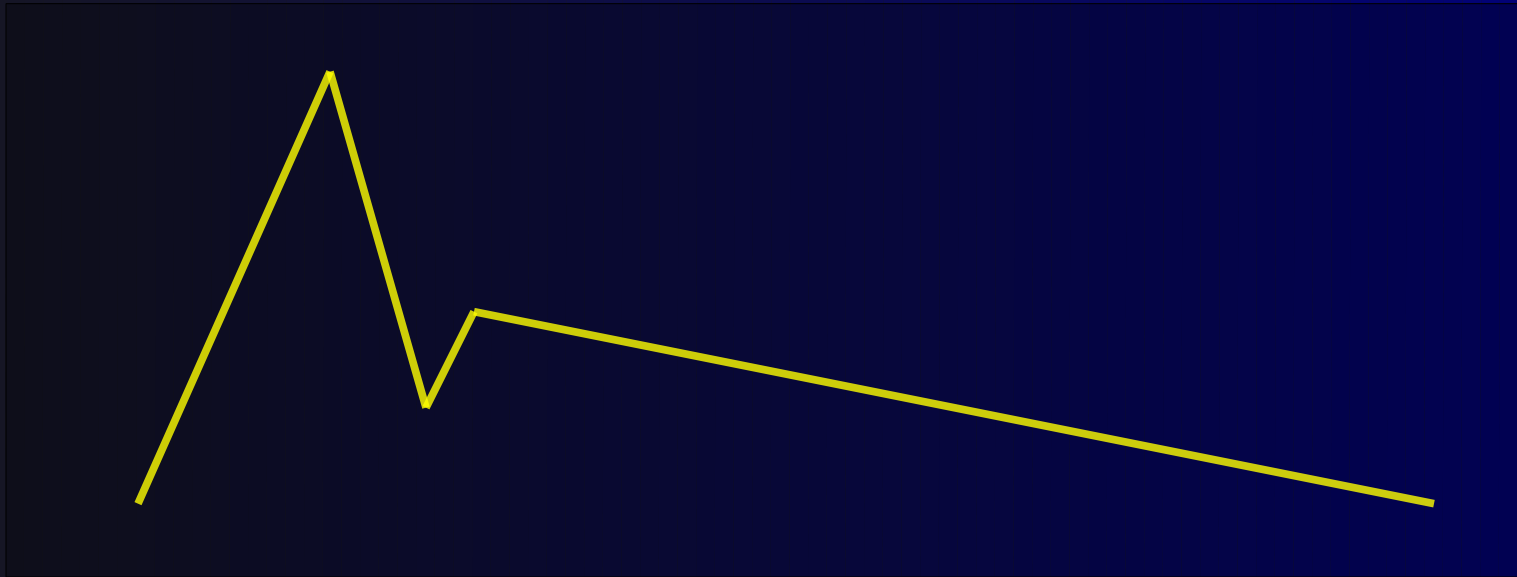


# QSOs in the Time-Domain: Monitoring and Detection



Nat Butler  
(UC Berkeley / ASU)

# UCB Center for Time Domain Informatics

## Berkeley (UCB):

### *Faculty/Staff*

Josh Bloom, Dan Starr (Astro.), John Rice, Nouredine El Karoui (Stats), Martin Wainright, Masoud Nikraves (CS)

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### *Grad Students*

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### *Undergrads*

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## Lawrence Berkley Laboratory (LBNL):


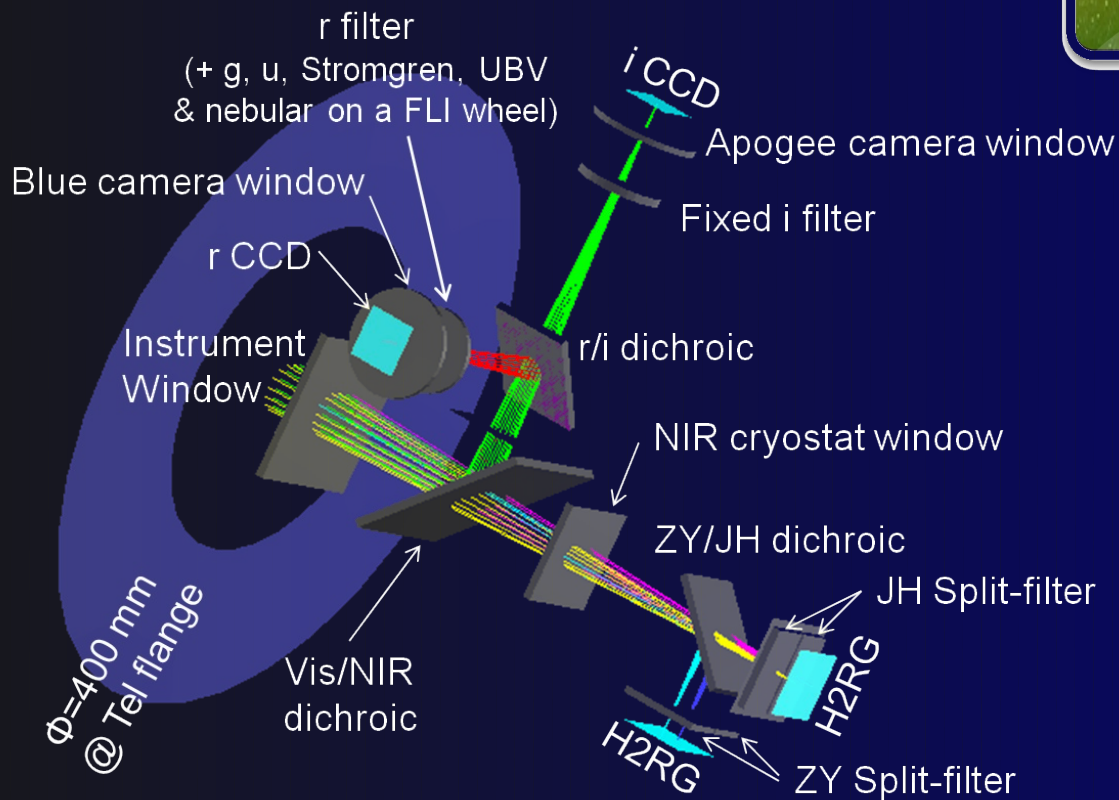
Peter Nugent, David Schlegel, Nic Ross, Horst Simon

## Non UCB-CfTDI, University of Washington:

Chelsea Macleod, Zeljko Ivezic, Scott Anderson

THE REIONIZATION AND TRANSIENTS  
INFRARED/OPTICAL PROJECT

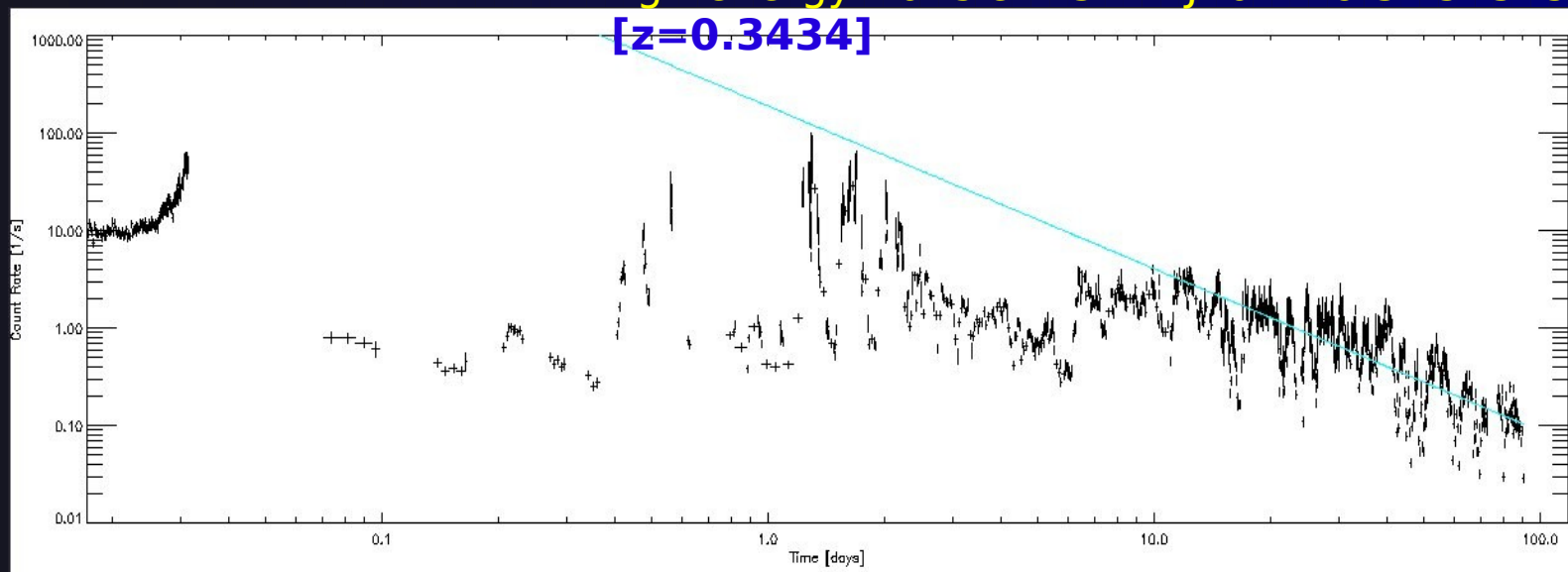
# RATIR

# Nuclear Transients

high-energy transient Swift J164449.3+573451

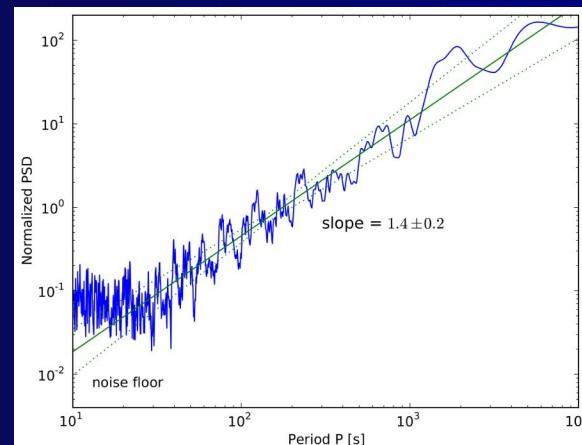
[ $z=0.3434$ ]



