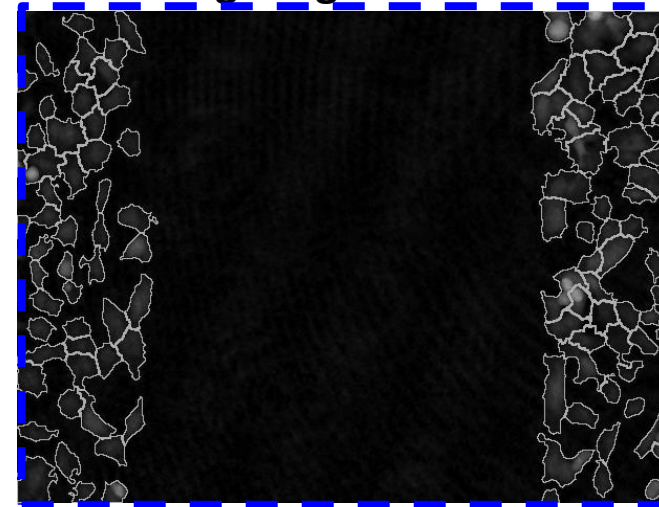


image segmentation

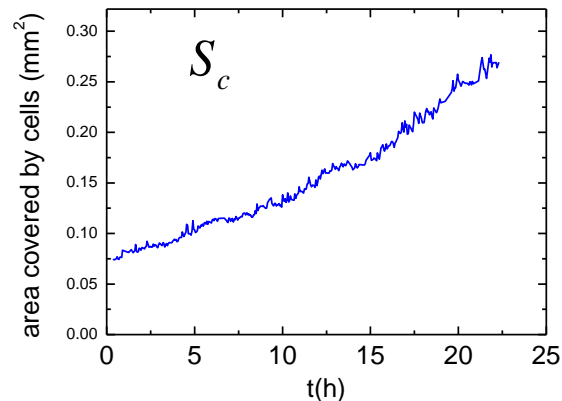


t = 0 – 24 h  
Δt = 3 min

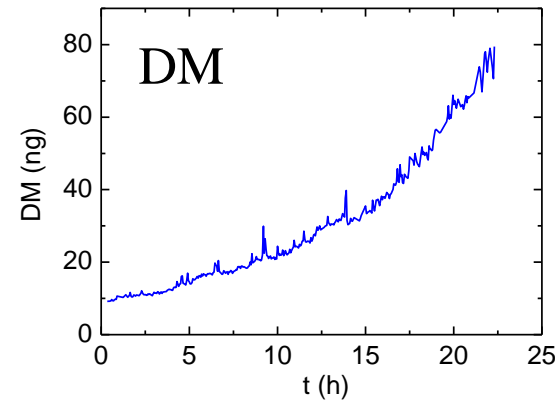


averaging

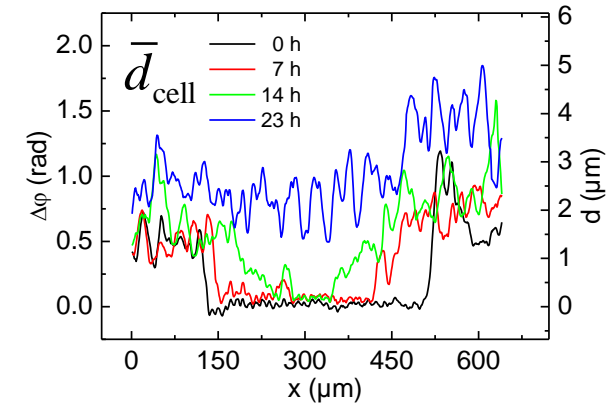
area covered by cells



dry mass



mean cell culture thickness

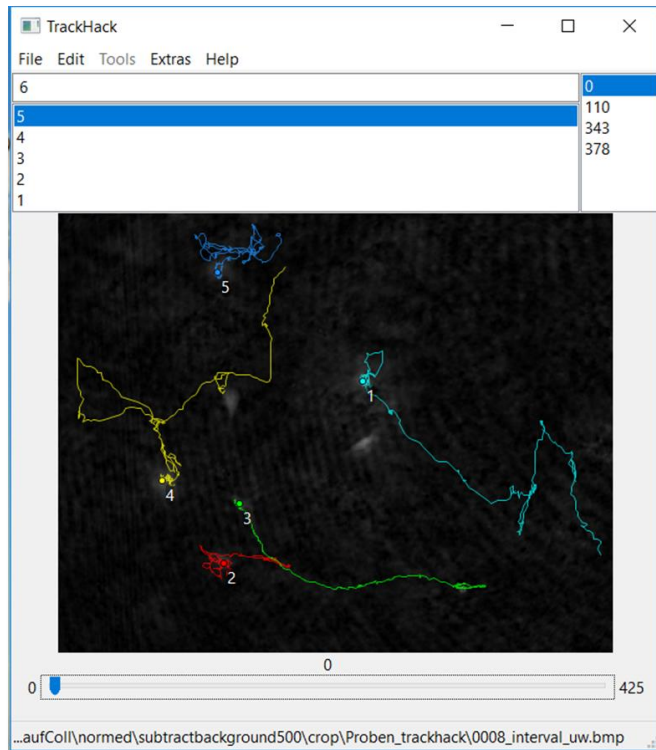


- D. Bettenworth, P. Lenz, P. Krausewitz, M. Brückner, S. Ketelhut, G. von Bally, D. Domagk, B. Kemper, Proc. SPIE 8797, 879702 (2013)  
 D. Bettenworth, D. Bettenworth, P. Lenz, P. Krausewitz, M. Brückner, S. Ketelhut, D. Domagk, B. Kemper, PLOS ONE 9, 07317 (2014).  
 D. Bettenworth, A. Bokemeier, C. Poremba, N. S. Ding, S. Ketelhut, P. Lenz, B. Kemper, Histol. Histopathol. 33, 417-432 (2018)

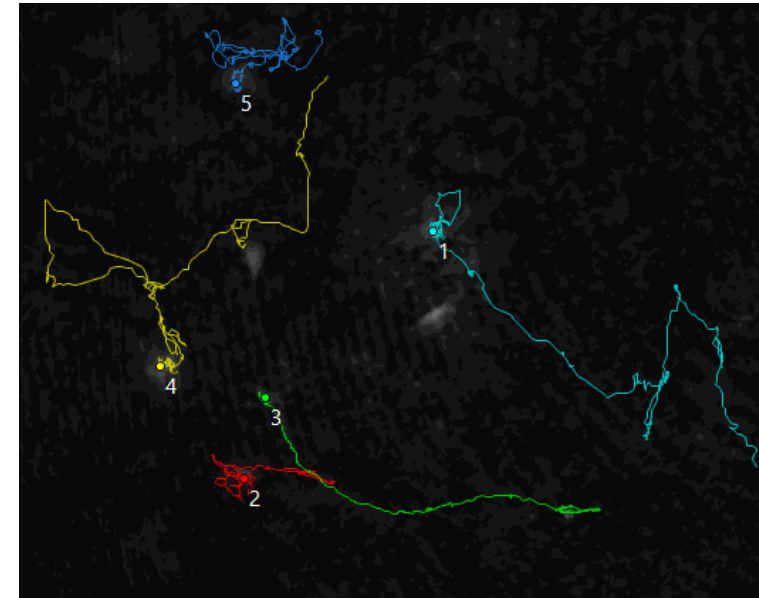
# Automated cell tracking

# QPI-based automated 2D cell tracking

## Software



## Cell tracking by detection of the maximum cell induced phase contrast



10x, NA=0.3,  
532 nm

→ Fast automated cell tracking  
(e.g., 800 images in  $\approx$  1-2 sec)

→ extraction of various migration related parameters (Mean squared displacement, max. migration distance, FMI, directness, velocity, ...)

# Quantification of cell motility

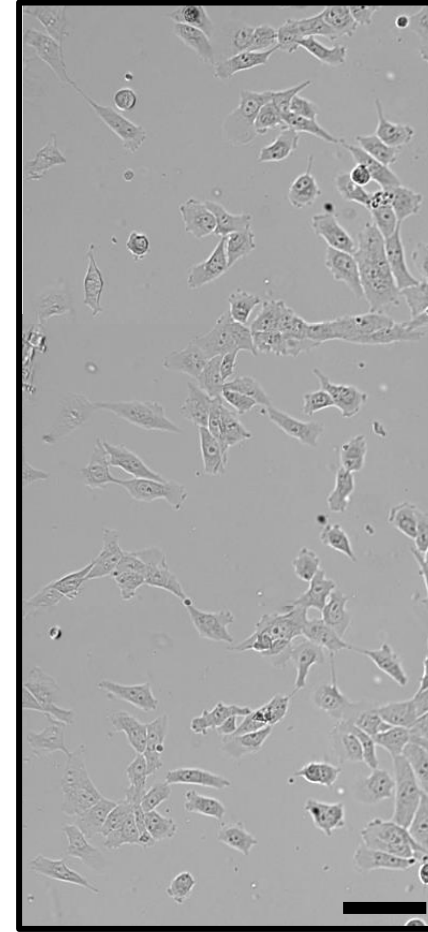
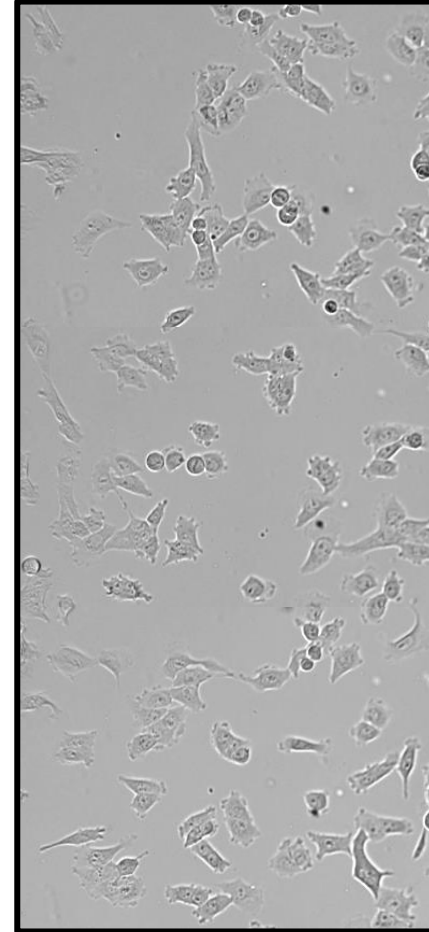
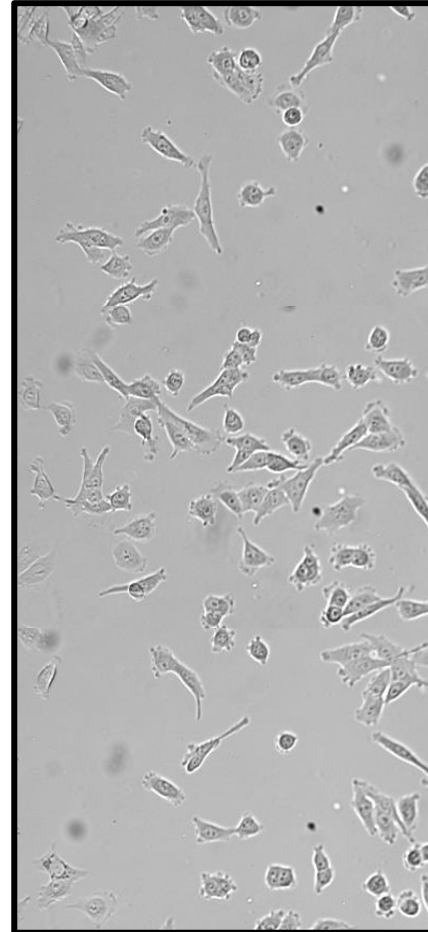
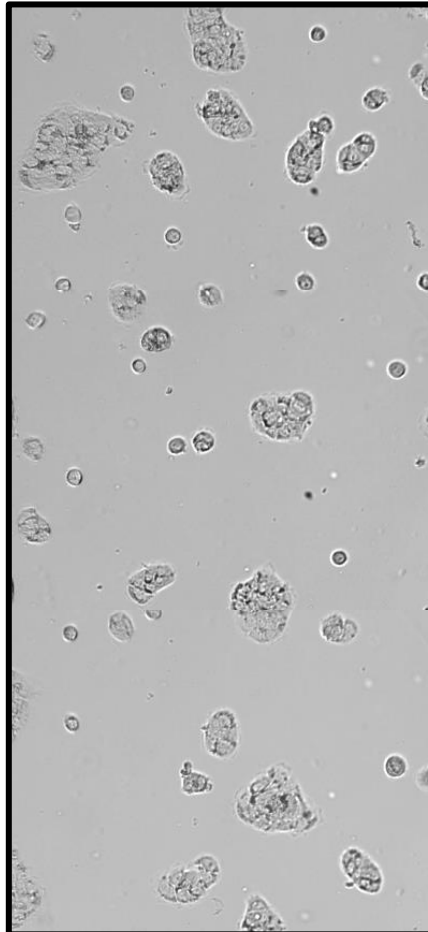
## Bright field bright field time-lapse observation of pancreatic tumor cells

