

# Time-Domain Quasar Selection

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Transients Classification (optical surveys!):

Variable Stars, Collaborations w/ Stats People

Quasars, color-independent BAO Targeting

*(Butler & Bloom 2010; arXiv:1008.3143)*

Collaborators:

UCB Josh Bloom, Dan Starr, Dovi Poznanski (Astronomy),  
John Rice, Joey Richards (Stats)

LBNL Nic Ross, Peter Nugent, David Schlegel

Center for Time-Domain Informatics  
(UC Berkeley; <http://cftd.info>)

Josh Bloom (PI), cross-campus collaboration w/ Stats,  
Astronomy, Comp. Sci, etc.

Transients Classification Project (TCP)  
*(Bloom et al. 2008, Starr et al. 2008)*

## Time Series Features:

Simple: mean, variance,  
skewness, kurtosis,  
rise-time, etc.

Complex:  
Fourier decomposition  
Model fitting

More data -->

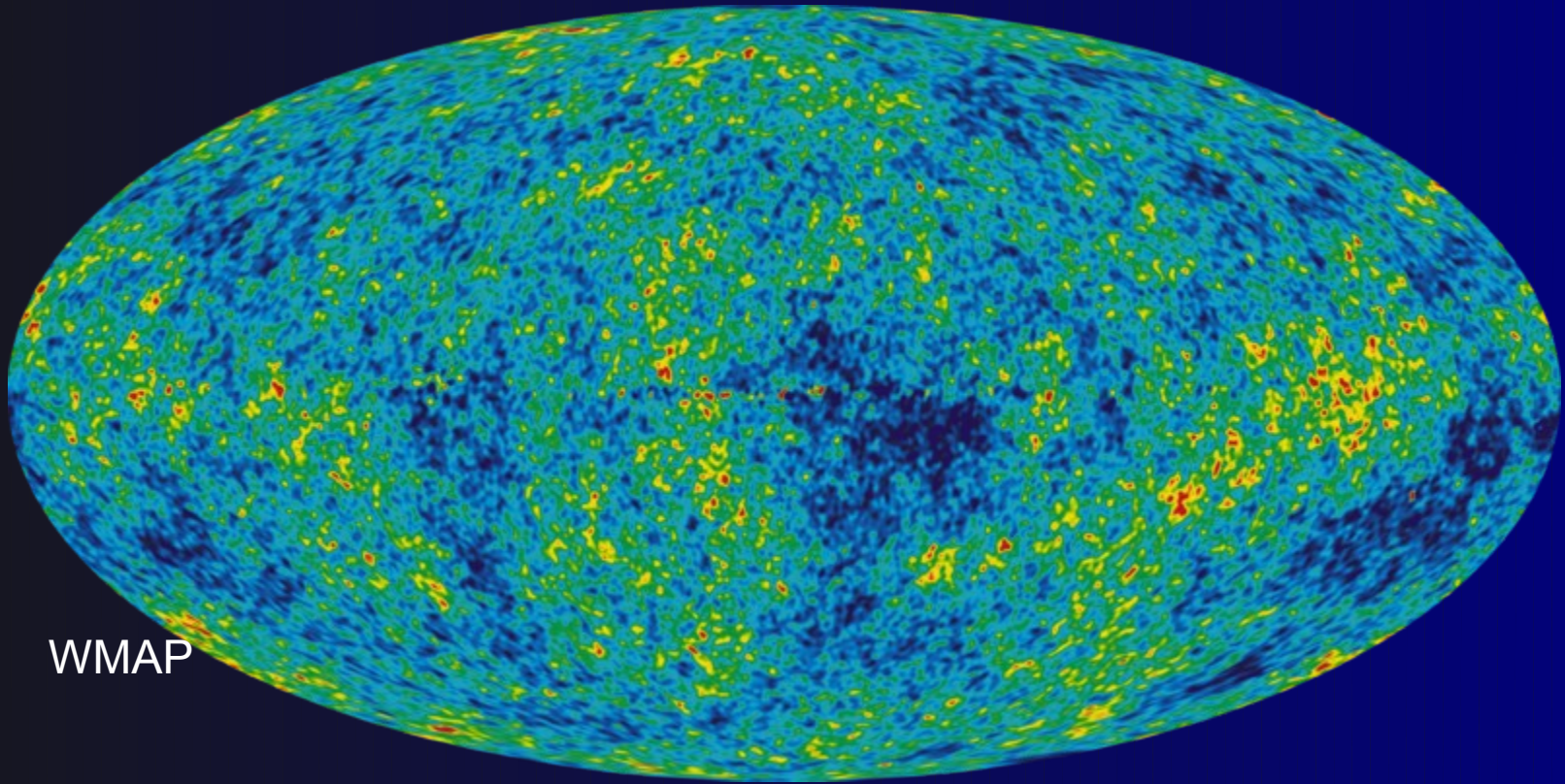
## Context Features:

Position in Galaxy

Catalog Queries:  
Nearby SDSS objects  
and their properties  
Nearby ROSAT objects



# Endgame: BAO Targets



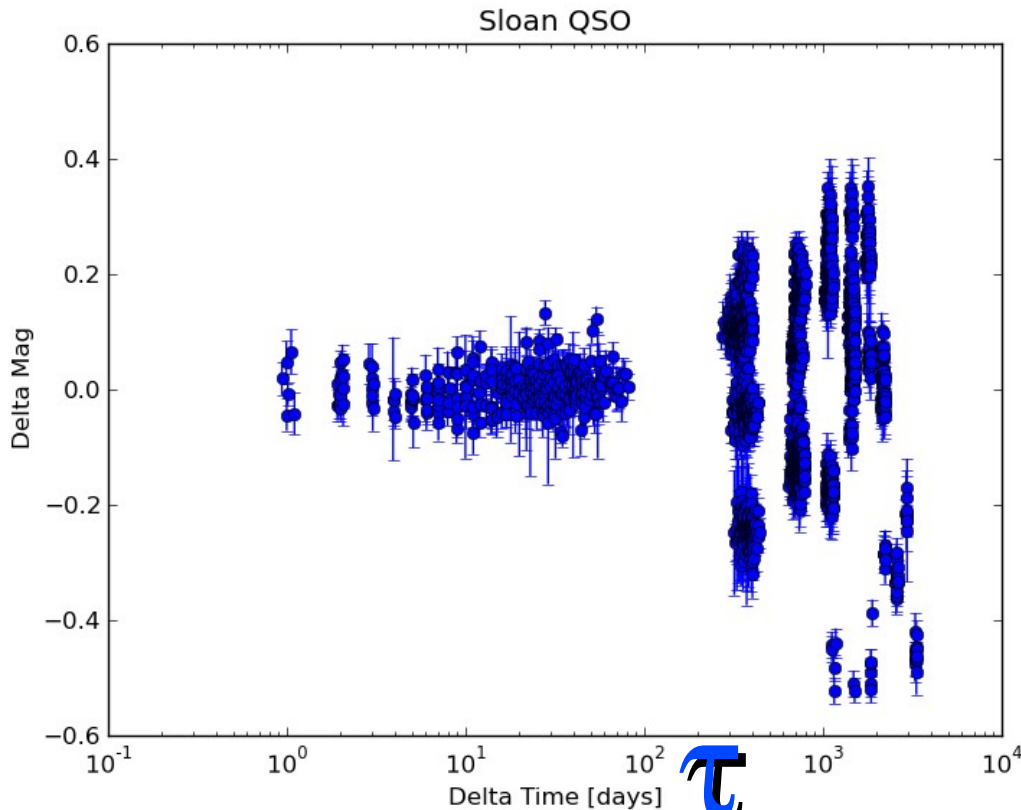
WMAP

QSO Clustering measurements require targets at a variety of redshifts!

