ISSW 2022 The International SPAD Sensor Workshop online conference

JUNE 13 - 15, 2022

### CORRELATION PLENOPTIC IMAGING BASED ON SPAD TECHNOLOGY

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Refocusing & single-shot 3D imaging

### UNIVERSITA ALDO MORO

### Light-field cameras for fast 3D imaging





# Intrinsic limits of conventional light-field cameras



- Strong trade-off between resolution and depth-of-field (Nx Nu = Ntot)
   → No diffraction limited resolution !
- Sacrificed change of perspective limits the 3D imaging capability

... both defined by the microlens array !



### Our solution:



### Plenoptic imaging with correlated beams

D'Angelo et al., PRL 116, 223602 (2016) + Pepe et al., PRL 119, 243602 (2017) + 5 patents











Ultra-low-noise (shot-noise limit or below) → imaging of low-absorping objects

SPAD arrays  $\rightarrow$  speed



### Sources for Correlation Plenoptic Imaging





#### D'Angelo et al., PRL 116, 223602 (2016) + patent 102016000027106 (2016)



#### **Resolution vs. DOF improvement**



Diffraction-limited resolution is combined with a much larger DOF than in standard imaging





### Proof-of-principle demonstration

#### PRL 116, 223602 (2016), PRL 119, 243602 (2017)



#### Same resolution, but 40 times larger DOF !!!



#### **Diffraction-limited CPI**









### Plenoptic Microscopy with correlated beams

#### PCT/2018 (INFN) + PLA 2020 + arXiv:2110.00807



Measure correlations between

- the image of the sample (formed by an ordinary microscope: lenses O & T)
- the image of the objective lens (formed by lens L)

### Plenoptic Microscopy with correlated beams



G. Massaro, et al., Light-field microscopy with correlated beams for extended volumetric imaging at the diffraction limit <u>arXiv:2110.00807</u>

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### Plenoptic Microscopy with correlated beams

- 3D sample: STARCH IN GEL
- Grain size: 20 um
- Detail recovery
- 3D rendering







#### Brain cells (astrocytes) during 24-hours migration

TOPMICRO MISE - Proof of concept





#### Potential applications:

- Study of cell aggregation → glioma
  - ~ 30-100 um diameter
  - ~ 3-5 um height

#### In focus



#### Out of focus ~3hrs later







#### TOPMICRO MISE - Proof of concept





#### Potential applications:

- 3D analysis of diagnostic
   biopsies during organ
   transplants / perfusion..
- Ophalmoscopy
- Particle tracks in nuclear emulsions
- Recycled fabrics...











2 different arbitrary planes within the 3D object are focused by 1 lens on the two disjoint sensors



#### Acquired images



#### Refocusing



#### Stacked refocused image



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 $D_a$ 

# CPI between arbitrary planes











#### Acquired

87 kfps , 
$$N_{\text{frames}} = 8 \times 10^3$$





DOF enhancement: 12 x



#### Refocused



Max SNR



60% SNR





### Qu3D – Qunatum 3D imaging at high speed and high resolution

QUANTERA



#### Quantum technology: more security and improved imaging

21/Nov/2019



#### http://www.ba.infn.it/qu3d/index.html



Milena D'Angelo



Maria Ieronymaki



Claudio Bruschini



Bohumil Stoklasa





### Hardware speed-up







#### SwissSPAD2. Ultra-fast SPAD array

- Array of 512 x 512 SPAD
- Records binary frames at 100 KHz
- Minimum gate length of 10.8 ns
- Fill factor ~ 60% (with microlenses)
- On-board FPGA for control, redout and logic operations

#### **High-performance computing**

- Development of high-bandwitdth bus connection (required ~ 25 Gb/s)
- On-board GPU for parallel data pre-processing
- Taking advantage of the 1 images for faster calculations









Processing optimization

#### **Compressive sensing**



#### **Quantum Fisher Information**

• Super-resolution and/or frame number optimization

QUANTERA





## Processing optimization

### **Quantum tomography**

#### **CPI** refocusing

**QPI** Tomography



QUANTERA





#### Scanning-free refocusing of 3D samples

Parallel acquisition of multiple perspectives  $\rightarrow$  3D imaging

#### with

Diffraction-limited resolution

Unprecedented DOF, at fix given resolution

Turbulence/scattering attenutation capability ... work in progress

SNR advantage: attenuation of stray light, source fluctuations, detector aging... work in progress

Can be realized with natural sources



Correlation Light-filed 3D Microscope

DMD, filtered LED/lamps ... fluorescence



- Speed-up & Super resolution ... both through *software* & *hardware*
- SNR enhancement by optimizing setups, sources (e.g., entangled photons) and measurement protocols (e.g., differential, compressive, machine learning,...)
- Exploring different use cases: target detection, space imaging, CLOSE
   hyperspectral imaging









