

# Exploring the Early Universe with Line-Intensity Mapping

Cornell Astronomy Colloquium

October 26, 2017

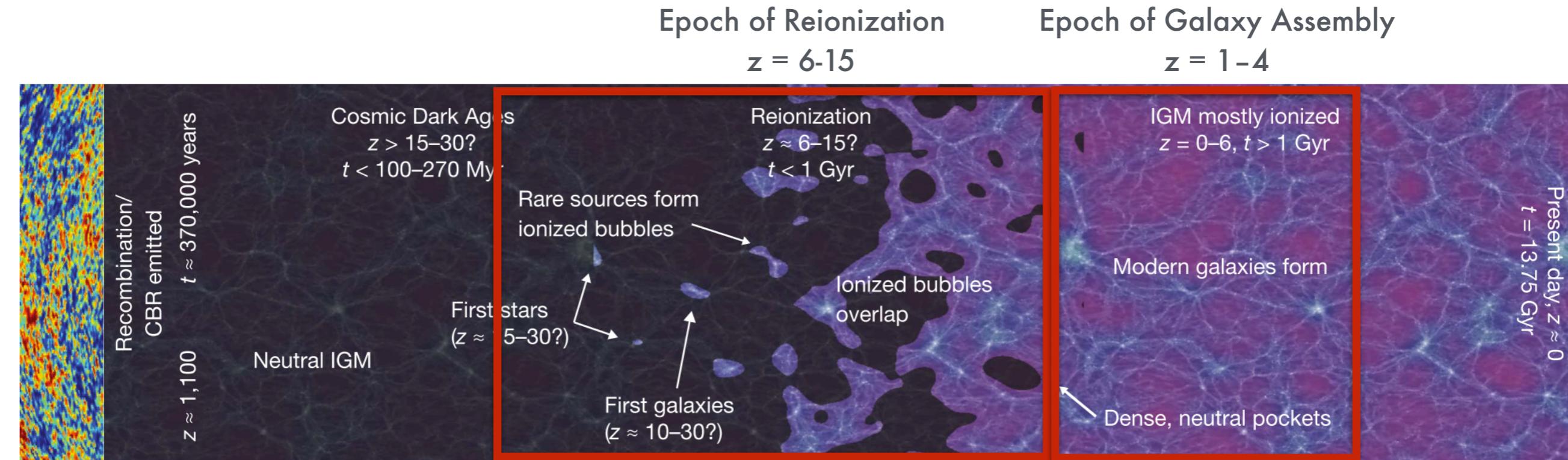
Marco Viero – KIPAC/Stanford University

# Outline

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- The Early Universe — Motivation
  - The Epoch of Reionization
  - The Epoch of Galaxy Assembly
- Embracing Statistical Techniques
  - Summary of Different Approaches
  - The CIB — A Success Story
- Line-Intensity Mapping
  - From IGM to Galaxies
  - First Detections
  - The Experimental Landscape

# Early Universe

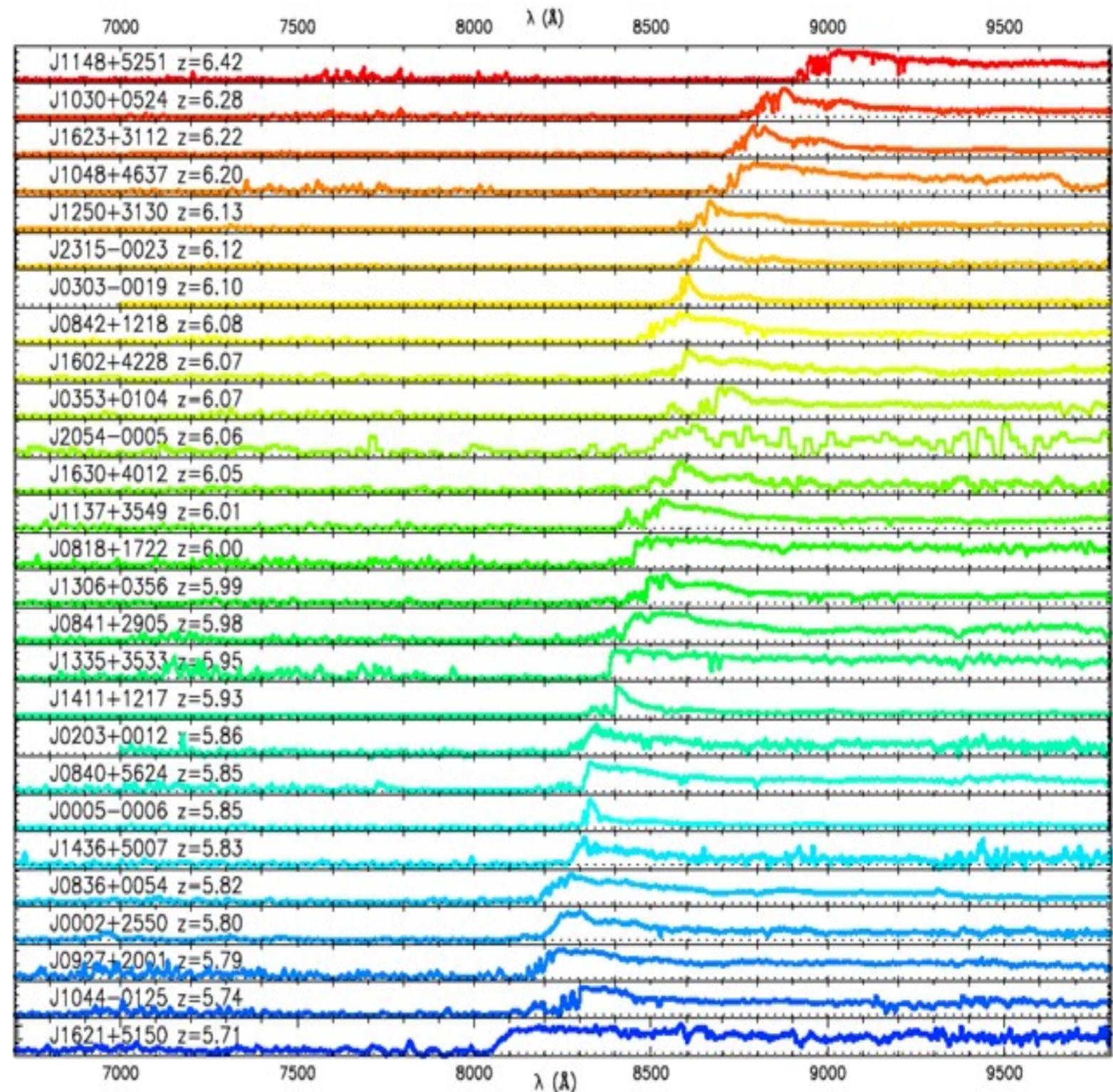


Robertson (2010)