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

# Quasar Classification

(Butler & Bloom 2010; arXiv:1008.3143; "Optimal Time-Series Selection of Quasars")



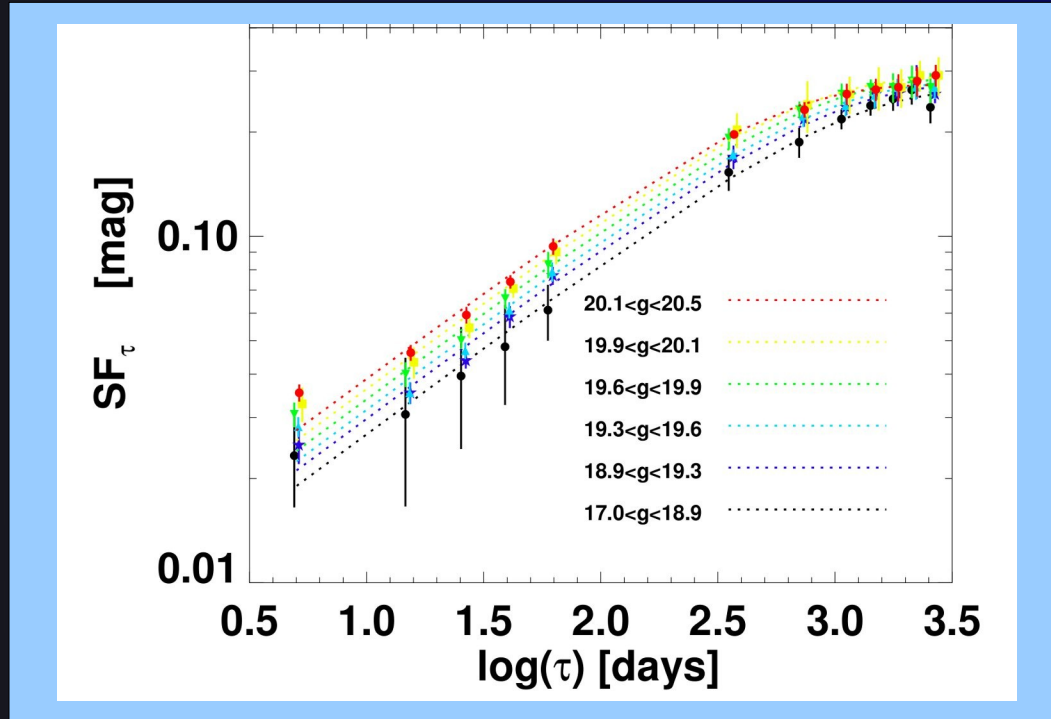
Model the Lightcurves.

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

Classify based on few  
epochs.

# SDSS Stripe 82 “Structure Func.”

(Butler & Bloom 2010)



