

# MULTI-SURVEY AND STATISTICAL METHODS FOR COOL WHITE DWARF DISCOVERY

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# Project Overview

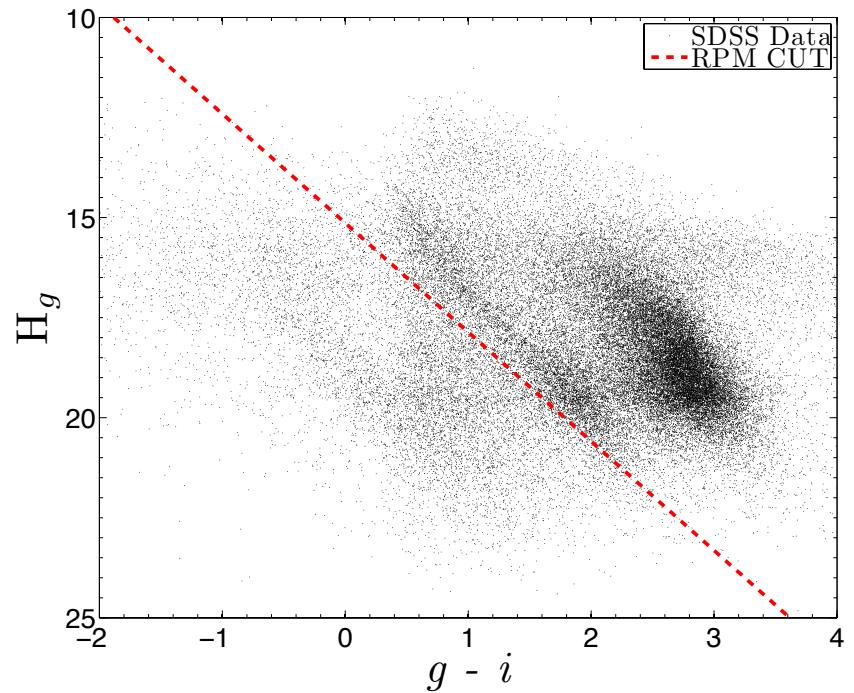
- Goal: ID new WDs, emphasis on Solar Neighborhood for parallax candidates.
- Initial Target Selection Process
- CTIO 4m Spectroscopic Observations & Results
- Revamped Target Selection – New Techniques.
- APO 3.5m Spectroscopic Observations & Results



# Initial Target Selection

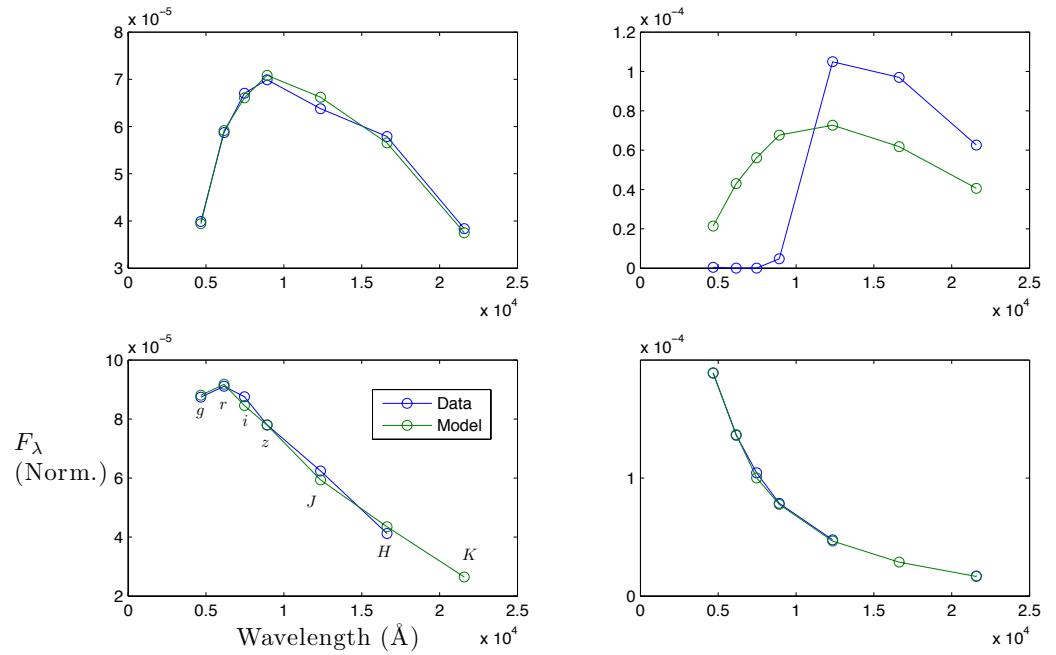
- SDSS DR7 Query:
  - $g$  Mag  $< 19.5$
  - Declinations south of  $+30$  deg
  - 60,000 objects
- Reduced Proper Motion Cut:
  - USNO-B Astrometry
  - Keep WDs
  - Defined in Kilic et al. 2006
- Cross-Match with 2MASS
  - $J - K$  cut  $< 0.5$
- Detectable Proper Motion Verification (By Eye)

