

# *On the variance and covariance in the determination of PTC*

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# Agenda

- Shotnoise: deterministic and random events
- PTC in Astronomy, work of Downing et.al. was a trigger
- Correlation between neighboring pixels
- Covariance and Variance

Pre-recorded.... Skipping the powerpoint rules wrt the amount of info on the slide 😊

# Shotnoise

$$Pois(p, P) = \frac{e^{-P} \cdot P^p}{p!}$$

$$Bin(n, p, \eta) = \frac{p!}{n! \cdot (p-n)!} \cdot \eta^n \cdot (1-\eta)^{p-n}$$

$$\sum_{p=n}^{\infty} Bin(n, p, \eta) \cdot Pois(p, P) = Pois(n, \eta \cdot P) = Pois(n, N)$$

- Photons  $p$ : Poisson distribution, with average  $P$  and variance  $P$
- photon-to-electron conversion in Si: either it happens, or it doesn't. Binominal with  $0 \leq n \leq p$  and  $\eta = QE_{\text{eff}}$  It is a random process.
- After cascading it is again Poisson, with avg =  $N = \eta * P$  and var =  $N = \eta * P$ .

**Note:**

deterministic e.g. gainstage (  $K$  [DN/e] )

avg =  $K * N = K * \eta * P$  and var =  $K^2 * N = K^2 * \eta * P$ .

The basis for Photon Transfer Curve (PTC).

# PTC in Astronomy

## Number check

$\text{Var}=70 \text{ S}=3000 \Rightarrow K=0.023 \text{ ADU}/e \Rightarrow 43e/\text{ADU}$   
 $Q_{\text{lin}}=65 \text{ kel}, Q_x=193 \text{ kel}$   
 $4500 \text{ adu}/40 \text{ sec}=112.5 \text{ adu}/\text{sec} \Rightarrow 4822e/\text{sec}$   
 $12 \mu\text{m}^2 \Rightarrow 33e/\text{sec}/\mu\text{m}^2 \dots 0.7e/\mu\text{m}^2 \text{ at } 20 \text{ms}$   
 P-type or N-type channel  
 low and high gain  
 70 $\mu\text{m}$  high res

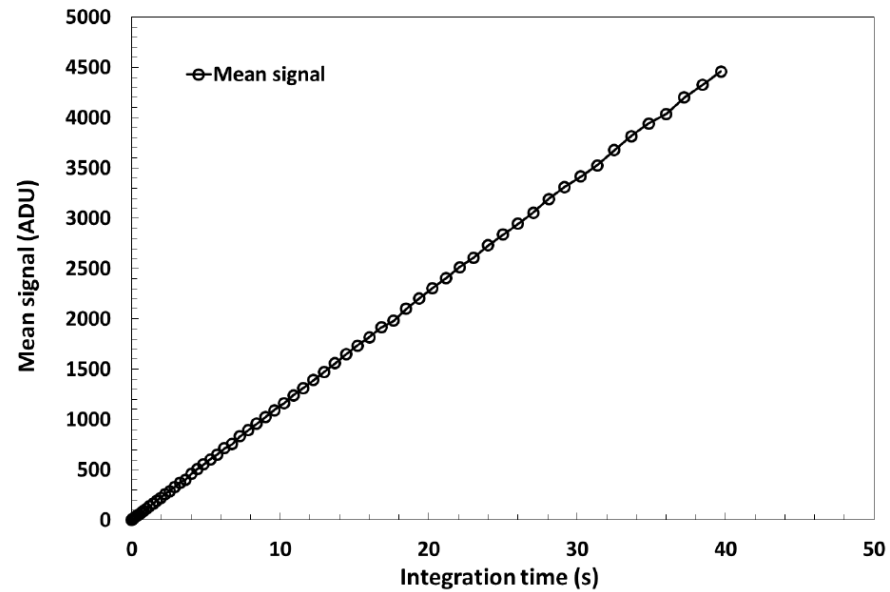


Fig. 2. Photo response of CCD204 obtained with light, with a wavelength of 660 nm. The linearity is better than  $\pm 1\%$ .