PaTuS<sub>WT</sub>

PaTuT<sub>WT</sub>

PaTuT<sub>C</sub>

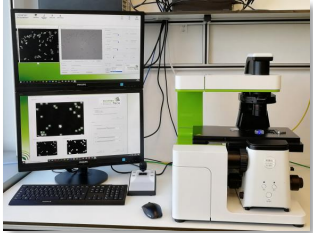
PaTuT<sub>E</sub>



00:00 h

Stitched images recorded a different fields of view (20x), t = 12 h

100  $\mu$ m



# Determination of cell motility

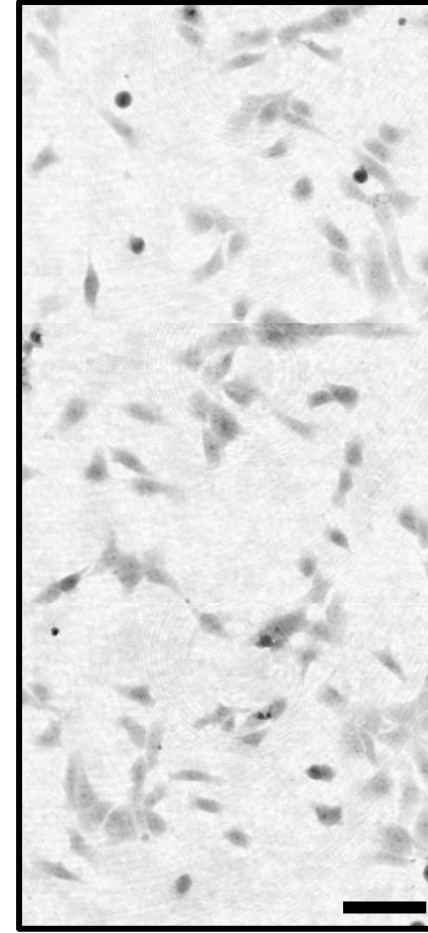
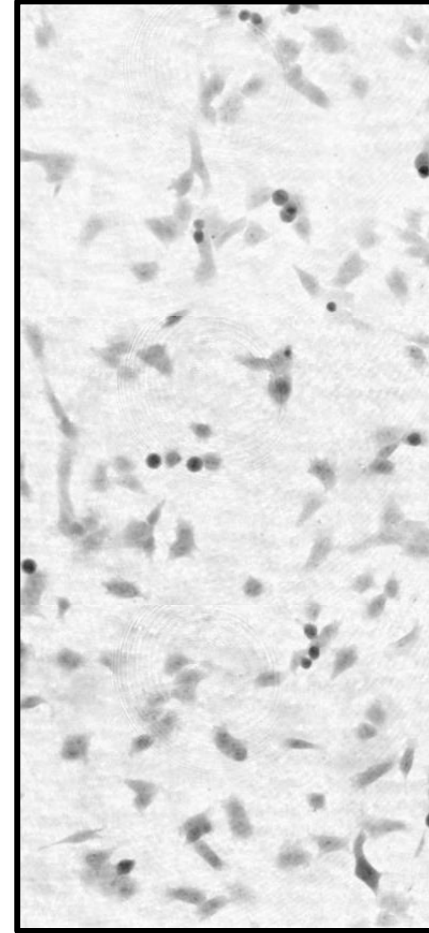
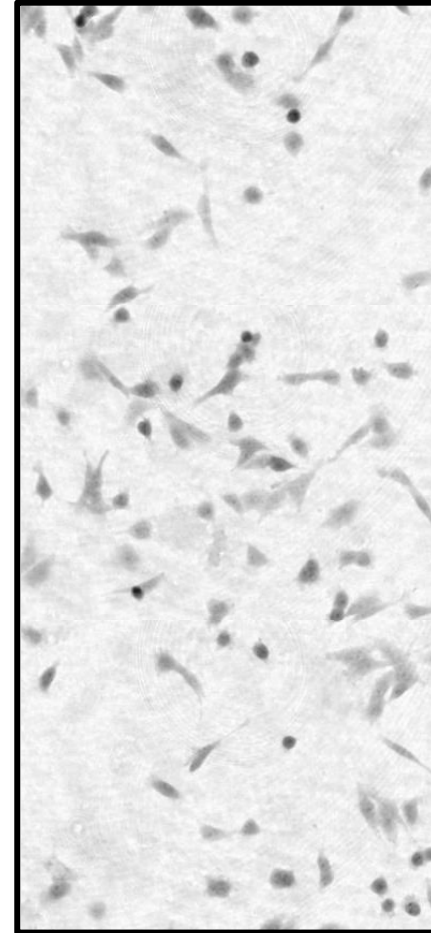
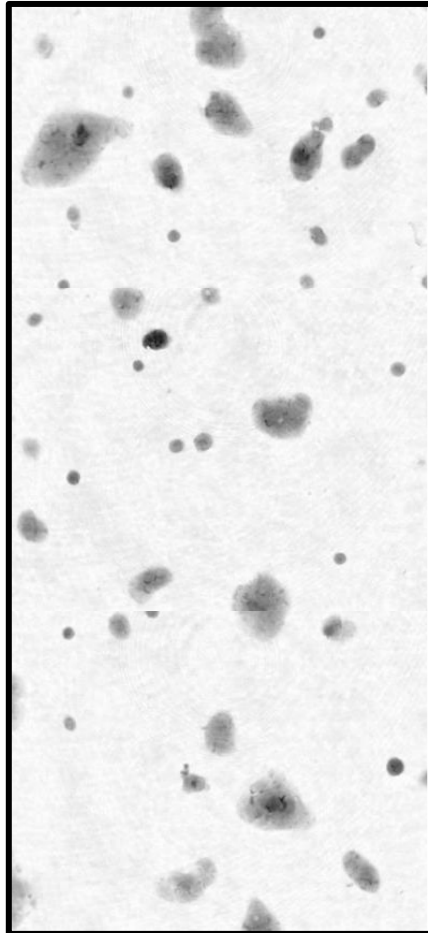
## Quantitative DHM Phase images of pancreatic tumor cells

