

# An introduction to X-ray variability from black holes

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# What do I hope to achieve?

Introduce some basic ideas that will be used a lot in the talks that follow

But the scope of this talk is rather limited...

## **Will focus on:**

- XRBs and radio-quiet AGN (not ULXs)
- One-band only (no spectral-timing, interband correlations)
- detailed studies of individuals, small samples – not massive time domain surveys
- No time for “exceptions” like GRS 1915+105
- Timescales  $\ll$  typical postdoc contract

# Fiducial timescales, frequencies

$$f_{lc} \sim 2 \times 10^5 \left( \frac{r}{r_g} \right)^{-1} \left( \frac{M}{M_\odot} \right)^{-1} \text{ Hz} \quad \left[ \left( \frac{GM_\odot}{c^3} \right)^{-1} = 2 \times 10^5 \right]$$

$$f_{dyn} \sim 2 \times 10^5 \left( \frac{r}{r_g} \right)^{-3/2} \left( \frac{M}{M_\odot} \right)^{-1} \text{ Hz} \sim 2\pi f_{orb}$$

$$f_{therm} \sim f_{orb} \alpha$$

$$f_{visc} \sim f_{orb} \alpha \left( \frac{h}{r} \right)^2$$

Timescale	$10 M_{\text{sun}}$	$10^6 M_{\text{sun}}$
Light crossing	$3 \times 10^3$ Hz (0.3 ms)	30 mHz (30 s)
Orbital	200 Hz (5 ms)	2 mHz (500 s)
Thermal	20 Hz (50 ms)	0.2 mHz (5 ks)
Viscous	0.2 Hz (5 s)	$2 \times 10^{-6}$ Hz (500 ks)

[assuming  $\alpha \sim 0.1$ ,  $h/r \sim 0.1$ ,  $r/r_g \sim 6$ ]

could be much longer

# Time series (aka light curves)

“Aperiodic”, “random”, “stochastic”

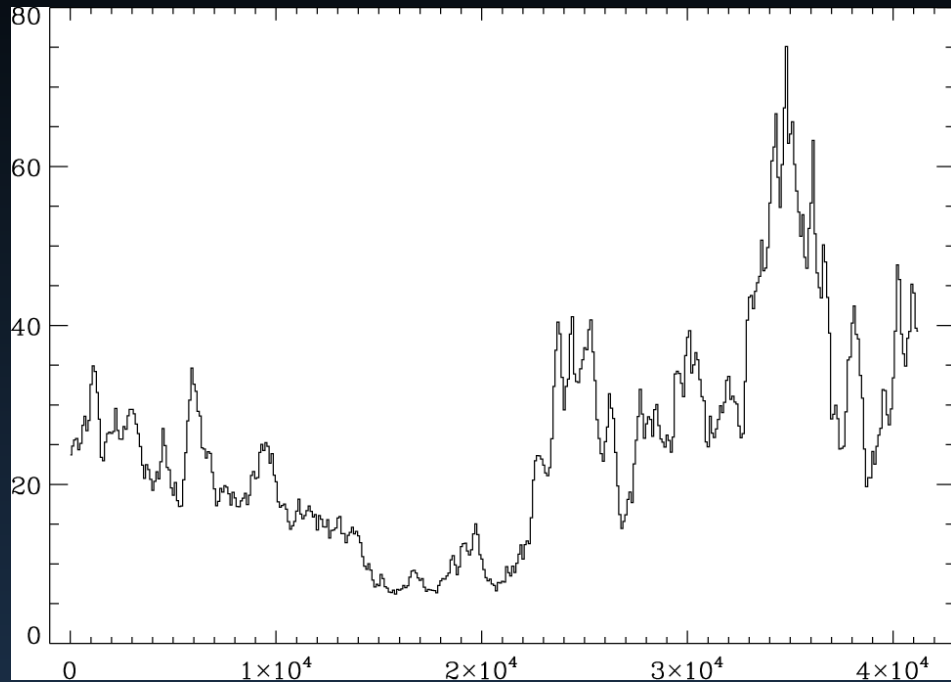
As we can fully describe a random variable in terms of its distribution, or moments (mean, variance, skew, ...)

So we can describe a random time series in terms of its “distribution”: mean, auto-correlation function (ACF), higher-order moments

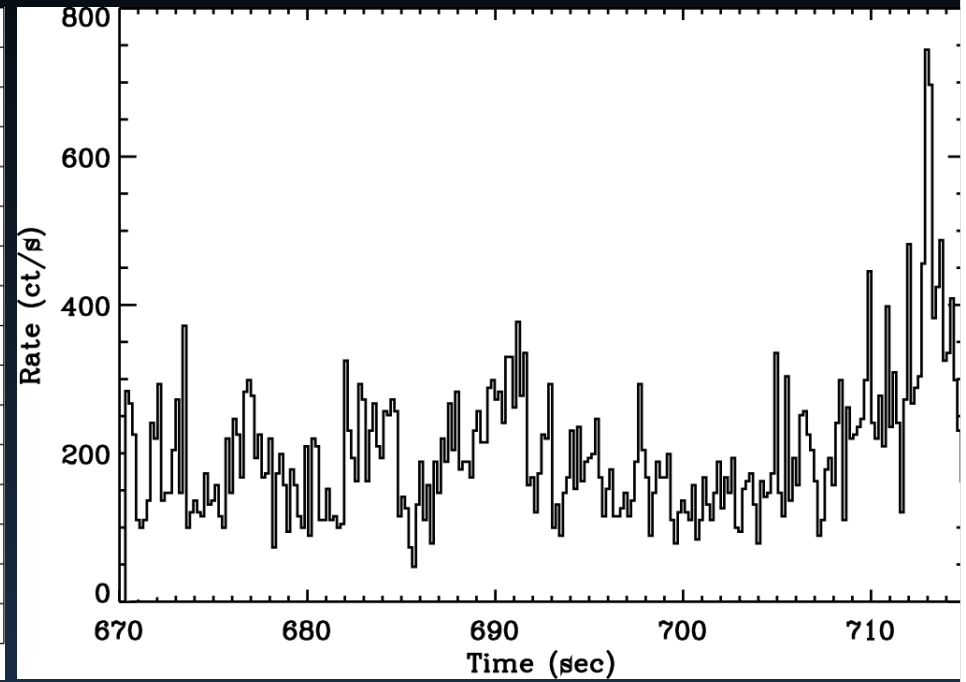
ACF and power spectrum are Fourier pairs