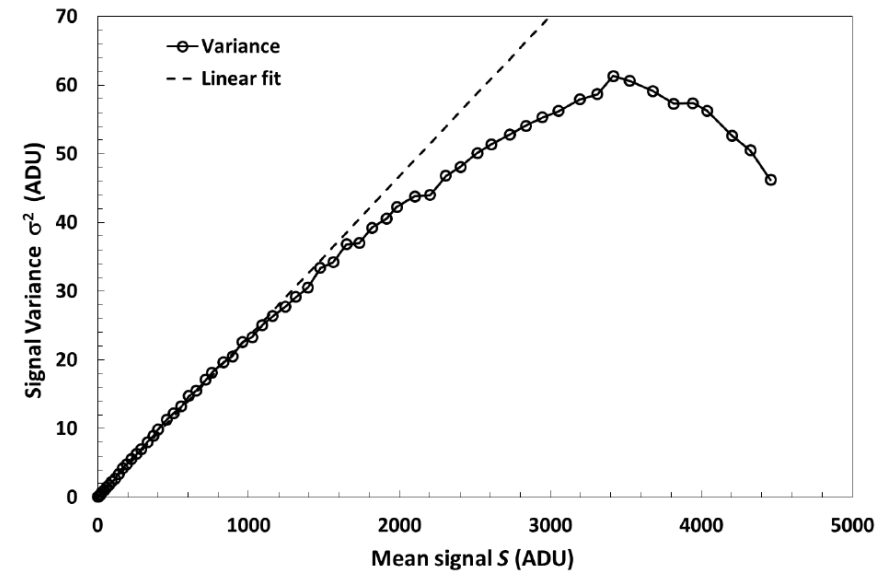
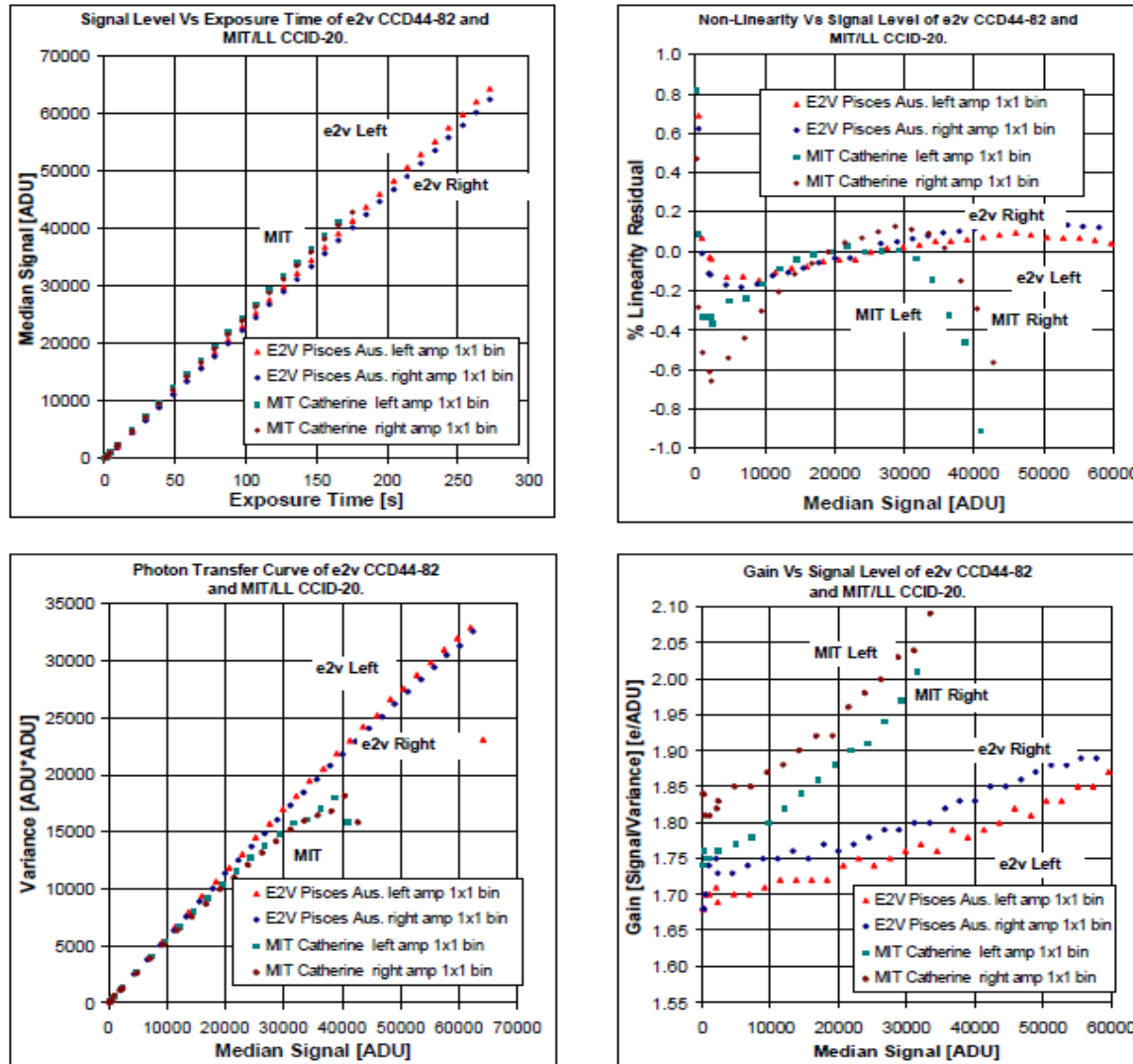


