

# PHAT (PHoto-z Accuracy Testing)

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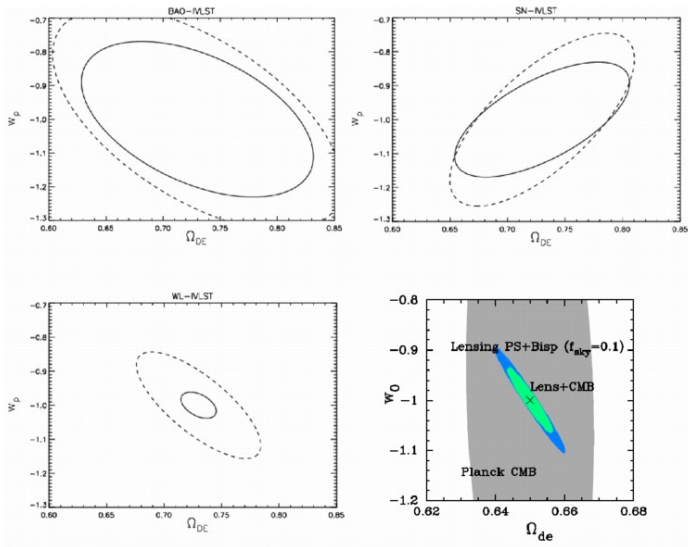
April 28, 2009

# Outline

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- 1 Importance of photo-z's
- 2 Introduction to PHAT
- 3 First simulation
- 4 GOODS-North catalogue
- 5 Outlook

# DETF report



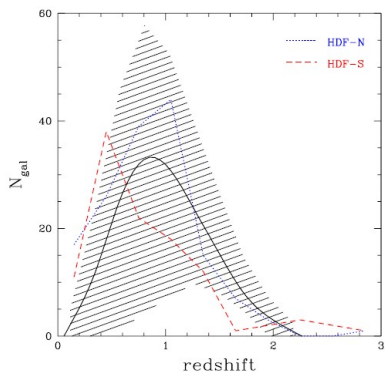
from Albrecht et al. (2006)

## What do we measure?

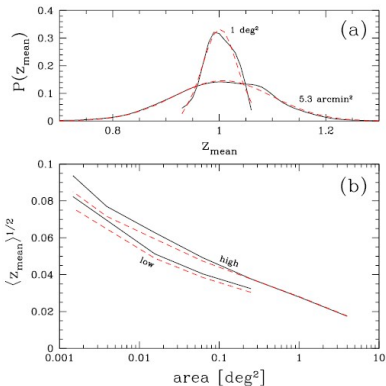
$$\langle \gamma^2 \rangle \propto 0.01^2 \sigma_8^2 \Omega^{1.6} z_s^{1.4} \theta^{-(n+2)/2}$$

- $\sigma_8$ : Mass power spectrum normalisation
- $\Omega$ : Mean density parameter
- $n$ : Slope of the power spectrum
- $z_s$ : Redshift of the sources

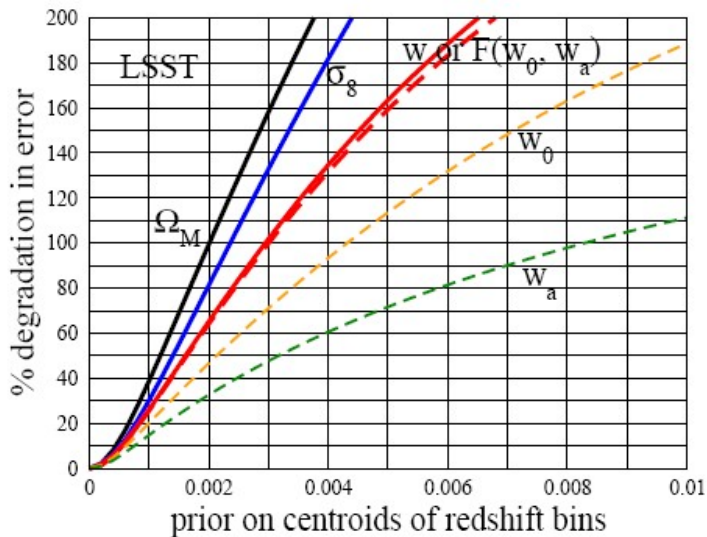
# Uncertainty in the redshift distribution



from van Waerbeke et al. (2006)



