

# **Alanna Connors and the Origins of Principled Data Analysis**

Jeff Scargle (NASA/Ames Research Center)

***Alanna was a key pioneer in using statistically sound principles for analysis of astronomical data. The corresponding viewpoint and algorithms provide a robust toolkit for high-energy astrophysics as we enter the Age of Digital Astronomy.***



I31 Astrostatistics in High Energy Astrophysics

Special Session in Memory of Alanna Connors

8 Apr 2013 High-Energy Astrophysics Division

30.11 A Broad Band X-Ray Telescope, P.J. SERLEMITSOS, C. GLASSER, R. PETRE\*, and A. CONNORS\*\*, NASA/GSFC. NASA's OSS-2 mission includes the Broad Band X-ray Telescope (BBXRT) experiment of the Goddard X-Ray Group. The instrument consists of two co-aligned grazing incidence mirrors with cooled Si(Li) detectors at each focus. Its objectives and capabilities will be discussed with particular emphasis on the unique mirrors. These represent a significant development because they offer a number of attractive features including large

throughput, broad energy response, light weight and low cost. Because image quality will largely determine future applications of this type of mirror, we will discuss our progress in attaining the arc minute image inherent in the mirror design.

\* NAS/NRC Research Associate

\*\* Also Dept. Physics & Astronomy, Univ. of Maryland

## First paper:

- 98 COMPTEL
  - 43 GRB Papers
  - 3 Sparse Bayesian Blocks
  - 21 Bayesian papers
  - 32 spectroscopy
  - 42 first author
- Total papers: 172

## Last paper:

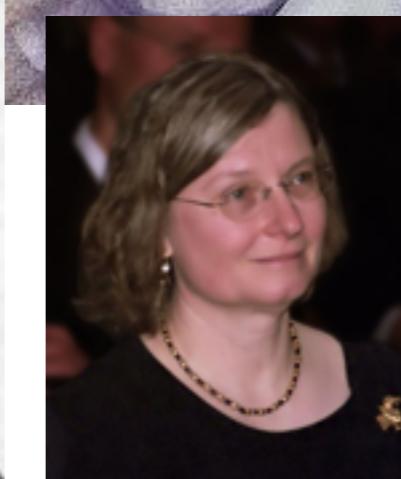
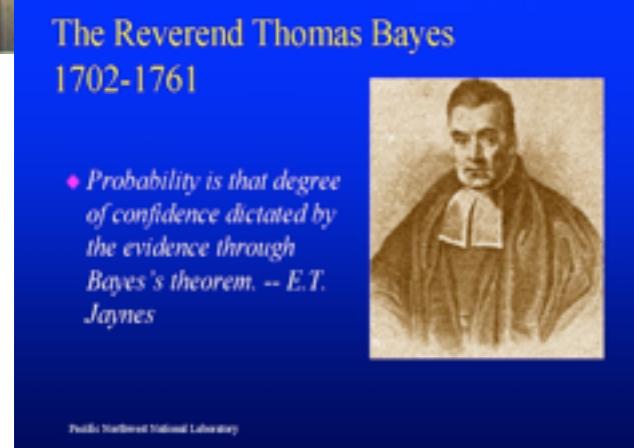
**Accounting for Calibration Uncertainties in X-ray Analysis: Effective Areas in Spectral Fitting**  
[Hyunsook Lee](#), [Vinay L. Kashyap](#), [David A. van Dyk](#), [Alanna Connors](#), [Jeremy J. Drake](#), [Rima Izem](#), [Xiao-Li Meng](#), [Shandong Min](#), [Taeyoung Park](#), [Pete Ratzlaff](#), [Aneta Siemiginowska](#), [Andreas Zezas](#)

# Top 10

The next slide contains my choice for the top 10 statistic methods that have seen important use in astronomy. I purposely did not link the pictures with the moments, to give you a chance to have some fun making these identifications ... and also coming up with your nominations for other events.

1763 Bayes  
1795 Gauss  
1810 Fourier  
1898 Schuster  
1940 Bellman  
1953 Metropolis, Rosenbluth<sup>2</sup> Teller<sup>2</sup>  
1960   
1965 Cooley and Tukey  
1979 Efron  
1986 Daubechies

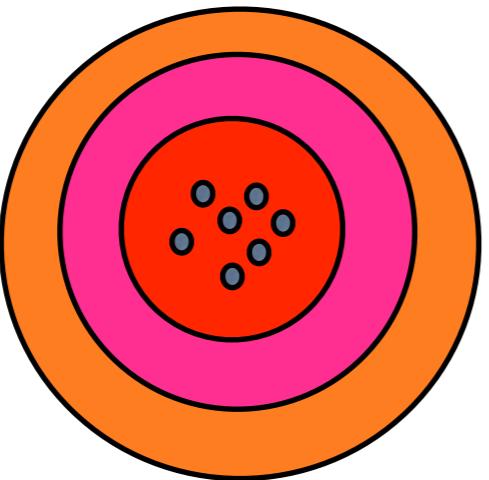
Probability  
Least-Squares  
Harmonic analysis  
Periodogram  
Dynamic Programming  
MCMC  
ARPANET  
Fast Fourier Transform  
Bootstrap  
Wavelets



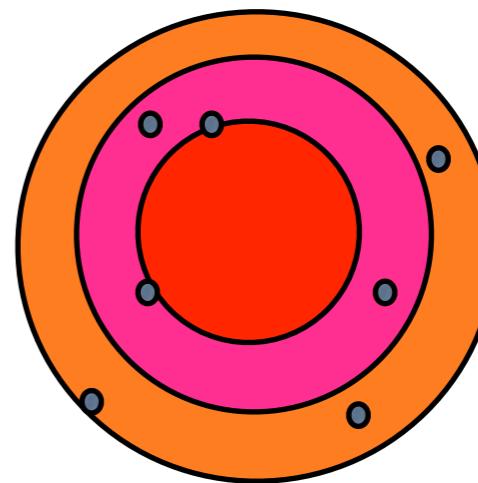
Alanna was a fan (inventor?) of the concept of principled methods. That is to say data analysis procedures based on sound statistical foundations, and opposed to ad hoc methods. The next few slides deal with a few that I think raise important issues.

