

# WHAT'S BEHIND THE PICTURE?

{ Choosing and using **scientific** cameras }

## Choosing and Using **Scientific** Cameras

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- 1 { The image problem
  - 2 { Think in photons
  - 3 { Real cameras are not perfect
  - 4 { Know thyself
  - 5 { The Living Image: Case Studies
-

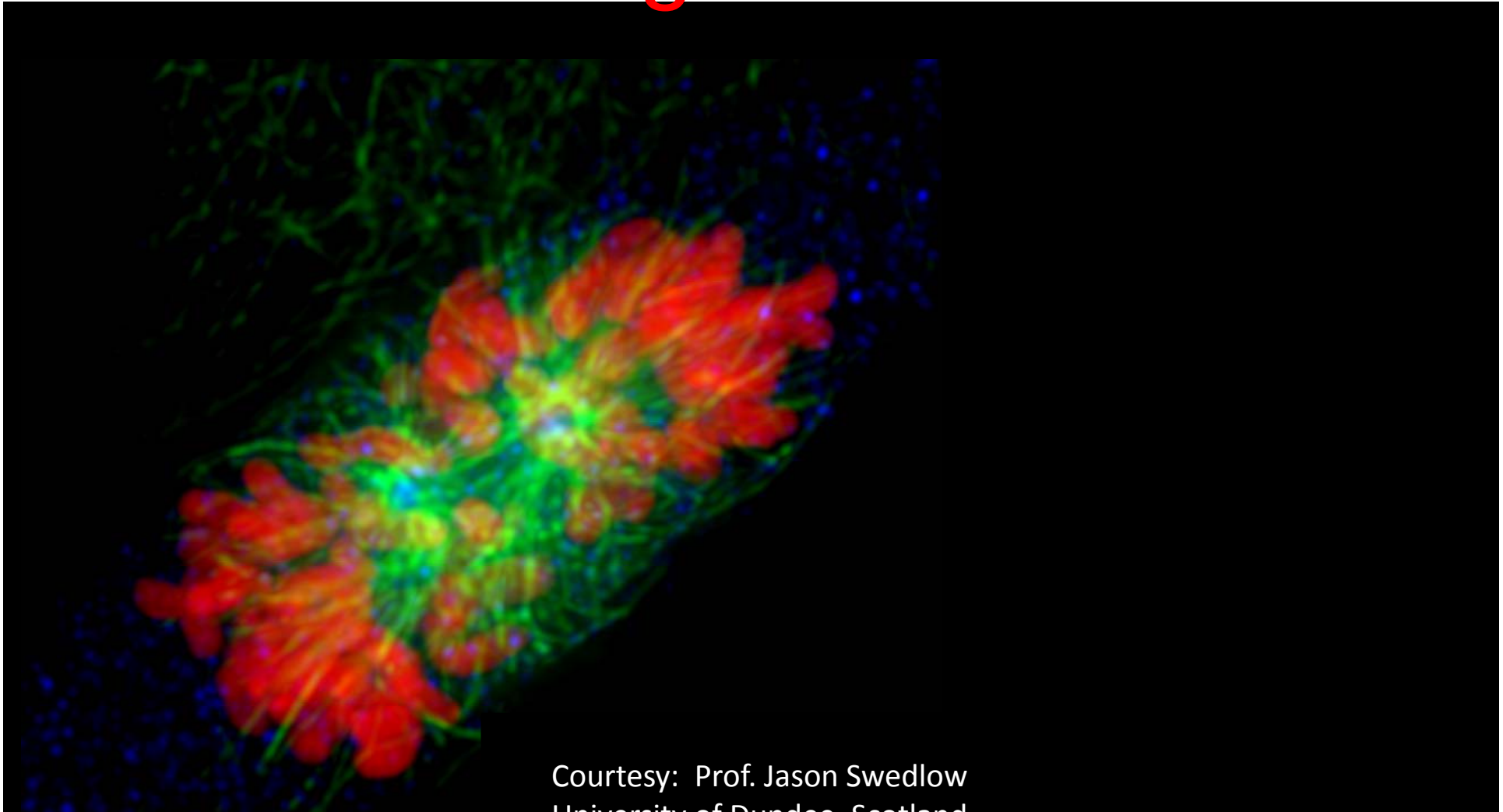
## Choosing and Using **Scientific** Cameras

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# The Image Problem...

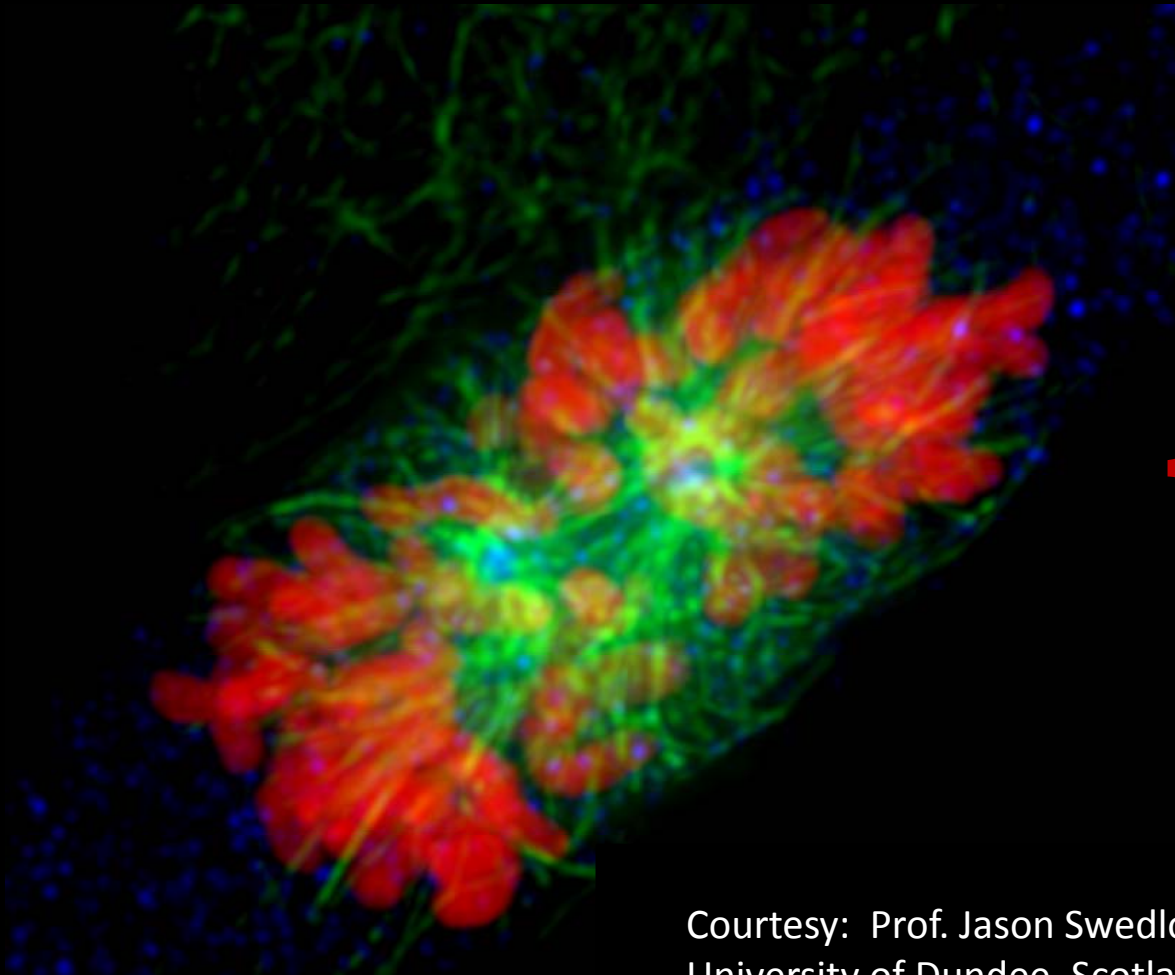
**HAMAMATSU**  
PHOTON IS OUR BUSINESS



Courtesy: Prof. Jason Swedlow  
University of Dundee, Scotland  
Open Microscopy Environment



# The Image Problem...



A pretty picture?

A measurement?

A resource?

A reference?

Courtesy: Prof. Jason Swedlow  
University of Dundee, Scotland  
Open Microscopy Environment

# {1}

## THE IMAGE PROBLEM

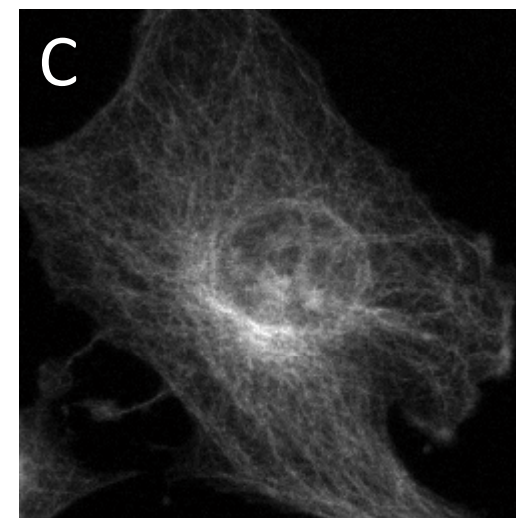
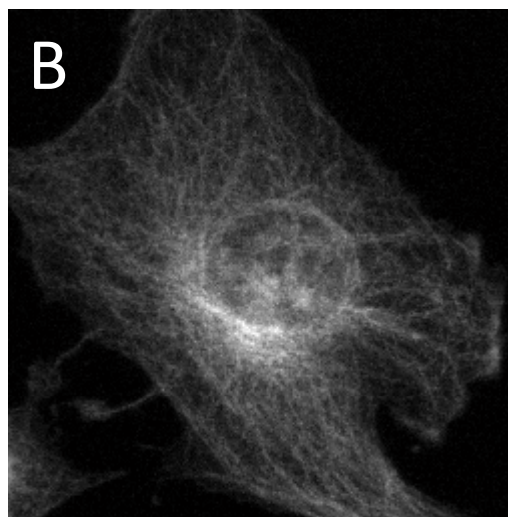
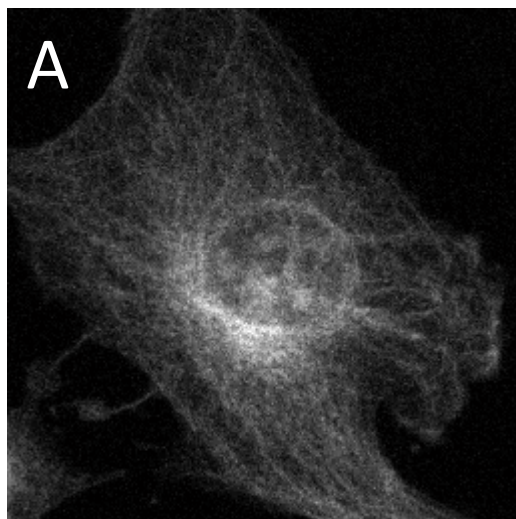
---

LOOK  
CAREFULLY

- Eyes can be fooled
    - Not good at quantifying greys
    - Not objective
    - Emphasizes patterns and colors
    - Viewing environment
  - Screens are not capable of displaying full bit depth
  - Image display can (and should be!) manipulated for on screen viewing
-

{1}

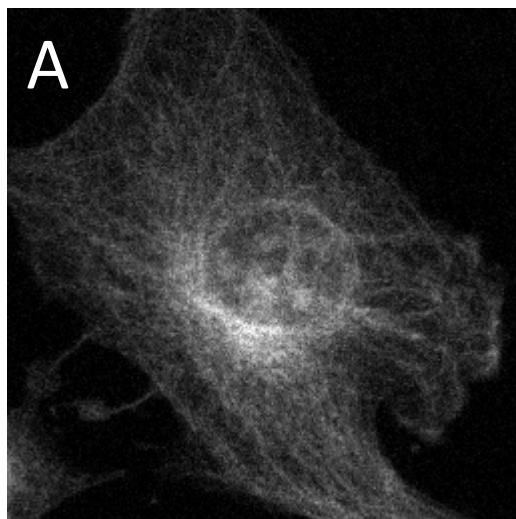
THREE IDENTICAL IMAGES?



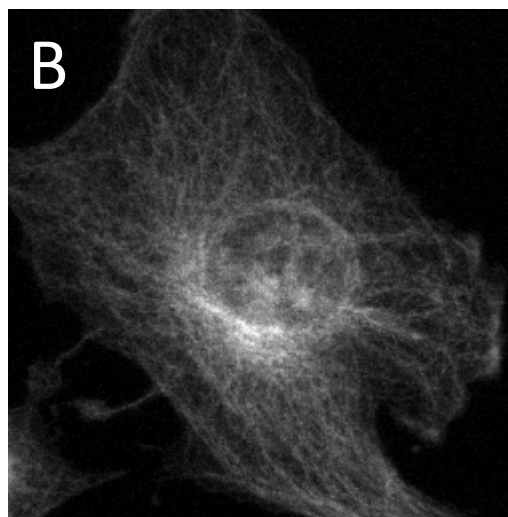
{1}

THREE IDENTICALLY DISPLAYED IMAGES!

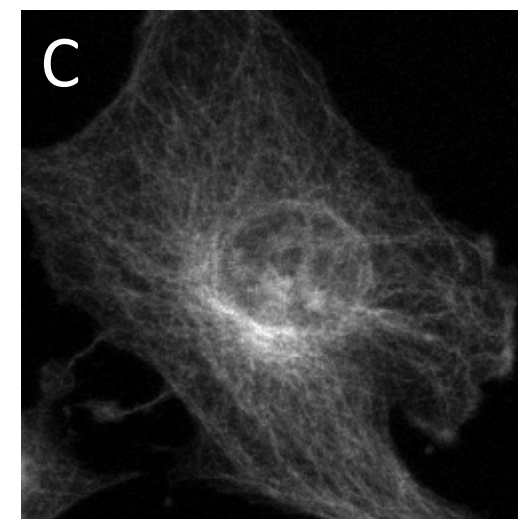
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200 photons



500 photons



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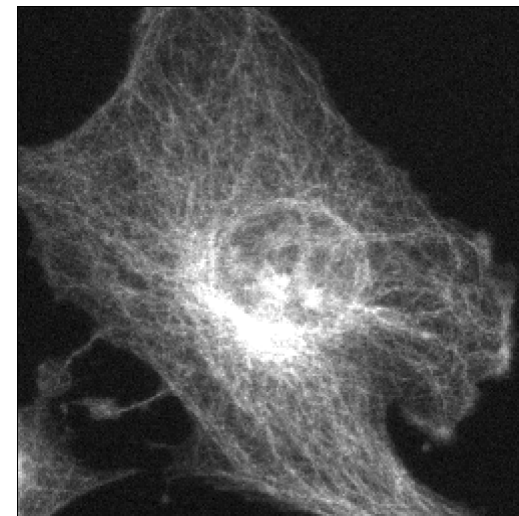
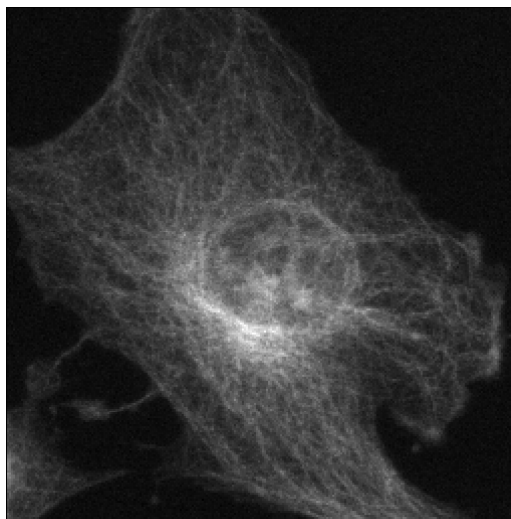
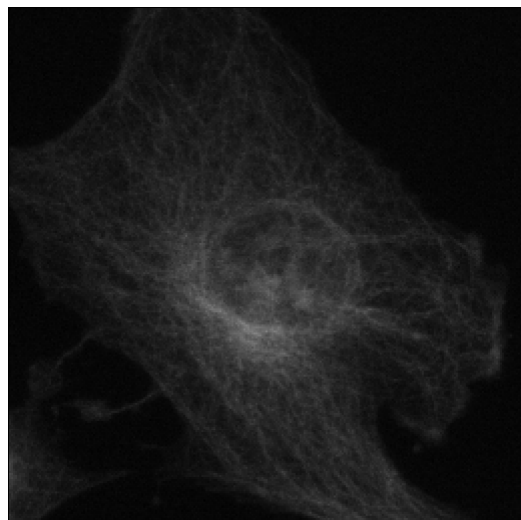
1000 photons



{1}

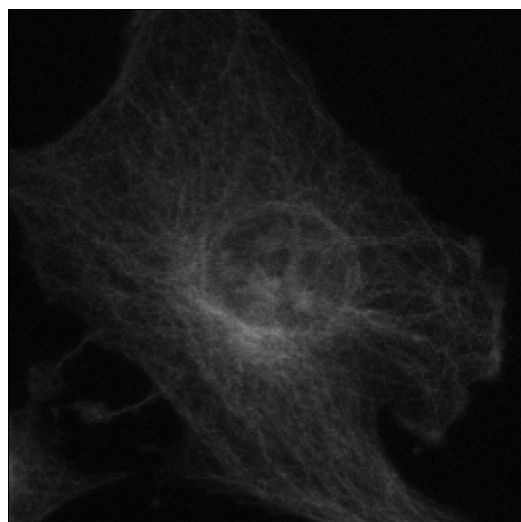
## THREE DIFFERENT INTENSITIES?

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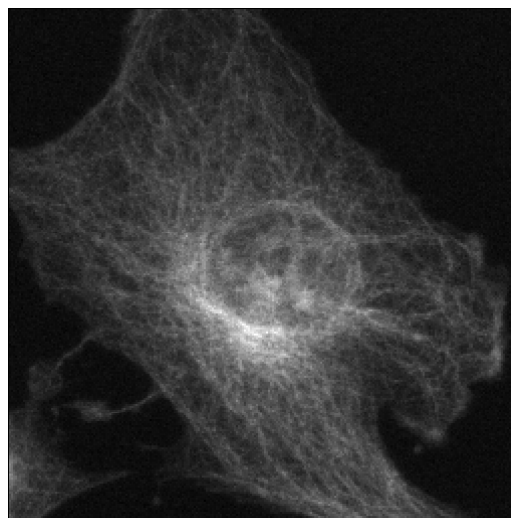


# {1} THREE DIFFERENT DISPLAYS OF THE SAME INTENSITY!

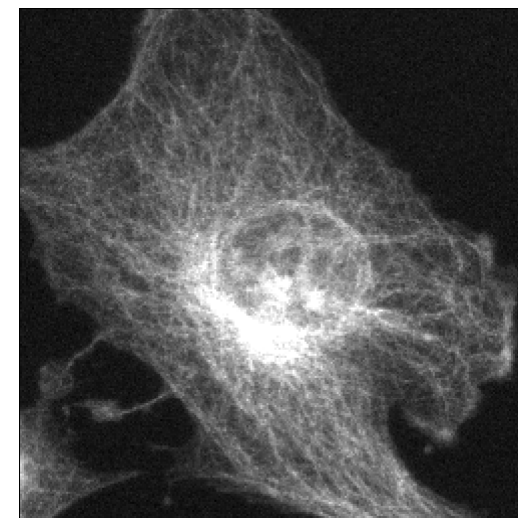
---



**1000 photons**



**1000 photons**

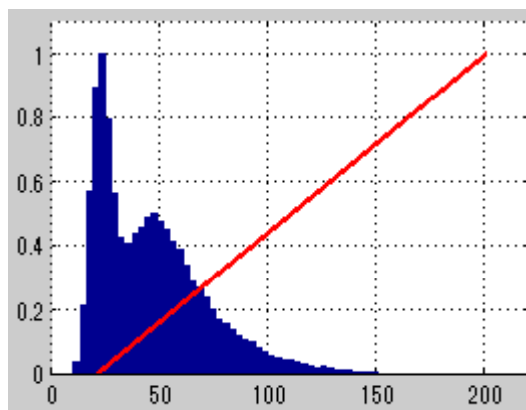
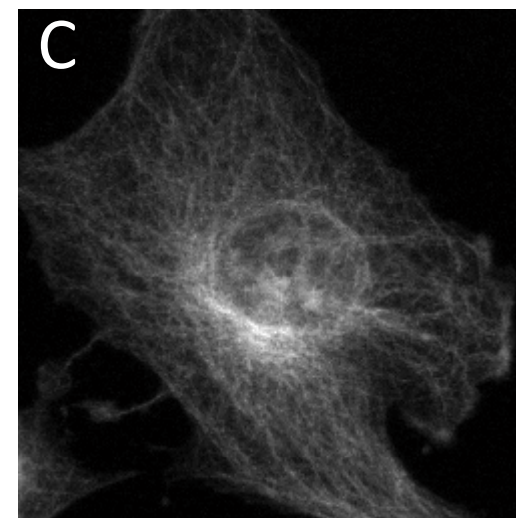
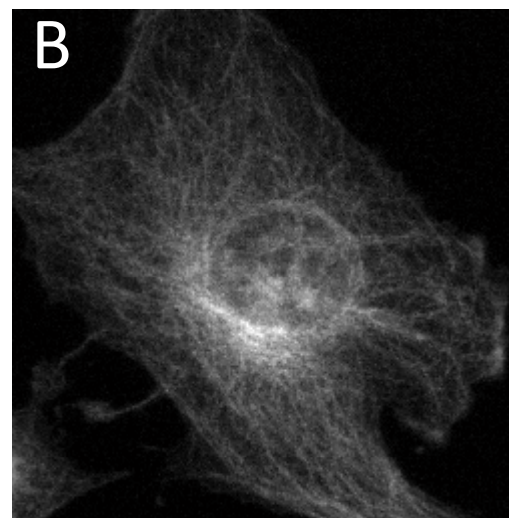
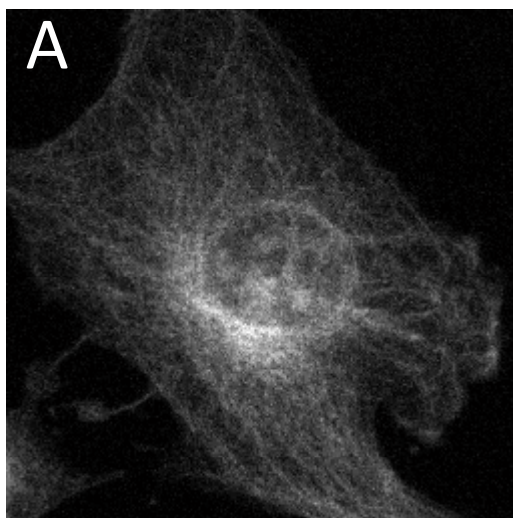