# Errors of cosmological parameters



from Huterer et al. (2005)

# PHAT – PHoto-z Accuracy Testing

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## Goals

- Credibility
- Quantitative understanding
- Rank and profile methods

## Tools

- Standardised test environments
- Study:
  - Codes
  - Templates
  - Filter sets
  - S/N
- Long term: study different approaches on galaxy photometry

# PHAT – Photo-z Accuracy Testing

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## Timeline

- Sep 2007: Start of PHAT
- Mar 2008: 1st simulation released
- May 2008: Wiki page launched with results from 1st simulation
- Aug 2008: GOODS-North catalogue released
- Sep 2008: Photo-z workshop in London
- Dec 2008: PHAT workshop in Pasadena
- Mar 2009: GOODS results on Wiki

## Websites

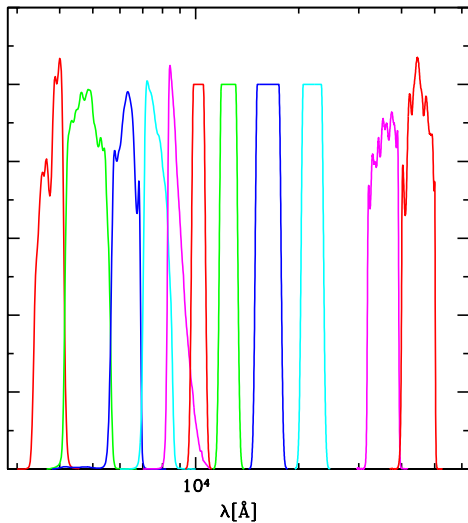
- PHAT Wiki page:  
[http://www.astro.caltech.edu/twiki\\_phat/bin/view/Main/WebHome](http://www.astro.caltech.edu/twiki_phat/bin/view/Main/WebHome)
- PHAT mailing list:  
<http://astro.caltech.edu:88/mailman/listinfo/phat>



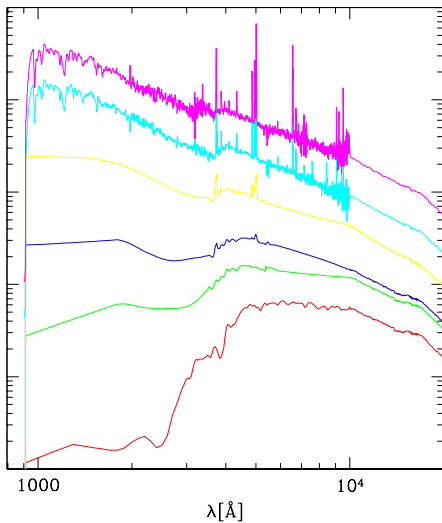
## Motivation

- Start as simple as possible.
- Test low-level agreement.
- Provide:
  - 2 catalogues
  - Template set
  - Filter curves
  - Optimal training set