- Epoch of Reionization:
  - When did the EoR begin/end?
  - Which galaxies are primarily responsible? SFG? AGN?
  - Is most of the work done by a few luminous or many faint galaxies?
- Epoch of Galaxy Assembly:
  - What sets the star-formation efficiency in early galaxy populations?
  - What is the role of gas supply in explaining the Universe's star-formation history?

# EoR – Know: Reionization was Patchy

- Gunn-Peterson trough traces reionization via absorption of Lyman-alpha in quasar spectra.
- Reionization is patchy: depending on where you point, redshift of Gunn-Peterson trough varies.
- Reionization is fully completed by  $z \sim 5$ .



Fan et al. (2006) – arXiv:0512082  
Becker et al. (2015) – arXiv:1407.4850

# EoR – Know: Optical Depth to Reionization

- Planck E-mode polarization maps enable measurement of Thomson optical depth

$$\tau = 0.065$$

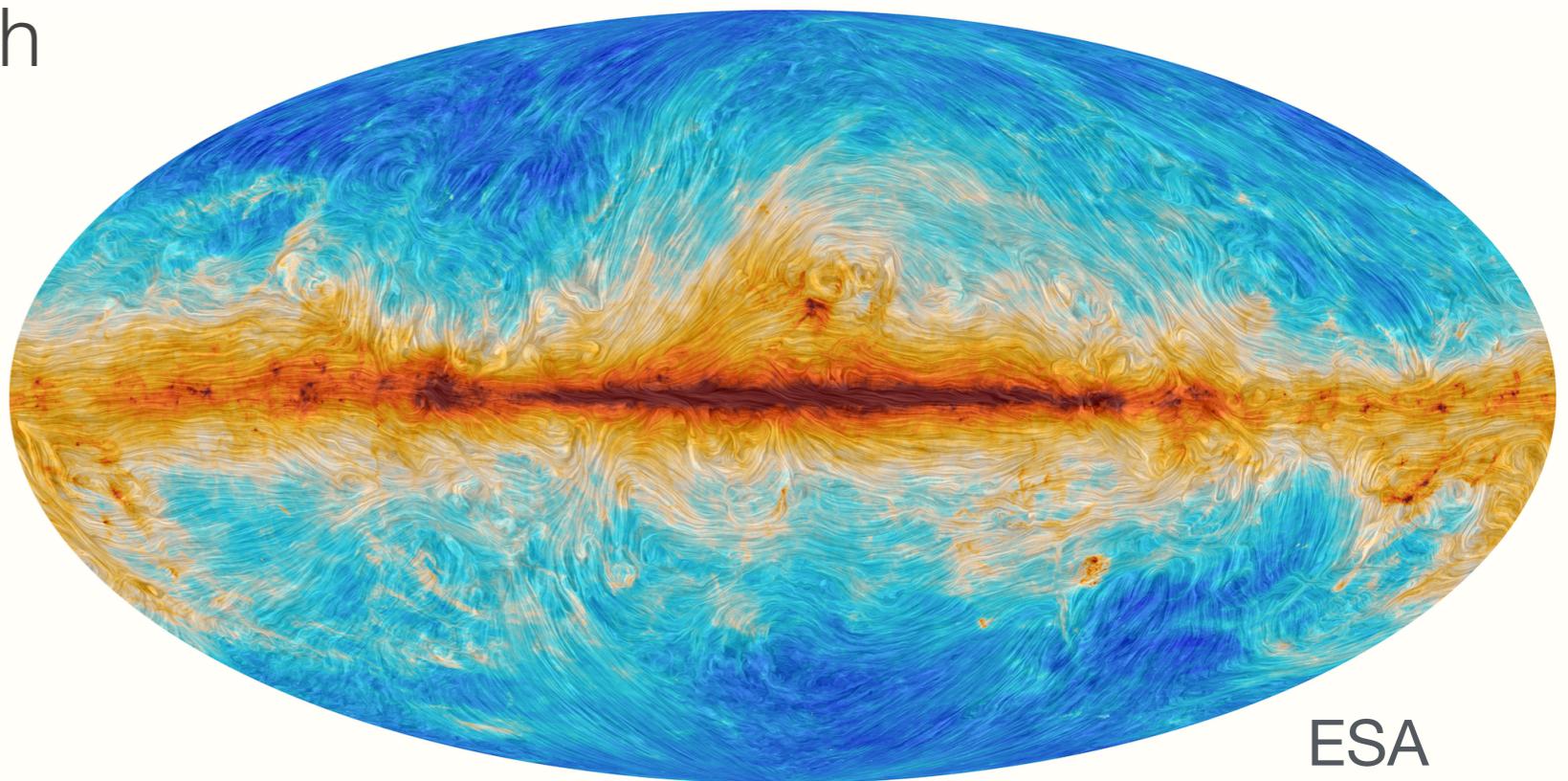
→ puts instantaneous reionization at  
 $z = 8.8 \pm 1.5$

