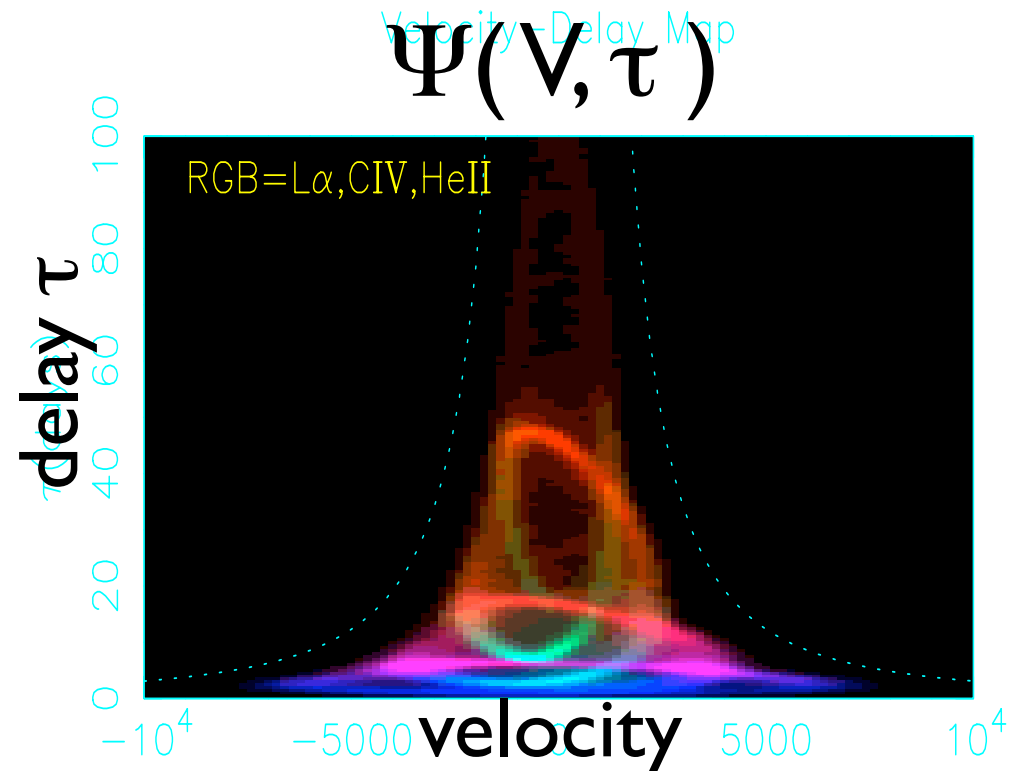


# Echo Mapping of Active Galactic Nuclei

*Keith Horne: (SUPA St Andrews)*

- **Indirect imaging** using light travel **time delays** and **doppler shifts**.
- **Micro-arcsecond** maps of accretion flows onto AGN black holes.
- *Black Hole masses.*
- *Geometry, Kinematics, Ionisation structure of their Accretion Flows..*

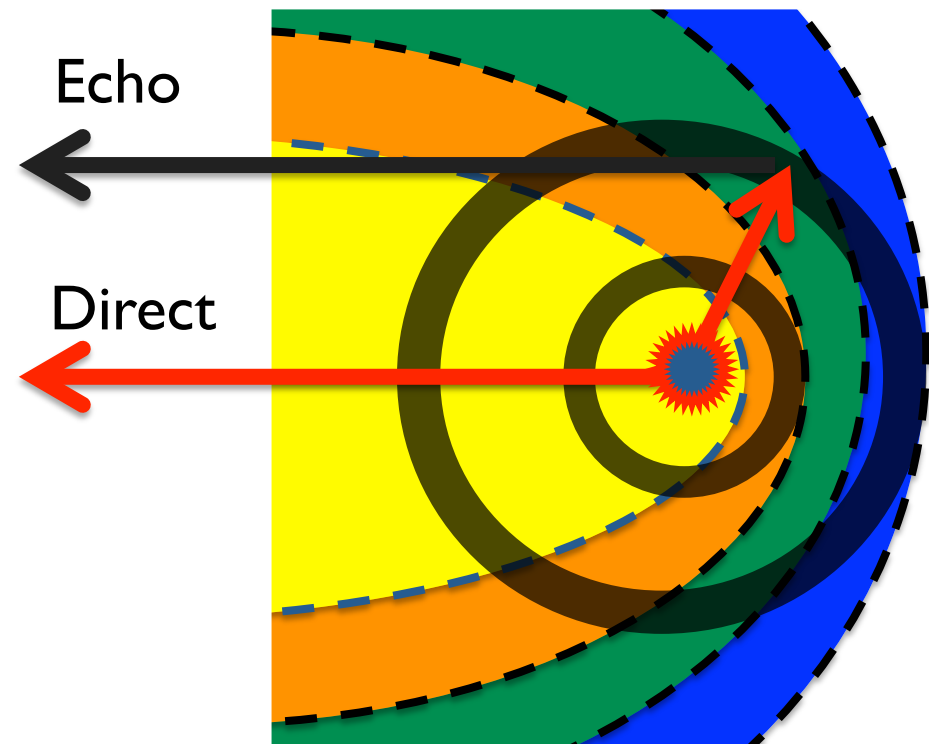
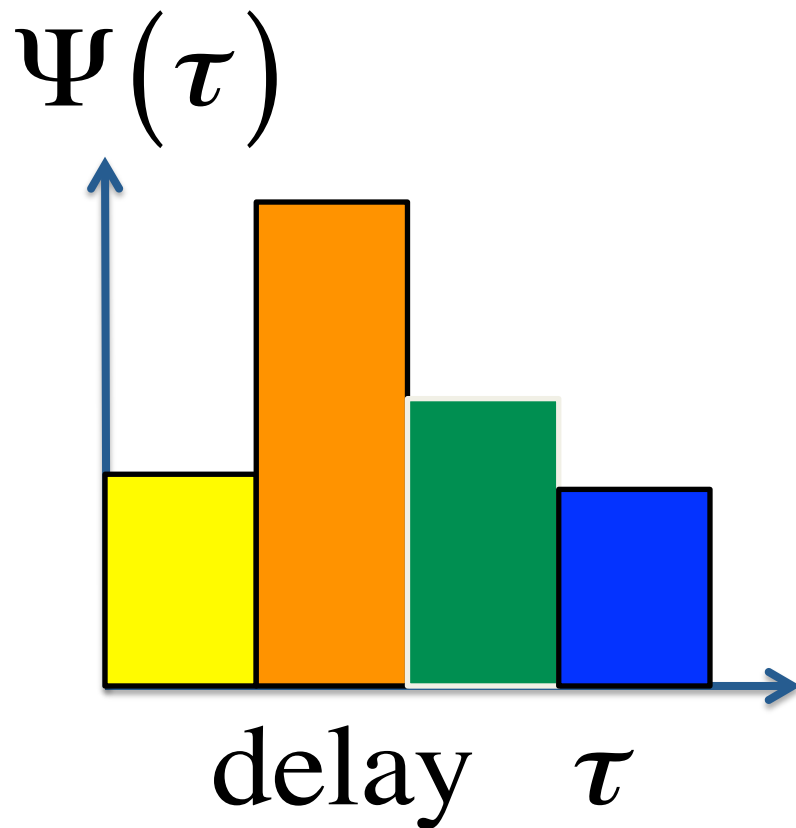
“Model-independent”  
projection of the 6-D  
phase space, resolved  
on doppler shift  $V$  and  
time delay  $\tau$ , for  
different emission lines.



# Echo Tomography:

$$f(\lambda, t) \Rightarrow \Psi(V, \tau)$$

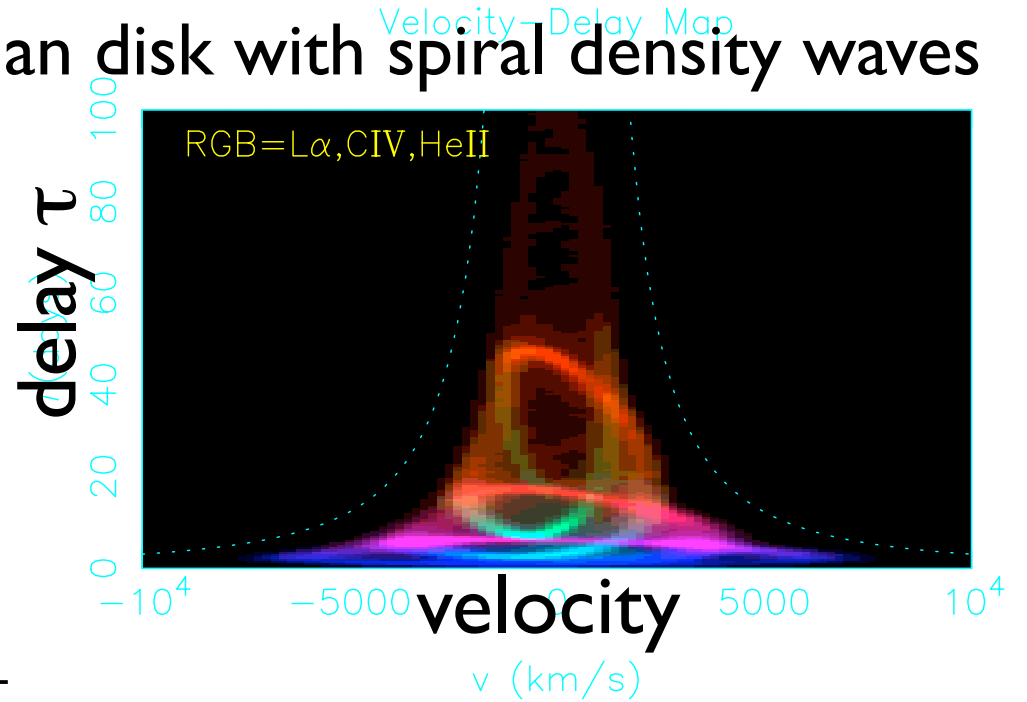
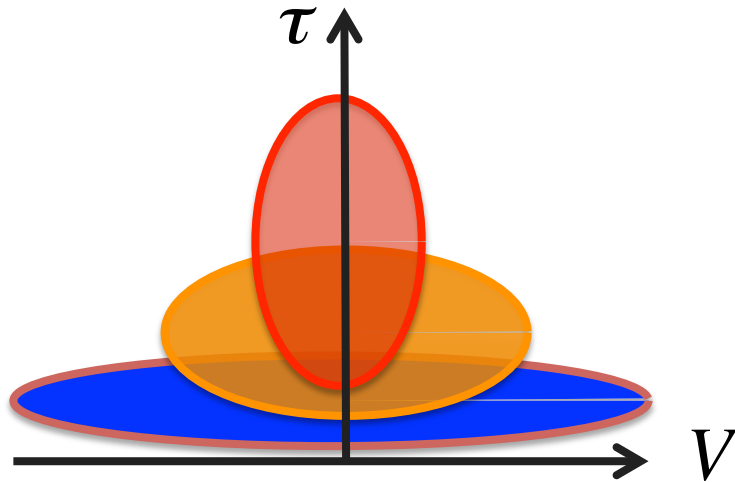
Light travel time delay  $\tau$  “slices up” the region on iso-delay paraboloids.



$$\tau = \frac{R}{c} (1 + \cos \theta)$$

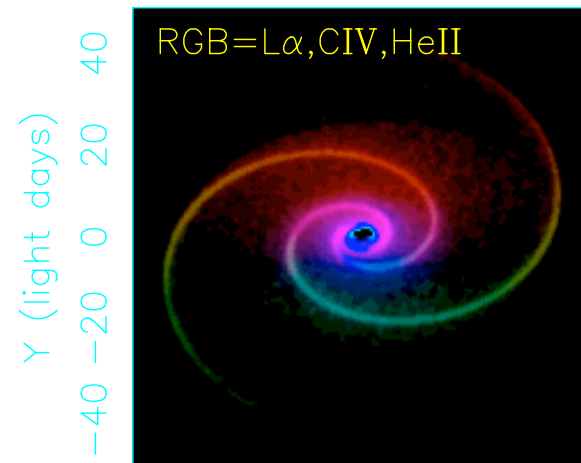
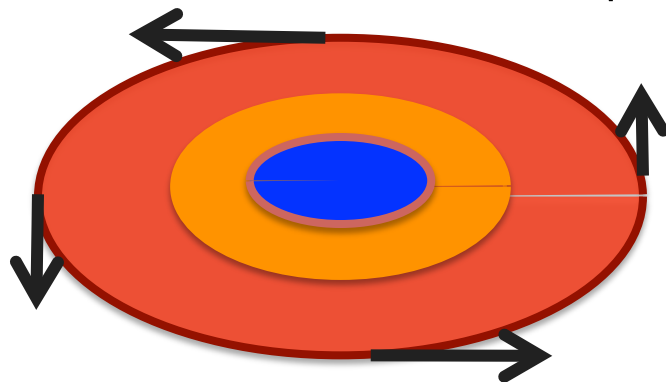
# Velocity-Delay Maps $\Psi(V, \tau)$

Simulation: Photo-ionised Keplerian disk with spiral density waves



$$\tau = \frac{R}{c} (1 + \sin i \cos \theta) \quad V = \sqrt{\frac{GM}{R}} \sin i \sin \theta$$

Sky view:

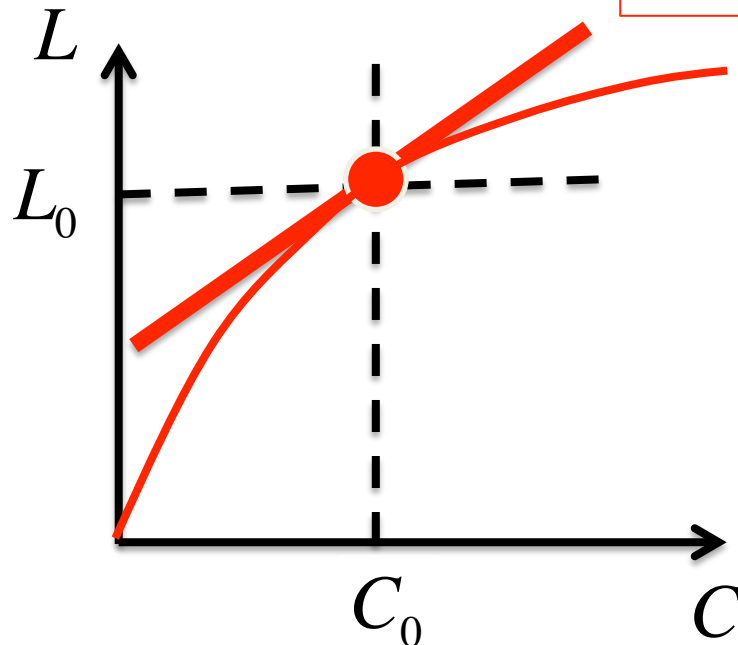


# Linearised Echo Model

*Lightcurve model:*

*Continuum:*  $C(t) = C_0 + \Delta C(t)$

*Line:*  $L(t) = L_0 + \int_0^{\tau_{\max}} \Psi(\tau) \Delta C(t - \tau) d\tau$



*Tangent-curve approximation to **non-linear** responses of photo-ionised emission lines to continuum variations.*

*Neglects **curvature** of  $L(C)$*

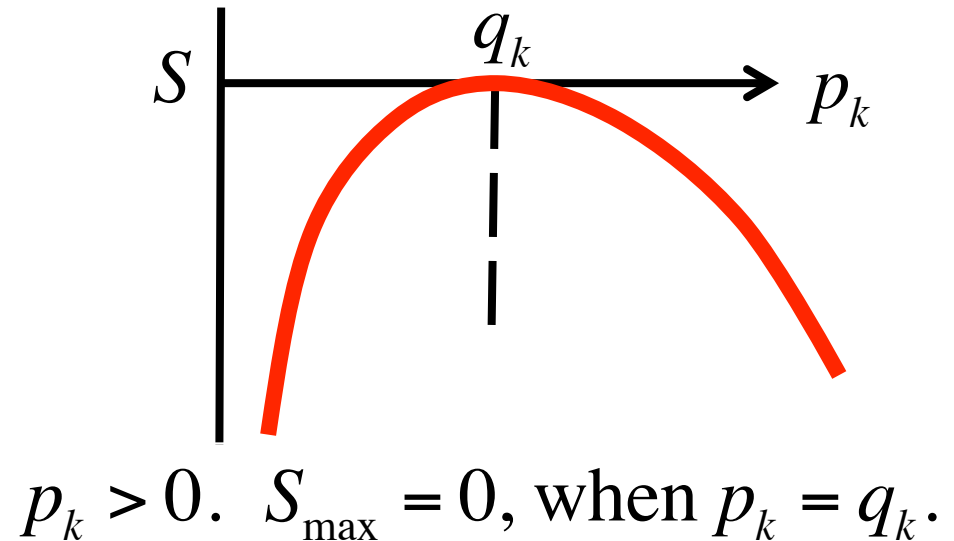
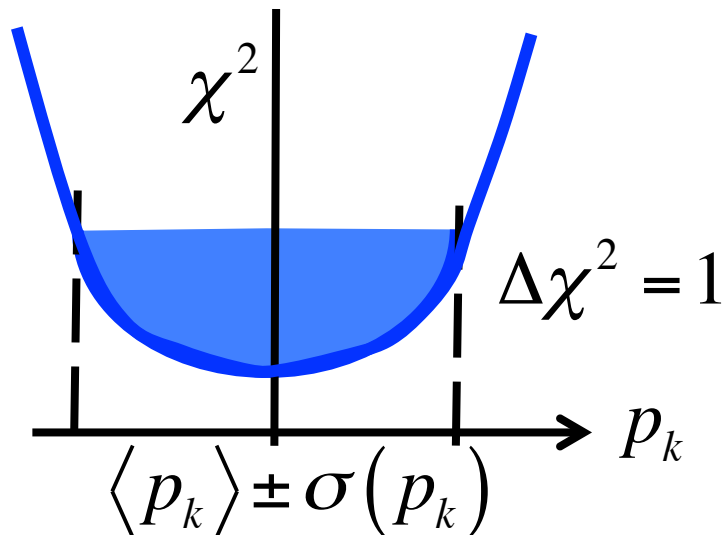
model parameters :  $C(t), L_0, \Psi(\tau)$  .

