

# Commentary

Chad M. Schafer

Carnegie Mellon University, Department of Statistics & Data Science

`cschafer@cmu.edu`

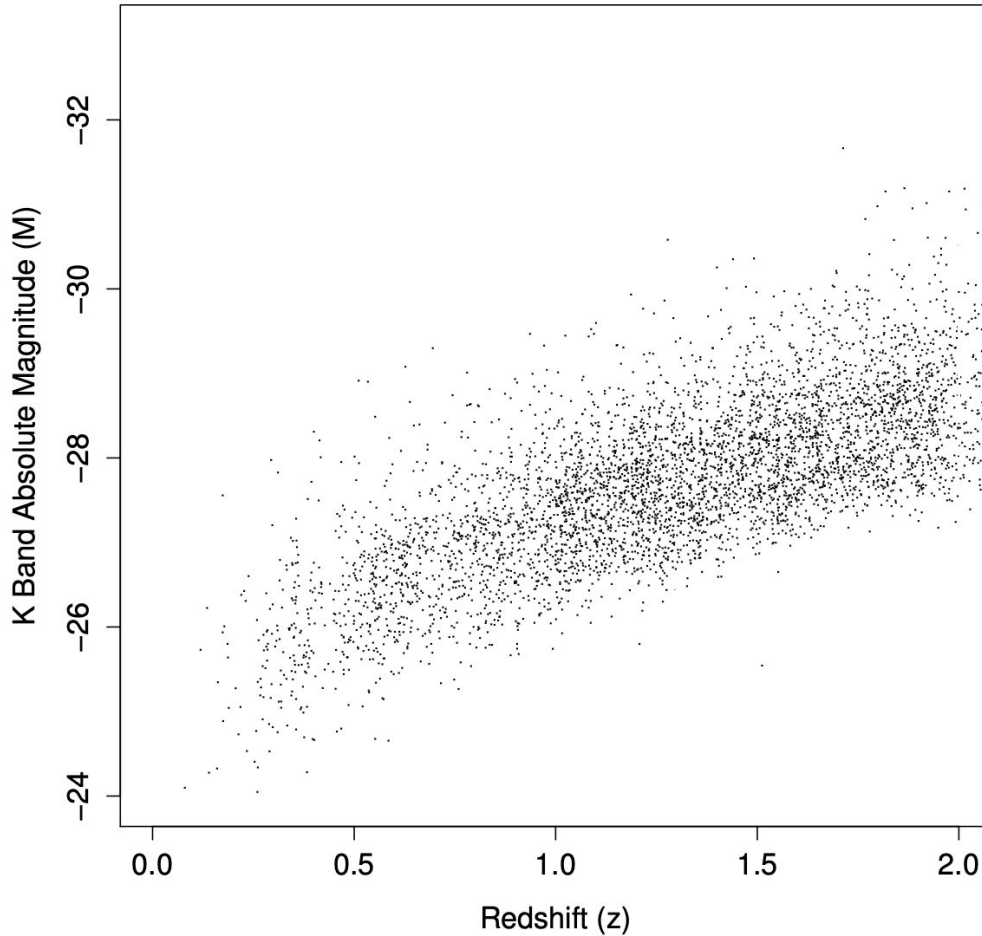
# Systematic Uncertainty as Model Misspecification

- Two classes of systematic uncertainty:
  1. Uncertainties due to analysis choices, which are typically binary variations (chosen as an example of other possible options).

If there are multiple choices of model for the signal, *e.g.* choice of resonances in an amplitude fit, it is usual to quote fit results for every model that has a similar fit quality.