### QuOT Lab @ UniBA

Milena D'Angelo

- **Researchers:** 
  - Francesco
  - Francesco
- Post-docs:
  - Francesco
  - Sergii Va

#### Students:

- Davide G
- Gianlorer
- Germano



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o Scattarella o V. Pepe	Qu3D – Qunatum 3D imaging at high speed and high resolution <u>Partners</u> :	U A N T E R A
o Di Lena siukov	<ul> <li>B. Stoklasa, Z. Hradil, J. Rehacek (Olomouc University</li> <li>F. Santoro, M. Iacobellis, L. Amoruso (Planetek Hellas)</li> </ul>	y - CZ) - GR)
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nzo Massaro, Borreggine	PICS4ME - Plenoptic Imaging with CorrelationS for Microscopy Enhancement	IN FN Hitted Nationale Hitted Nationale
	<u>Partners</u> M. Genovese, I. P. Di Giovanni (INRIM, Torino - IT) J. Forneris, P. Olivero (Università di Torino - IT)	
	Close – Close to the Earth	





### Where is Bari?



![](_page_26_Picture_0.jpeg)

Quantum 2022 - Summer School on Quantum Optical Technologies in Apulia

![](_page_26_Picture_2.jpeg)

![](_page_26_Picture_3.jpeg)

Trani (Bari), 18-24 Sept. 2022

![](_page_26_Picture_4.jpeg)

The school is oriented to PhD students, master students and young researchers, and aims to provide **a privileged vision** of quantum optical technologies from both a theoretical and an experimental perspective. The lecture topics will include: quantum imaging; quantum information; quantum cryptography; quantum simulation; quantum communication in space; detectors, sources and measurements for quantum technologies.

**Lecturers:** Gunnar Björk, Edoardo Charbon, Maria Chekhova, Milena D'Angelo, Ivo Pietro Degiovanni, Paolo Facchi, Daniele Faccio, John Howell, Zdenek Hradil, Simone Montangero (to be confirmed), Ivano Ruo-Berchera, Fabio Sciarrino, Bohumil Stoklasa, Paolo Villoresi, Hugo Zbinden

Scientific Committee: Milena D'Angelo, Paolo Facchi, Augusto Garuccio, Saverio Pascazio (UniBA and INFN), Marco Genovese (INRIM), Fabio Sciarrino (Sapienza Roma)

#### PhD & post-doc positions available !!! For details, contact: milena.dangelo@uniba.it

![](_page_27_Picture_0.jpeg)

### Ray tracing $\rightarrow$ **Re**focusing

#### Ng et al., Tech. Rep. 2005

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![](_page_27_Figure_3.jpeg)

Rescaling the acquired radiance = Refocusing

$$L_{\alpha D}(\mathbf{x}, \mathbf{u}) = L_D\left(\frac{\mathbf{x}}{\alpha} + \left(1 - \frac{1}{\alpha}\right)\mathbf{u}, \mathbf{u}\right)$$

#### Refocused image:

$$I_{\alpha D}(\mathbf{x}) \propto \int L_{\alpha D}(\mathbf{x}, \mathbf{u}) d^2 u$$

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Shot

![](_page_27_Picture_10.jpeg)

#### Refocused (post-proc.)

![](_page_27_Picture_12.jpeg)

![](_page_28_Picture_0.jpeg)

![](_page_28_Picture_1.jpeg)

#### Ng et al., Tech. Rep. 2005 <u>https://illum.lytro.com/illum</u>

![](_page_28_Picture_3.jpeg)

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![](_page_28_Picture_5.jpeg)

#### Same DOF of a smaller NA, but higher luminosity and SNR

![](_page_29_Picture_0.jpeg)

![](_page_29_Figure_1.jpeg)

![](_page_29_Figure_2.jpeg)

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s'

![](_page_29_Picture_3.jpeg)

![](_page_30_Picture_0.jpeg)

### Our solution:

![](_page_30_Picture_2.jpeg)

### Plenoptic imaging with correlated beams

D'Angelo et al., PRL 116, 223602 (2016) + Pepe et al., PRL 119, 243602 (2017) 5 patents

 $G^{(2)}(\rho_1,\rho_2)$  or  $\langle \Delta I(\rho_1) \Delta I(\rho_2) \rangle$ : contains plenoptic properties ! Light propagation direction Image of the scene object 

- Take two correlated light beams: at least one of them interacts with the
  - Follow in time the number of photons/intensitites with two high resolution detectors
  - Time-average to evaluate the pointto-point coincidences / correlations of intensity fluctuations

![](_page_31_Picture_0.jpeg)

![](_page_31_Picture_1.jpeg)

![](_page_31_Figure_2.jpeg)

![](_page_32_Picture_0.jpeg)

### Advantages of Correlation Plenoptic Imaging

Pepe et al., PRL 119, 243602 (2017)

![](_page_32_Figure_3.jpeg)

Diffraction-limited resolution is combined with a much larger DOF than in standard imaging

![](_page_33_Picture_0.jpeg)

![](_page_33_Picture_1.jpeg)

Pepe et al., Journ. Optics 19, 114001 (2017) + Di Lena et al., Applied Sciences 2018 + PCT/2017

No ghost imaging of the object

- Monitor object by conventional imaging
- Higher SNR: no trade-off SNR vs. resolution & object trasmission area !