- Previously WMAP had

$$\tau = 0.089$$

→ instantaneous reionization at  $z = 10.5$

Planck 353 GHz B-Field



Planck Collaboration (2015) – arXiv:1502.01589

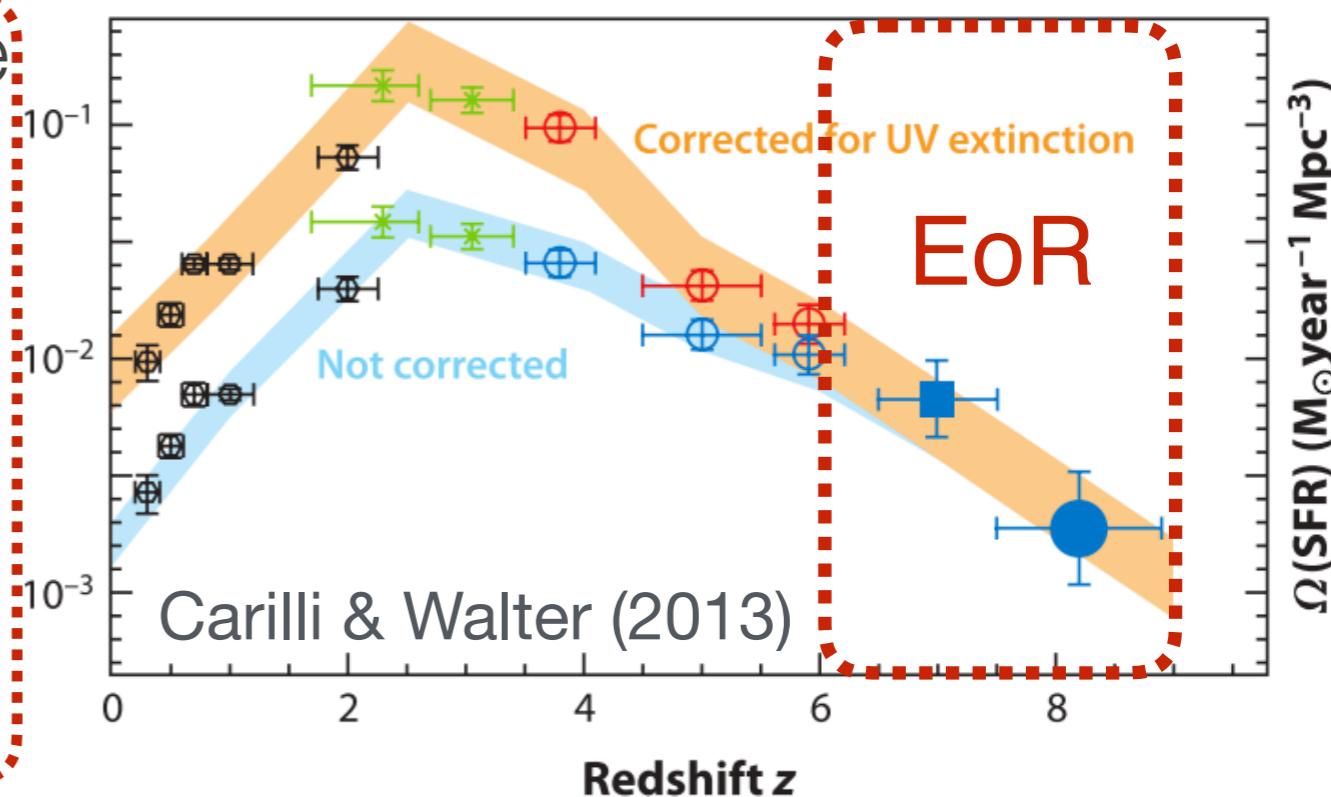
# Reionization: A Balancing Act



- $f_{\text{esc}}$ : Escape fraction of ionizing photons.
- $\zeta_Q$ : Number of ionizing photons per UV luminosity.
- $\rho_{\text{SFR}}$ : Comoving star-formation rate (UV luminosity) density.
  - high-z galaxies are identified as Lyman-break dropouts.
    - ◆ Missing faint dusty sources?
  - $\rho_{\text{SFR}}$  inferred via the UV luminosity function.

