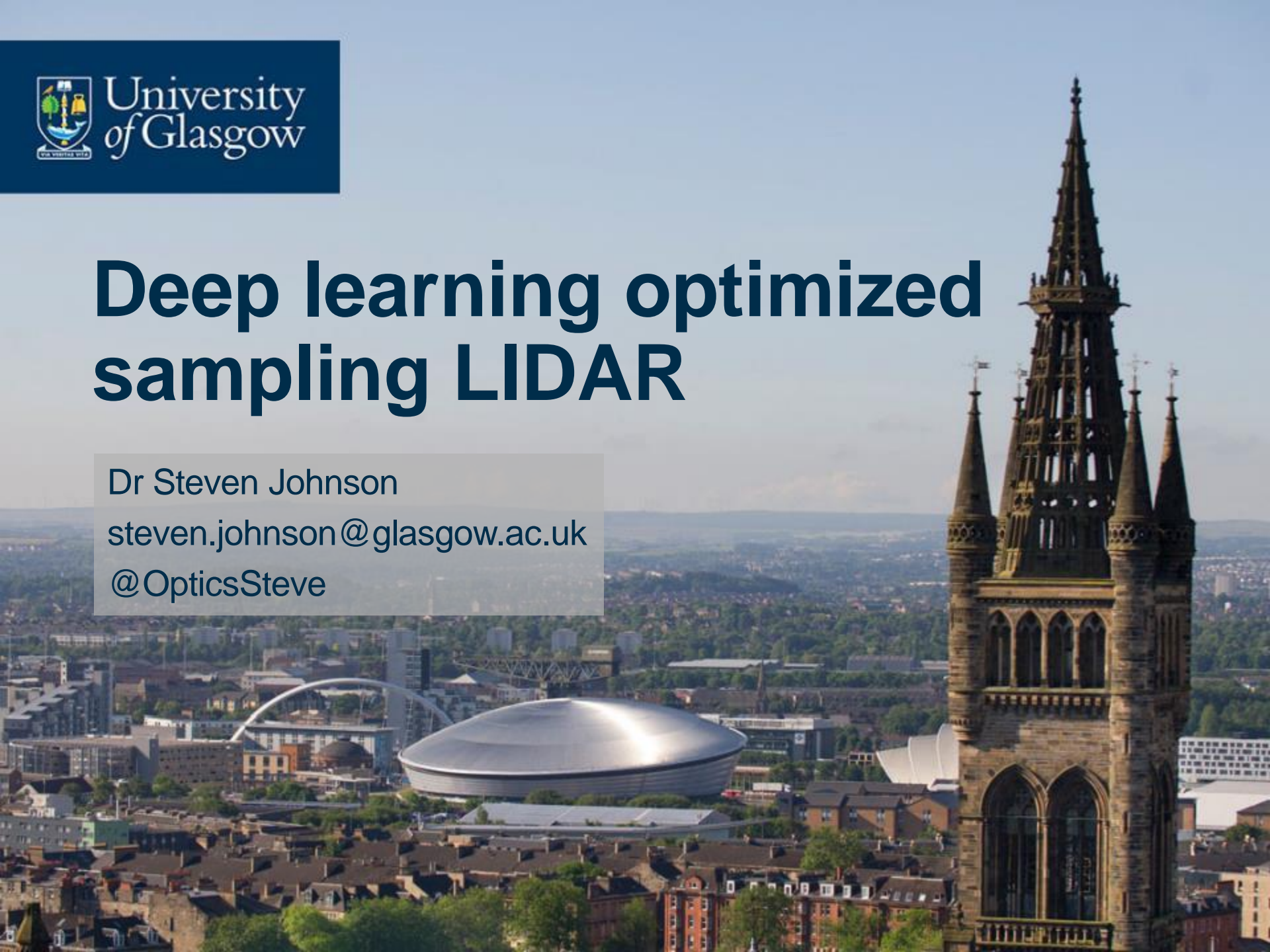


# Deep learning optimized sampling LIDAR

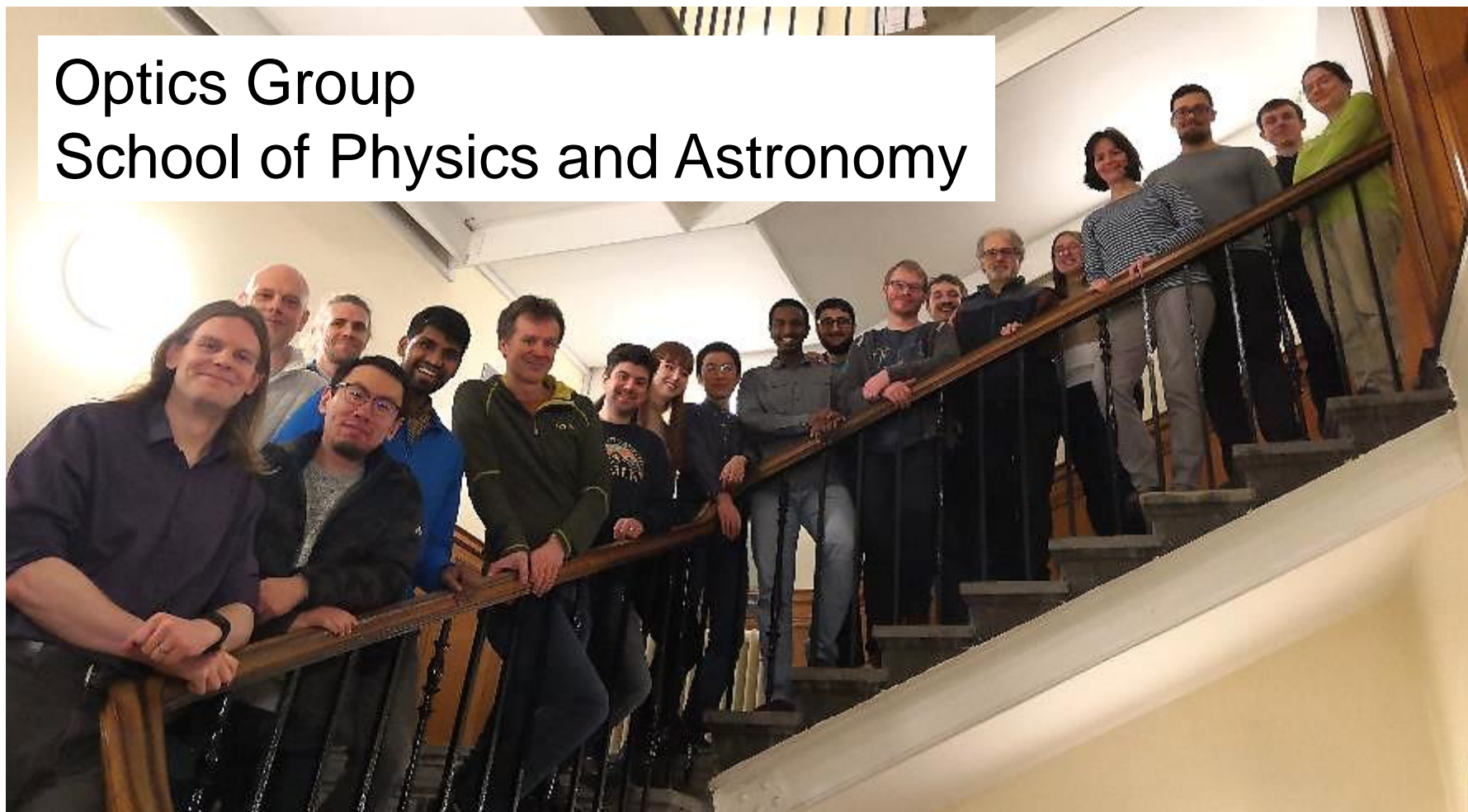
Dr Steven Johnson

[steven.johnson@glasgow.ac.uk](mailto:steven.johnson@glasgow.ac.uk)