![](_page_33_Figure_6.jpeg)

![](_page_34_Picture_0.jpeg)

Pepe et al., Journ. Optics 19, 114001 (2017) + Di Lena et al., Applied Sciences 2018 + PCT/2017

Nx

Nυ

Still, in this scheme, the **direction of light before and after the object** must change in a predictable way (transmission, mirror-like reflection) !!

#### What if we have :

- Diffusive, scattering objects
- Objects surrounded by turbulence
- Self-emitting samples (e.g., fluorescent)

Relevant categories for microscopy, space objects, ...

![](_page_35_Picture_0.jpeg)

![](_page_35_Picture_1.jpeg)

Paper under preparation

![](_page_35_Figure_3.jpeg)

#### Minimization of the statistical noise & background suppression

![](_page_36_Picture_0.jpeg)

# The physics behind CPI

Conventional imaging

$$I(\boldsymbol{\rho}_{A,\boldsymbol{B}}) = \int |A(\boldsymbol{\rho})|^2 |\Phi_{A,B}(\boldsymbol{\rho},\boldsymbol{\rho}_{A,\boldsymbol{B}})|^2 d^2 \rho$$

In geometrical optics

$$I(\boldsymbol{\rho}_{\boldsymbol{A},\boldsymbol{B}}) = \int |A(\alpha \,\boldsymbol{\rho}_{\boldsymbol{A},\boldsymbol{B}} + \beta \boldsymbol{\rho})|^2 d^2 \rho$$

![](_page_36_Figure_6.jpeg)

- ightarrow Object is resolved only if eta=0 (at focus) !
- Ghost imaging would give similar results

![](_page_36_Figure_9.jpeg)

![](_page_36_Figure_11.jpeg)

![](_page_37_Picture_0.jpeg)

### The physics behind CPI

 $\Box$  Information about the 2D sample A is encoded in

$$G^{(2)}(\boldsymbol{\rho}_{\boldsymbol{A}},\boldsymbol{\rho}_{\boldsymbol{B}}) = \left| \int \int A(\boldsymbol{\rho}_{\boldsymbol{o}}) A^{*}(\boldsymbol{\rho}_{\boldsymbol{o}}') \Phi(\boldsymbol{\rho}_{\boldsymbol{o}},\boldsymbol{\rho}_{\boldsymbol{o}}',\boldsymbol{\rho}_{\boldsymbol{A}},\boldsymbol{\rho}_{\boldsymbol{B}}) d^{2} \rho_{0} d^{2} \rho_{0}' \right|^{2}$$

 $G^{(2)}(\boldsymbol{\rho}_{A},\boldsymbol{\rho}_{B}) \simeq |A(\alpha \boldsymbol{\rho}_{A} + \beta \boldsymbol{\rho}_{B})|^{2}$ 

![](_page_37_Figure_4.jpeg)

 $\alpha \rho_A + \beta \rho_B = \rho_O$ 

Sample details are available and spread along lines !

XP

In geometrical optics

![](_page_38_Picture_0.jpeg)

### The physics behind CPI

Sample is recovered through line integrals:

$$\Sigma(\boldsymbol{\rho_0}) = \int_{\gamma(\boldsymbol{\rho_0})} G^{(2)}(\boldsymbol{\rho_A}, \boldsymbol{\rho_B}) dl \simeq |A(\boldsymbol{\rho_0})|^2$$

![](_page_38_Figure_5.jpeg)

![](_page_39_Picture_0.jpeg)

![](_page_39_Picture_1.jpeg)

![](_page_39_Figure_2.jpeg)

![](_page_40_Picture_0.jpeg)

### CPI-AP with SwissSPAD2

#### 50 kframes @ 90 kfps

![](_page_40_Picture_3.jpeg)

#### Total capture time: 0,6 sec

![](_page_40_Figure_5.jpeg)

![](_page_40_Picture_6.jpeg)

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![](_page_40_Figure_8.jpeg)

![](_page_41_Picture_0.jpeg)

![](_page_41_Picture_1.jpeg)

### **CPI-AP** with SwissSPAD2

![](_page_41_Figure_3.jpeg)

![](_page_41_Picture_4.jpeg)