Power spectrum: distribution of variance, as function of frequency ( $\sim 1/\text{timescale}$ )

# Modern X-ray light curves

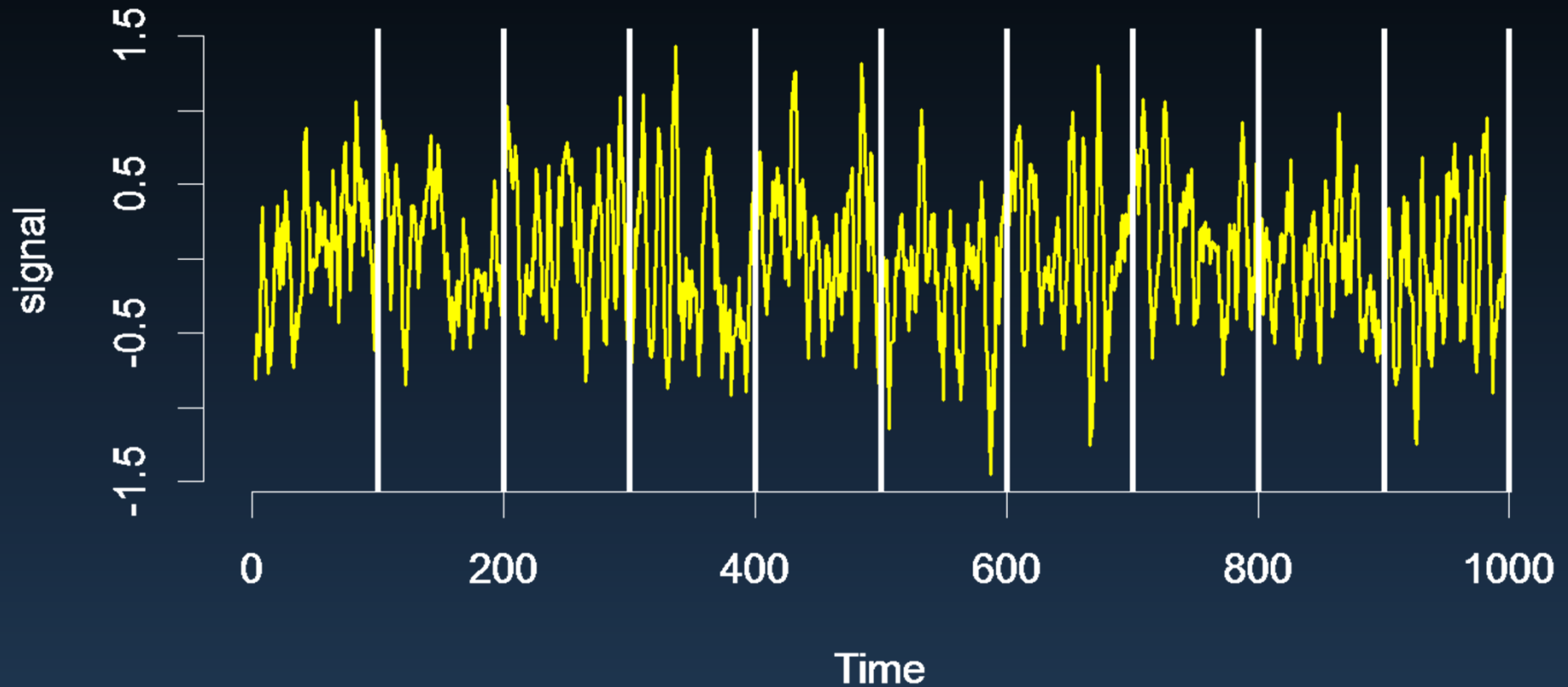


AGN (NGC 4051)  
with XMM (0.2-10 keV)  
0.5 day of data, with 50s resolution



XRB (GX 339-4)  
with XMM (0.2-10 keV)  
0.5 s of data, with  $\sim 0.2$ s resolution

# Standard recipe



The most popular spectral estimate (in astronomy, at least) is the averaged periodogram: raw periodograms from each of  $M$  non-overlapping intervals are averaged. 'Barlett's method' after M. S. Bartlett (1948, *Nature*, 161, 686-687)

# Standard recipe: Power spectrum analysis

observed = signal + noise  
(not quite right!)

