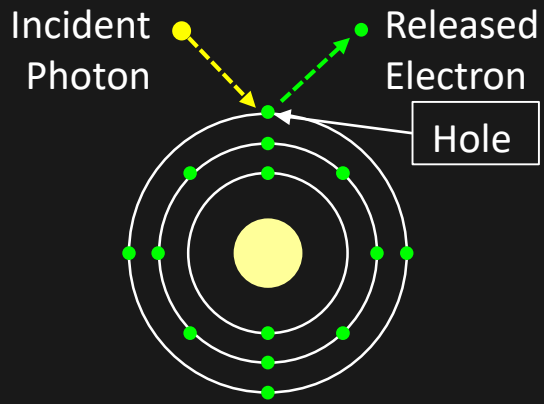


Photons to images

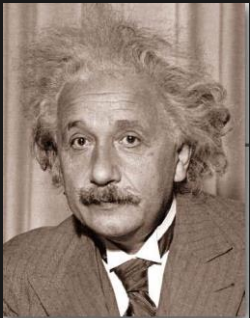
January 3, 2018

Digital imaging pipeline

Photons to electrons



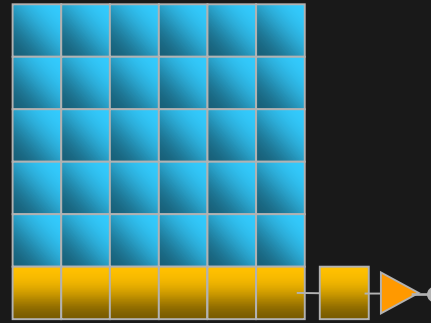
Silicon Atom



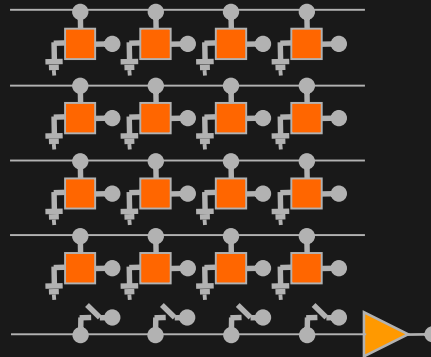
Albert Einstein

Electrons to voltage conversion

CCD

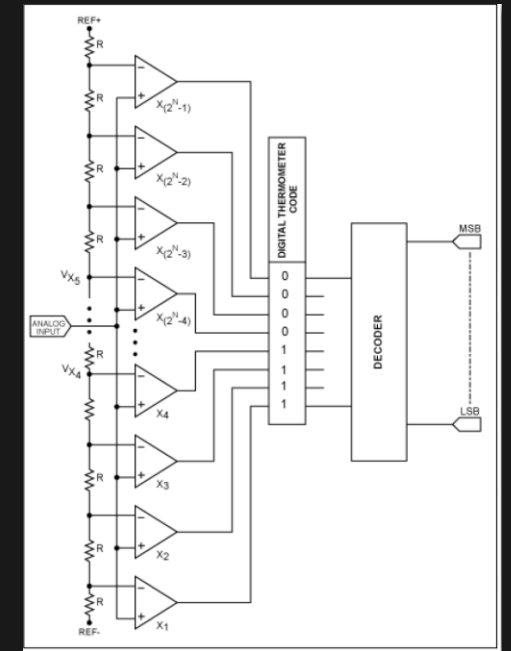


CMOS



Voltages to gray levels

ADC



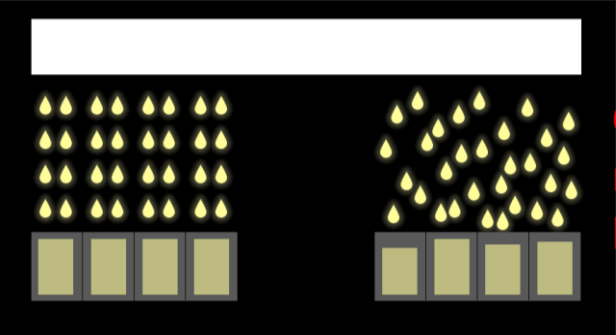
Sources of noise

Photons to electrons

1. Photon shot noise

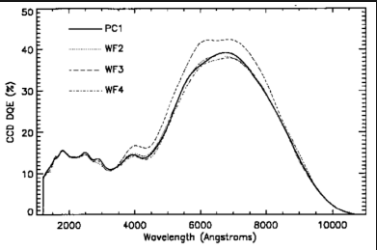
Expectation

Reality

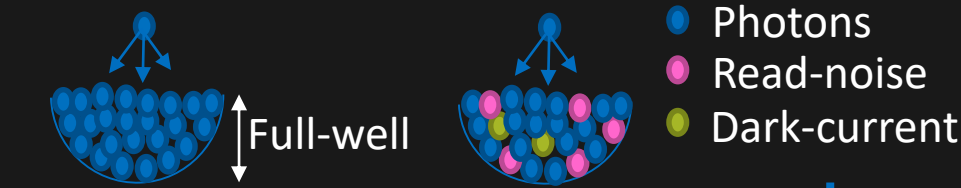