Fig. 1. Photon transfer curve of CCD204 obtained with light, with a wavelength of 660 nm.

Figures from: Konstantin Stefanov, A Statistical Model for Signal-Dependent Charge Sharing in Image Sensors, IEEE January 2014, Transactions on Electron Devices, vol. 61, issue 1, pp. 110-115.

NOTE: Earliest paper: **Mark Downing, et.al.**, *CCD riddle: a) signal vs time: linear; b) signal vs variance: non-linear*, June 2006, Proceedings of SPIE - The International Society for Optical Engineering 6276.



Figures from:

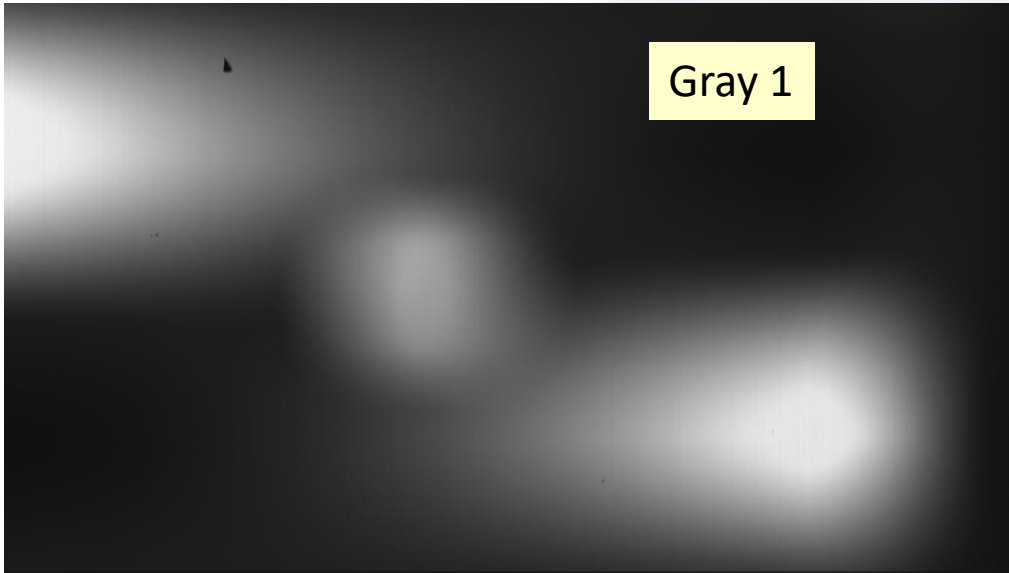
Mark Downing, et.al., *CCD riddle: a) signal vs time: linear; b) signal vs variance: non-linear*, June 2006, Proceedings of SPIE - The International Society for Optical Engineering 6276.