- Bias-Variance Tradeoff & Random vs. Systematic Errors (3 slides)
- Experimental Design (2 slides, adapted from Tom Loredo's work)
- Concern for Error Distributions (1 slide)
- Sampling Bias (1 slide)

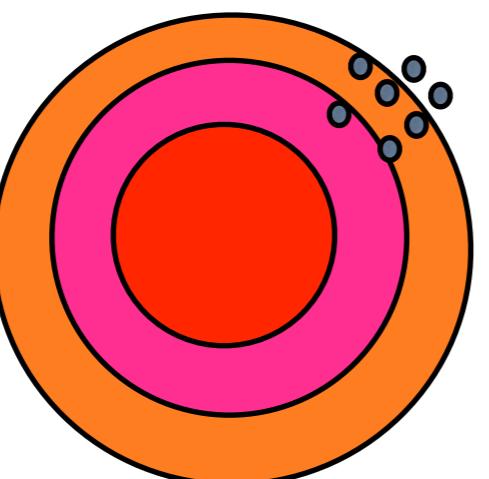
Low Variance



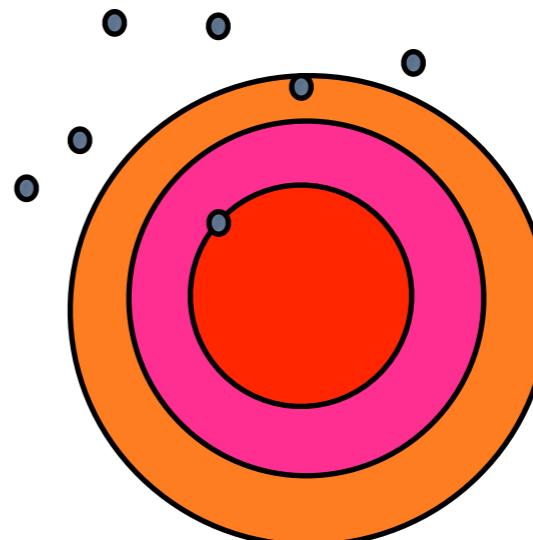
High Variance



Low Bias



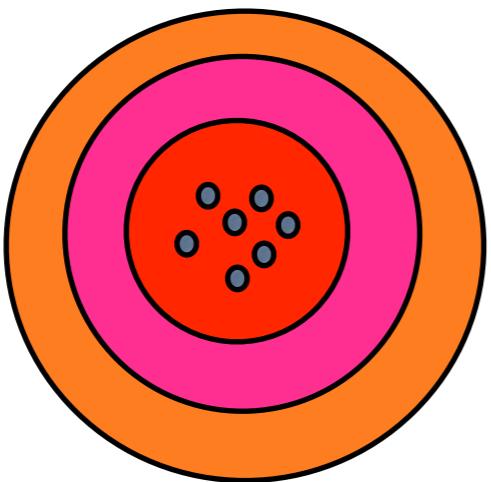
High Bias



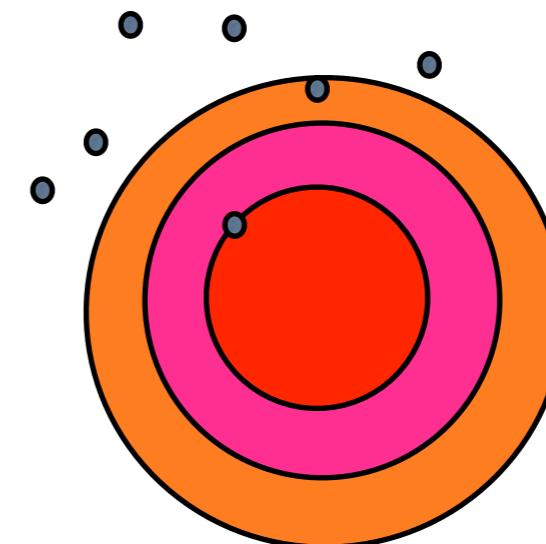
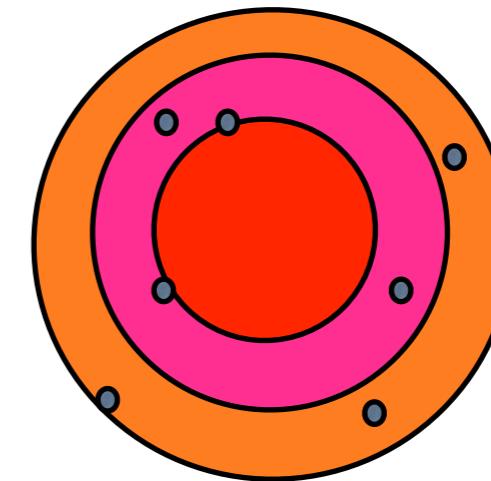
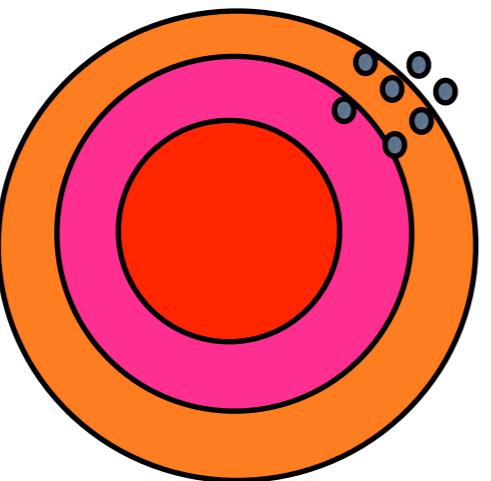
Low Variance