Fourier transforms

$$x = s + n$$

$$X = S + N$$

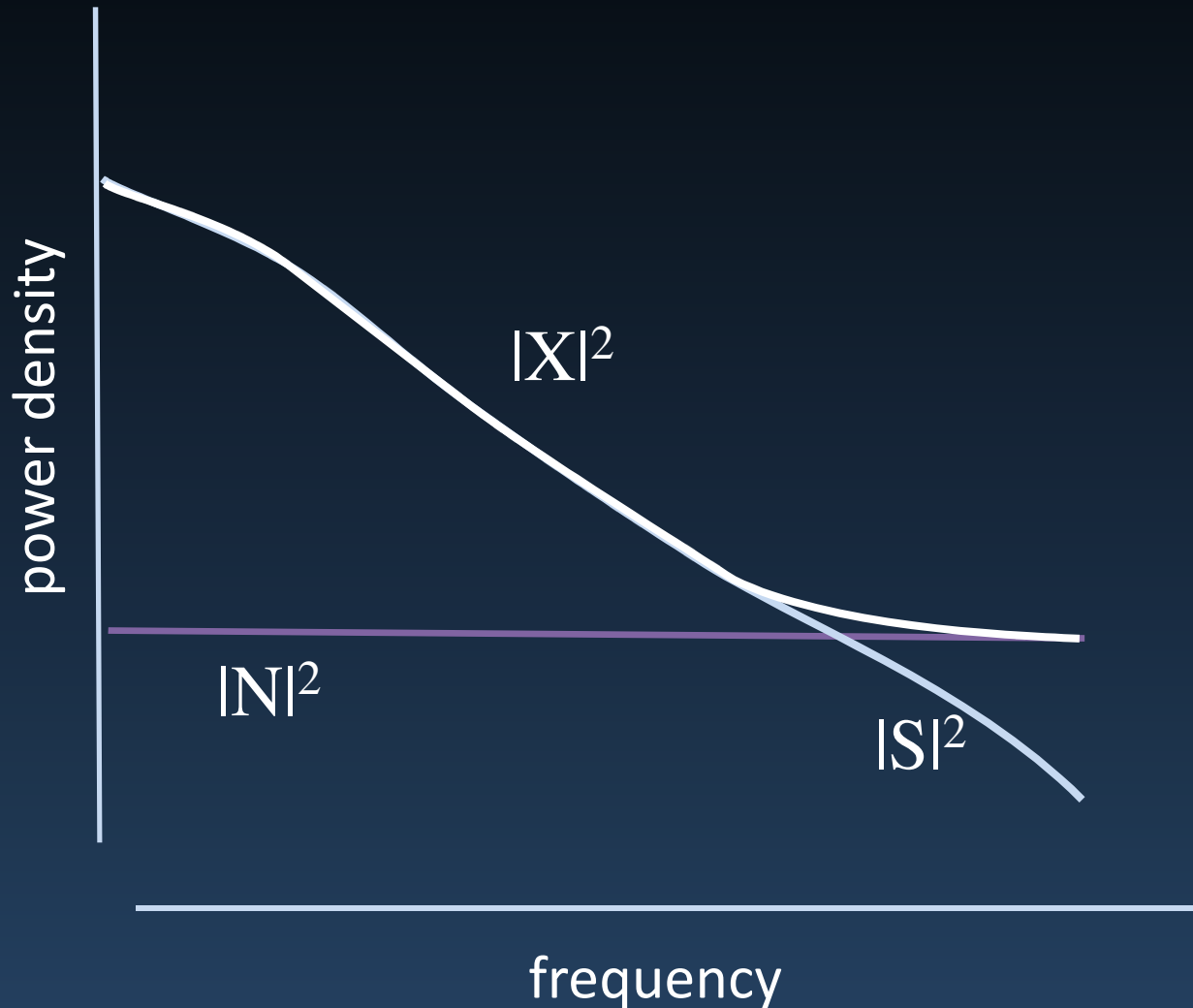
Periodogram

$$|X|^2 = |S|^2 + |N|^2 + \text{cross-terms}$$

Spectrum

$$P(f) = \langle |S|^2 \rangle = \langle |X|^2 \rangle - \langle |N|^2 \rangle$$

# Standard recipe: Power spectrum analysis





## A message from Captain Data:



*“More lives have been lost looking at the raw periodogram than by any other action involving time series!”*

(J. Tukey 1980; quoted by D. Brillinger, 2002)

what we get  
(periodogram)

what we want

$$I_j \sim P(f_j) \chi_2^2 / 2$$

chi-sq variable

large scatter (~100%) and asymmetric distribution to each periodogram point.  
And this is only true in the large  $N$  limit...

## A message from Captain Data:



*“More lives have been lost looking at the raw periodogram than by any other action involving time series!”*

(J. Tukey 1980; quoted by D. Brillinger, 2002)

what we get  
(on average)

Fejer kernel

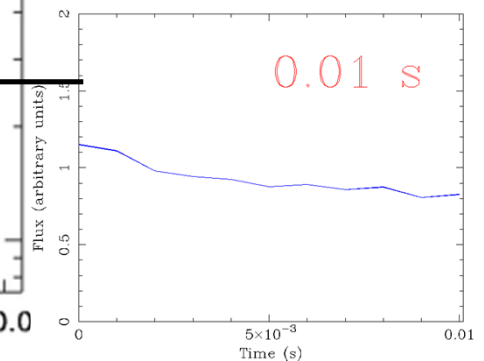
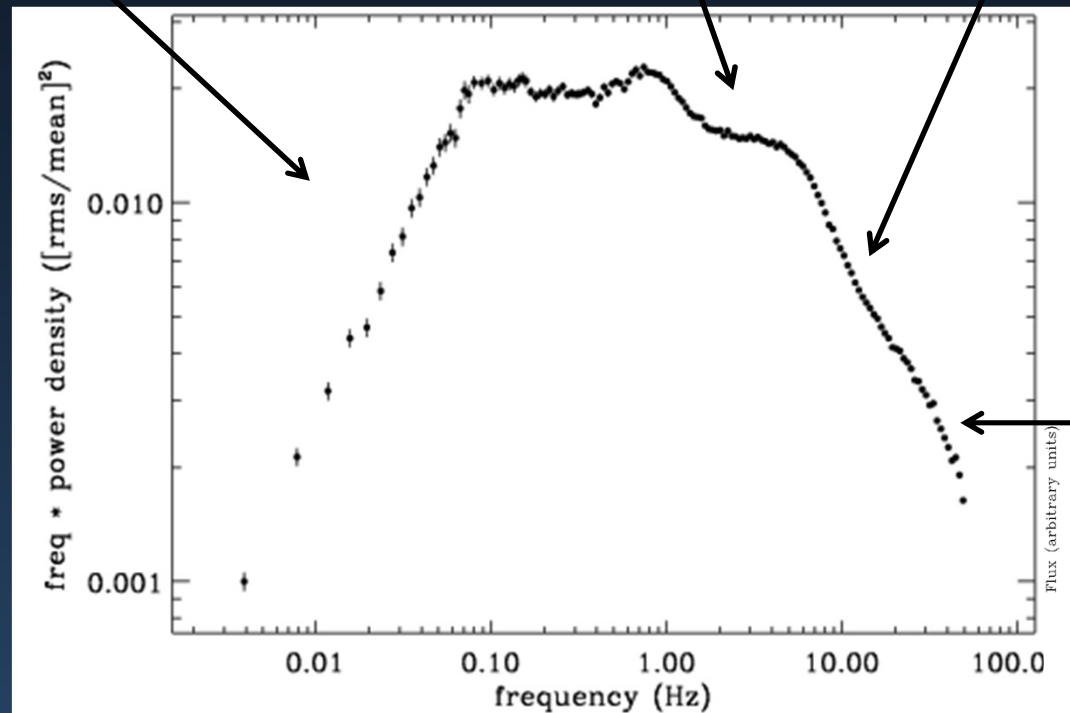
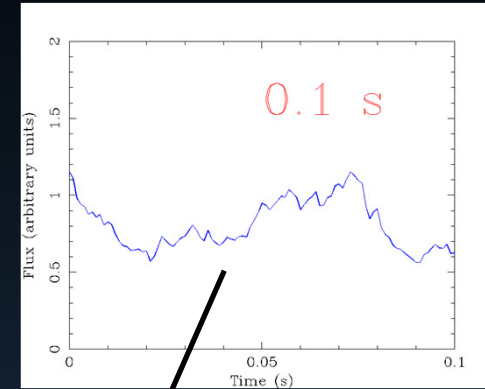
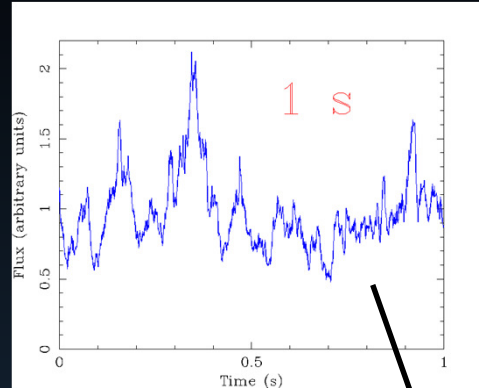
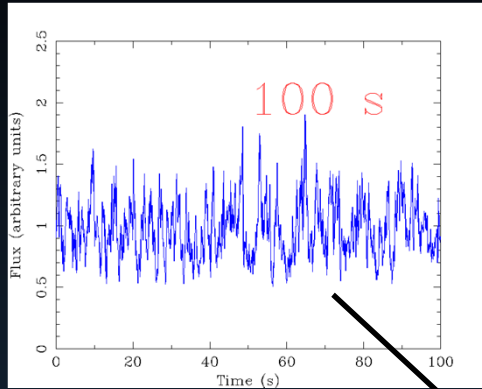
what we want

