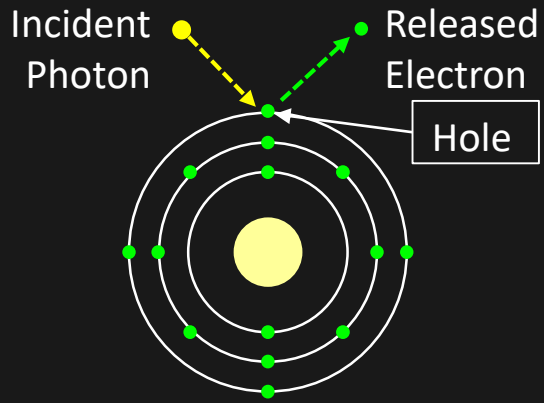


# Photons to images

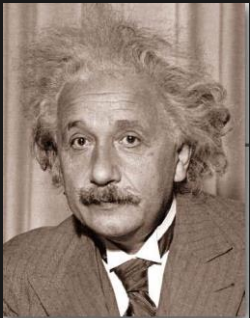
January 3, 2018

# Digital imaging pipeline

Photons to electrons



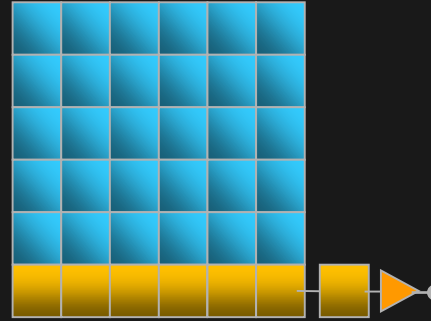
Silicon Atom



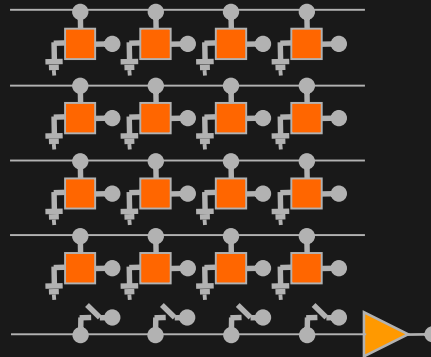
Albert Einstein

Electrons to voltage conversion

CCD

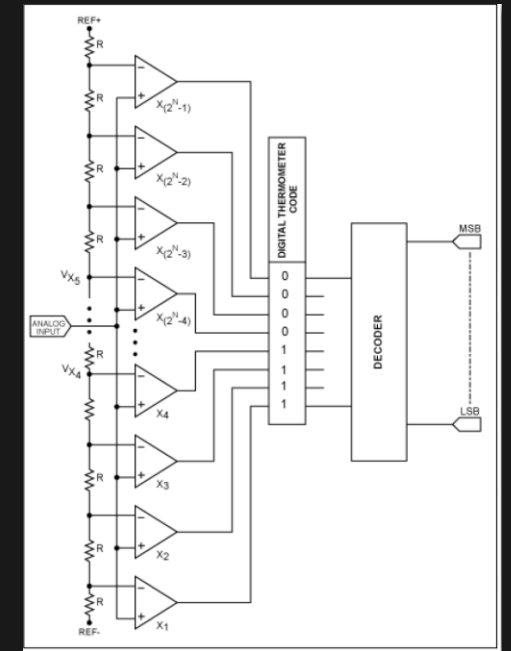


CMOS



Voltages to gray levels

ADC



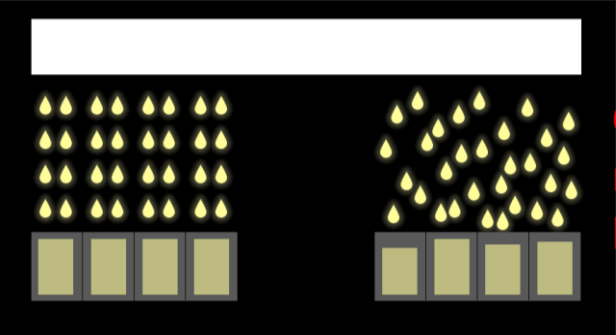
# Sources of noise

## Photons to electrons

### 1. Photon shot noise

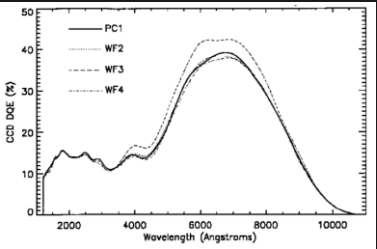
Expectation

Reality

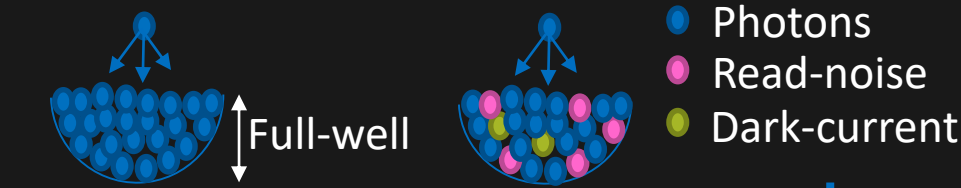


Quantum nature of light