*Bloom++*:

“A relativistic jetted outburst from a massive black hole fed by a tidally disrupted star”

(also, *Levan++*)



# Transients from the Ground

**SDSS-II** (“stripe 82”): 2.5m Telescope, 290 deg sq. (total), ~3 day cadence over 6 years (mag > 21.5)

Palomar Transients Factory (**PTF**): 48” Telescope, 7.8 deg sq. field, 1hr - 1 day cadence (mag 21 in 60s).

**Pan-STARRS1**: 4x1.8m Telescopes, 7 deg sq. field, whole sky every ~4 days (mag 23 in 30s).

**LSST** (2019): 8m Telescope, 10 deg sq field; all sky every 3 days (mag 24 in 15s).

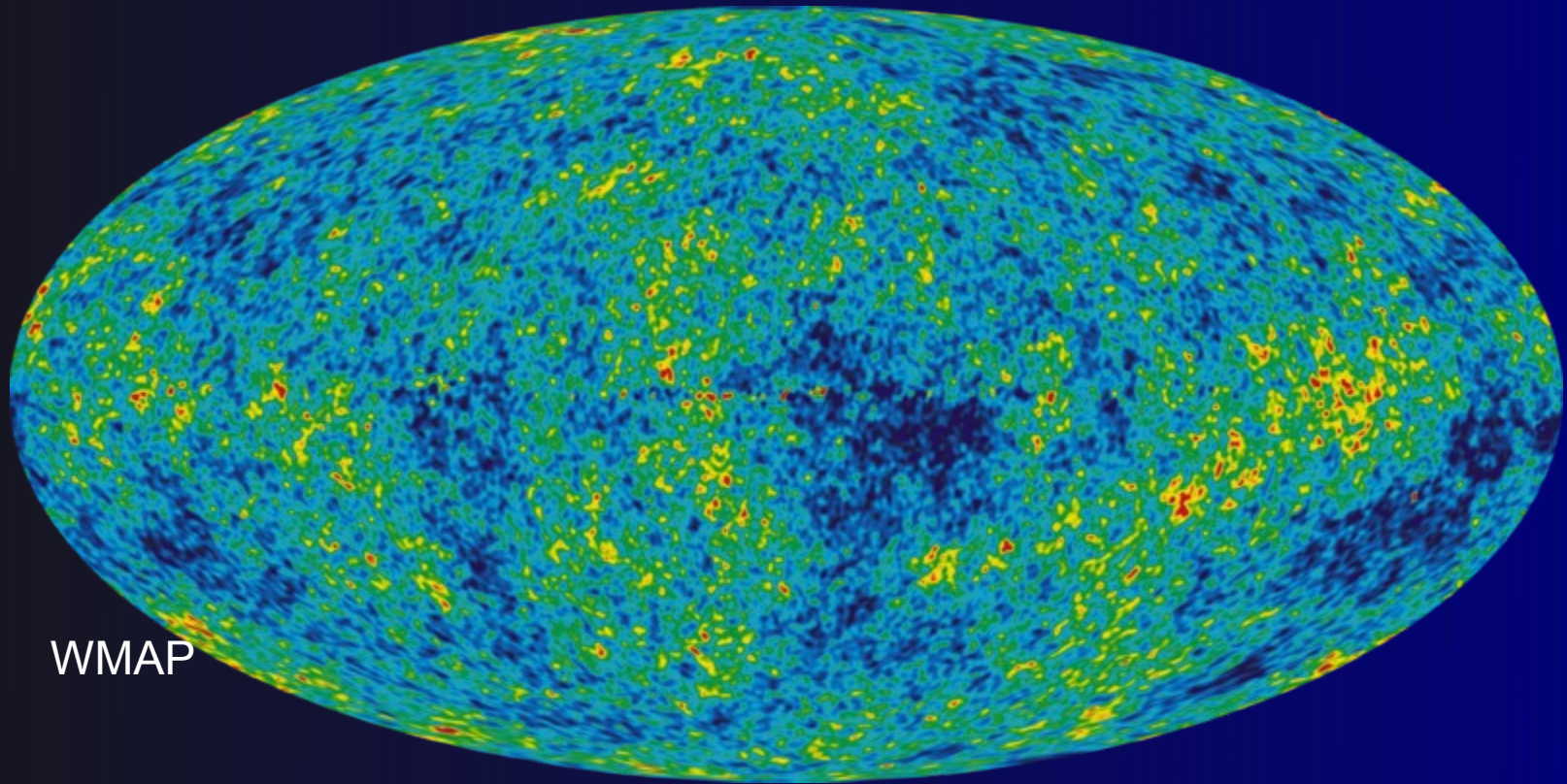
Synoptic All-Sky InfraRed (**SASIR**) survey: 1 day cadence, followup, all-sky every 3 months

+ many others datasets  
(HIPPARCOS, OGLE, ASAS, KEPLER, LINEAR...)





# Endgame: BAO Targets



WMAP

QSO Clustering measurements require targets at a variety of redshifts!

[Next generation surveys  $\sim 10^6$  QSOs]

*(e.g., Schlegel et al 2009)*



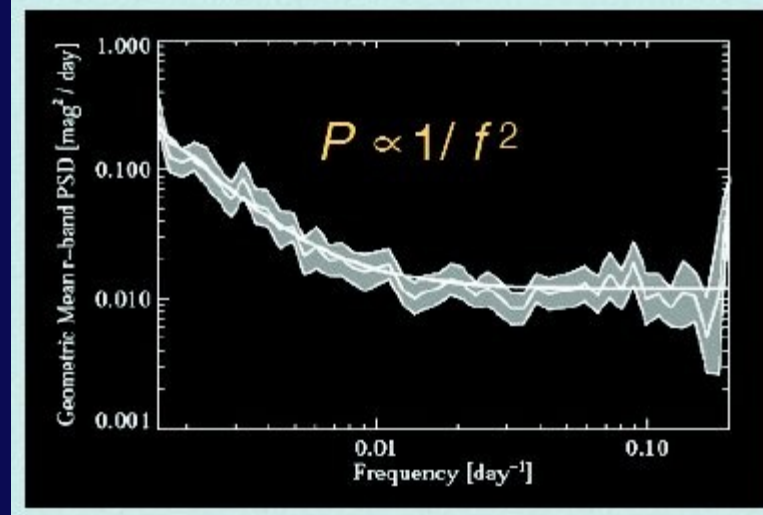
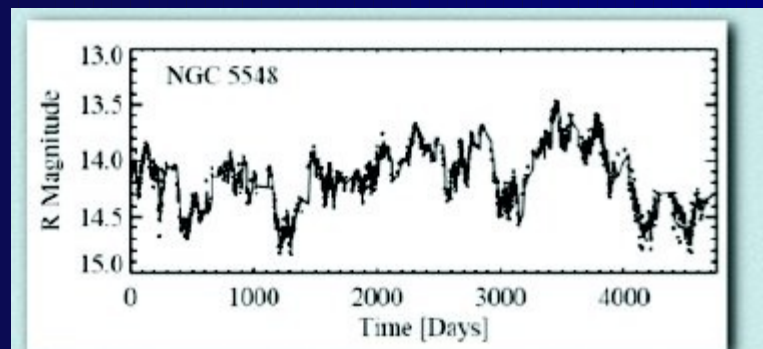
# QSO Variability Intro

>90% of QSOs (*Sesar+07*)  
[>99% *Butler&Bloom11*]

QSOs are variable!