$$E[I_j] = \int_{-f(Nyq)}^{+f(Nyq)} F(f_j - f') P(f') df' = P(f) - bias[f]$$

even when we can “beat down” the intrinsic fluctuations in the periodogram, biases – in the form of *leakage* and *aliasing* – can be difficult to overcome.

Especially true when  $N$  not really large, and variability is still “red”

# Example power spectrum



# power spectral features (zoology)

## **Broad-band noise** (the “continuum”)

Previously modelled using piece-wise power laws

“soft state” power spectra often cut-off power law

Nowak (2000) and others showed Lorentzians work (for “hard state” power spectra)

See talks by L. Heil, A. Ingram (next)

**Quasi-periodic oscillations** (QPOs) are “peaked noise” (not periods) – bewildering phenomenology (but getting simpler?)

See S. Motta’s, Rapisarda’s and Steven’s talks (next)

In AGN?

See W. Alston’s talk (next)

# X-ray binary power spectra

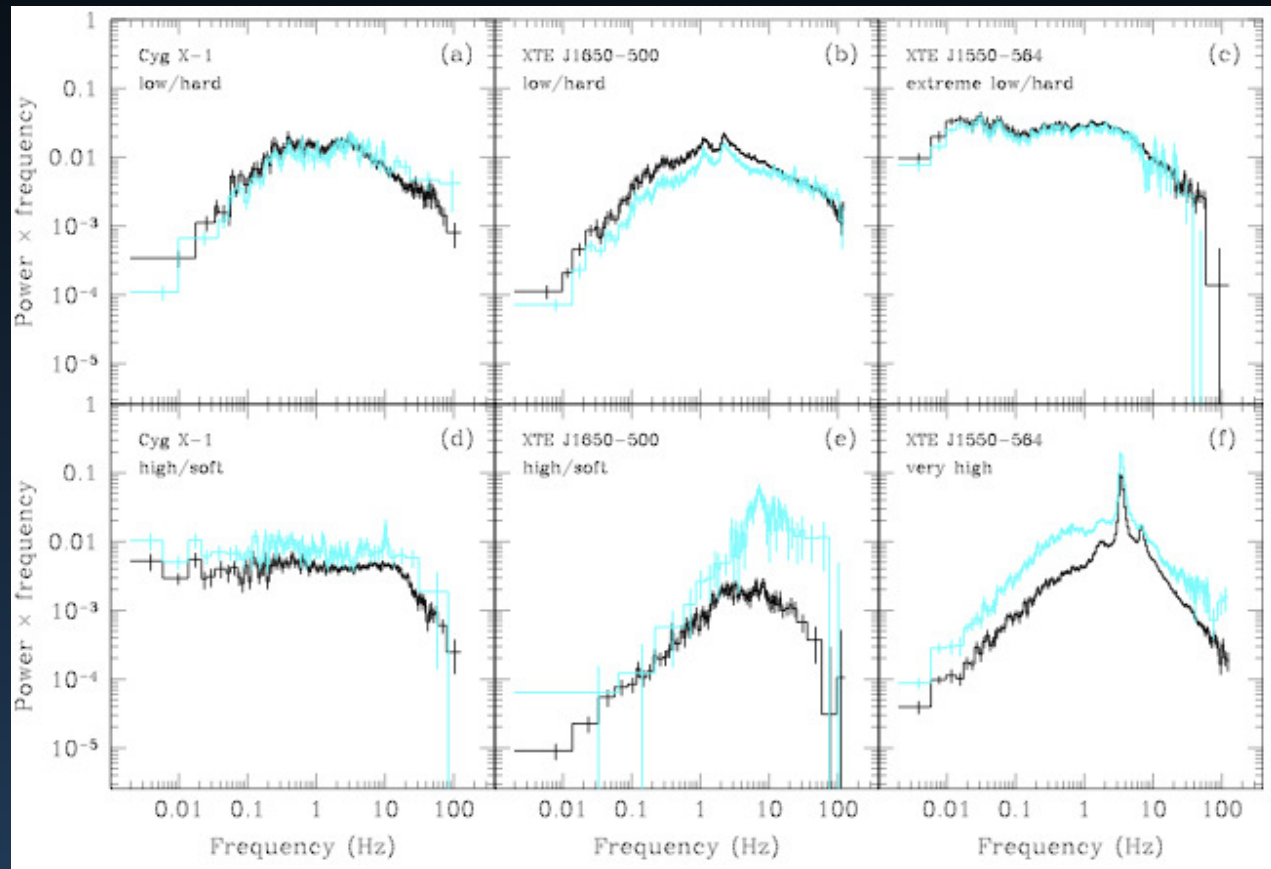
Usually dominated by  
“red noise”