### 2. Quantum Efficiency

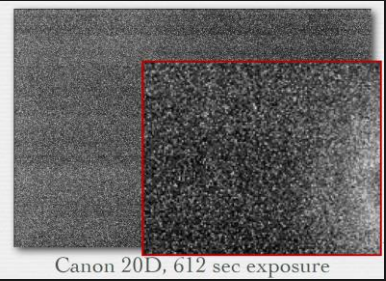


$$QE = \frac{\text{\#electrons}}{\text{\#photons}}$$



## Electrons to voltage conversion

### 1. Dark current noise



Thermally generated electrons

### 2. Full-well capacity

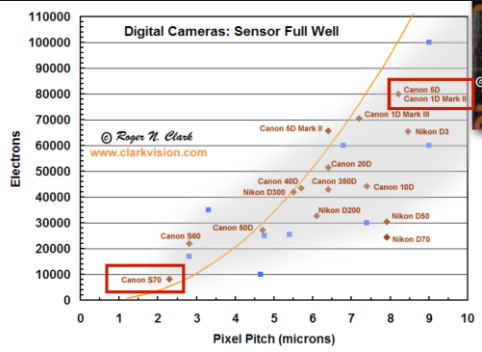
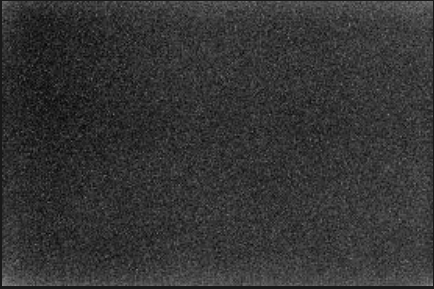


Image saturation

## Voltages to gray levels

### 1. Read noise



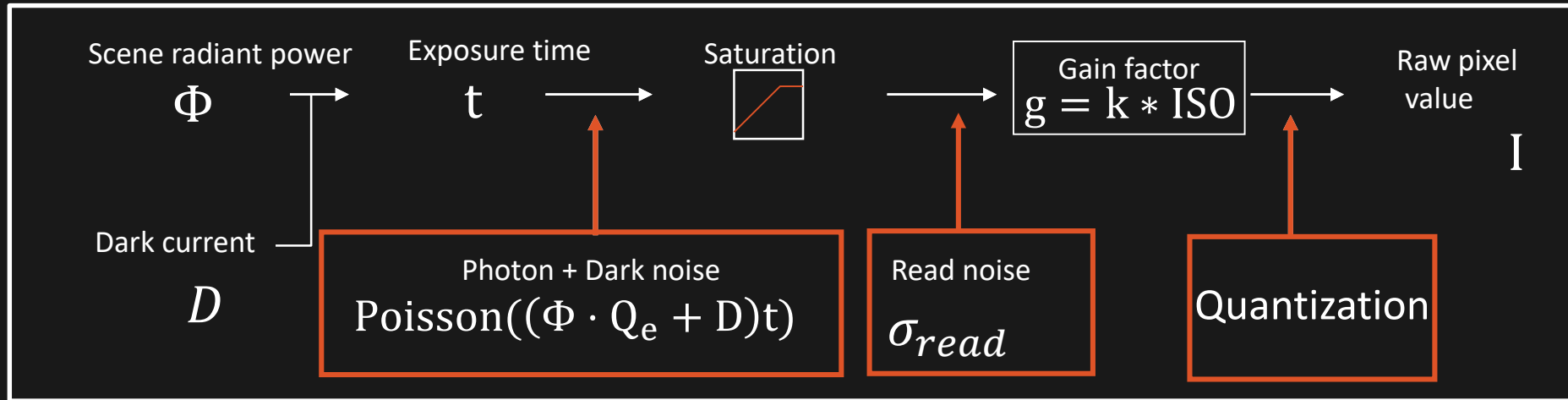
Thermal noise in read-out circuitry

### 2. Systematic noise

- Fixed-pattern noise
- Pixel readout non-uniformity
- Hot-pixels

Ignore for now

# Per-pixel noise model



linear image formation:

$$I = g * \left( \min\left(\text{Poisson}((\Phi \cdot Q_e + D)t), I_{max}\right) + n \right)$$

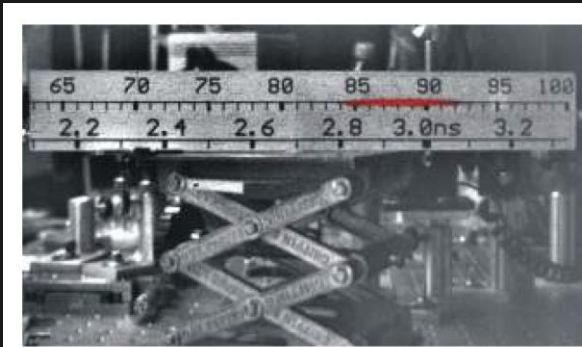
The equation is annotated with labels:

- Gain** points to the gain factor  $g$ .
- Saturation level/Full-well** points to the  $I_{max}$  term in the  $\min$  function.
- Noise (Read)** points to the  $n$  term in the equation.

# Intensified CCD camera (ICCD): 4 Picos



Single-photon sensitivity   **Stanford Computer Optics**   Temporal Resolution: 200 ps

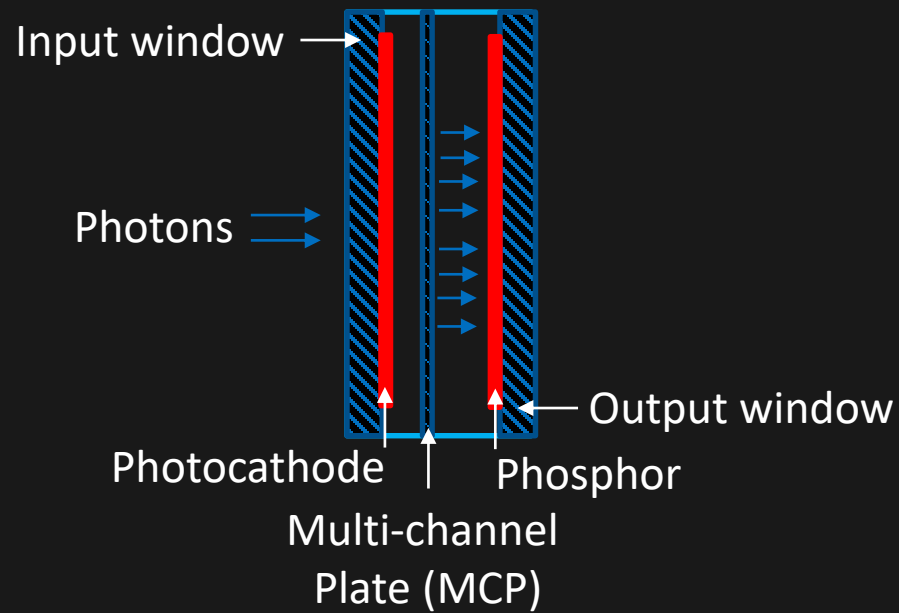


*The image shows the distance a femtosecond laser pulse moved along a ruler while the shutter of the 4 Picos camera was open. This distance is a direct measure of the flat top, single shot gating time.*

**Example image:** Shows that the laser moved approximately  $\sim 200$  ps.

# Intensified CCD camera (ICCD): 4 Picos

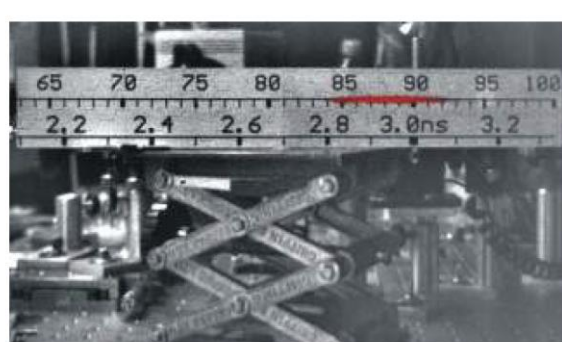
Intensifier



- **Photocathode:** 50% (peak)
- **MCP** : 1000 × electron multiplication
- **Phosphor** : 180 photons per electron