High Variance

Low Bias

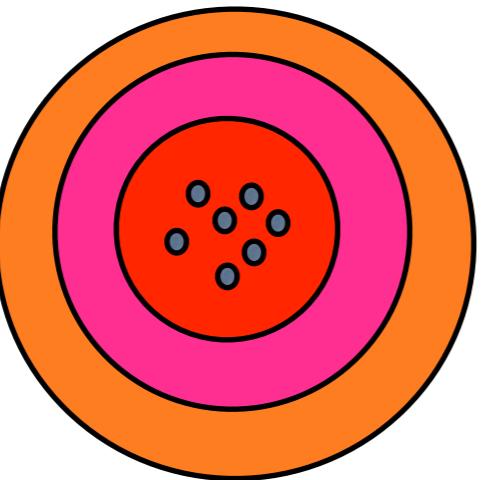


High Bias

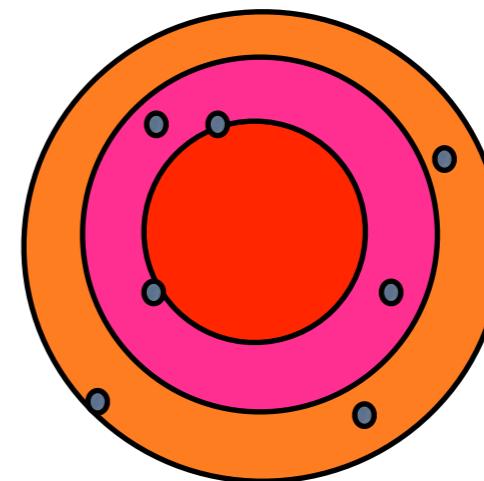


Bias Variance Tradeoff  
Systematic vs. Random Errors

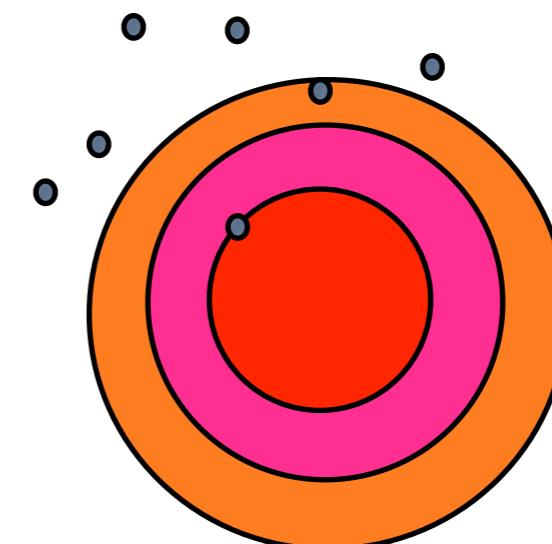
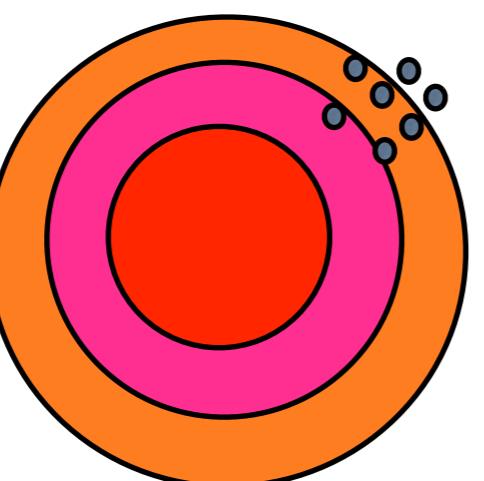
# Low Variance