PaTuS<sub>WT</sub>

PaTuT<sub>WT</sub>

PaTuT<sub>C</sub>

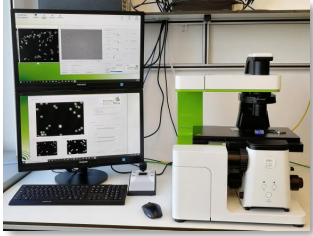
PaTuT<sub>E</sub>



00:00 h

Stitched images recorded a different fields of view (20x), t = 12 h

100  $\mu$ m





# Determination of cell motility

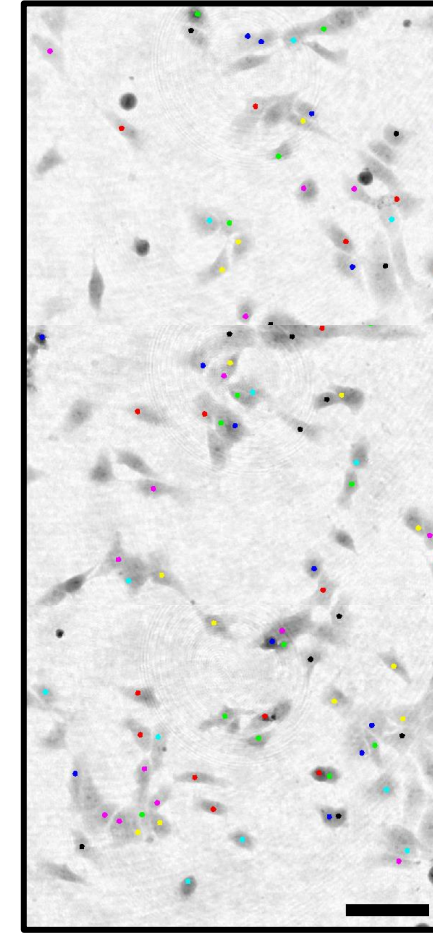
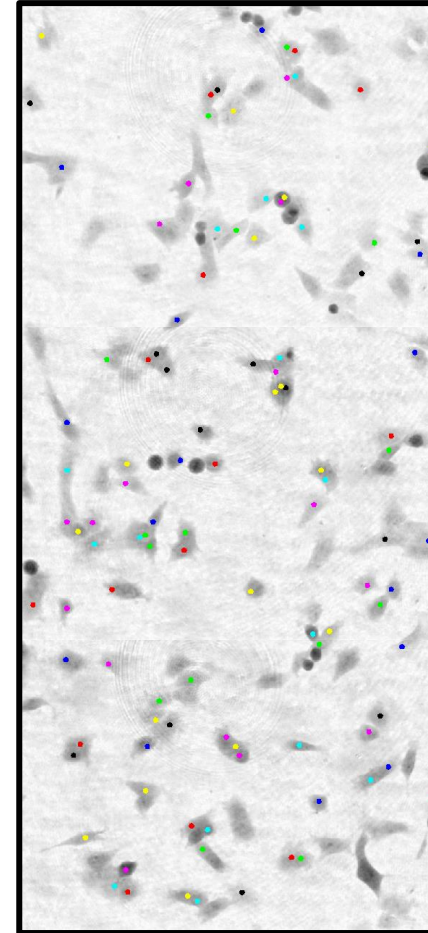
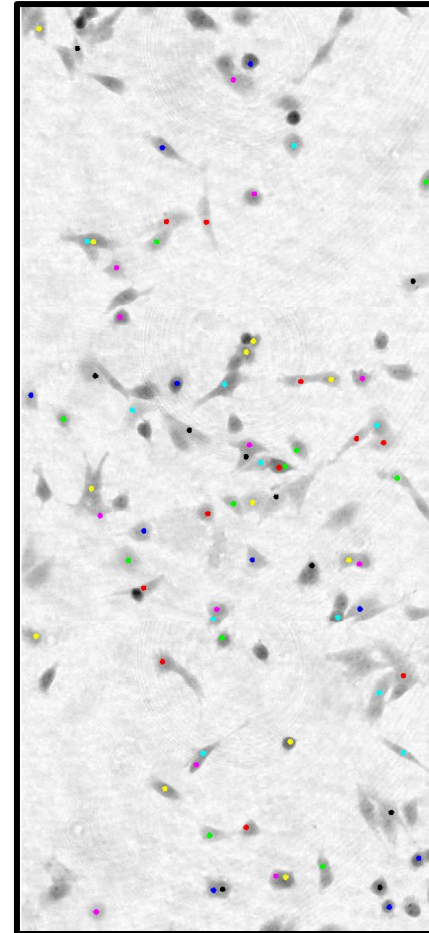
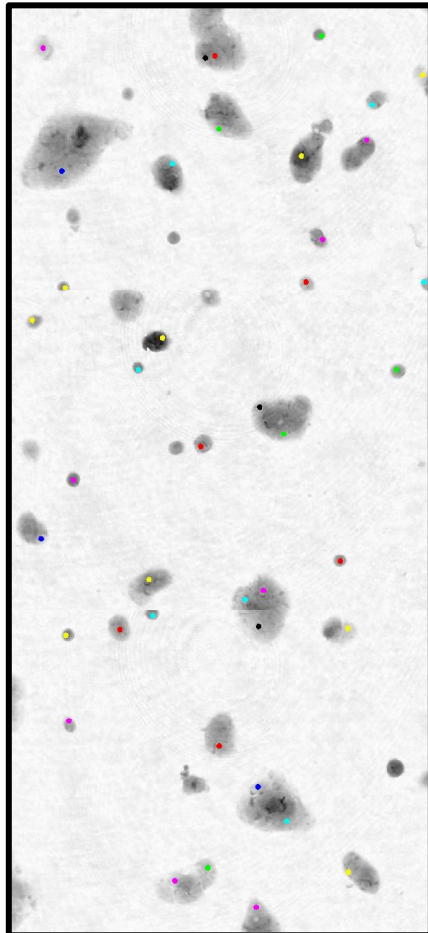
## DHM-based retrieval of migration trajectories of pancreatic tumor cells

PaTuS<sub>WT</sub>

PaTuT<sub>WT</sub>

PaTuT<sub>C</sub>

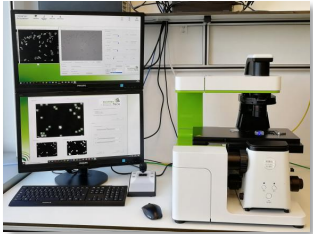
PaTuT<sub>E</sub>



00:00 h

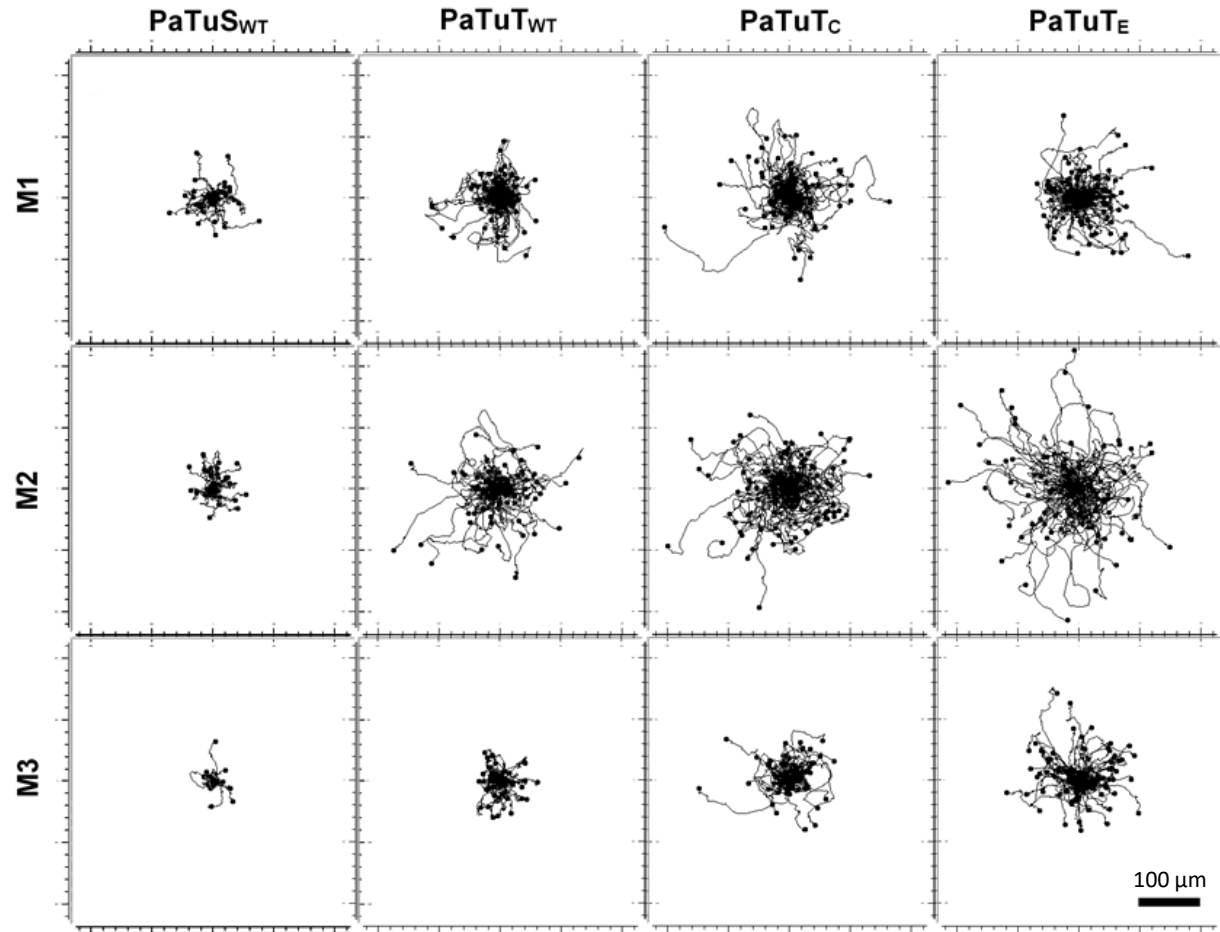
Stitched images recorded a different fields of view (20x), t = 12 h

100  $\mu$ m



# Determination of cell motility

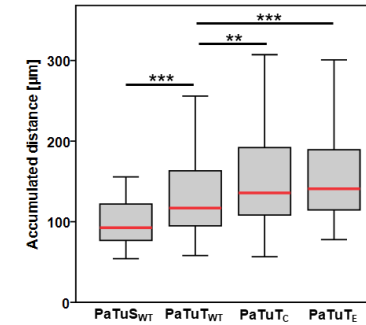
## Migration trajectories of pancreatic tumor cells



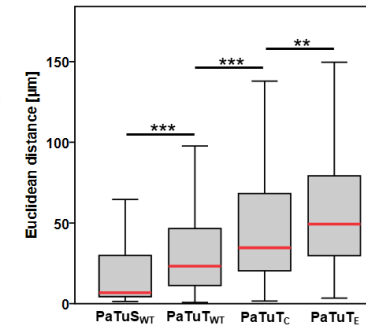
t = 12 h, N=3 independent experiments (M1-M3)

Plots created with ibidi chemotaxis and migration Tool ([www.ibidi.com](http://www.ibidi.com))