Very broad range of  
frequencies

Broken power-law(s)

Or sum of broad  
Lorentzians

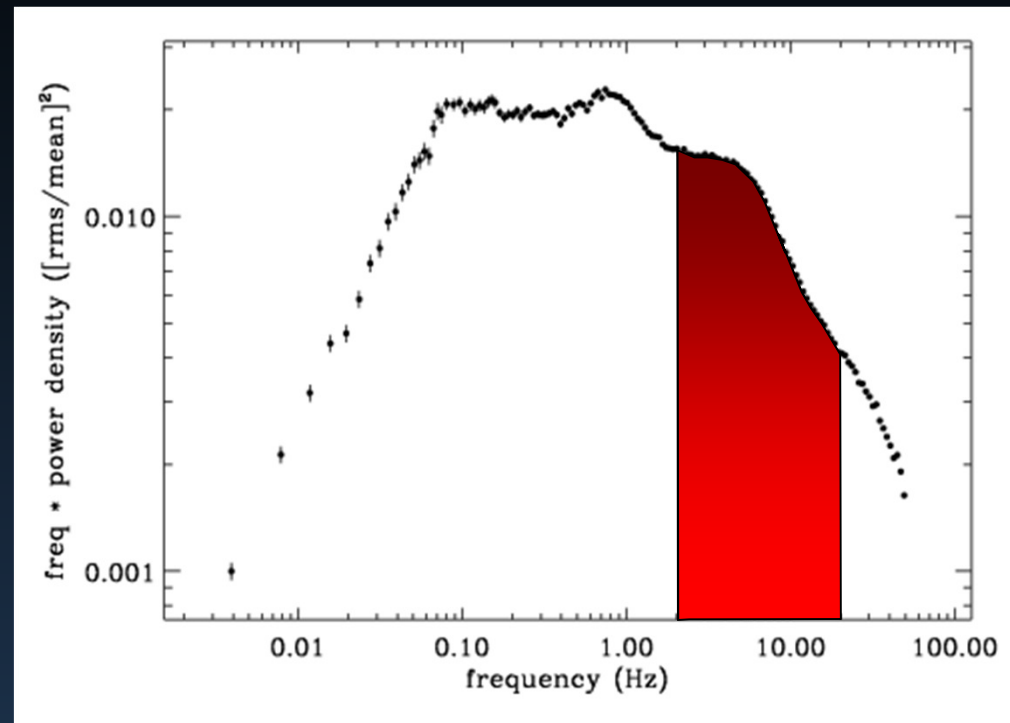
QPOs (width:  $f/\Delta f > 2$ )



Done & Gierlinski (2005)

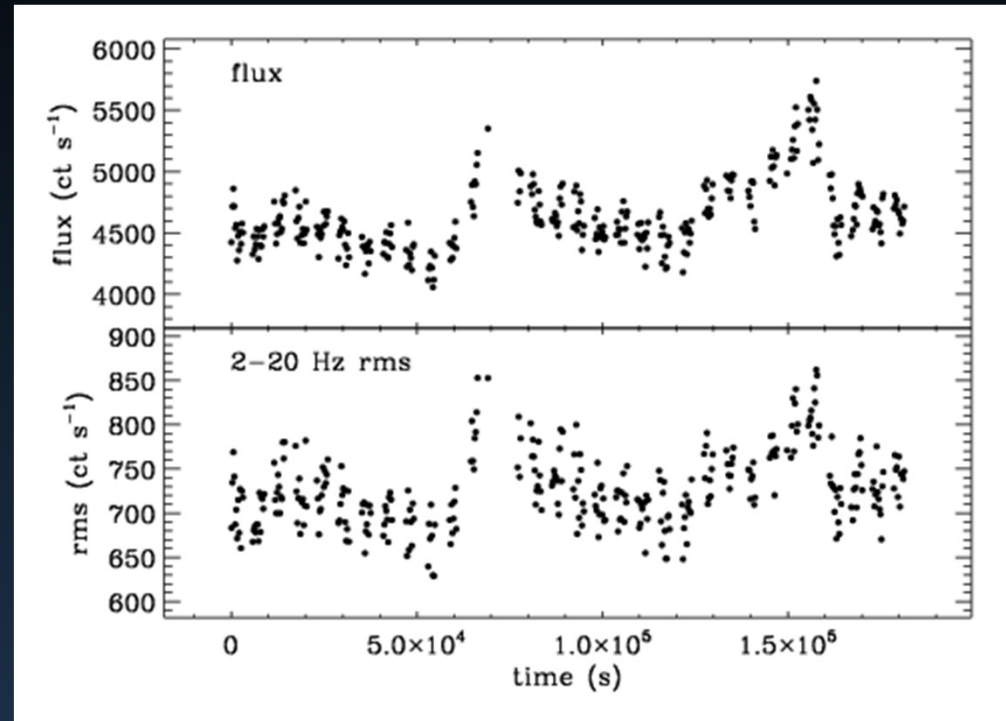
reviews by van der Klis (1989, 2006), Remillard & McClintock (2004, 2006)

# Estimating rms



Variability dominated by broad-band noise (= aperiodic, stochastic, random)  
Power spectrum contains all useful information *iff* stationary, Gaussian process  
⇒ mean and variance (rms) do not change with time  
We can integrate 2-20 Hz in many short data segments ( $n\Delta t \geq 0.5$  s) and see...