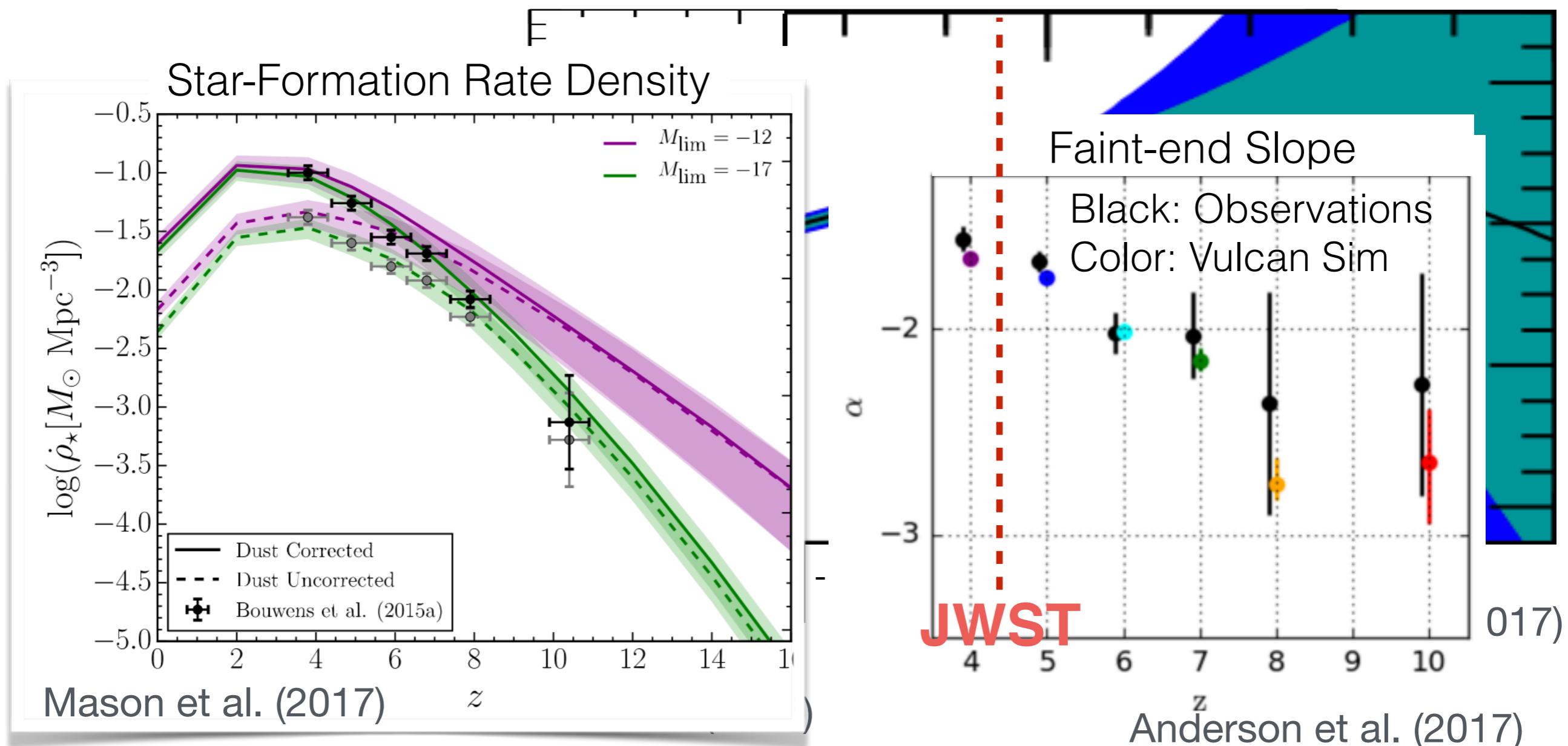
## Recombinations

- $T_{\text{IGM}}$ : IGM temperature.
- $\rho_{\text{HI}}$ : Physical hydrogen density.
- $C_{\text{HII}}$ : Clumping factor



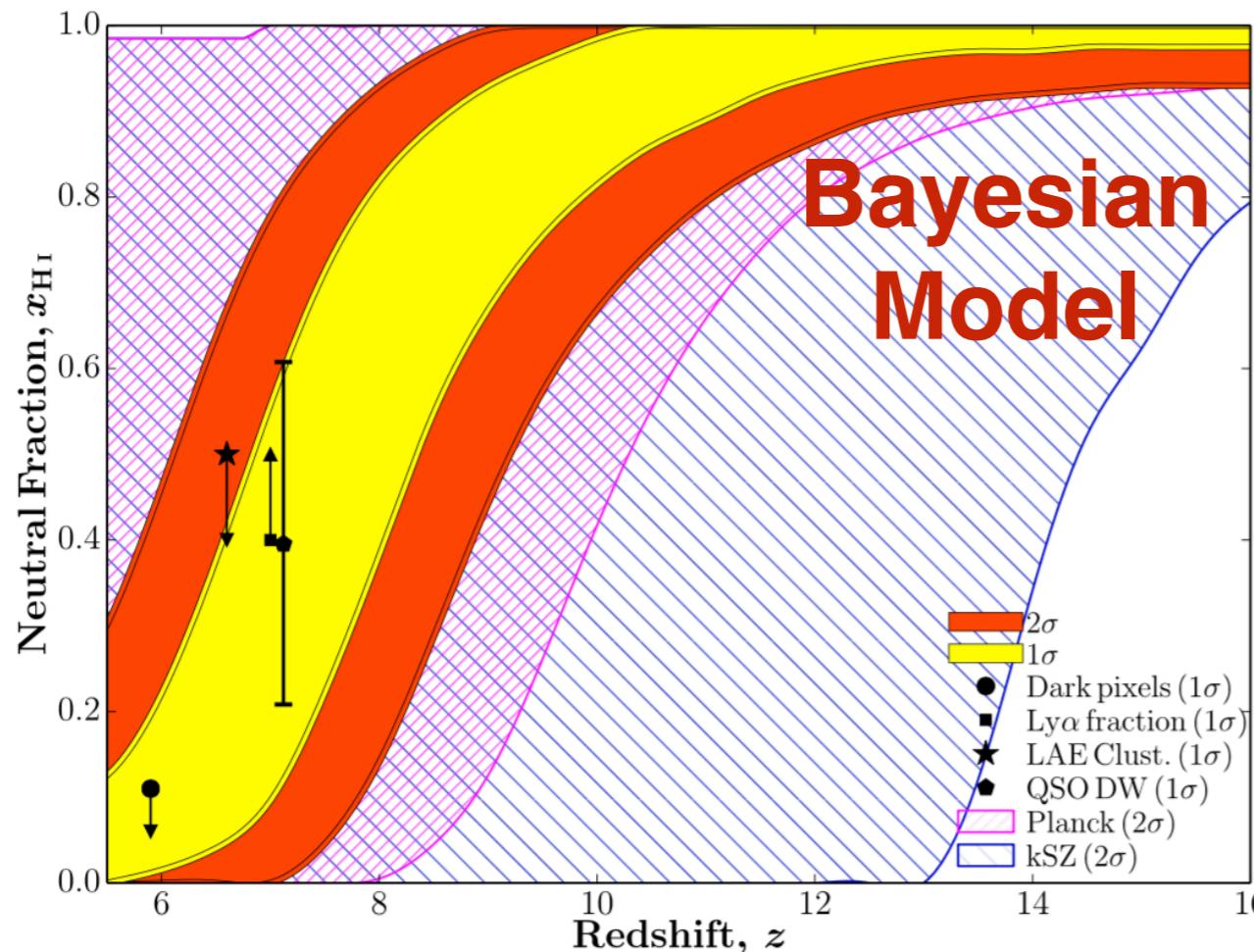
# EoR – Don't Know: Faint-end of the Luminosity Function

- Slope determines which population dominates the power:
  - Does slope evolve with redshift? Where does it turn over?
- Sources fainter than -16 measured via magnification from cluster lensing. Subject to systematics (e.g., lensing model, shear, etc.)