# Filter set



# Template SEDs



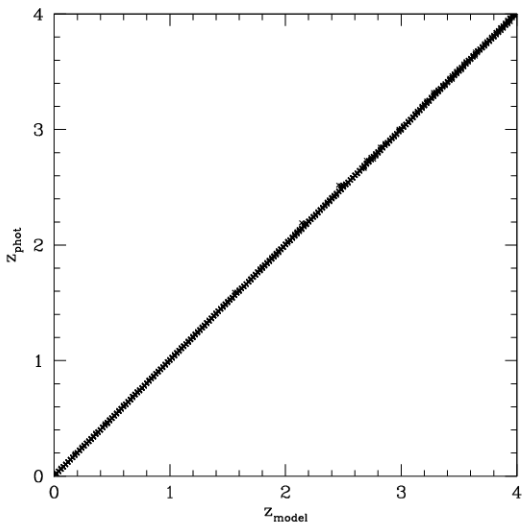
## Results from 15 people

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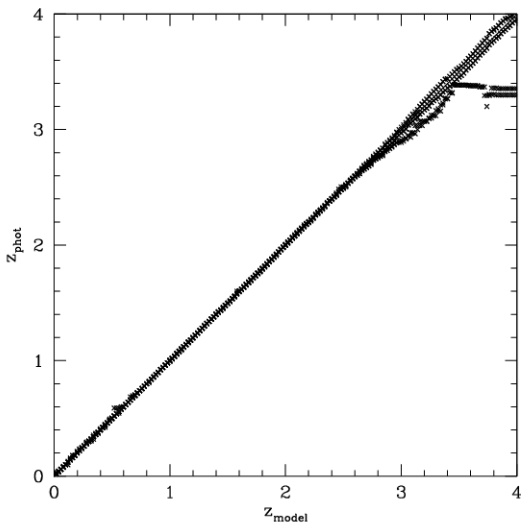
- Abdalla, Filipe
- Arnouts, Stephane
- Assef, Roberto
- Brammer, Gabriel
- Carliles, Sam
- Coe, Dan
- Dahlen, Tomas
- Feldmann, Robert
- Gerdes, David
- Gillis, Bryan
- Kotulla, Ralf
- Li, Tornado
- Miralles, Joan-Marc
- Purger, Norbert
- Singal, Jack

# Noise-free catalogue - ZEBRA

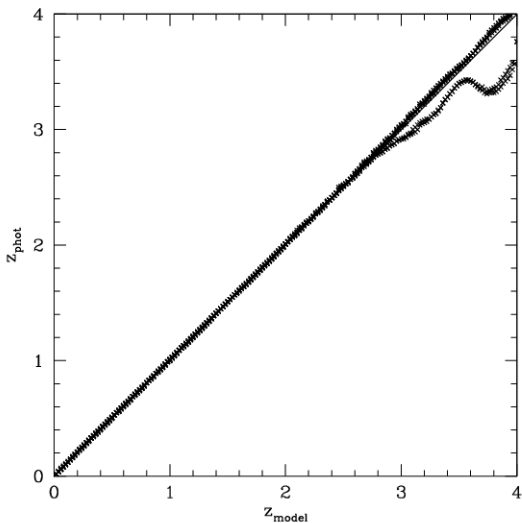
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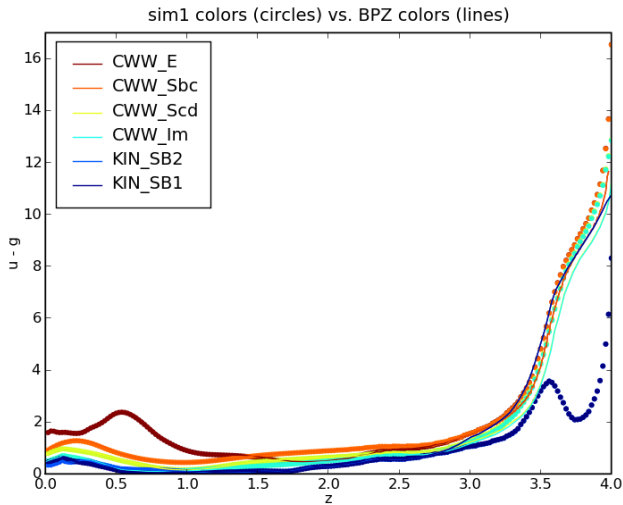
# Noise-free catalogue - *Hyperz*