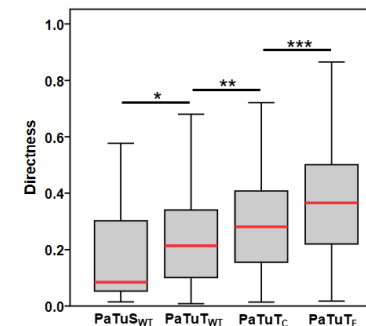
### Accumulated distance



### Euclidean distance



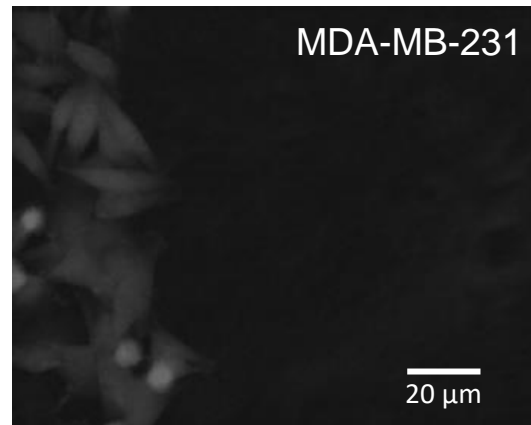
### Directness



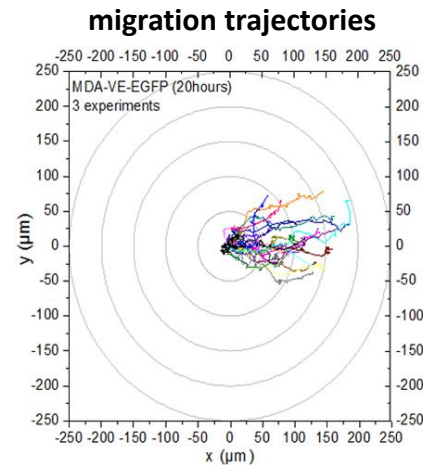
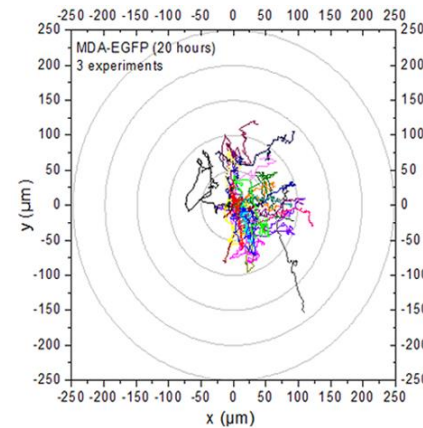
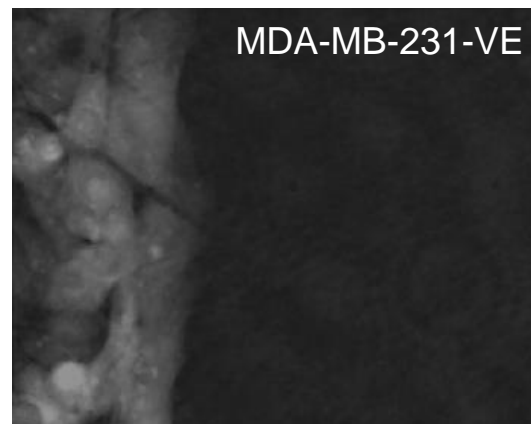
# Multimodal / multiparameter imaging

# Multi-parameter analysis of breast cancer cells

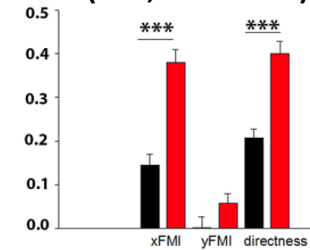
## Influence of VE-cadherin on cell migration and morphology



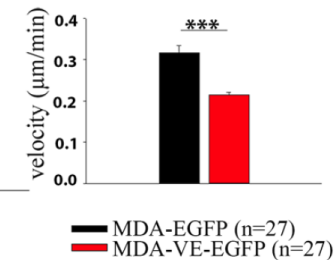
quantitative DHM phase contrast



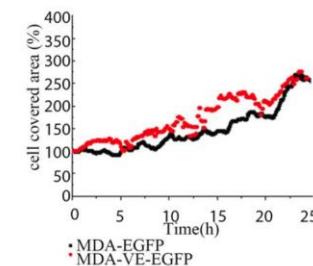
migration parameters  
(FMI, directness)



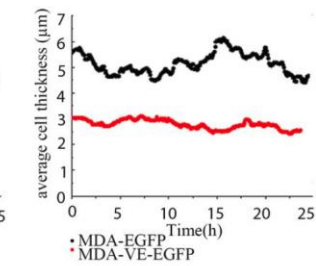
velocity



cell covered area



thickness



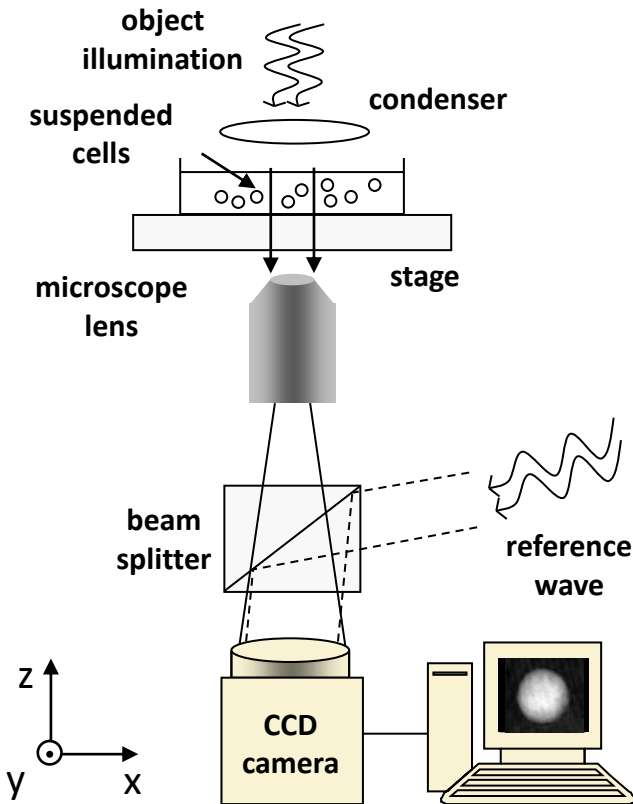
M. Rezaei et al.  
Histochemistry and Cell  
Biology Histochem. Cell Biol.  
149, 15-30 (2018)

➔ Significant change of migration direction, velocity and cell thickness

## **Suspended cells:**

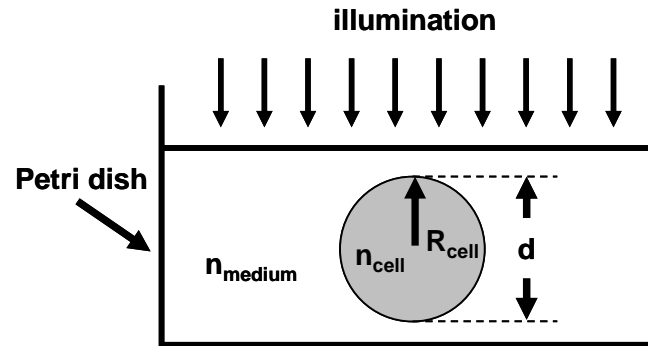
**Determination of integral cellular  
refractive index, volume, and dry mass**

# Refractive index, volume and dry mass characterization suspended single cells



required:  $n_{\text{medium}}$  and imaging scale

$n_{\text{cell}} \sim$  intracellular solute concentration



phase change: spherical cell

$$\Delta\varphi_{\text{cell}}(x, y) = \frac{4\pi}{\lambda} (n_{\text{cell}} - n_{\text{medium}}) \cdot \sqrt{R^2 - (x - x_0)^2 - (y - y_0)^2}$$

volume  

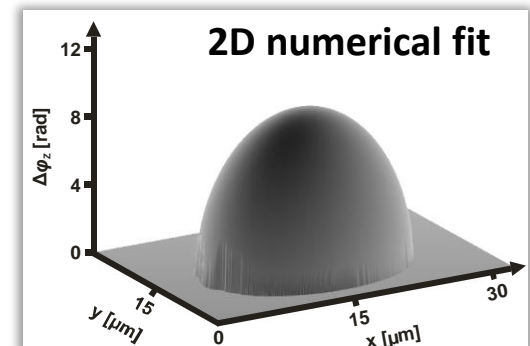
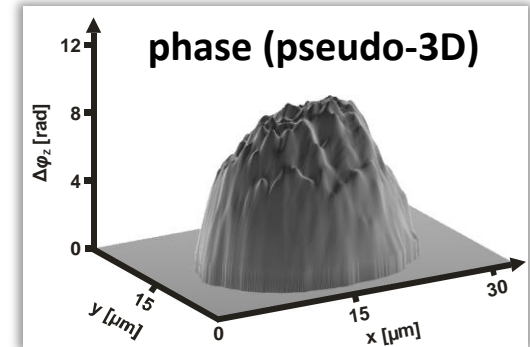
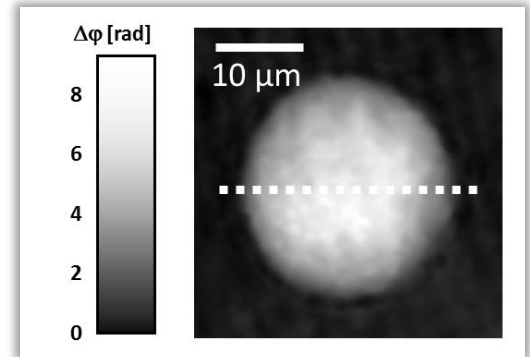
$$V = \frac{4}{3} \pi R^3$$

$\alpha \approx 0.002 \text{ m}^3/\text{Kg}$

dry mass  

$$DM = \frac{V}{\alpha} \cdot (n_{\text{cell}} - n_{\text{medium}})$$

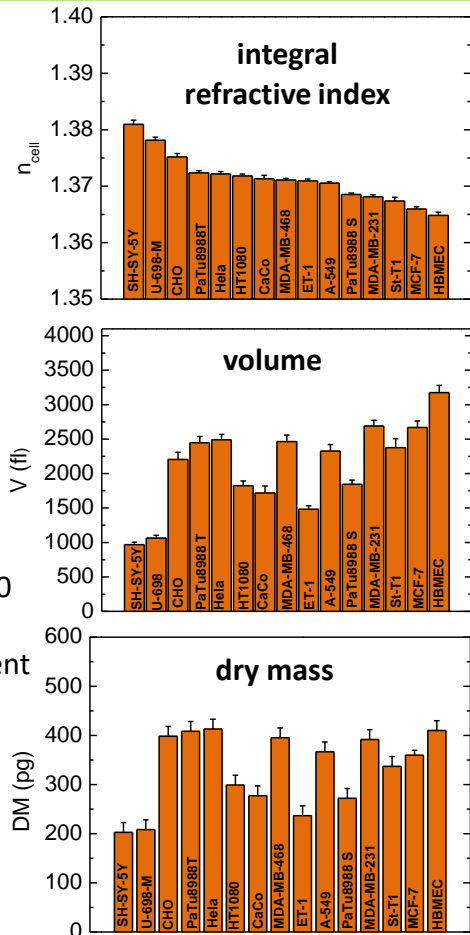
DHM phase contrast image



(Gauß-Newton/Levenberg Marquart)