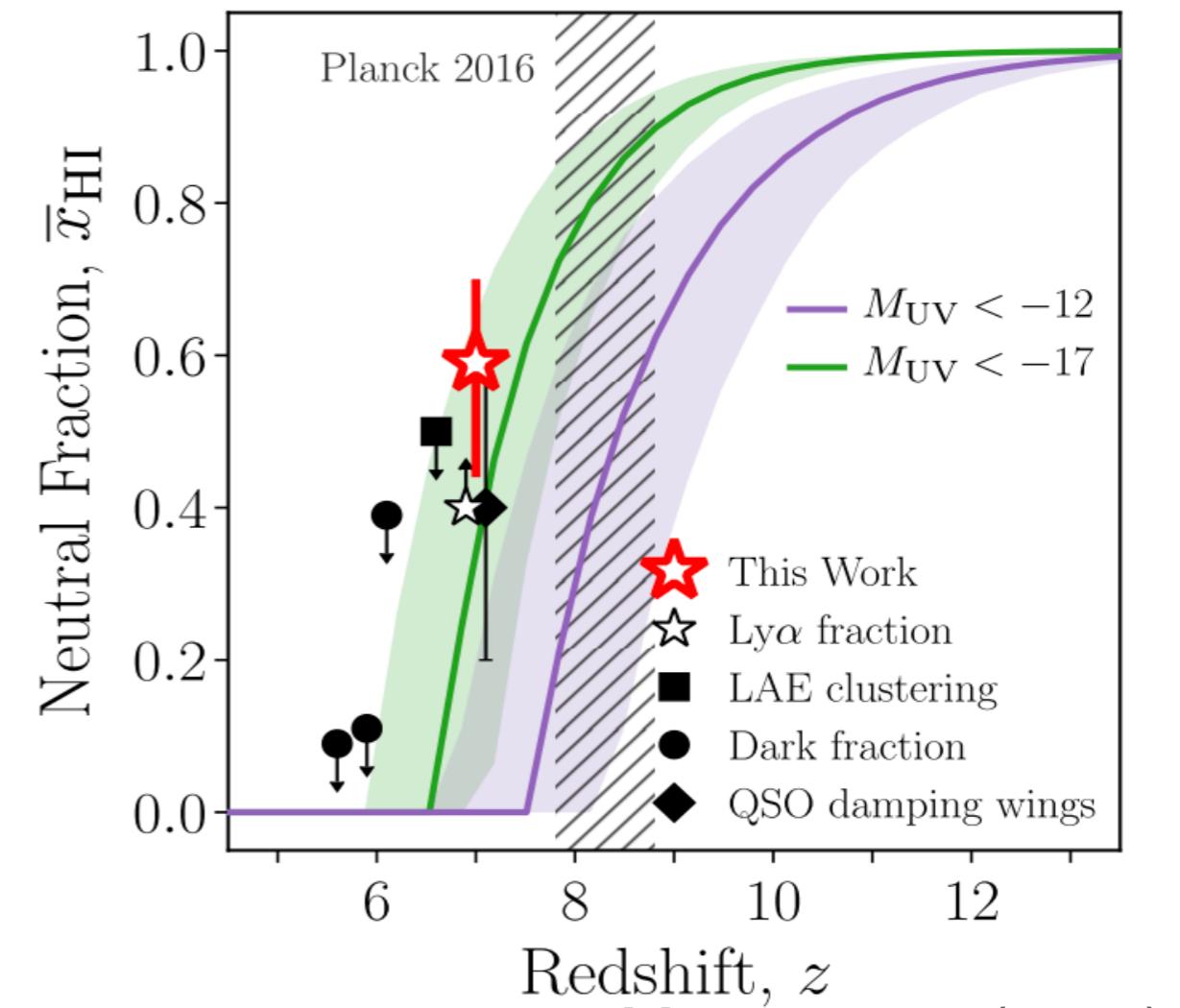


# EoR – Don't Know: Evolution of Neutral Fraction

- Combining all existing observations leads to a wide range of possibilities.
- The existence of a significant faint contribution would push reionization to earlier times.



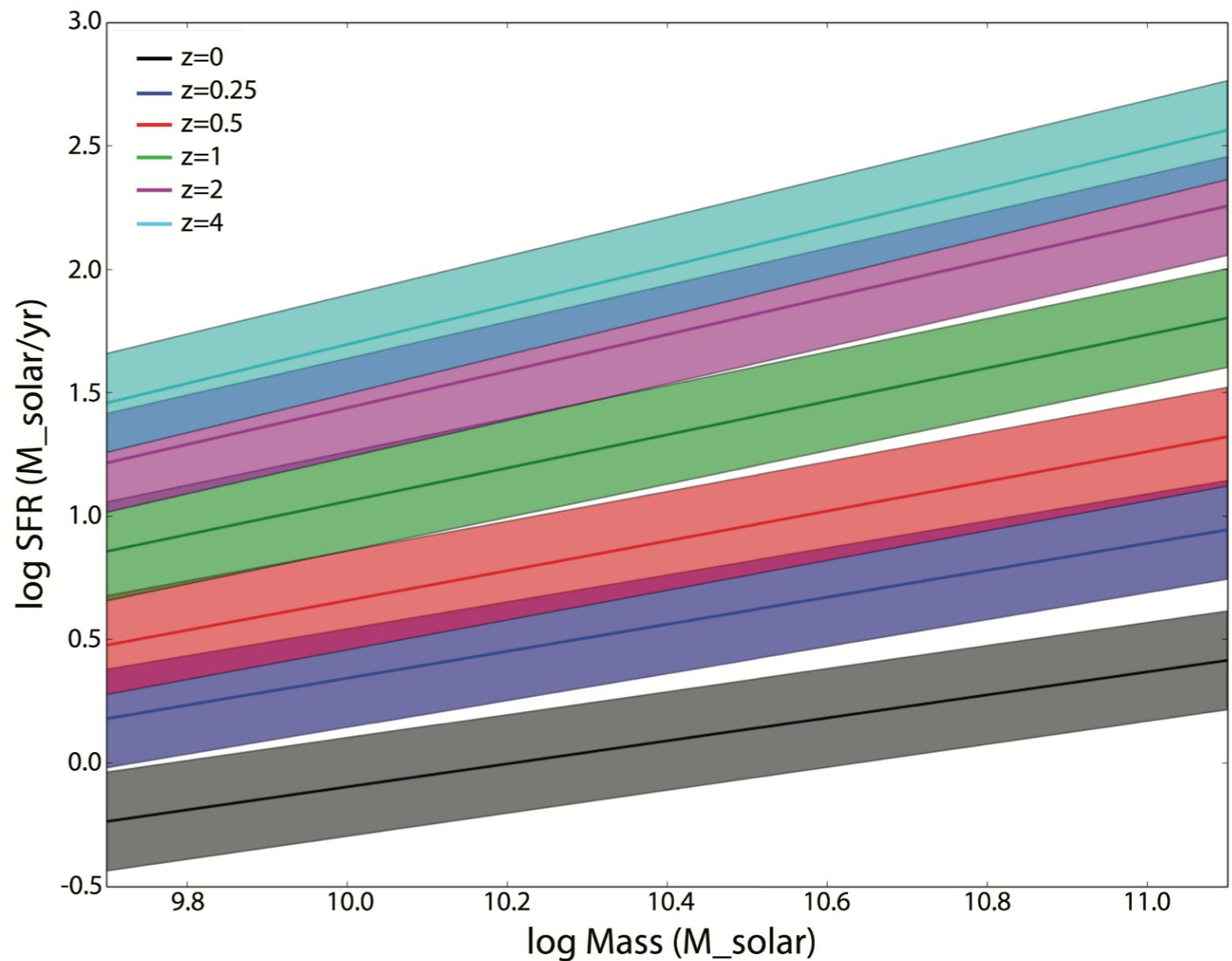
Greig & Mesinger (2017)  
arXiv:1605.05374