$$H = m + 5 + 5 \log \mu$$



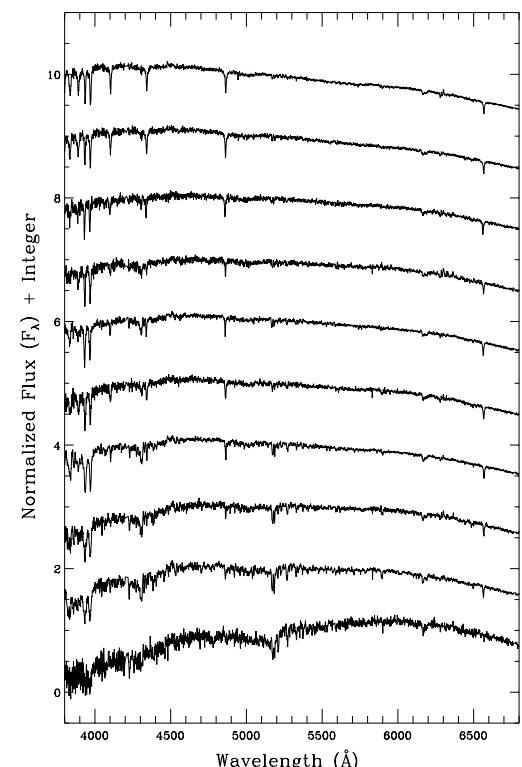
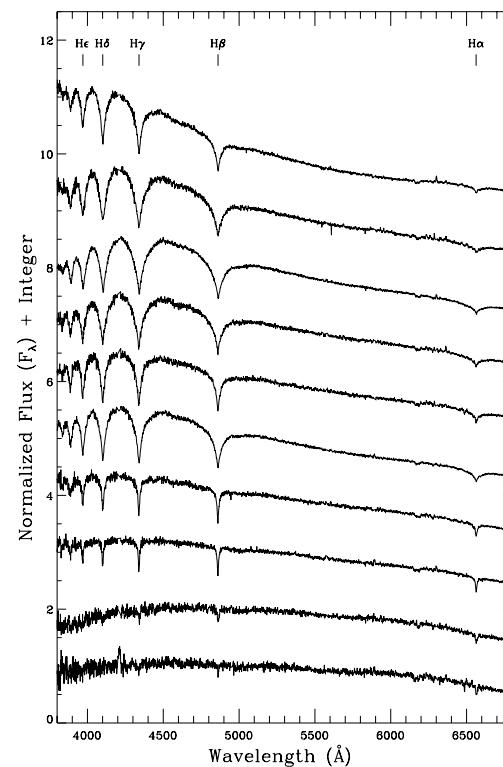
# Initial Target Selection

- Atmospheric Modeling
  - DA (pure hydrogen) Atmosphere Synthetic Photometry Tables (Bergeron)
  - Assume  $\log g = 8$
  - Temp & Dist Estimates
  - Poor Fits Thrown out