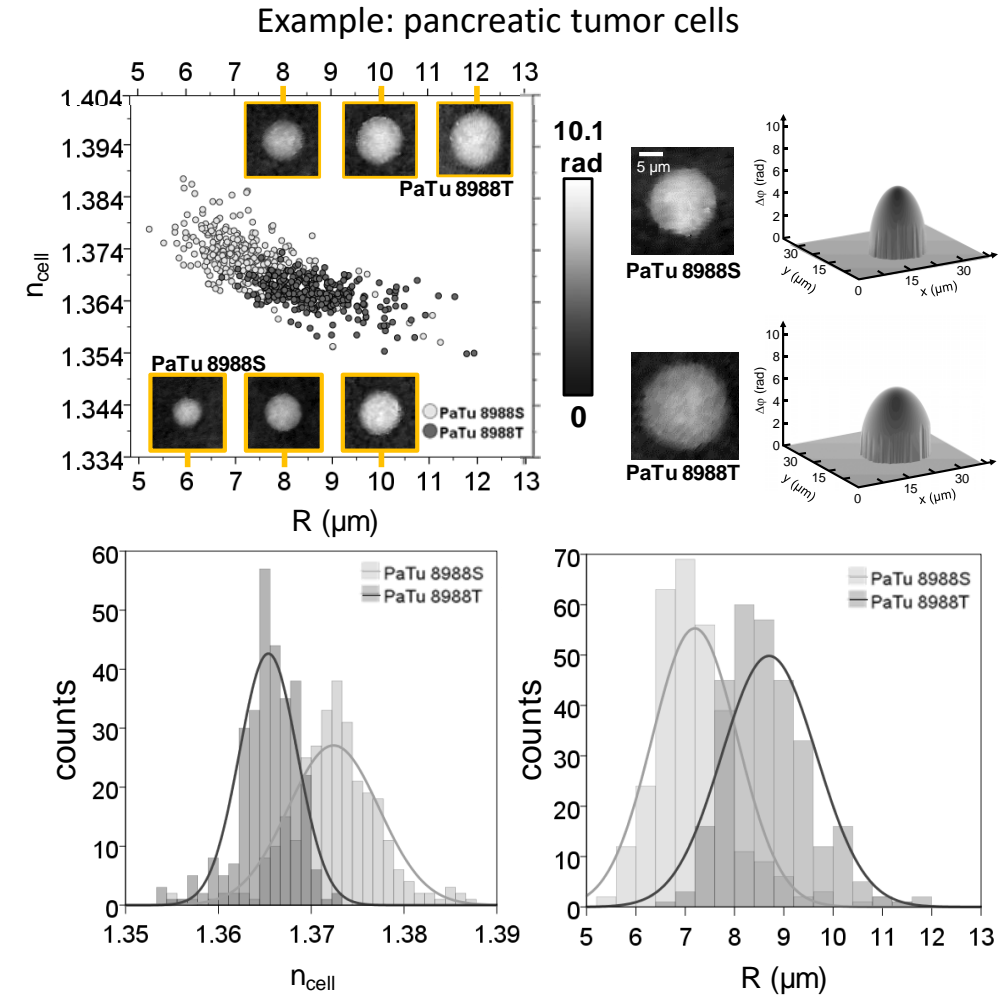
# Label-free analysis of suspended cells for phenotyping and cell culture quality control

## Individual biophysical signatures of different cell types

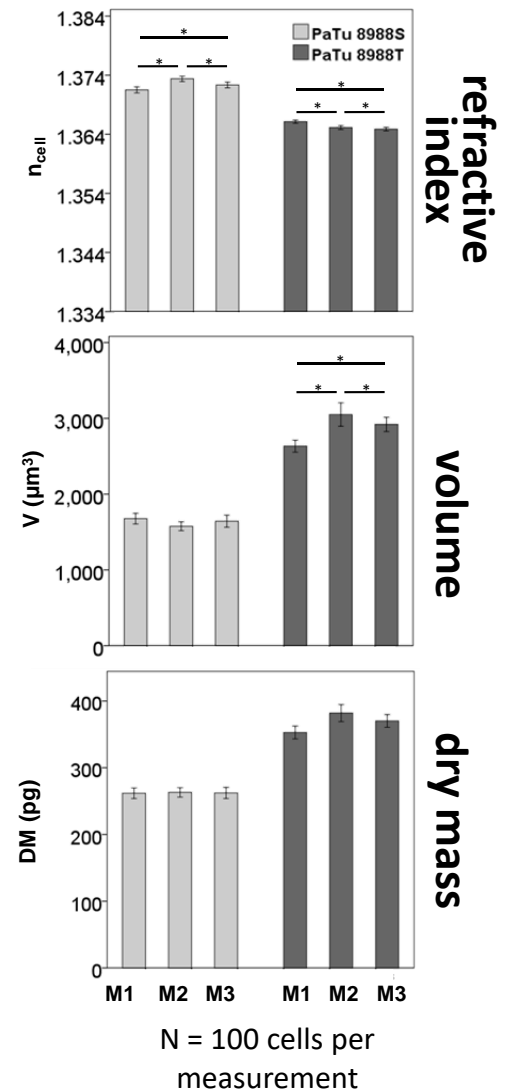


N=100-200 cells per measurement

## Volume, refractive index and dry mass determination



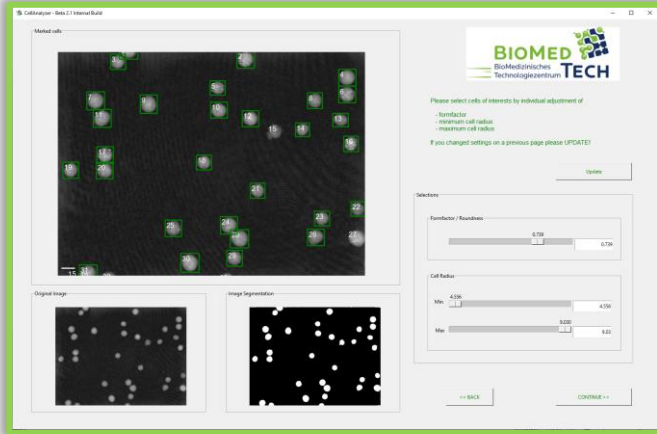
## High reliability / repeatability (N=3, independent measurement)



➔ Significant cell radius and refractive index differences

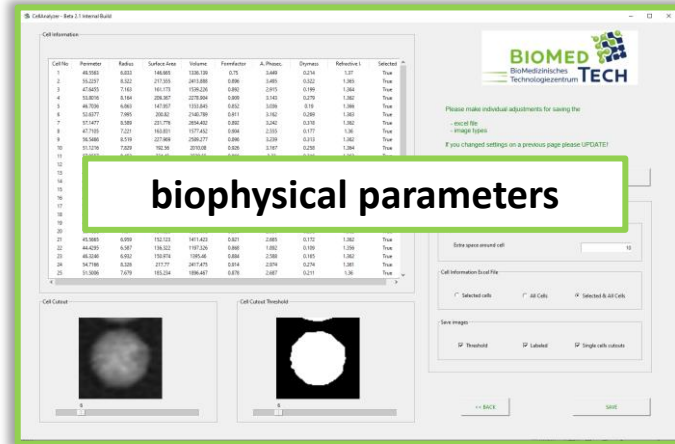
# Towards automated cell analysis and image flow cytometry

## Automated analysis of suspended cells in Petri dishes



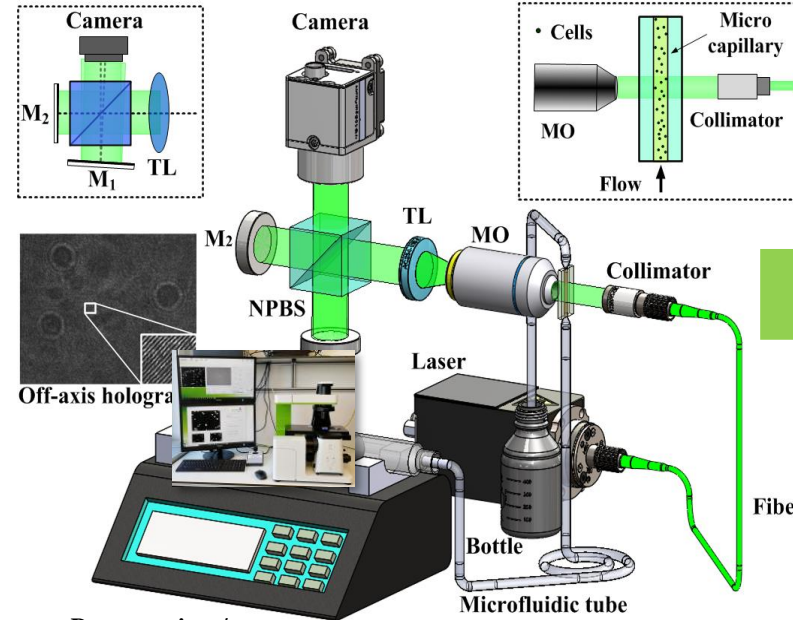
automated object recognition

segmentation

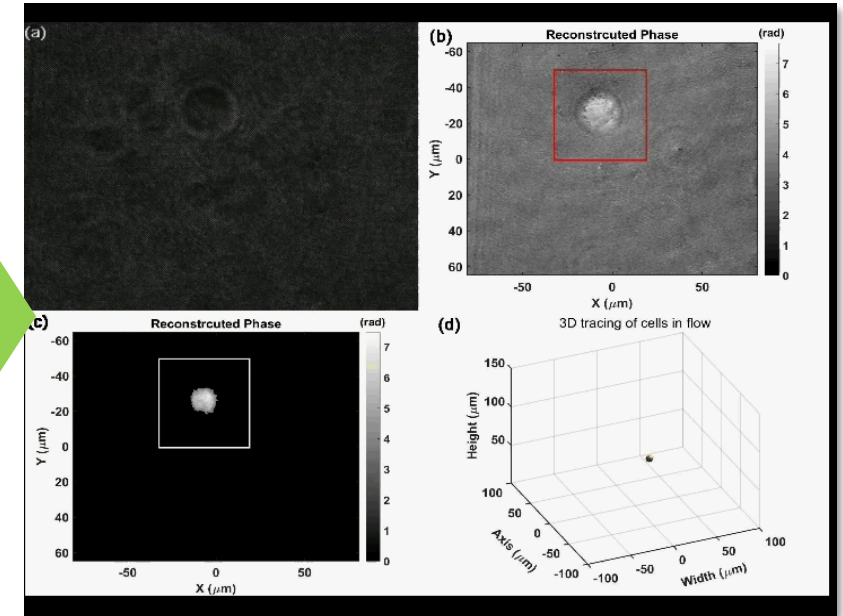


L. Brandt et al. Proc. BIOSTEC 2018 5, 431-437 (2018).

## Holographic image flow cytometry of pancreatic tumor cells

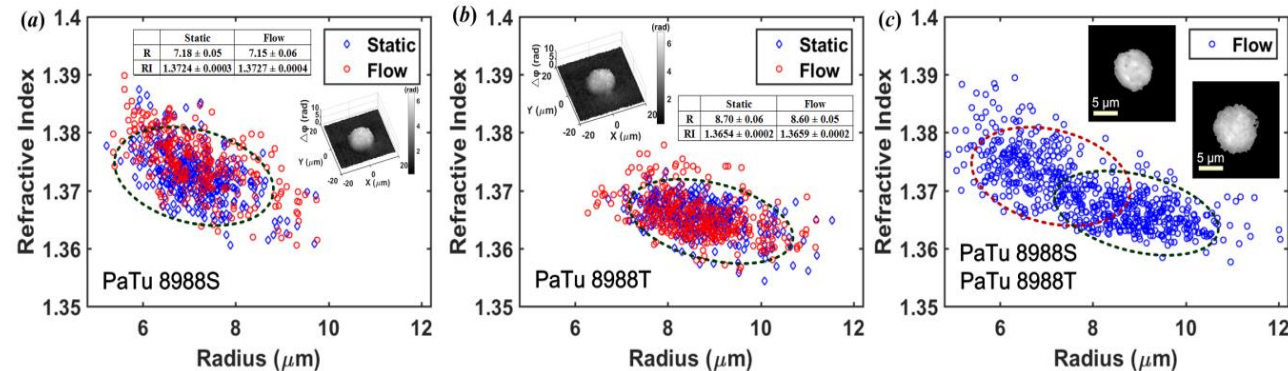


Pump: syringe/  
pneumatic



Refractive index (static, flow)