Quantum nature of light

2. Quantum Efficiency

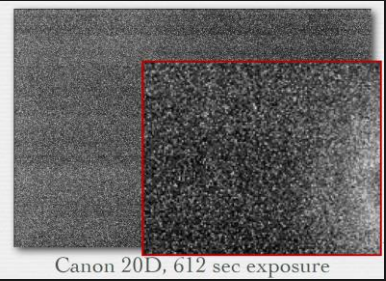


$$QE = \frac{\text{\#electrons}}{\text{\#photons}}$$



Electrons to voltage conversion

1. Dark current noise



Thermally generated electrons

2. Full-well capacity

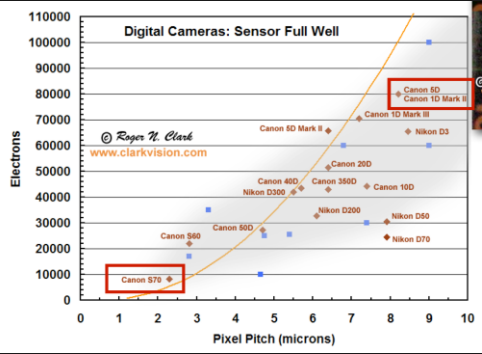
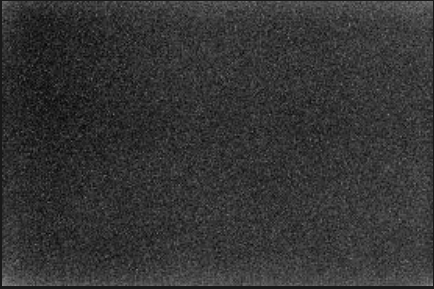


Image saturation

Voltages to gray levels

1. Read noise



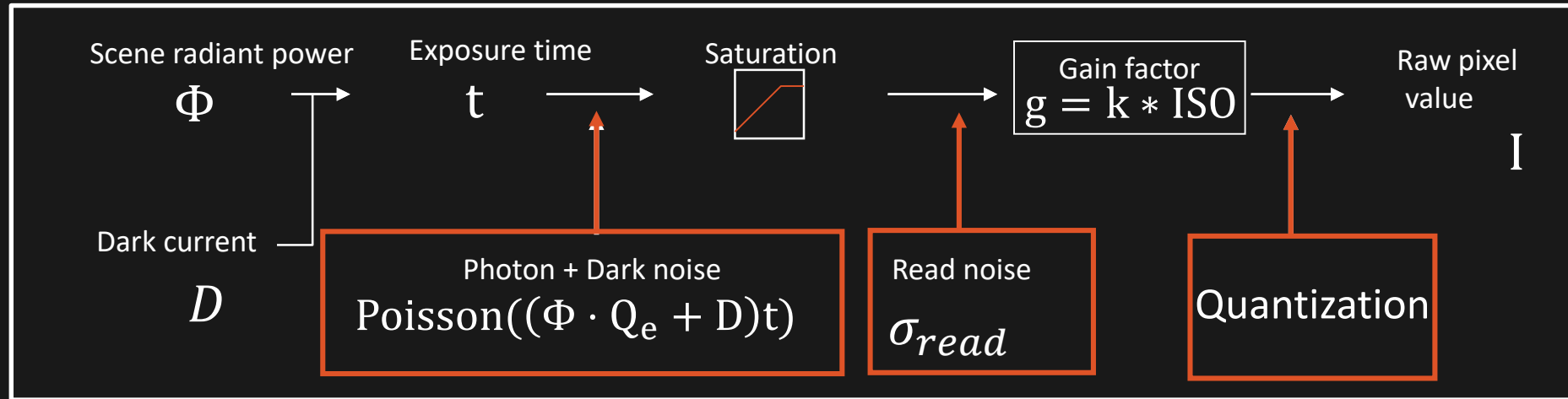
Thermal noise in read-out circuitry

2. Systematic noise

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

Ignore for now

Per-pixel noise model



linear image formation:

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

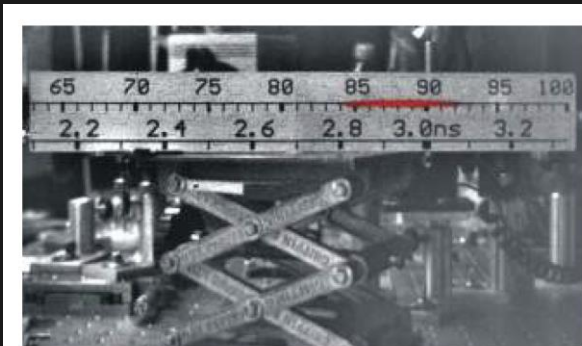
The equation is annotated with labels:

- Gain** points to g .
- Noise (Read)** points to n .
- Saturation level/Full-well** points to I_{max} .

Intensified CCD camera (ICCD): 4 Picos



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

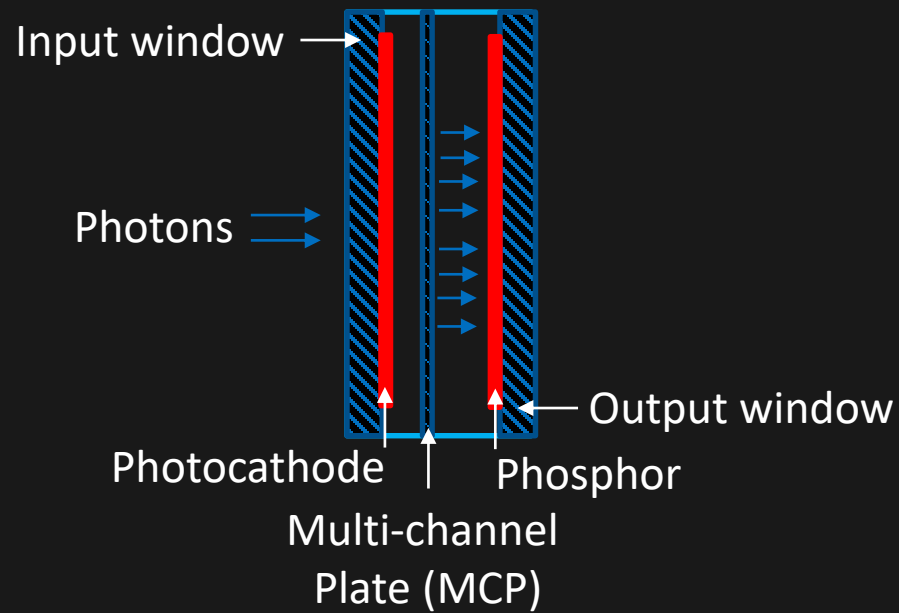


The image shows the distance a femtosecond laser pulse moved along a ruler while the shutter of the 4 Picos camera was open. This distance is a direct measure of the flat top, single shot gating time.

Example image: Shows that the laser moved approximately ~ 200 ps.

Intensified CCD camera (ICCD): 4 Picos

Intensifier



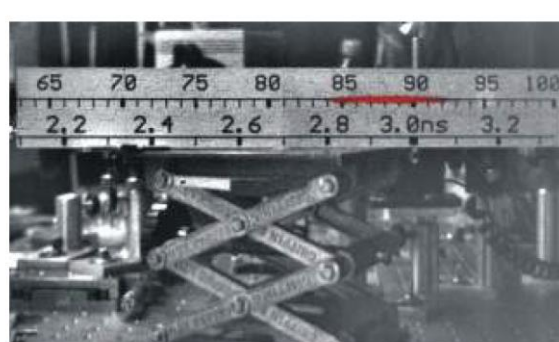
- **Photocathode:** 50% (peak)
- **MCP** : 1000 × electron multiplication
- **Phosphor** : 180 photons per electron



CCD



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.