# CTIO Observations

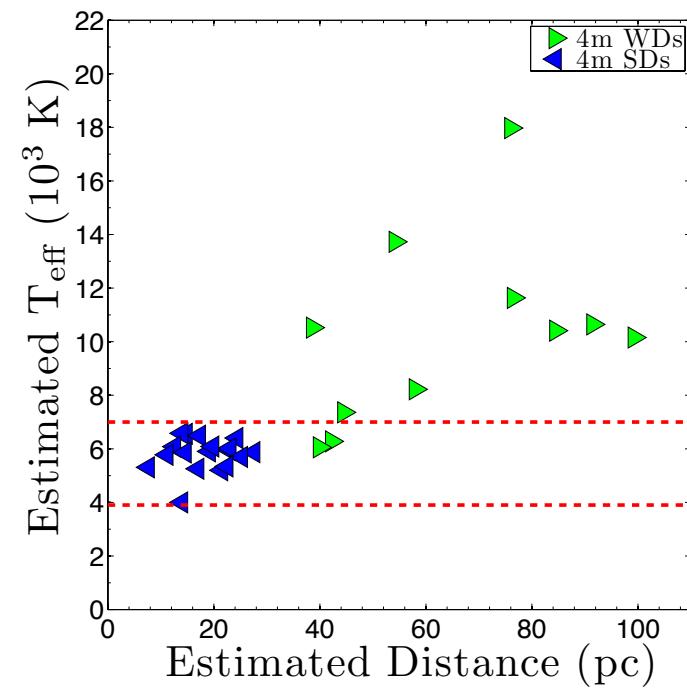
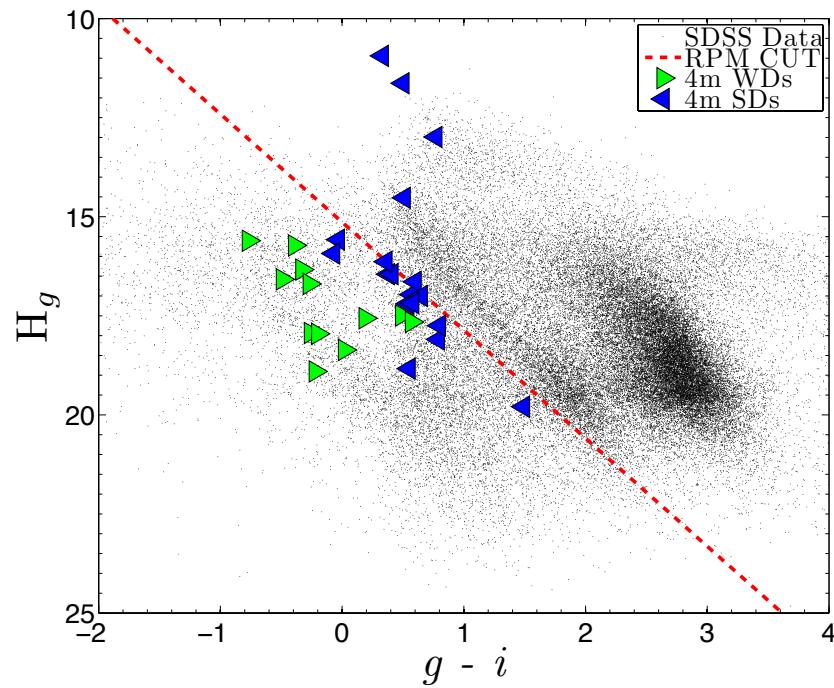
- 4m Blanco Telescope
  - RC Spectograph
  - 12 WDs
    - 10 DA
    - 1 DQ
    - 1 DC
  - 18 SDs
- SDSS Spectra (Freebies)
  - 13 WDs
    - 10 DA
    - 1 DB
    - 2 DC