# MEMECHO : Maximum Entropy Fits

$$\Pr(\text{Model} \mid \text{Data}) \propto \exp\{-\chi^2 / 2\} \exp\{\alpha S / 2\}$$

$$\chi^2 = \sum_i^{N_{\text{dat}}} \left( \frac{D_i - \mu_i}{\sigma_i^2} \right)^2 \quad S = \sum_k^{N_{\text{pix}}} p_k - q_k - p_k \ln(p_k / q_k)$$

- 1. **Fit the data**  $\alpha \Rightarrow 0$
- 2. **Keep it "simple"**.  $\alpha \Rightarrow \infty$



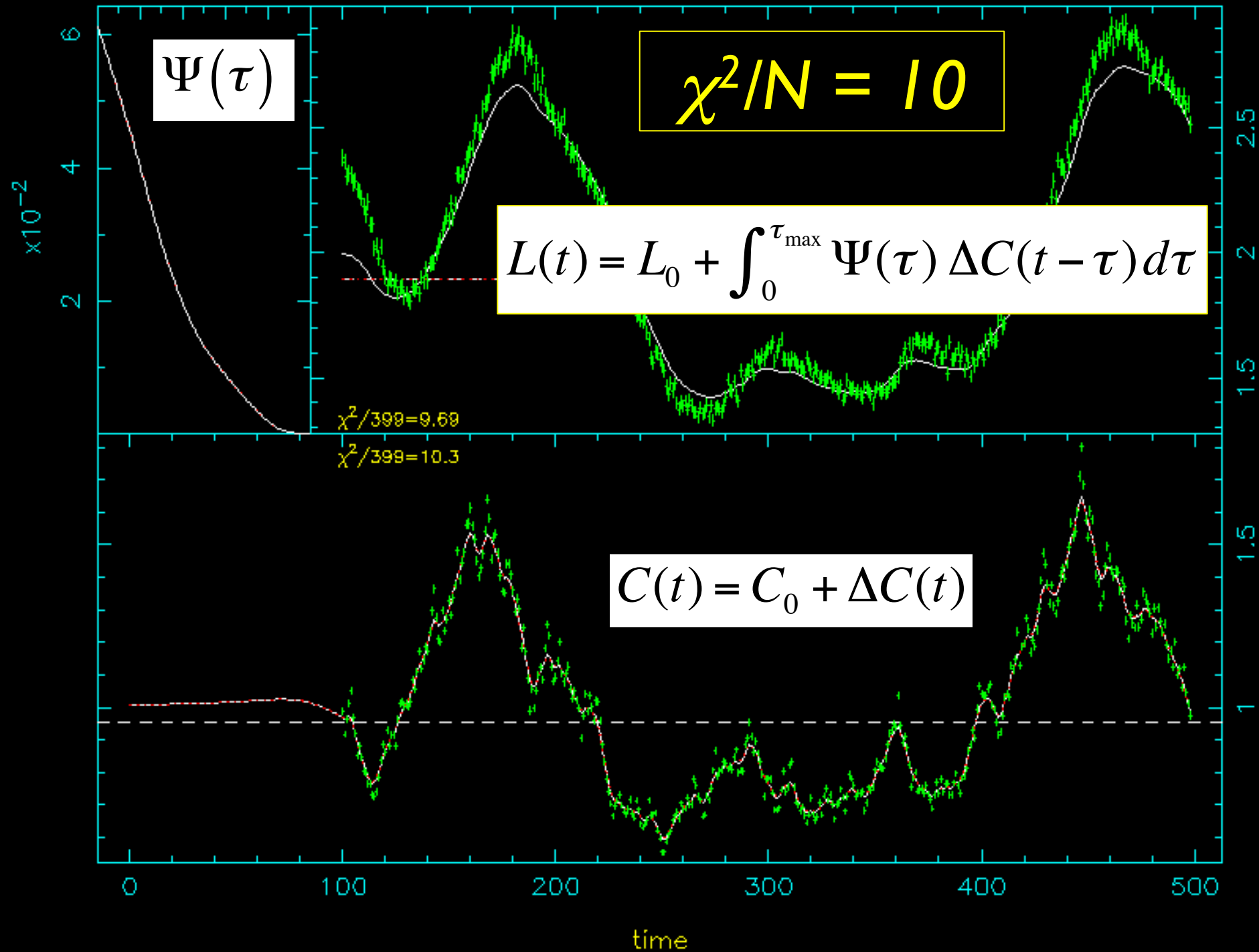
default values: e.g.  $q_k = (p_{k-1} p_{k+1})^{1/2}$