Cell mixture (flow)



J. Min et al., J. Biophoton. 12, e201900085 (2019).



# Toxicity testing

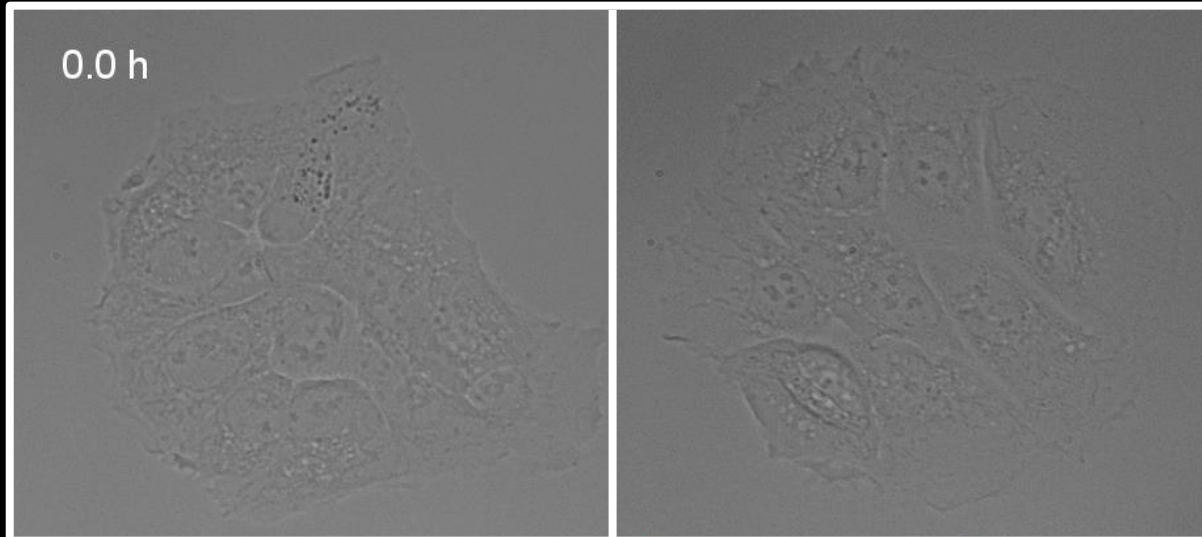
# Time-lapse observation of the impact of **toxic vesicles** on human gastrointestinal cells (HCT-8)

t = 0-48 h

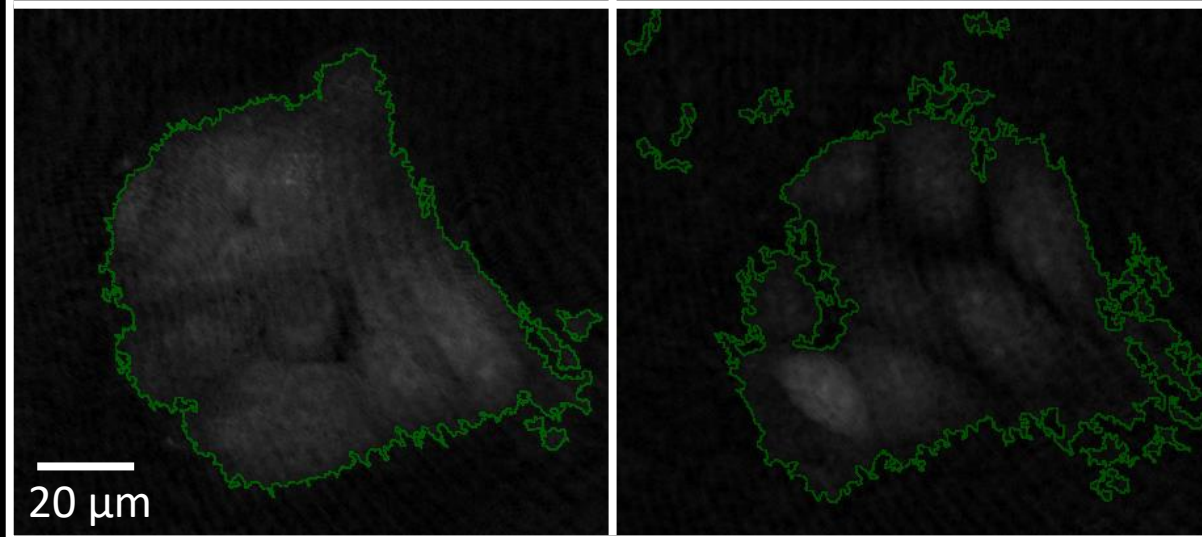
control

OMV LB 226692

white light images



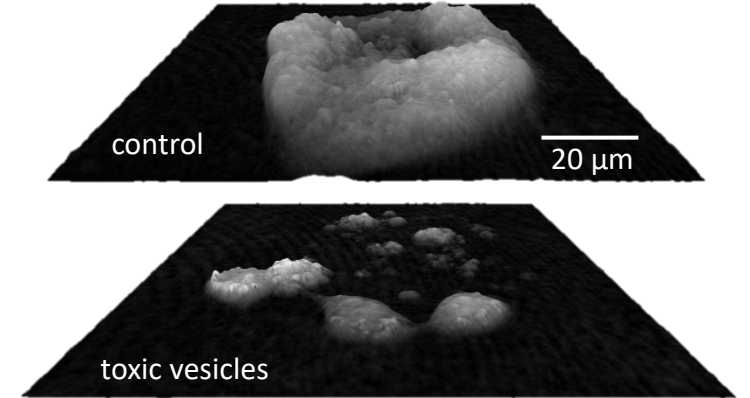
segmented quantitative DHM phase contrast images



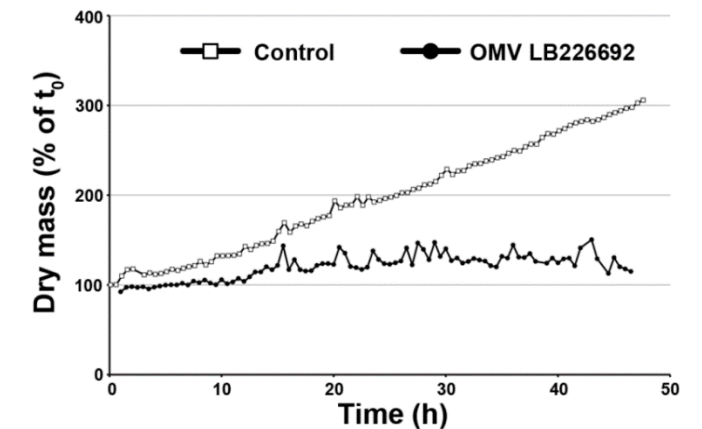
0 10.8 rad

0 12.8 rad

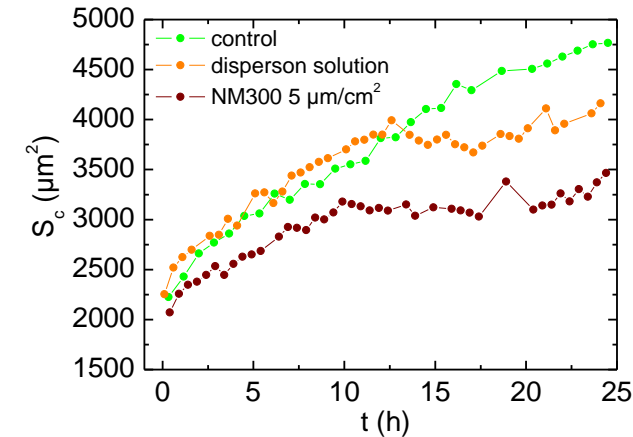
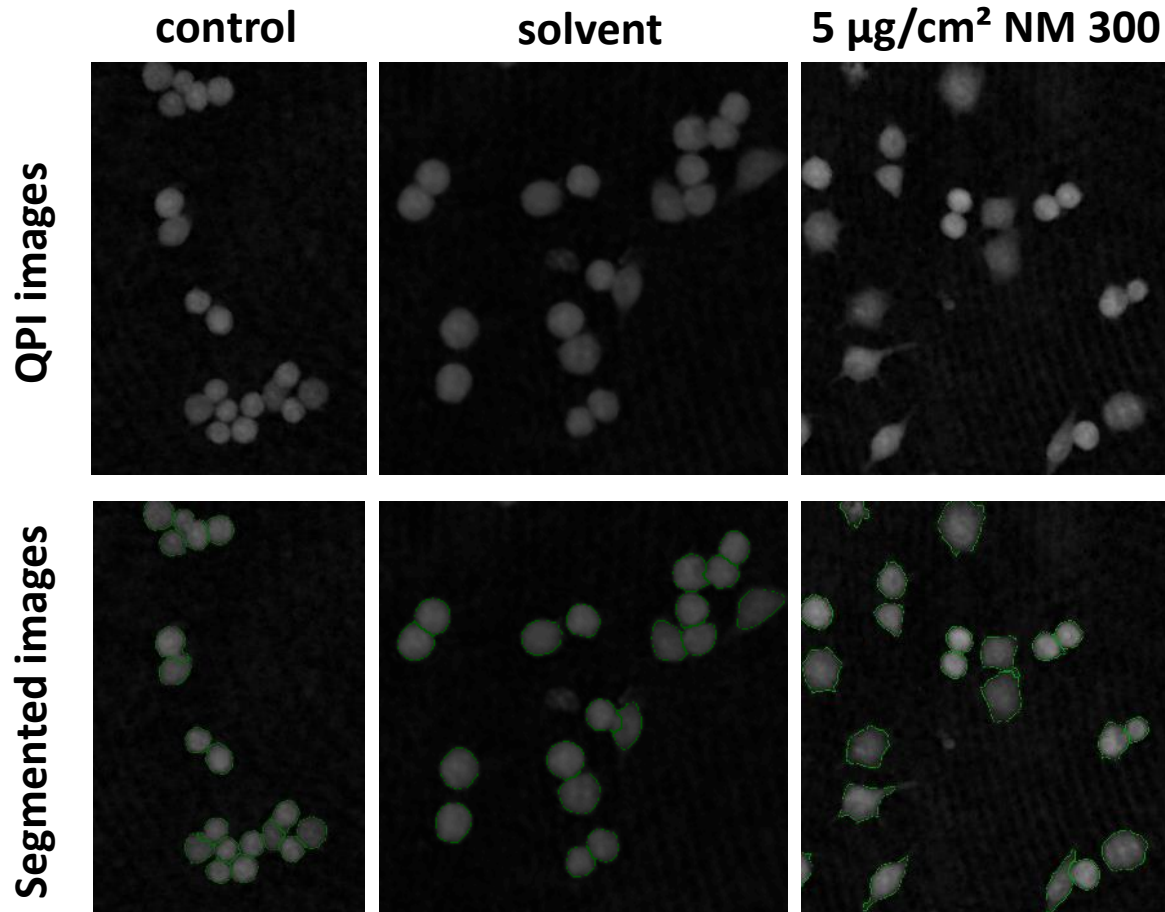
(pseudo) 3D morphology after 48h