# Noise-free catalogue - *BPZ*

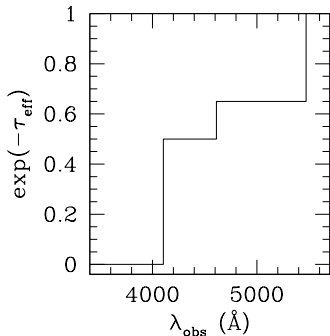
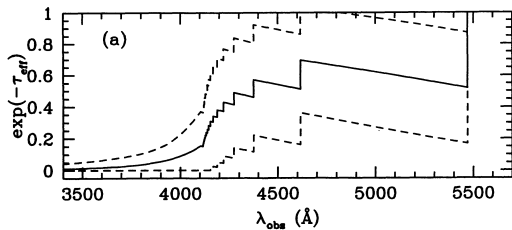


# Noise-free catalogue - *BPZ*

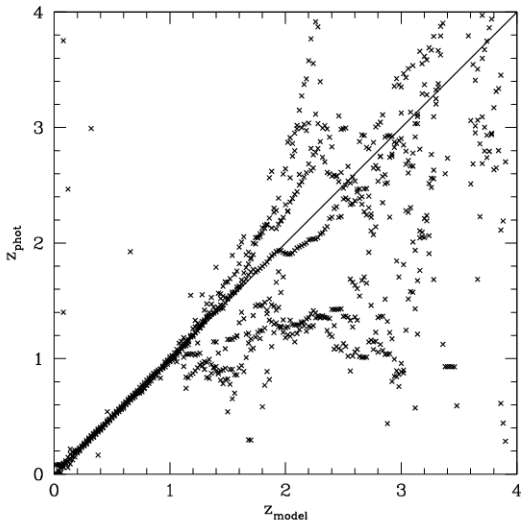




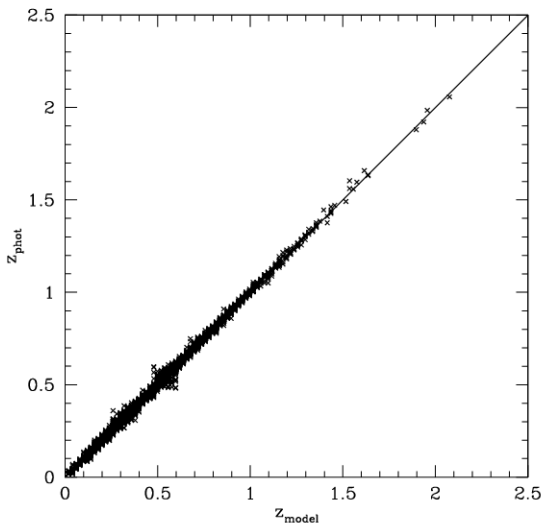
# Different IGM handlings



# Noise-free catalogue - empirical code

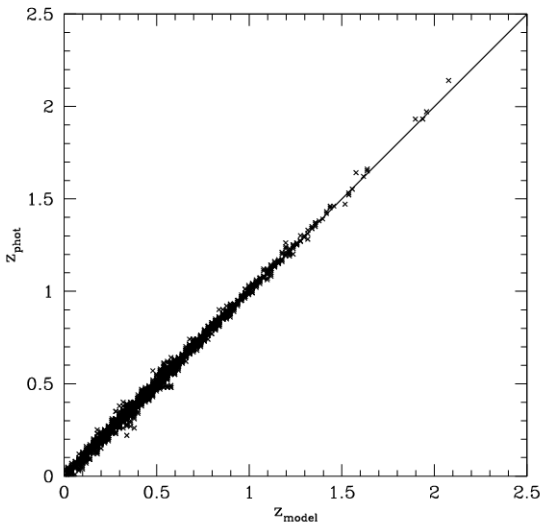


# Catalogue with noise - *Le Phare*



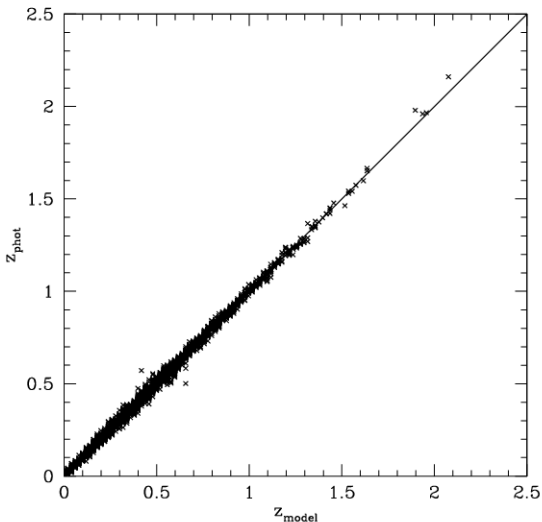
# Catalogue with noise - Tomas Dahlen (template-based)

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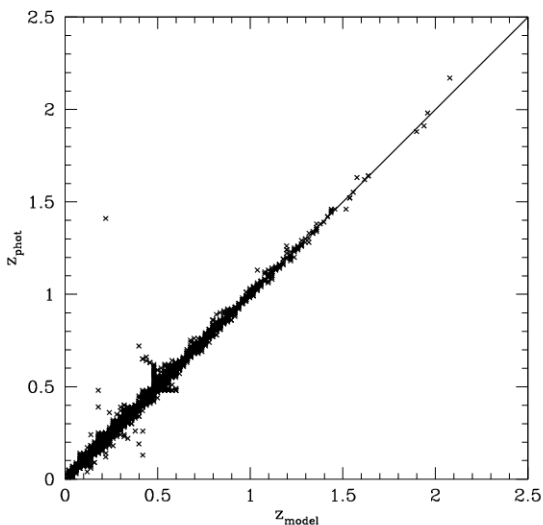
# Catalogue with noise - Filipe Abdalla (empirical)

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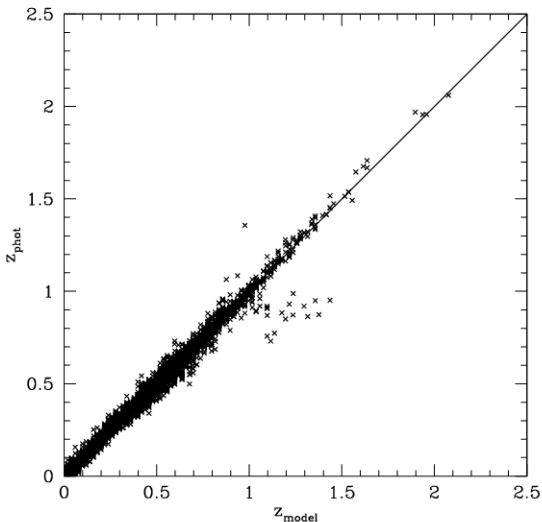
# Catalogue with noise - Roberto Assef (template-based)

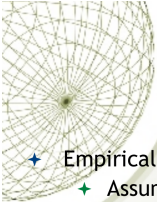
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# Catalogue with noise - Tornado Li (empirical)

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# Tornado's photo-z code

- ★ Empirical fitting method

- ★ Assuming galaxy redshift is a function of galaxy magnitudes and colors

$$z = a_0 + \sum_i^N a_i m_i + \sum_i^N \sum_{j=i+1}^N a_{ij} (m_i - m_j)^2$$

- ★ For each input galaxy, the fitting solutions ( $a_0$ ,  $a_i$ ,  $a_{ij}$ ) are derived using 300 training-set galaxies which have the best mag. and colors to the input galaxy in the training set
- ★ If some columns give crappy fitting results, i.e., the fitting is not good, reject the columns and re-do the fitting
- ★ If a galaxy only has photometry in some filters but not all UBVRIJHK, then the fitting is derived using training-set galaxies which have the photometry in the same passbands. Minimum three passband photometry is required.
- ★ Somehow my photo-z code is very slow. Suspect because of mpfitfun.pro.  
Any suggestion to make the code faster are welcome !