# High Variance



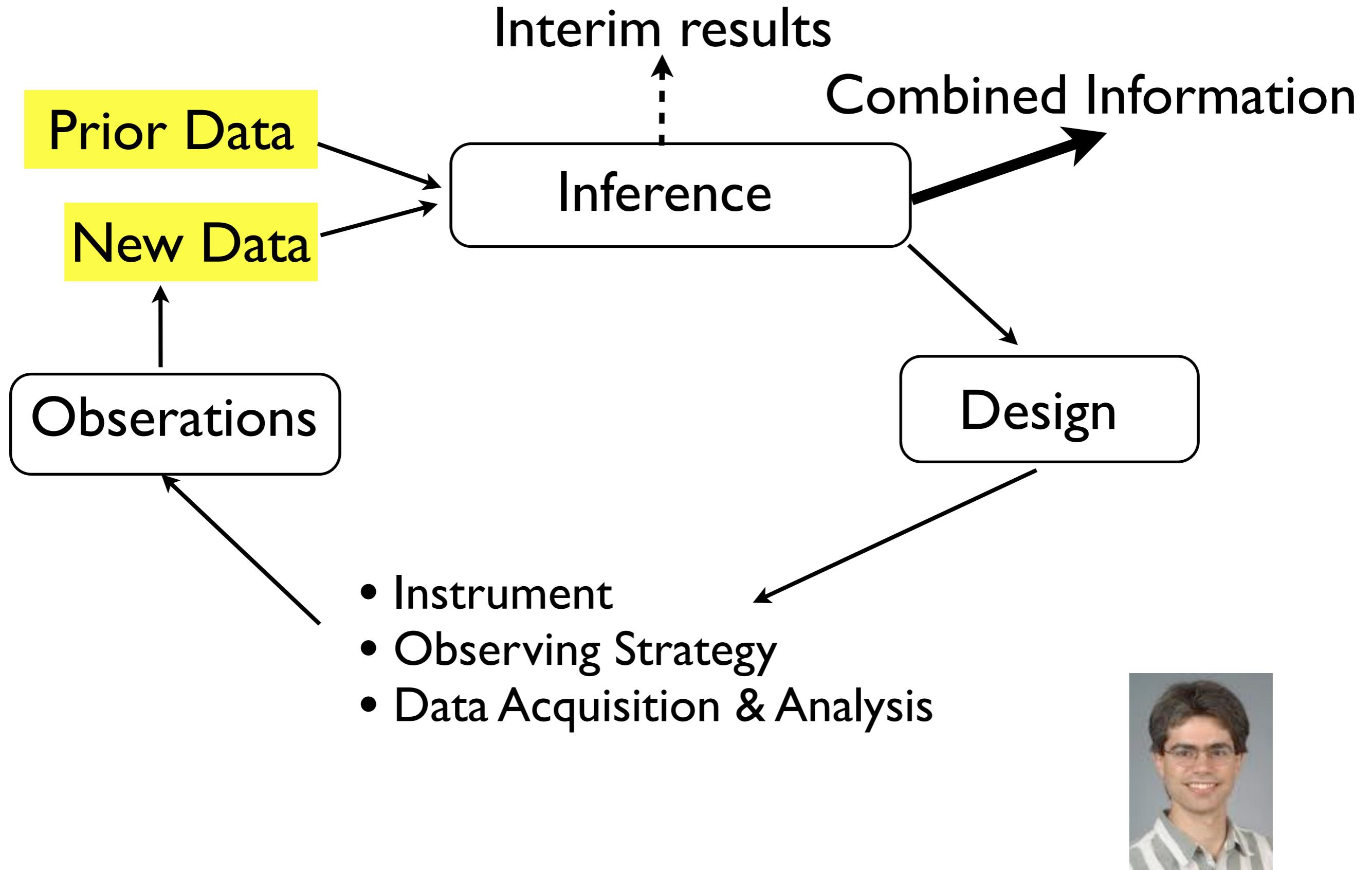
# Low Bias



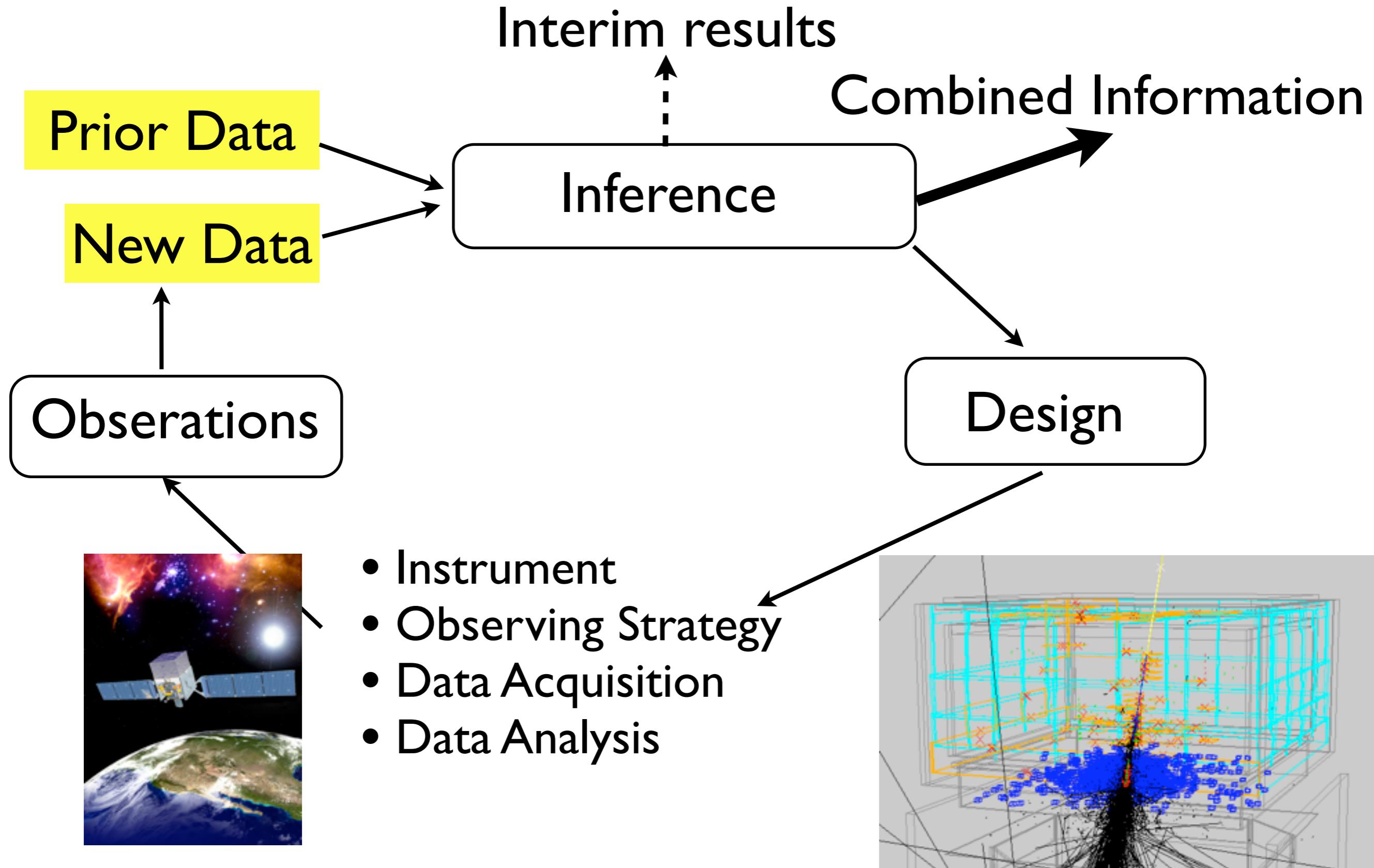
# High Bias

**Bias Variance Tradeoff  
Systematic