delay

MEMECHO  $\chi^2/798=10.0$  TEST=0.00007

0 20 40 60 80 100

C=10 E=Y W=1

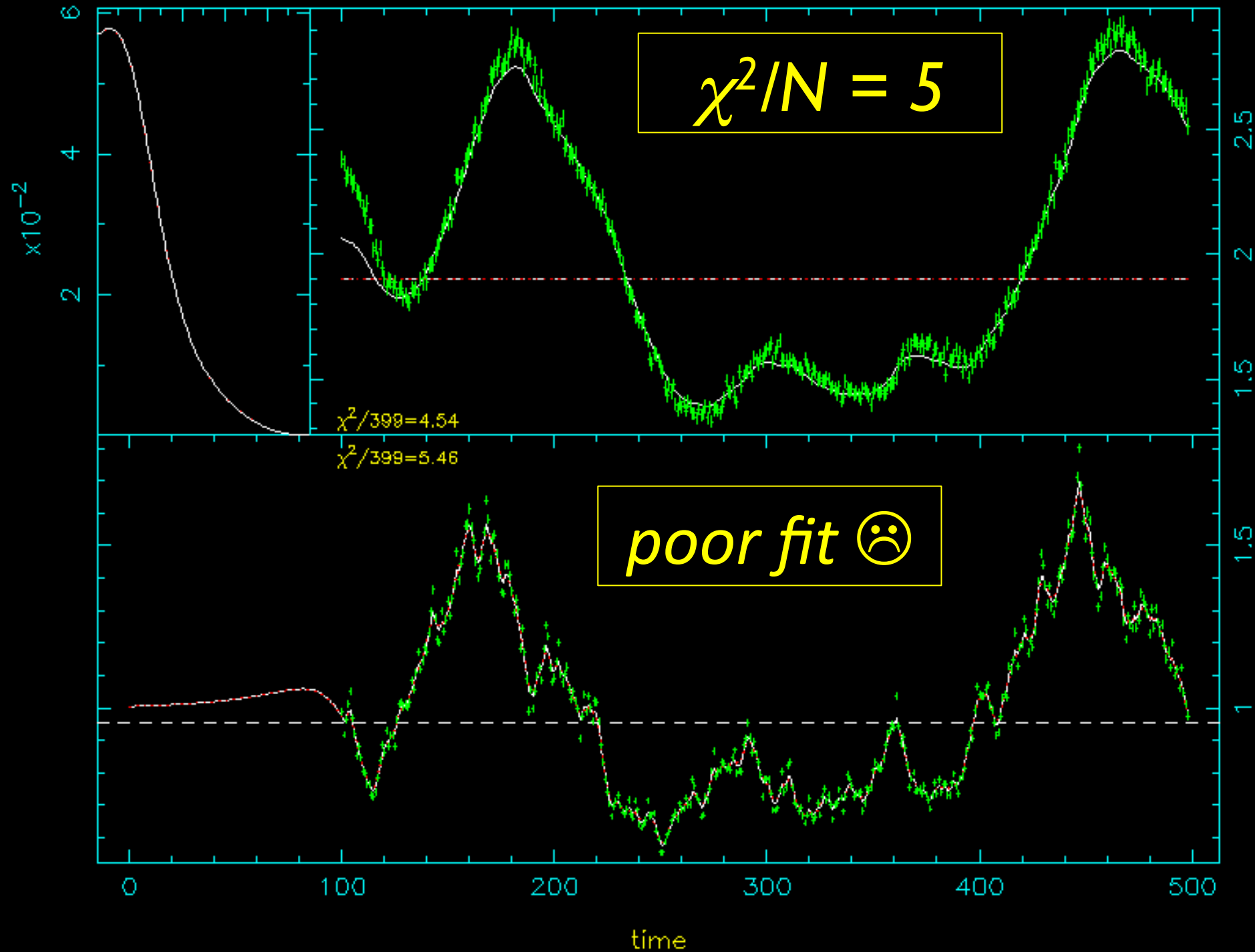


delay

MEMECHO  $\chi^2/798=5.00$  TEST=0.00006

C=5 E=Y W=1

0 20 40 60 80 100

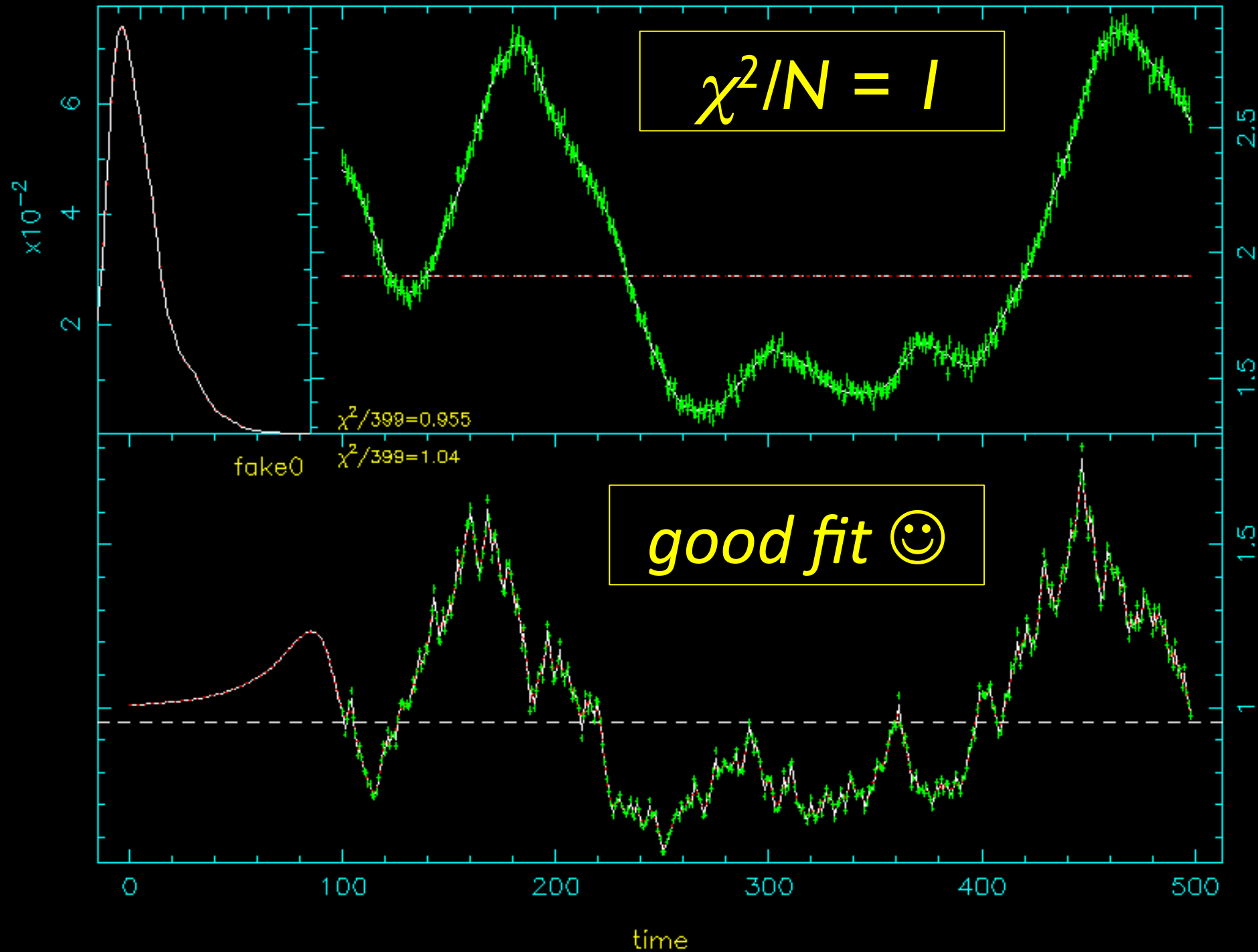


delay

MEMECHO  $\chi^2/798=1.00$  TEST=0.00007

0 20 40 60 80 100

C=1 E=Y W=1



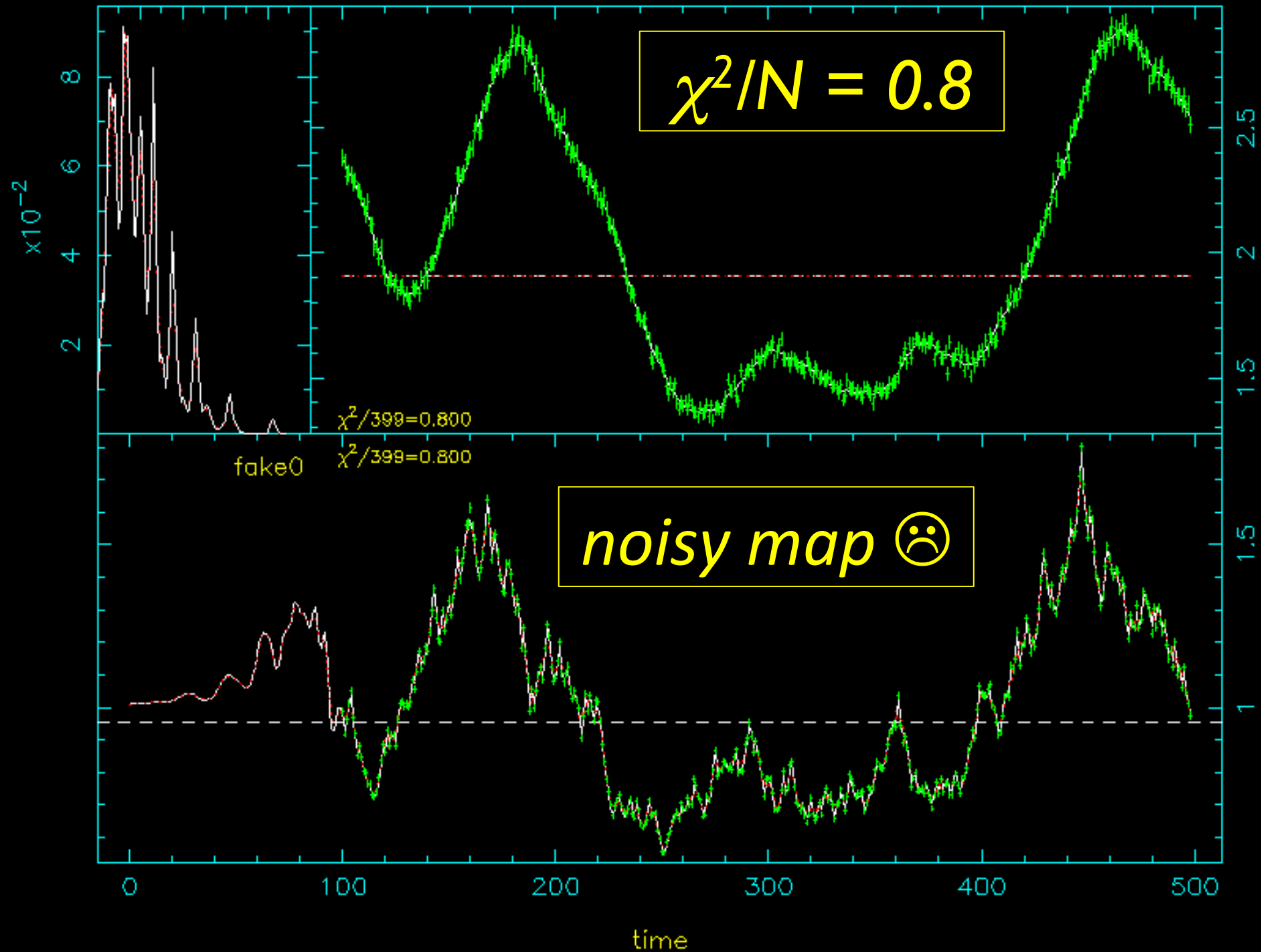


delay

MEMECHO  $\chi^2/798=0.800$  TEST=0.00007

0 20 40 60 80 100

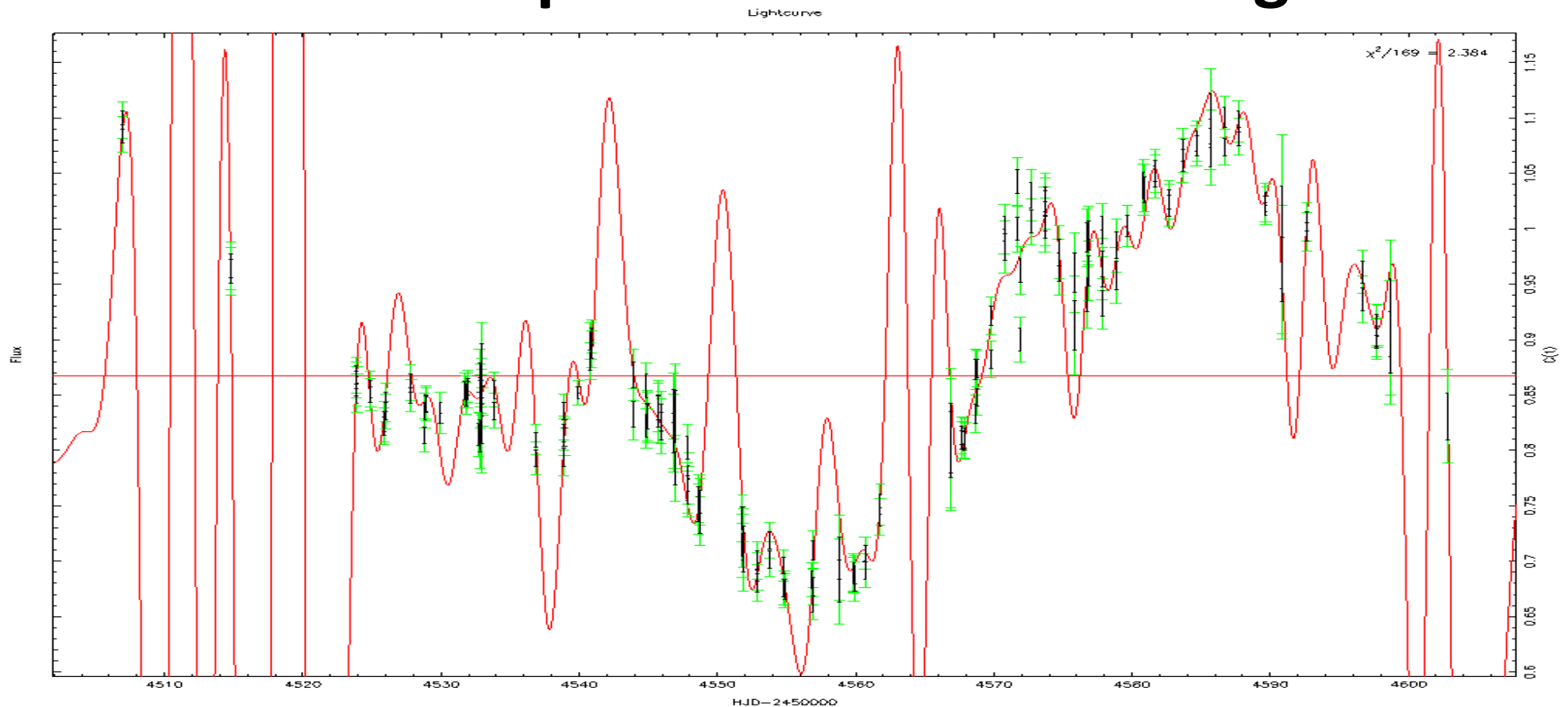
C=0.8 E=Y W=1



**Problem:**  $\chi^2 - \alpha S$  fails to control the lightcurve model in data gaps and extrapolation regions.

**Solution: 1:** Use good data with good error bars.

**2:** Use prior info about AGN lightcurves.



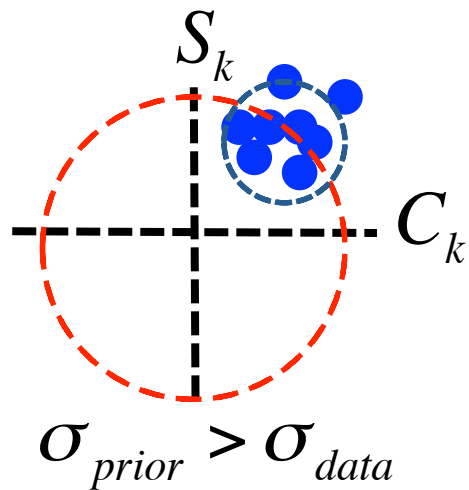
# Cure: Power Spectrum Prior

Lightcurve model: 
$$\mu(t) = \sum_{k=1}^K C_k \cos(2\pi \omega_k t) + S_k \sin(2\pi \omega_k t)$$

**Gaussian priors on fourier amplitudes, power - law power spectrum:**

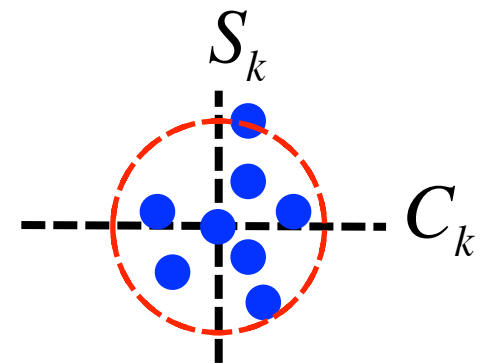
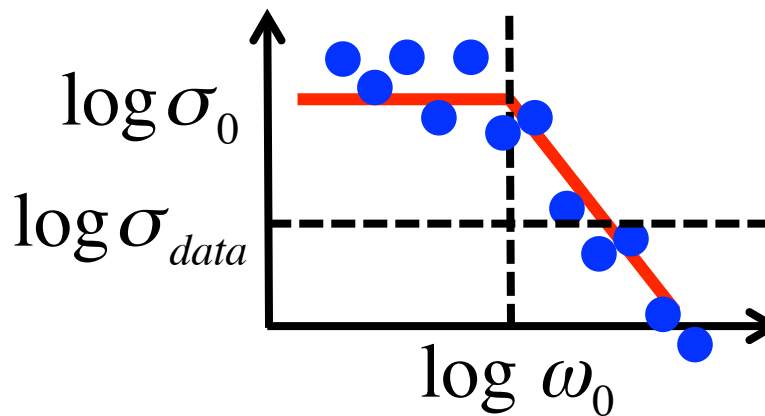
$$\text{Prior}(C_k, S_k) = \frac{1}{2\pi \sigma_k^2} \exp\left\{-\frac{C_k^2 + S_k^2}{2\sigma_k^2}\right\} \quad \sigma_k^2 = \frac{\sigma_0^2}{1 + (\omega_k/\omega_0)^\alpha}$$

Parameters:  $C_k, S_k, \sigma_0^2, \omega_0, \alpha$



$\sigma_{\text{prior}} > \sigma_{\text{data}}$

**strong data**



$\sigma_{\text{prior}} < \sigma_{\text{data}}$

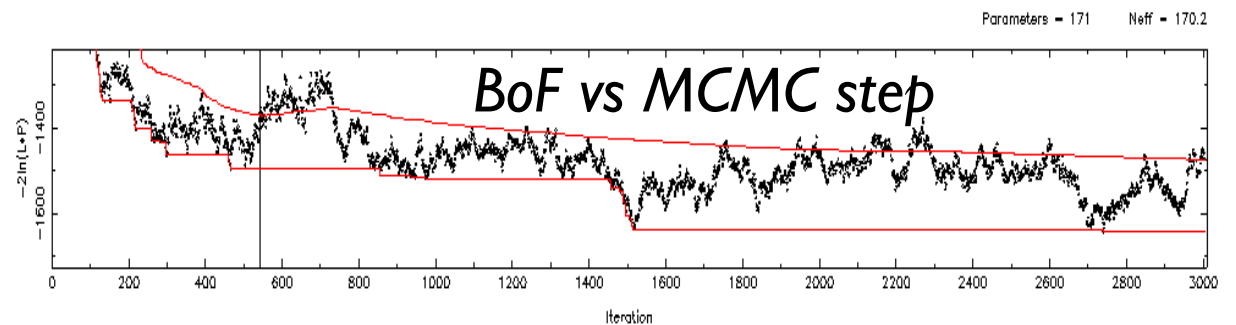
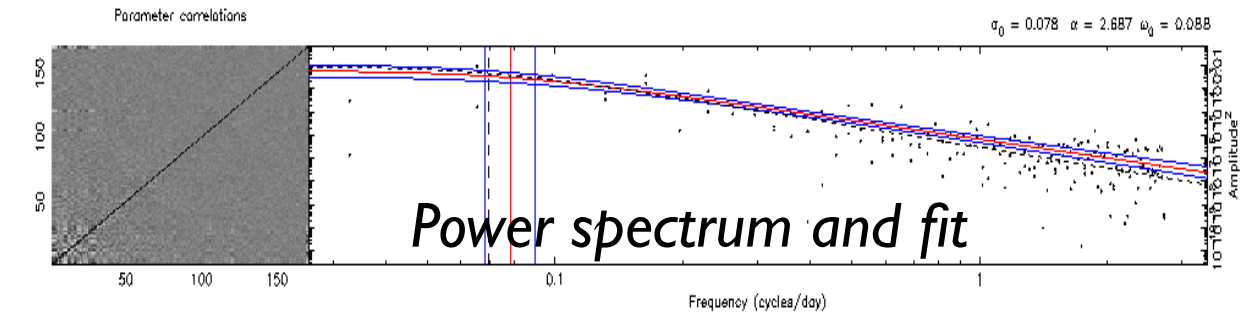
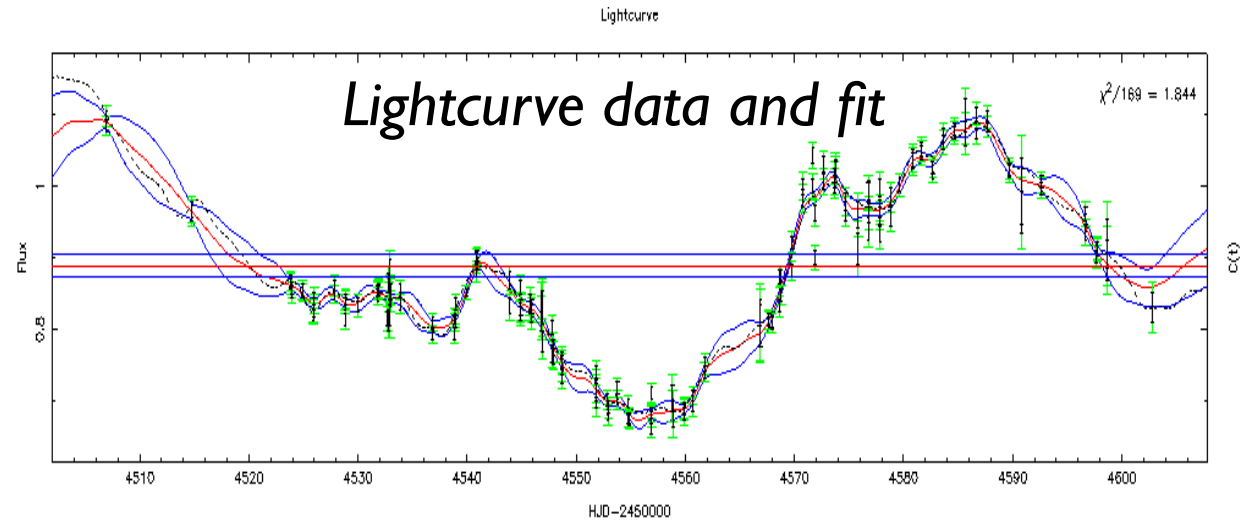
**weak data**

# MCMC fit with Power-Spectrum Prior

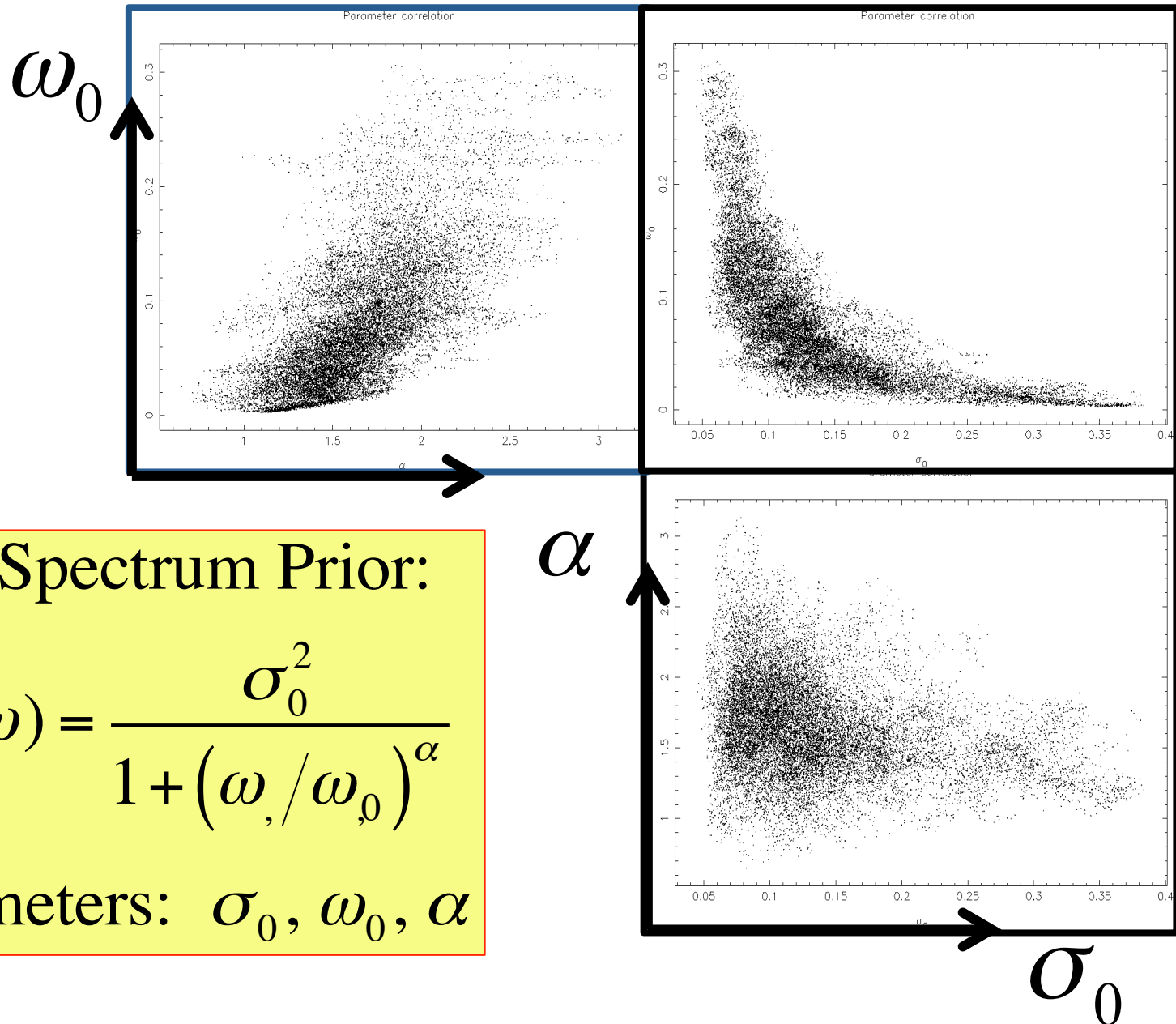
**MCMC fit** explores the full range of parameters that fit the data.