# CTIO Observations

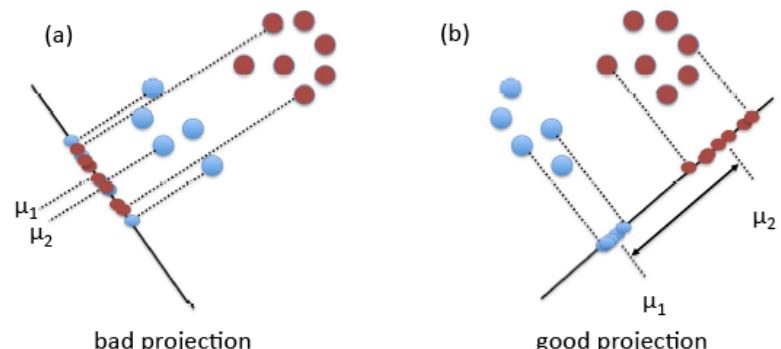
## Quantifying SD Contamination

- Erroneous proper motion values
- Narrow  $T_{\text{eff}}$  Range



# Revamped Target Selection

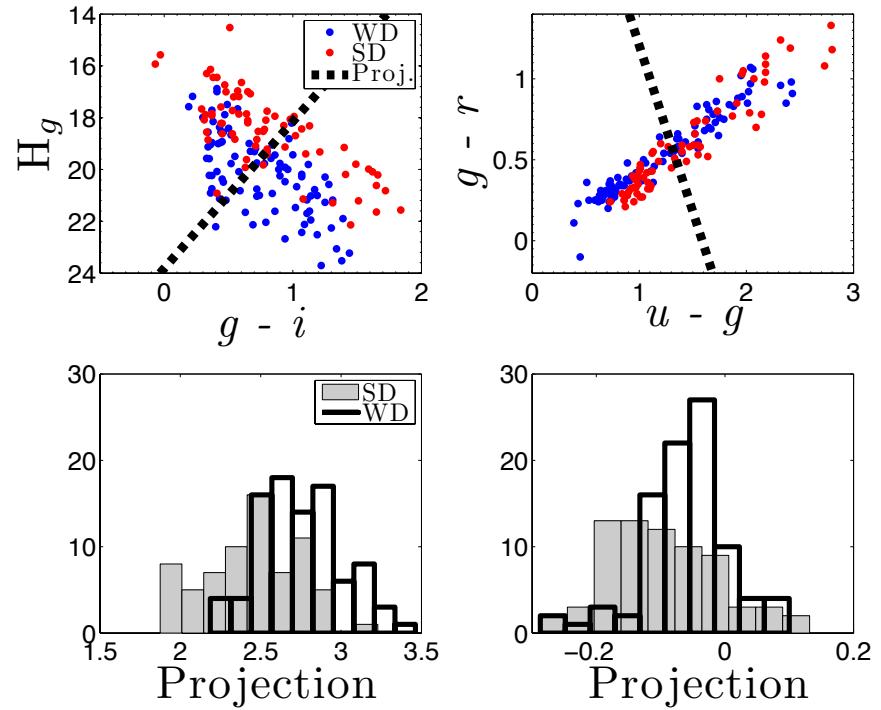
- Different:
  - Only HPM objects (LSPM North)
  - Northern Declinations
- Same:
  - Catalog Matching
  - RPM/Color-Color cuts
  - Atmospheric Model Fitting
- New:
  - Linear Discriminant Analysis (LDA)
  - LDA Training Set (Kilic 2006)