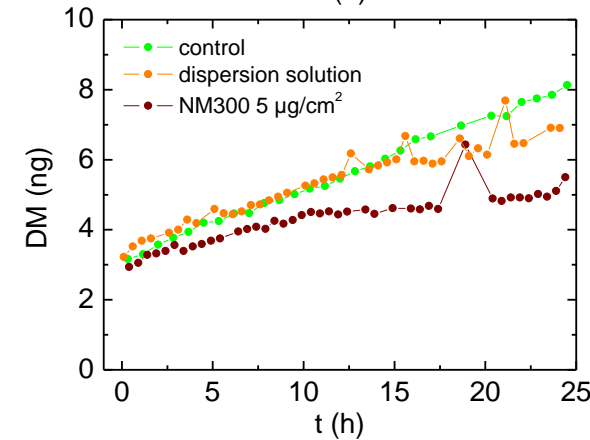
Time course of cellular dry mass



# DHM QPI observation of macrophages (RAW264.7) after incubation with a cytotoxic silver nano material (NM 300)



projected cell surface



dry mass

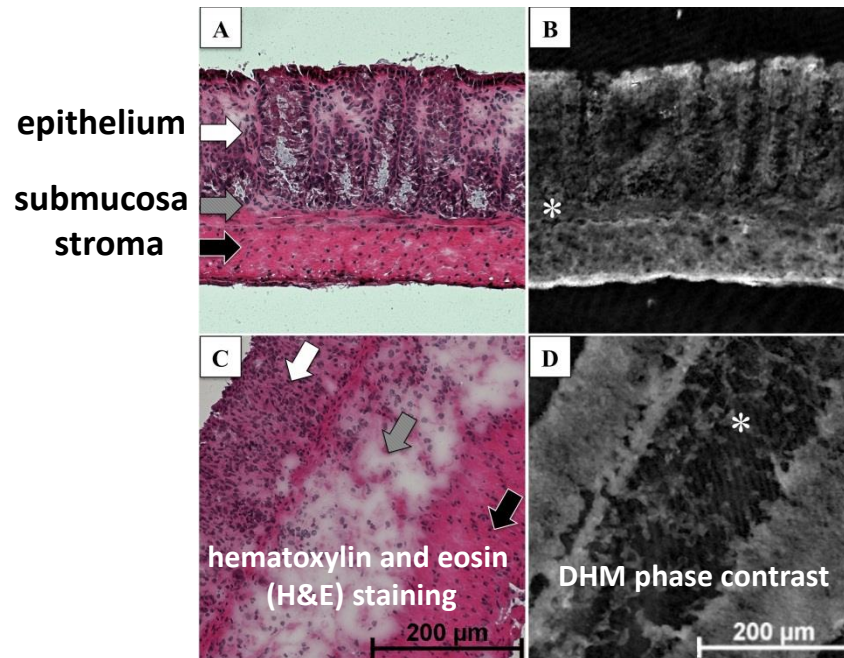
**→ Cytotoxic effects of silver nano spheres cause significant proliferation decrease**

# Quantitative imaging of tissue sections

# Example: Experimental colitis in mice

## Refractive index correlates with degree of inflammation

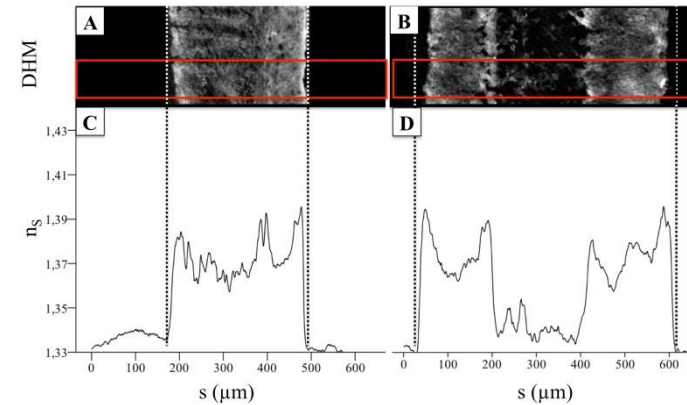
DHM analysis of cryostat tissue sections  
(mouse colon,  $d = 7 \mu\text{m}$ )



$$n_s(x, y) = \left( \frac{\Delta\varphi_s(x, y)}{d} \frac{\lambda}{2\pi} \right) + n_{\text{medium}}$$

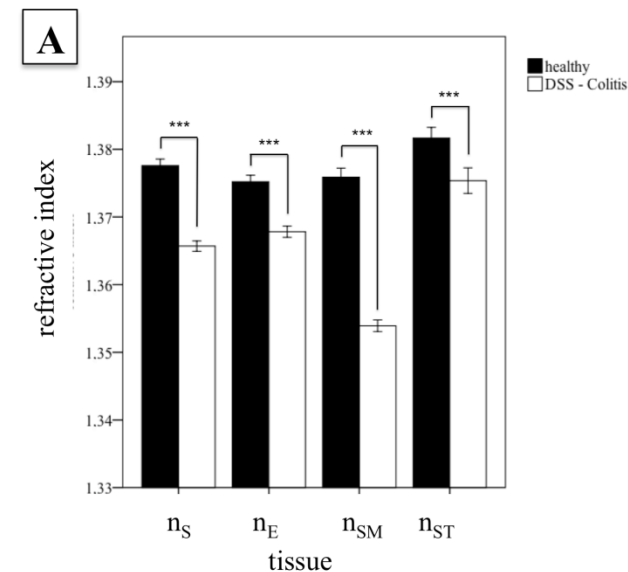
➔ Towards absolute parameters  
in “digital pathology”

refractive index / density map



10 healthy animals  
10 colitis animals

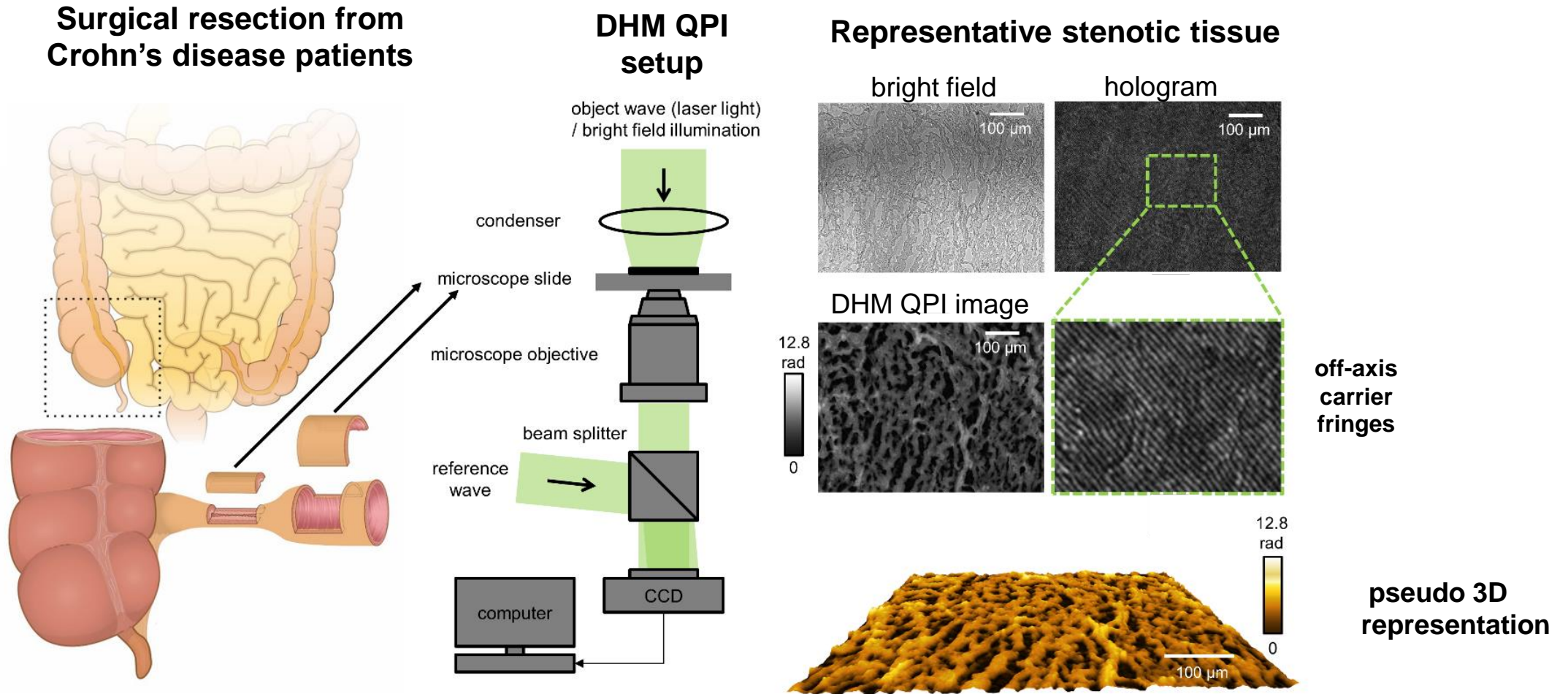
75 measurements  
per animal



➔ significant  
density loss  
due to inflammation  
in different tissue  
layers