2. Statistical uncertainties on external inputs.  
*e.g.* due to limited MC sample sizes or calibration sample sizes.

# Cosmological Context



Model the bivariate distribution

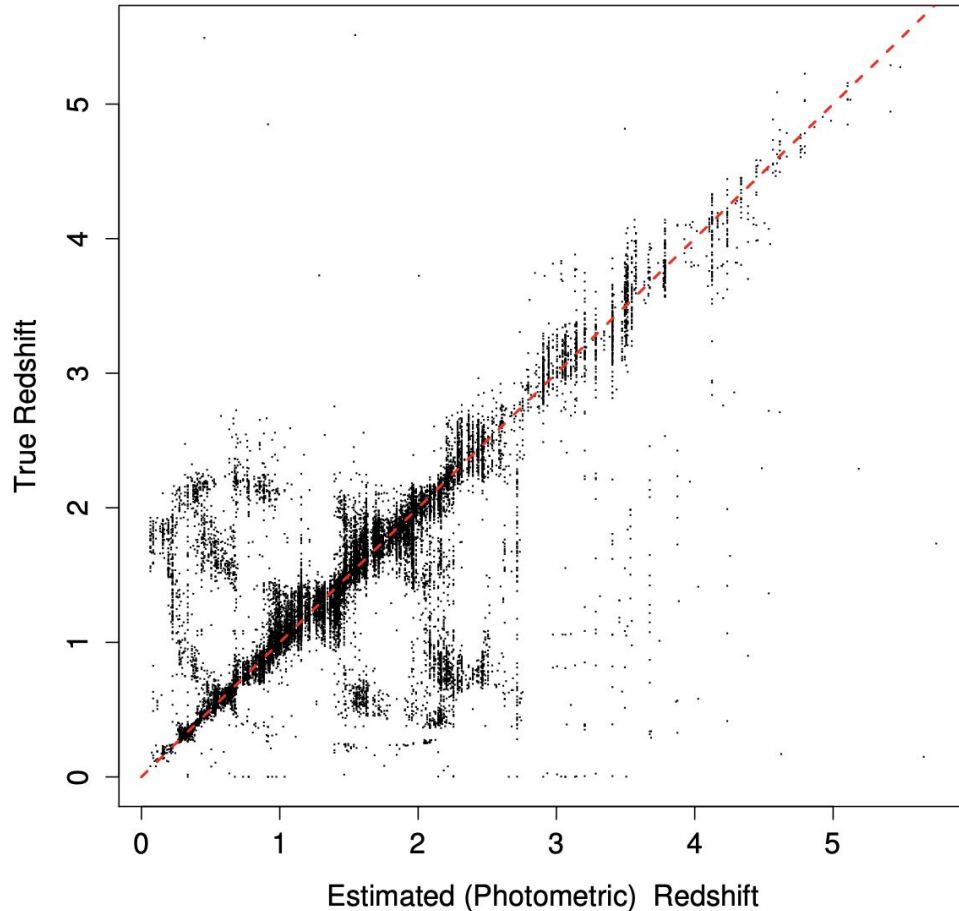
(5000 quasars taken from Peth (2010) sample)

# Cosmological Context

| Year | Count        | Source                                      |
|------|--------------|---|
| 1984 | 35           | Marshall, et al.                            |
| 1988 | 420          | Boyle, et al.                               |
| 1995 | 1,200        | Pei   |
| 2002 | 3,814        | Schneider, et al. (SDSS Early Data Release) |
| 2003 | 16,713       | Schneider, et al. (SDSS DR1)                |
| 2005 | 46,420       | Schneider, et al. (SDSS DR3)                |
| 2007 | 77,429       | Schneider, et al. (SDSS DR5)                |
| 2010 | 105,783      | Schneider, et al. (SDSS DR7)                |
| 2018 | 526,356      | Paris, et al. (SDSS DR14)                   |
| 2017 | 2.0 million  | MILLIQUAS, Version 5.2                      |
| 2030 | > 10 million | LSST  |

Progression  
of quasar  
sample sizes

# Cosmological Context



Model the bivariate distribution as a function of key cosmological parameters

(5000 quasars taken from Peth (2010) sample)

# Cosmological Context

Modern cosmology motivates use of...

...Bayesian methods

...Nonparametric methods

...likelihood-free methods

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## What is missing?

Issues surrounding discovery claims

# Discovery Issues

Does the need for agreement on when a discovery has been made unduly constrain the space of allowable analysis methods?