J. N. Kutz, AMATH 582 Course notes

# Revamped Target Selection Classical Discriminate Techniques

- RPM/Color-Color Plots
  - Kilic 2006 data
- 2 measurements



# Revamped Target Selection

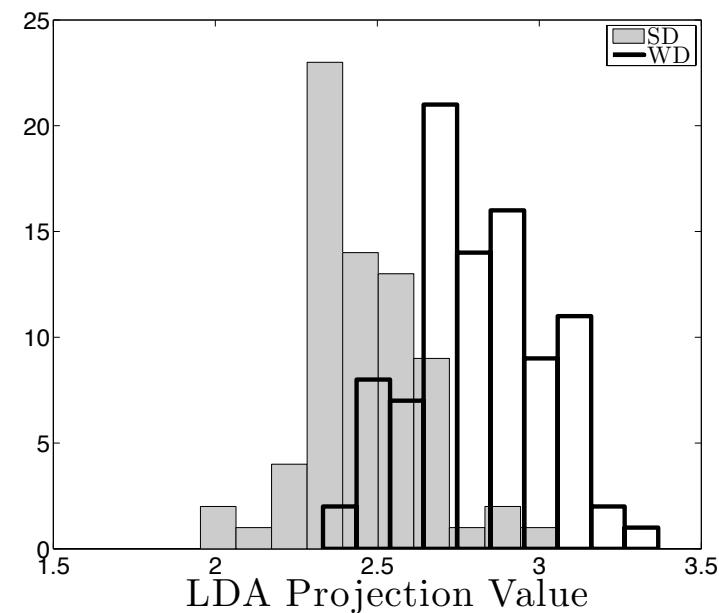
## LDA

- 2-class discrimination based on all measurements
- $u \ g \ r \ i \ z \mu$
- Construct RPM for each band, 5-D LDA
- Construct Scatter Matrices
- Solve generalized eigen problem
- Determine best projection (largest eigenvalue).
- Project targets onto LDA basis defined by the training set

$$\mathbf{S}_B = (\boldsymbol{\mu}_2 - \boldsymbol{\mu}_1)(\boldsymbol{\mu}_2 - \boldsymbol{\mu}_1)^T$$

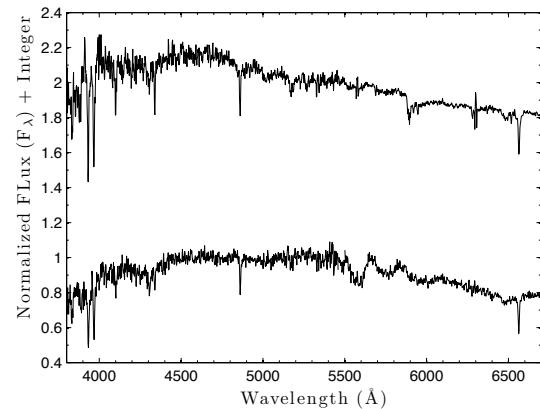
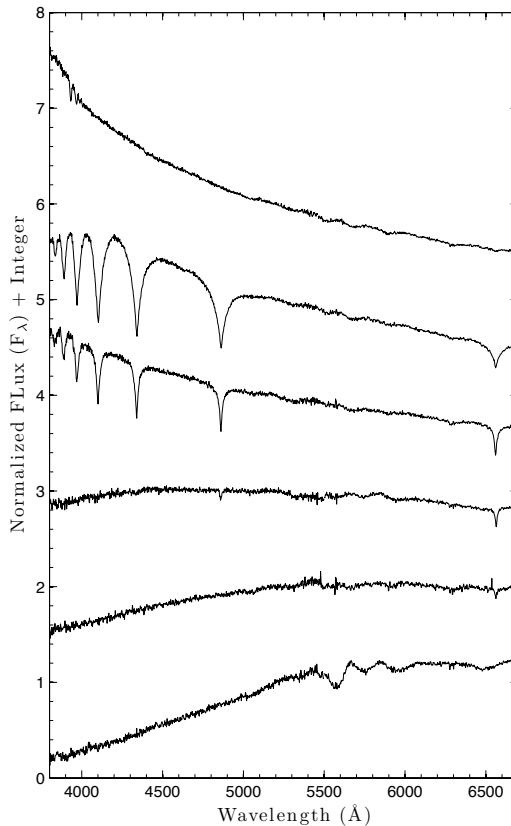
$$\mathbf{S}_W = \sum_{j=1}^2 \sum_{\mathbf{x}} (\mathbf{x} - \boldsymbol{\mu}_j)(\mathbf{x} - \boldsymbol{\mu}_j)^T$$