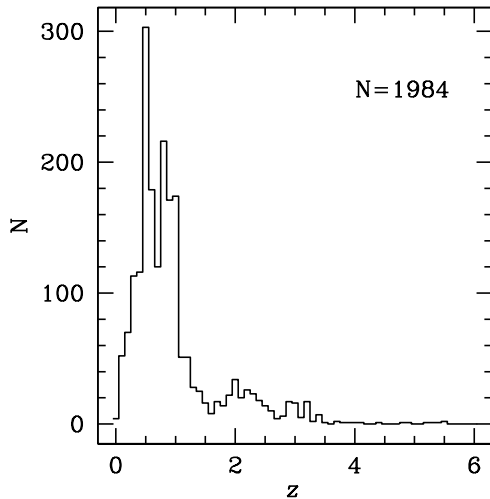
## Conclusions

- Generally good agreement
- Empirical and template-based codes work
- However, more than a factor of 2 accuracy differences
- IGM handling very different in the different template-based codes
- Importance of user-handling

## Motivation

- Several people: “We want real data.”
- Highly motivating
- Going back later
- Provide:
  - Filter curves (*UBVRI*, 4× *ACS*, *JHK*, 4× *IRAC*)
  - Small training set

# GOODS-North catalogue z-distribution

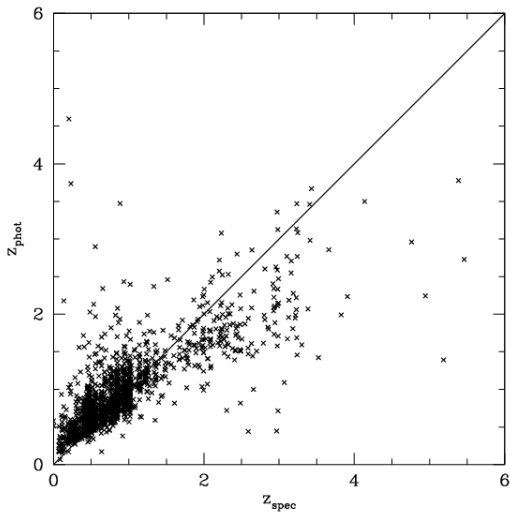


# Results from 9 people

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- Assef, Roberto
- Banerji, Manda
- Brammer, Gabriel
- Coe, Dan
- Kotulla, Ralf
- Li, Tornado
- Miralles, Joan-Marc
- Schmidt, Sam
- Wolf, Chris