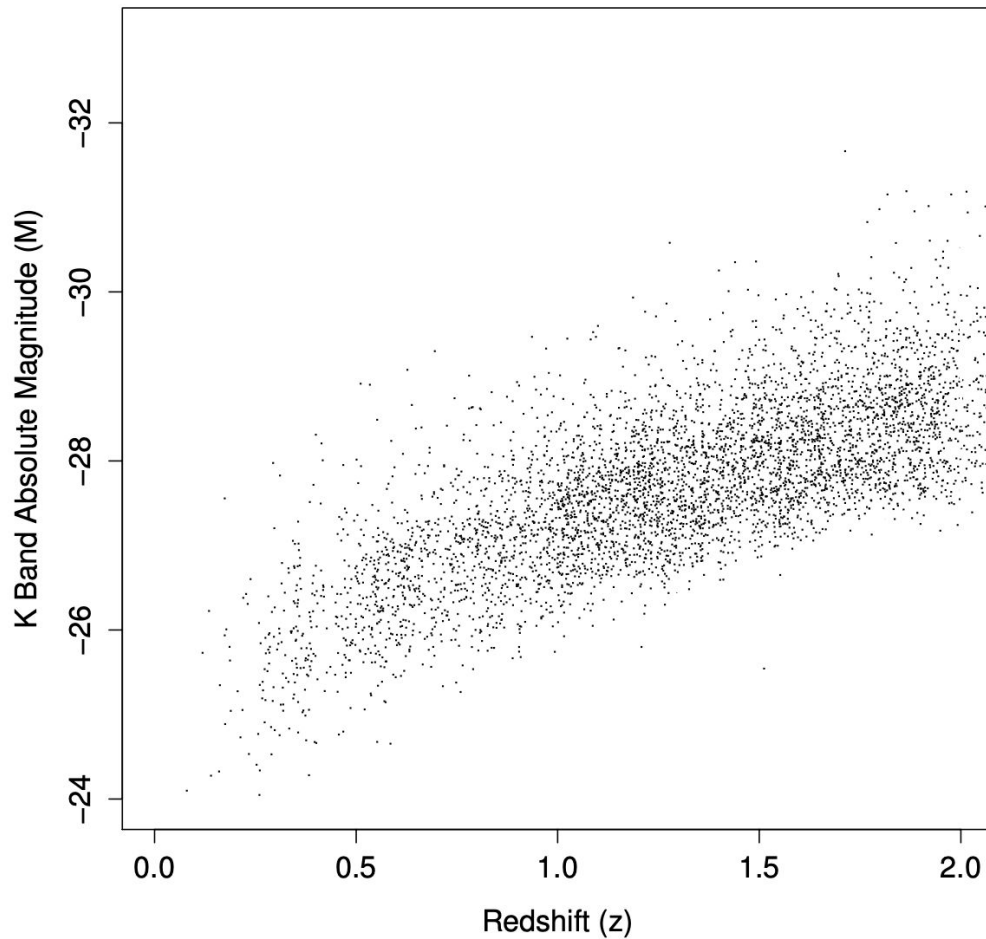
Does the focus on preserving power (sensitivity) bias significance results?



## Cowan, et al. (2011)

“For the significances obtained to be valid it is necessary that the model predictions for data distributions represent accurately the underlying theory being tested. That is, any errors due to approximations, e.g., in detector modeling or in methods used to relate observable quantities to the fundamental theories, should be negligible for some point in the full parameter space. **By including additional parameters in the model one can approach this ideal situation more closely. However, the additional flexibility introduced to parameterize systematic effects results, as it should, in a loss in sensitivity.**” (page 2)

# Back to cosmology



Model the bivariate distribution

(5000 quasars taken from Peth (2010) sample)

# Handling Model Misspecification

## Handling uncertainties in background shapes: the discrete profiling method

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**P. D. Dauncey<sup>a\*</sup>, M. Kenzie<sup>b</sup>, N. Wardle<sup>b</sup> and G. J. Davies<sup>a</sup>**

<sup>a</sup>*Department of Physics, Imperial College London, Prince Consort Road, London, SW7 2AZ, UK.*

<sup>b</sup>*CERN, CH-1211 Geneva 23, Switzerland.*

*E-mail: P.Dauncey@imperial.ac.uk*

**ABSTRACT:** A common problem in data analysis is that the functional form, as well as the parameter values, of the underlying model which should describe a dataset is not known *a priori*. In these cases some extra uncertainty must be assigned to the extracted parameters of interest due to lack of exact knowledge of the functional form of the model. A method for assigning an appropriate error is presented. The method is based on considering the choice of functional form as a discrete nuisance parameter which is profiled in an analogous way to continuous nuisance parameters. The bias and coverage of this method are shown to be good when applied to a realistic example.