@OpticsSteve



# Optics Group School of Physics and Astronomy



# Outline

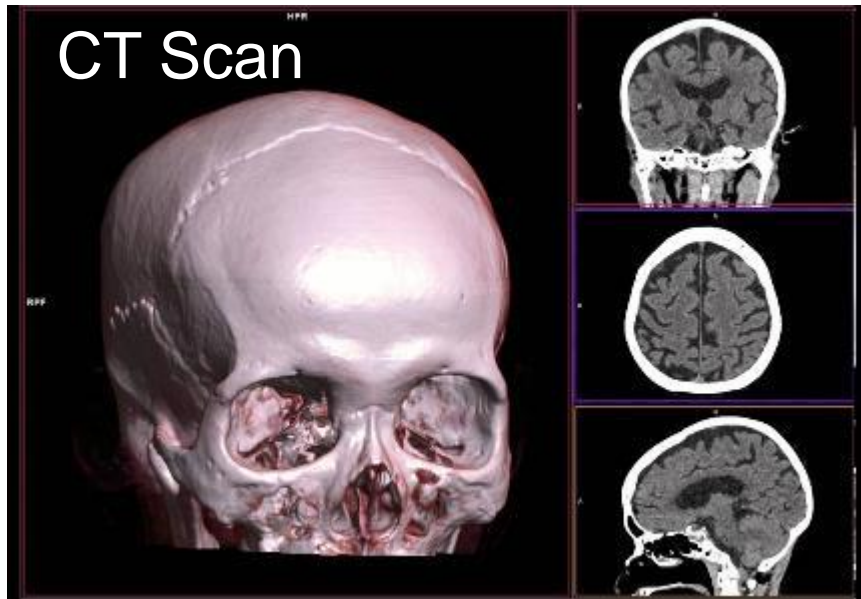
- Computational imaging
- Deep learning optimisation
- LIDAR with optimised sampling

# COMPUTATIONAL IMAGING



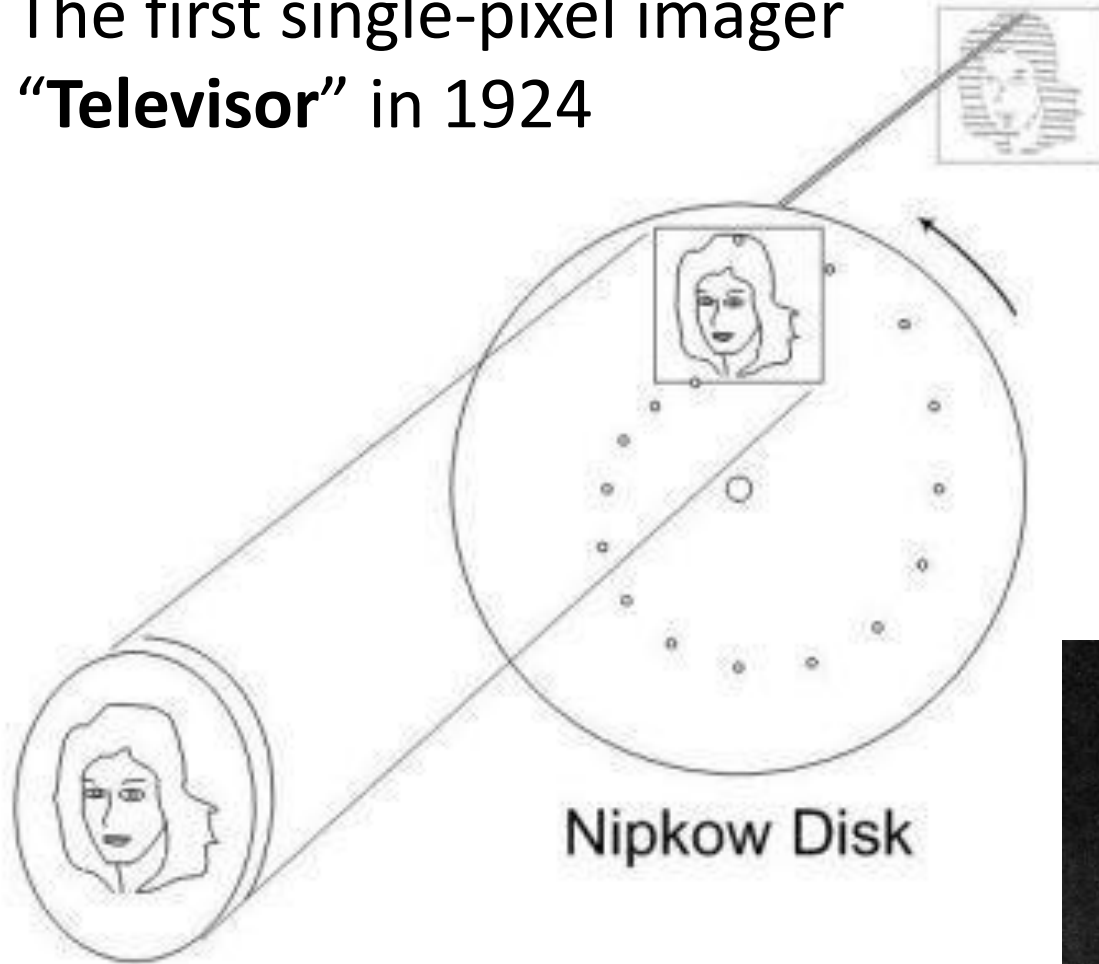
# Computational Imaging

Indirectly forming images from measurements using algorithms to compute the image.