- High-dynamic range : 12 bits
- High TE cooling (-40°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 : 1360×1024
- Dynamic-range : 12 bit
- Pixel-Size (μm) : 4.7×4.7

- 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)

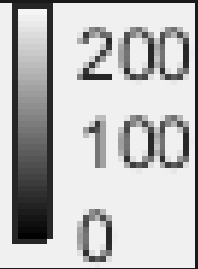
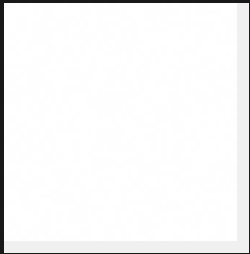
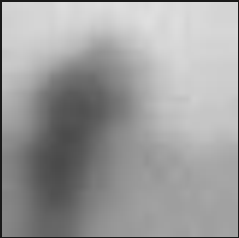
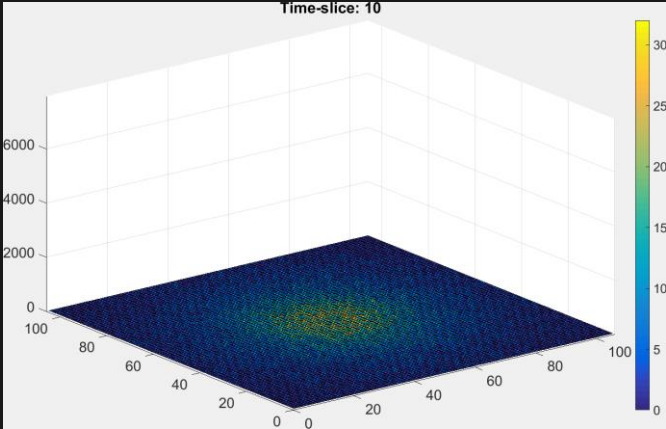
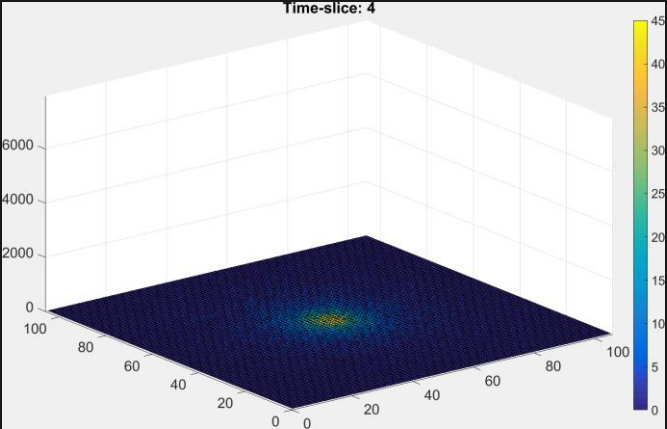
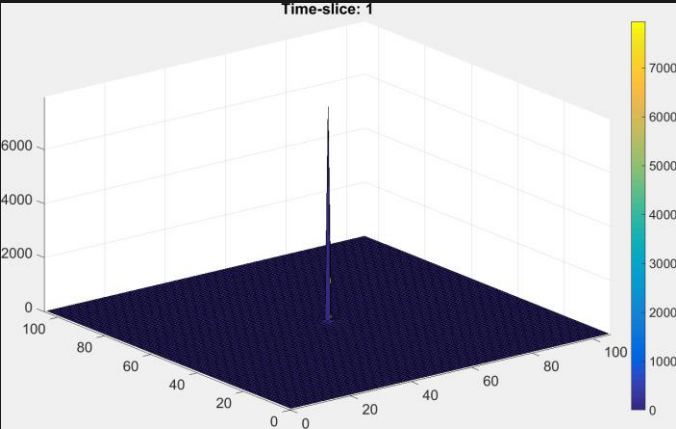
imageInElectrons = AWGN(imageInElectrons, rn²)

imageInVolts = imageInElectrons \times g

imageInPixels = binarize(imageInVolts, nb)