**1000 photons**

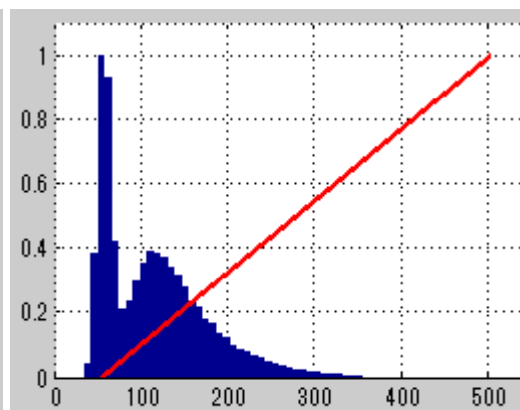
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{1}

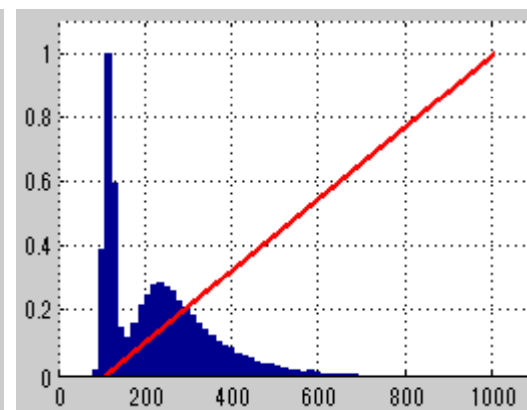
# HISTOGRAM AND AREA STATISTICS



Peak (photons) 200  
Mean (photons) 47.0



500  
117.4



1000  
234.7

# Choosing and Using **Scientific** Cameras

---

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-

{2}

## THINKING IN PHOTONS

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Is  
THINKING IN  
PHOTONS  
REALLY  
NECESSARY?

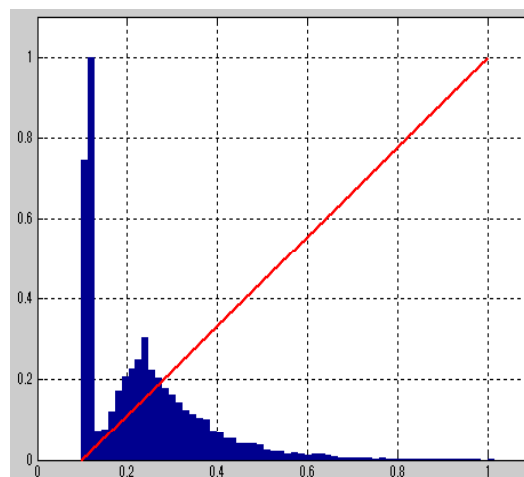
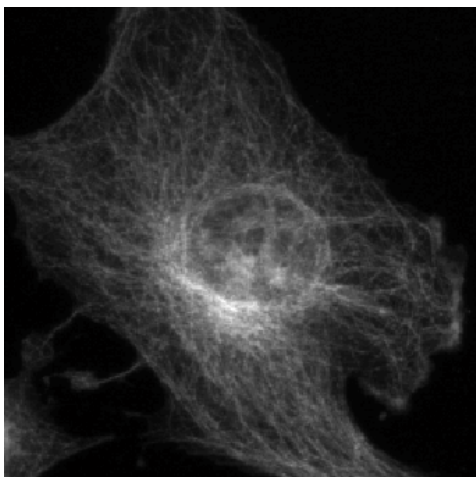
- Aren't ADU's or grey levels good enough?

SCIENTIFIC CAMERAS SHOULD MEASURE **PHOTONS**

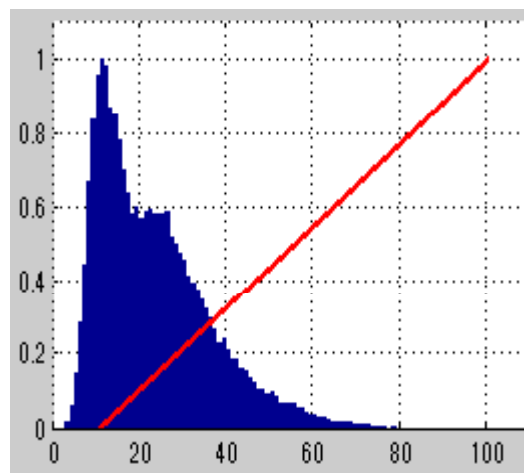
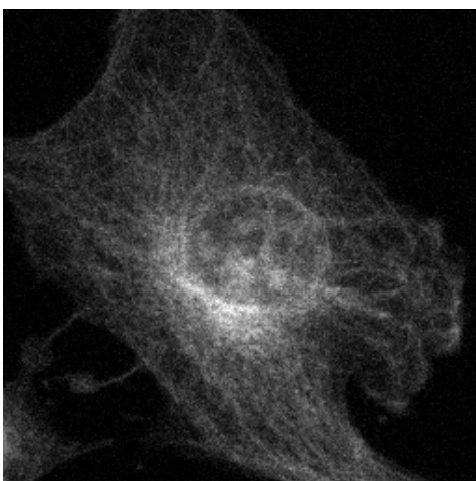
---

{2}

## PHOTONS REALLY MATTER



**Truth**



**100 photons peak**

Looks similar, but

- The histogram is different
- Information is different
- Quantification different
- Lower image contrast

Perfect camera

Background = Peak/10

{2}

REMEMBER SHOT NOISE

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$$N_S = \sqrt{S}$$

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# {2}

## THINKING IN PHOTONS

WHAT'S  
LIMITING  
MY  
SCIENCE?

- The information in an image is limited by the number of photons.
- A perfect camera does **not** produce a perfect image, especially if photons are limited.
- The minimum number of photons **needed** depends upon the object imaged, resolution and measurement requirements (i.e. your experiment).



{2}

## PHOTONS REALLY MATTER

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ARE YOU  
CONVINCED?

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-

{3}

## REAL CAMERAS: THINKING IN PHOTONS

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HOW  
DOES THIS  
MAKE ME  
A **BETTER**  
MICROSCOPIST?

- Makes comparisons among cameras meaningful. (ADUs are arbitrary)
  - Brings relevance to your data.
  - Knowing the number of photons and contrast in sample is key to picking the correct camera.
-

{ 3 }

## REAL CAMERAS

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Is  
THINKING IN  
PHOTONS  
REALLY  
NECESSARY?

- Can't we figure everything out from a camera specs (QE and electronic specs)?

[Hint: Maybe, but there's a better way]

SCIENTIFIC CAMERAS SHOULD MEASURE **PHOTONS**

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# {3} REAL CAMERAS ARE **NOT** PERFECT

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THE  
WHAT  
AND  
HOW

- The Gap
  - Electron multiplying CCDs (EMCCDs)
  - Simulations comparing perfect to product by spec
  - All pixels are not created equal
  - Actual product measurements
  - Camera noise & visualization
-

Why is a  
camera manufacturer  
*proclaiming*  
that  
cameras are not perfect?

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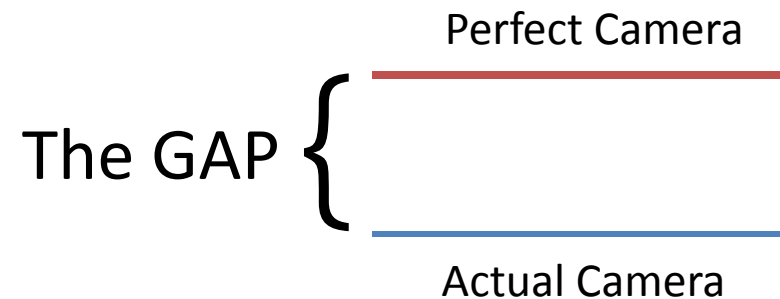
Because NO camera is perfect  
&  
Because understanding why  
**matters** to your science

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# {3} WHAT IS THE GAP?

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The difference between the performance of an actual camera and a theoretically perfect camera





## { 3 } UNDERSTANDING **WHY** THERE IS A GAP ENABLES:

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- Appropriate camera selection
- Optimized camera usage
- Optimized experimental design
- More reliable data analysis



**Better  
Results**

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# {3} THE GAP DEPENDS ON:

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1. Sensor technology {
    - CCD
    - EMCCD
    - sCMOS
  
  2. Camera specs {
    - Quantum Efficiency
    - Camera Noise
      - Read noise
      - Excess noise
      - Photo-response non-uniformity (PRNU)
  
  3. Input photon level {
    - Ultra low light
    - Low Light
    - Intermediate
    - High
-

# { 3 } THE (HYPOTHETICAL) PERFECT CAMERA

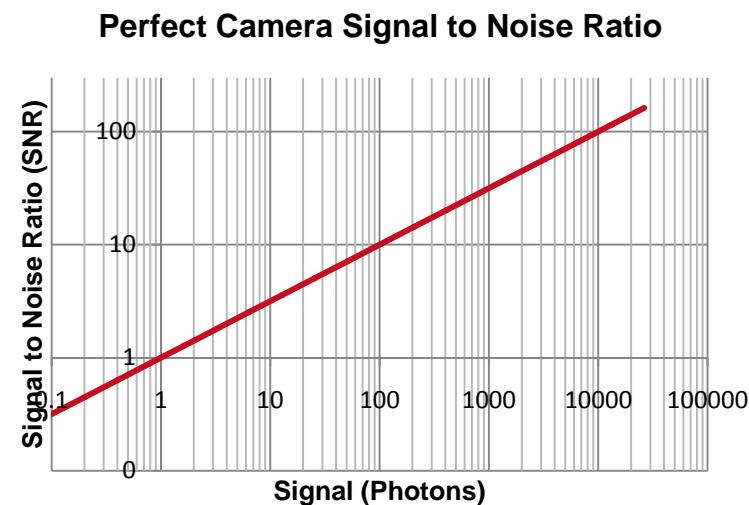
100% QE { Every photon is converted into one electron

0 e-read noise { Every electron is digitized exactly as expected every time

0% fixed pattern noise { Every pixel and amplifier perform identically and predictably

In a perfect camera, the SNR of a single pixel is limited only by the physics of photon statistics... i.e. shot noise.

$$SNR = \sqrt{S}$$



{ 3 }

## REAL CAMERAS ARE NOT PERFECT

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**ImagEM X2**  
EMCCD: Electron  
Multiplying CCD



**ORCA-Flash4.0 V2**  
Scientific CMOS  
Camera



**ORCA-R2**  
Cooled Interline CCD

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# {3} BASIC SPECS: COMPARED

	CCD	EMCCD	CMOS
Camera Name	ORCA-R2	ImagEM x2	ORCA Flash4.0 V2
QE (550 nm)	70 %	90 %	72 %
Read Noise Single Frame rms (e-)	6	< 0.5 (M = 200)	1.5
Full Well Capacity (e-)	18,000	Gain dependent	30,000
Dynamic Range	3000:1	Gain dependent	20,000:1
Bit Depth	16	16	16
Max pixel rate (Mps)	13	18	420
Pixel Size (μm)	6.45 x 6.45	16 x 16	6.5 x 6.5
Pixel Number	1024 x 1344	512 x 512	2048 x 2048

# { 3 } AMPLIFIERS

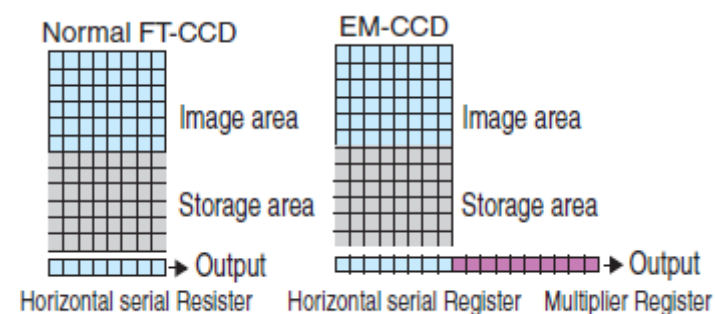
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Important  
differences

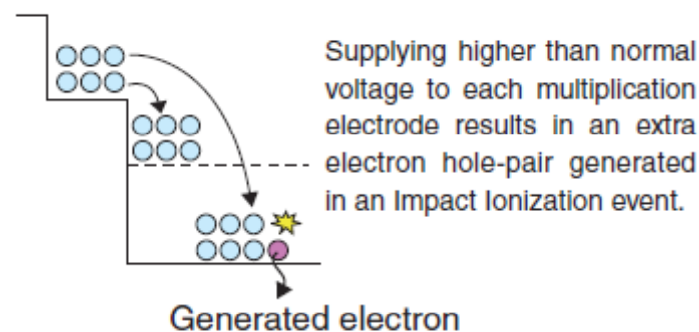
{ CCD and sCMOS  
EMCCD

# { 3 } ELECTRON MULTIPLYING CCDs (EMCCDs)

- A type of CCD: Frame transfer and **back-thinned** for increased QE
- Frame transfer requires  $\sim 100\mu\text{s}$
- Serial devices where each pixel's charge is read out one at a time
- High voltage gain register on sensor for on-chip amplification.
- Option to read out through EM circuitry or non-EM circuit (normal CCD mode)



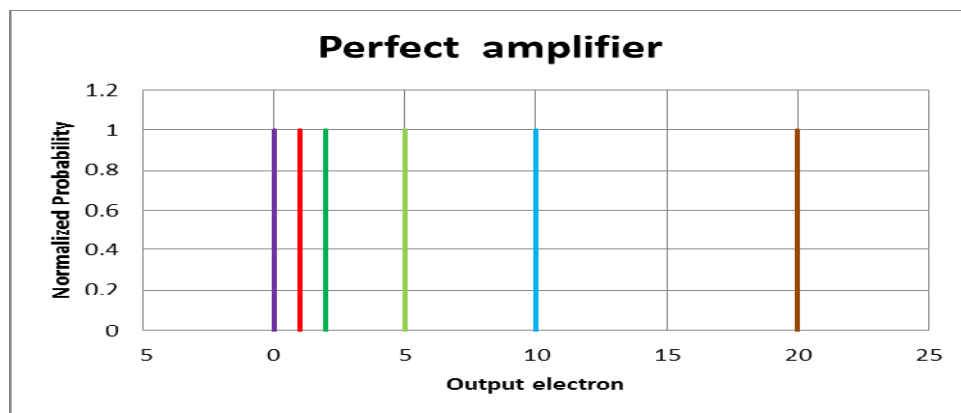
(b)



{ EMCCD architecture }

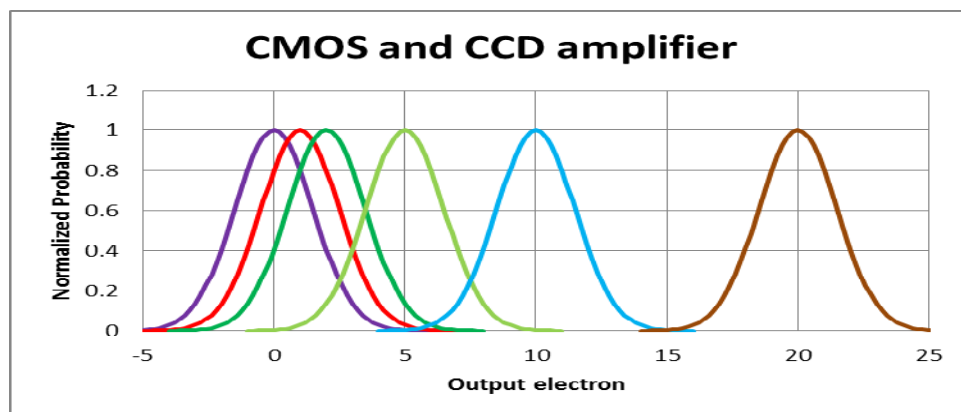
{ 3 }

## CMOS AND CCD AMPLIFIER NOISE



Output an exact multiple of the input

No noise broadening



Output is a multiple of the input

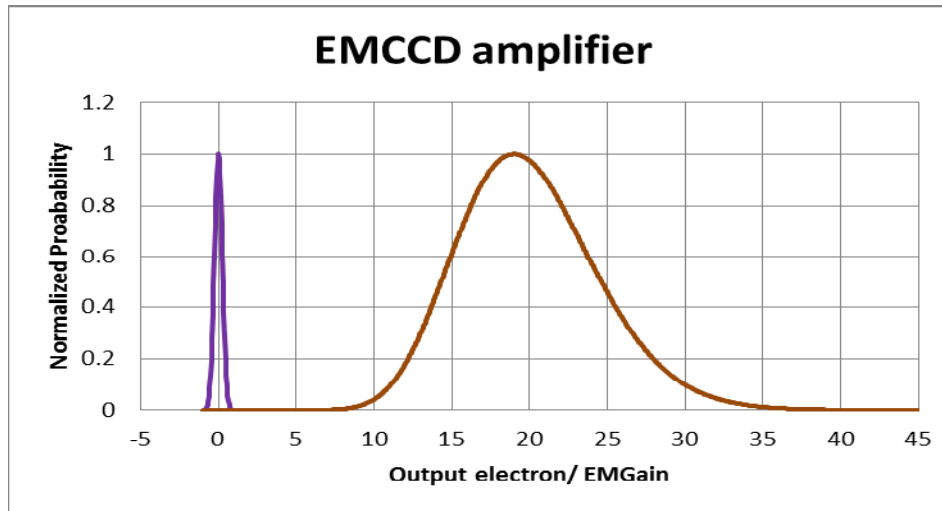
“Read noise” broadening

Width independent of signal level

CMOS read noise: 1.5 e- rms



# { 3 } EMCCD AMPLIFIER NOISE DEPENDS ON SIGNAL

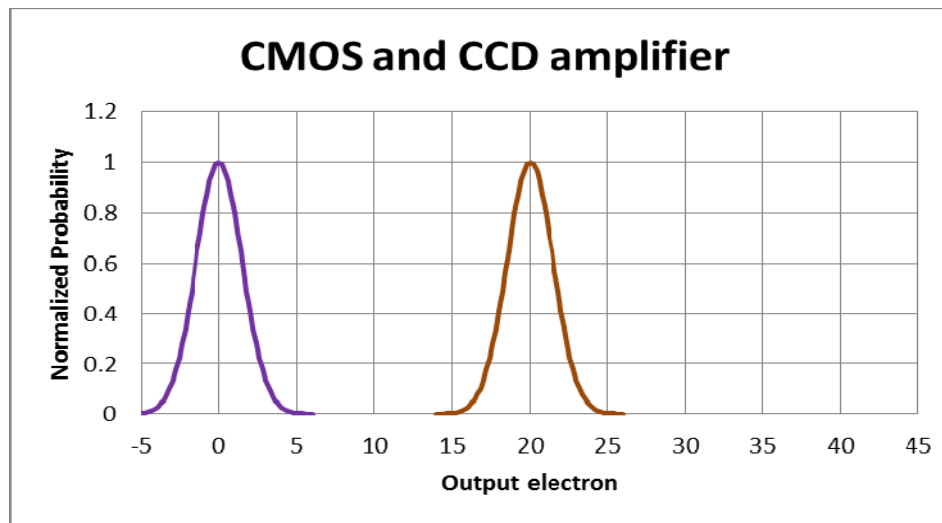


No electron:

- Very small noise
- beautiful blacks

Signal:

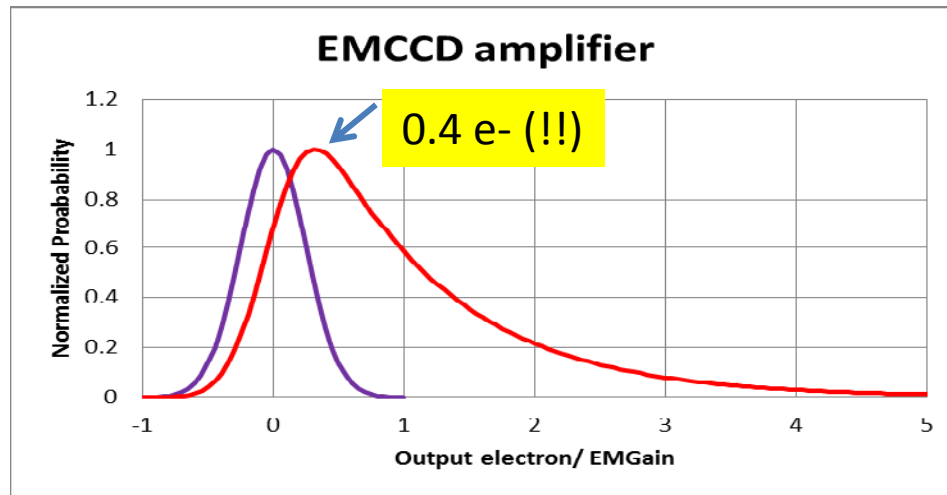
- Broad (excess noise)
- Long tail: larger **apparent** contrast



Signal independent

- No excess noise
- Short tail

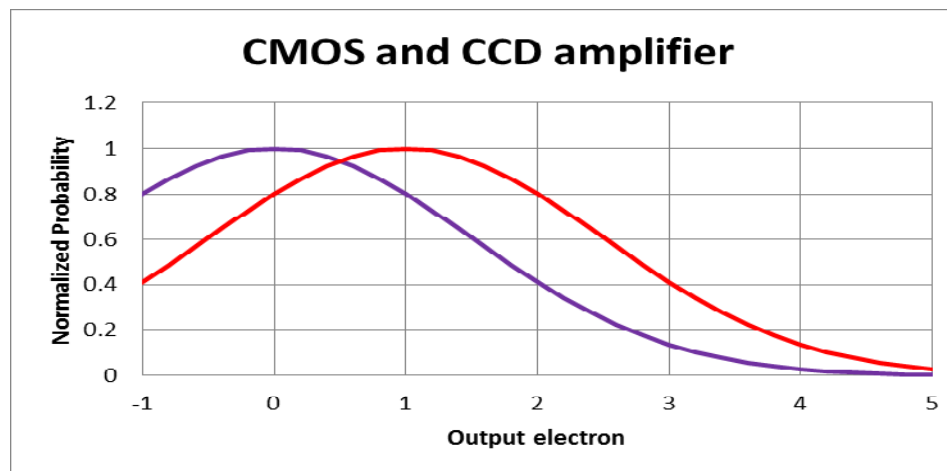
# { 3 } EMCCDs “DETECT” SINGLE PHOTONS, BUT



Peak of 1e- output is  $\sim 0.4e^-$ !

Signal < (some) noise

Long tail



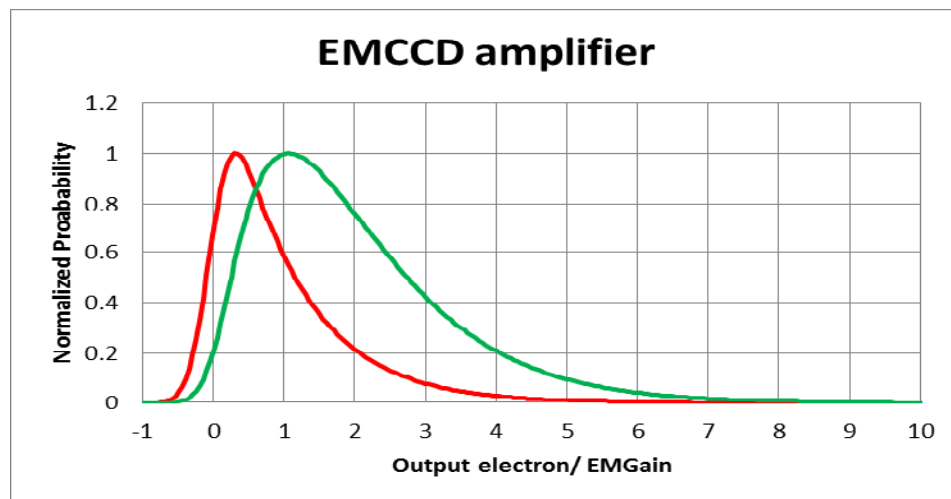
Symmetric distribution, with noise extending  $\sim \pm 2 \sigma$  (3 e-) from mean.

Significant overlap

Quantization of ADC not included

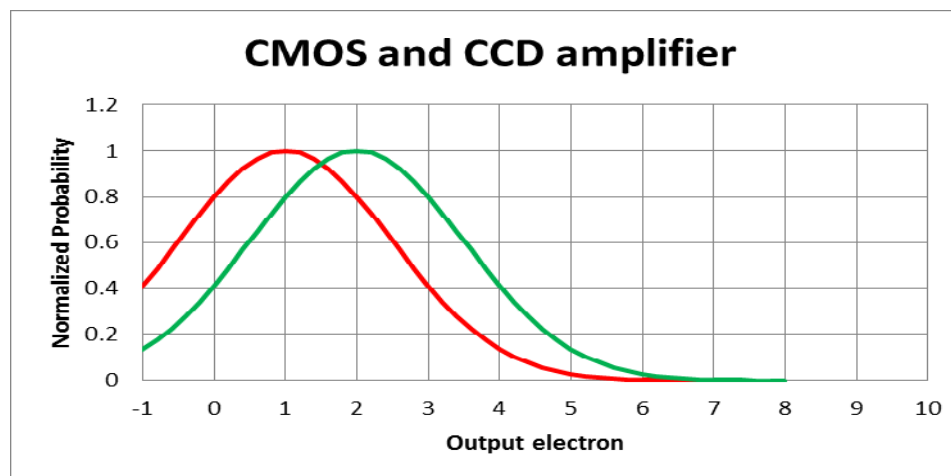
{ 3 }

## EMCCDs CAN'T COUNT



Outputs from  $1e^-$  and  $2e^-$  overlap.

Peak output of  $2e^-$  input is  $\sim 1e^-$

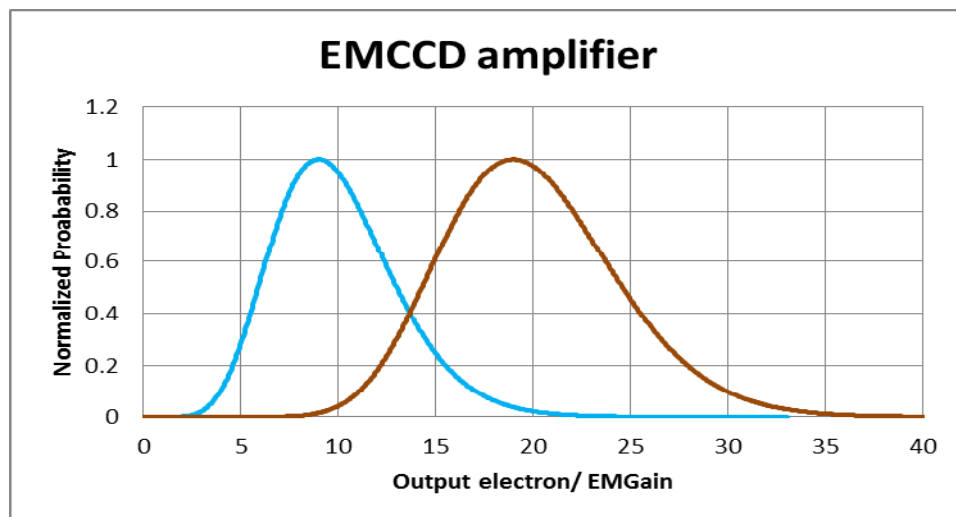


CMOS not so good either at very low light

$2e^-$  input, CMOS tail is shorter than EMCCD

# { 3 }

## EMCCD: SIGNAL DEPENDENT NOISE

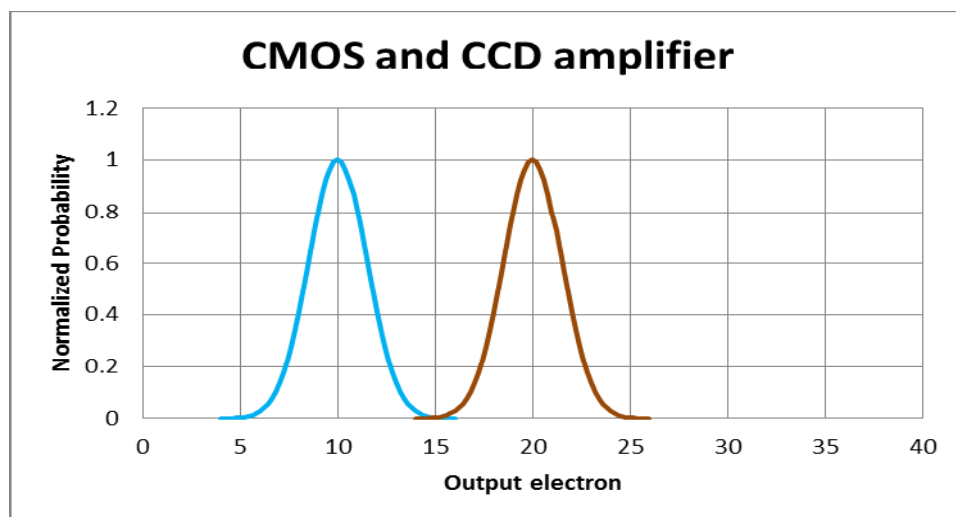


Most probable output < mean.

Very long tail

$\sigma^2 = \text{signal}$

Lots of overlap:  $10e^-$  &  $20e^-$



Most probable output = mean

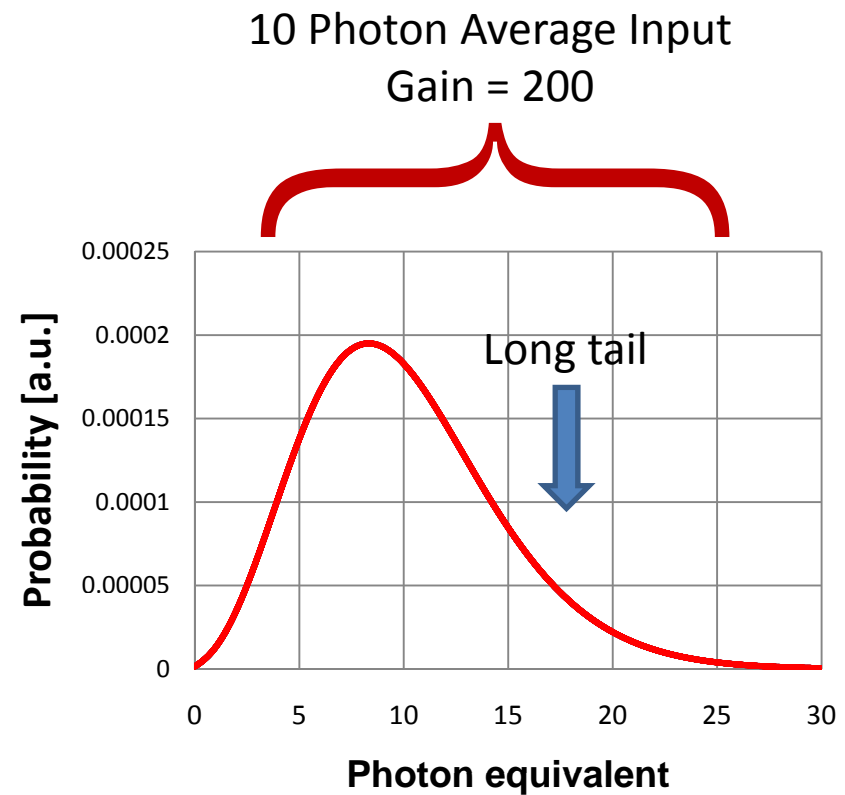
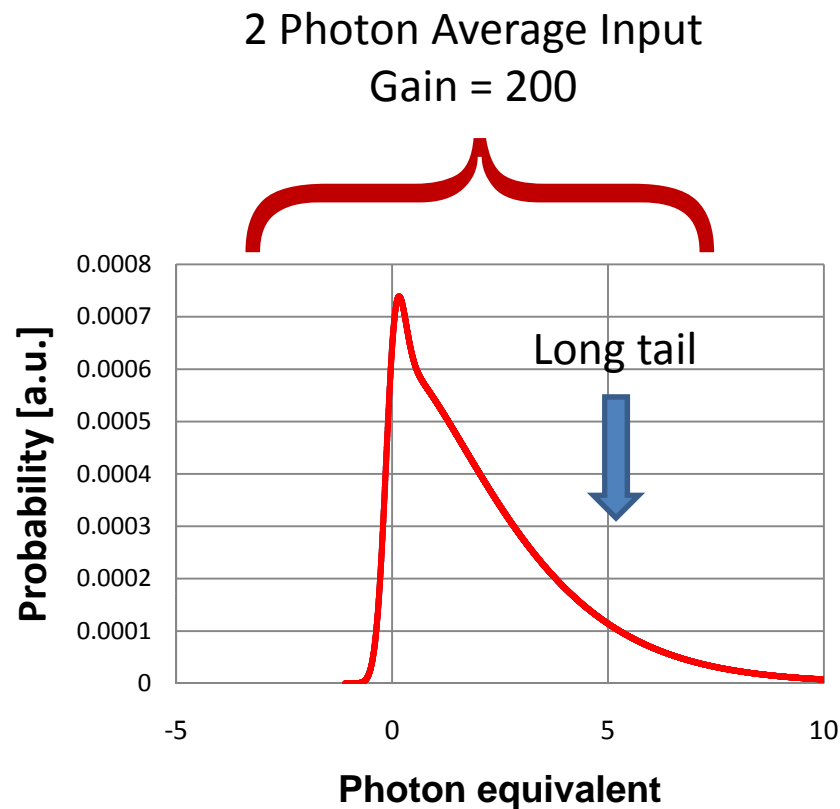
Short tail

$\sigma^2 = 1.5 e^-$

**CMOS clearly better**

# { 3 } EMCCD OUTPUT INCLUDING PHOTON SHOT NOISE

In simulated probability distribution functions for EMCCD, the output at high gain is **not** Poisson due to the electron multiplication process!



# { 3 }

## EMCCD vs. CMOS AMPLIFIERS

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- *Stochastic EM amplification:*
    - Very low noise without input
    - Excess noise effectively doubles photoelectron shot noise ( $F_n^2 = 2$ )
    - Asymmetric output distribution
      - At low light, peak output is much below mean
      - Long tail
  - **CMOS**
    - Noisier with no or very low input
    - Noise independent of signal
-

{3}

## ELECTRON MULTIPLYING CCDs

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Are they  
really what  
you  
thought?

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{ 3 }

## SIMPLE (PIXEL) SNR EQUATION

$$SNR = \frac{QE * S}{\sqrt{F_n^2 * QE * (S + I_b) + (N_r / M)^2}}$$

*Terms included:*

**QE:** Quantum Efficiency

**S:** Input Signal Photon Number (photon/pixel)

**F<sub>n</sub>:** Noise Factor

(= 1 for CCD/sCMOS and √2 for EM-CCD)

**N<sub>r</sub>:** Readout Noise

**M:** EM Gain (=1 for CCD / CMOS)

**I<sub>b</sub>:** Background

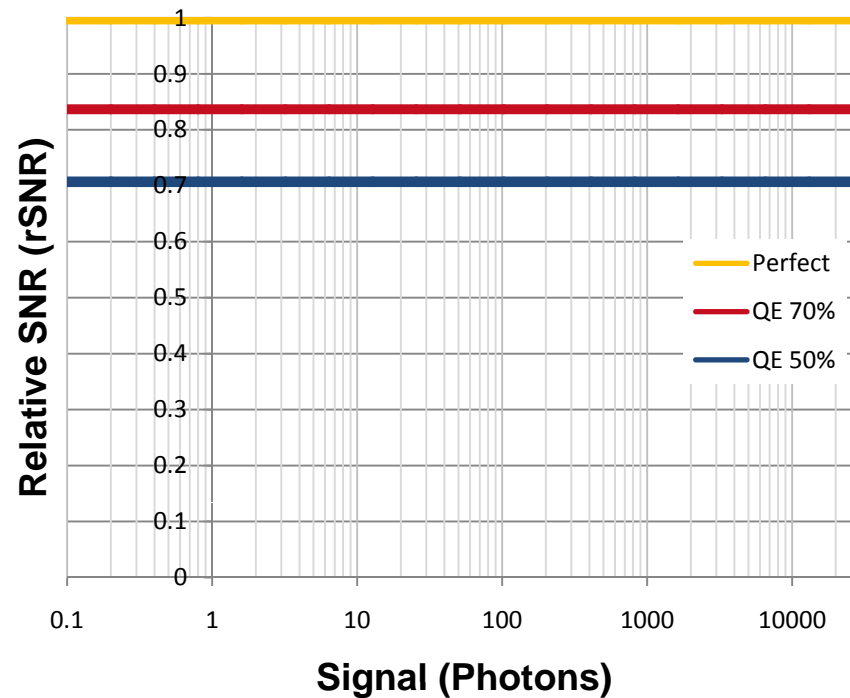
*Not included:*

**Dark Noise:** Dark current X time;  
considered negligible

**Photo response non uniformity:**  
necessary for *image* SNR



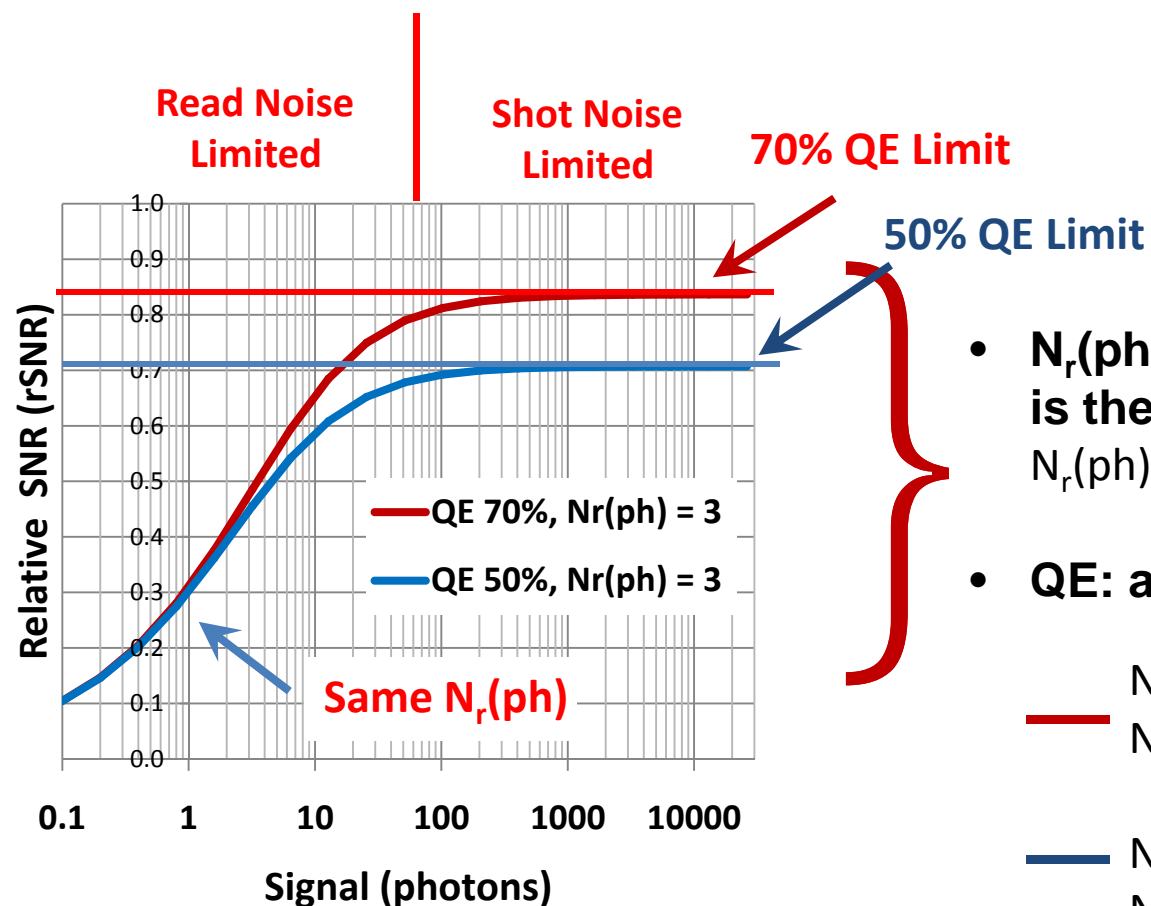
# { 3 } RELATIVE SNR: DISPLAYS IMPERFECTIONS PERFECTLY



rSNR is the SNR for a camera plotted relative to the perfect camera

rSNR shows differences among cameras over full range of signal level

# { 3 } READ NOISE REDUCES RSNR ONLY AT LOW LIGHT



- $N_r(\text{ph})$ : Read noise in **photons** is the key low light parameter  
 $N_r(\text{ph}) = N_r(e^-)/\text{QE}$