# Single-pixel imaging origins

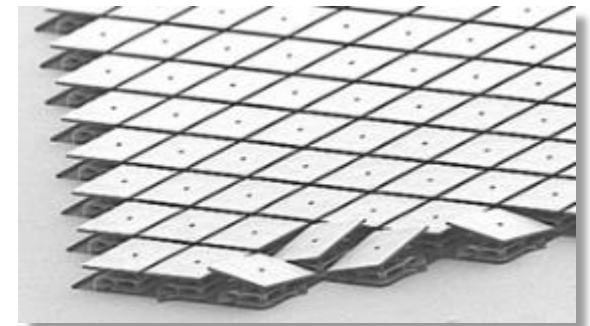
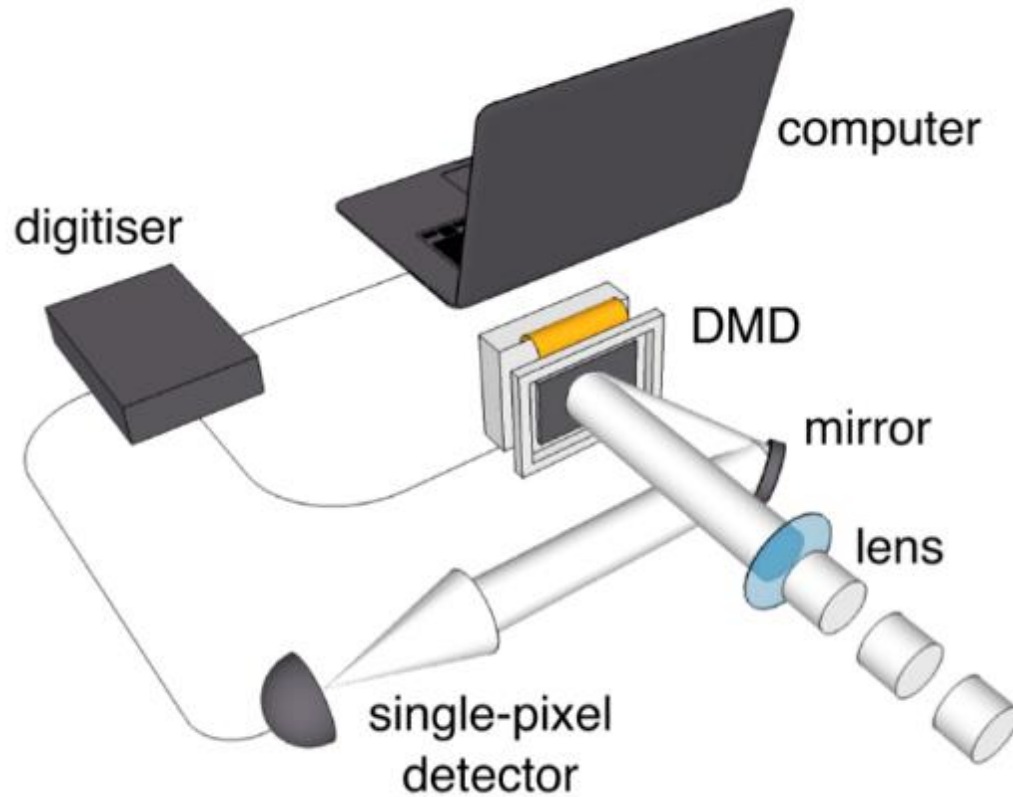
The first single-pixel imager  
**“Televisor”** in 1924



John Logie Baird



# Single-pixel imaging



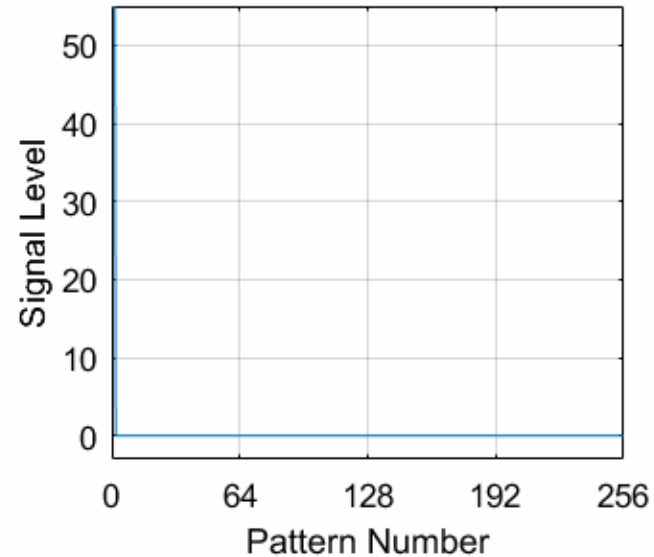
Higham et al., Deep learning for real-time single-pixel video, Scientific Reports **8**, 2369 (2018)

# Single-pixel Imaging

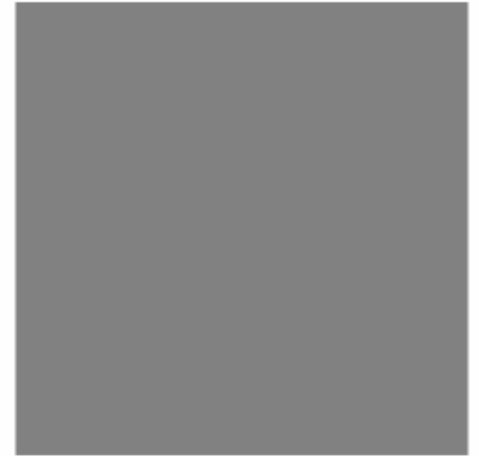
## Pattern Displayed



## Measured Signal

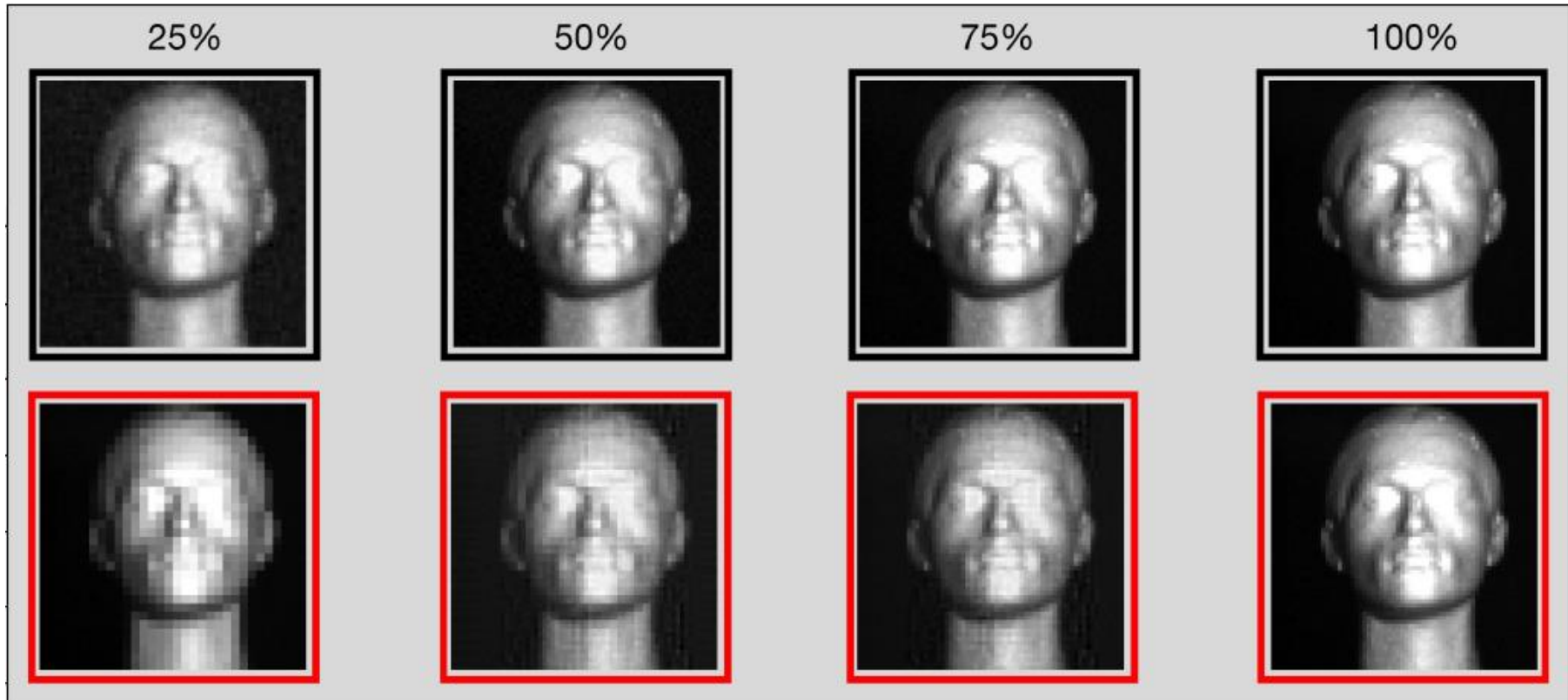


## Calculated Image





# Compressive sensing



Matthew P. Edgar et al, "Real-time 3D video utilizing a compressed sensing time-of-flight single-pixel camera," Proc. SPIE 9922, (2016)