$$\mathbf{S}_B \mathbf{w} = \lambda \mathbf{S}_W \mathbf{w}$$



# APO Observations

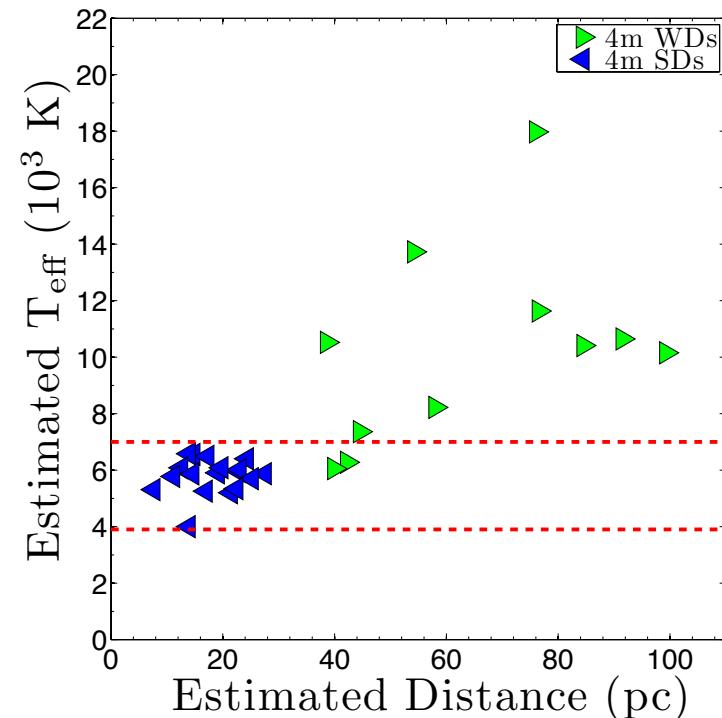
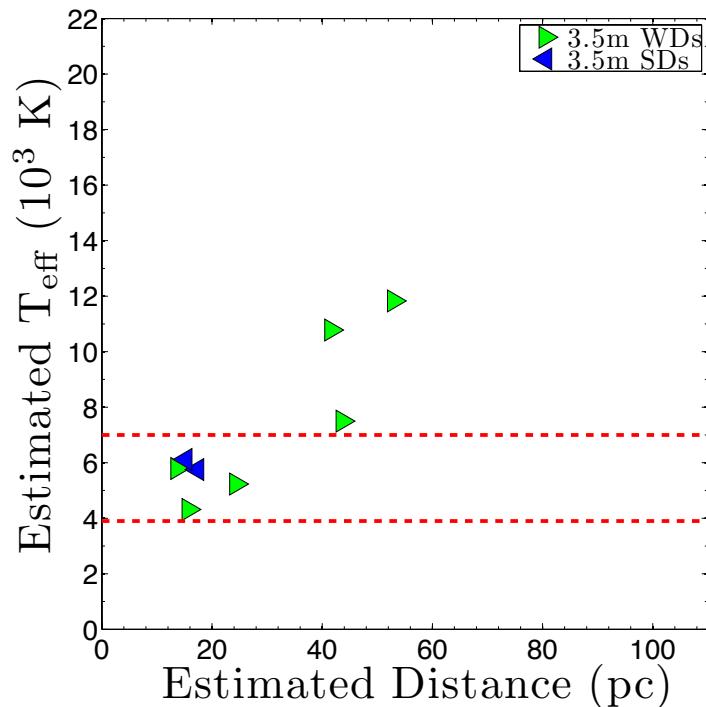
- 3.5m Telescope
  - Dual Imaging Spectrograph (DIS)
  - 6 WDs
    - 4 DA
    - 1 DC
    - 1 DZ?
  - 2 SDs
- SDSS Spectra (Freebies)
  - 18 WDs
    - 10 DA
    - 1 DQ
    - 6 DC
    - 1 DZ



# APO vs. CTIO

## Quantifying SD Contamination

- Less Contaminants
- 2 targets put on CTIOPI Parallax Program:
  - Estimates at 13.6 pc & 15.7 pc



# Thanks To

- John Subasavage
- EURO WD Workshop 2010 for support
- REU Program at CTIO directed by Ryan Campbell
- Chris Smith and Nicole van der Bliek for discretionary telescope time at CTIO
- Suzanne Hawley for discretionary telescope time at APO
- Jim Davenport & Yusra AlSayyad for observational collaboration at APO
- Adam Kowalski for DIS reduction help
- P. Bergeron for model fits and advice
- J. N. Kutz & Peizhe Shi for algorithm advice



# References

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