- **QE: always important**

—  $N_r(e^-) = 2.1 e^-$   
 $N_r(\text{ph}) = 3$

—  $N_r(e^-) = 1.5 e^-$   
 $N_r(\text{ph}) = 3$

# { 3 } EMCCDs: EXCESS NOISE CREATES A GAP

SNR for CCD / CMOS



$$SNR = \frac{QE \times P}{\sqrt{QE \times P}}$$

$$= \sqrt{QE \times P}$$

SNR for EM-CCD



$$SNR = \frac{M \times QE \times P}{F_n \times M \times \sqrt{QE \times P}} = \sqrt{\frac{QE \times P}{F_n^2}}$$

$$= \sqrt{QE_{eff} \times P}$$

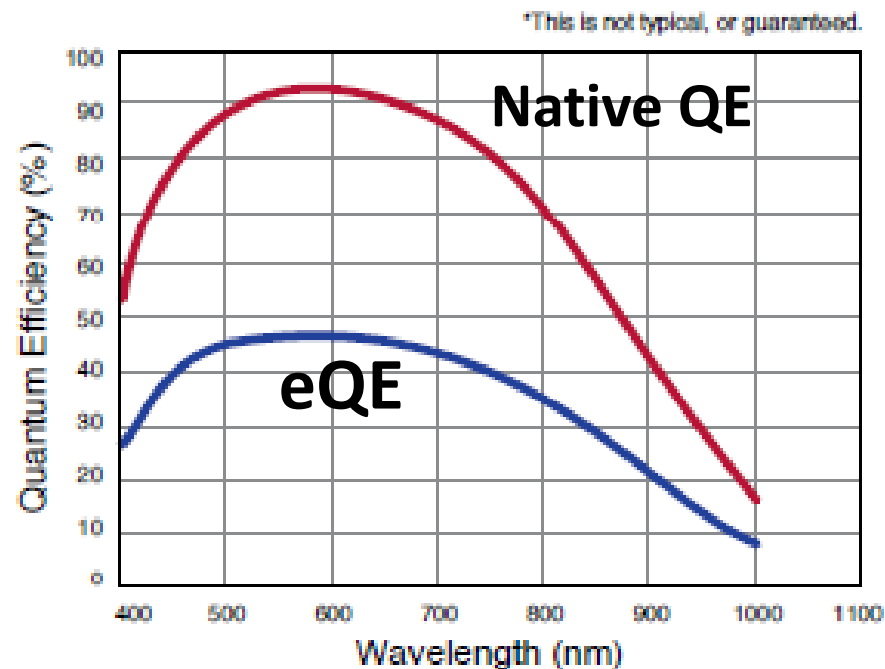
$$QE_{eff} = \frac{QE}{F_n^2} = \frac{QE}{2}$$

QE: Quantum Efficiency,  
P: Input Signal Photon Number,  
M: EM Gain  
 $F_n$ : Noise Factor  
(assumes dark current and read noise are negligible)

# { 3 }

## EMCCDs

- Stochastic EM amplification **adds excess noise**
- Excess noise effectively lowers the SNR to a detector with  $\frac{1}{2}$  **the QE**

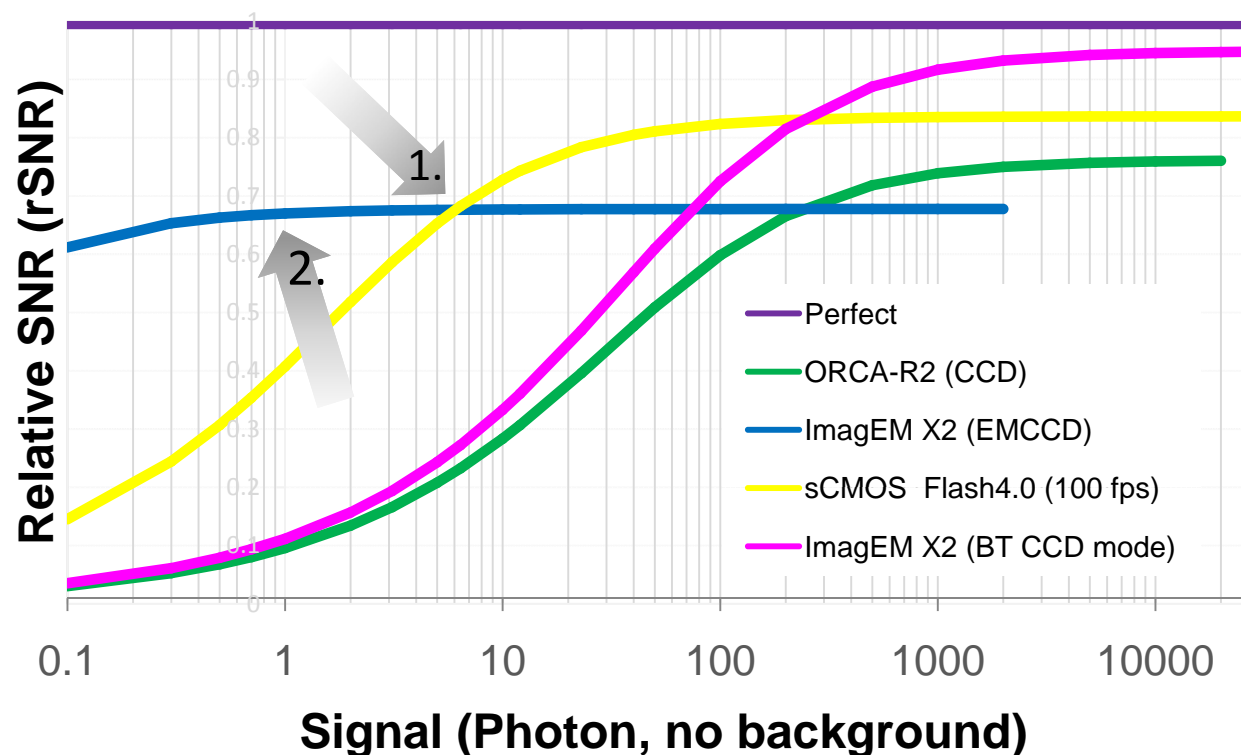


{ Effective QE in EMCCDs }

# { 3 } MIND THE GAP: PREDICTED PIXEL rSNR PERFORMANCE FOR COMMON CAMERAS

1. { A camera with the highest SNR at the lowest light level may not be the best at higher light levels

2. { The SNR of an EMCCD above 1 electron/pixel is comparable to a camera with  $QE_{\text{eff}} = QE/2$  due to excess noise from EM gain.



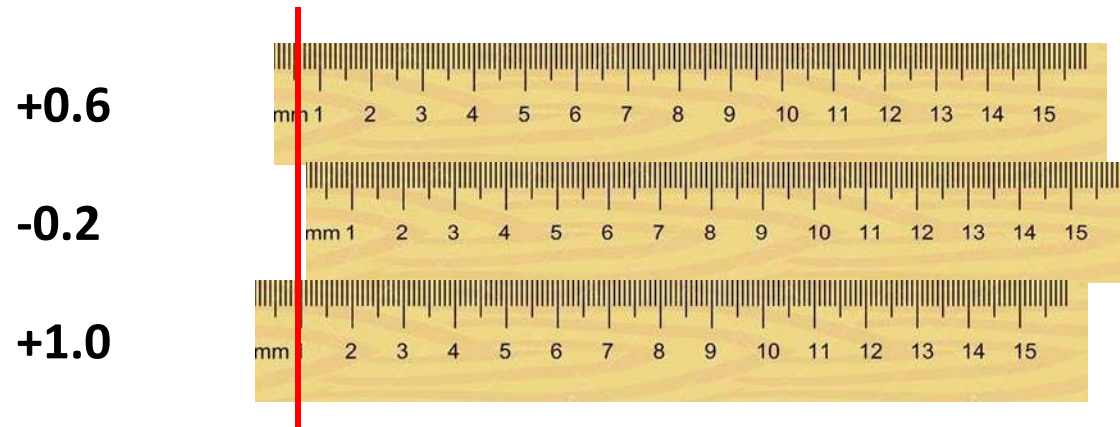
# ARE ALL PIXELS THE SAME?



- Offset non-uniformity
- Photo response non-uniformity (PRNU)
- Dark signal non-uniformity (DSNU)
- Read noise distribution

# { 3 } ACCURATE MEASUREMENT OF THE NUMBER OF PHOTONS OFFSET NON-UNIFORMITY

Pixel to pixel variation of readings in the dark



If the **zero is incorrect**, then **absolute measurement is also incorrect**.

- Most noticeable in dark or low light conditions.
- Usually expressed as DN or e-, rms.
- For scientific cameras, should be less than read noise.

# { 3 } ACCURATE **MEASUREMENT** OF THE NUMBER OF **PHOTONS**

## PHOTO RESPONSE NON-UNIFORMITY

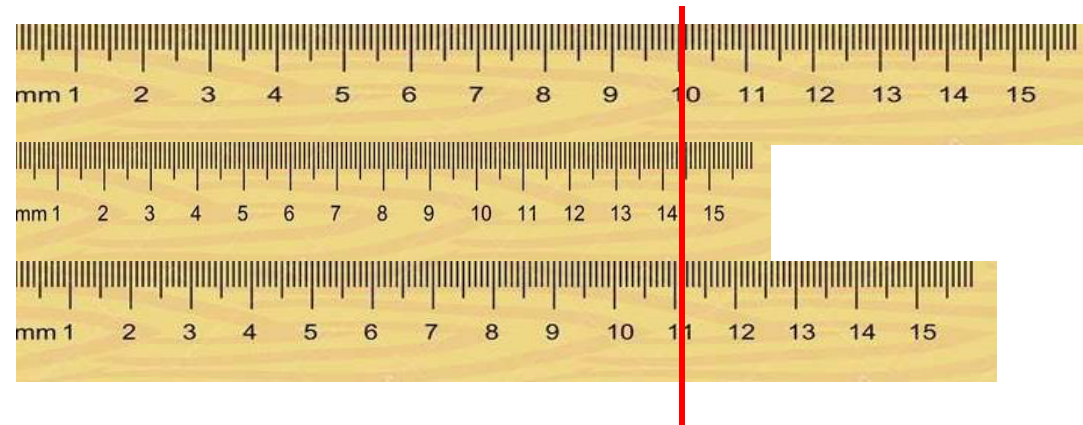
**PRNU:** pixel to pixel variation of the response to light (DN / photon)

- QE variation : conversion rate of photon to  $e^-$   
(may be spectrum dependent)
- Electronic gain variation: Conversion factor from  $e^-$  to DN

**-15%**

**+22%**

**-6.5%**



Mean: 11.9

If the **unit length incorrect**, then **absolute measurement is also incorrect**.

- Most noticeable in higher light conditions.
- May have spatial pattern, stable over time.
- Usually expressed as % maximum.



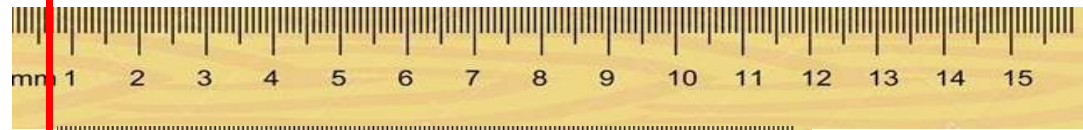
# { 3 } ACCURATE MEASUREMENT OF THE NUMBER OF PHOTONS

## TOTAL FIXED PATTERN NOISE

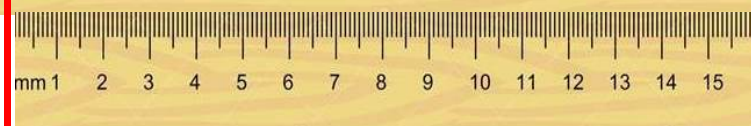
Total **pixel-to-pixel variation** in the **accuracy** of the measurement of the number of photons. Includes

- Offset non-uniformity
- Photo-response non-uniformity

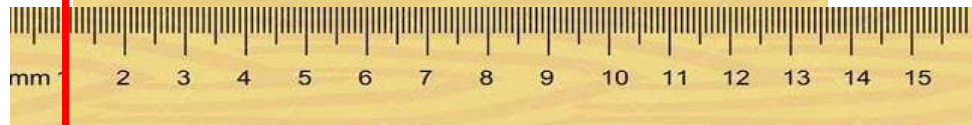
**-15%**



**+22%**



**-6.5%**



Overall specification of the non-uniformity measurement across the image sensor

Does not include:

- Errors in average QE
- Temporal noise (excess noise, read noise)
- Dark current and dark current shot

# { 3 } DARK SIGNAL NON-UNIFORMITY (DSNU)

Pixel-to-pixel **variation** in **dark current**

Offset : dark signal x exposure time.

Noise :  $\sqrt{(\text{offset in e-})}$

**How big?**



- Proportional to **exposure time**.
- Can **be >100 e- / sec** for a few pixels, especially for sensors > 0C
- For a given image sensor, a multiple of average dark current
- Doubles for each ~8C increase in **sensor temperature**
- Higher noise for high dark current pixels due to **dark shot noise**.

**Which technologies?**



- Mainly sCMOS

**Correction**

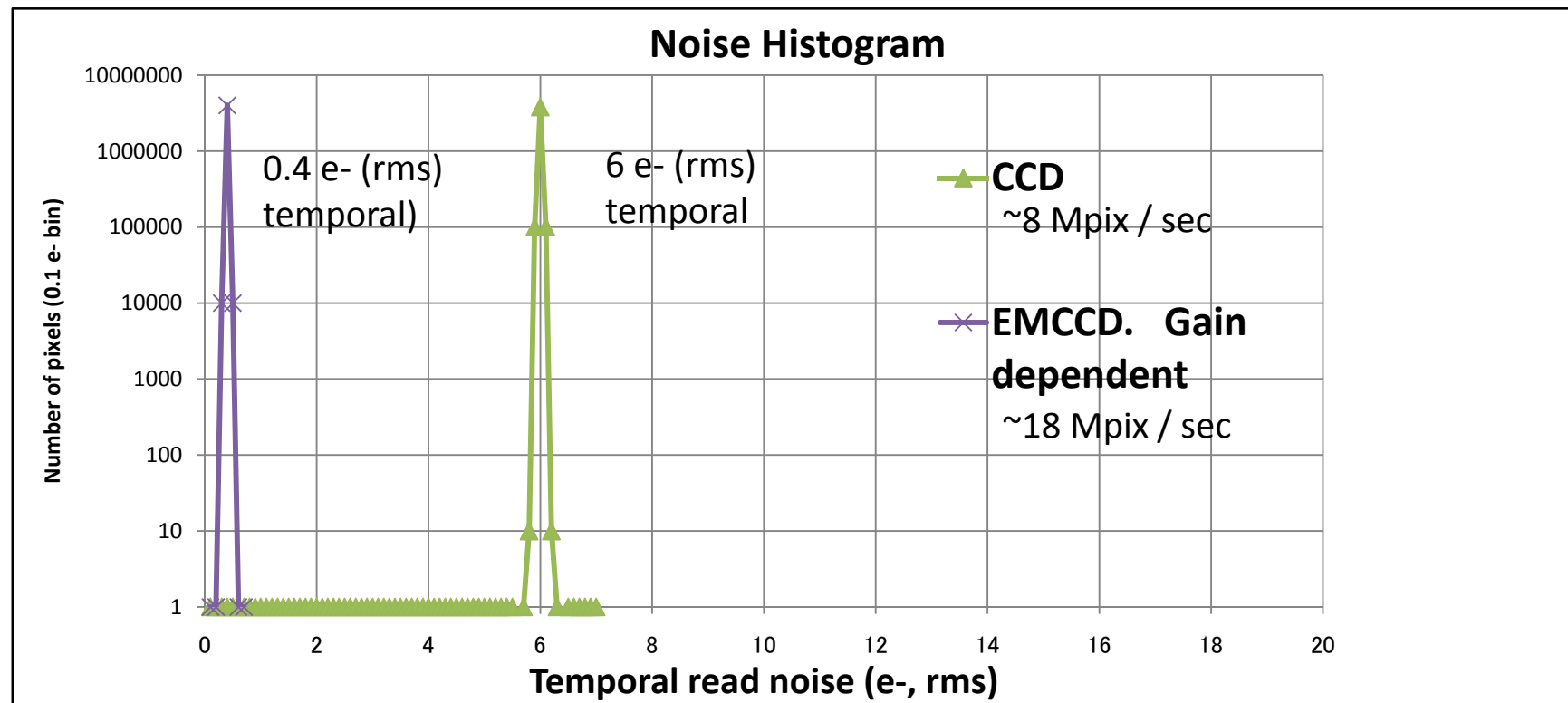


- Identify high noise pixels and correct in image
- Dark shot noise can NOT be corrected.

# { 3 } READ NOISE UNIFORMITY: CCD & EMCCD

**CCDs and EMCCDs:** All pixels are readout through the same amplifier and digitization circuits and therefore read noise is **very uniform**.

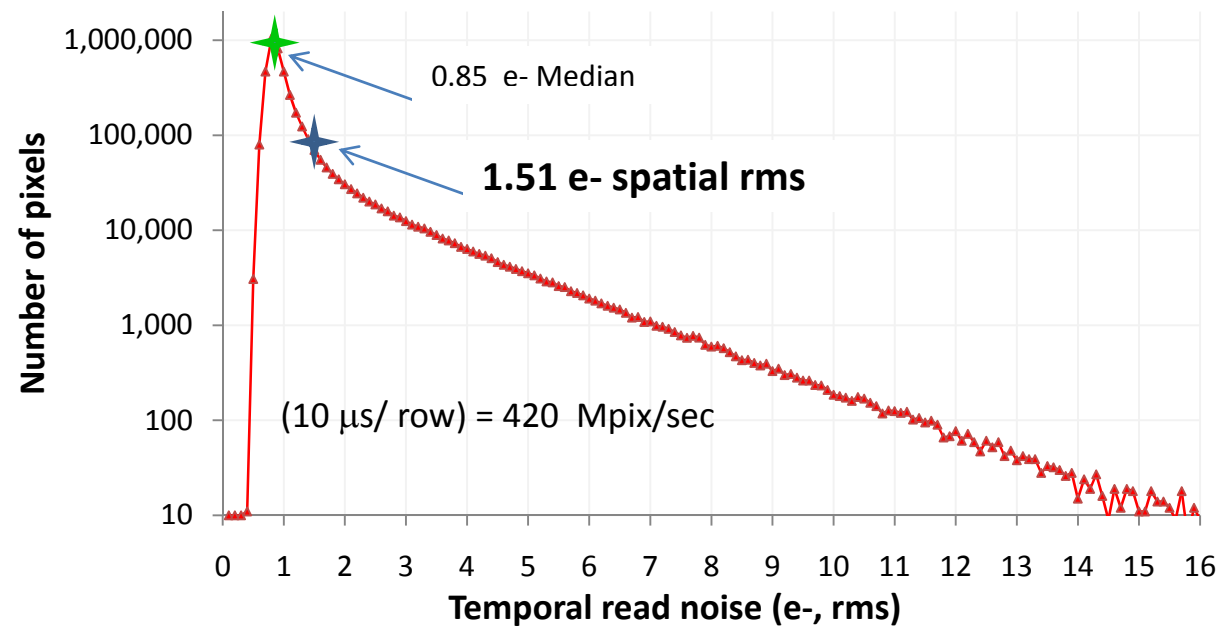
Median = spatial rms



# { 3 }

## READ NOISE UNIFORMITY: CMOS

**CMOS:** Each pixel has an independent amplifier and each column has an independent amplifier. Read noise is pixel dependent  
“Median” < spatial rms.



# { 3 }

## READ NOISE

---

- **CCDs:** Uniform, readout speed dependent, relatively high.
- **EMCCDs:** Uniform, gain and readout speed dependent, very low with EM gain  $> \sim 50$ , but relatively high in “normal CCD” mode.
- **sCMOS:** pixel dependent, little dependence on readout speed for a particular camera.