vs. Random Errors**

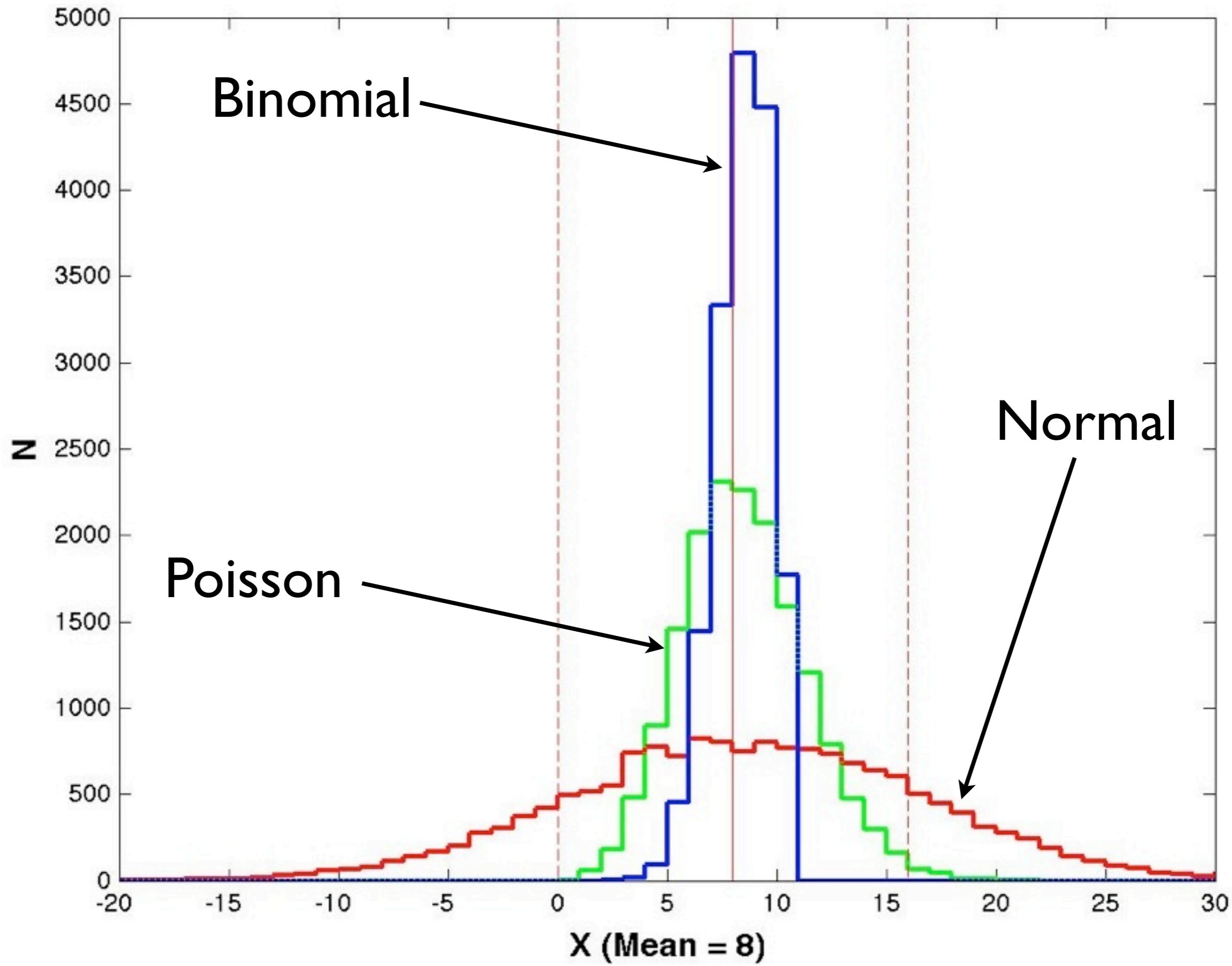
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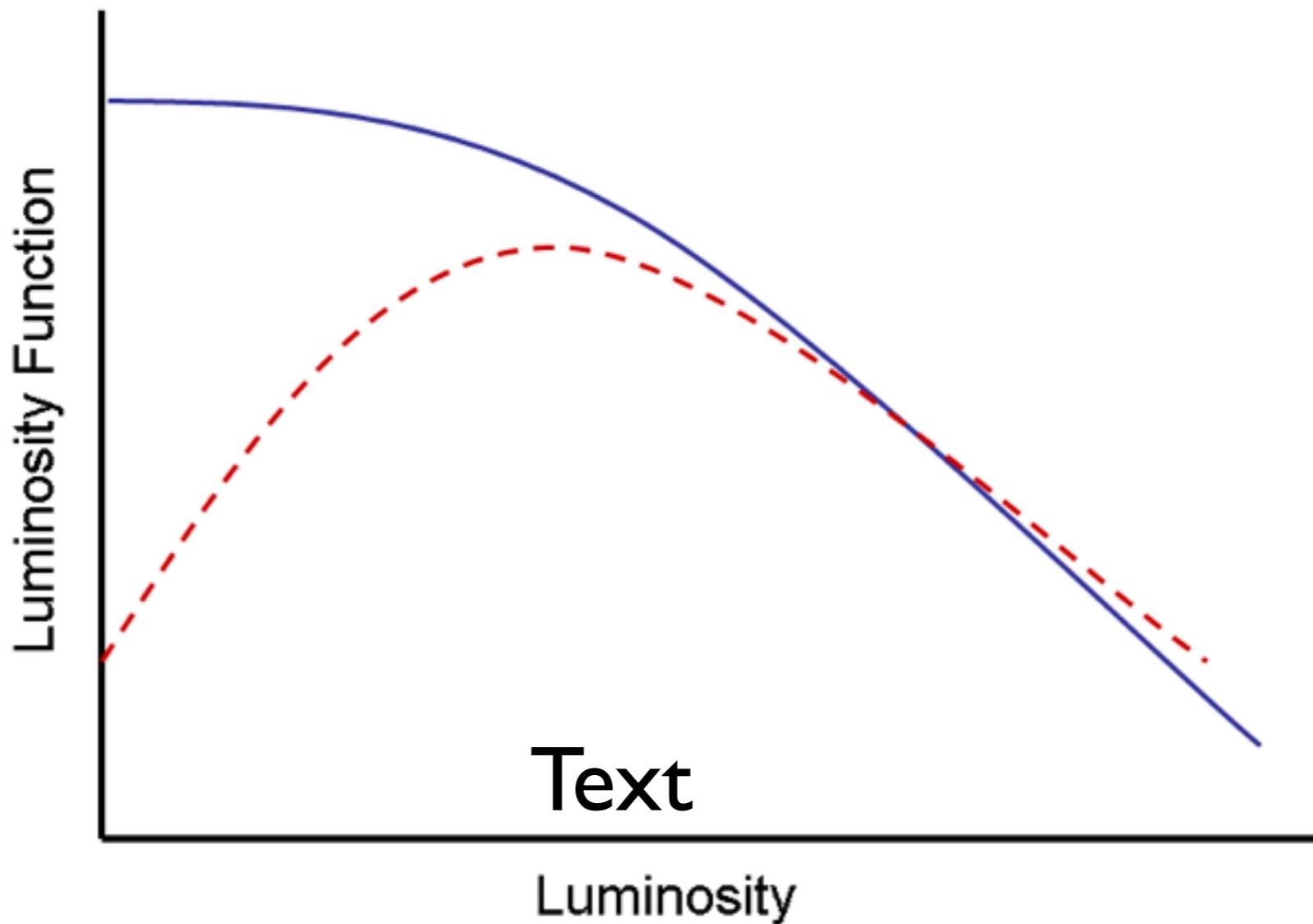