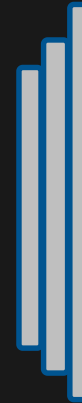


Stanford Computer Optics



The image shows the distance a femtosecond laser pulse moved along a ruler while the shutter of the 4 Picos camera was open. This distance is a direct measure of the flat top, single shot gating time.

CCD



- High-dynamic range : 12 bits
- High TE cooling ( $-40^{\circ}\text{C}$ ): Low-dark current

## Intensifier specification

- Quantum-efficiency : 50 %
- MCP (amplification) :  $1000 \times$
- Phosphor-efficiency : 180 photons per electron

- Dark-current :  $0.2 \frac{\text{electrons}}{\text{pix}} / \text{sec}$

## CCD specification

- Resolution :  $1360 \times 1024$
- Dynamic-range : 12 bit
- Pixel-Size ( $\mu\text{m}$ ) :  $4.7 \times 4.7$

- Quantum-efficiency : 40 %
- Dark-current :  $0.2 \frac{\text{electrons}}{\text{pix}} / \text{sec}$
- Read-noise : 7 electrons
- Full-well :  $500,000 e^-$
- Quantization-bits : 12 bits

# Pseudocode: Forward-model

[outputImage] = ScatteringMedium (PSF, reflectivity)

PSF : 2D-Point-spread function in  $\frac{\text{photons}}{\text{unit-time}}$

reflectivity : Scene-reflectivity in [0,1]

outputImage: Output-image in  $\frac{\text{photons}}{\text{unit-time}}$

outputImage = imfilter(PSF, Reflectivity, 'same');

[intensifiedOutput] = ICCDIntensifier (outputImage)

outputImage : Image incident on intensifier in  $\frac{\text{photons}}{\text{unit-time}}$

intensifiedOutput: Intensified output-image in  $\frac{\text{photons}}{\text{unit-time}}$

$q_e$  : 0.5 (Quantum-efficiency of intensifier in  $\frac{\text{electrons}}{\text{photons}}$ )

dc : 0.2 (Dark-current in  $\frac{\text{electrons}}{\text{pixel} \cdot \text{second}}$ )

mcp : 1000 (Amplification of electrons)

pe : 180 (Phosphor-screen efficiency in  $\frac{\text{photons}}{\text{electrons}}$ )

intensifiedOutput = poisson(outputImage  $\times q_e$  + dc  $\times \Delta t$ )  $\times$  mcp  $\times$  pe

[imagePixels] = CCDSensor (intensifiedOutput, x)

intensifiedOutput : Intensified output-image in  $\frac{\text{photons}}{\text{unit-time}}$

outputImage : Output-image in  $\frac{\text{photons}}{\text{unit-time}}$

$q_e$  : 0.4 (Quantum-efficiency of sensor in  $\frac{\text{electrons}}{\text{photons}}$ )

dc : 0.2 (Dark-current in  $\frac{\text{electrons}}{\text{pixel} \cdot \text{second}}$ )

rn : 7 (Read-noise in  $\frac{\text{electrons}}{\text{pixel}}$ )

fw : 500,000 (Full-well capacity in  $\frac{\text{electrons}}{\text{pixel}}$ )

g : x (Gain-factor decided by which image saturates)

nb : 12 (Number of bits in bits)

imageInElectrons = poisson(intensifiedOutput  $\times q_e$  + dc  $\times \Delta t$ )

imageInElectrons = min(imageInElectrons, fw)

imageInElectrons = AWGN(imageInElectrons, rn<sup>2</sup>)

imageInVolts = imageInElectrons  $\times$  g

imageInPixels = binarize(imageInVolts, nb)



