# Black Hole Masses from the Time Domain Mapping Broad Line Regions in AGNs by Photometry

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## Abstract

We present the development and application of a rigorous approach for stochastic reverberation mapping of sparsely sampled AGN broad-band flux measurements. We show how - and that - the BLR size of (ensembles of) QSOs can be estimated from a single spectroscopic epoch and many epochs of precision broad-band photometry. The AGN continuum is modeled as a stochastic Gaussian process. A flux model describes variations of the observed flux with emission line contribution as a scaled version of the pure continuum band plus a scaled, smoothed and delayed version of the continuum. Through generating and evaluating problem-specific mock data, we verify that SDSS S82-like data can constrain  $au_{
m delay}$  . For well-sampled light curves in fortuitous redshifts bins with strongly differential line-flux contributions to different bands we get significant estimates of  $R_{BLR}$ , which appear to be ~1.7 larger than found by [Kaspi2000]. The formalism developed here should also be useful for application to data sets from upcoming surveys.

## **Reverberation Mapping**



*f*: proportionality factor for BLR geometry and kinematics [Kaspi2000]

- continuum radiation from accretion disk excites BLR clouds  $\Rightarrow$  broad emission lines
- changes in BLR excitation and luminosities
- finite light travel time  $\Rightarrow$  delay  $\tau_{delay}$  of BLR luminosity variations w.r.t. accretion disk's

# **Application and Results**

In application to SDSS S82 data, we estimated  $\tau_{delay}$  for a well-defined sample of 323 objects spanning redshifts from z = 0.225-0.846.



# **Stochastical Reverberation Mapping - methodology**

stochastic approach is capable to

- not only interpolate between data points, but also make self-consistently i) estimates and include these uncertainties in the interpolation
- handle transfer functions  $\Psi( au_{
  m delay})$  instead of simply a  $au_{
  m delay}$ ii)
- iii) separate light curve means and systematic errors in flux calibration
- operationally, we fit a light curve by maximizing the likelihood of the flux model given the photometric data points
- approach by [Rybicki1994] and [Zu2011] applied to broad band photometry with many modifications
- carried out by Parallel Affine Invariant MCMC Ensemble Sampler

from variability signals and measurement noise in a self-consistent way

- iv) derive simultaneously the lags of multiple emission lines
- provide statistical confidence limits on all estimated parameter V)
- handle sparsely sampled data!  $\Rightarrow$



$$\log P_{\text{posterior}} = \log P(\mathbf{p}) + \log \mathcal{L}(\mathbf{m}|\mathbf{p})$$

where  $\mathbf{p}$  are the structure function parameters and  ${f m}$  the measured light curve points

### model continuum-only band x

describe AGN continuum light curve as Gaussian stochastic process (e.g. [Kozlowski2009] [McLeod2012])

- damped random walk [Kelly2009]
- power-law structure function model [Schmidt2010]

 $\Rightarrow$  continuum model is characterized by a variance matrix  $C_{xx}^{cc}$ 

### model continuum + emission line band y

model band y as a scaled version of band x plus scaled, smoothed and displaced version of band x

flux model:

$$\begin{split} f_x(t) &= f_x^c(t) & \text{continuum only band} \\ f_y(t) &= f_y^c(t) + f_y^e(t) & \text{continuum + emission line band} \\ &= s \cdot f_x^c(t) + e \! \int \! \mathrm{d}\tau_{\mathrm{delay}} \Psi(\tau_{\mathrm{delay}}) f_x^c(t - \tau_{\mathrm{delay}}) \end{split}$$

emission-line covariance matrix

$$\begin{aligned} C_{yy}^{ee}(\Delta t) &= \langle f_y^e(t), f_y^e(t + \Delta t) \rangle \\ &= e^2 \!\! \int \mathrm{d}\tau_{\mathrm{delay},1} \int \mathrm{d}\tau_{\mathrm{delay},2} \Psi(\tau_{\mathrm{delay},1}) \\ &\quad \langle f_y^c(t - \tau_{\mathrm{delay},1}) f_y^c(t + \Delta t - \tau_{\mathrm{delay},2}) \rangle \end{aligned}$$

continuum-emission cross terms

$$C_{yy}^{ec/ce}(\Delta t) = s \cdot e \int d\tau_{delay} \Psi(\tau_{delay}) C_{xx}^{cc}(\Delta t \pm \tau_{delay})$$



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model continuum + emission line band y

g 
$$P_{\text{posterior}}$$
  
= log  $P(\tau_{\text{delay}}, e, s)$   
+ log  $\mathcal{L}(\mathbf{m}_x, \mathbf{m}_y | \tau_{\text{delay}}, e, s)$ 

covariance matrix for x and y band fluxes





likelihood  ${\cal L}$  from covariance matrix C and data  ${f m}$  [Zu2011]

$$\mathcal{L} \equiv |S+N|^{-1/2} |L^T C^{-1} L|^{-1/2} \exp\left(-\frac{\mathbf{m}^T C_{\perp}^{-1} \mathbf{m}}{2}\right)$$