10-20% scale variability (rms)  
In optical/NIR

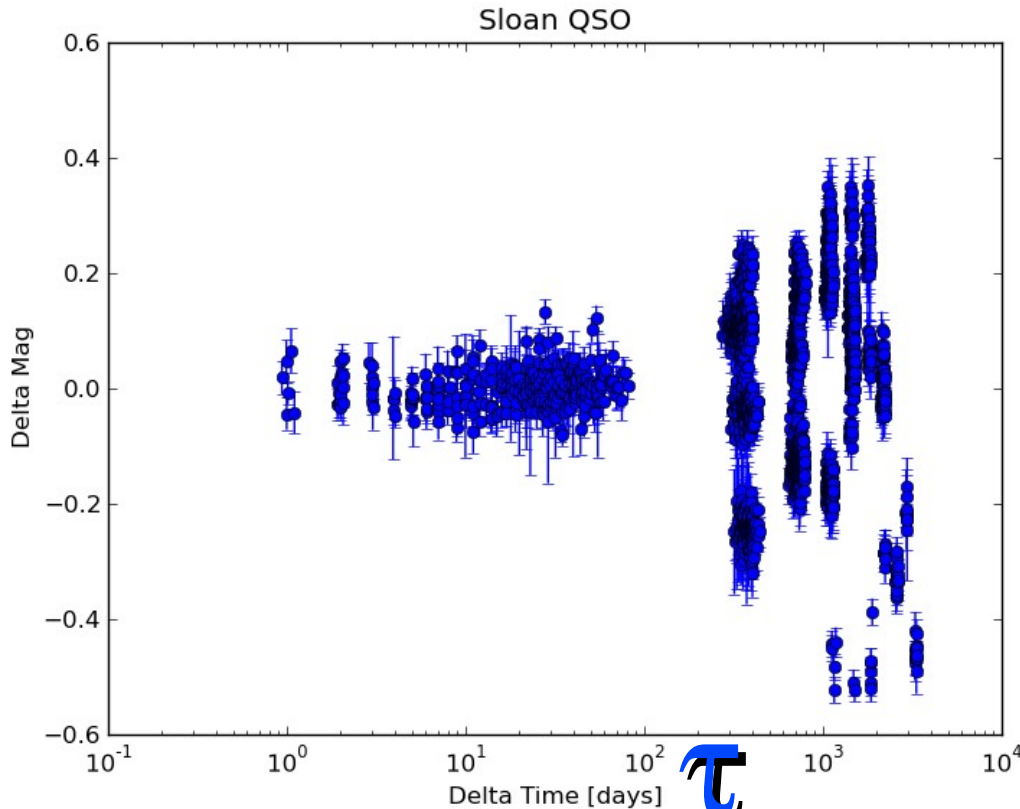
Intrinsic! (accretion disk),  
Aperiodic, and stochastic





# Quasar Classification

(Butler & Bloom 2011; AJ, 143)



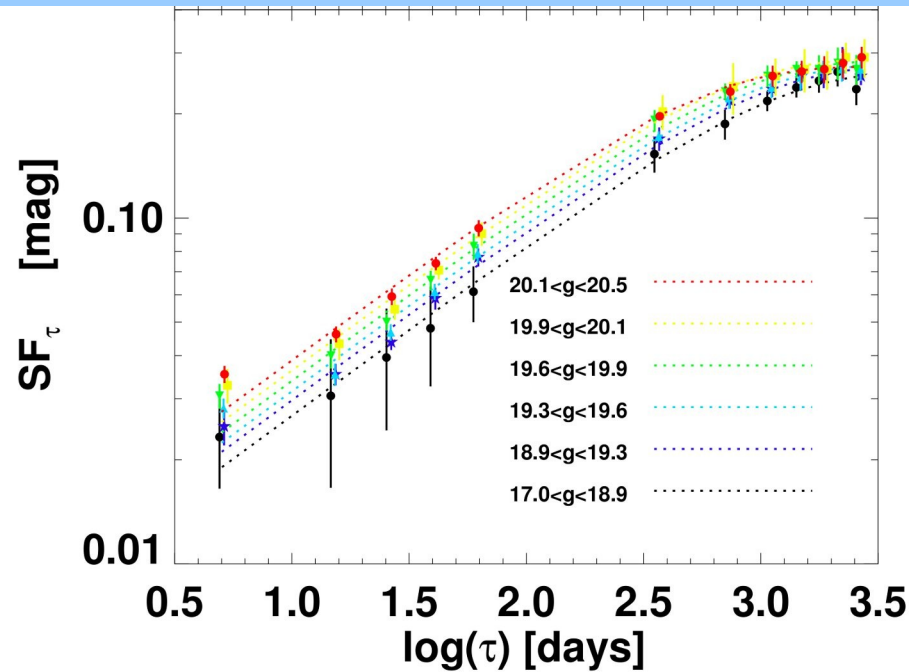
Model the Lightcurves.

Evaluate Likelihood  
 $P(\Delta m | \tau)$ .

Classify based on few  
epochs.

$\tau_{ij}$

# SDSS Stripe 82 “Structure Func.”



Exploit QSO “structure”

Model as damped  
random walk to get:

$$P(x|\hat{\sigma}^2, \tau_o) \propto |C|^{-1/2} \exp[-0.5(x - x_o)^T C^{-1}(x - x_o)]$$
$$-0.5\chi_{\text{QSO}}^2 = -0.5(x - x_{o,\text{best}})^T C^{-1}(x - x_{o,\text{best}})$$

$$SF_{\tau} \propto \hat{\sigma} \tau_o^{1/2} [1 - \exp(-\tau_{ij}/\tau_o)]^{1/2}$$

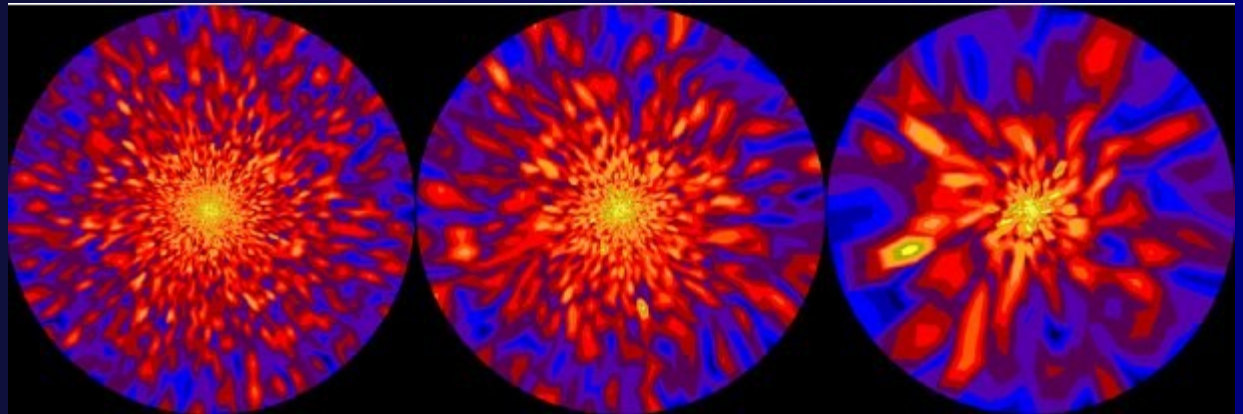
*(Kelley et al. 2009, Koslowski & Kochanek 2010) [Rybicki & Press 1994]*

# Implies Inhomogeneous Disk

$$SF_{\tau} \propto \hat{\sigma} \tau_{\circ}^{1/2} [1 - \exp(-\tau_{ij}/\tau_{\circ})]^{1/2}$$

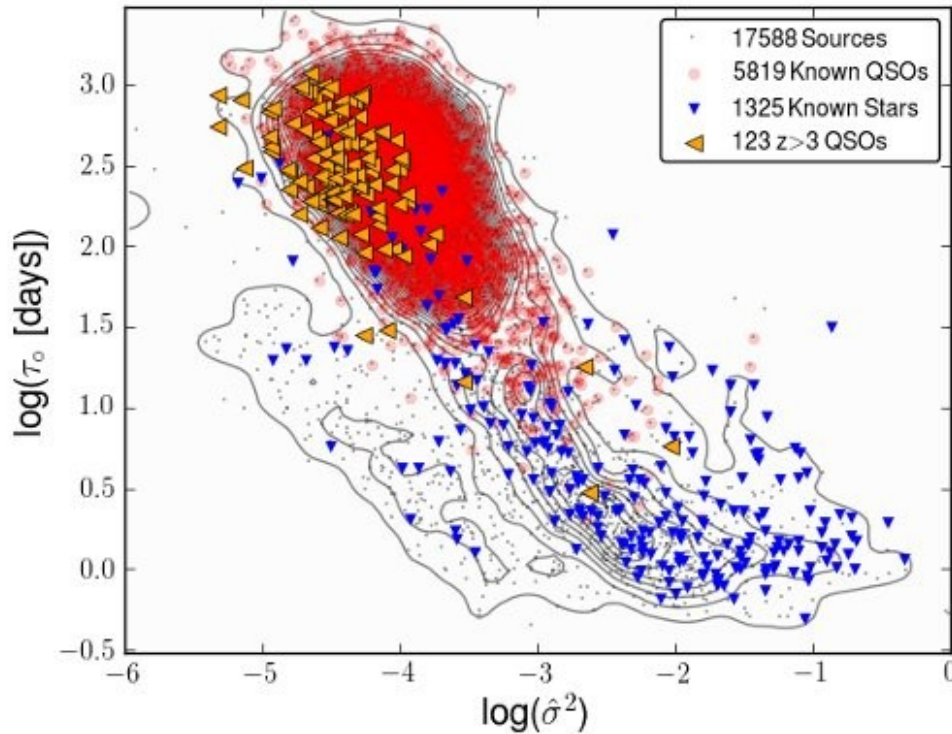
10-20% rms implies  $\sim N^{1/2}$  larger (order unity) variation

Disk must be patchy, hence instabilities



*(Dexter & Agol 2011)*

# Deeper Questions

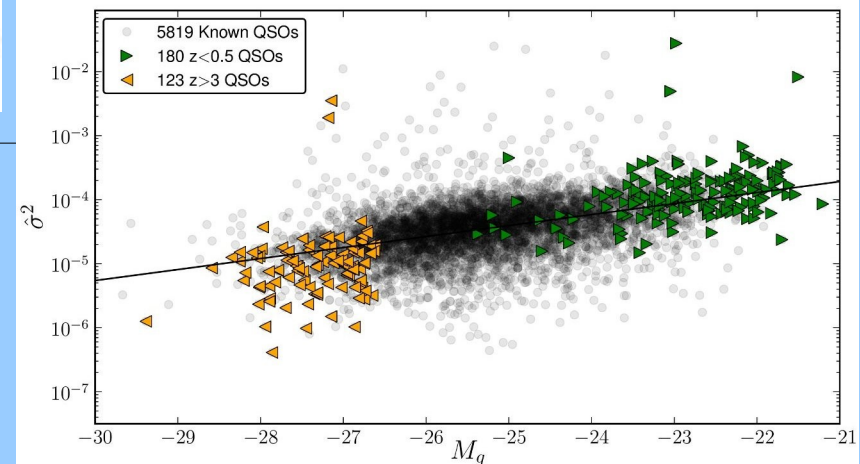


How do parameters relate to fundamental QSO processes?