# Manda Banerji (ANNz)



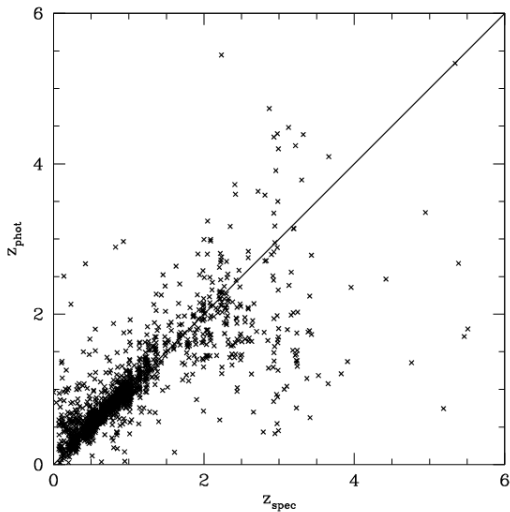
## Statistics

bias =  $-0.01$

$\sigma = 0.07$

outliers = 31.0%

# Tornado Li (empirical)



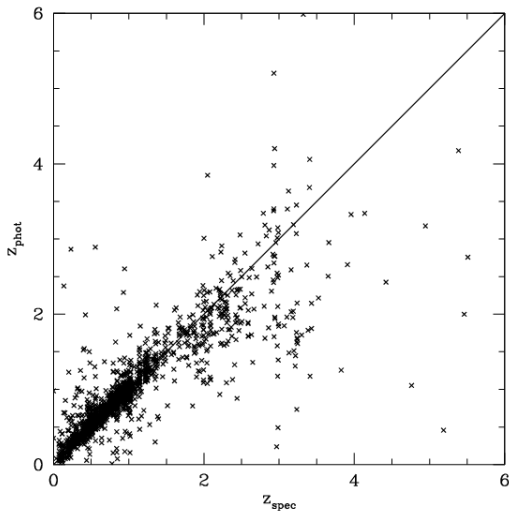
## Statistics

bias =  $-0.01$

$\sigma = 0.052$

outliers = 18.0%

# Tornado Li (empirical) without IRAC

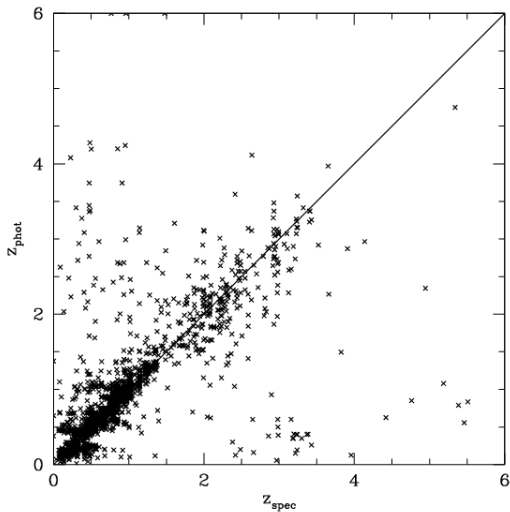


## Statistics

bias =  $-0.01$

$\sigma = 0.051$

outliers = 13.7%



## Statistics

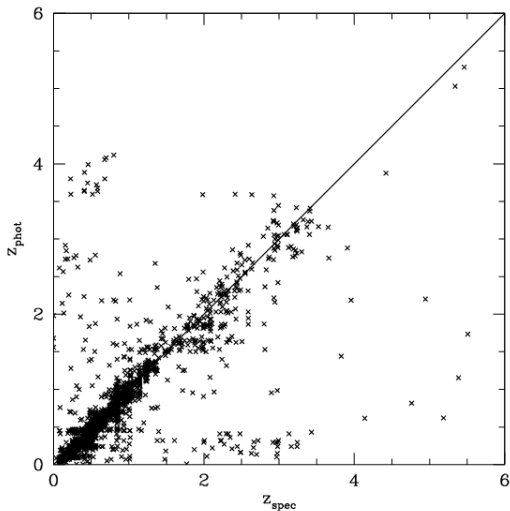
bias = 0.00

$\sigma = 0.058$

outliers = 18.5%



# Joan-Marc Miralles (Hyperz) without IRAC

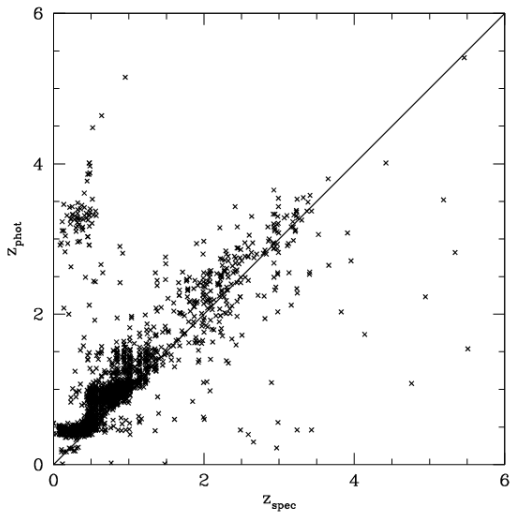


## Statistics

bias = 0.02

$\sigma = 0.055$

outliers = 14.7%



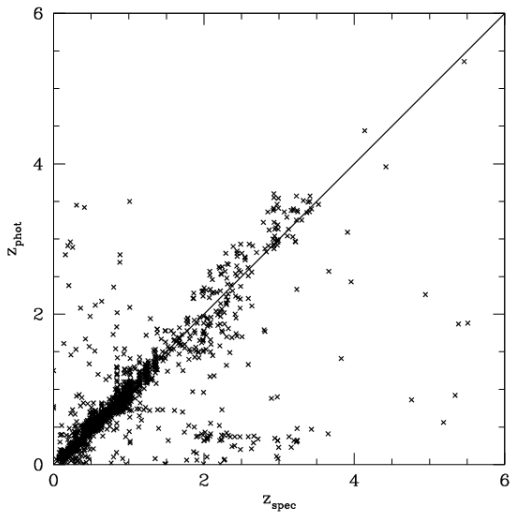
## Statistics

bias =  $-0.05$