# rms-flux relation I

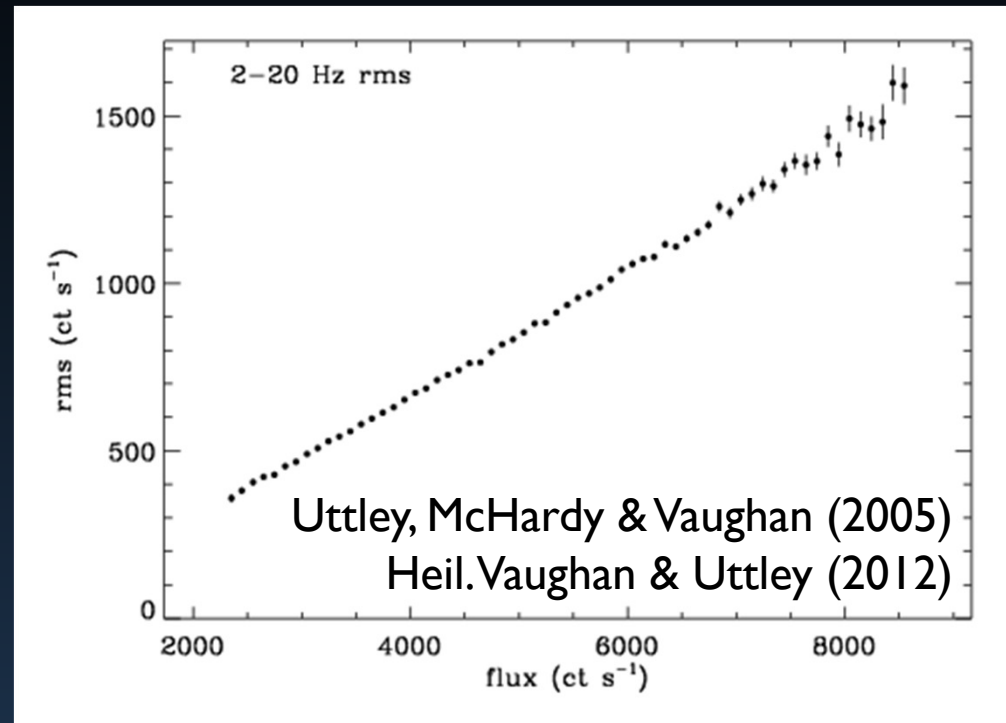


Average X-ray count rate (flux) over  $\Delta T=256$  sec segments ( $=65536\Delta t$ )

Calculate 2-20 Hz rms for each segment from periodogram

Compare time series of  $\langle \text{flux} \rangle$  with rms

# rms-flux relation II



Calculate  $\langle \text{flux} \rangle$  and rms using  $\Delta T=1$  sec segments  
Average rms in flux bins to measure  $\langle \text{rms} \rangle$  against  $\langle \text{flux} \rangle$   
Use  $\langle \text{rms} \rangle$  to reduce intrinsic scatter on rms  
Strong linear relationship



# In *all* accretion discs...?

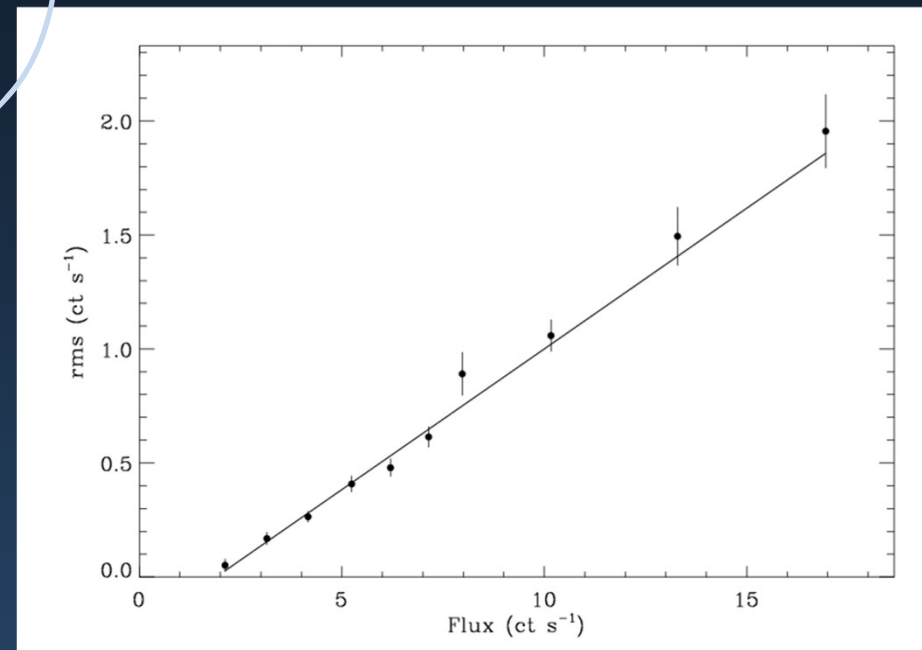
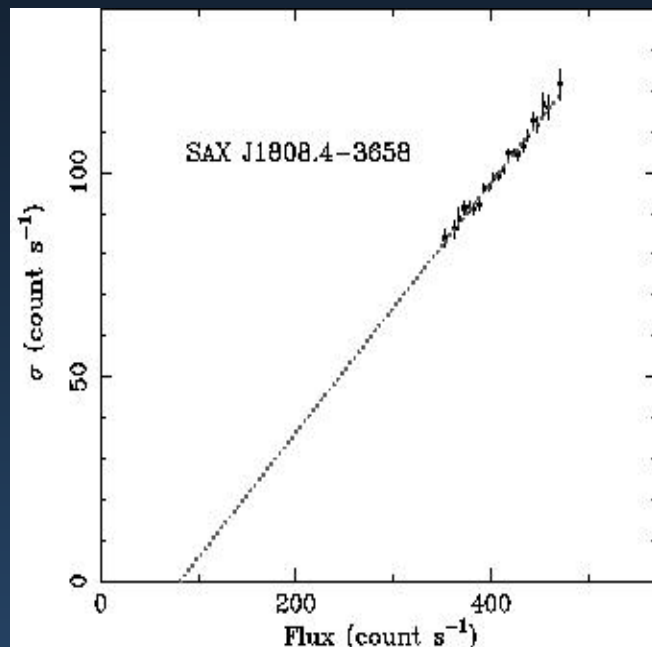
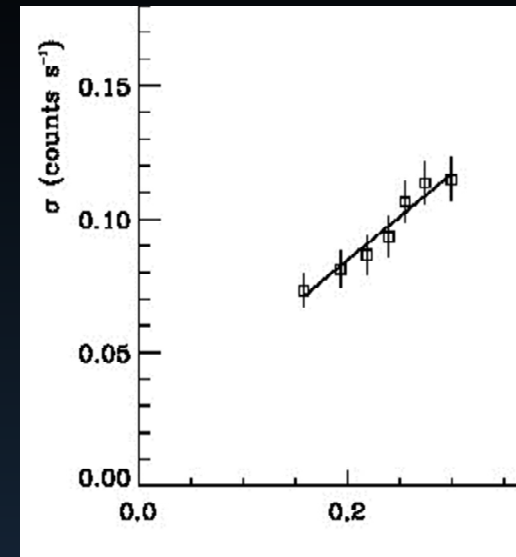
Optical fast variability of XRBs (Gandhi 2009)