## Why bother?

Choose  
patterns for  
imaging

Standard  
pattern set

25%

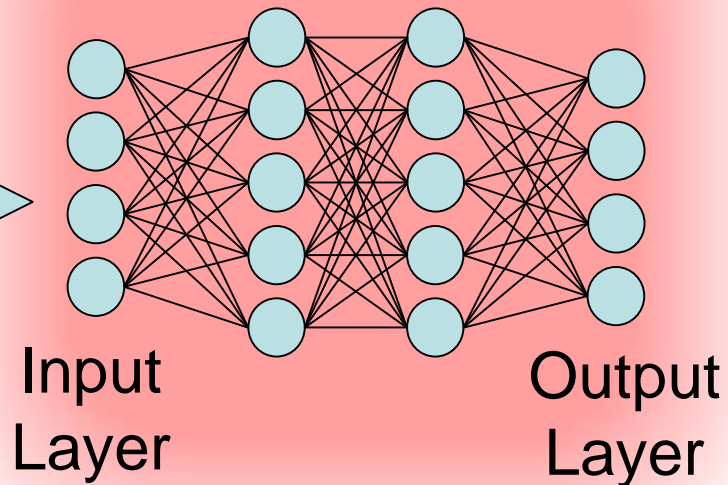


# DEEP LEARNING OPTIMIZATION

# Deep learning method

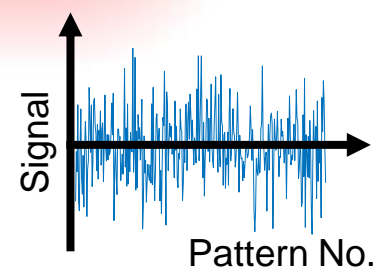


Convolutional  
neural network



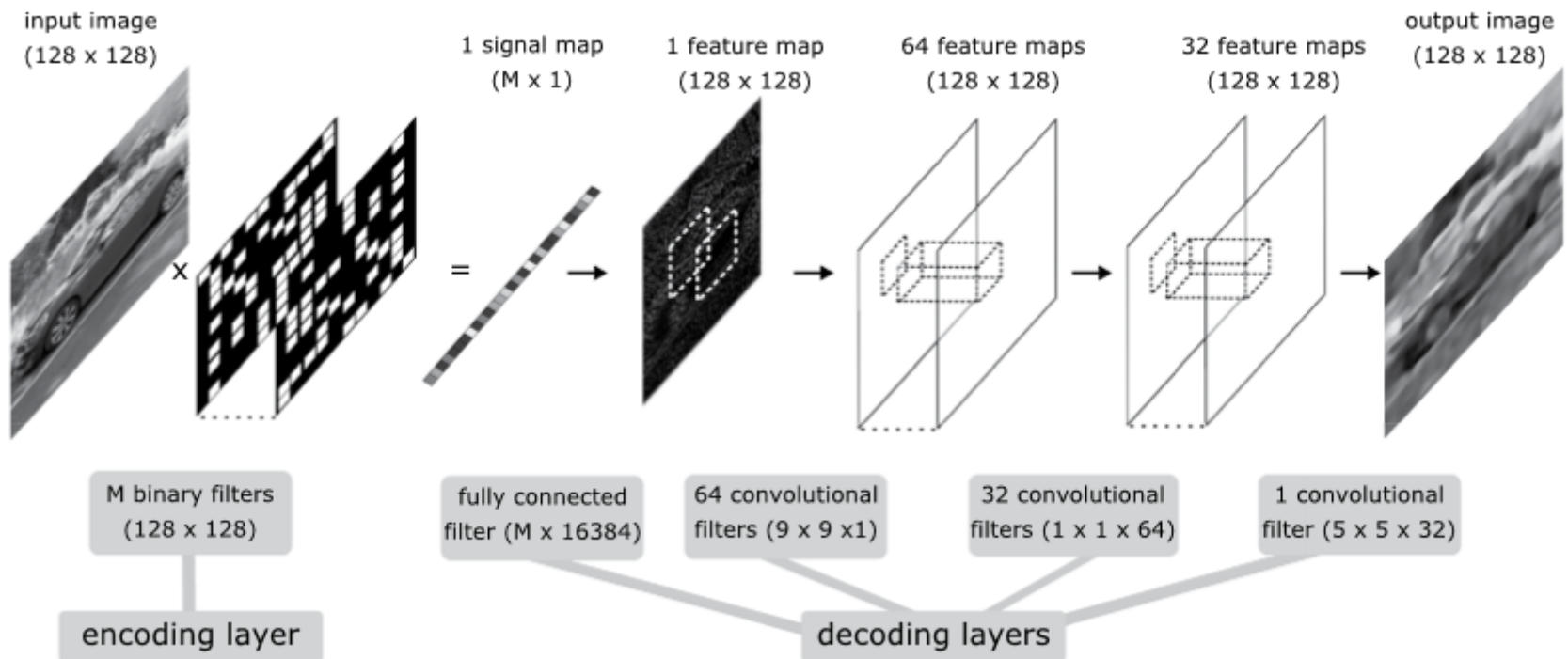
Pattern set

Algorithm



# Deep Learning - Single-Pixel Cameras

Deep-learning with convolutional auto-encoder networks (DCAN)



Higham et al., Deep learning for real-time single-pixel video, Scientific Reports **8**, 2369 (2018)