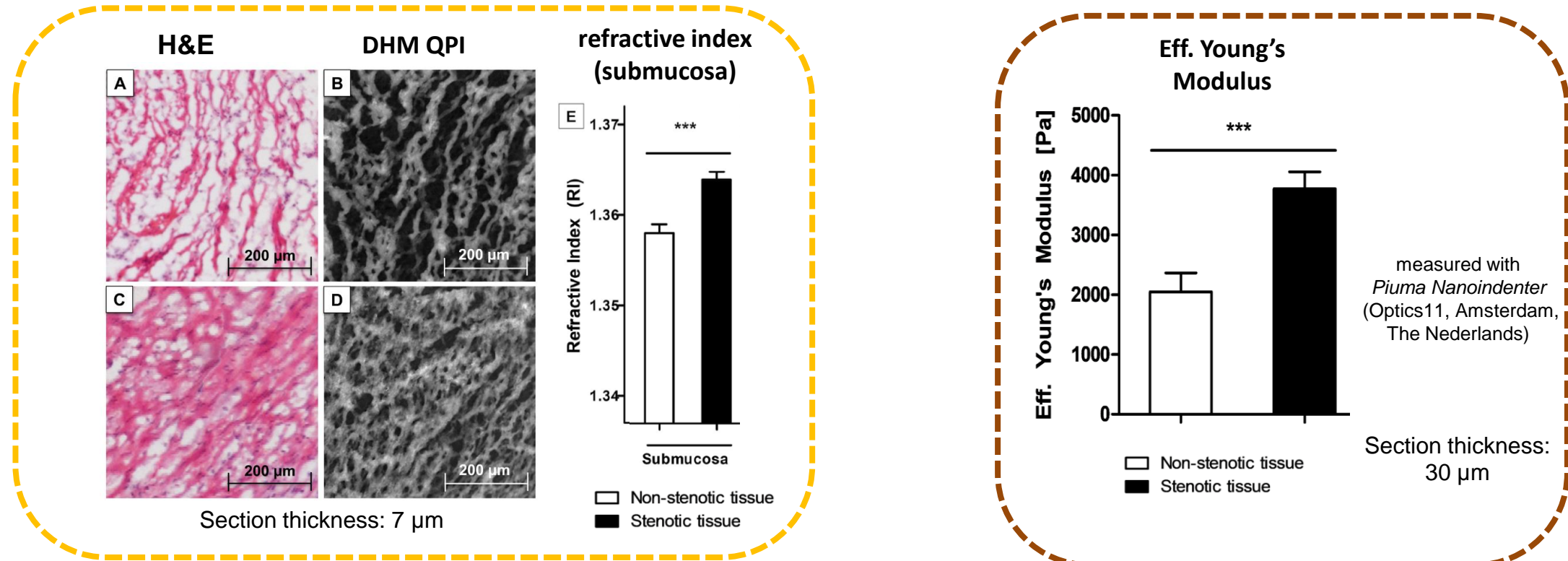
Cooperation:  
Department of Medicine B  
University of Muenster

# Quantification of inflammation induced stenotic tissue alterations in unstained tissue



# Refractive index of stenotic tissue correlates with elasticity properties

26 surgical resection specimens from 13 Crohn's disease patients (stenosis vs. control)

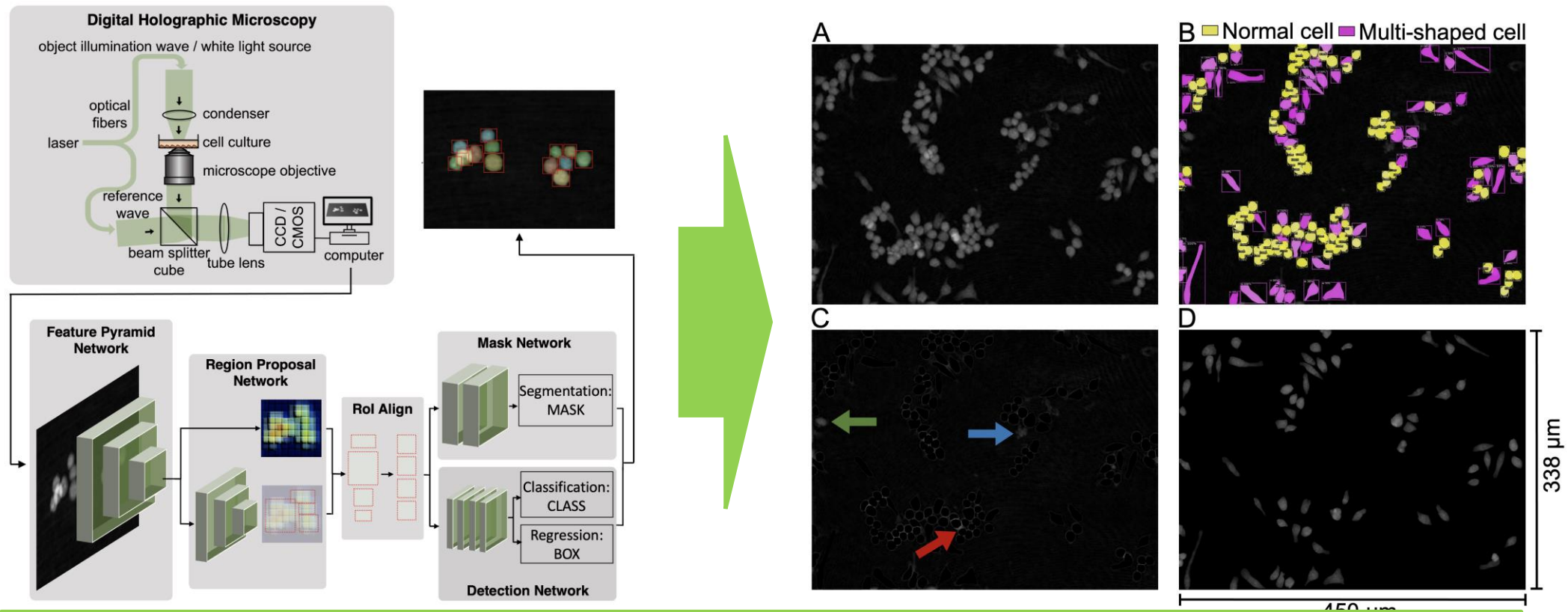


\*\*\*p<0.001

stenotic tissue → significant higher stiffness  
→ tissue refractive index reflects stiffness data  
retrieved by DHM

# Towards enhanced QPI image evaluation

**Example: Automated detection of macrophages in quantitative phase images by deep learning using a Mask Region-based Convolutional Neural Network**



**Mask R-CNN deep learning architecture → simultaneous detection, segmentation and classification of RAW 264.7 mouse macrophages (detection accuracy 93.5%)**



# Conclusions

**Quantitative phase imaging with DHM can address various topics in cell and tissue analysis by label-free quantification of:**

- **motility** (automated migration trajectories, maximum migration distance, mean squared displacement,...)
- **growth / proliferation** (dry mass, area covered by cells, imaging of cell division events, cell counting)
- **morphology** (cell thickness/volume, tissue density/refractive index distribution)

by absolute biophysical parameters.

## **Future challenges**

- accelerated procedures for image acquisition and data extraction
  - achieving a statistically convincing amount of measurement data with minimized efforts and time
  - enhanced specificity
- **robust laboratory systems**
  - **simplified handling**
  - **automation**
  - **machine learning / AI assisted analysis**

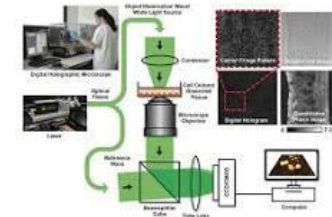
⇒ **Multifunctional label-free tool for the analysis of cells *in-vitro* and *ex-vivo* tissues**

# Selected references

## Overview (very short):

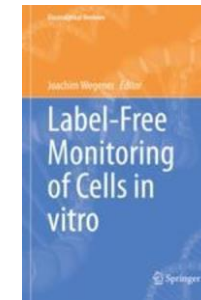
B. Kemper, "Digital holographic microscopy enhances cytometry and histology", Europhotonics Winter 2019, 20-23 (2019).

[https://www.photonics.com/Articles/Digital\\_Holographic\\_Microscopy\\_Enhances\\_Cytometry/a65240](https://www.photonics.com/Articles/Digital_Holographic_Microscopy_Enhances_Cytometry/a65240)



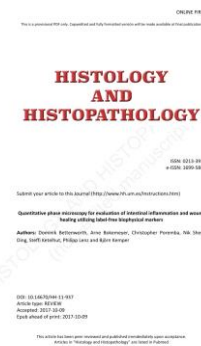
## Overview live cell imaging (very long):

B. Kemper et al., Book Chapter "Label-free quantitative in-vitro live cell imaging with digital holographic microscopy", Bioanalytical Reviews (2019), Ed.: J. Wegener, BIOREV (2019) 2: 219–272 (Springer Nature Switzerland AG).



## Overview dissected tissues:

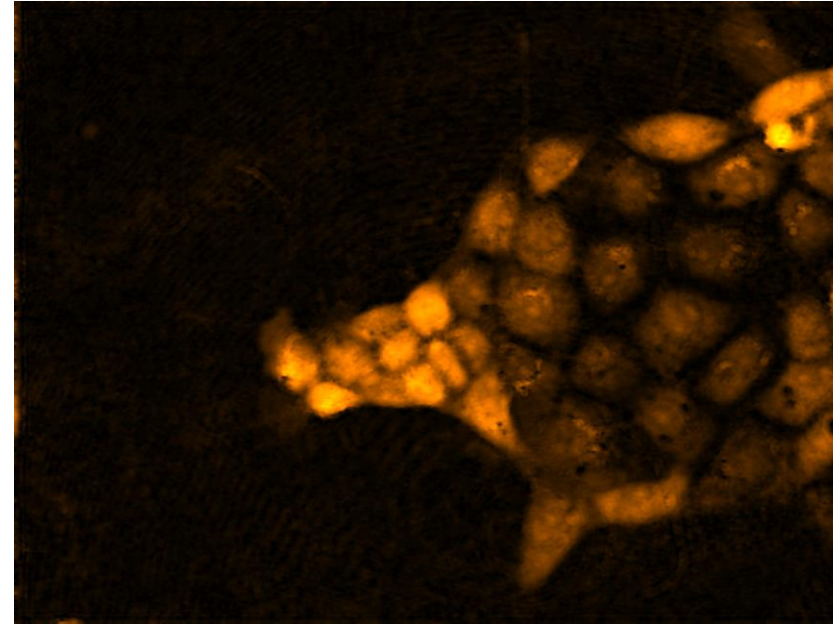
D. Bettenworth, A. Bokemeier, C. Poremba, N. S. Ding, S. Ketelhut, P. Lenz, B. Kemper, "Quantitative phase microscopy for evaluation of intestinal inflammation and wound healing utilizing label-free biophysical markers" Review article, *Histol. Histopathol.* 33, 417-432 (2018).



## More:

Google Scholar  
Research gate

porcine intestine cells co-cultivated with  
*Lactobacillus acidophilus*



**Thank you!**