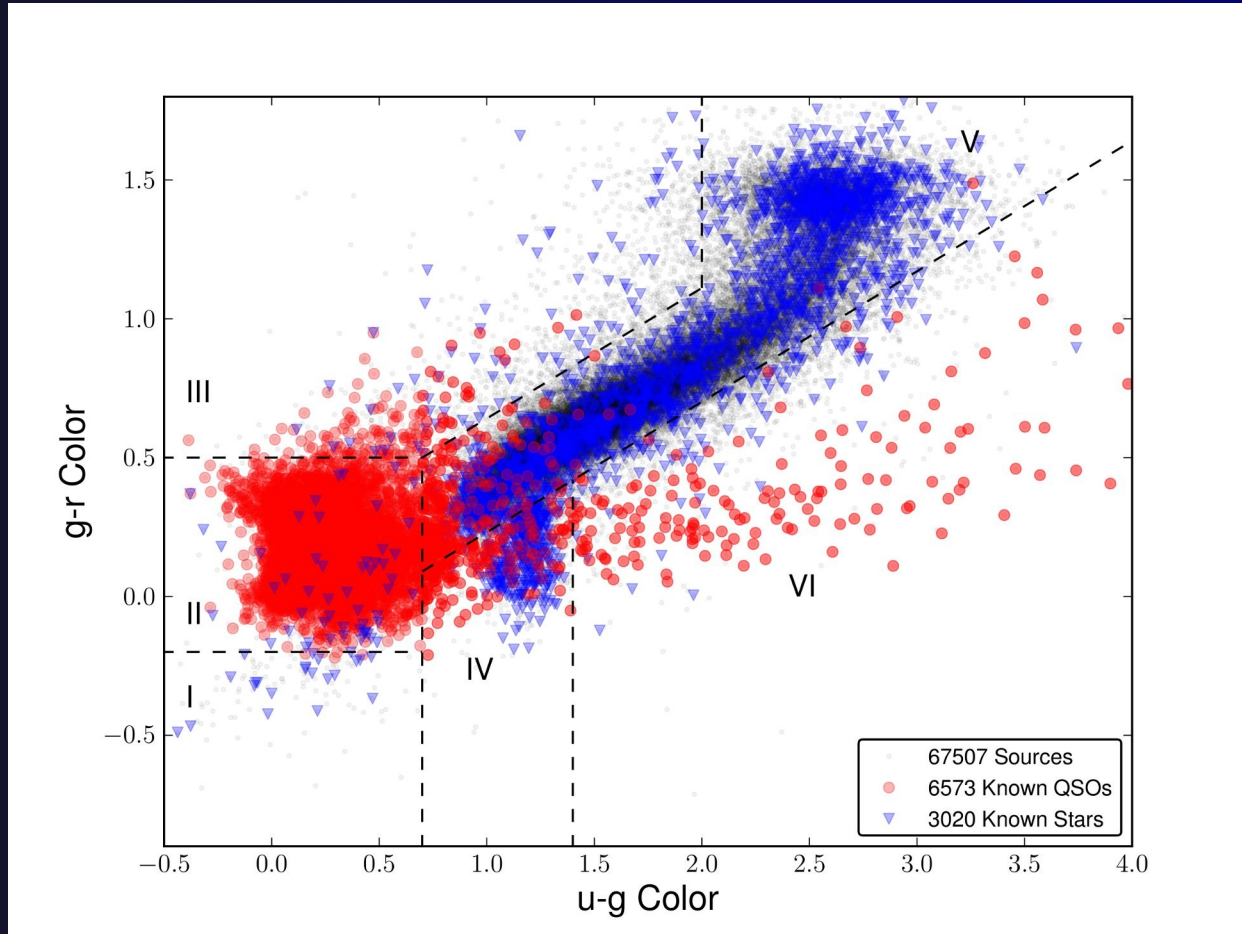
Exploit QSO “structure”

Model as damped  
random walk to get  
 $P(\Delta m|\tau)$ .