Mason et al. (2017)  
arXiv:11709.05356

# EGA – Know: Star-Forming Main Sequence

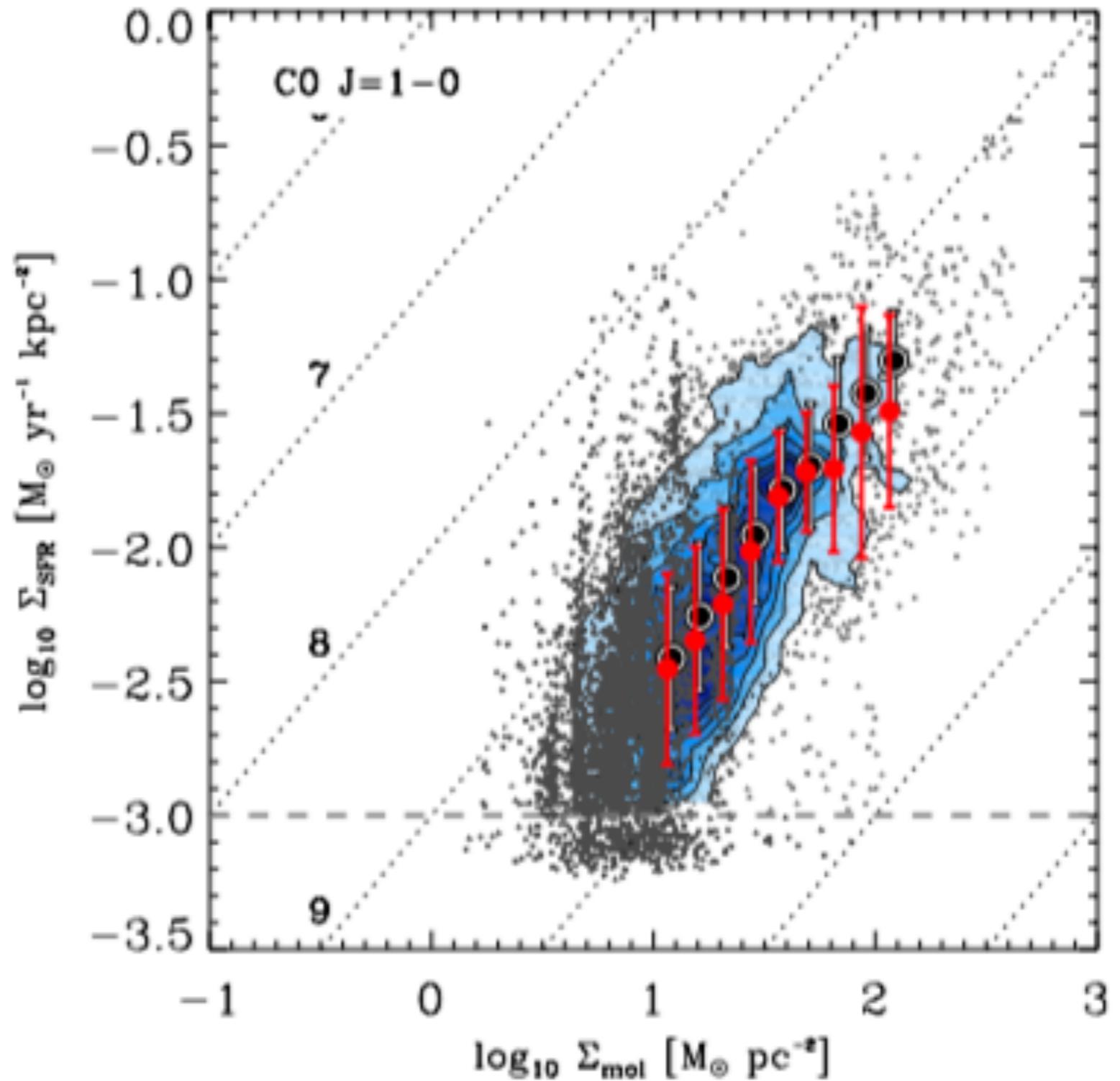
- Star-formation rate is a strong function of galaxy stellar-mass.
  - Exceptions include starbursts (above), and quiescent (below).
- Power-law evolves strongly with redshift.



