## ASTR 598: Astro-statistics and Machine Learning

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## Class Project: Deep Proper Motion Catalog for SDSS Stripe 82 Region

Scientific Goals: The main scientific aim of this quarter-long class project is to produce a catalog with improved proper motion measurements for faint stars (14 < r < 22) in the SDSS Stripe 82 region (250 sq. deg.). The SDSS-based catalog<sup>1</sup> for 3.7 million objects constructed by Bramich et al. will be augmented with newer additional data obtained with the Dark Energy Camera<sup>2</sup>, and possibly from other surveys, and the proper motions will be refit. If all goes well, the results should be publishable in a top astronomical journal.

**Learning Goals:** While working on this project, students will develop a working knowledge of the NOAO Datalab interface, astropy, pandas, astroML and other astronomical python tools, and of selected methods from astro-statistics (e.g., robust regression, Bayesian statistics, clustering, visualization).

**Prerequisites:** The students taking this class are required to open an account at the NOAO Data Lab site<sup>3</sup>. The Data Lab allows users to

- access, search, and filter databases containing large catalogs;
- create custom databases and analyses from large catalogs using familiar tools;
- combine catalog databases with data from NOAO telescopes, analysis results, and data from external archives in one place;
- share custom results easily with collaborators and create and publish catalogs derived from large data sets through a central workspace;
- experiment with tools being developed for LSST using existing large data sets.

We will use GitHub and Jupyter notebooks for progress tracking.

<sup>&</sup>lt;sup>1</sup>Bramich et al. 2008, "Light and motion in SDSS Stripe 82: the catalogues", MNRAS 386, 887.

<sup>&</sup>lt;sup>2</sup>See, for example, http://legacysurvey.org/decamls/

<sup>&</sup>lt;sup>3</sup>http://datalab.noao.edu

## **Brief Project Outline**

We will discuss detailed work plan in class and here is only an overview of the main steps:

- 1. Download Bramich et al. catalog (HLC files) from the SDSS website<sup>4</sup> and perform preliminary analysis (e.g., the variation of proper motion errors with position and magnitude; also, see examples in the last bullet below and, in particular, reproduce Figs. 22 and 23 from Sesar et al.); Using Data Lab, perform similar analysis for DECaLS and other available data from the Stripe 82 region.
- 2. Cross-match to DECaLS data using Data Lab (technical details TBD).
- 3. Preliminary analysis and quality assurance of the assembled data set (e.g., coordinates vs. time plots for stars with large SDSS proper motions); decision whether astrometric recalibration is required (perhaps using galaxies).
- 4. Fit proper motions (see eqs.3-6 in Bramich et al.) using the Bramich et al. SDSS values as priors.
- 5. Analyze updated proper motions (e.g., Fig. 2 in Vidrih et al. 2007, MNRAS 382, 515; Figs. 22 and 23 from Sesar et al. 2010, AJ 708, 717, color-coded with the mean proper motions), including using quasars for the assessment of systematic errors.
- 6. Write paper(s) and become rich and famous!

<sup>4</sup>http://das.sdss.org/va/stripe\_82\_variability/SDSS\_82\_public/