# Deep Learning - Single-Pixel Cameras

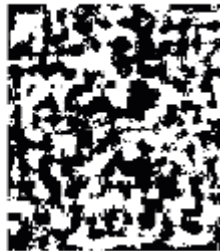


Deep-learning technique: deep-learned basis of 666 patterns and reconstruction



Previous technique: evolutionary Hadamard scan using 666 patterns

Example  
patterns



666 (x2) patterns, at  
20KHz, i.e. 15 fps

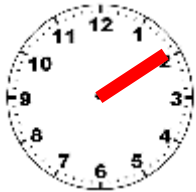
# LIDAR WITH OPTIMISED SAMPLING

# Light Detection and Ranging

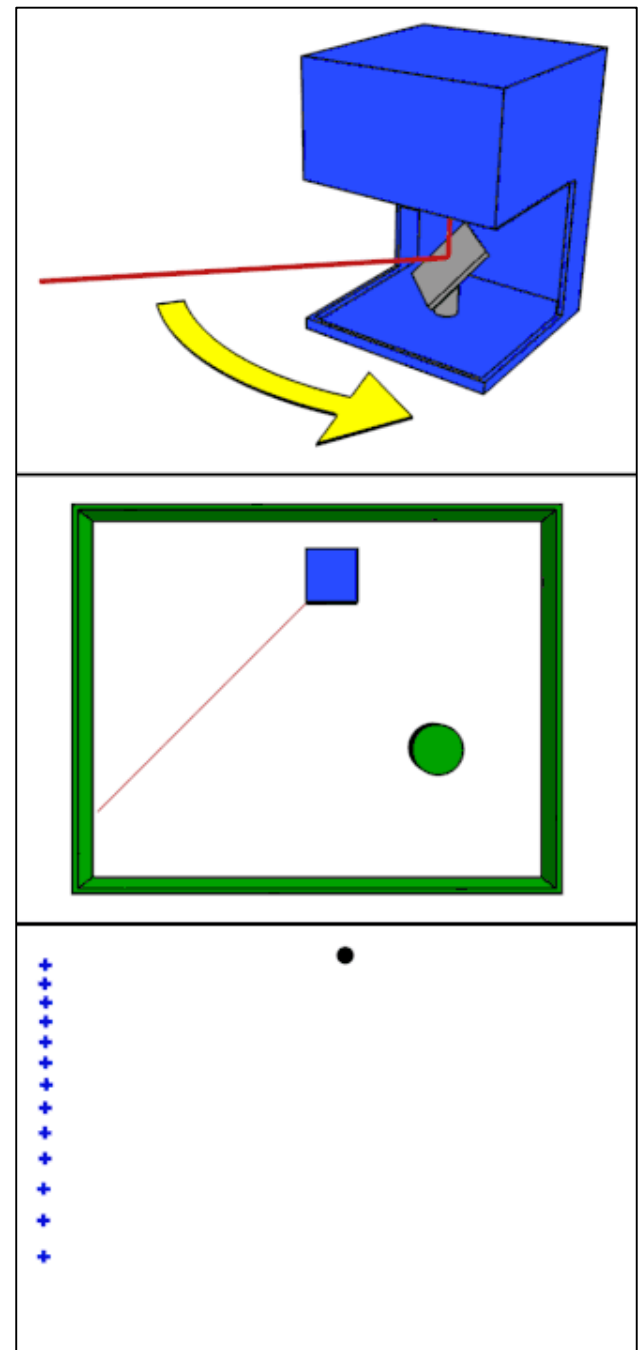
Emitter



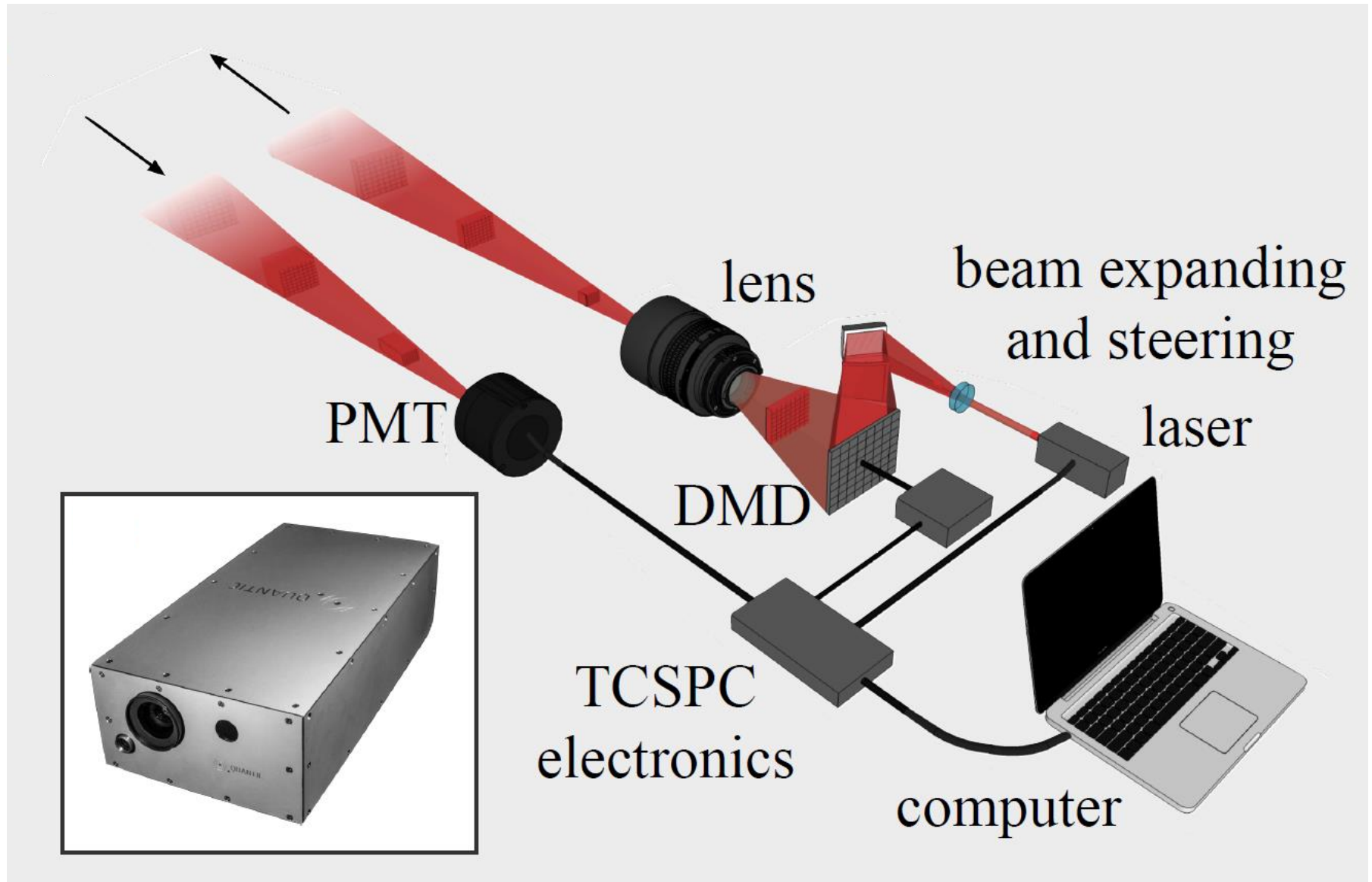