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

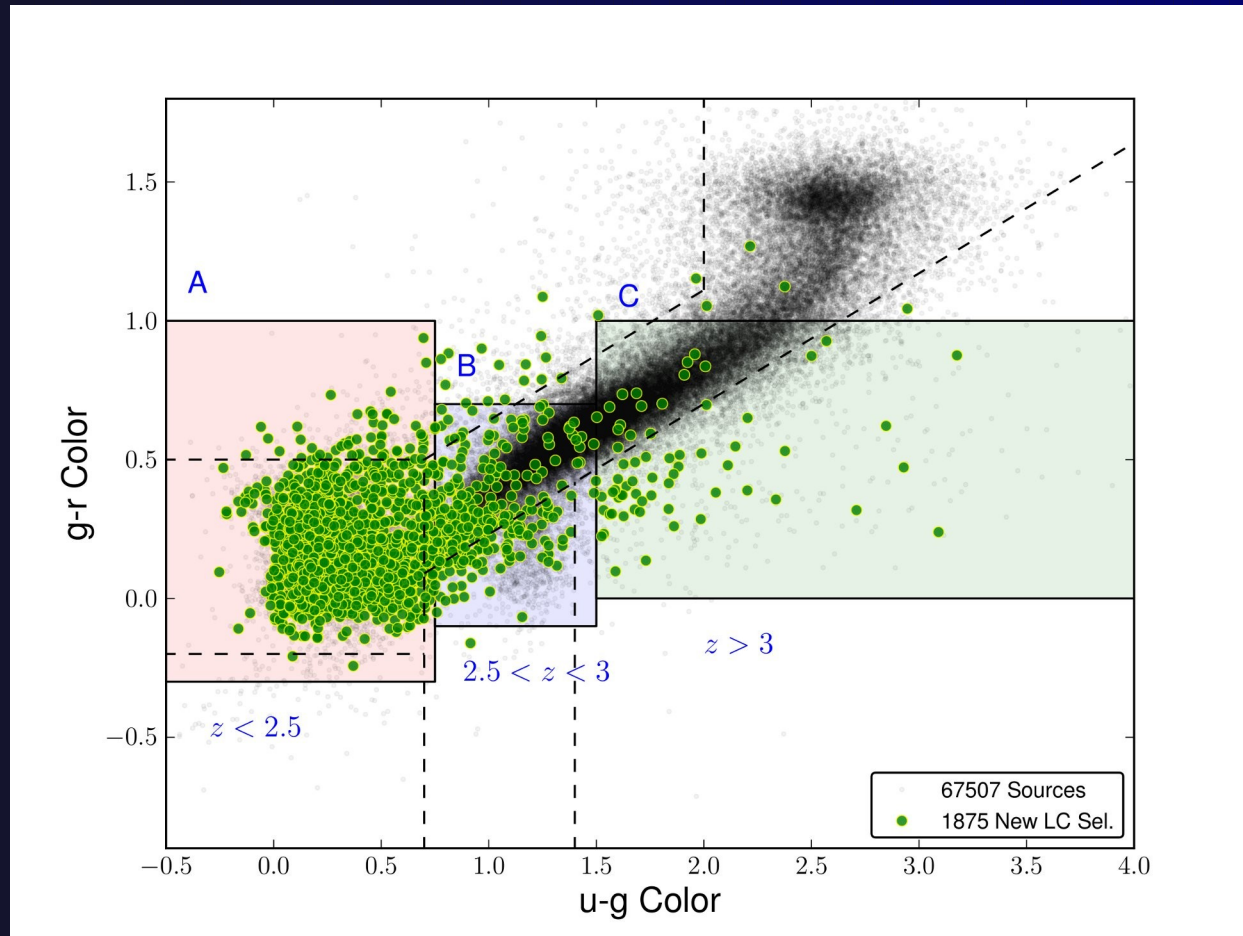
(Kelley et al. 2009, Koslowski & Kochanek 2010) [Rybicki & Press 1994]