2 ULXs (Heil & Vaughan 2009)  
[+Hernandez-Garcia, Vaughan et al. 2015]

many Seyfert 1s (Vaughan et al. 2011)

neutron star XRBs (Uttley & McHardy 2001)

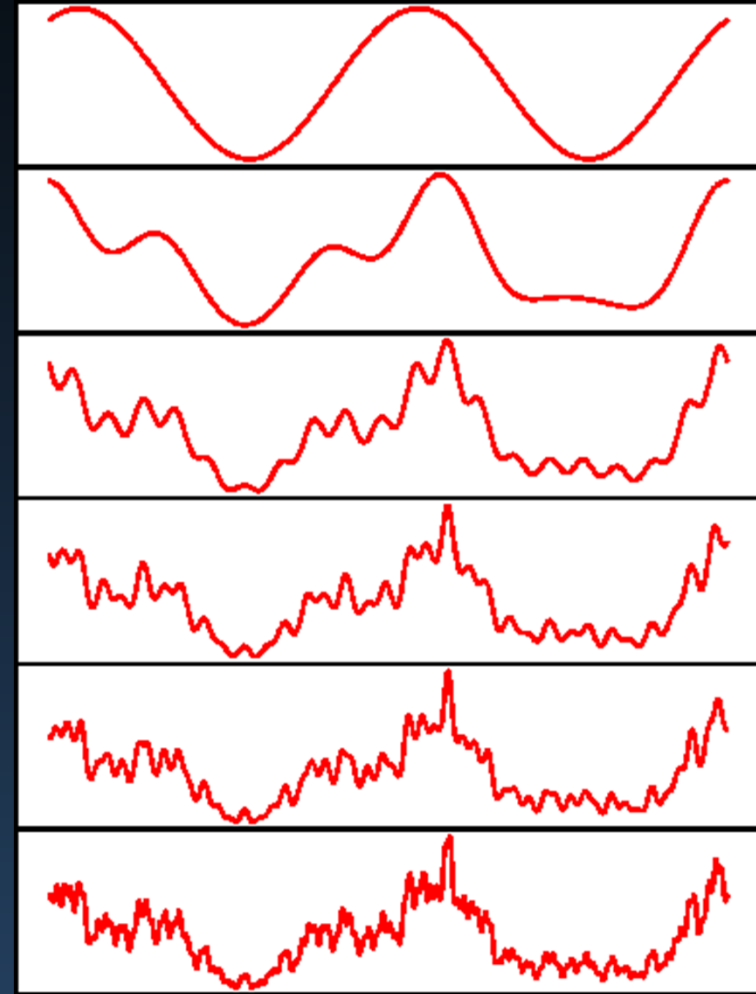
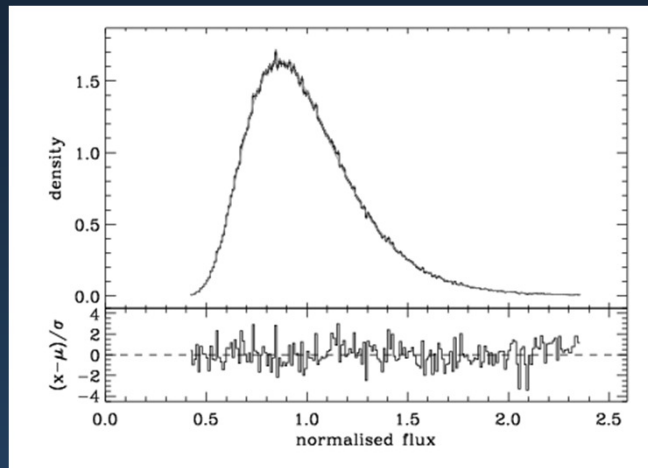
Also CVs (see Scaringi et al. 2014, 2015)



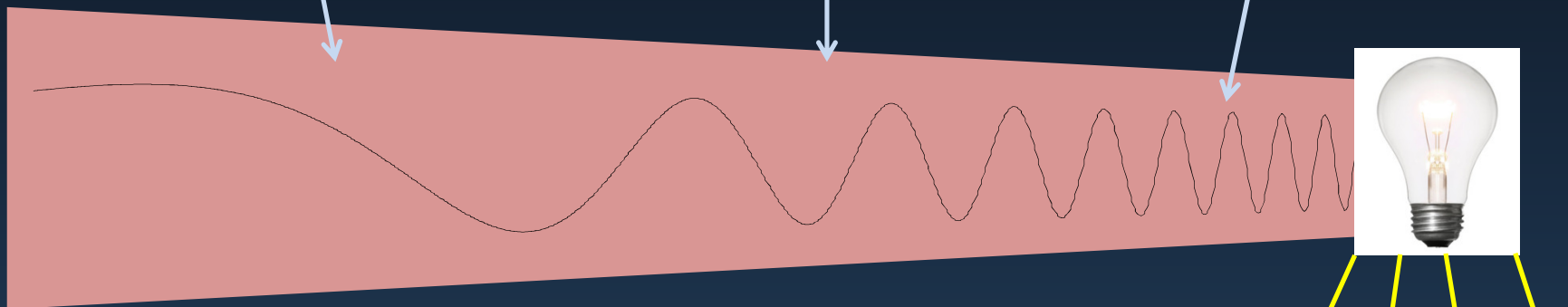
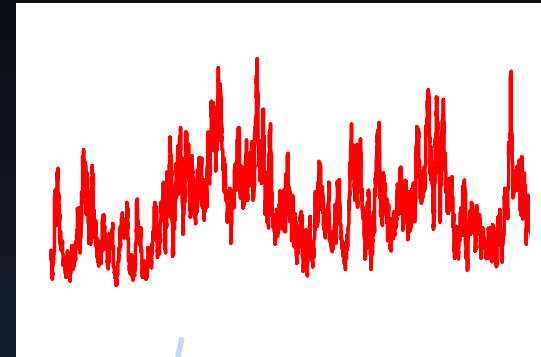
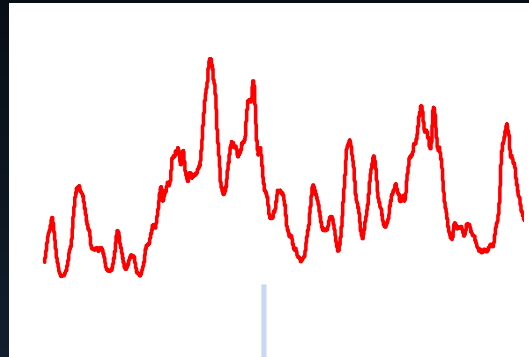
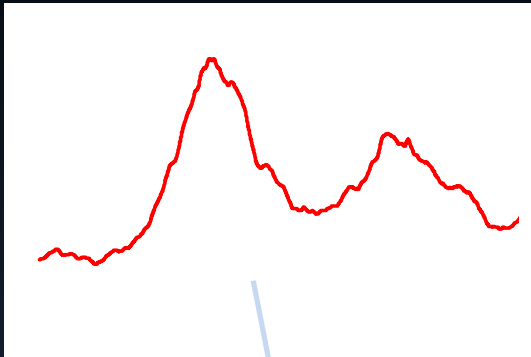
# what does rms-flux mean?