Detector

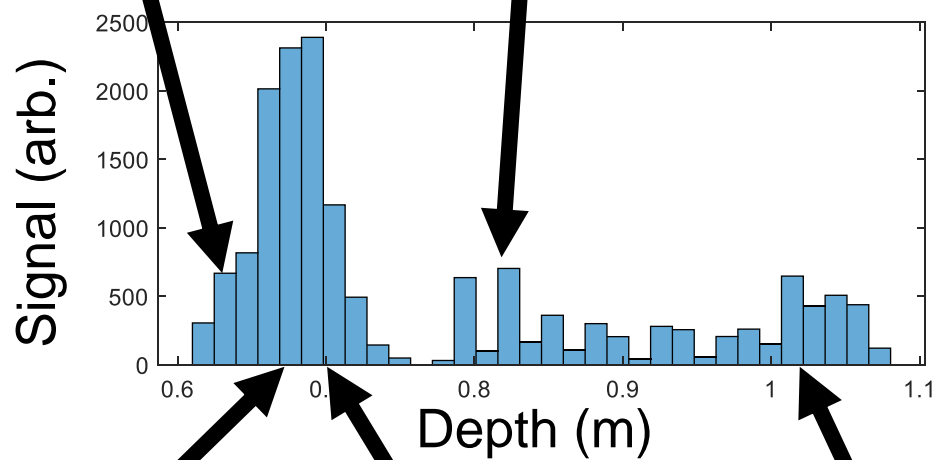
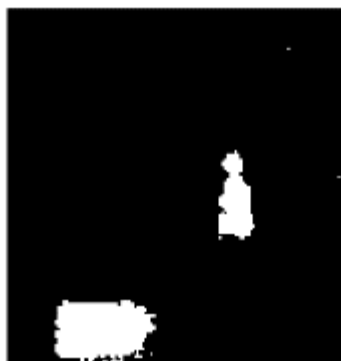
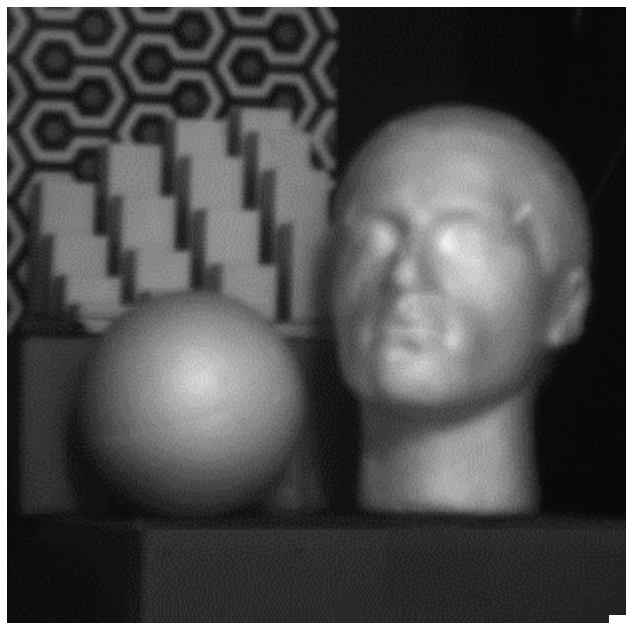


$$\text{Distance} = \text{Speed of Light} \times \text{Time}$$



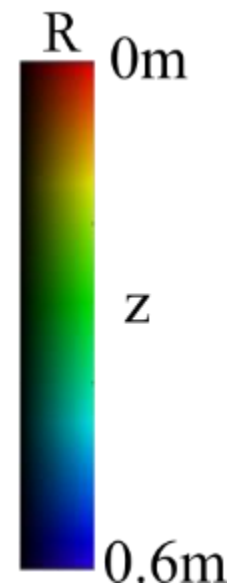
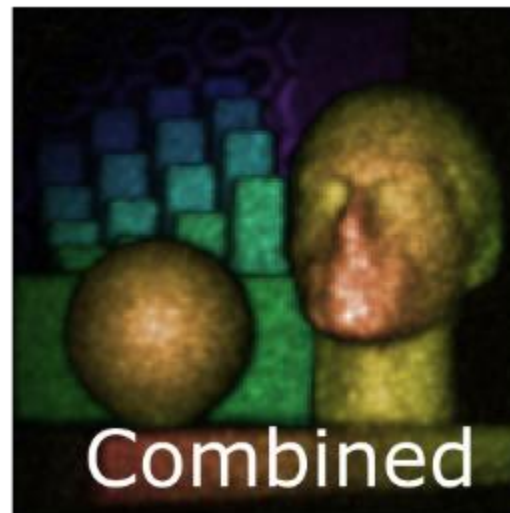
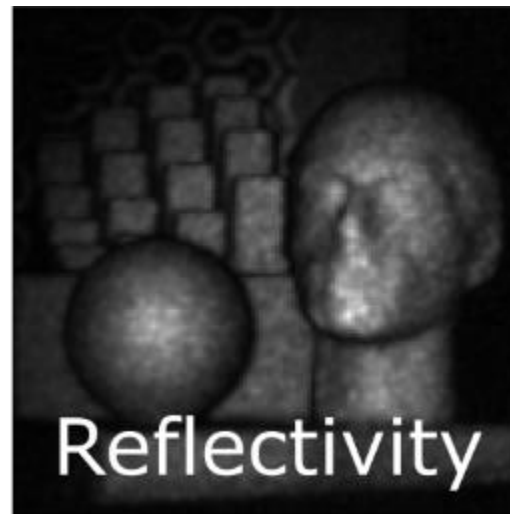
# LIDAR System





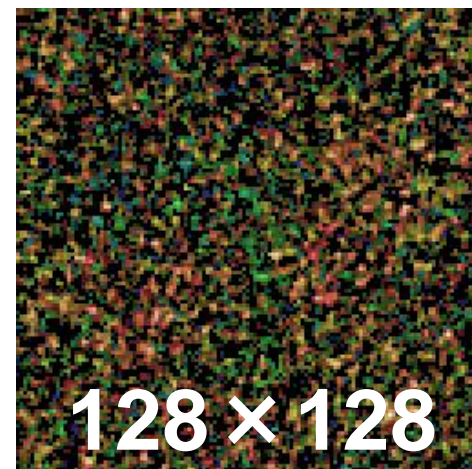
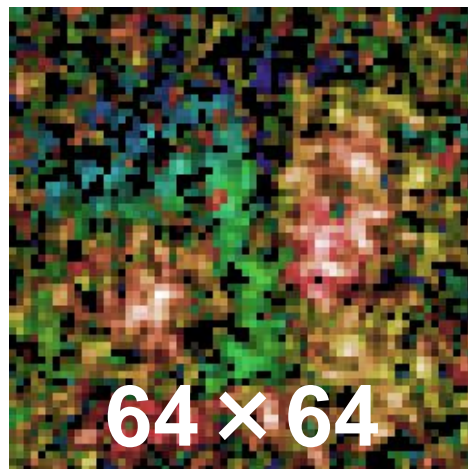
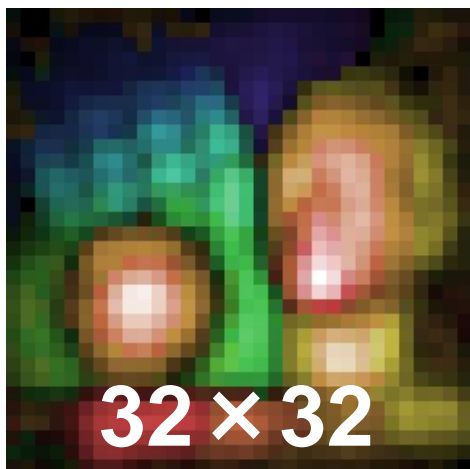