(*cf, Kelley+, MacLeod+*)

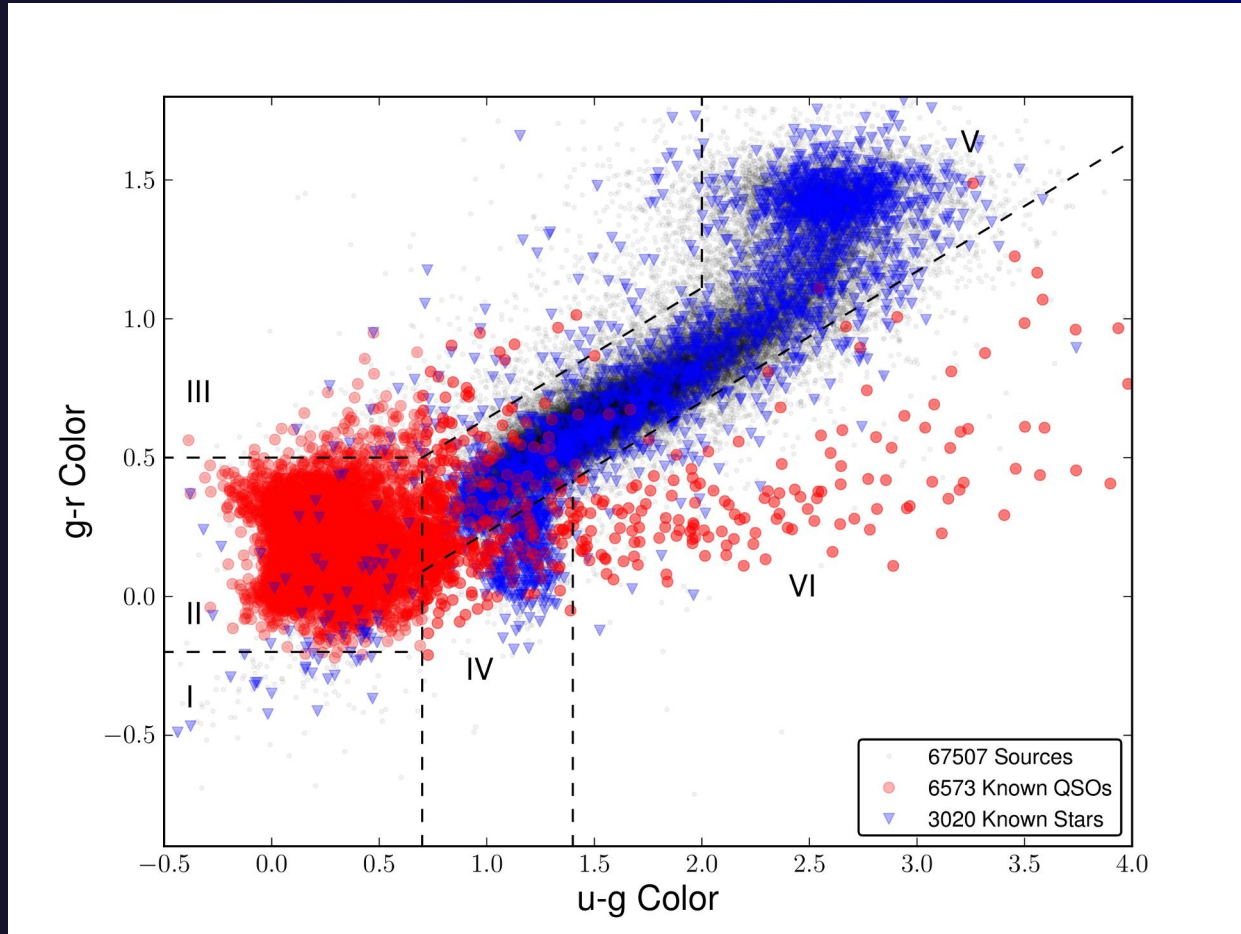
How to constrain based on intrinsic quantities?

$$SF_{\tau} \propto \hat{\sigma} \tau_0^{1/2} [1 - \exp(-\tau_{ij}/\tau_0)]^{1/2}$$