“amplitude modulation”:  
multiplicative coupling of  
variations on *all* timescales

The multiplicative analogue of a  
Gaussian (normal) stationary  
process is a *lognormal* stationary  
process.



# What causes the variability?



(Lyubarskii 1997; Churazov et al. 2001; Kotov et al. 2001; King et al. 2004; Arevalo & Uttley 2006; Cowperthwaite & Reynolds 2014)

See talk by A. Ingram (next)

# Other models are available

Are the  $F_x$  variations intrinsic (i.e.  $\sim L_x$ )?

Or is  $L_x \sim$  constant and  $F_x$  varies due to extrinsic factors (e.g. line of sight absorption)

**An important question!**

Variable absorption does sometimes cause variability in AGN (see yesterday's talks)

X-rays are “harder when fainter” (Seyfert 1s) – makes sense if absorption

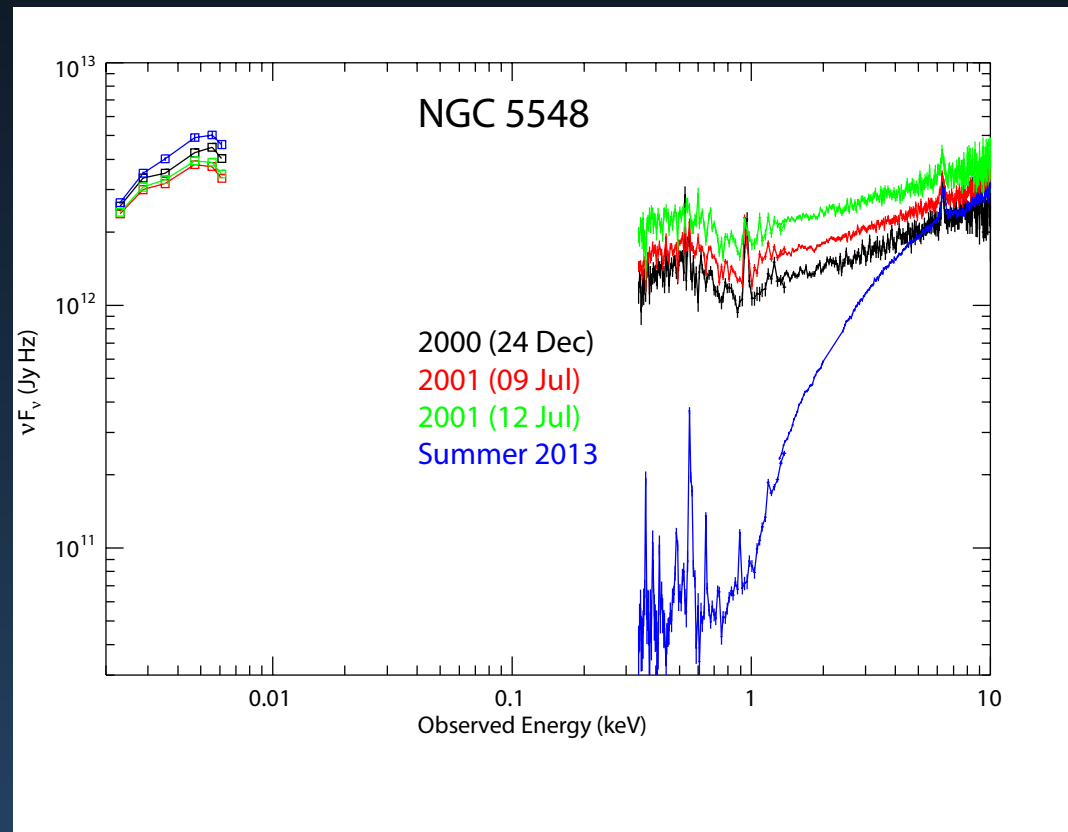
Can it all be “just absorption”? (see session VIII)

# Absorption variability

Not the general solution. Needs to explain:

- broad-band noise power spectrum (in common with XRBs, CVs)  
(see also the AGN-XRB scaling results: McHardy et al. 2006 etc.)
- rms-flux relation (in common with XRBs, CVs)
- rev. mapping (yesterday's talks) assumes point-like central source (and that works ok)
- X-ray / opt correlations

Much simpler if  $L_x$  is variable,  
and absorption (sometimes)  
varies in front of that.



Mehdipour et al. (2015)

# Looking ahead

- rapid, recent progress in X-ray “spectral-timing” (session VII, VIII). Likely to be more advances in methods and models
- need to cope better with uneven sampling (AGN people especially)
- better coordination of studies across wavebands (e.g. optical/IR vs. soft/hard X-rays) – for both XRBs and AGN
- surprises: e.g. the ultra-pulsar (session IX)
- ASTROSAT (2015+?)