Example forward-model

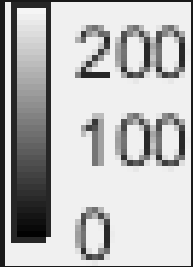
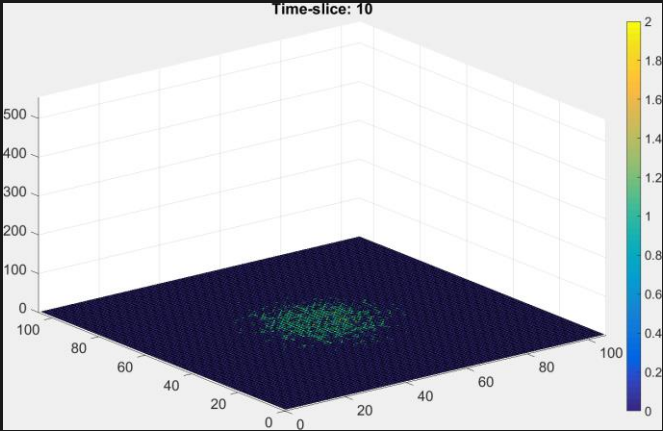
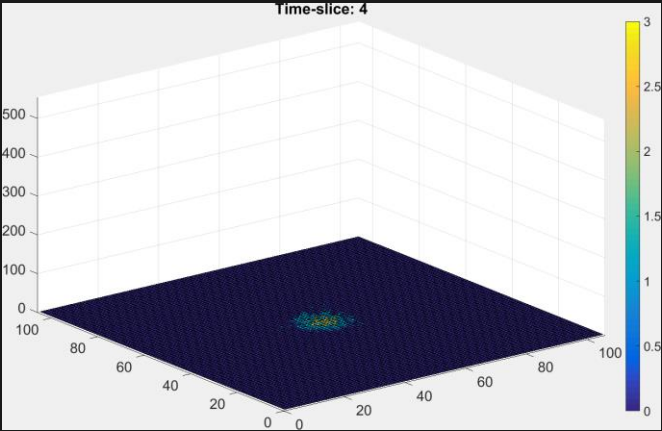
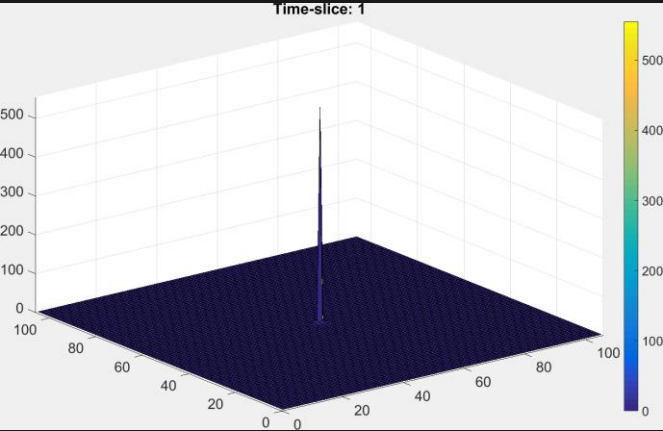
TotalNumberPhotons = 1e9