**Things to  
keep in  
mind**

# MEASURING THE REAL GAP



An in-depth look at noise in  
CCD, EMCCD and CMOS  
cameras

# { 3 } A CLEARER WAY TO COMBINE CAMERA SPECIFICATIONS

---

- **Single Frame rSNR**

Summarizes whole sensor performance

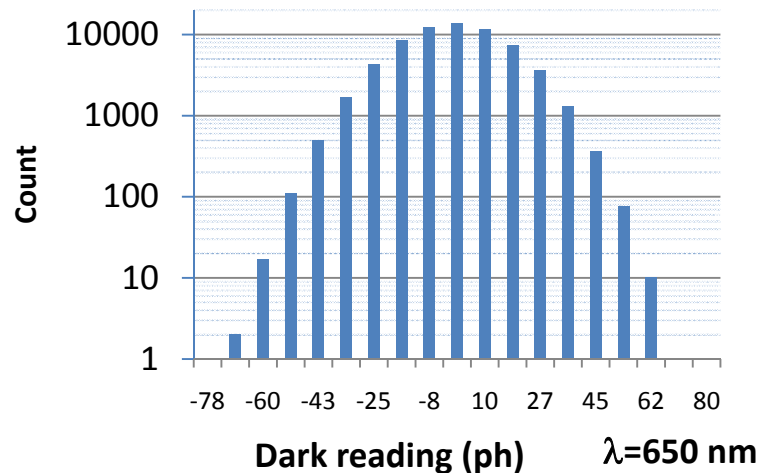
- QE
  - Gain
  - Noise: including spatial rms read noise, excess noise, dark shot noise
  - Fixed pattern noises, including offset non-uniformity and PRNU
  - Saturation
-

# { 3 } ORCA-R2 INTERLINE CCD: PREDICTABLE AND ROBUST

1. { PRNU is insignificant
2. { Single frame read noise histogram has a Gaussian distribution

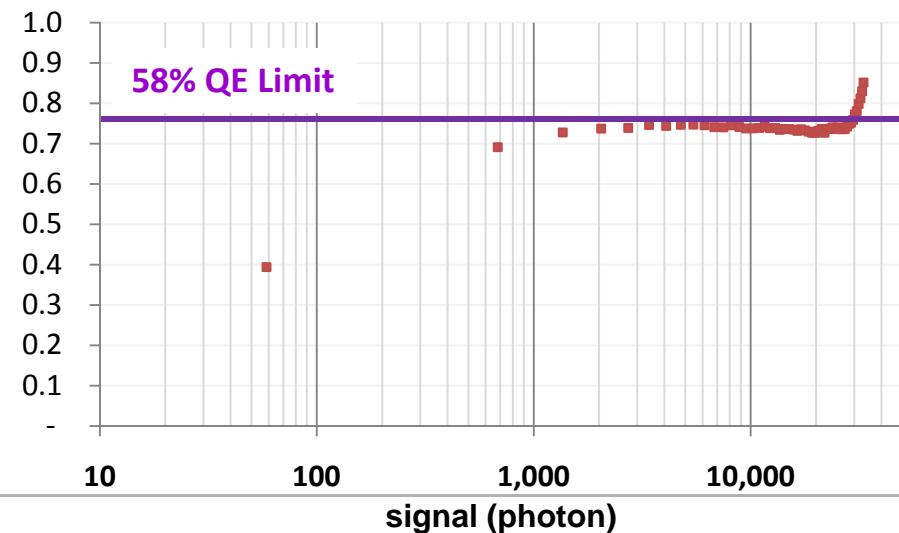
**Bright Image:**  
shot noise limited

Mean intensity: 17,300 e-  
 $\sigma$ : 130.5e-  
PRNU: not measurable



Read Noise  
( $N_r/QE$ )

Shot Noise  
& QE

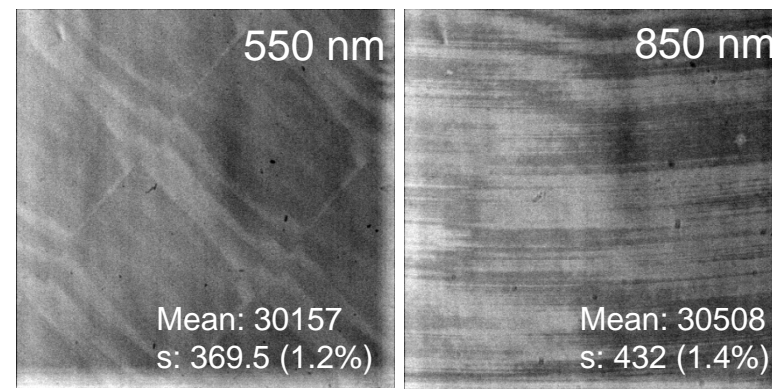




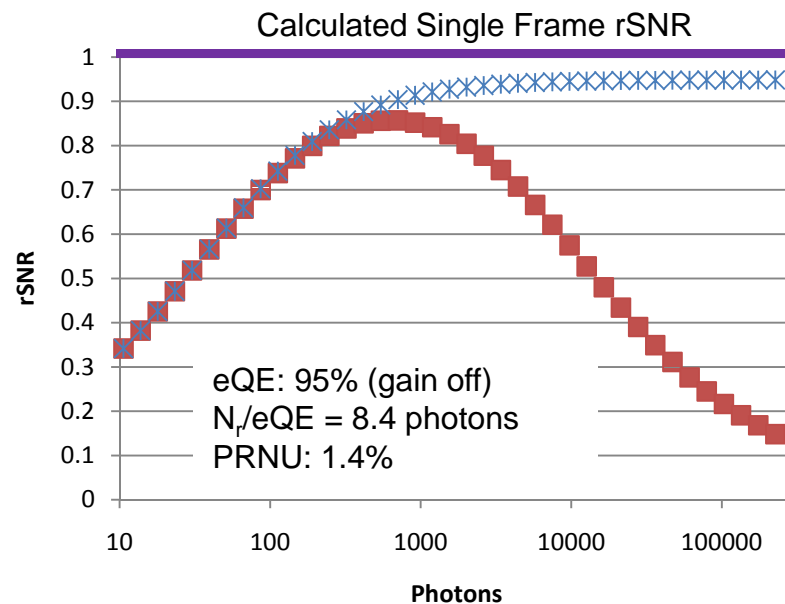
# { 3 } EMCCD: SOME SURPRISING RESULTS

## 1. { Thickness variations from back-thinning process causes **spectrally-dependent** PRNU

- Cannot be removed during manufacturing
- Must be calibrated by users for *their specific spectrum*.
- Individual pixel map required for correction



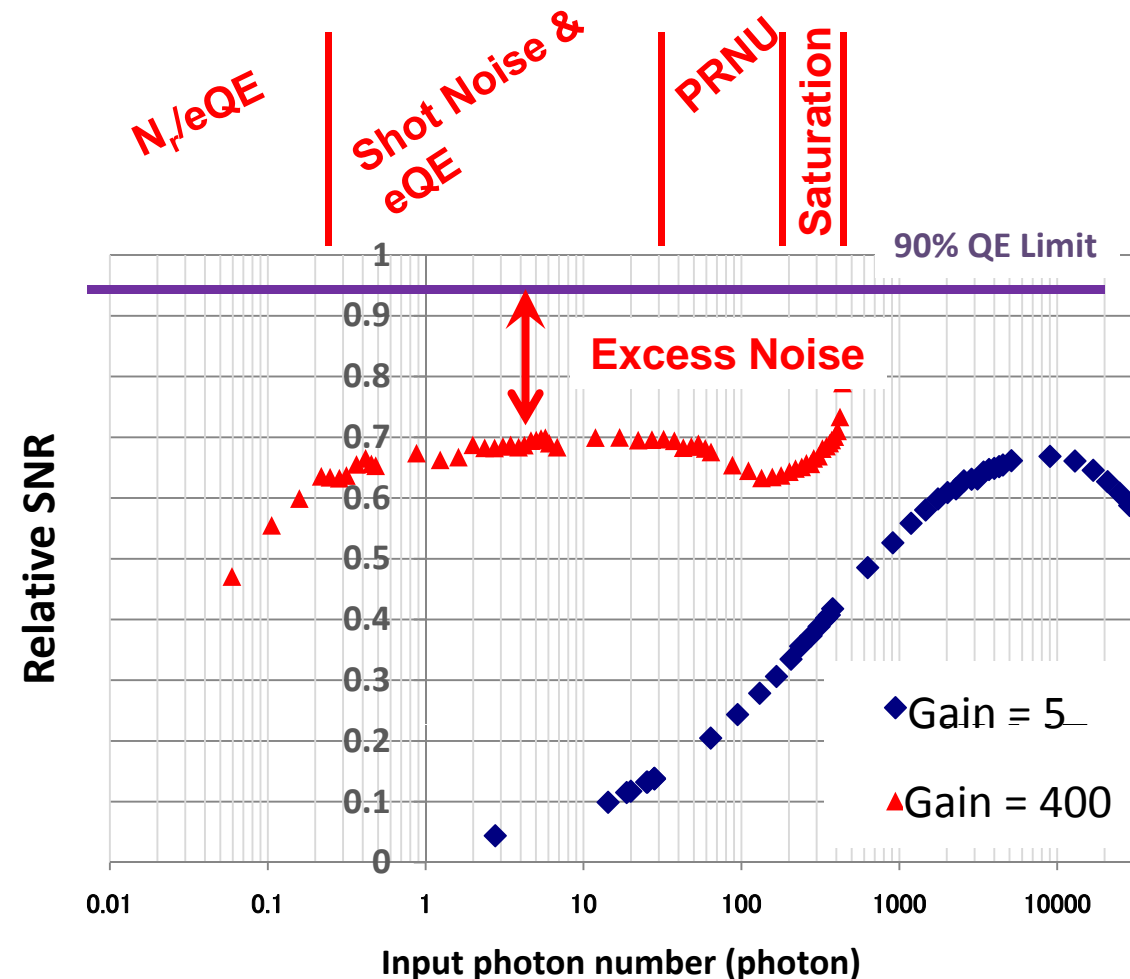
## 2. { The Gap for EMCCD in CCD mode becomes very wide due to PRNU



# { 3 } COMPLEX BEHAVIOR: A CLOSER LOOK AT EMCCD SNR WITH HIGH AND LOW GAIN

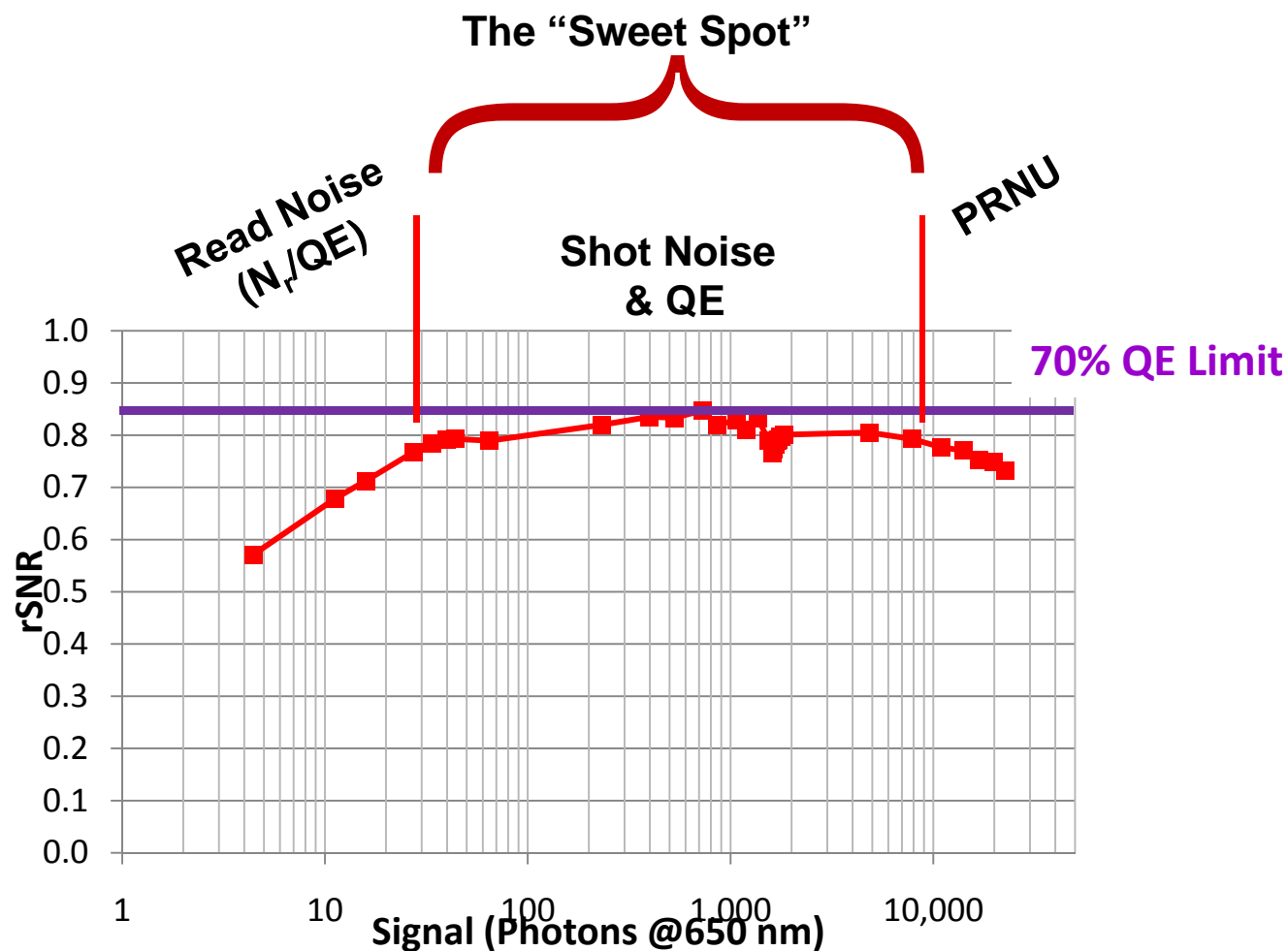
## Complex Behavior

- Excess noise (eQE)
- PRNU
- Saturation
- High read noise  
(34 e<sup>-</sup> @ M=5, 70 fps)
- Gain hard to measure



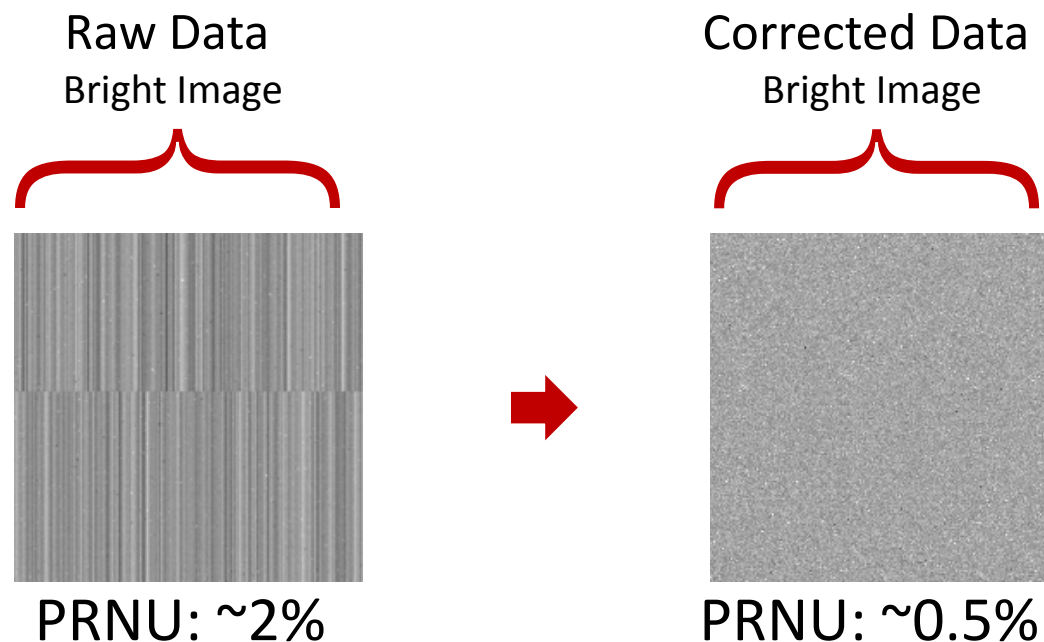
{ 3 }

## ORCA-FLASH4.0 V2 (sCMOS): A VERY COMFORTABLE SWEET SPOT



{ 3 }

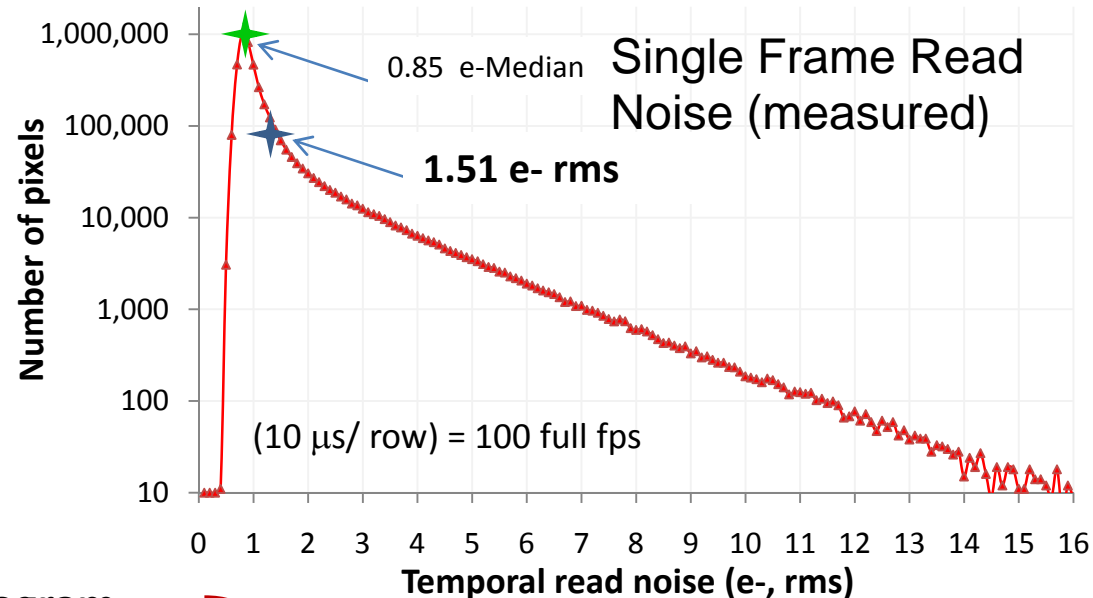
## THE IMAGE SENSOR IS **NOT** THE CAMERA: PRNU IS SIGNIFICANT IN “SCIENTIFIC” CMOS IMAGE SENSORS



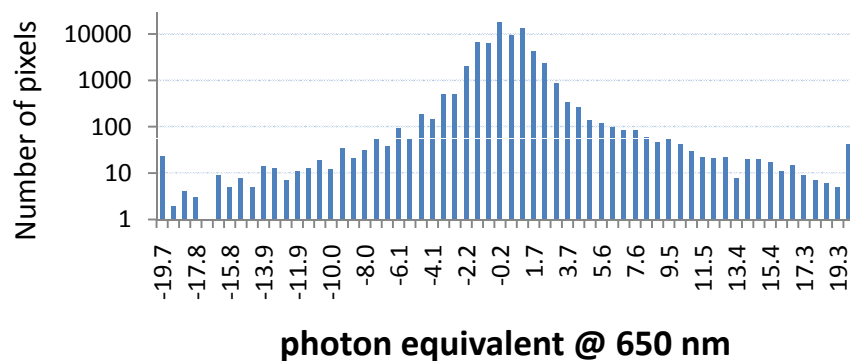
Signal amplified and digitized in column-parallel ADC.  
FPGA provides offset and gain correction to the raw digitized signal.

# { 3 } sCMOS: PIXEL-DEPENDENT READ NOISE

Rms read noise matches single frame rSNR.