Speagle et al. (2014) — arXiv:1405.2041

# EGA – Know: SFR / Molecular Gas Surface Densities Proportional

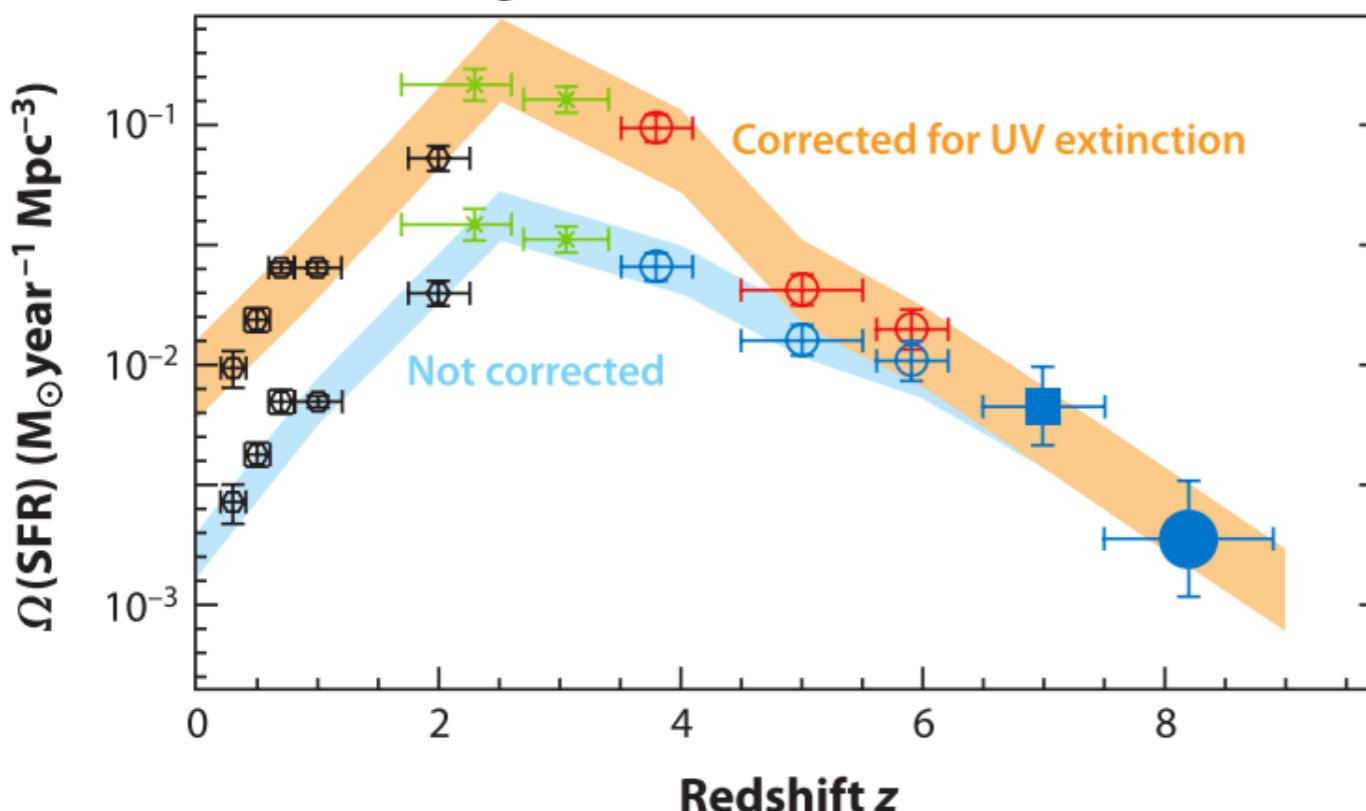
- Seen locally in detailed studies of resolved galaxies in HI and CO.
- Exhaustion of gas reservoirs may explain strong evolution of the star-forming main sequence.