Intensifier-gain	1
Saturated-image	5

Example forward-model

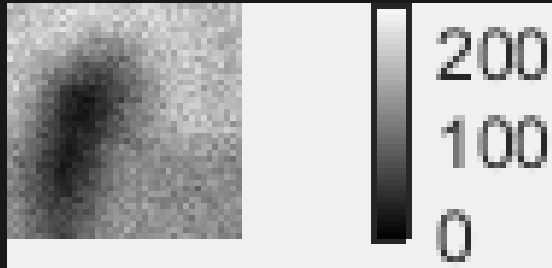
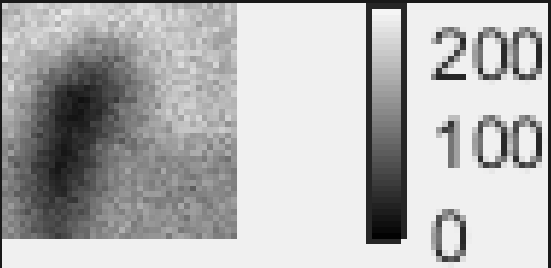
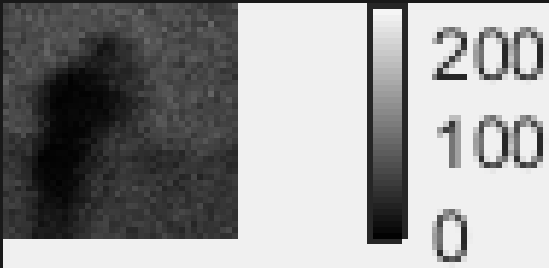
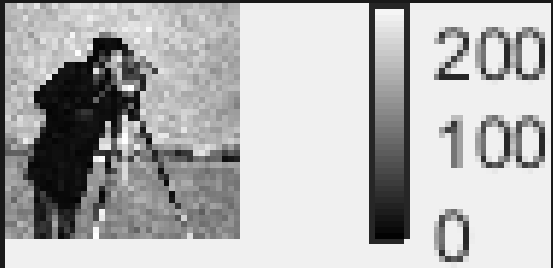
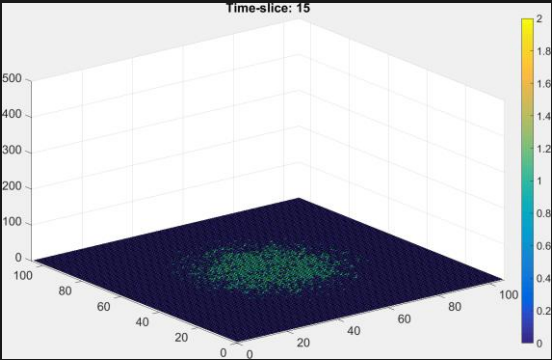
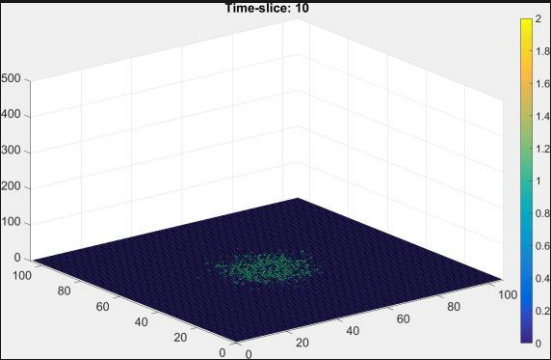
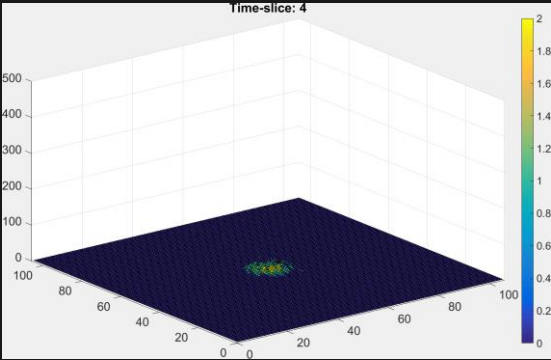
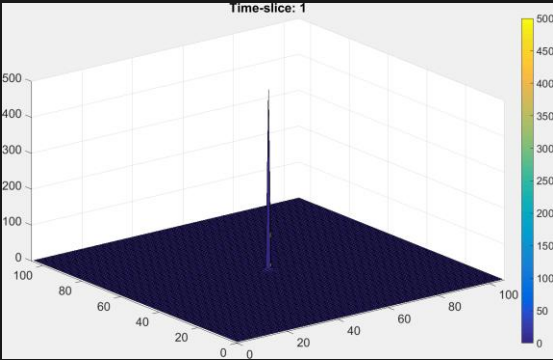
TotalNumberPhotons = 1e7



