#### A Review of AGN Variability Studies using Survey Data: Prospects for LSST



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# **Optical Quasar Variability**

#### Continuum:

- rms ~ 0.2 mag over ~1 year
- Aperiodic, stochastic red noise
- Optical contains reprocessed UV emission (Edelson+ 2015)
  - **Broad Emission Lines:**
- Less variable, lagged (*t*<sub>lt,BLR</sub>)



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- Large changes rare



## LONG-TERM VARIABILITY WITH LSST

- Constrain the timescale for quasar variability
  - Modeling SDSS S82 light curves as a DRW

- Constrain physics through extreme variability
  - Changing-Look Quasars

Determine incidence of transient AGN phenomena

viscous ("radial drift") timescale
 Optical: ~10,000 yrs
 UV: ~days

$$t_{\rm infl} = 5 \times 10^4 \left[\frac{\alpha}{0.1}\right]^{-1} \left[\frac{\lambda_{\rm Edd}}{0.05}\right]^{-2} \left[\frac{\eta}{0.1}\right]^2 \left[\frac{r}{50R_{\rm S}}\right]^{7/2} \left[\frac{M_8}{2.1}\right] \,{\rm yr}.$$



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- **dynamical** timescale *t*<sub>dyn</sub> (~days; months-yrs for BLR)

free-fall: 
$$t_{ff} \sim (R/g)^{1/2}$$



orbital:  $t_{orb} \sim 2\pi t_{ff}$ 

sound crossing:  $t_s \sim H/c_s$ 

- viscous ("radial drift") timescale (~10,000 yrs)
- light travel timescale  $t_{lt} = R/c$  (~hrs; days for BLR)
- dynamical timescale *t*<sub>dyn</sub> (~days; yrs for BLR)
- **thermal** timescale *t*<sub>th</sub> (days-yrs)

 $t_{th} = 4.6 \ (\alpha/0.01)^{-1} \ (M/10^8 M_{\odot}) \ (R/100 R_S)^{3/2} \ yr.$ 





## **SDSS Repeated Imaging**



MacLeod+ 2012

#### **Structure Function Analysis**

For irregularly sampled data, statistical samples are best analyzed using the (model-independent) structure function



#### FITTING LIGHTCURVES AS A DAMPED RANDOM WALK (DRW)

(also known as Ornstein-Uhlenbeck process and as CAR(1) process)



Simple, fast [O(N)]

Two variability parameters:

**SF**<sub>∞</sub>: asymptotic rms in Δm **τ**: characteristic time scale

(Kelly+ 2009; Kozłowski+ 2010; Zu+ 2012)

Predicts exponential form for Structure Function:

$$SF(\Delta t) = SF_{\infty}(1 - e^{-|\Delta t|/\tau})^{1/2}$$
auto-correlation function

#### STRIPE 82: OBSERVED DRW PARAMETERS



#### EDDINGTON RATIO AS THE DRIVER OF VARIABILITY?

 With SDSS S82 data, can see clear dependence of variability on physical quantities such as Eddington ratio (see also SF analyses from Kozlowski 2016A; Wilhite+2005)





Due to intrinsic **T** for quasars (+ time dilation), need >10 yrs (MacLeod+ 2011)

Can reliably constrain timescale for lengths >10T (Kozlowski 2016c)

MacLeod, LSST AGN Science Roadmap Meeting, 3 Jan 2017 14



MacLeod+ 2011

# Probing Long-term Variability with LSST



- AGN variability studies will be based on millions of light curves with ~900 observations over 10 yrs
- LSST overlap with SDSS, Pan-STARRS, PTF, etc. yields 30 yr-long light curves for 20,000 quasars
- I0 yr-long light curves are sufficient at low z and light weight end of BH mass spectrum (τ ∝ M<sup>0.4</sup>, Kozlowski 2016a)

LSST:  $M_B = -23$  at  $z \sim 2$ , SDSS:  $M_B > -23$  at z < 0.5





- Broad Balmer BEL (dis)appearance associated with large flux change
- Serendipitous discovery for z = 0.31 QSO (LaMassa+2015)
- Archival X-ray observations rule out variable obscuration.

#### **Systematic Search for CLQs**

Selection	Total #	In S82
SDSS Quasars in DR7Q	105783	9474
with BOSS spectra	25484	2304
and $ \Delta g  > 1$ mag and $\sigma_g < 0.15$ mag	1011	287
and that show variable BELs	10	7



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#### **Changing-look Quasars in SDSS/BOSS**



"Turn-off" CLQ from systematic archival search.