Single Frame Dark Histogram

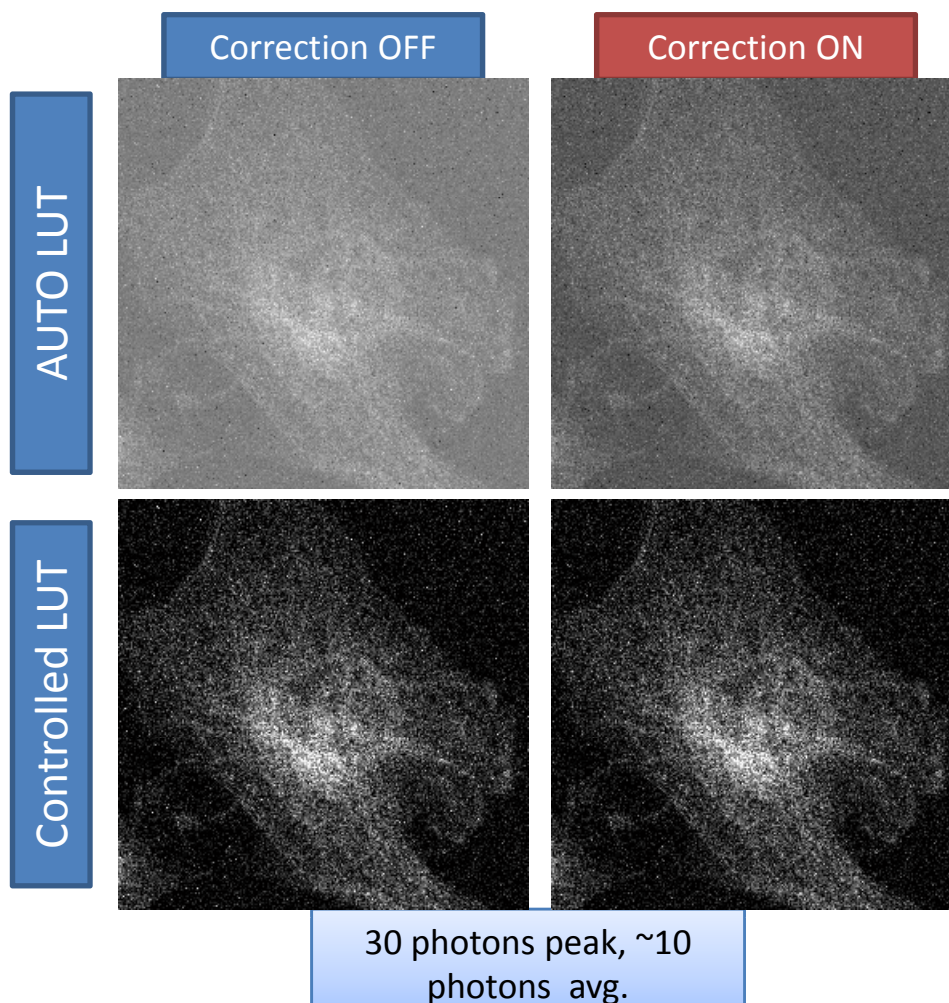


Does not fit a Gaussian distribution, i.e. is not completely modeled by a single "read noise."

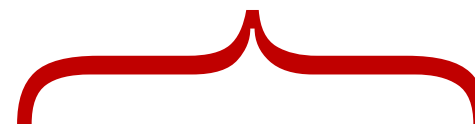
{ 3 }

# SCMOS: IMPROVING VISUAL IMAGE QUALITY

## “NOISY” PIXEL FILTERING



Map high noise pixels and selectively replace value with the average of the surrounding pixels.



- Improves contrast & “flicker” with “auto” LUT.
- Small difference with controlled LUT
- Affects only a very small number of pixels in frame

# {3} MANAGING READ NOISE

CCD

EMCCD

CMOS

Specs	Read noise expressed in photons is the <b>key specification</b> . $N_r(\text{ph}) = N_r(\text{e-})/\text{QE}$		
			Distribution Use spatial or single frame rms, <b>not</b> median rms
Data collection	Analog binning, optical matching Use slowest clock speed possible		<b>Optical matching</b> Use pixel noise filter when possible
Visualization	Set lower threshold to a minimum of offset plus 0 to 3 noise standard deviations		
Statistical noise model	Poisson + uniform Gaussian	Complicated, gain dependent	Poisson + pixel-dependent Gaussian

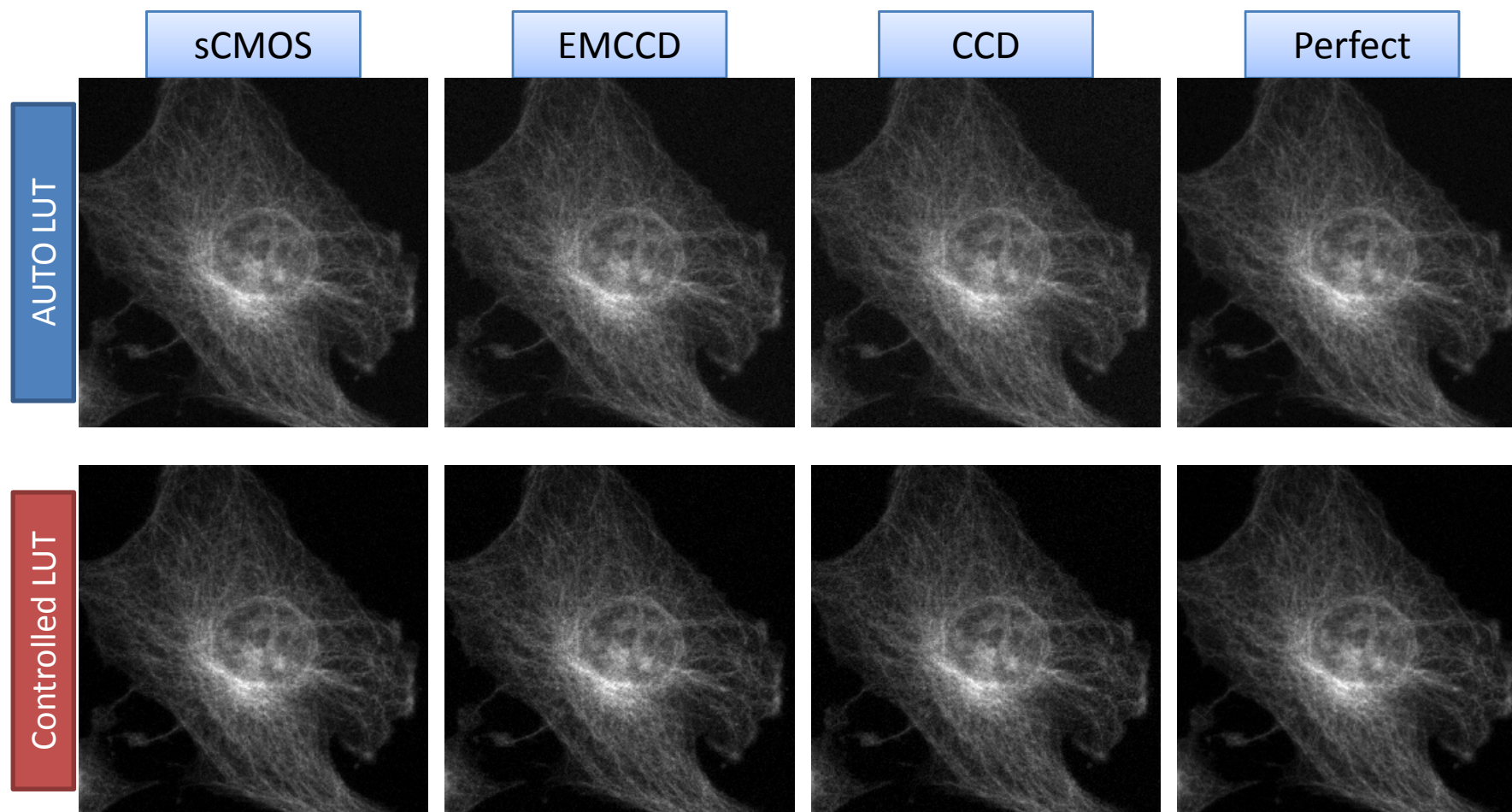
# WHAT ABOUT IMAGES?

- Perfect and real cameras
- Visualization
- Histograms
- How many photons do you need?



{ 3 }

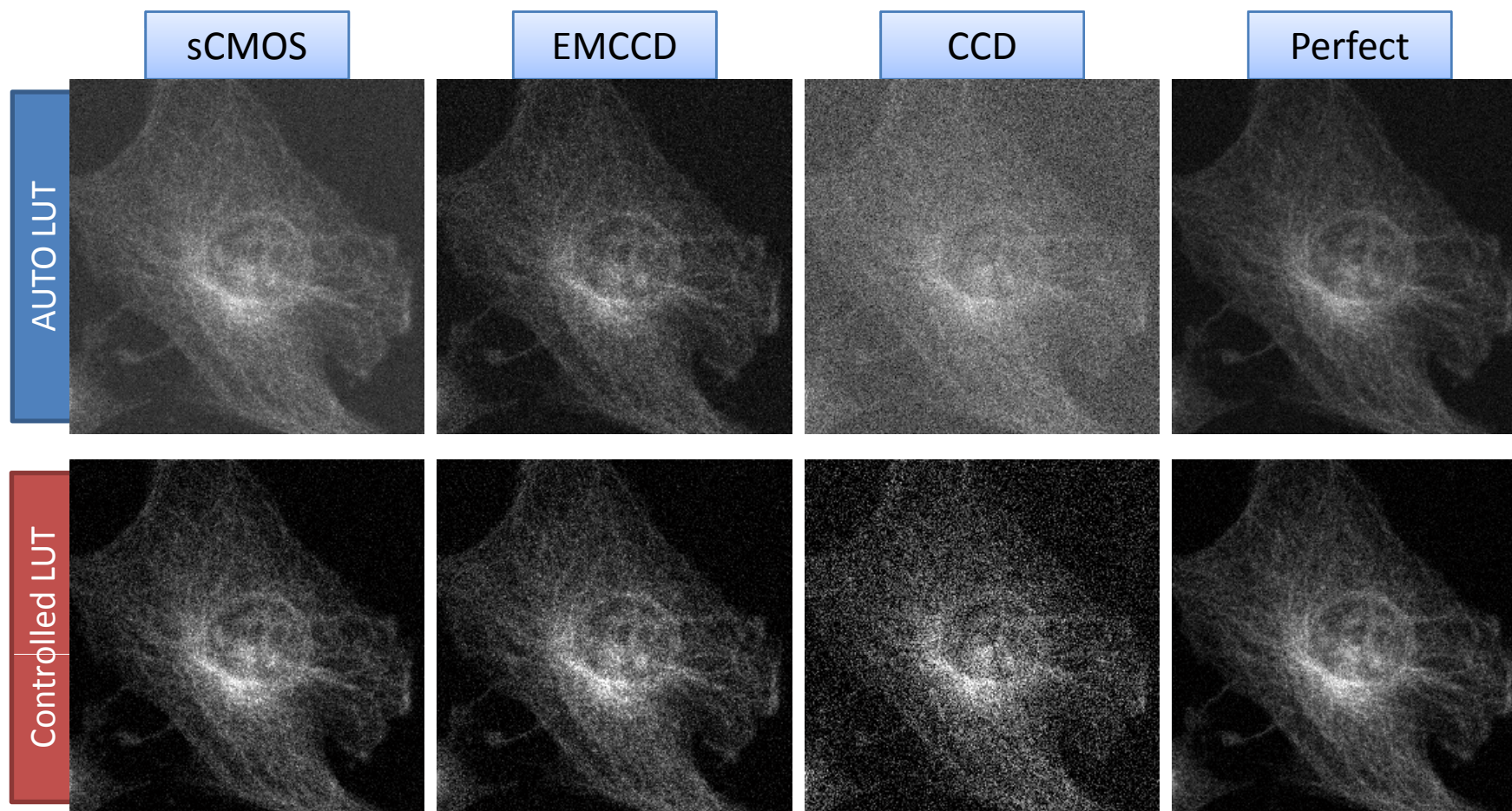
## COMPARING CAMERAS: 1000 PHOTON PEAK VISUALLY SIMILAR