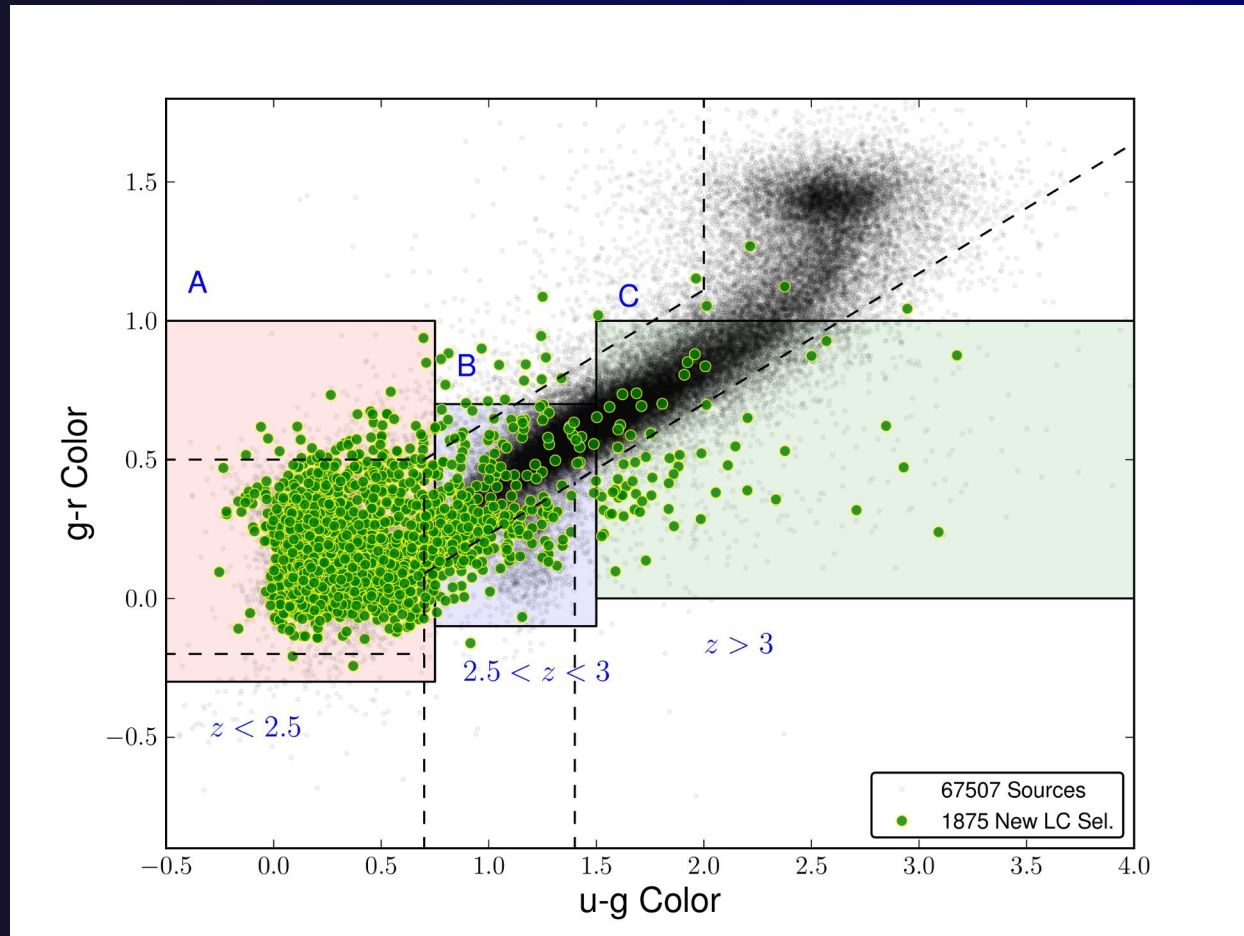


# QSO/Variable Star Selection (color)

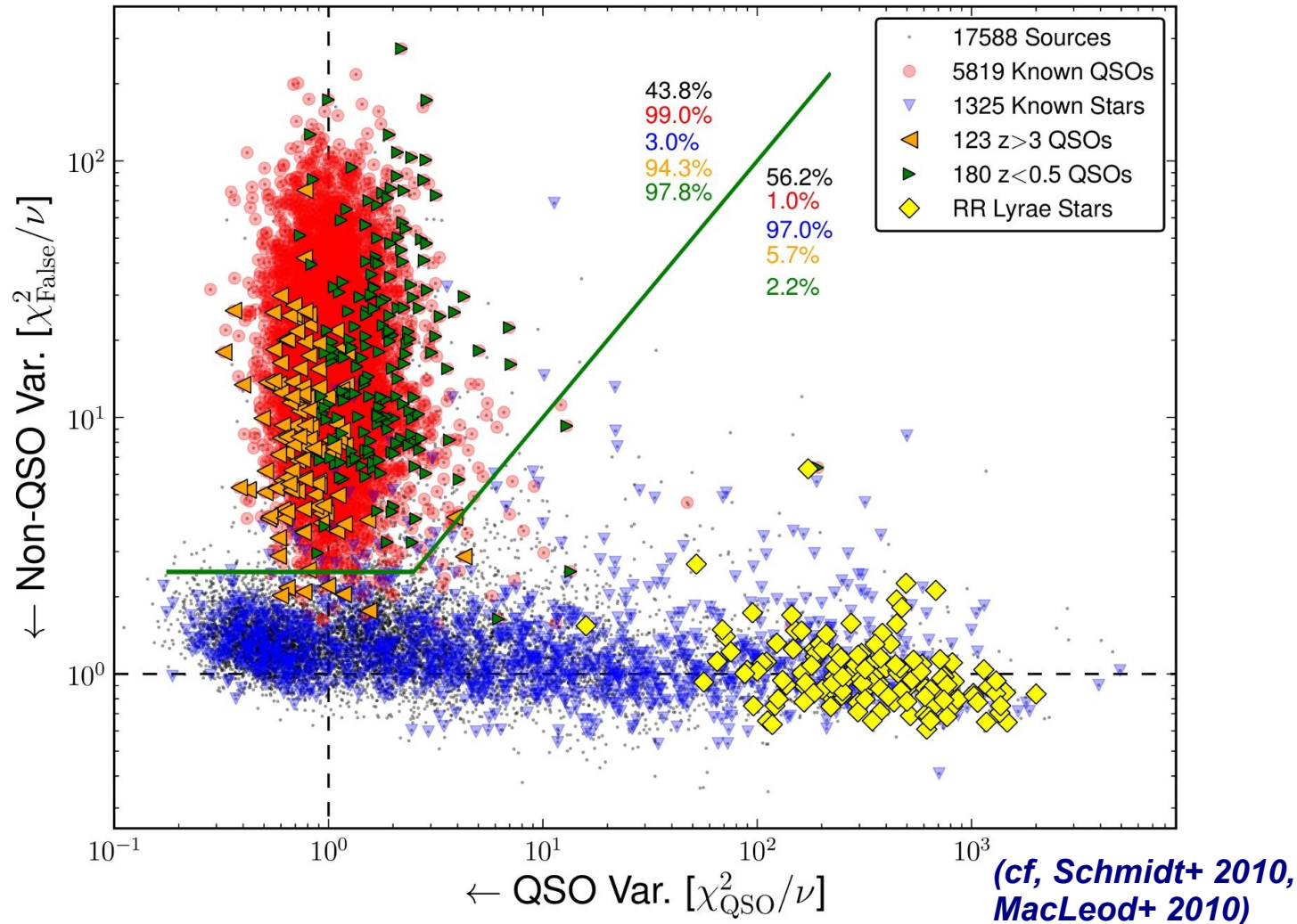


*(e.g., Sesar et al. 2007)*

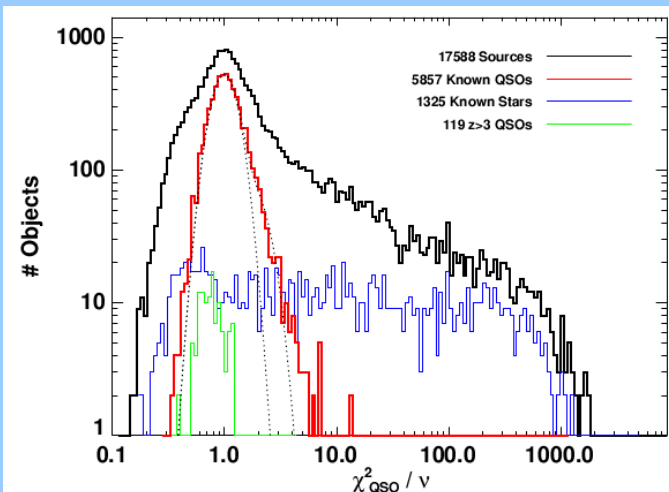
# Time Selection in Color-Color Space



# QSO/Variable Star Selection (time)

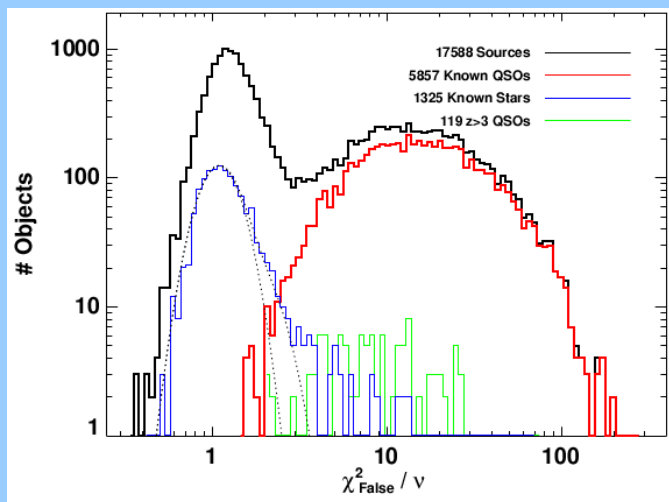


# Simple Case: Optimal Selection



**QSOs**

**Stars**



## Model Mis-Specification & Data Scatter

$$P(\chi_{\text{QSO}}^2 | x, \text{quasar}) \propto (y'[1 - y'])^{(\nu-1)/2}$$

$$y' \equiv \nu / [\nu + \chi_{\text{QSO}}^2]$$

$$P(\chi_{\text{QSO}}^2 | x, \text{not quasar}) \propto (y[1 - y])^{(\nu-1)/2}$$

$$y \equiv \chi_{\text{QSO}}^2 / [\chi_{\text{QSO}}^2 + v_x \text{Tr}(C^{-1})]$$

$$v_x \equiv \langle x^2 \rangle - \langle x \rangle^2$$

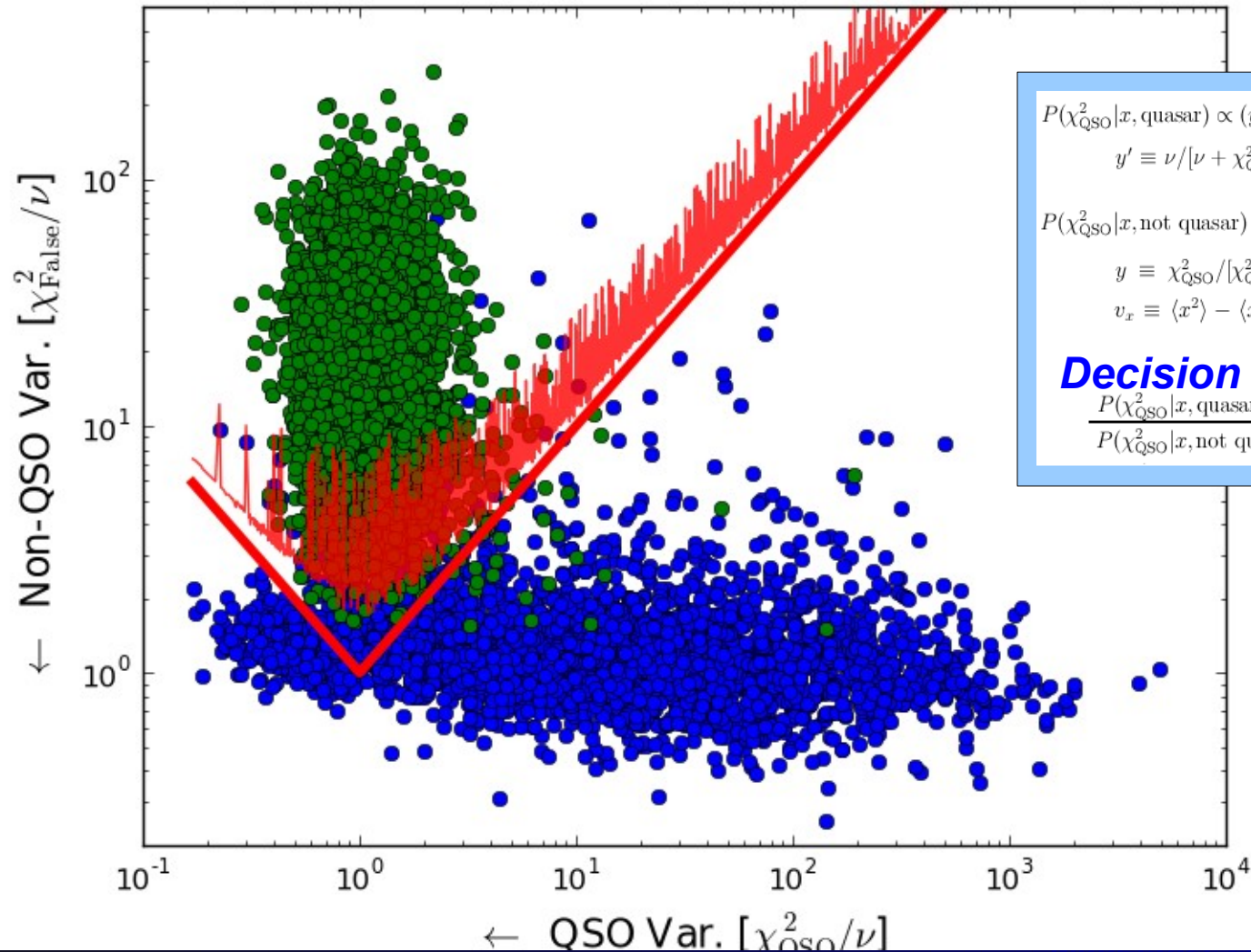
### Decision Rule:

$$\frac{P(\chi_{\text{QSO}}^2 | x, \text{quasar})}{P(\chi_{\text{QSO}}^2 | x, \text{not quasar})} = \text{const.}$$