# Measurement



## Results at 2 seconds integration

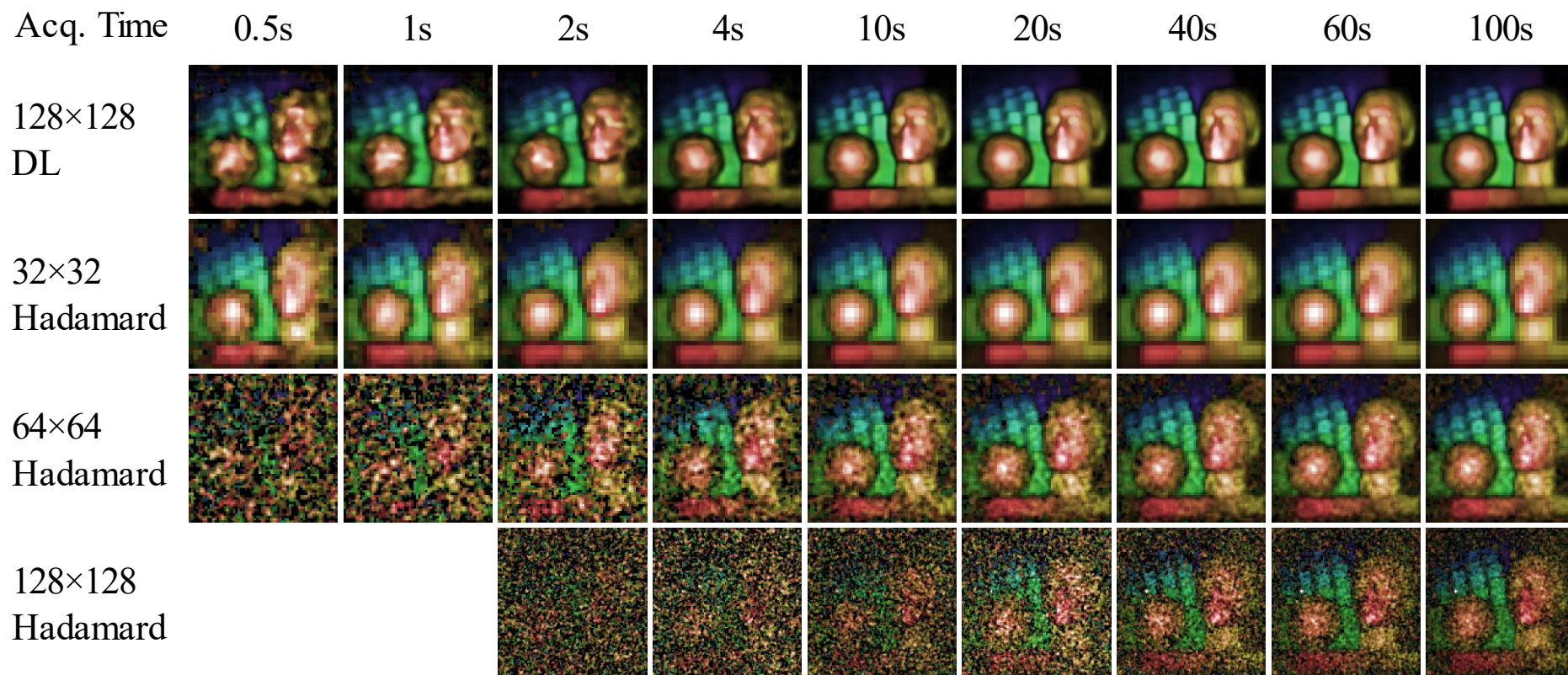
Hadamard



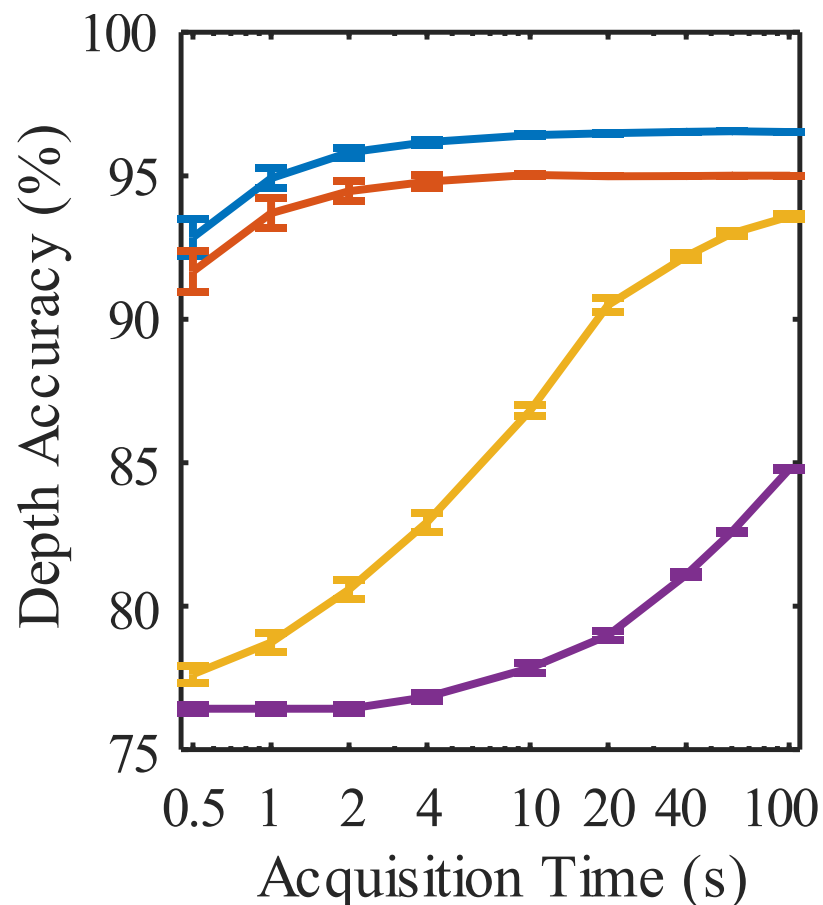
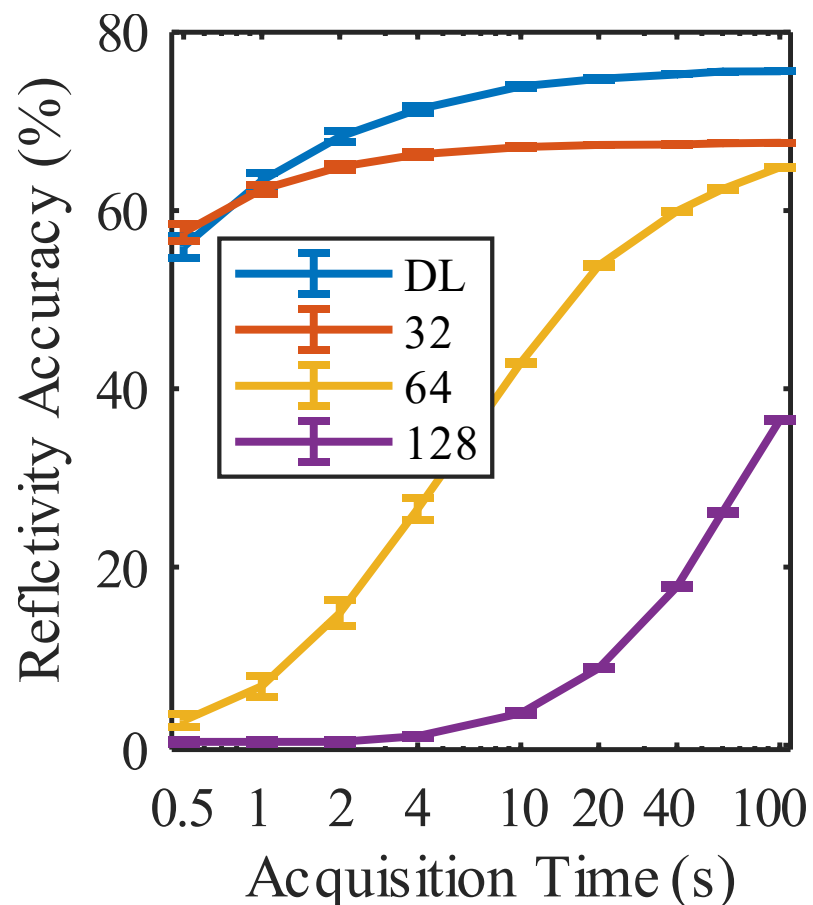
Deep Learning