sCMOS:  
Noise Correction ON

{ 3 }

## COMPARING CAMERAS: 100 PHOTON PEAK CAMERA NOISE AND / OR VISUALIZATION MATTER

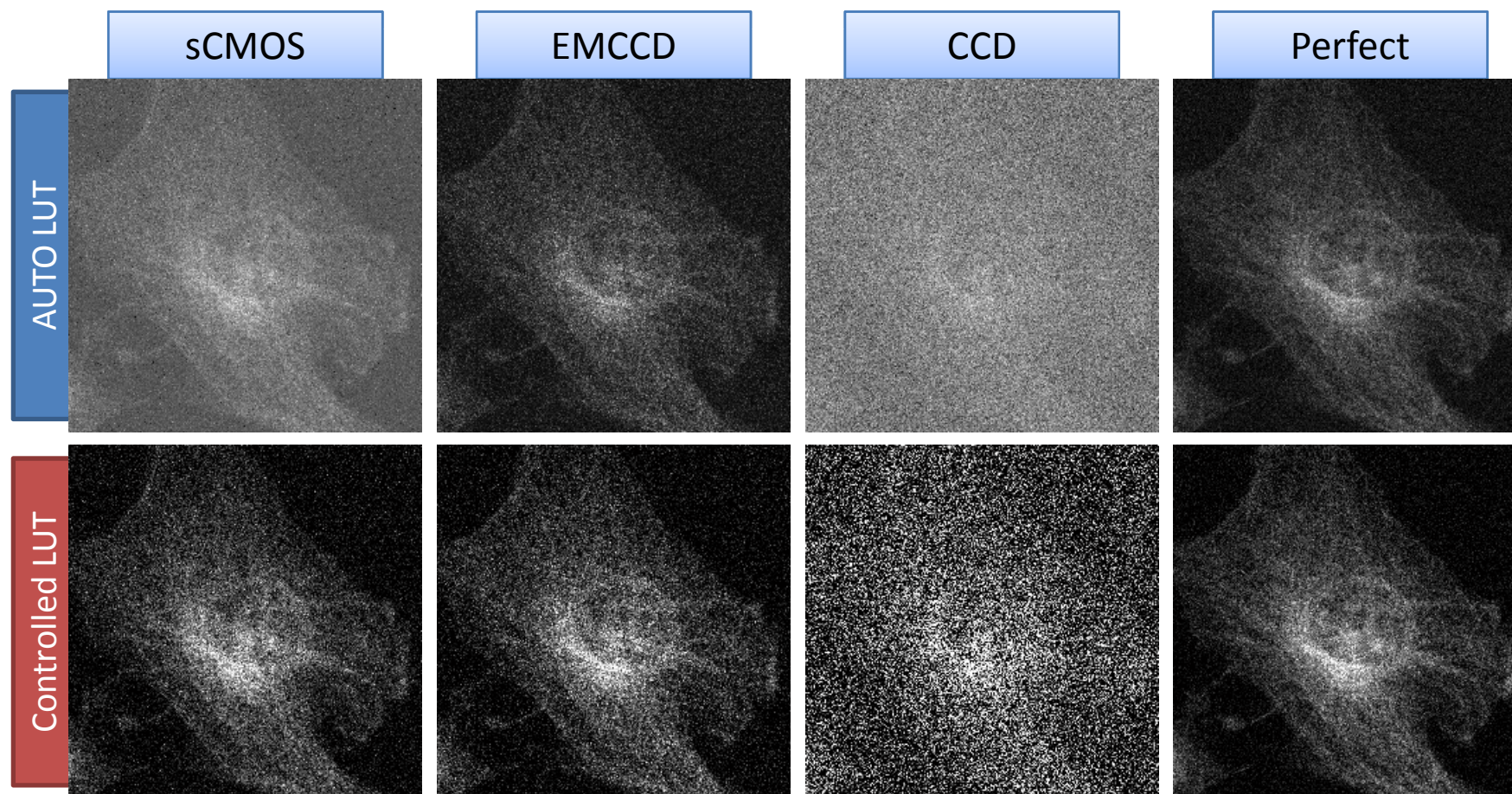


sCMOS:  
Noise Correction ON



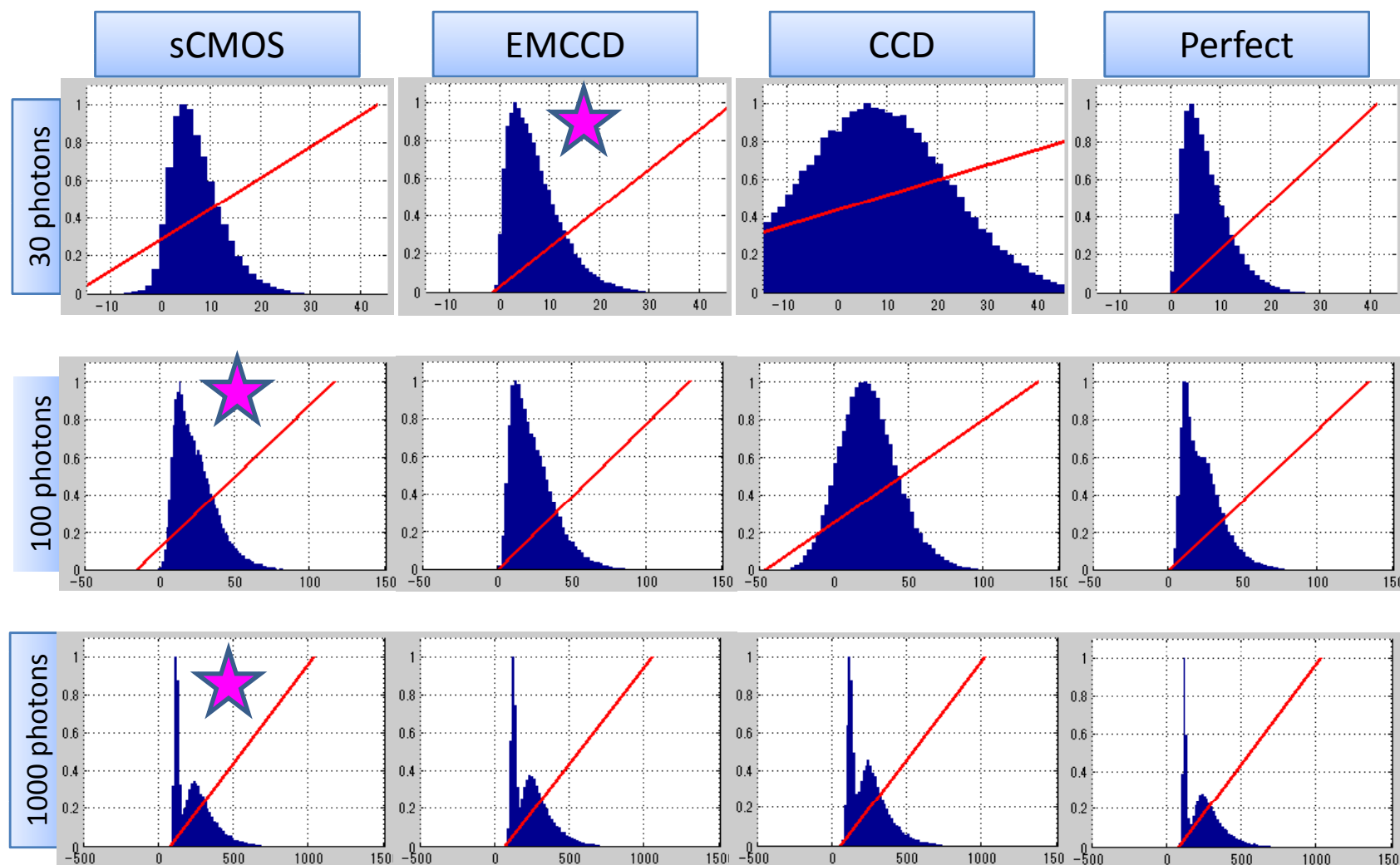
{ 3 }

## HARDER TO SEE IN THE DARK: 30 PHOTON PEAK CAMERA & VISUALIZATION CRITICAL



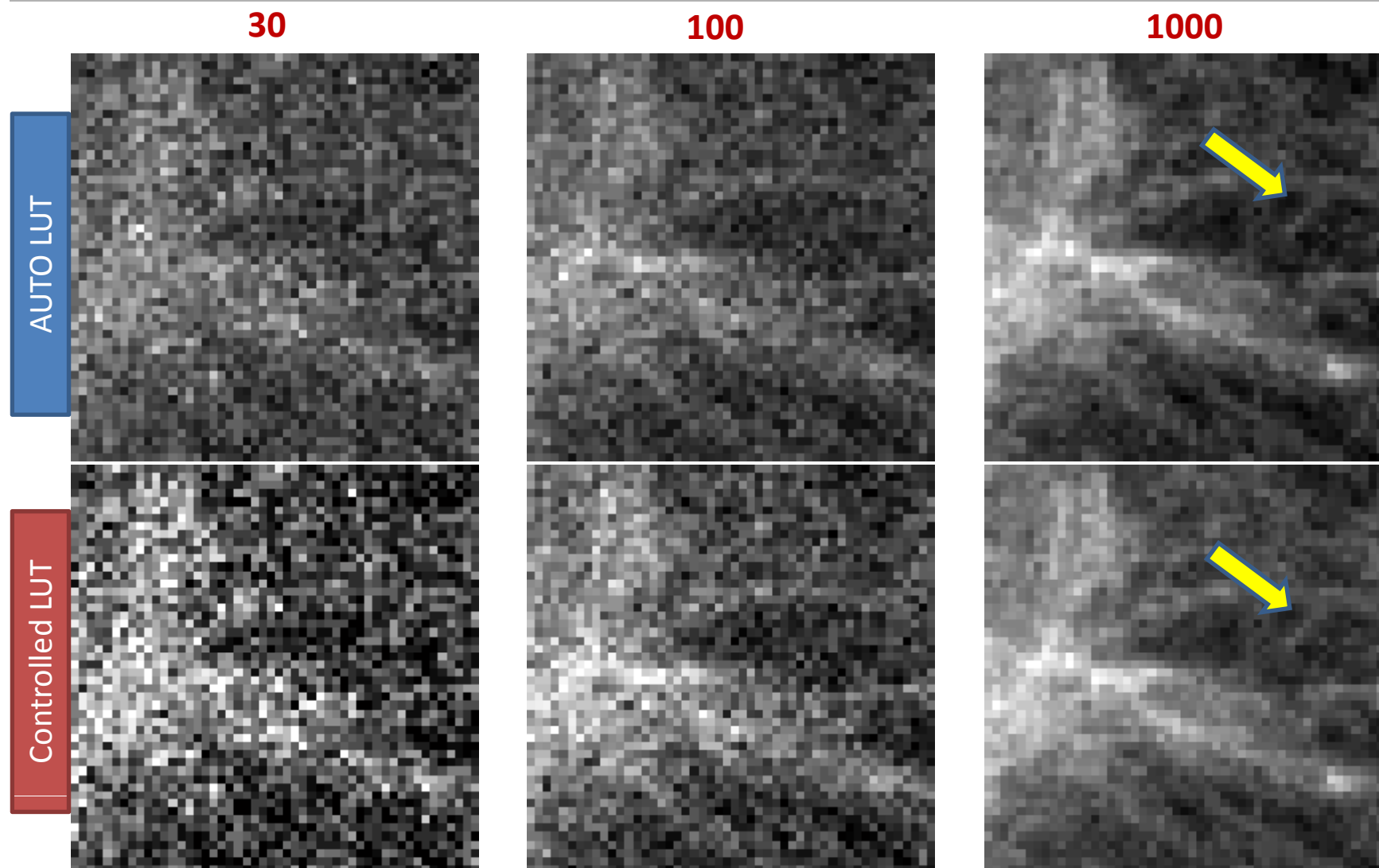
sCMOS:  
Noise Correction ON

# { 3 } HISTOGRAMS: MOST SIMILAR TO THE PERFECT CAMERA

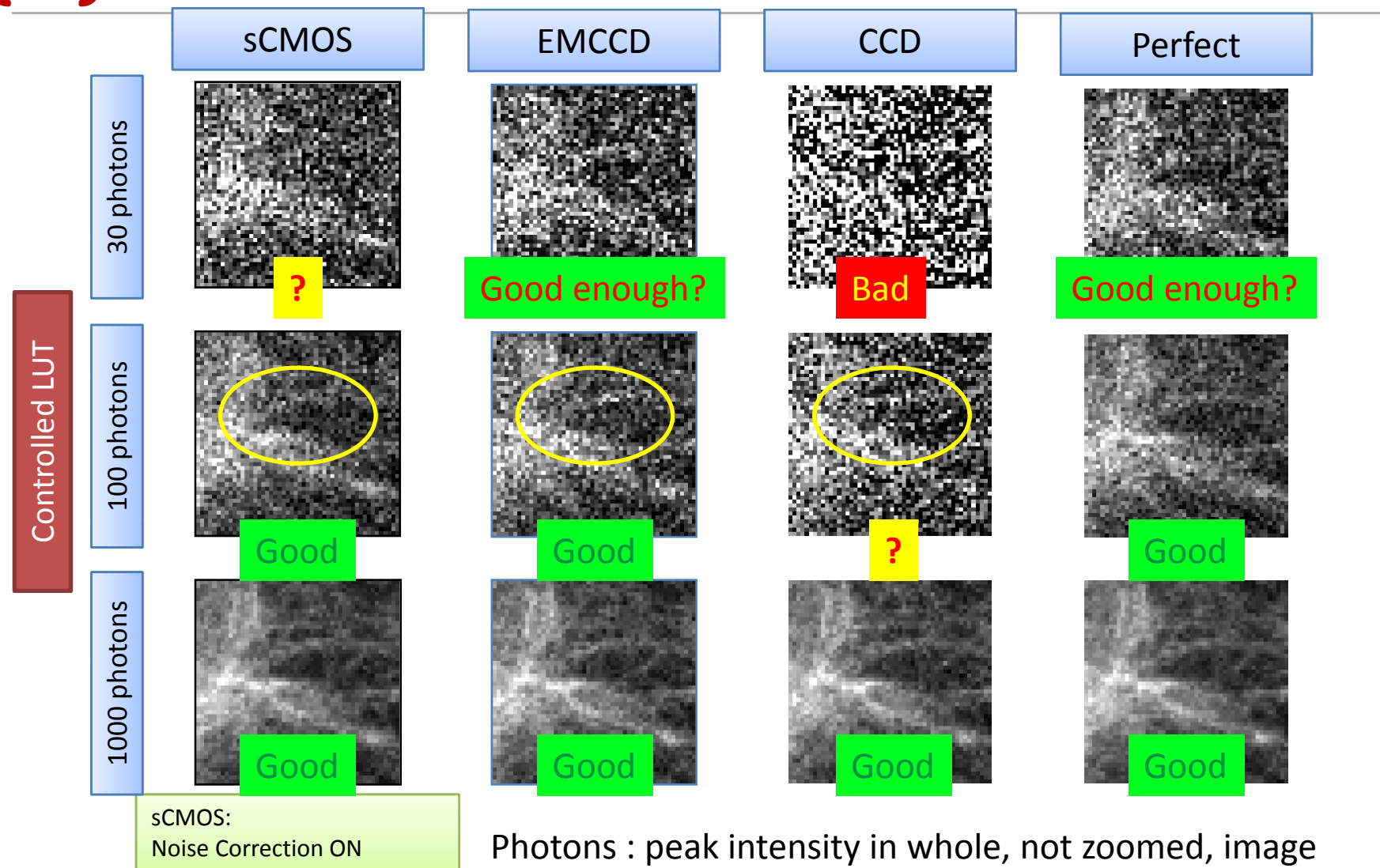


Mean photons: ~35% of peak

# { 3 } HOW MANY PHOTONS DO I NEED WITH A **PERFECT** CAMERA?



# { 3 } HOW MANY PHOTONS DO I NEED WITH A **REAL** CAMERA?



# {3}

## HOW TO **NARROW THE GAP**

---

- 1 { **Know what you want to do**  
The number of photons required to “see” something depends upon what you want to see, and how clearly you want to see it, even with a perfect camera.
  - 2 { **Turn up the light carefully**  
Real cameras reduce image quality, however when there is enough light, all scientific cameras work well
  - 3 { **Visualization matters**  
Monitor choice, ambient light, LUT settings all make a difference
  - 4 { **Use the right camera**  
Gen II sCMOS cameras have comparable or better image quality than EMCCDs at light levels typically required for visual imaging
-



## CHOOSING AND USING **SCIENTIFIC** CAMERAS

---

- 1 { The image problem
  - 2 { Think in photons
  - 3 { Real cameras are not perfect
  - 4 { Know thyself**
  - 5 { The Living Image: Case Studies
-



{4}

## KNOW THYSELF

WHAT IS **MOST**  
IMPORTANT  
FOR **YOUR**  
EXPERIMENT?

throughput

field of view

sample contrast

frame *rate*

resolution

accuracy

SAMPLE **BRIGHTNESS**

minimum bleaching rate

distance measurement

background

# {4} CONSIDER THE ENTIRE SYSTEM

---

TWO  
EXAMPLES

- Lightsheet microscopy (SPIM)
- Single molecule localization microscopy

# {4}

## Light Sheet Microscopy

- Just like Localization Microscopy LSM has many faces

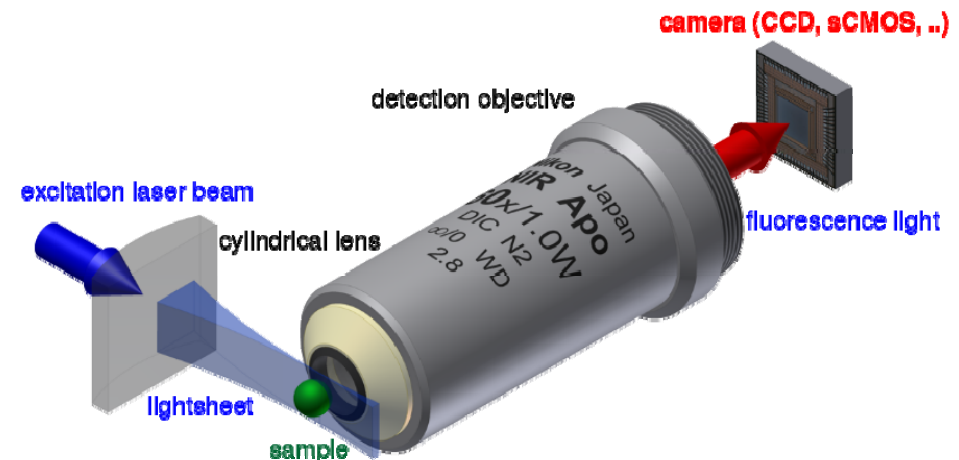
LSFM - Light Sheet **F**luorescence Microscope  
SPIM - Single Plane Illumination **M**icroscope  
OPM - Oblique Plane Microscopy  
sTSLIM – Scanning Thin Sheet Laser Illumination Microscopy  
mSPIM – Multidirectional SPIM

- Benefits

- Better sectioning vs. widefield
- Less photodamage vs. confocal
- Fast acquisition of large samples

- New developments

- Multiple Cameras
- Structured Illumination



# {4}

## MuVi-SPIM and SIMView

- Multiple illumination beams and cameras
- Increased isotropy and axial resolution
- Faster scanning with phase or wavelength separation of **offset** beams

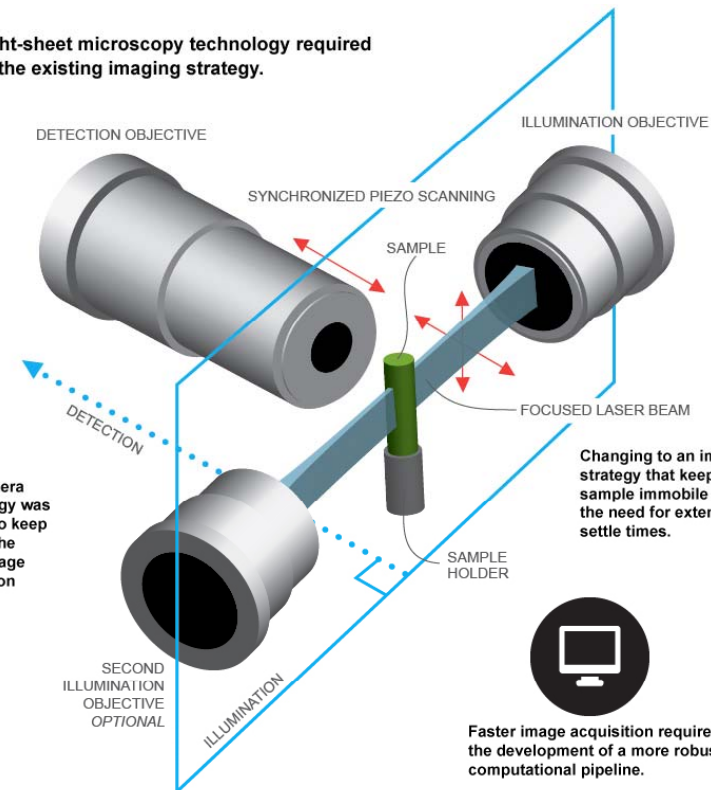
Advancing light-sheet microscopy technology required a redesign of the existing imaging strategy.

The team optimized the hardware components and configuration to streamline communications throughout the microscope control system.

New camera technology was needed to keep up with the faster image acquisition times.

Changing to an imaging strategy that keeps the sample immobile reduced the need for extended settle times.

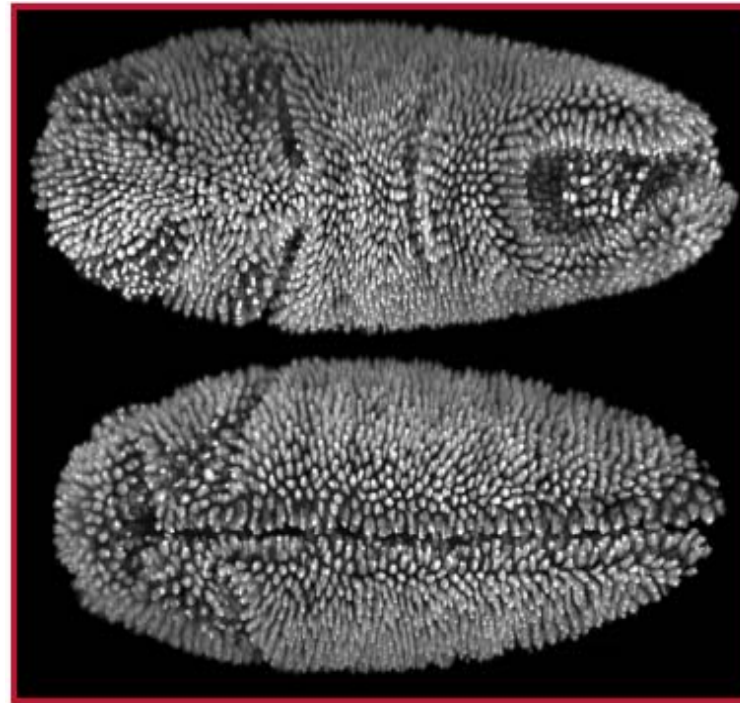
Faster image acquisition required the development of a more robust computational pipeline.



{4}

sCMOS is >20X FASTER THAN EMCCDs

SPEED!



A *Drosophila* embryo approximately 3 hours post fertilization (top: dorsal view, bottom: ventral view). The embryo, which expresses a genetically encoded marker labeling all cell nuclei, was recorded simultaneously from four different directions with a SiMView light-sheet microscope equipped with two Hamamatsu ORCA-Flash4.0 cameras. William Lemon and Philipp Keller, HHMI/Janelia Farm. <http://www.janelia.org/lab/keller-lab>

{4}

## LIGHT SHEET MICROSCOPY

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<http://thelivingimage.hamamatsu.com/>

<http://player.vimeo.com/video/74253101>

---

# {4}

## LIGHT SHEET MICROSCOPY

---

### CRITICAL CAMERA CHARACTERISTICS

- Large field of view (high pixel number)
- High speed (data rate)
- Large dynamic range
- Reasonably low noise
- Rolling shutter synchronized to sample scanning with variable speed

**Camera: ORCA Flash4.0 Scientific CMOS**

---

# {4}

## LIGHT SHEET MICROSCOPY

---

Light sheet microscopy – matching the camera  
and optical system

[http://www.hamamatsu.com/sp/sys/en/promotion/mp4/s\\_Lightsheet\\_en.html](http://www.hamamatsu.com/sp/sys/en/promotion/mp4/s_Lightsheet_en.html)

---



# {4}

## OPTIMALLY USING THE CAMERA FOR THE TASK

CCD

### **Subnanometre single-molecule localization, registration and distance measurements**

Alexandros Pertsinidis<sup>1,2</sup>, Yunxiang Zhang<sup>1,2</sup> & Steven Chu<sup>1,2,3,4,†</sup>

EMCCD

### **Ultrahigh accuracy imaging modality for super-localization microscopy**

Jerry Chao<sup>1-3</sup>, Sripad Ram<sup>1-3</sup>, E Sally Ward<sup>2</sup> & Raimund J Ober<sup>1,2</sup>

sCMOS

### **Video-rate nanoscopy using sCMOS camera-specific single-molecule localization algorithms**

Fang Huang<sup>1</sup>, Tobias M P Hartwich<sup>1-3,9</sup>, Felix E Rivera-Molina<sup>1,9</sup>, Yu Lin<sup>4,5</sup>, Whitney C Duim<sup>1</sup>, Jane J Long<sup>6</sup>, Pradeep D Uchil<sup>7</sup>, Jordan R Myers<sup>1</sup>, Michelle A Baird<sup>8</sup>, Walther Mothes<sup>7</sup>, Michael W Davidson<sup>8</sup>, Derek Toomre<sup>1</sup> & Joerg Bewersdorf<sup>1,4,5</sup>

{4}

## STANDARD PRACTICE IS NOT THE BEST PRACTICE: USING EMCCD WITH GAIN YIELDS LEAST ACCURATE RESULTS

Mean photon count	Ultimate accuracy limit (nm)	Conventional EMCCD accuracy limit (nm)	UAIM at 900×	UAIM at 4500×	CCD accuracy limit <sup>a</sup> (nm)
			accuracy limit (nm)	accuracy limit (nm)	
200	4.84	9.71 [100.6%]	5.41 [11.8%]	5.13 [6.0%]	7.94 [64.0%]
400	3.42	6.94 [102.9%]	3.92 [14.6%]	3.63 [6.1%]	5.26 [53.8%]
800	2.42	4.93 [103.7%]	2.85 [17.8%]	2.57 [6.2%]	3.45 [42.6%]
1600	1.71	3.49 [104.1%]	2.08 [21.6%]	1.82 [6.4%]	2.32 [35.7%]
3200	1.21	2.48 [105.0%]	1.52 [25.6%]	1.30 [7.4%]	1.57 [29.8%]

<sup>a</sup>Computed at near-optimal magnification (i.e., magnification that yields approximately the best localization accuracy limit) of 128.6×, 185.7×, 185.7×, 185.7×, and 242.9× for mean photon count of 200, 400, 800, 1600, and 3200, respectively.

CCD QE: 100%, read noise = 1.8 ph, **no background; No fixed pattern noise.**

... “the fact that the noise coefficient approaches 1 with increasing photon count demonstrates the suitability of the CCD (CMOS) detector when enough light is available....”

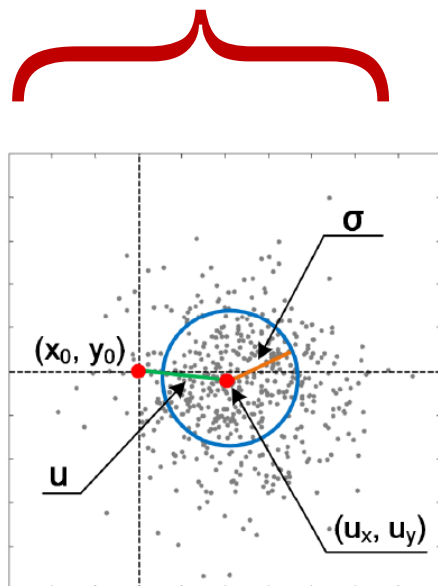
... “even with a low readout noise of  $\sigma=2$  electrons, the CCD detector is unsuitable for extreme low light imaging and implementing UAIM.”