**(Neyman-Pearson Lemma)**



# QSO/Variable Star Selection (time)



$$P(\chi^2_{\text{QSO}}|x, \text{quasar}) \propto (y'[1-y'])^{(\nu-1)/2}$$

$$y' \equiv \nu/[\nu + \chi^2_{\text{QSO}}]$$

$$P(\chi^2_{\text{QSO}}|x, \text{not quasar}) \propto (y[1-y])^{(\nu-1)/2}$$

$$y \equiv \chi^2_{\text{QSO}}/[\chi^2_{\text{QSO}} + v_x \text{Tr}(C^{-1})]$$

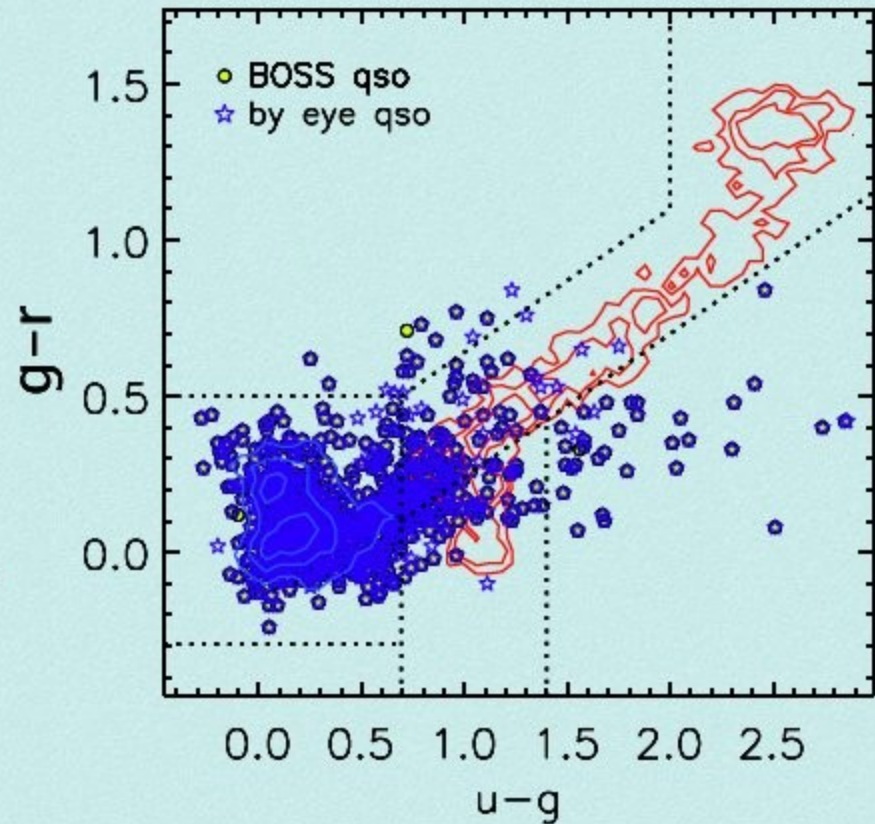
$$v_x \equiv \langle x^2 \rangle - \langle x \rangle^2$$

**Decision Rule:**

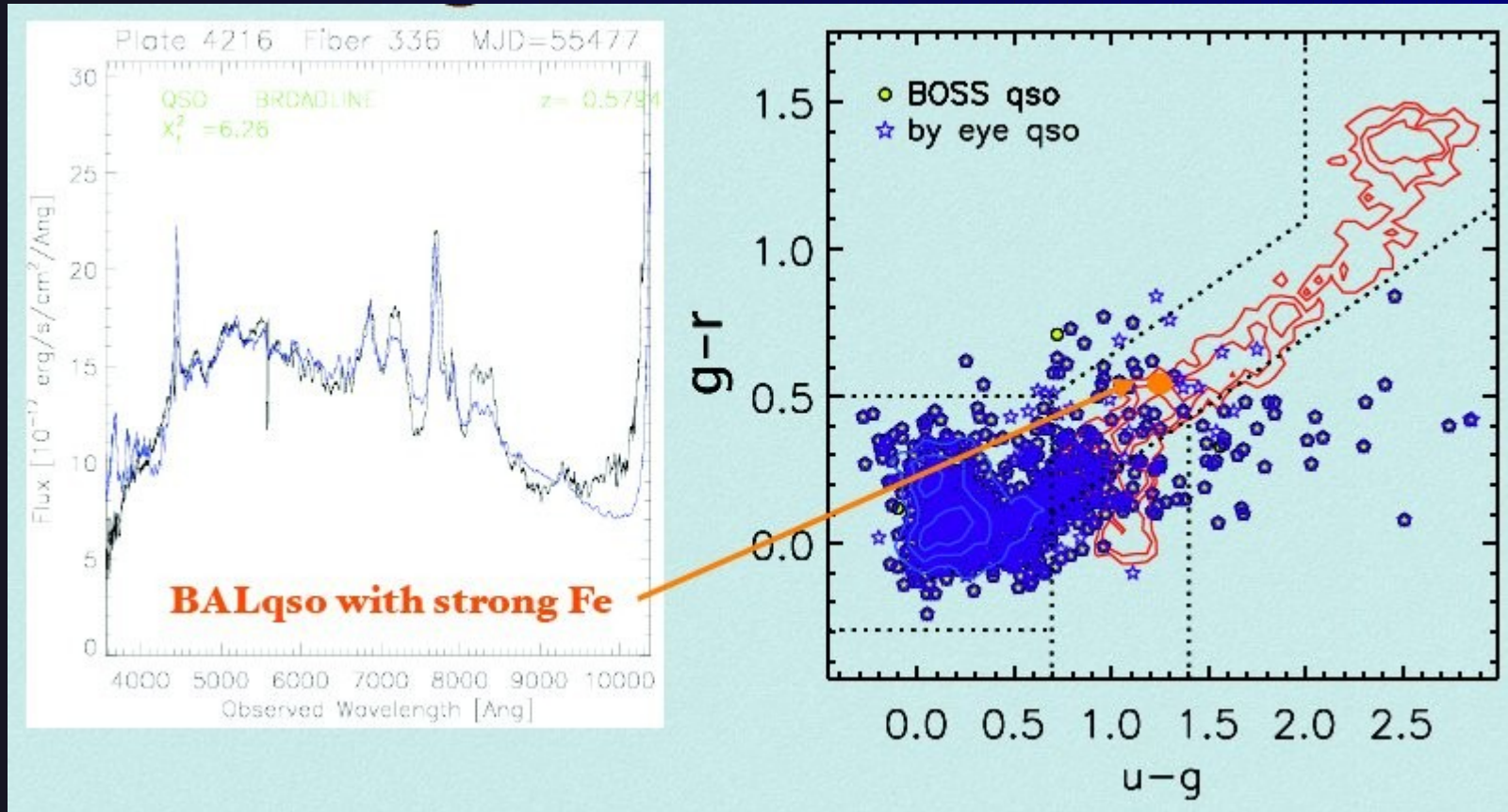
$$\frac{P(\chi^2_{\text{QSO}}|x, \text{quasar})}{P(\chi^2_{\text{QSO}}|x, \text{not quasar})} = \text{const.}$$

# SDSS III: “No QSO Left Behind”

- ❖ 1500 targets ( $7 \text{ deg}^{-2}$ ),  
 $16.2 < i < 20.5$ ,  
 $(g-i) < 1.8$
- ❖ Results:
  - ❖ 917 BOSS “qsos”
  - ❖ 941 qsos according to  
by-eye spectral  
classification