# Example forward-model

TotalNumberPhotons = 1e9

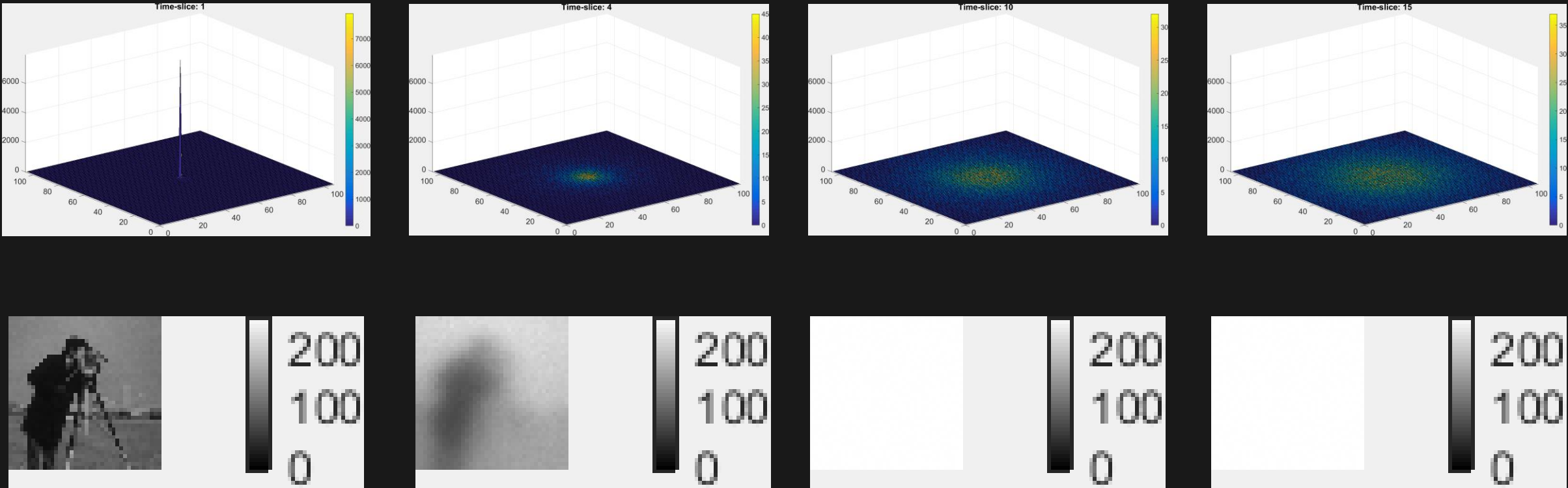


Image saturates at slice 5 itself.