**Adapted from Tom Loredo: Bayesian Adaptive Exploration**



# **Adapted from Tom Loredo: Bayesian Adaptive Exploration**

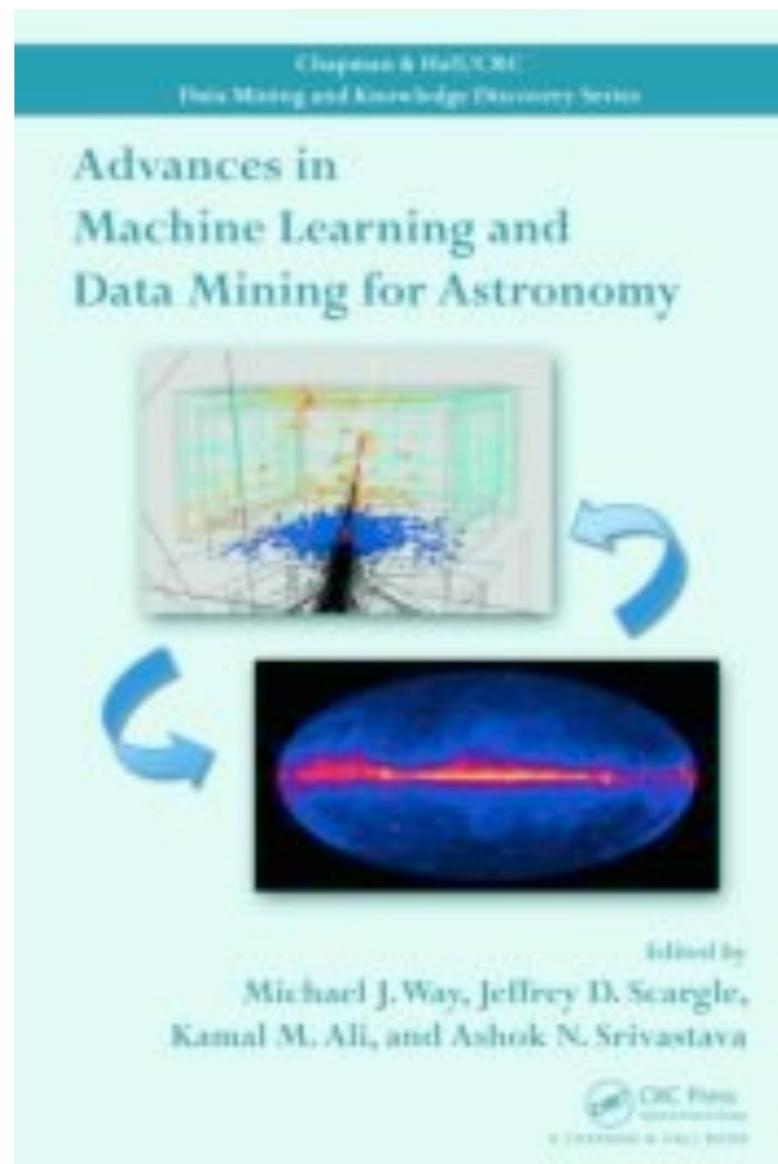




The dashed red line is an example luminosity function when the Malmquist bias is not corrected for. The more numerous low luminosity objects are underrepresented because of the apparent magnitude limit of the survey. The solid blue line is the properly corrected luminosity function using the volume-weighted correction method. (Wikipedia)

# Other Principles of Astrostatistics

Large scale observational programs are making automatic data analysis, machine learning and data mining necessary for scientific progress.