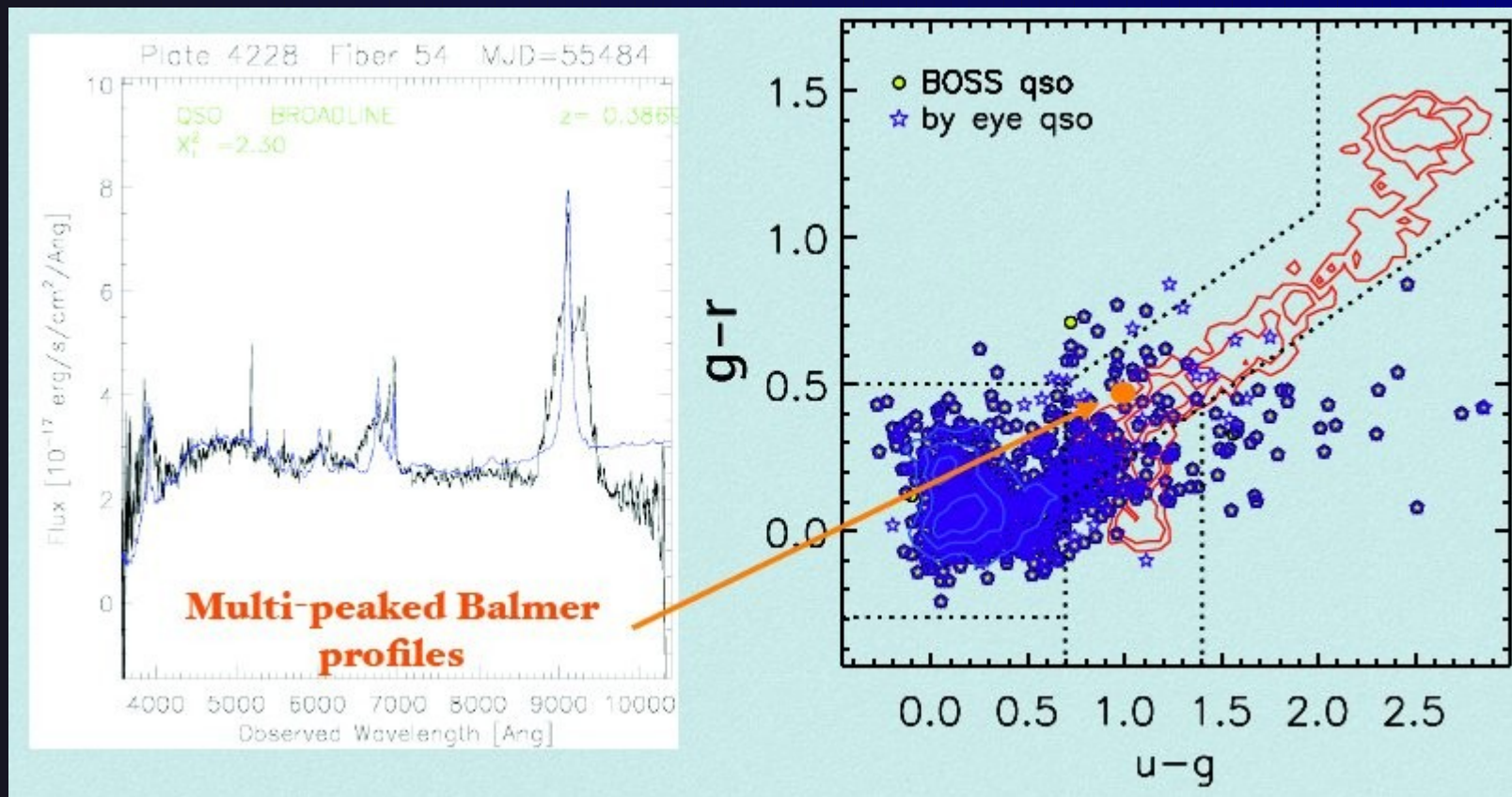


# No Color Bias



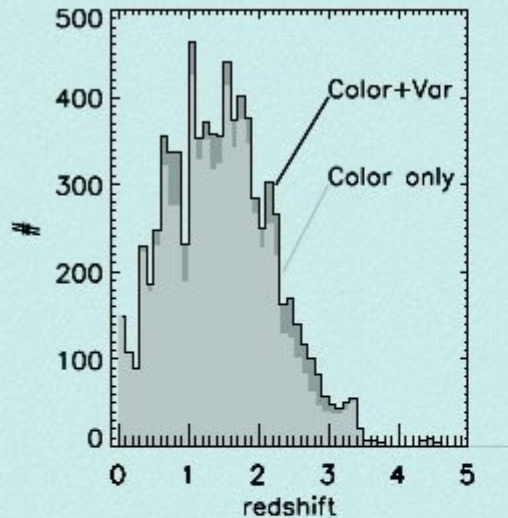


# No Color Bias

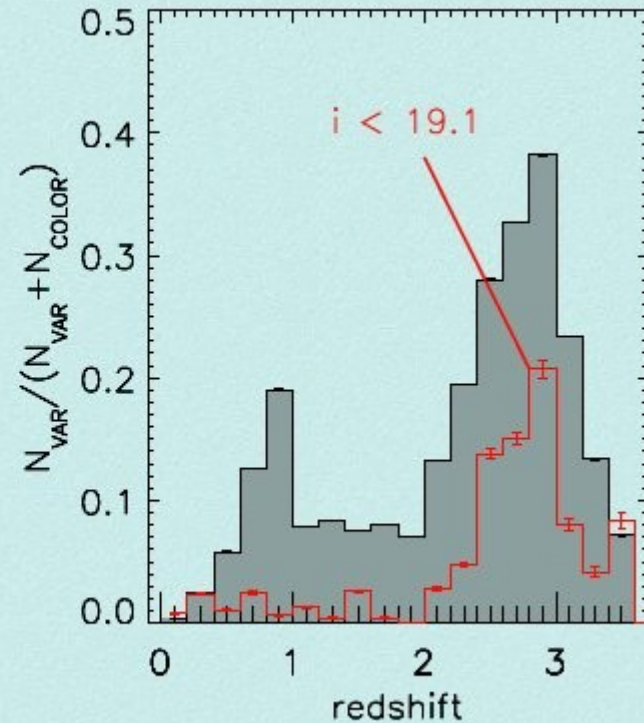




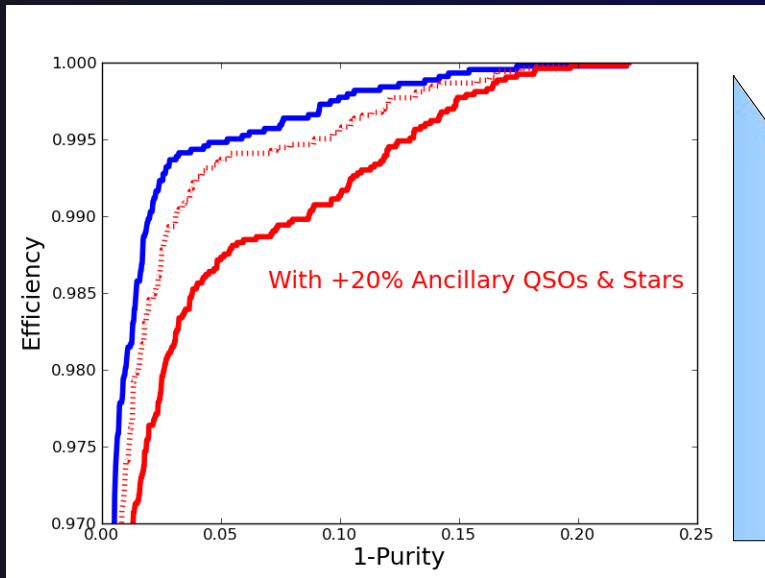
# No Redshift Bias



**\*\* 17% of  $z > 2.2$  quasars in our sample not already targeted by BOSS! (BOSS\_target1 = 0)**



# Classification is VERY Robust



$$P(\chi_{\text{QSO}}^2 | x, \text{quasar}) \propto (y'[1 - y'])^{(\nu-1)/2}$$

$$y' \equiv \nu / [\nu + \chi_{\text{QSO}}^2]$$

$$P(\chi_{\text{QSO}}^2 | x, \text{not quasar}) \propto (y[1 - y])^{(\nu-1)/2}$$

$$y \equiv \chi_{\text{QSO}}^2 / [\chi_{\text{QSO}}^2 + v_x \text{Tr}(C^{-1})]$$

$$v_x \equiv \langle x^2 \rangle - \langle x \rangle^2$$

**Decision Rule:**

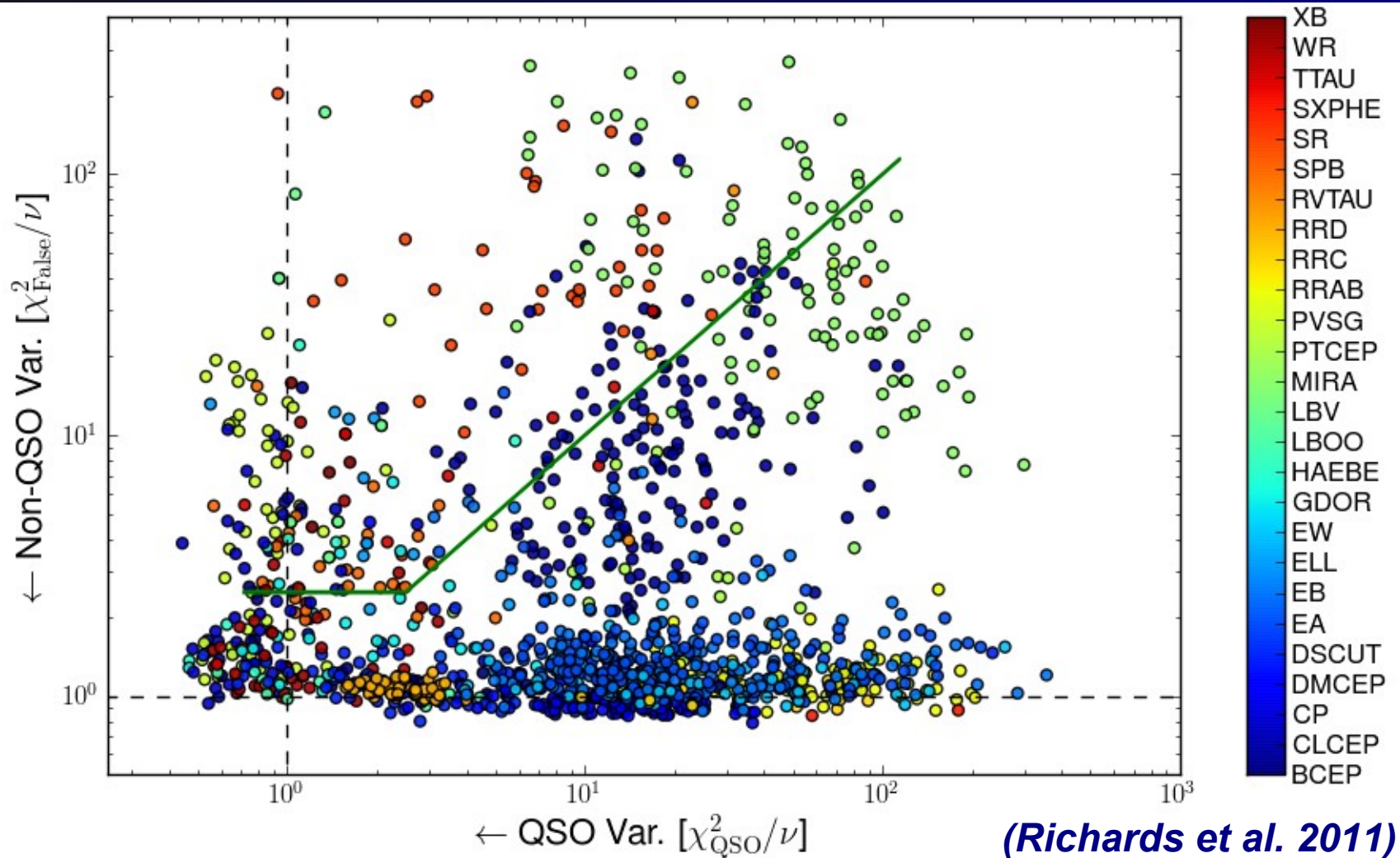