$\sigma = 0.06$

outliers = 30.9%

# Dan Coe (BPZ) without IRAC



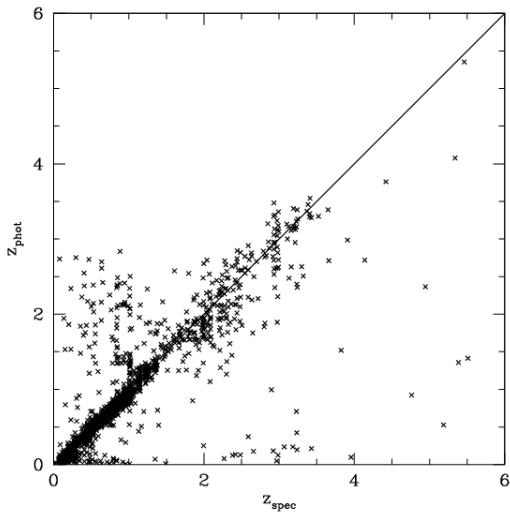
## Statistics

bias = 0.01

$\sigma = 0.048$

outliers = 11.4%

# Gabriel Brammer (EAZY)



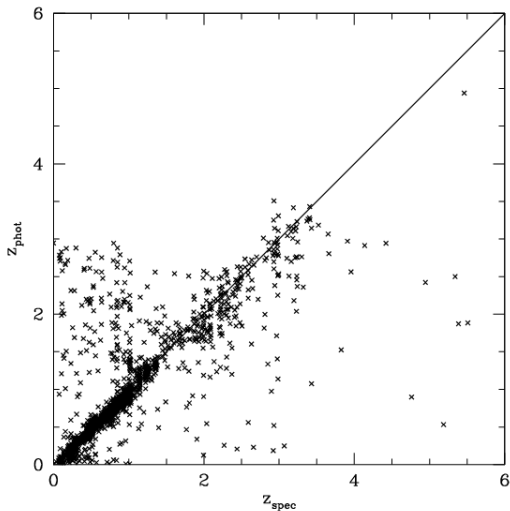
## Statistics

bias = 0.02

$\sigma = 0.042$

outliers = 11.6%

# Gabriel Brammer (EAZY) without IRAC



## Statistics

bias = 0.02

$\sigma = 0.042$

outliers = 13.5%

## What's next?

- More advanced analysis
- PHAT0b
- GOODS-North b
- Open to ideas from the community

## Websites

- PHAT Wiki page:  
[http://www.astro.caltech.edu/twiki\\_phat/bin/view/Main/WebHome](http://www.astro.caltech.edu/twiki_phat/bin/view/Main/WebHome)
- PHAT mailing list:  
<http://astro.caltech.edu:88/mailman/listinfo/phat>