# Results



# Results





# Longer-range results



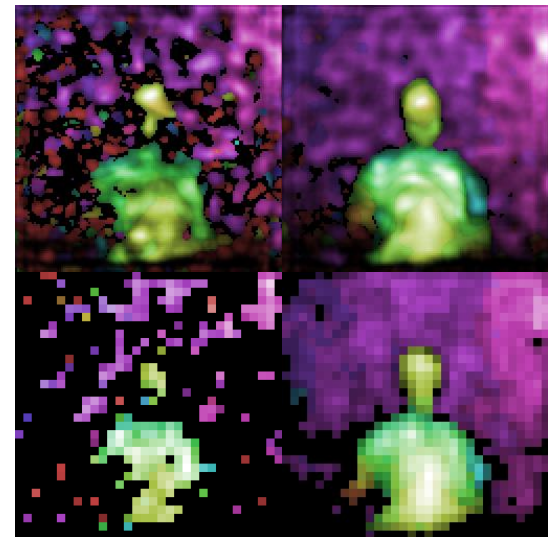
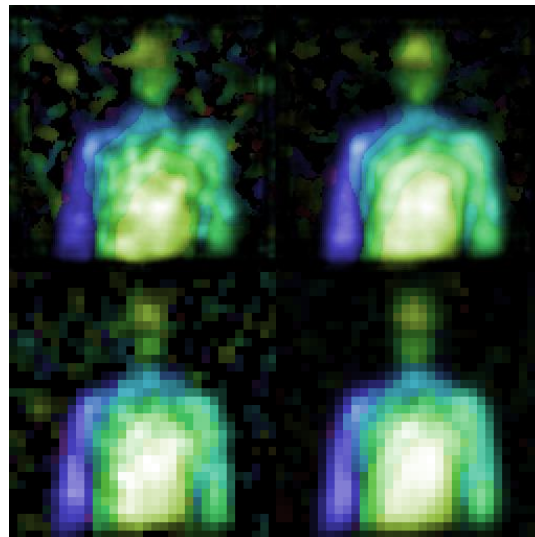
Range  
Acq. Time

1s      5m      10s

1s      30m      10s

128×128

DL



32×32

Hadamard



# Future Applications

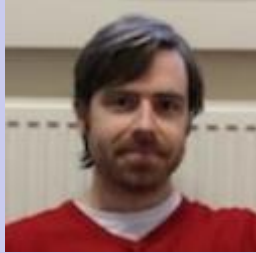
- Non-imaging sampling for fast response
- Computers do not need a picture
- Can they react quicker?



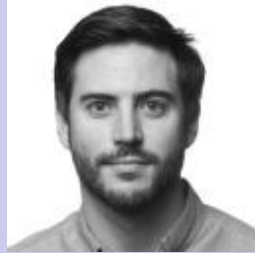
# Acknowledgements



Miles  
Padgett



Neal  
Radwell



Matt  
Edgar



Catherine  
Higham



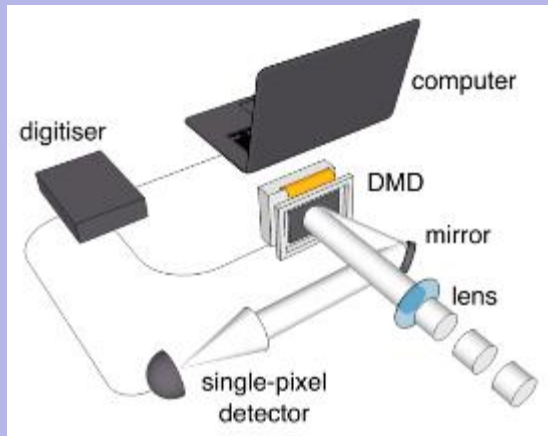
Rod  
Murray-Smith



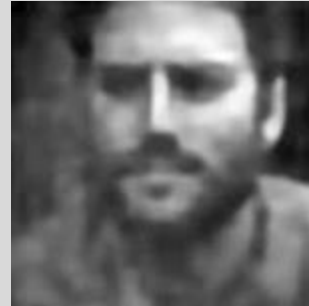
Engineering and  
Physical Sciences  
Research Council

# Summary

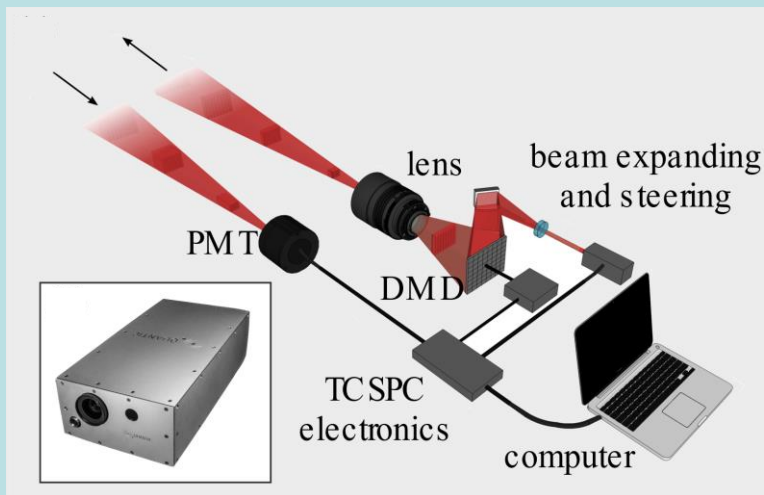
## Single pixel



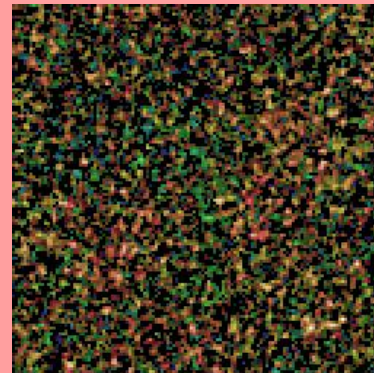
## Deep learning



## LIDAR



## Hadamard



## Deep learning