$$\frac{P(\chi_{\text{QSO}}^2 | x, \text{quasar})}{P(\chi_{\text{QSO}}^2 | x, \text{not quasar})} = \text{const.}$$

But there are many “unlabeled” (faint) sources in Stripe 82.

Will we detect the QSOs, reject the stars?

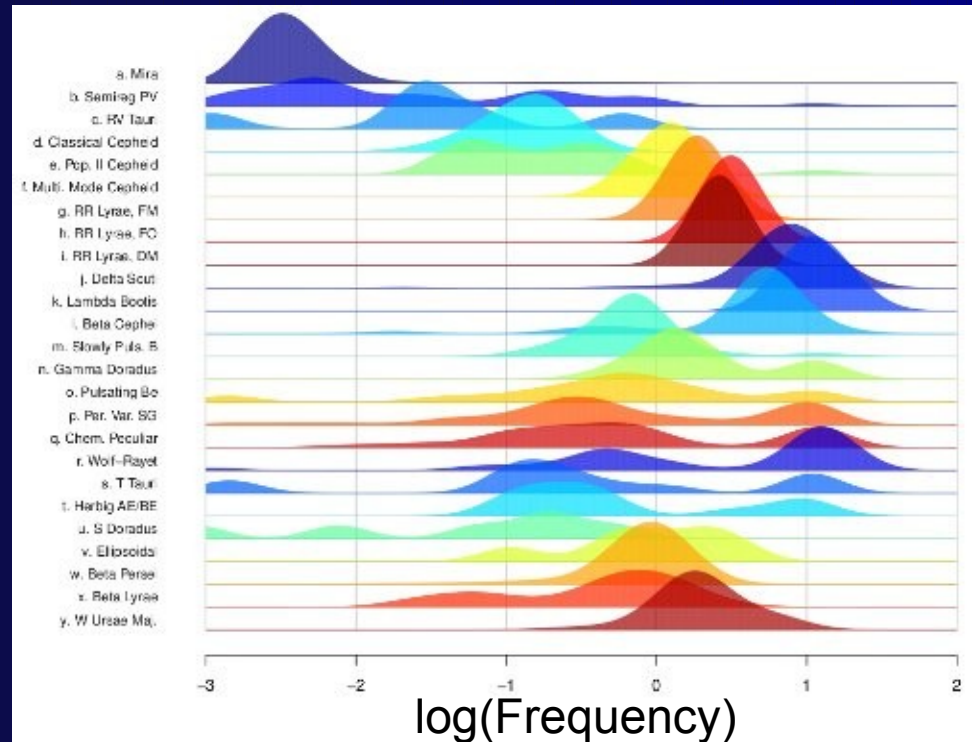
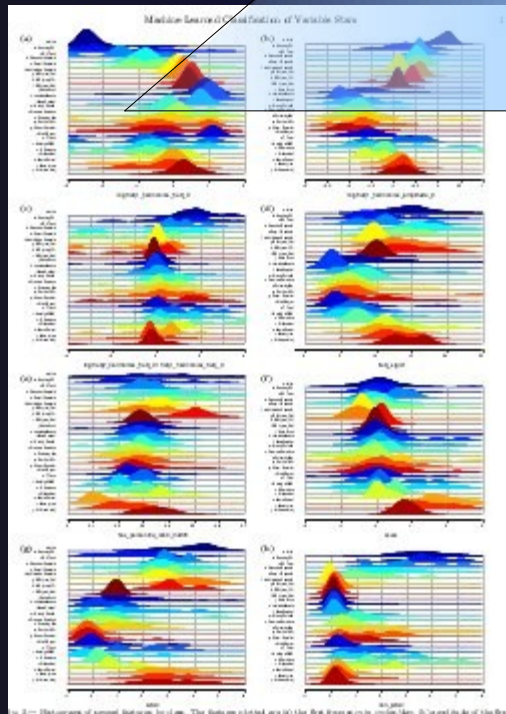


# QSO Interlopers



# Supervised Variable Star Classification

(Joey Richards et al. 2011;  
ArXiv:1101.1959)



1542 Hipparcos + OGLE lightcurves →  
52 “features” (mostly periodic) →  
Decision Tree classification (25 classes)



# Next Steps

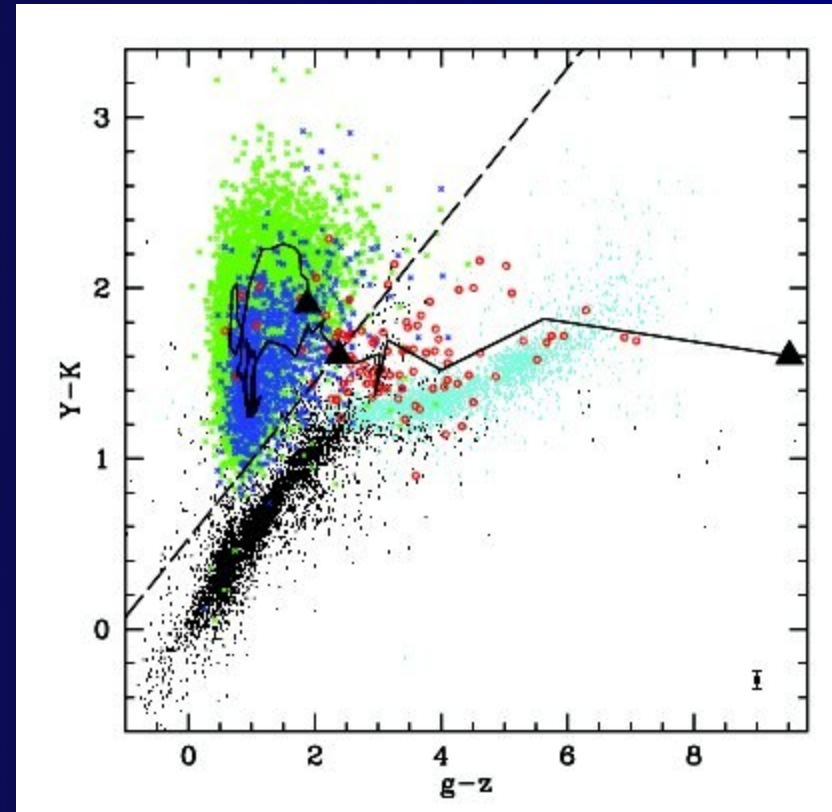
Pilot program to monitor quasars and Fermi blazars with PAIRITEL

Additional SDSS monitoring:

Hectospec spectroscopy (A. Morgan)  
SDSS-3 no QSO left behind

Toward high- $z$  QSO detection with SASIR

-Observations and Monitoring with RATIR



*(Wu & Jia 2010; Wu++ 2011)*