**Power-spectrum prior** cures “flailing” in the data gaps.

**Error bars on the fit**  
Optimal average of dense data,  
Error envelope expands  
in data gaps and extrapolations.



# MCMC: Parameter Co-Variations

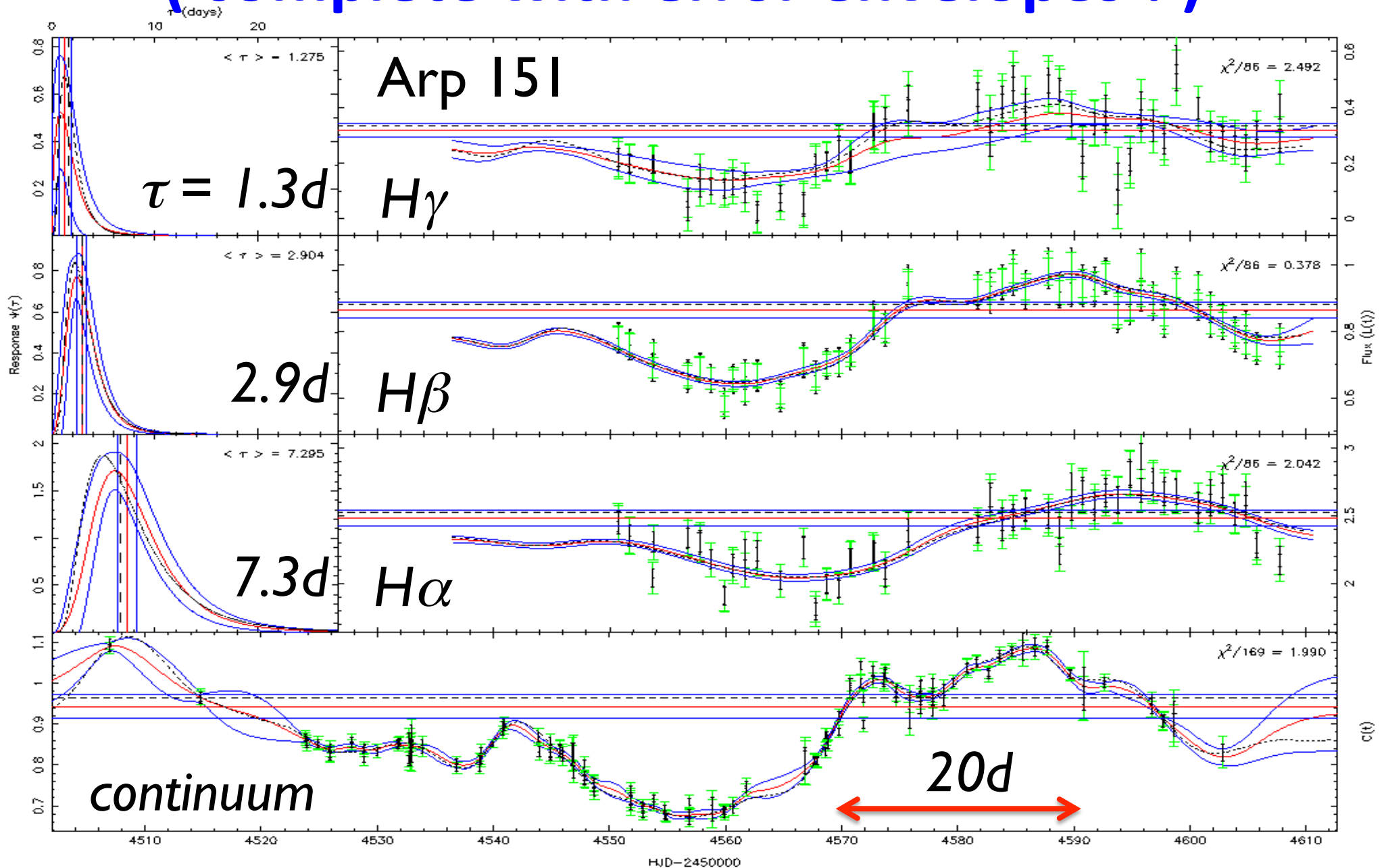


Power Spectrum Prior:

$$\sigma^2(\omega) = \frac{\sigma_0^2}{1 + (\omega / \omega_0)^\alpha}$$

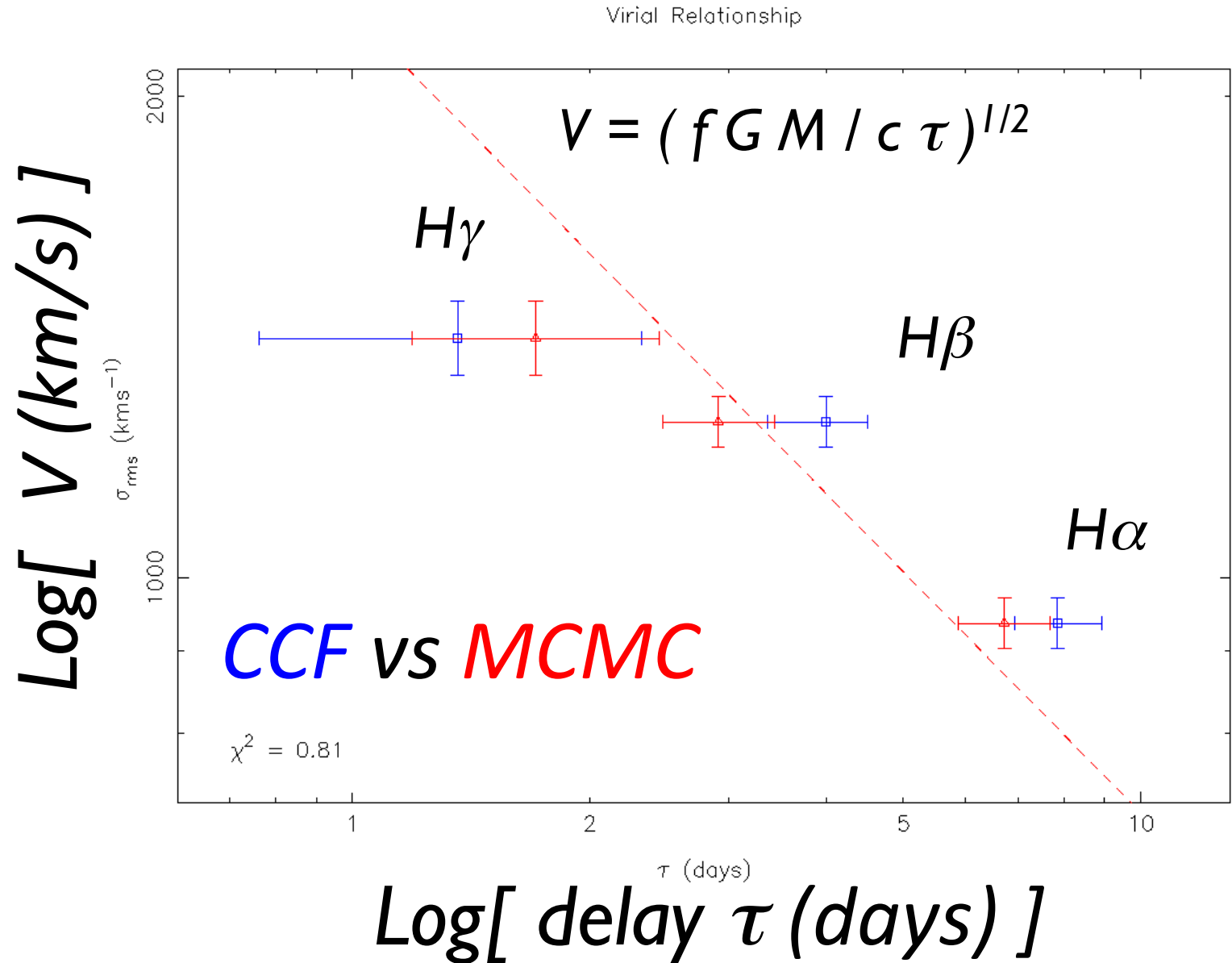
3 parameters:  $\sigma_0, \omega_0, \alpha$

# MCMC: log-normal delay maps of Arp 151 (complete with error envelopes!)



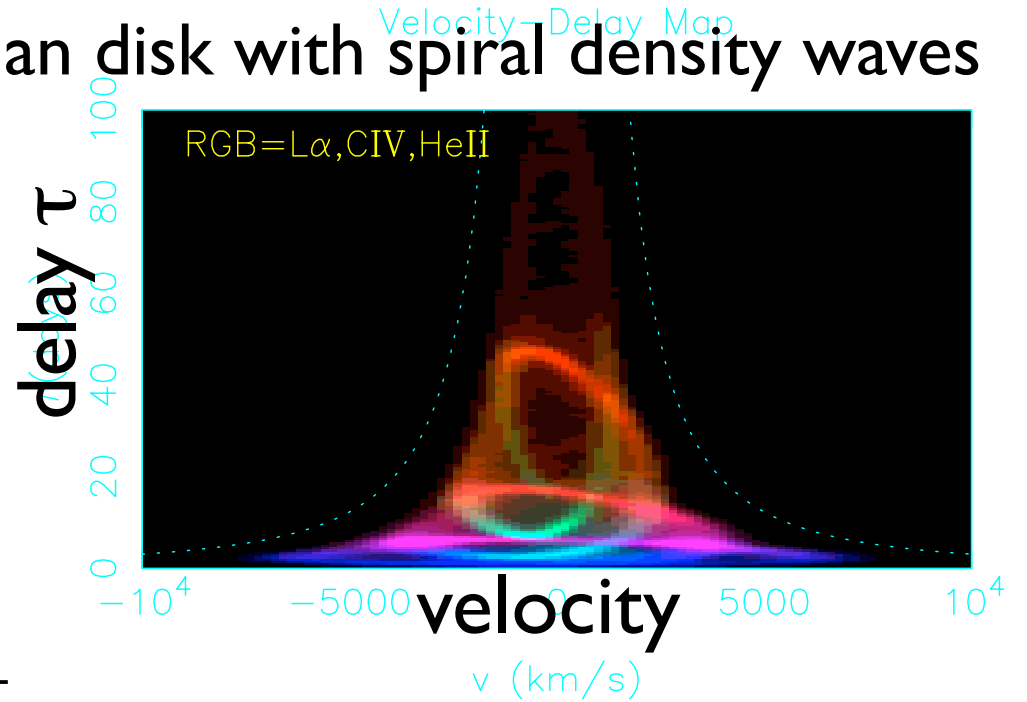
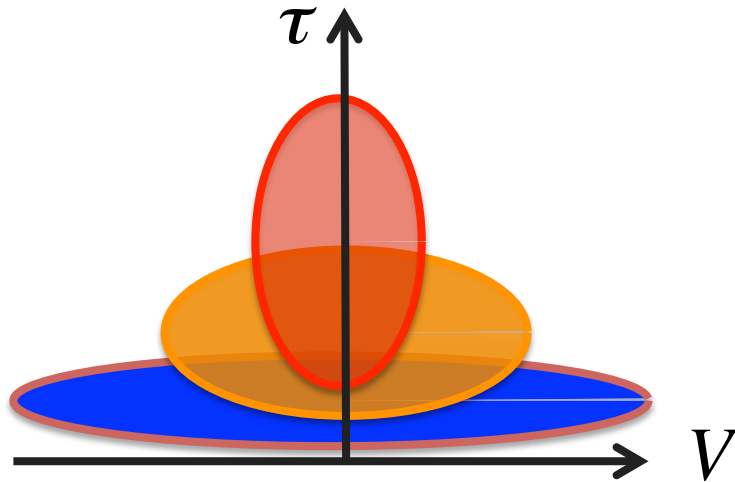
2008 LAMP data, MCMC fit by J.Simpson

# Test of Virial Gas Motions



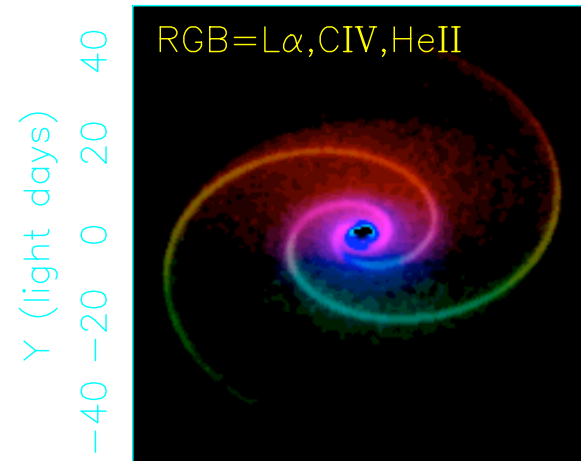
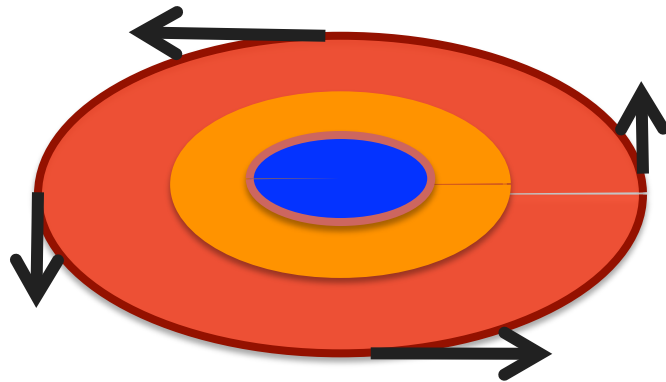
# Velocity-Delay Maps $\Psi(V, \tau)$

Simulation: Photo-ionised Keplerian disk with spiral density waves



$$\tau = \frac{R}{c} (1 + \sin i \cos \theta) \quad V = \sqrt{\frac{GM}{R}} \sin i \sin \theta$$

Sky view:



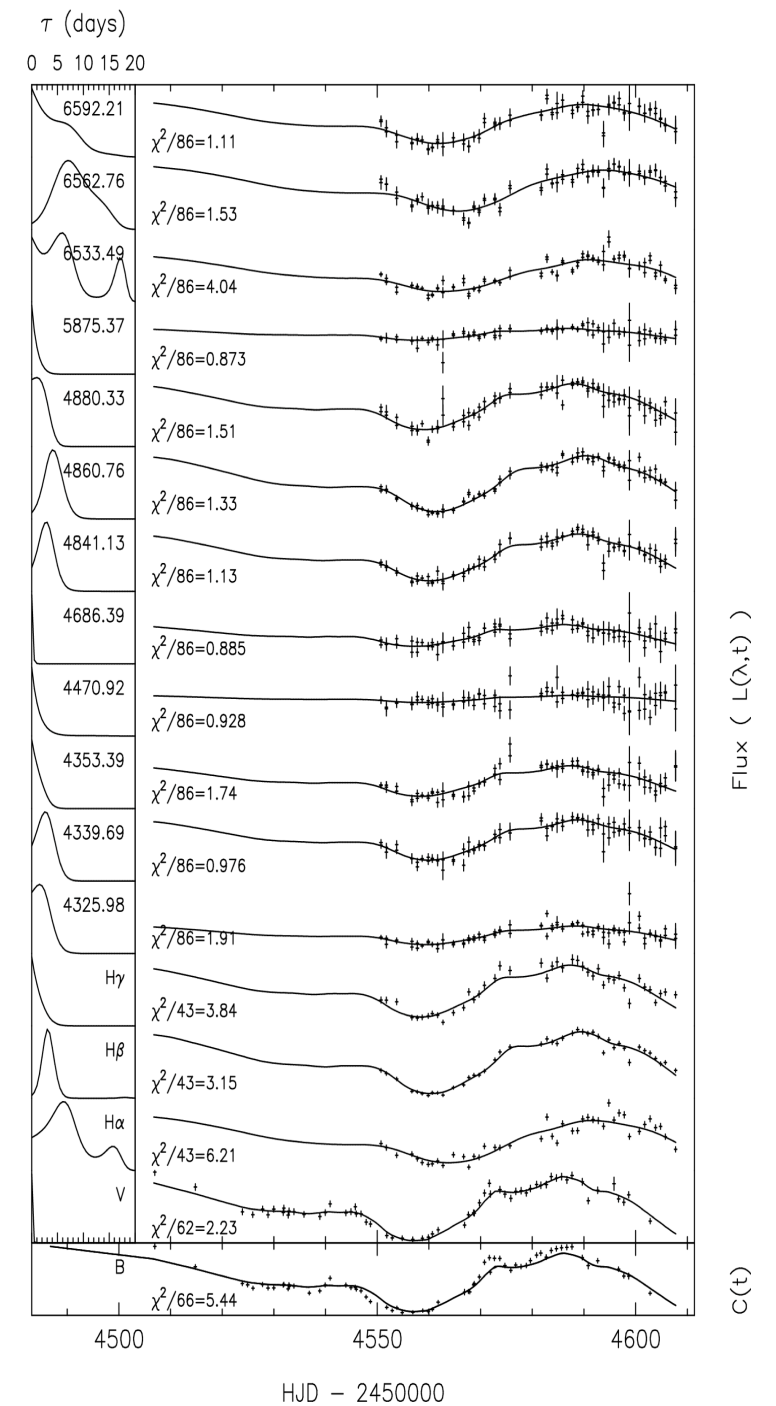
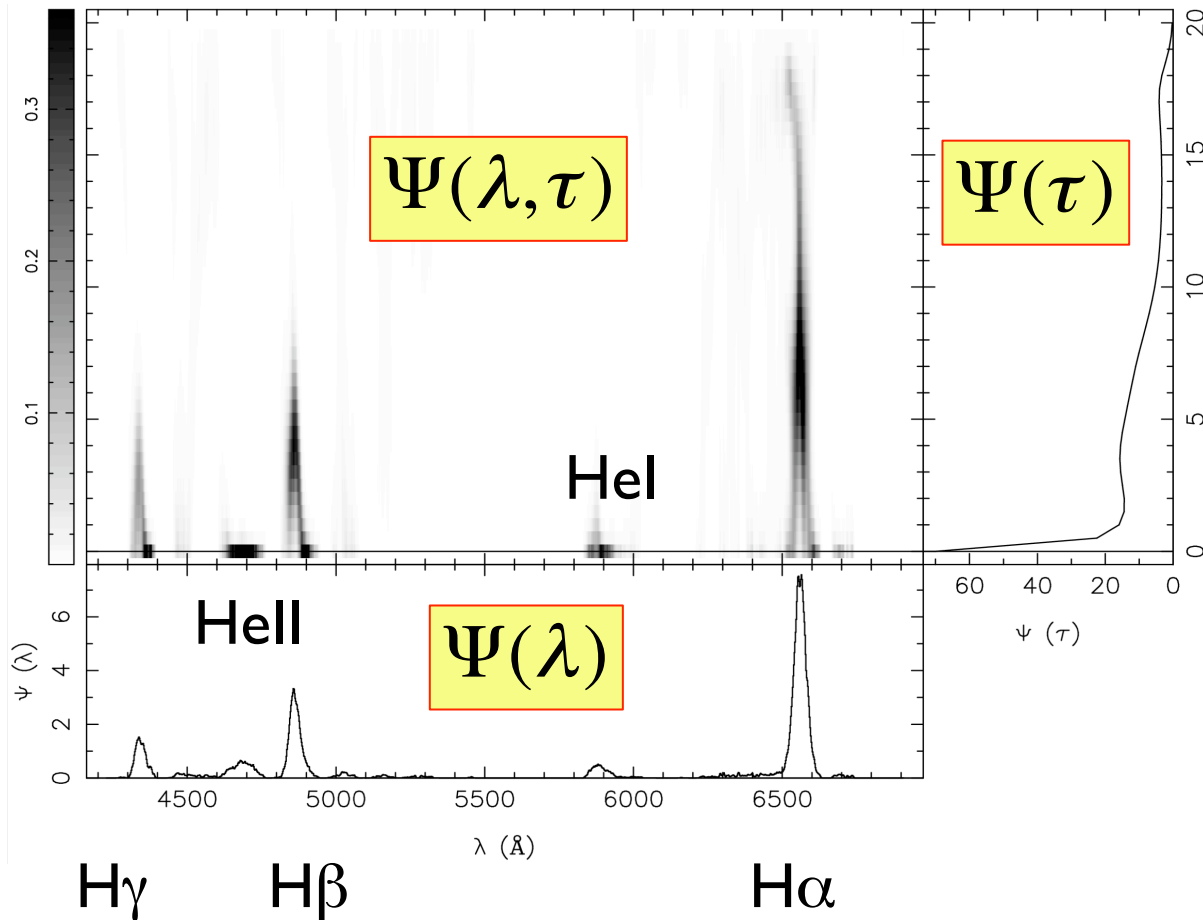


# Arp 151 Maps: $\Psi(\lambda, \tau)$

**MEMECHO** fits to 2008 LAMP data

$$C(t) = C_0 + \Delta C(t)$$

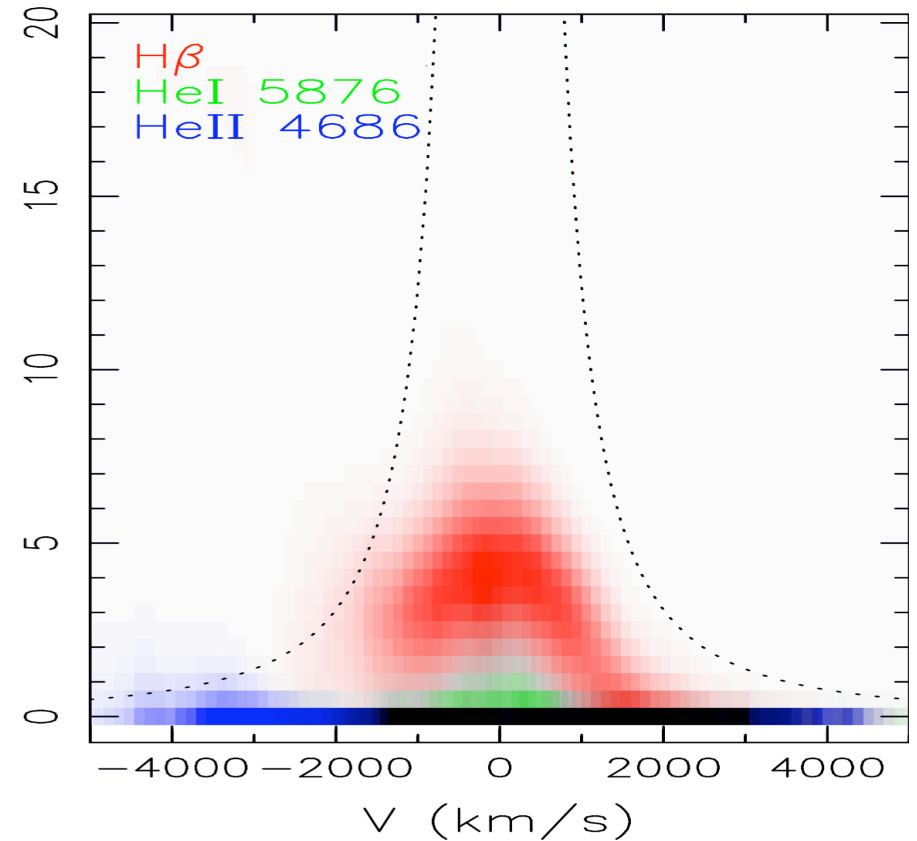
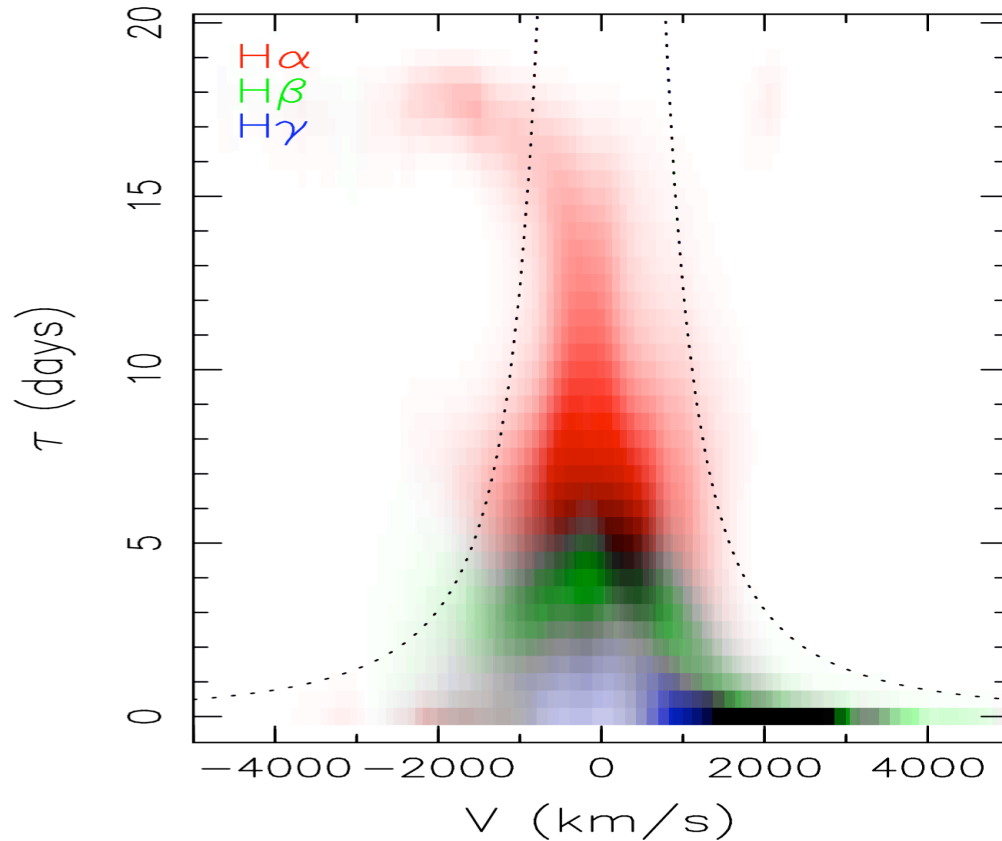
$$f(\lambda, t) = f_0(\lambda, t) + \int_0^{\tau_{\max}} \Psi(\lambda, \tau) \Delta C(t - \tau) d\tau$$