Intensifier-gain	21
Saturated-image	11

Example forward-model

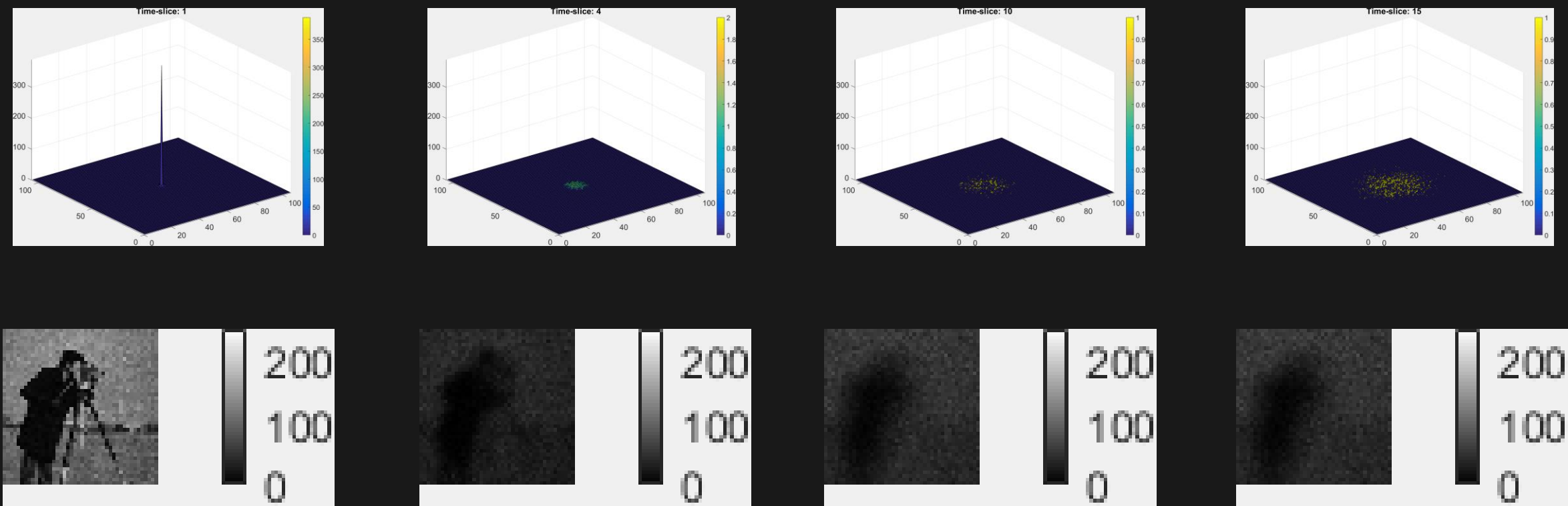
TotalNumberPhotons = $0.9e7$



Intensifier-gain	24
Saturated-image	11

Example forward-model

TotalNumberPhotons = $0.7e7$



Intensifier-gain	24
Saturated-image	17

Intensifier gain

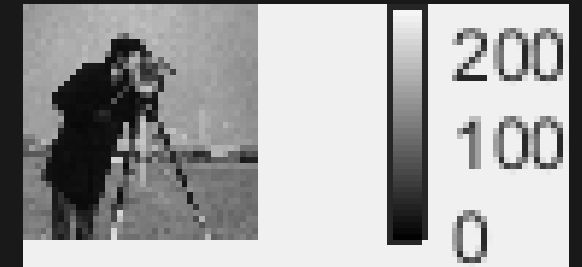
TotalNumberPhotons = $1e8$