Intensifier-gain	1
Desired-saturated image	10
Achieved-saturated image	5

# Example forward-model

TotalNumberPhotons =  $1e7$

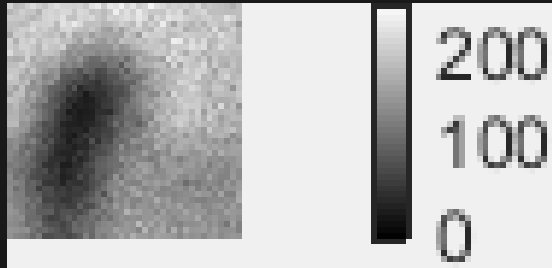
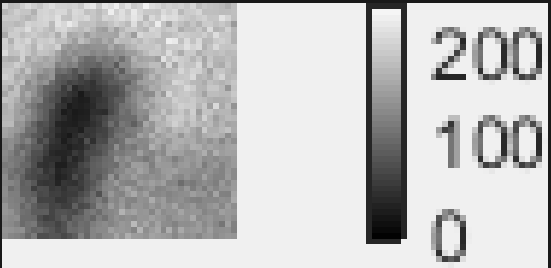
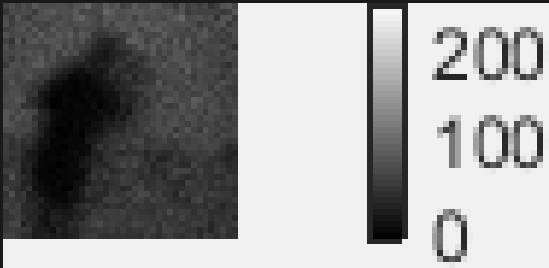
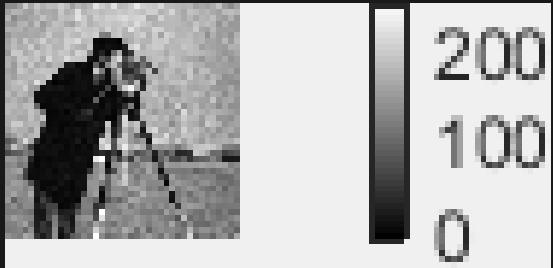
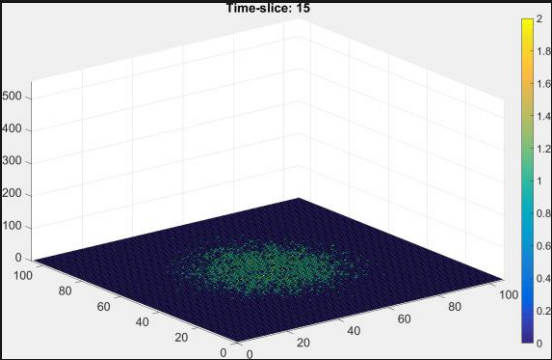
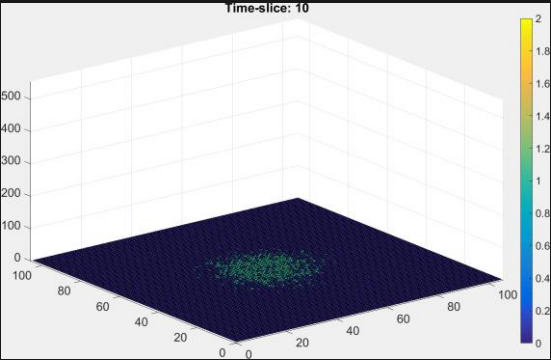
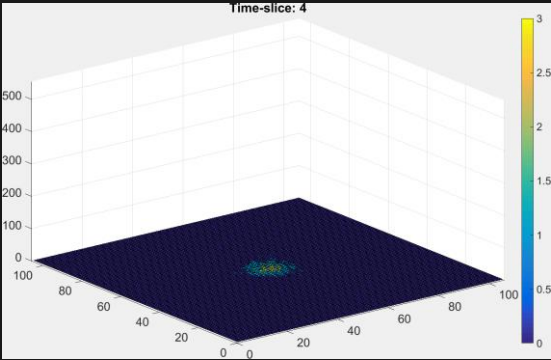
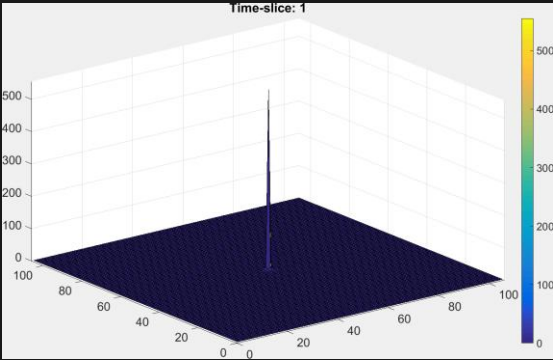


Image saturates at slice 11.