*Bentz, et al. 2010*

# Arp 151 Maps: $\Psi(v, \tau)$

**MEMECHO** fits to 2008 LAMP data



*Virial envelope  $V \sim \tau^{-1/2}$*

*Balmer lines stratified.*

*Prompt response on red wing.  
(disk, far side enhanced, inflow)*

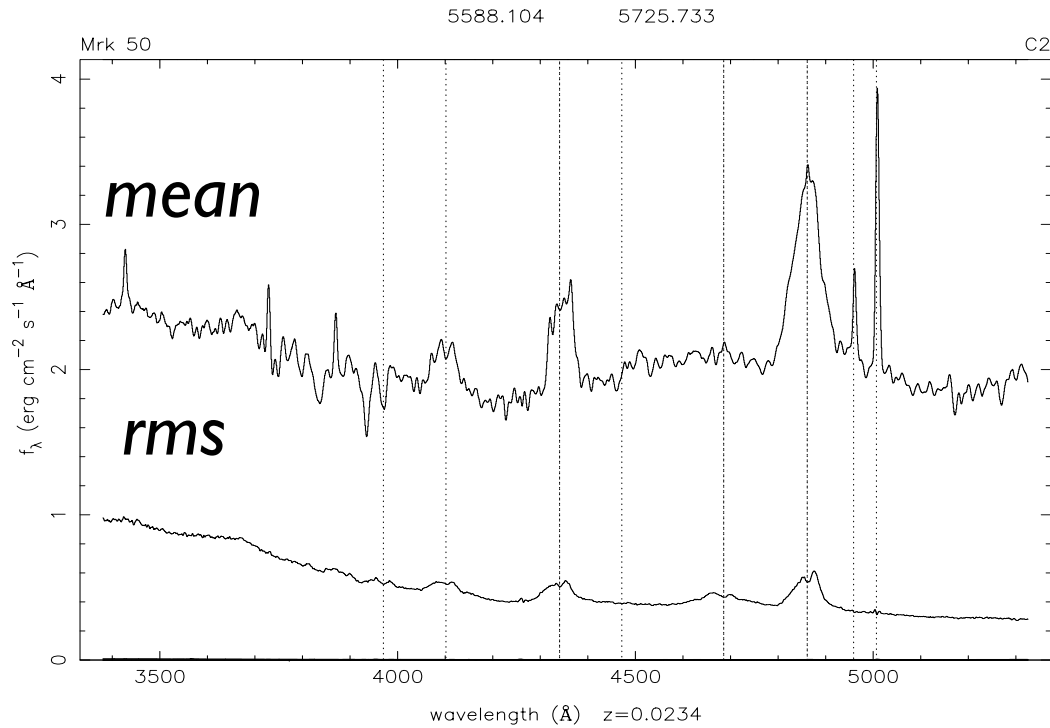
*HeI and HeII*

*Barely resolved in  $\tau$*

*Bentz, et al. 2010*

# Mrk 50 : 2011 LAMP data

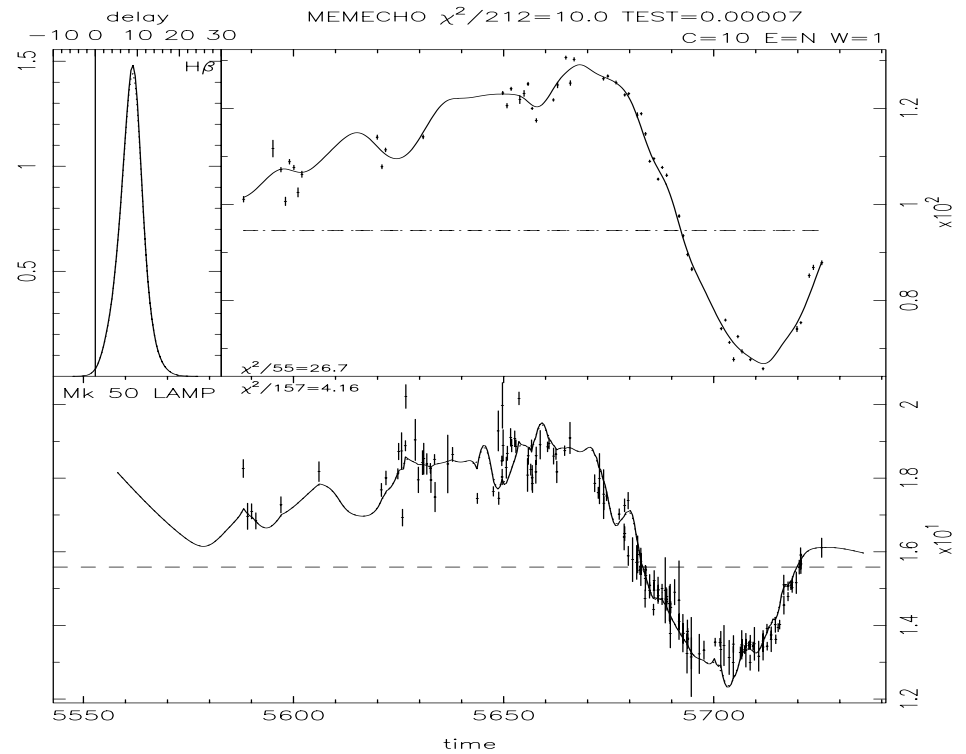
Mean and RMS spectra



**MEMECHO** fit of  $\Psi(\tau)$

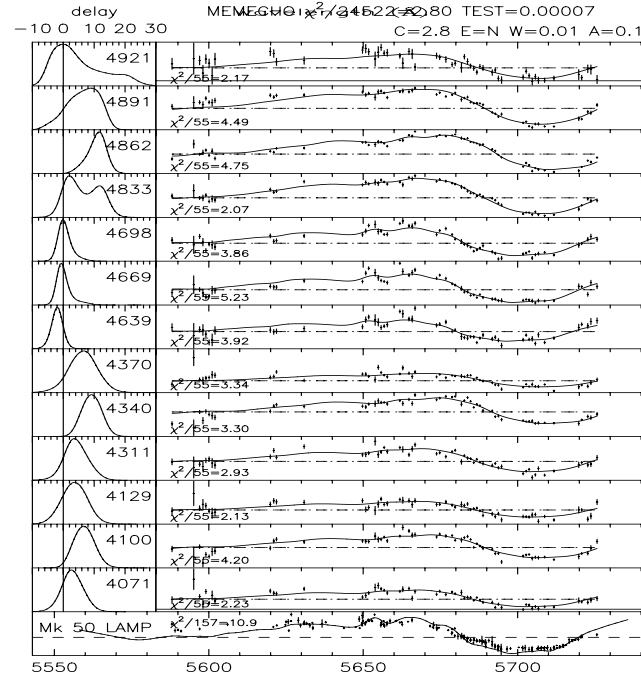
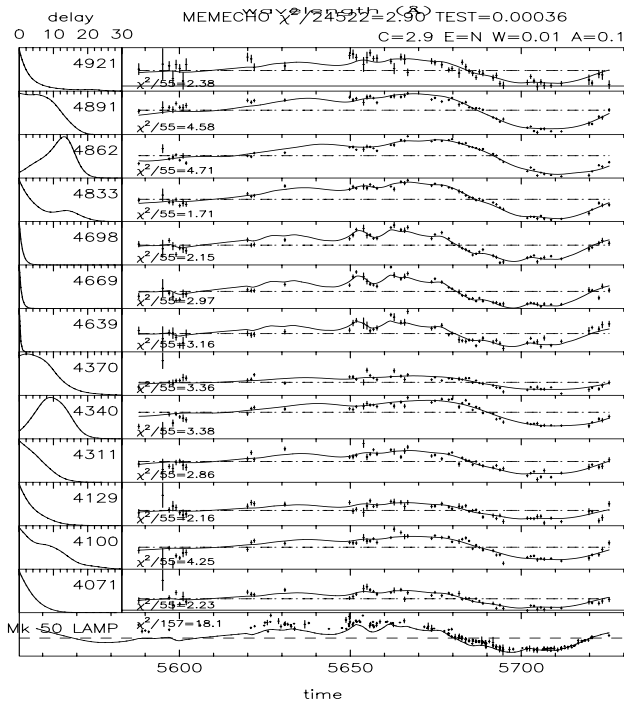
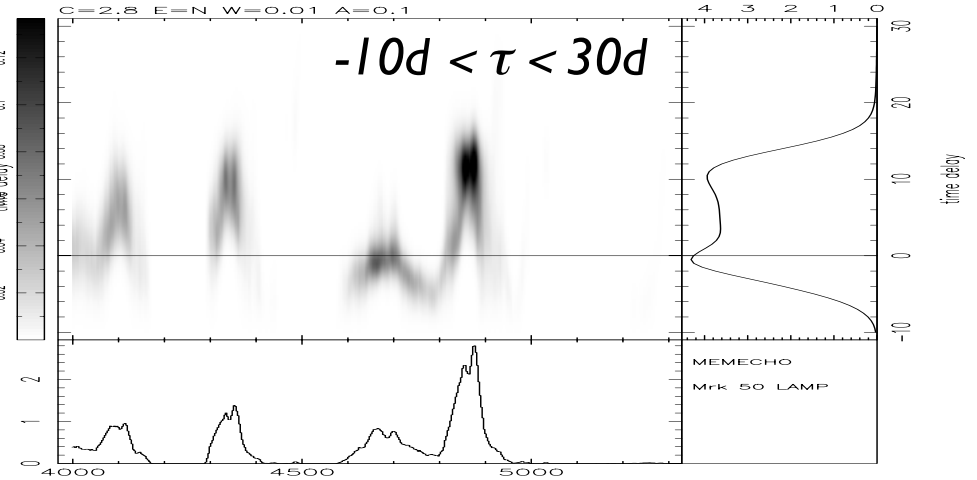
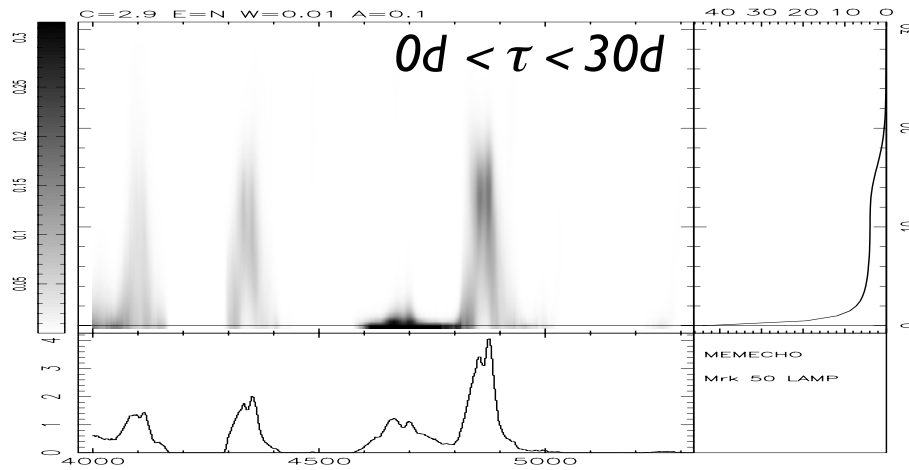
$H\beta$  vs continuum

$\tau \sim 10d$



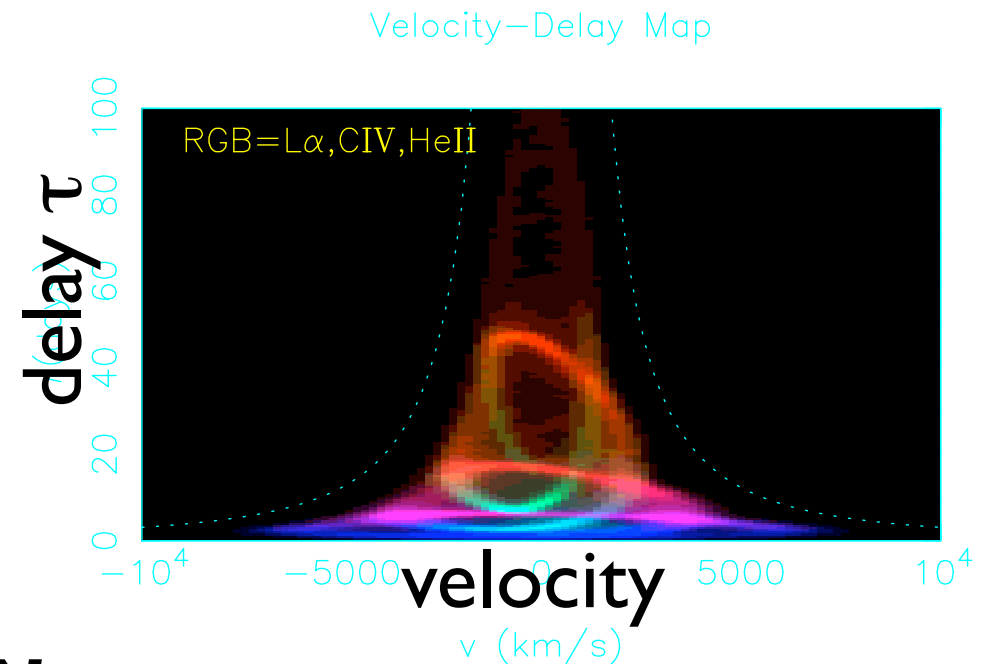
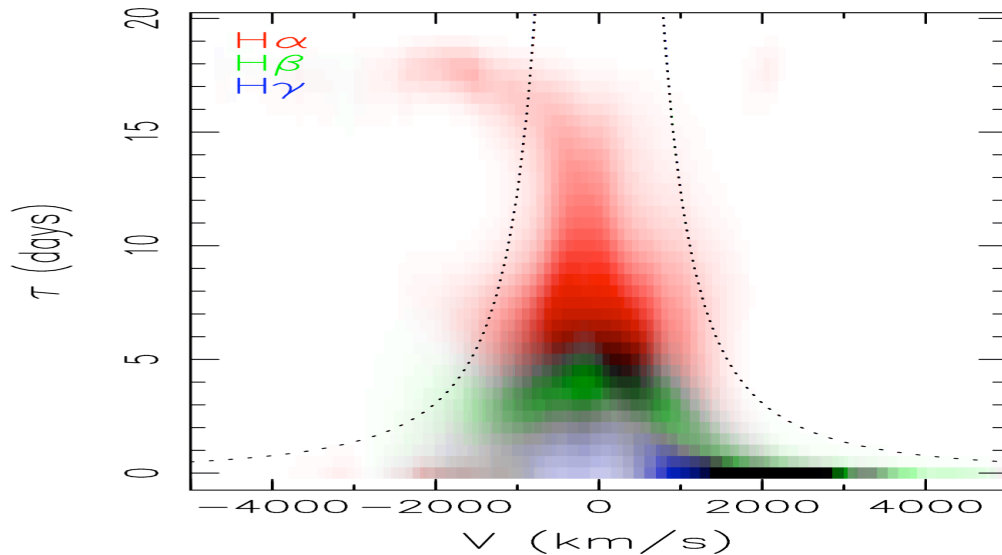
# Mrk 50: Velocity-Delay Maps

**MEMECHO** fits of  $\Psi(\lambda, \tau)$  to 2011 LAMP data



Does Hell precede the continuum?

# STORM campaign on NGC 5548



**Delay resolution limited by S/N, cadence, duration, systematic errors.**

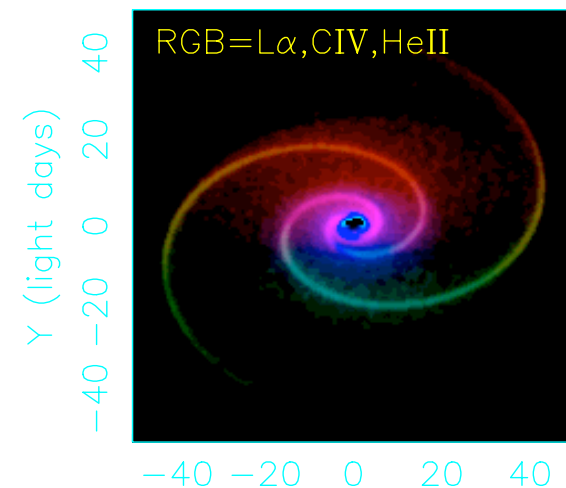
Better time sampling => sharper maps.

HST/COS 180 epochs at 1d sampling.

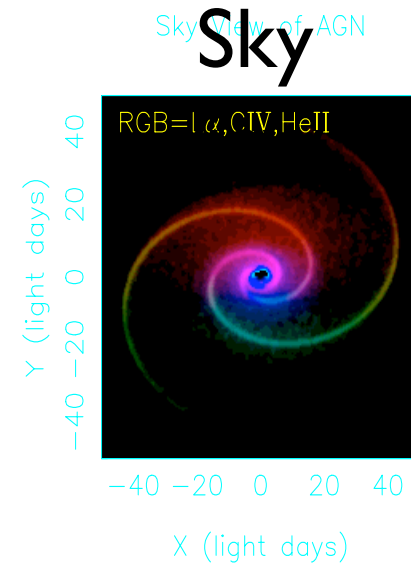
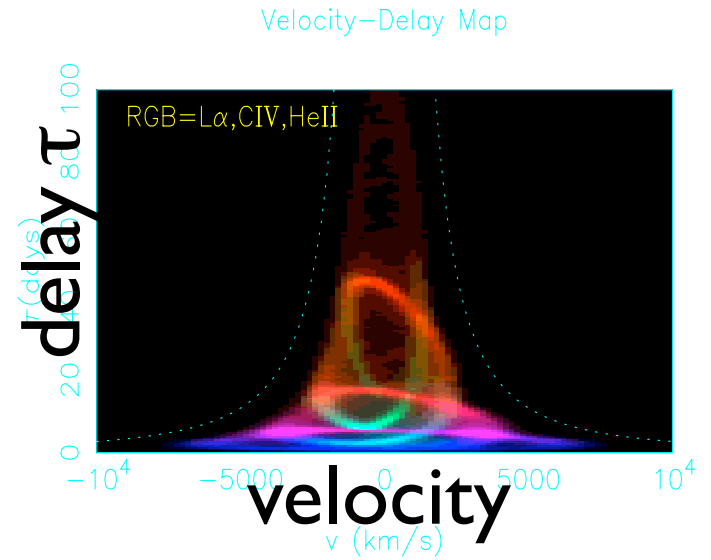
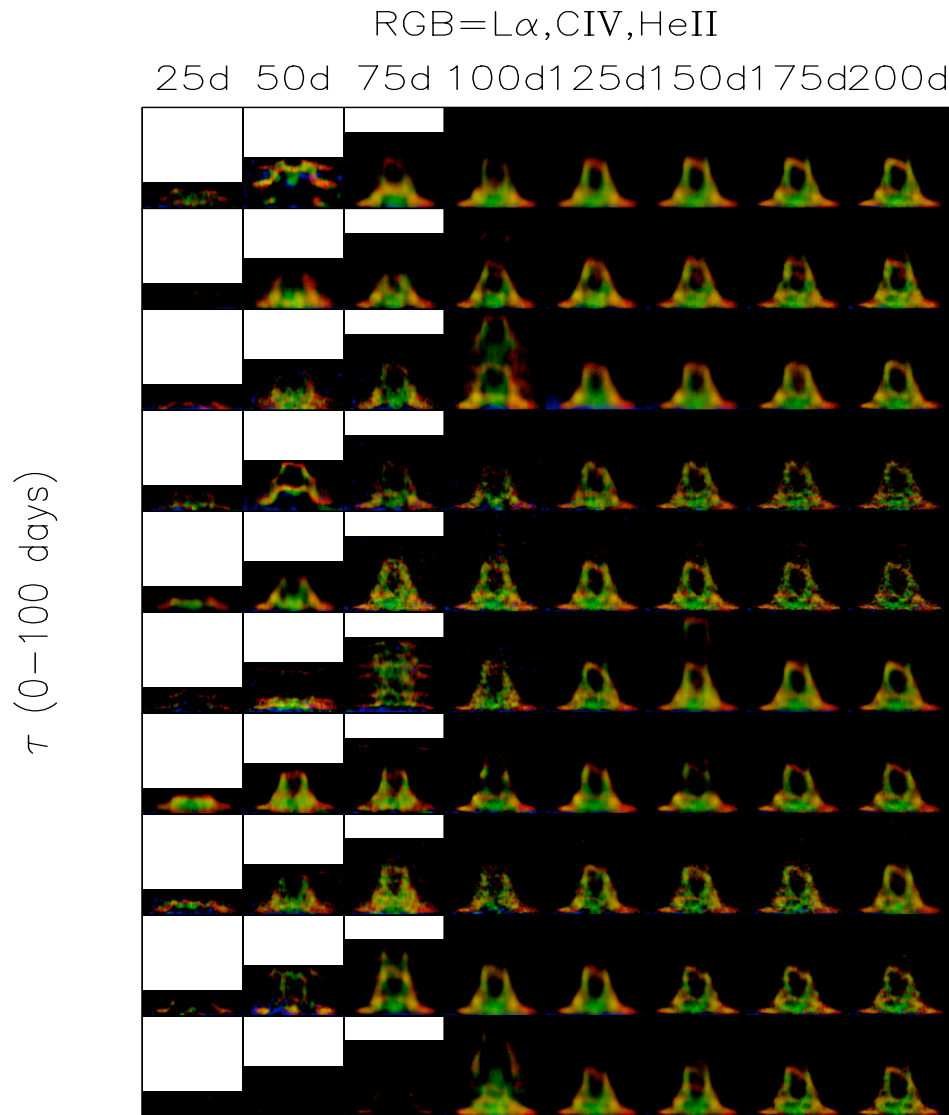
SWIFT 8hr sampling.

Ground-based photometry and spectroscopy.

Sky view of AGN:



# MEMECHO recovery of $\Psi(v, \tau)$ maps from simulated HST/COS data



# Prelim analysis of 5548 HST data

- **No delay maps yet** 😞

- Absorption lines complicating the analysis.