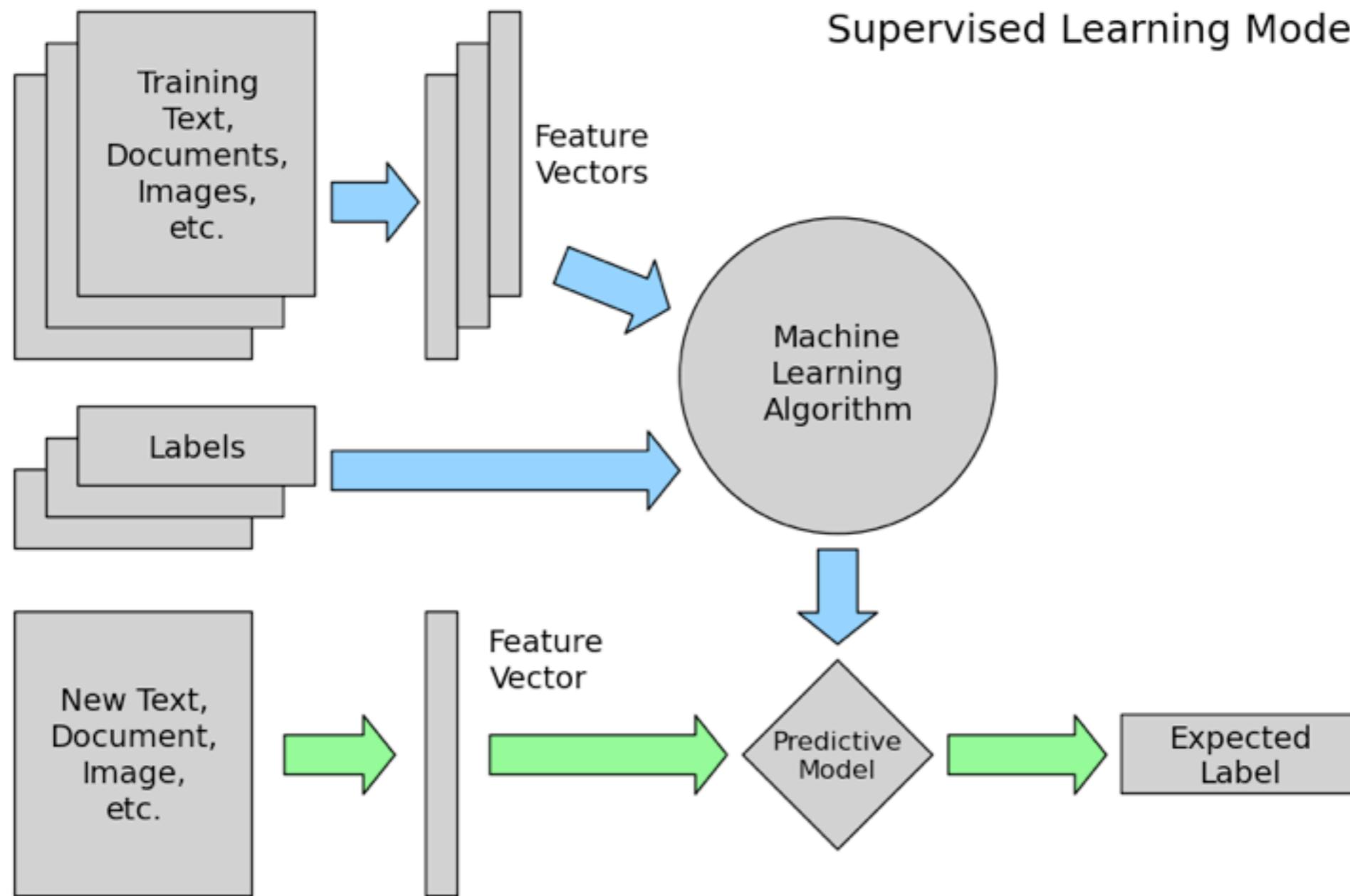
# Machine Learning for Astronomy with Scikit-learn

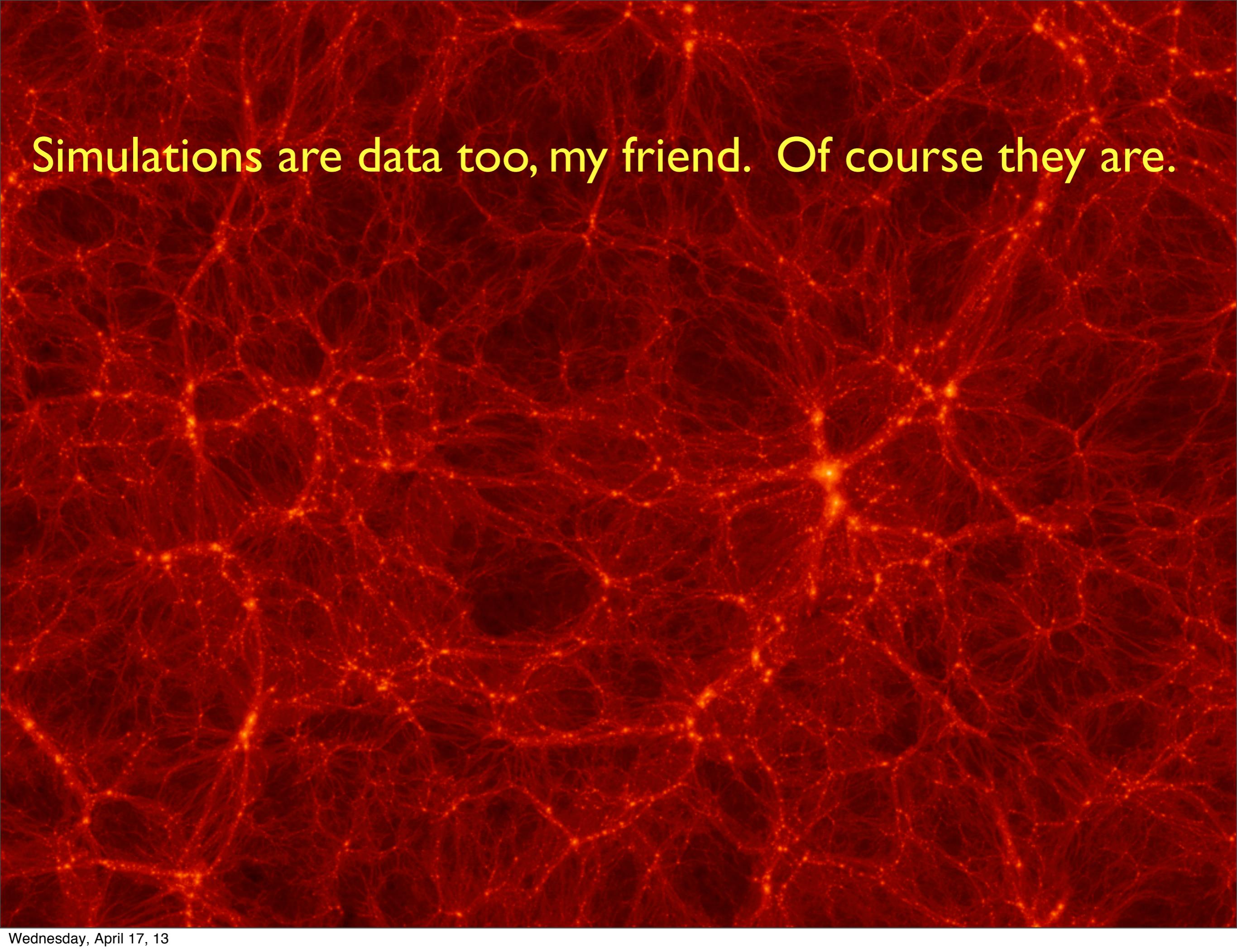
[http://astroml.github.io/sklearn\\_tutorial/](http://astroml.github.io/sklearn_tutorial/)