Note:

E2V : CCD44-82; 15um pixels; 16um thick

MIT/LL: CCID-20; 15um pixels; 40um high res thick

Fig. 2: Signal linearity and photon transfer curves of the left and right amplifiers of MIT/LL Catherine and e2v Pisces Australis II. Top Left: Signal versus exposure time; Top Right: Residual linearity curve; Bottom Left: Photon transfer curve (Variance versus Median Signal); Bottom Right: Calculated gain versus signal.



**A Low Effort Method to determine PTC**

1 image: no illumination, eg capped (Dark)

2 images: same illumination (Gray1 and Gray2) short after one other

Level = (Gray1 + Gray2)/2 – Dark      % signal level

Shot = (Gray1 - Gray2)/  $\sqrt{2}$       % includes the readnoise as well

**For all pixels (i,j)**

HISTO(Level) = HISTO(Level) + 1 ;      %Level(i,j) is used as a pointer

VAR(Level) = VAR(Level) + Shot(Level)<sup>2</sup>;      %cumulating the variances

AVG(Level)=AVG(Level)+Shot(Level);      %the averages should be close to zero

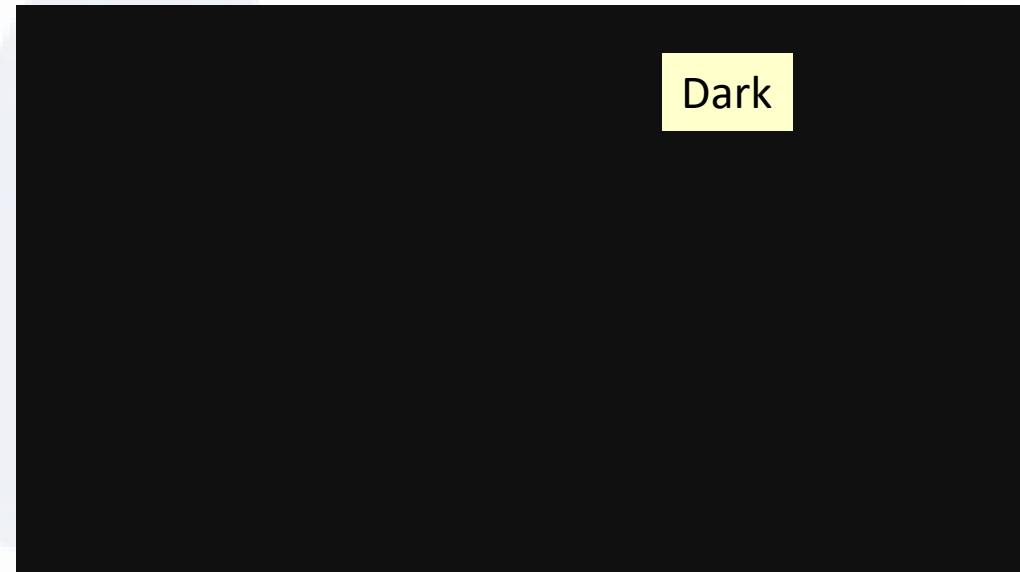
**For i,j,k<>0,l<>0** COVAR(Level(i,j)) = COVAR(Level(i,j)) + Shot(i,j)\*Shot(i-k,j-l)