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



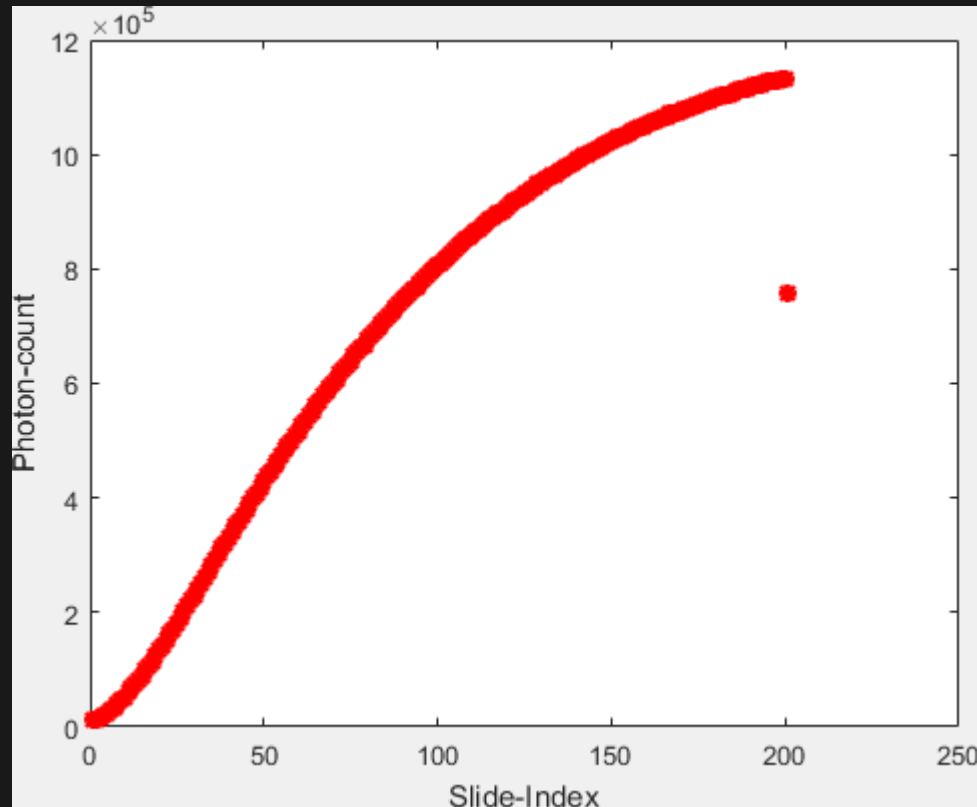
Intensifier gain = 4
Saturated image= 1



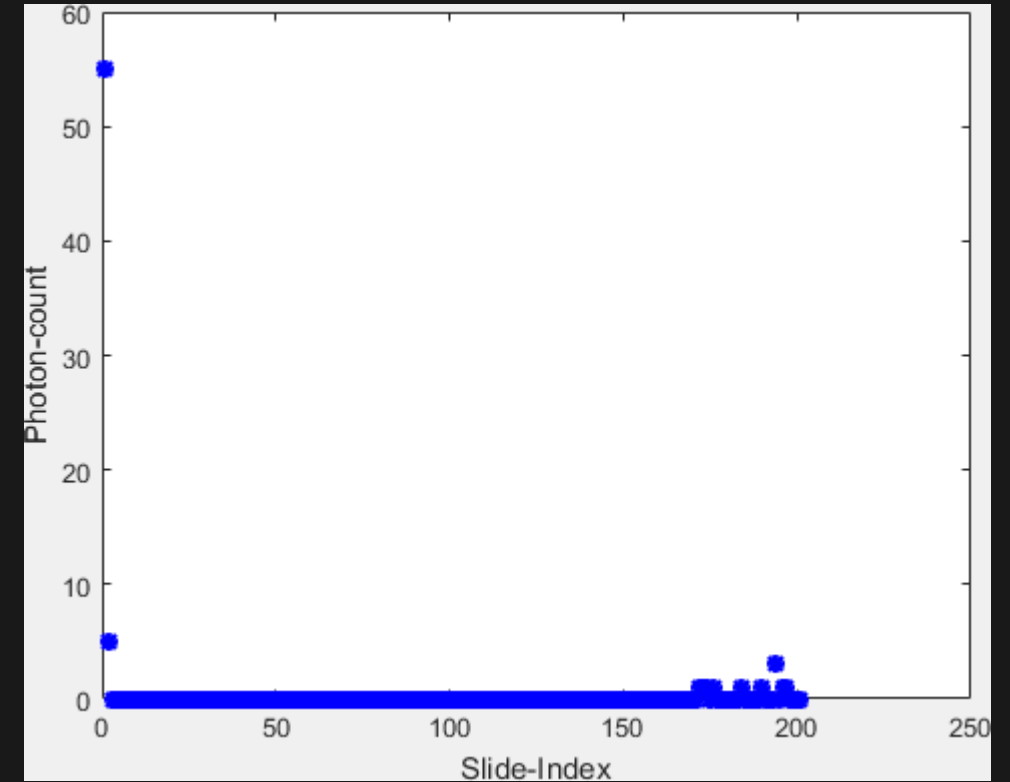
Low-photon count issue

Photon-count adjustment formula:

$$\text{NewPSF} = \text{floor}\left(\frac{\text{NewPhotonCount}}{\text{OldPhotonCount}} * \text{OldPSF}\right)$$



Old-photon count



New-photon count