Jake Vanderplas, Oliver Grisel, Jaques Grobler, Gael Varoquaux

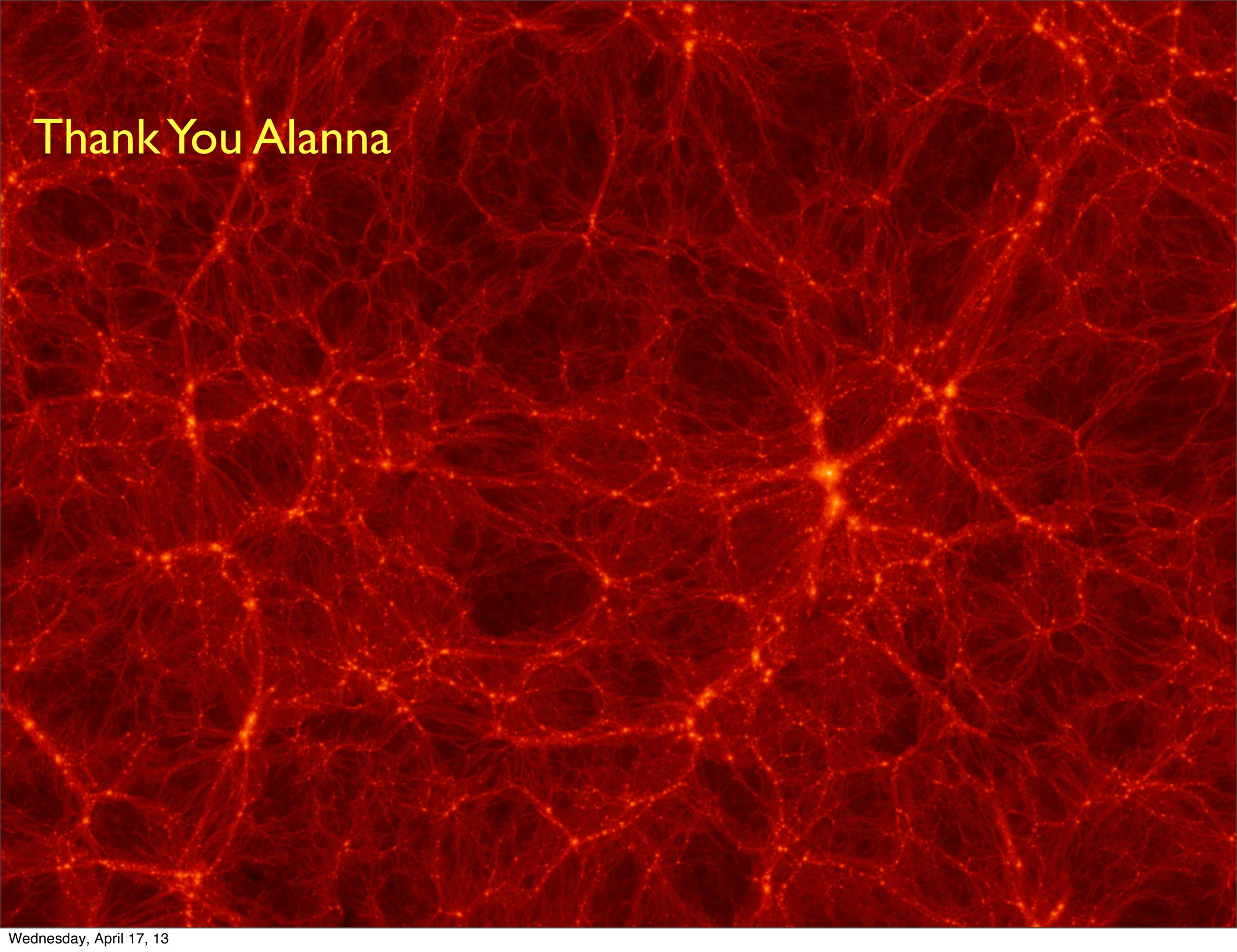
**AstroML: Machine Learning and Data Mining for Astronomy**

<http://astroml.github.io>





Simulations are data too, my friend. Of course they are.



Thank You Alanna