**For all Level**

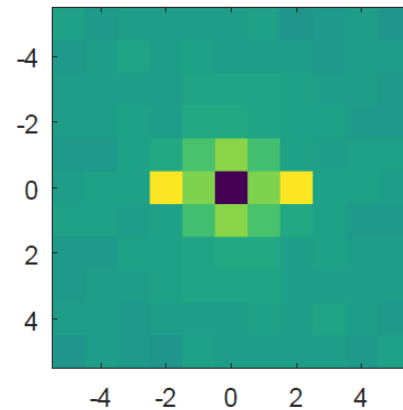
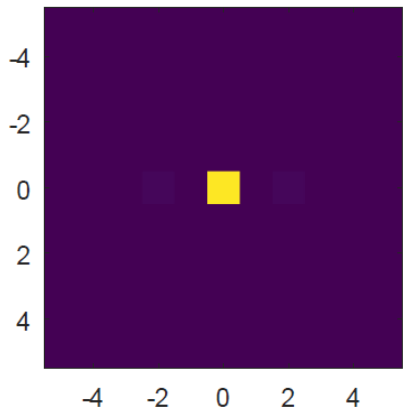
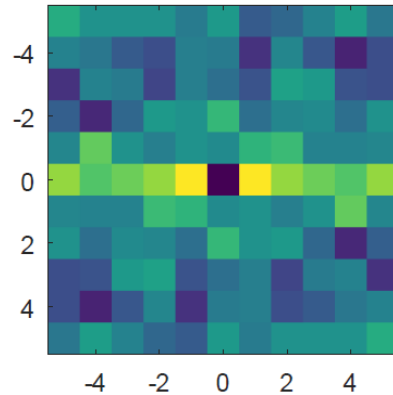
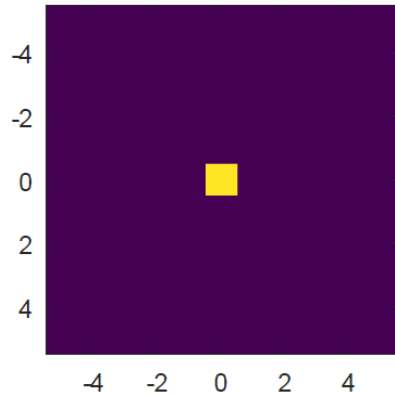
VAR(Level)=VAR(Level)/HISTO(Level);

AVG(Level)=AVG(Level)/HISTO(Level);

COVAR(Level)=COVAR(Level)/HISTO(Level);