**Adapted from: J. Chao et al (Ober Lab), Nat. Meth10, 2013) doi:10.1038/nmeth.2396**

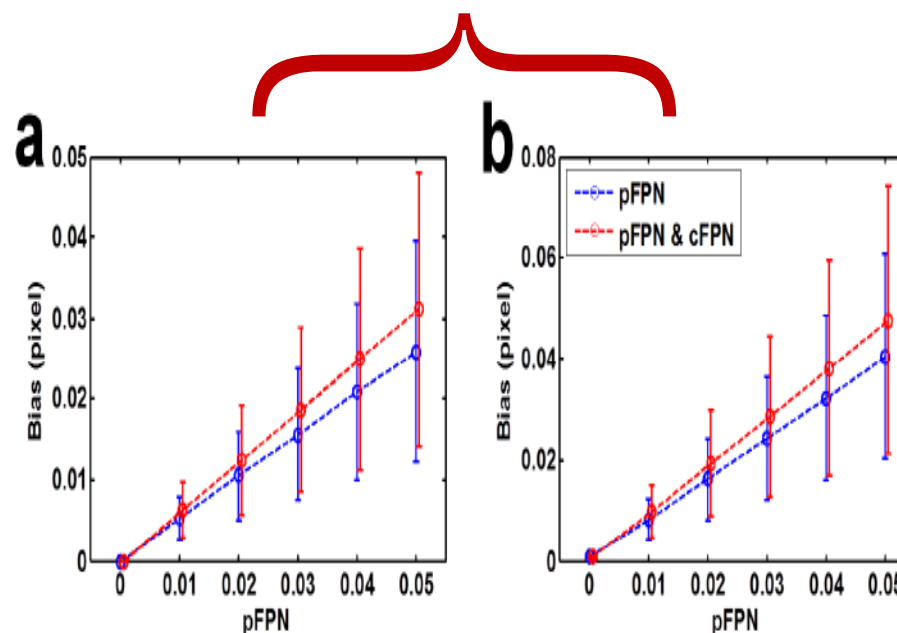
<http://www.wardoberlab.com/>

# {4} UNCORRECTED PRNU CAN LEAD TO LOCALIZATION BIAS

Localization  
distribution & bias



Impact of PRNU on localization bias:



Alexa 647 simulation  
(3000 photons)

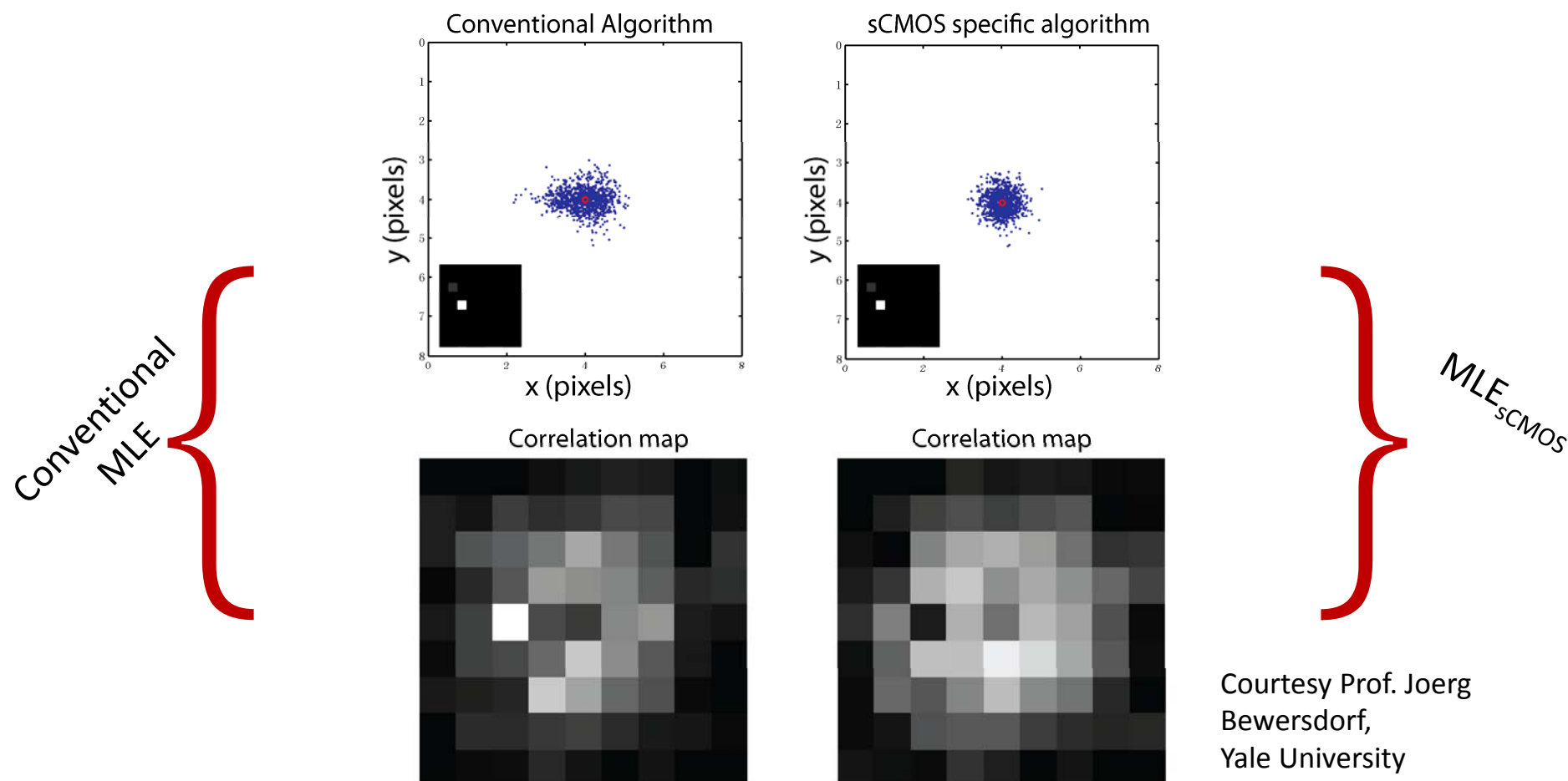
mEos2 simulation  
(750 photons)

0.5% PRNU: 1 – 2 nm @ 100 nm/ pixel

Courtesy: Zhen-li Huang, Huazhong University of Science and Technology, (unpublished)

# {4}

## COMPENSATING READ NOISE VARIATION



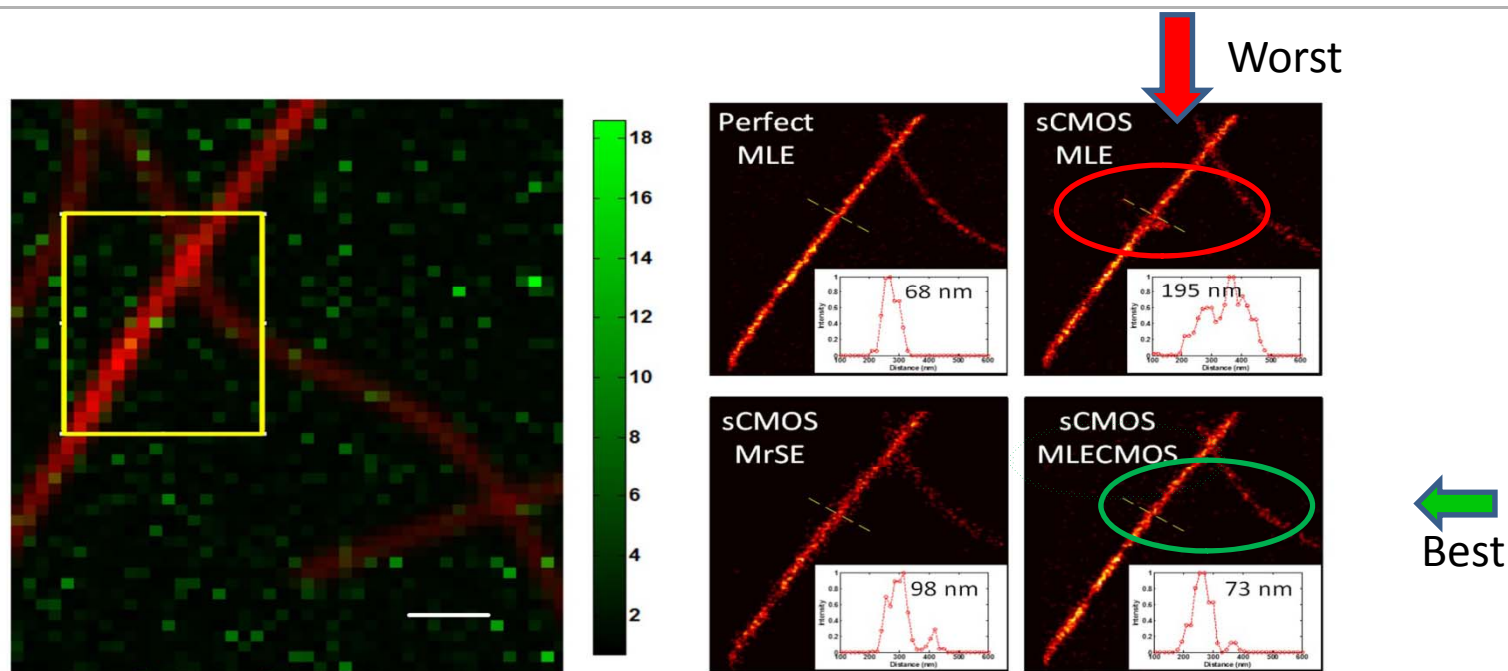
Courtesy Prof. Joerg  
Bewersdorf,  
Yale University

Incorporating pixel-specific read noise into the Maximum Likelihood Probability Model eliminates and narrows the asymmetric distribution of localized molecules caused by higher read noise pixels.

Courtesy F. Huang, Bewersdorf Lab

{4}

# MLE RECONSTRUCTION MUST USE A NOISE MODEL INCLUDING CAMERA NOISE



Note: MLE for EMCCDs are also difficult:

- Inaccurate gain
- Output PDF not Poisson
- Even at “high” light, the variance is 2X the mean signal (in photons).

Courtesy: Zhen-li Huang, Huazhong University of Science and Technology, (unpublished)

# {4} SELECTING AND USING CAMERAS: CASE STUDIES

CCD

## **Subnanometre single-molecule localization, registration and distance measurements**

Alexandros Pertsinidis<sup>1,2</sup>, Yunxiang Zhang<sup>1,2</sup> & Steven Chu<sup>1,2,3,4,†</sup>

EMCCD

## **Ultrahigh accuracy imaging modality for super-localization microscopy**

Jerry Chao<sup>1-3</sup>, Sripad Ram<sup>1-3</sup>, E Sally Ward<sup>2</sup> & Raimund J Ober<sup>1,2</sup>

sCMOS

## **Video-rate nanoscopy using sCMOS camera-specific single-molecule localization algorithms**

Fang Huang<sup>1</sup>, Tobias M P Hartwich<sup>1-3,9</sup>, Felix E Rivera-Molina<sup>1,9</sup>, Yu Lin<sup>4,5</sup>, Whitney C Duim<sup>1</sup>, Jane J Long<sup>6</sup>, Pradeep D Uchil<sup>7</sup>, Jordan R Myers<sup>1</sup>, Michelle A Baird<sup>8</sup>, Walther Mothes<sup>7</sup>, Michael W Davidson<sup>8</sup>, Derek Toomre<sup>1</sup> & Joerg Bewersdorf<sup>1,4,5</sup>

# {4}

## Subnanometre single-molecule localization, registration and distance measurements

Alexandros Pertsinidis<sup>1,2</sup>, Yunxiang Zhang<sup>1,2</sup> & Steven Chu<sup>1,2,3,4†</sup>

### Results

Accurate measurement of the *distance* between two fluorophores of different colors.  $\sigma_{\text{distance}} \sim 0.77$  nm using a dichroic beamsplitter to direct each color of light to separate halves of the CCD camera.

### Camera Correction

Measured PRNU maps for each color. Improved localization relative accuracy by  $\sim 2$ –4 nm.

### Details

**Speed:** 5 – 50 s / measurement

**Light:**  $\sim 4,000$  –  $10,000$  ph / mol/frame  
 $\sim 10^5$  ph / mol before bleaching

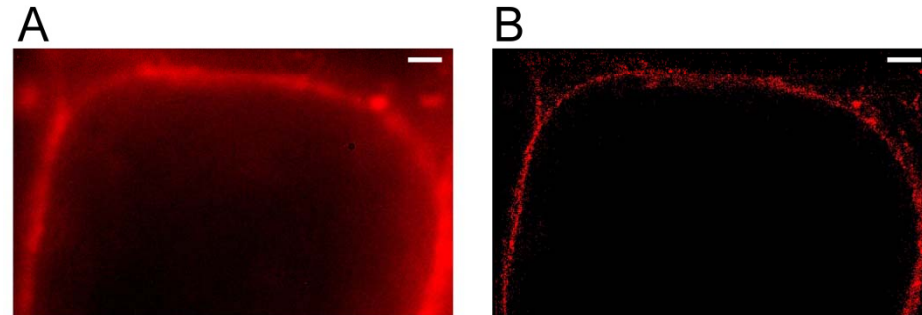
**Imaging:** Simultaneous 2 color

**Camera:** Back-thinned EM-CCD, gain off

Nature (2010) | doi:10.1038/nature09163

# { 4 } Ultrahigh accuracy imaging modality for super-localization microscopy

Jerry Chao<sup>1-3</sup>, Sripad Ram<sup>1-3</sup>, E Sally Ward<sup>2</sup> & Raimund J Ober<sup>1,2</sup>



Cholera toxin B subunit

scale bar: 1  $\mu$ m

## Results

**Localization Microscopy with Minimal Bleaching.** Plasma membrane dynamics for > 60 s (594 frames). 40% better localization precision than “conventional” EMCCD localization

## Camera Correction

Implemented detailed statistical EM noise model into maximum likelihood reconstruction probability model.

## Details

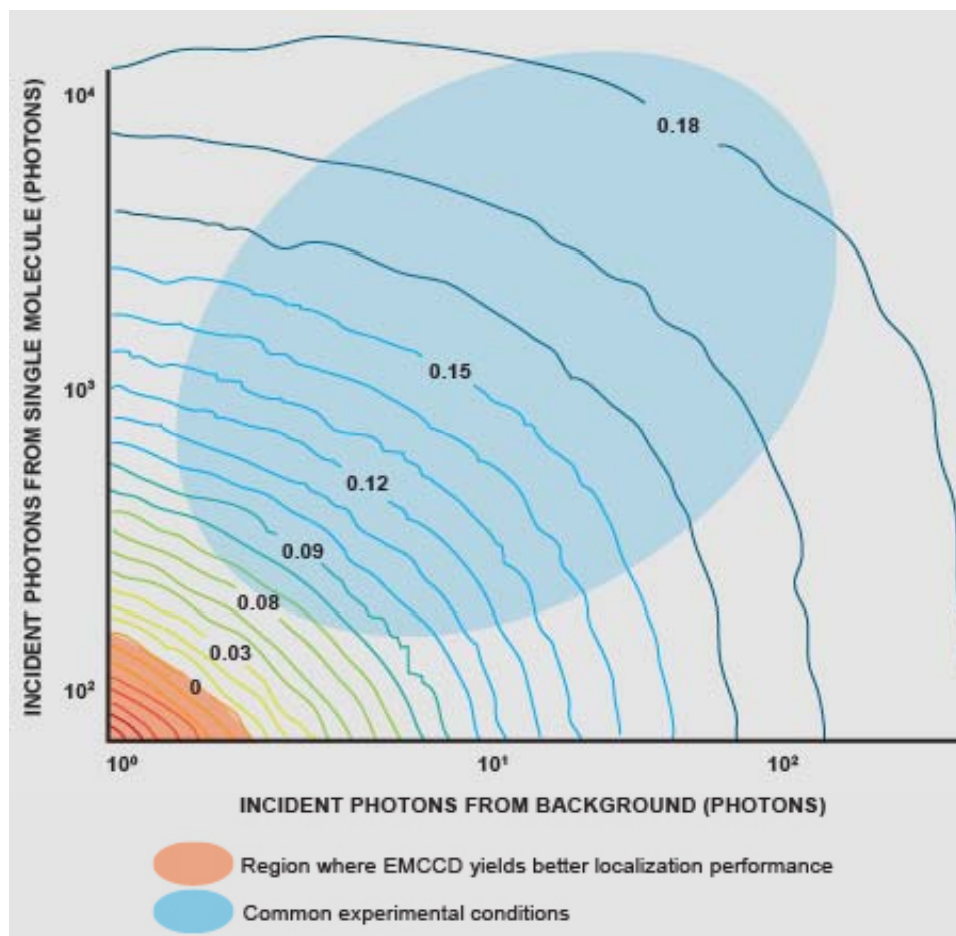
**Speed:** ~60s / reconstructed image      **Mag:** 630X  
**Light:** ~100 photons /molecule frame      **Camera:** EM-CCD, Gain ~1000

Courtesy of J. Chao et al (Ober Lab)

Adapted from Nat Meth (2013) doi:10.1038/nmeth.2396

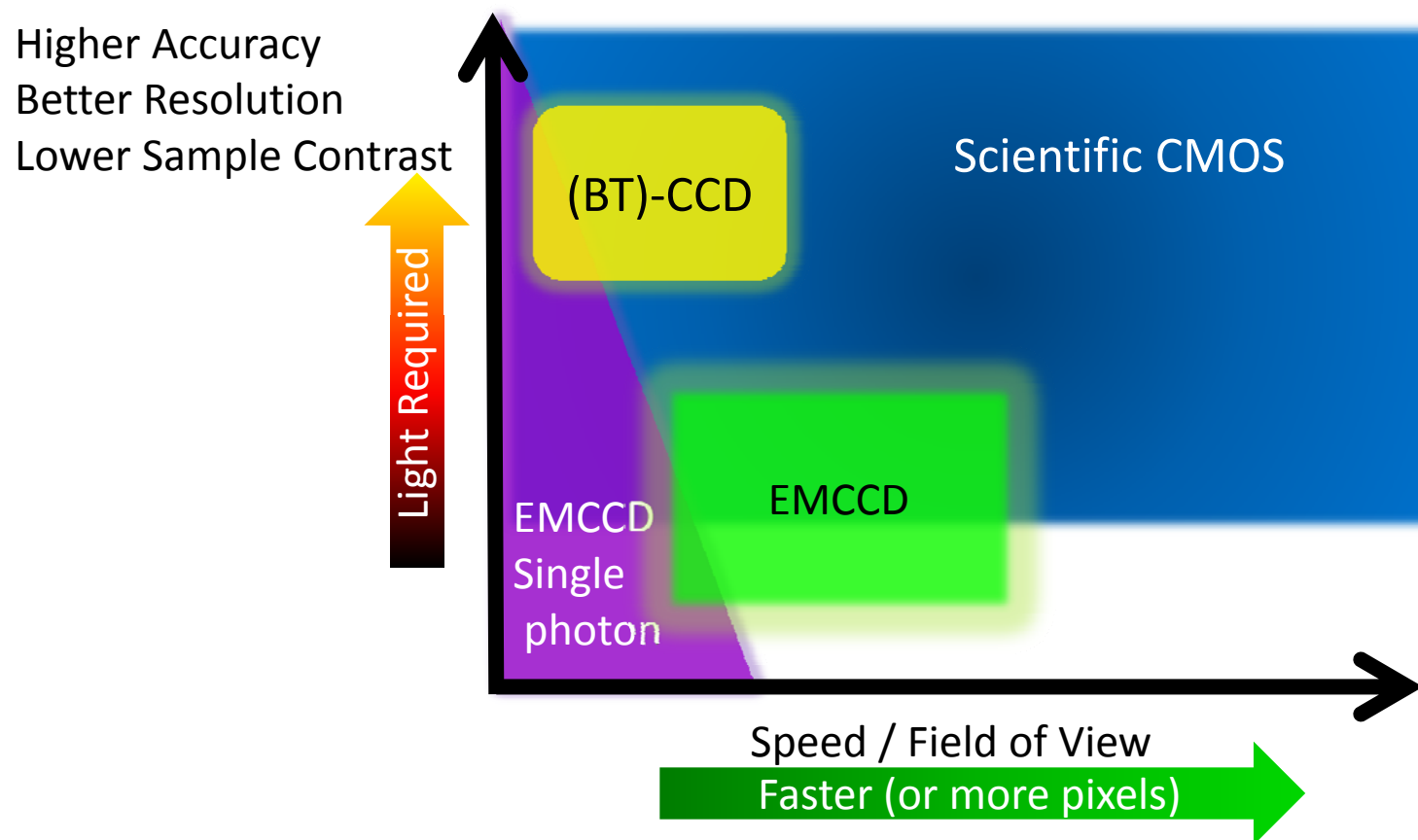


# {4} Localization Precision “conventional” EMCCD vs. sCMOS



Courtesy of F. Huang. Bewersdorf Lab, Yale  
Adapted from F. Huang *et al.*, Nature Methods 10(7): 653-658 (2013)

# {4} MINIMIZING THE GAP: MATCHING THE CAMERA TO YOUR NEEDS



# Choosing and Using **Scientific** Cameras

---

- 1 { The image problem
  - 2 { Think in photons
  - 3 { Real cameras are not perfect
  - 4 { Know thyself
  - 5 { **The Living Image**
-

{ 5 }

## RESOURCES FOR MICROSCOPISTS

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<http://thelivingimage.hamamatsu.com>

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# ACKNOWLEDGEMENTS

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**Prof. Zhen-li Huang, Huazhong University of Science and Technology**

F. Long et al, OPTICS EXPRESS 17741 (2012)

**Prof. Joerg Bewersdorf, Yale University**

F. Huang *et al.*, Nature Methods 10(7): 653-658 (2013)

**Prof. Raimund Ober, Texas Southwestern University**

J. Chao et al, Nat Meth (2013) doi:10.1038/nmeth.2396

**Prof. Lars Hufnagel, EMBL**

**Dr. Philip Keller, Janelia Farms**

## Hamamatsu

Teruo Takahashi: simulations

Hiroyuki Kawai: camera measurements

Stephanie Fullerton: presentation guidance

Katsuhide Ito: Lightsheet microscopy

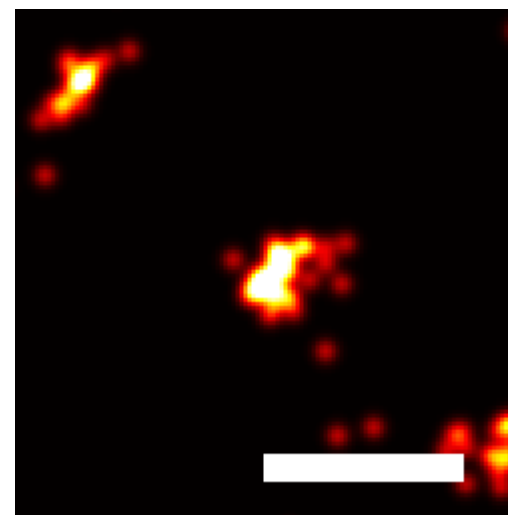
Eiji Toda: budget

## **Download**

(look on The Living Image)

Keith Bennett

[kbennett@hamamatsu.com](mailto:kbennett@hamamatsu.com)



[32 fps dynamics. 500 nm](#)  
scale

Courtesy Vutara / Prof.  
Bewersdorf

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