MacLeod, Ross et al (2016)

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## PHYSICAL INTERPRETATIONS OF CLQS



- Cold chaotic accretion models (Gaspari+2015)
- Thermal timescale for *global temperature change* (e.g. Mkn 1018, Husemann et al 2016)
- Thermal instability due to low metallicity (Jiang+2016)
- Structural change in BLR on τ<sub>dyn,BLR</sub>
- Some may be tidal disruption events (Merloni+2015)

#### **Systematic Search for CLQs**

- Shortest timescales are ≤1yr (Gezari+2016)
- Probability grows with time difference (MacLeod, Ross et al. 2016)



 Out of highly variable, |Δg| > 1 mag luminous (L<sub>bol</sub> ≈ 10<sup>45</sup> erg s<sup>-1</sup>) quasars, CLQ fraction is ~20%.

#### **CLAGN: PROSPECTS FOR LSST**



- Among 50 million AGN, will have thousands with |Δg|>1 mag; or more (variability increases with decreasing luminosity)
- CLQs: large changes in *g*-*r* (BBB) and *y* (Hα), X-ray flare (Shappee+2014)
- Follow-up spectroscopy: i) Find more CLQs in faint states. ii) Extend CLAGN population to fainter luminosities at z < 0.8</li>

## PREPARING FOR LSST

- Are changing-look quasars
  - a unique phenomenon, or



- the tail of regular quasar variability?
- Look for outliers in light curve parameters (e.g. Graham et al 2016, arxiv:1612.07271v1)
- Understand long-term spectroscopic variability using large samples of quasars with repeat spectra





#### **SDSS IV Time Domain Spectroscopic Survey**



Paul Green (P-I, SAO), Scott Anderson (P-I, UWa), Chelsea MacLeod (SAO), Michael Eracleous (PSU), Niel Brandt (PSU), Sean McGraw (PSU), Kate Grier (PSU), Jessie Runnoe (UMich), Eric Morganson (UIUC), John Ruan (UWa), Don Schneider (PSU), Yue Shen (UIUC), the TDSS Team, the SDSS-IV Collaboration, and the Pan-STARRS1 Science Consortium

- ★ Unbiased spectral survey for ~200,000 celestial variables (Morganson+ 2015; Ruan+ 2016)
- ★ Repeat spectra for 13K Quasars
- Repeat spectra for ~1K Hypervariable Quasars (|Δm|>0.7 mag)



## SUMMARY

- S82 QSO variability data consistent with thermal timescales; accretion disk instabilities
- Constrain τ using LSST overlap with SDSS, DES, etc. for bright QSOs and at low-z, faint end
- Large amplitude, long-term QSO variability with followup spectroscopy gives us new insights into accretion physics
- Determine best follow-up strategy

#### 

## **EXTRA SLIDES**

#### **DRW Model Refinements**

DRW Power Spectral Density:

 $P(f) \propto (f_0^2 + f^2)^{-1} (f_0 = 1/\tau)$ 

- XRBs/ X-ray AGN: Mixed OU
   process (Kelly+ 2011)
- Long Timescales (low f): cannot distinguish between f<sup>-1</sup> or f<sup>0</sup> in optical
- Short timescales (high f): Kepler data shows f<sup>-3</sup> (Mushotzky+2011; Kasliwal+2016)
- CARMA: flexible models (Kelly +2014; Simm+ 2015; Zinn+2016)



CARMA(2, r) = QPO (= DRW when  $\tau/P \ll 1$ )

# Probing Long-term Variability with LSST



# With an accurate long-term variability model to LSST depths, can determine *incidence of AGN contamination* in transient searches.



#### **Followup Spectra of CLQ Candidates**



(Redimming also seen in CLAGN Mkn 1018, McElroy et al 2016)

Is CLQ behavior a one-off event?



- X-ray flux changes by factor: Fig. 2. Time evolution of the X-ray photon index Γ and the 2–10 keV flux from 2005 until 2016 based on the *Swift* and *Chandra* data.
  - 10 in Mkn1018 (Husemann+2016)
  - 12 in SDSSJ0159 (LaMassa+2015)
  - >3 in iPTF 16bco (Gezari+ 2016)
- No evidence for obscuration

#### Damped random walk

What can be learned from fitting individual light curves?



T increases with wavelength and black hole mass, and is nearly constant with redshift and luminosity  $SF_{\infty}$  increases with decreasing luminosity and rest-frame wavelength, and without a correlation with redshift  $SF_{\infty}$  is correlated with black hole mass, independent of the anti-correlation with luminosity  $SF_{\infty}$  is anti-correlated with the Eddington ratio, which suggests a scenario where optical fluctuations are tied to variations in the accretion rate.

**M**<sub>BH</sub> MacLeod et al. 2010

#### **S82 Variability-Based Quasar Selection**

• DRW model:

Butler & Bloom 2011; MacLeod+ 2011; Choi+ 2014 (extended AGN)

- SF rising slope: Schmidt+ 2010; Palanque-Delabrouille+ 2011; Peters+ 2015
- SDSS III: adding 78,086
   qsos (Paris+ 2012)



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