# QSO/Variable Star Selection (color)



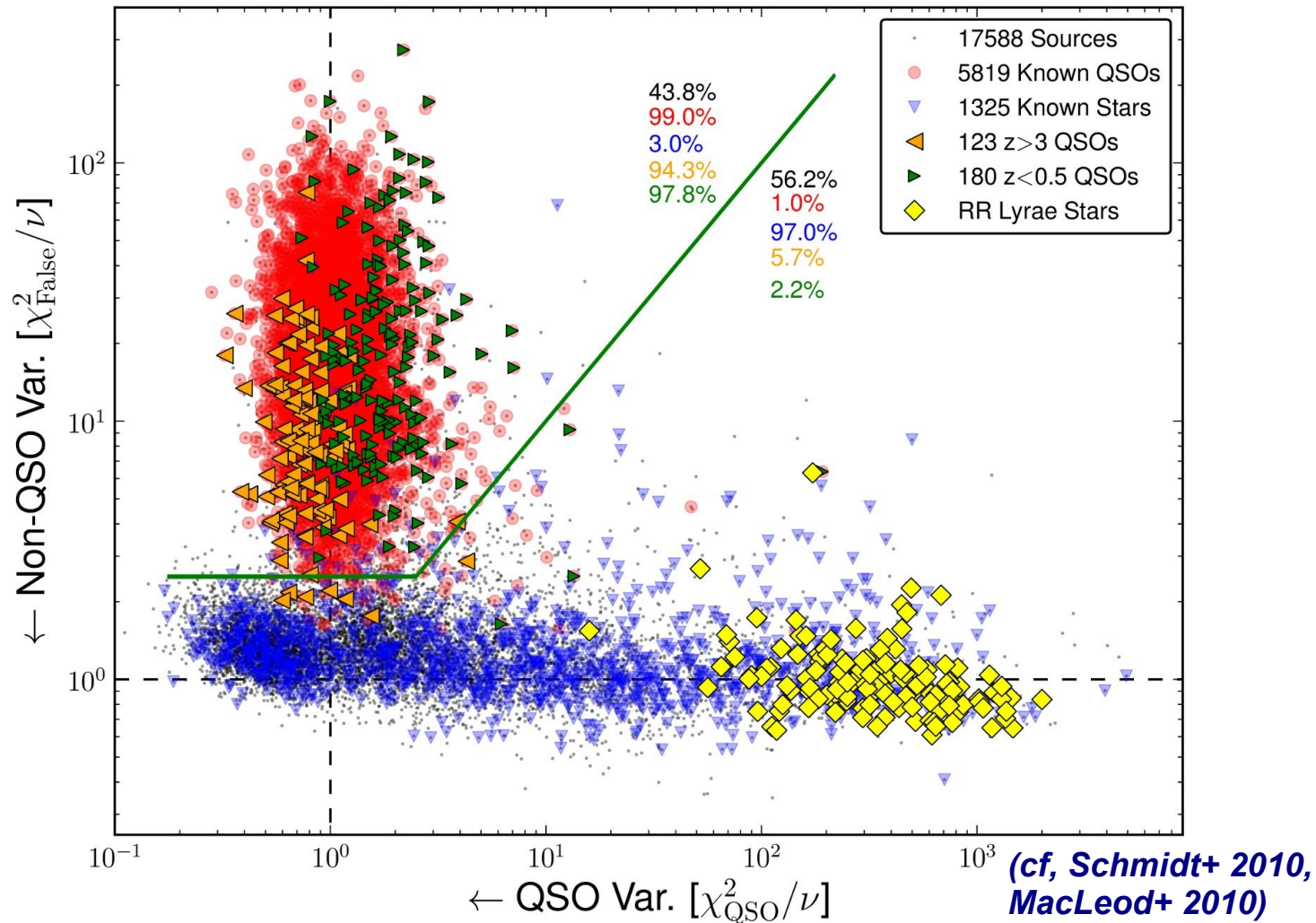
*(e.g., Sesar et al. 2007)*

# Time Selection in Color-Color Space

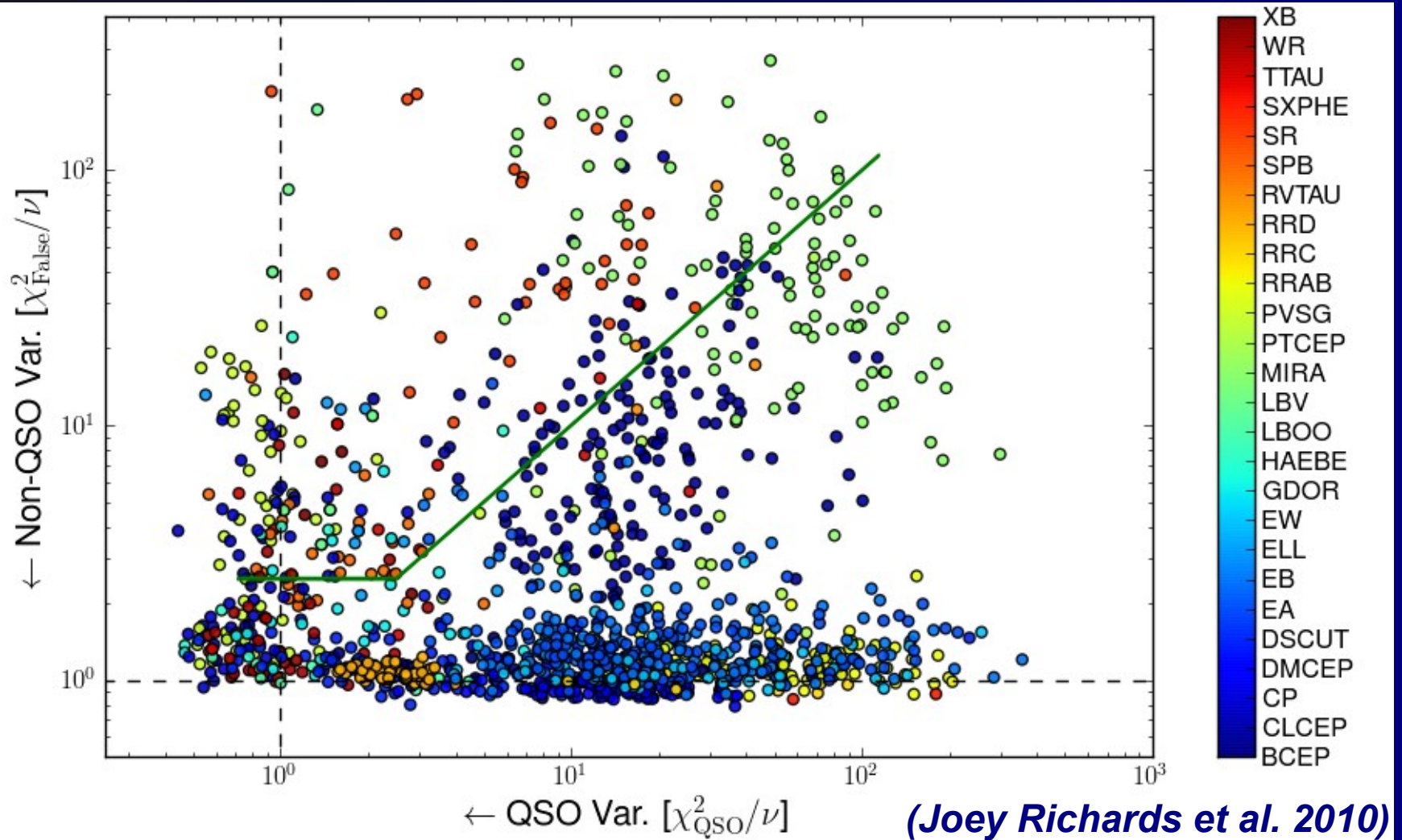




# QSO/Variable Star Selection (time)



# QSO Interlopers

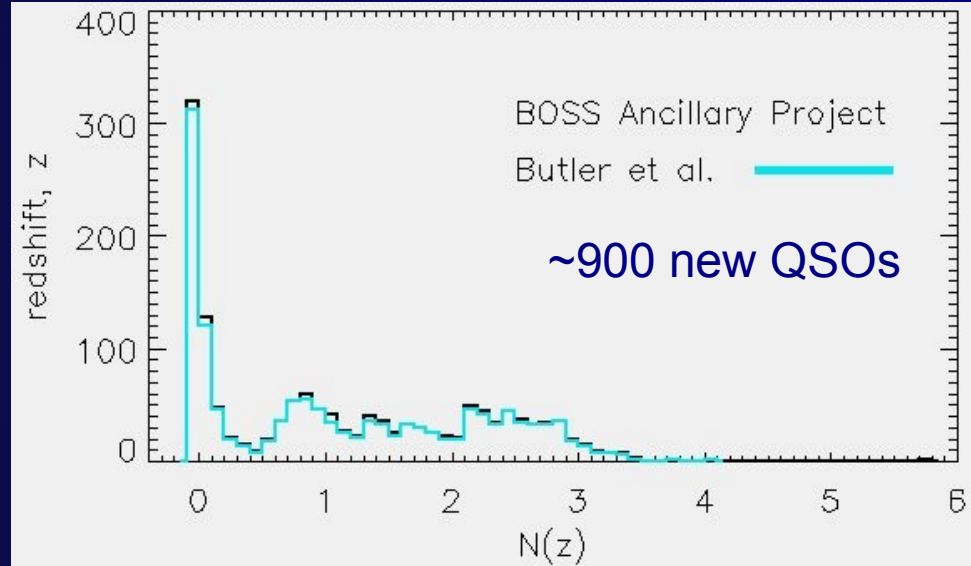


# Next Steps

## QSO Selection:

Accepted SDSS3/BOSS Proposal (1500 candidates, observing now)  
Few data limit (PTF -> BAO)

## Variable Star Classification: apply classifier other surveys



(credit: Nic Ross)

## \* Preparedness for LSST/DES/WFIRST era...

Fast and efficient (scalable algorithms)  
Cloud implementations  
Domain knowledge → real tools