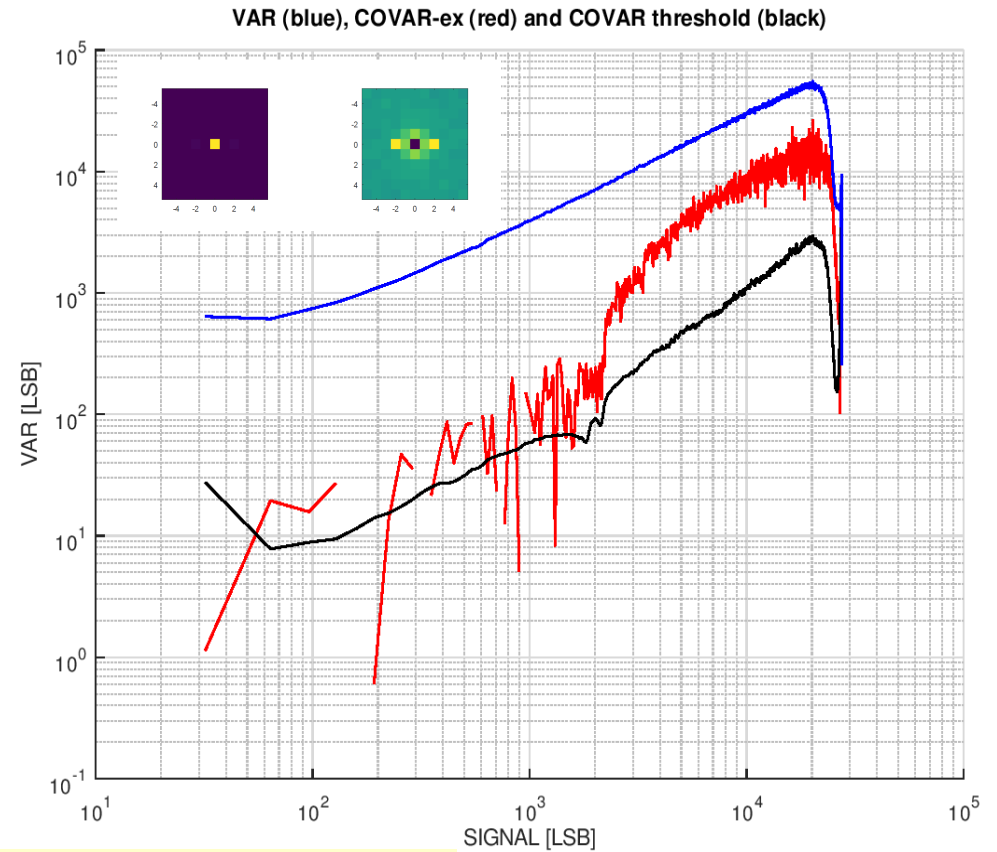
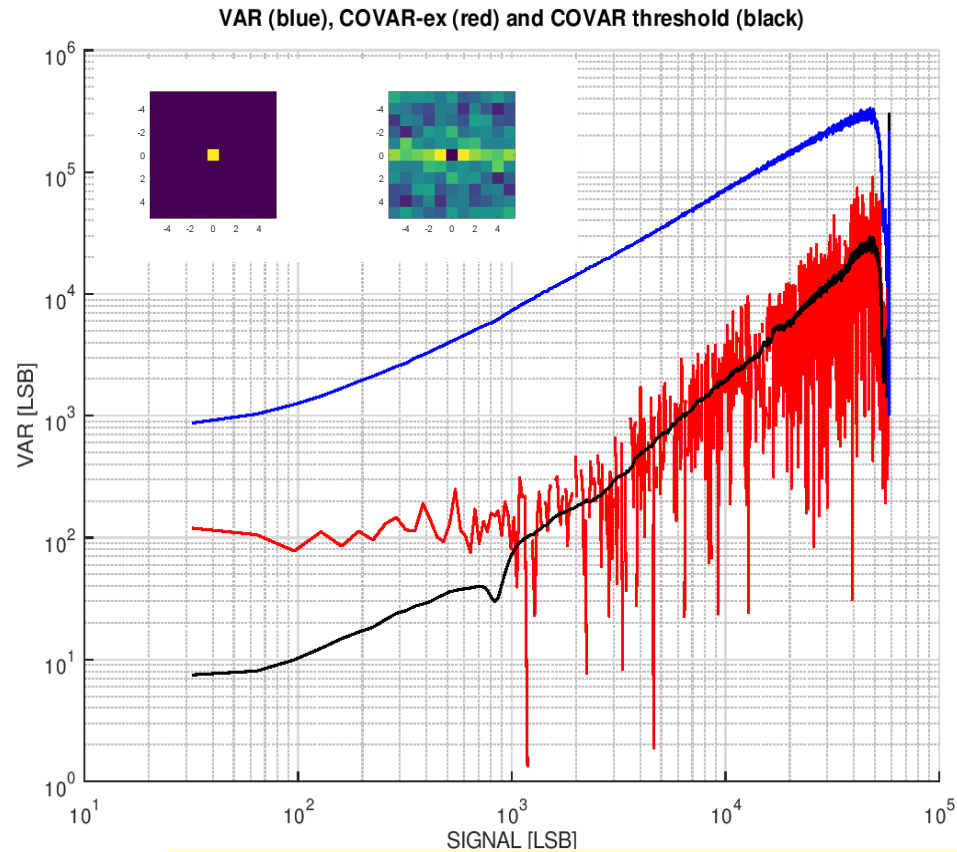


# Correlation with neighboring pixels



- Two different imagers
- The surface plots of the correlation coefficient are autoscaled
  - Left plot: central element (0,0) has value 1
  - Right plot: central element (0,0) made 0 to enhance visibility of the correlation coefficient
- Left plot to show that on a linear scale the correlation is small
- Right upperplot: median=0.14%, max=0.3%
- Right lowerplot: median=2.2%, max=4%

# Covariance and variance



**Blue trace is variance (PTC),  
Red trace is covariance with neighboring pixels in a 3x3 kernel excluding the pixel itself,  
Black trace is detection threshold.**



# Wrap-up

- Check with covariance and/or correlation if there is crosstalk into neighboring pixels. If so, the validity of the Photon Transfer Curve PTC can be in doubt and some investigation is needed.
  - The Photon-Transfer-Curve can be non-linear even when the transfercurve is linear
  - There is a case with thick BSI CCD's where the covariance can be used to compensate for the non-linearity. Unfortunately, this is not universal applicable.

Slide 6:

E-mail the “Gray1, Gray2 and Dark” in tiff to [peter@peerimaging.com](mailto:peter@peerimaging.com) and I'll discuss the result of your imager/camera in the breakout session. For “Gray” any defocused illumination pattern is ok but no steep edges.