- **PrepSpec** fits a simple separable model:

$$F(\lambda, t) = \text{avg}(\lambda) + \text{cont}(\lambda, t) + \text{BLR}(\lambda) \text{BLR}(t)$$

- Mean spectrum **avg( $\lambda$ )**

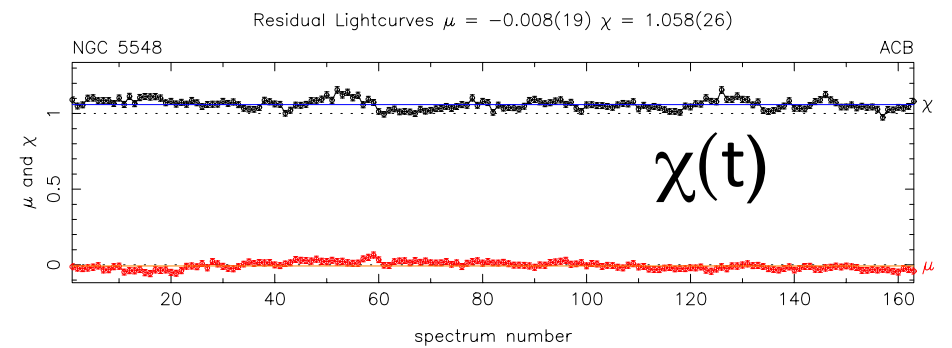
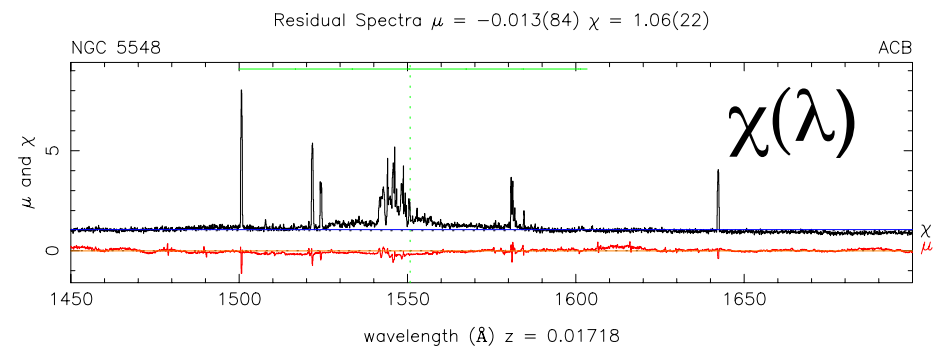
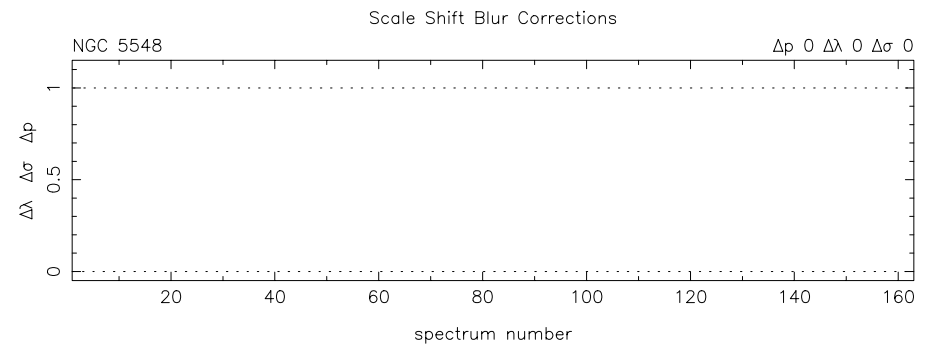
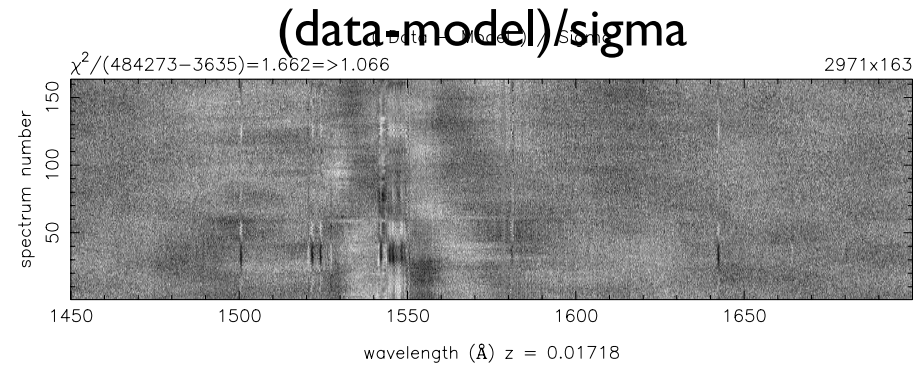
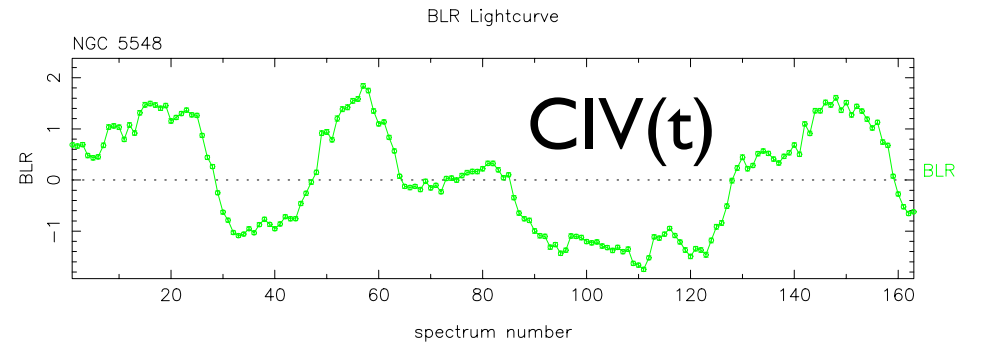
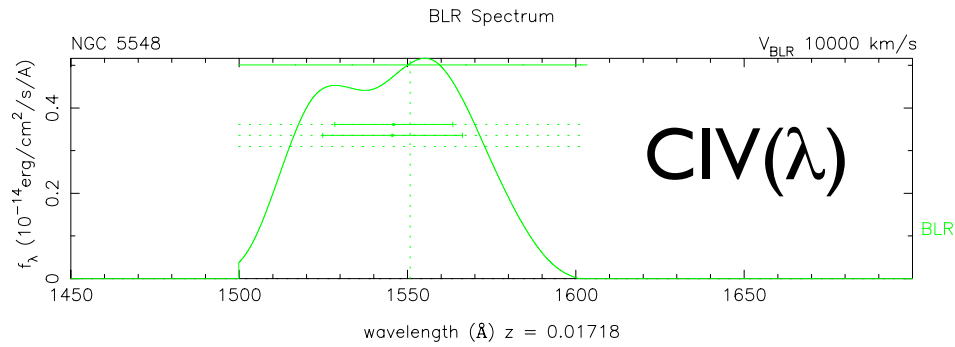
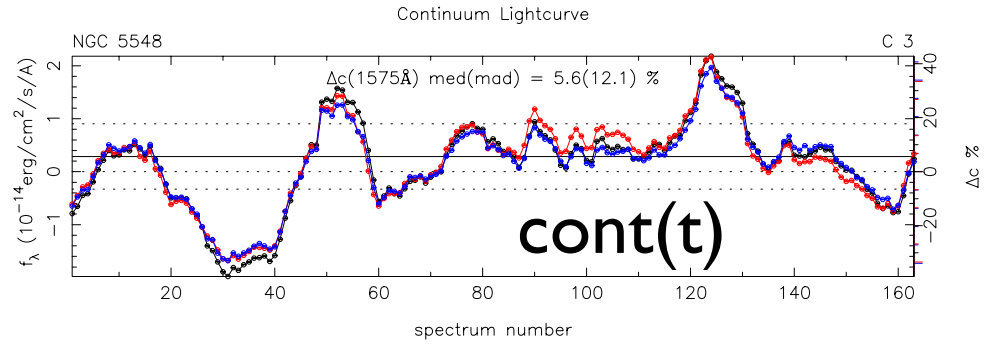
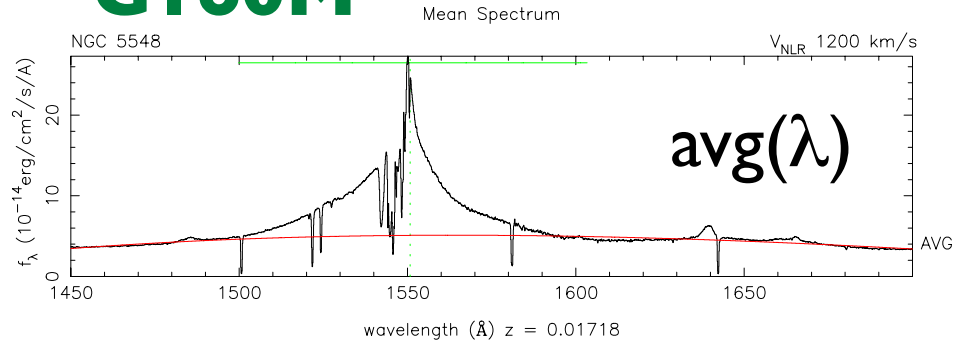
- Continuum lightcurves **cont( $\lambda, t$ )**

- BLR lightcurves **BLR( $t$ )**

- Variable BLR velocity profiles **BLR( $\lambda$ )**

- Residuals show subtle features (not yet analysed).