Intensifier-gain	21
Desired-saturated image	10
Achieved-saturated image	11

# Example forward-model

TotalNumberPhotons =  $0.9e7$

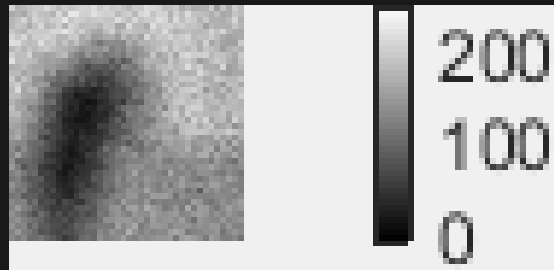
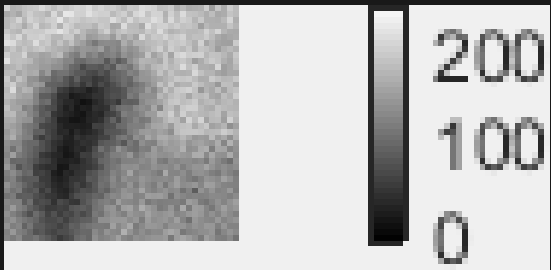
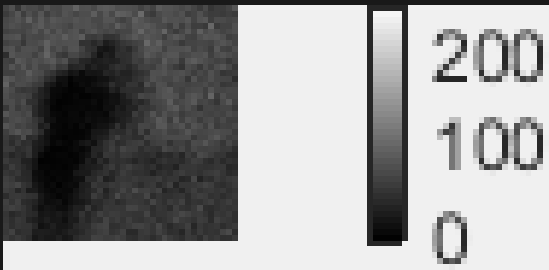
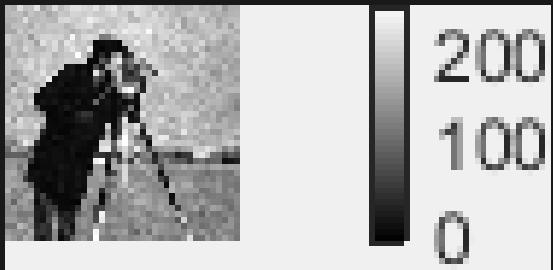
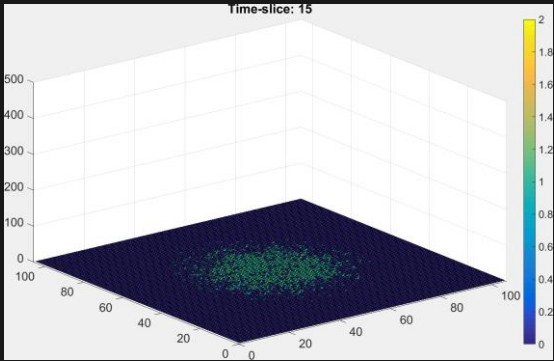
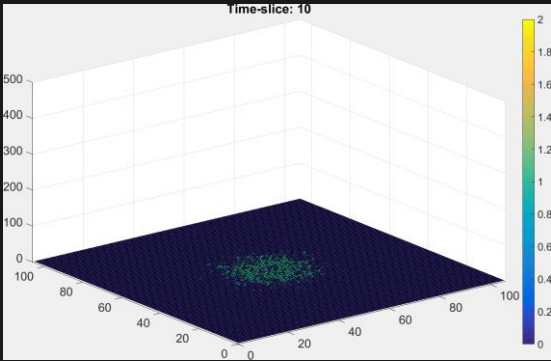
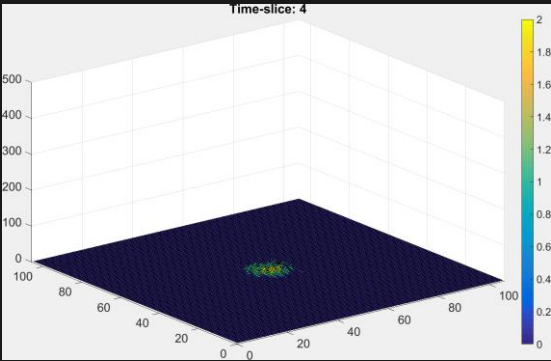
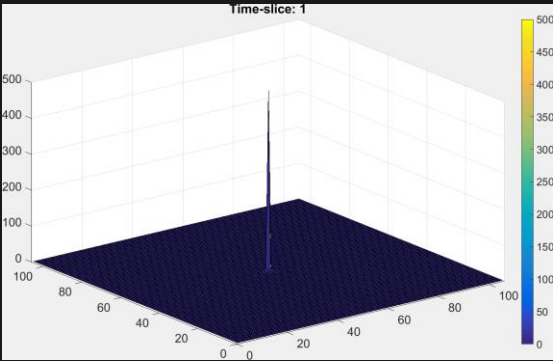


Image saturates at slice 11.

Intensifier-gain	24
Desired-saturated image	10
Achieved-saturated image	11

# Intensifier gain

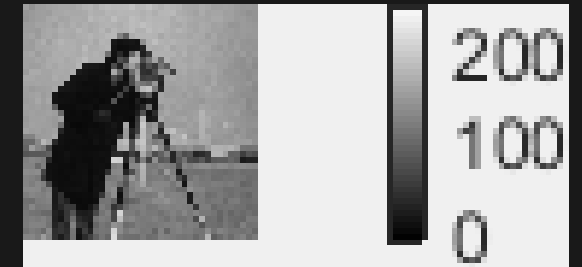
TotalNumberPhotons =  $1e8$

Increasing the intensifier-gain saturates the image more quickly (in time) but the quality of the slice-1 seems to improve.

Intensifier gain = 1  
Saturated image= 8



Intensifier gain = 2  
Saturated image= 5



Intensifier gain = 3  
Saturated image= 1



Intensifier gain = 4  
Saturated image= 1