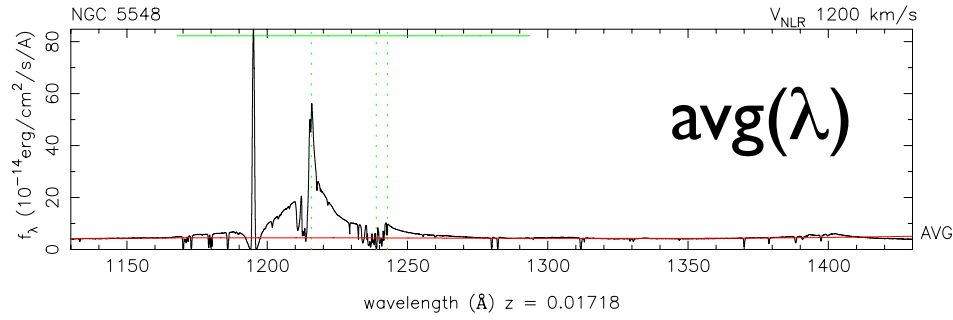
# GI60M



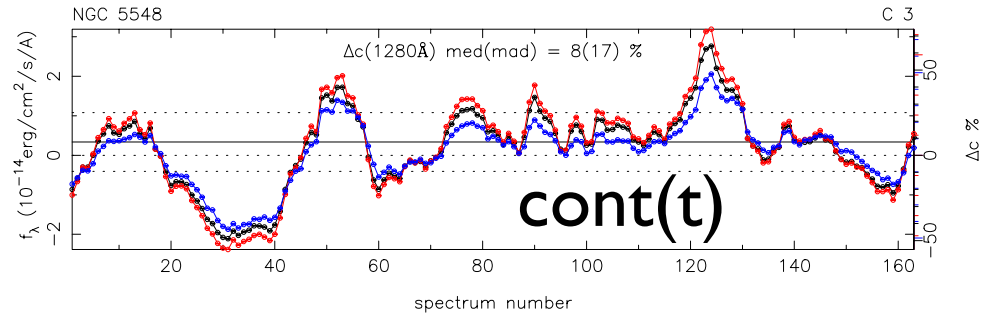


# GI30M

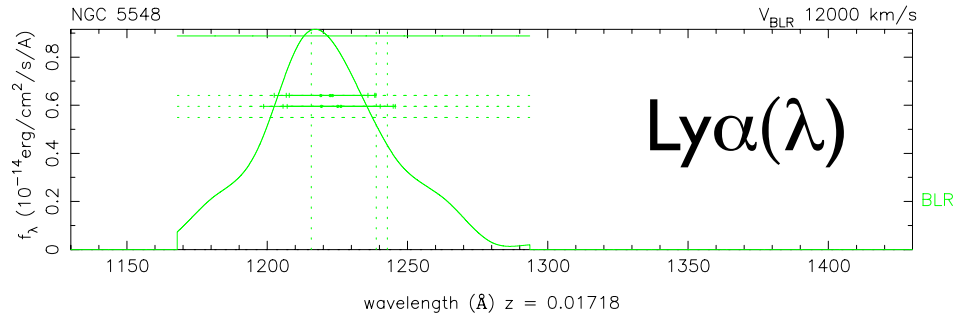
Mean Spectrum



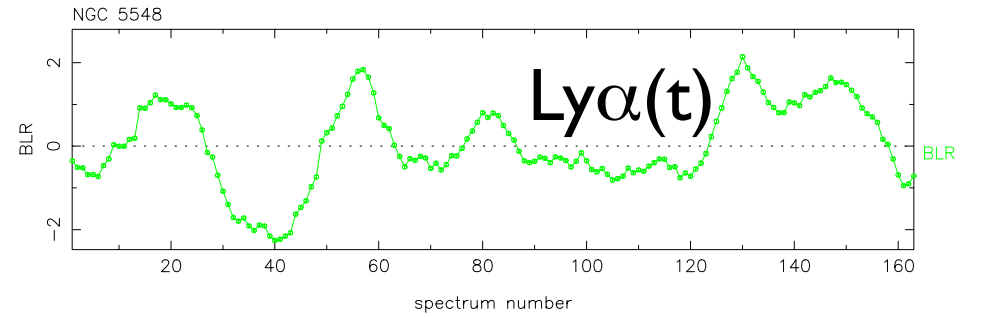
Continuum Lightcurve



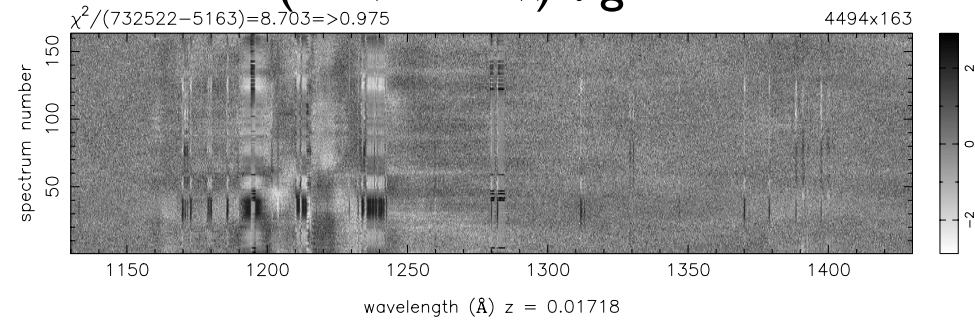
BLR Spectrum



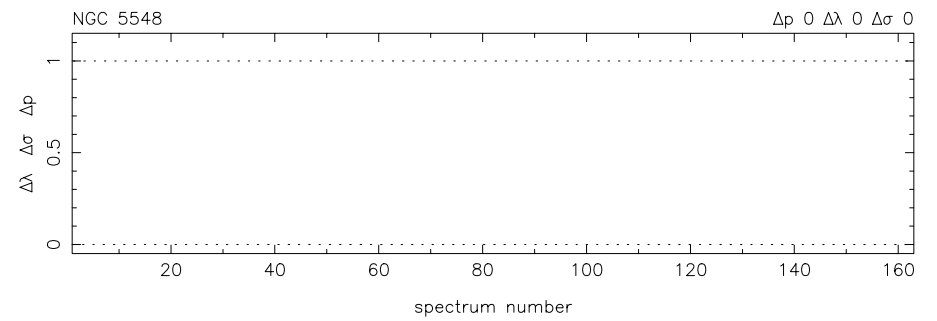
BLR Lightcurve



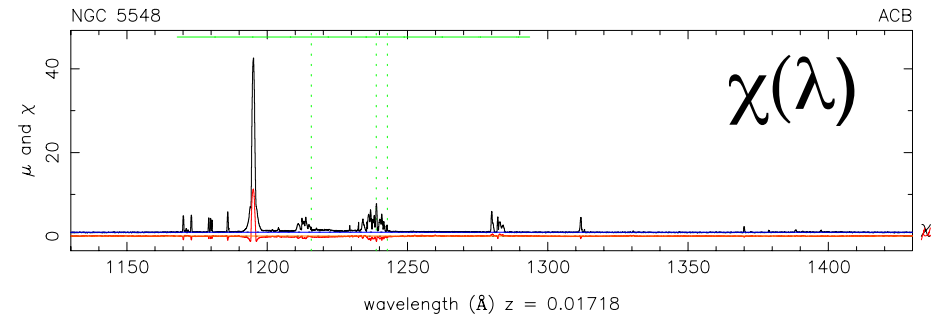
(data-model)/sigma



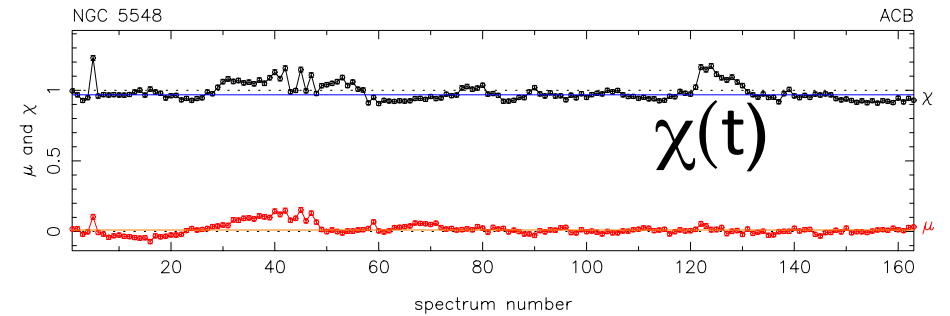
Scale Shift Blur Corrections



Residual Spectra  $\mu = 0.025(128)$   $\chi = 0.97(46)$

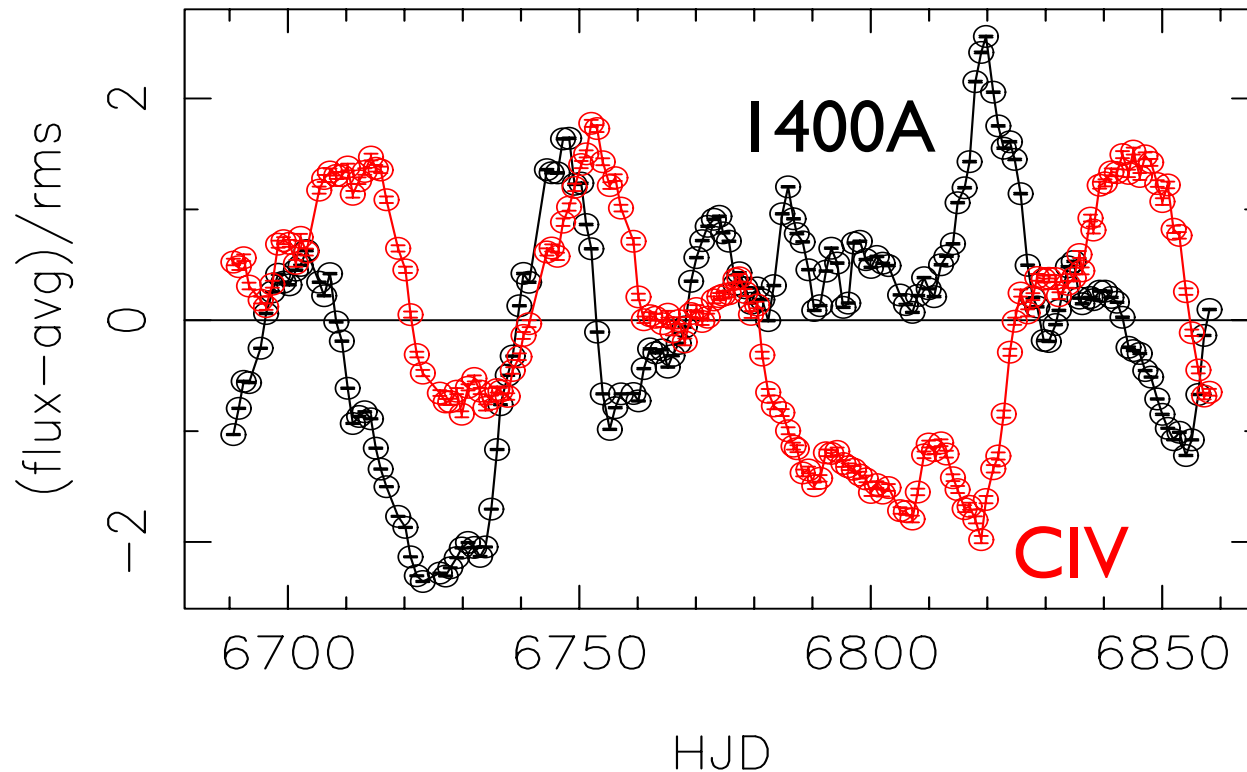


Residual Lightcurves  $\mu = 0.010(27)$   $\chi = 0.968(43)$



# CIV variations complicated

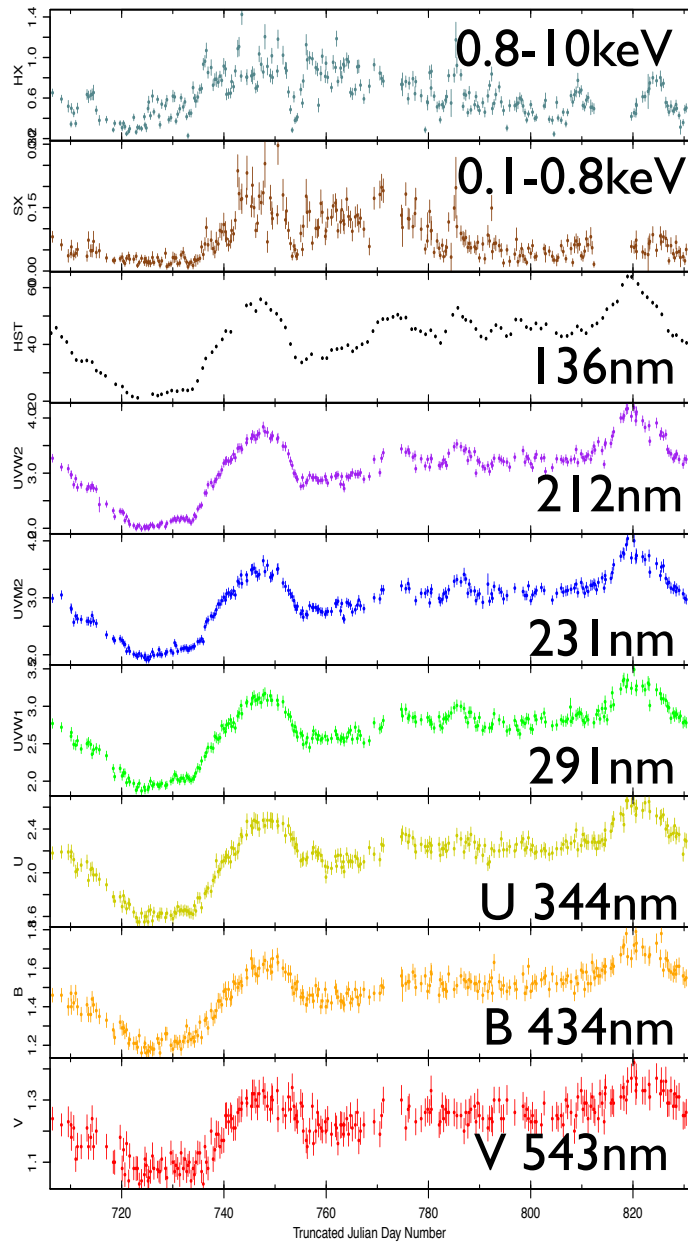
NGC 5548 HST



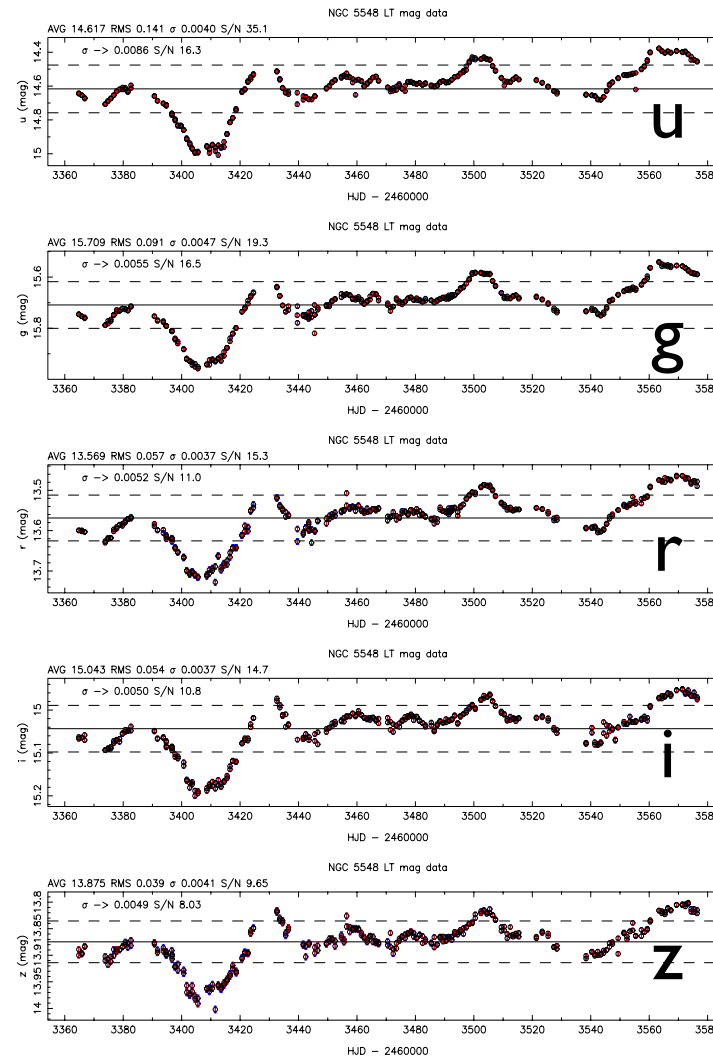
- Fast (5-20d) variations correlate, with clear (5-10d) lags.
- Slow (100d) variations may anti-correlate.
- Linearised echo model may be inadequate.
  - Negative CIV response on 100d timescales?

# N5548 Photometric Lightcurves

Swift lightcurves

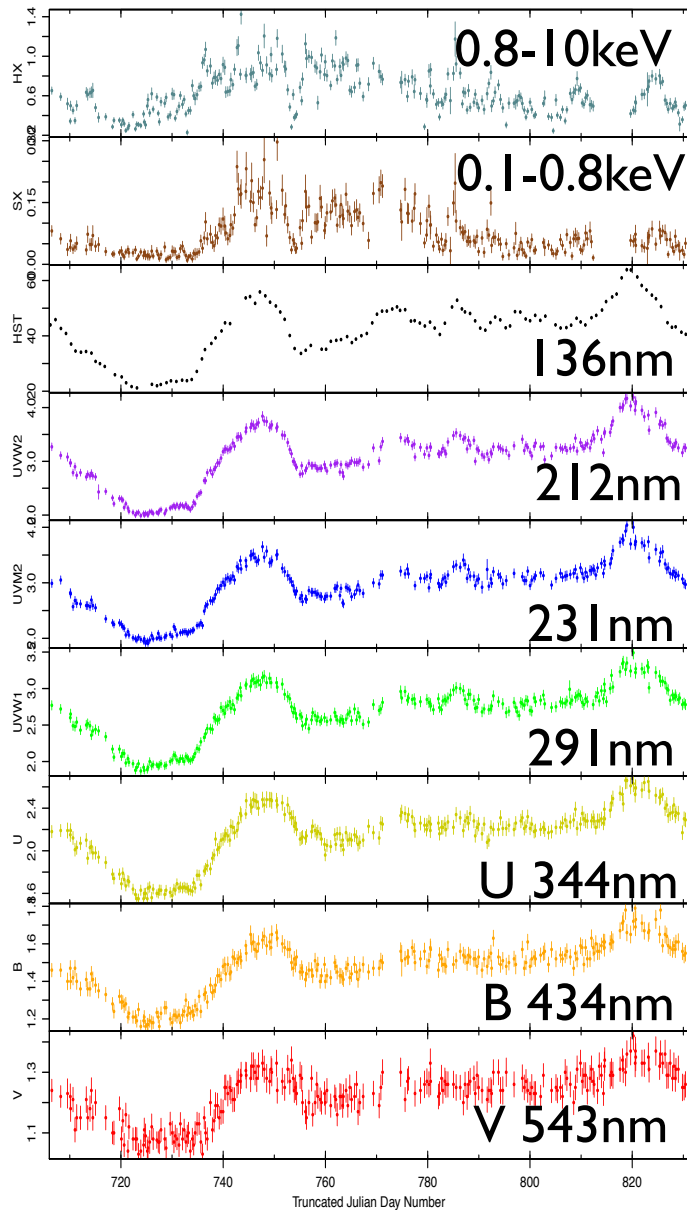


Liverpool 2m robotic telescope  
ugriz lightcurves

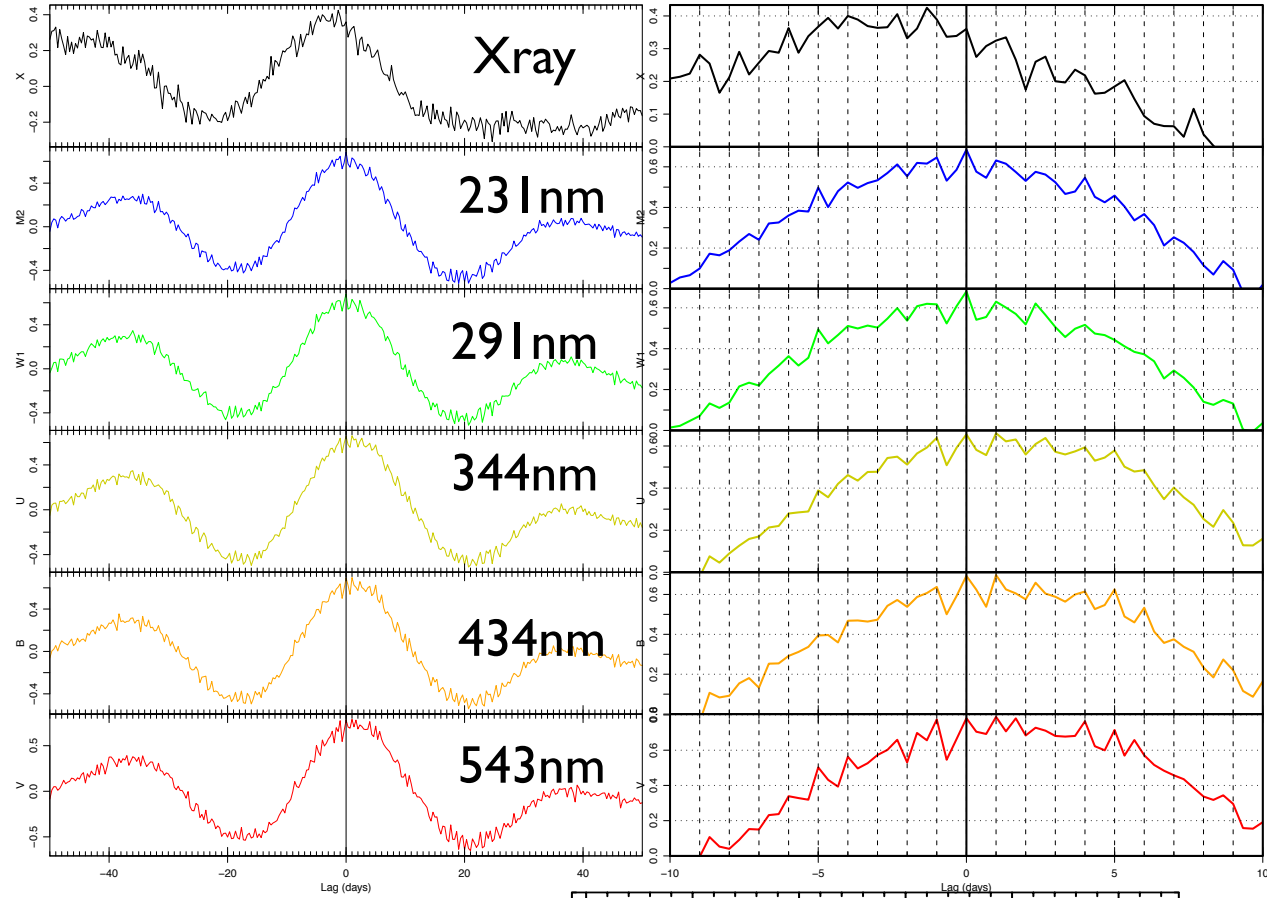


# SWIFT lags (Edelson et al. in prep)

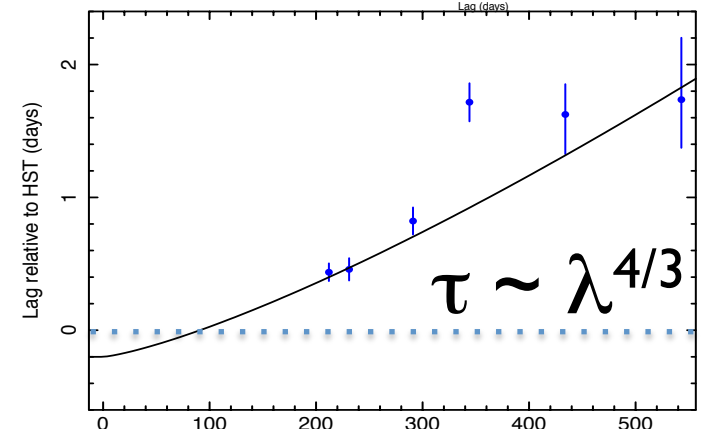
## Swift lightcurves



## Swift CCF vs 212nm



Steady disk  
 $T \sim R^{-3/4}$



# Summary

- Analysis techniques well developed
- Datasets now support velocity-delay mapping.
- 5548 HST, Swift, rich datasets under analysis.
  
- Future:
- Robotic telescopes (LCOGT) deliver photometry.
- IFU spectrographs (better control of systematics)
- SDSS-RM 800 AGN in parallel.