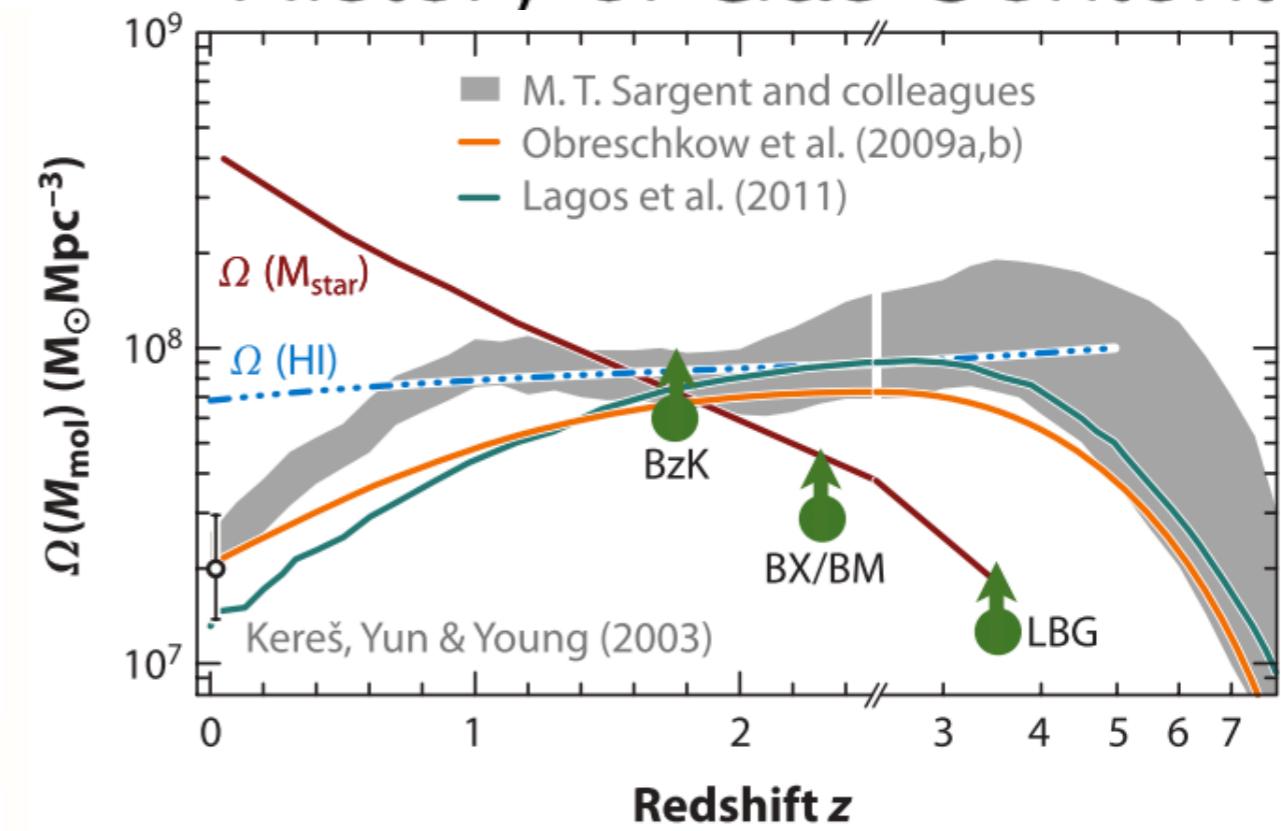
Leroy et al. (2013) – arXiv:1301.2328

# EGA – Don't Know: Role of Gas in High-z Galaxy Assembly

## History of Star Formation



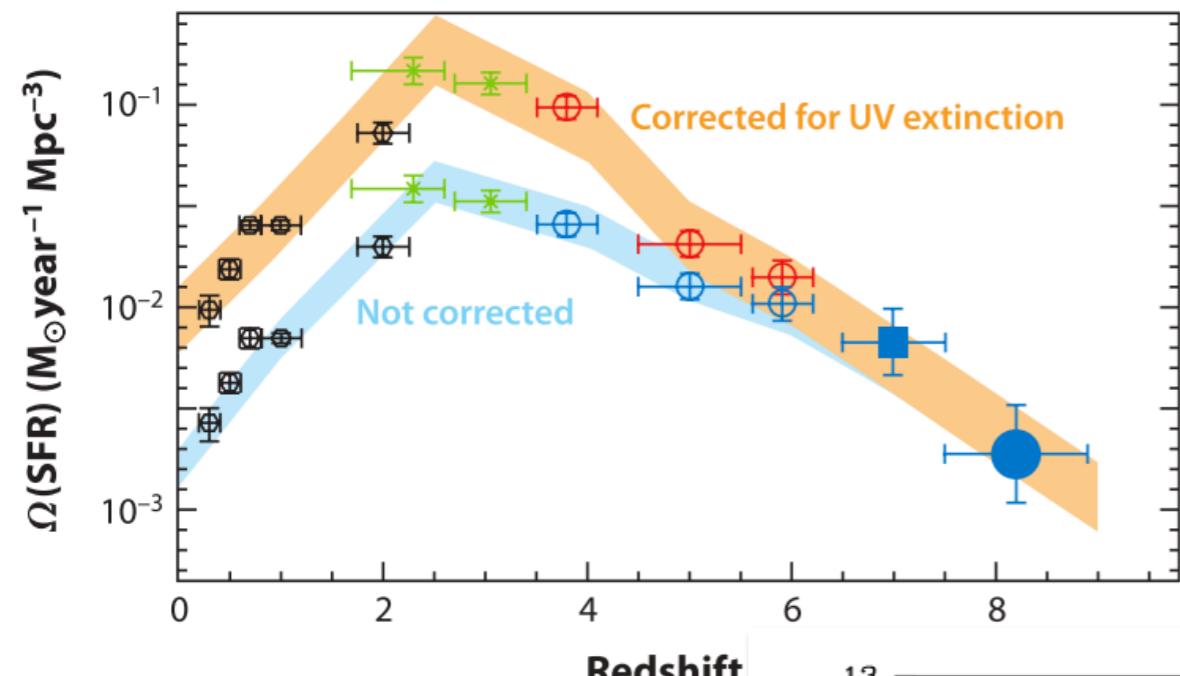
## History of Gas Content



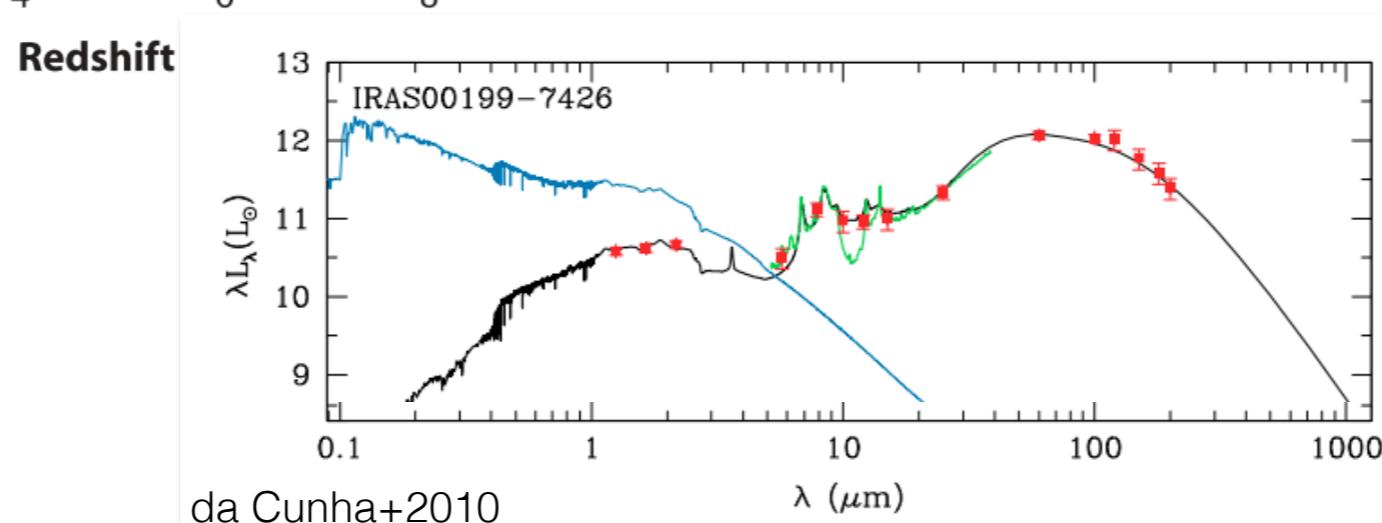
Carilli & Walter (2013) — arXiv:1301.0371

- To understand role of gas in star formation at all epochs, need to extend our knowledge of history of gas content to high- $z$ .

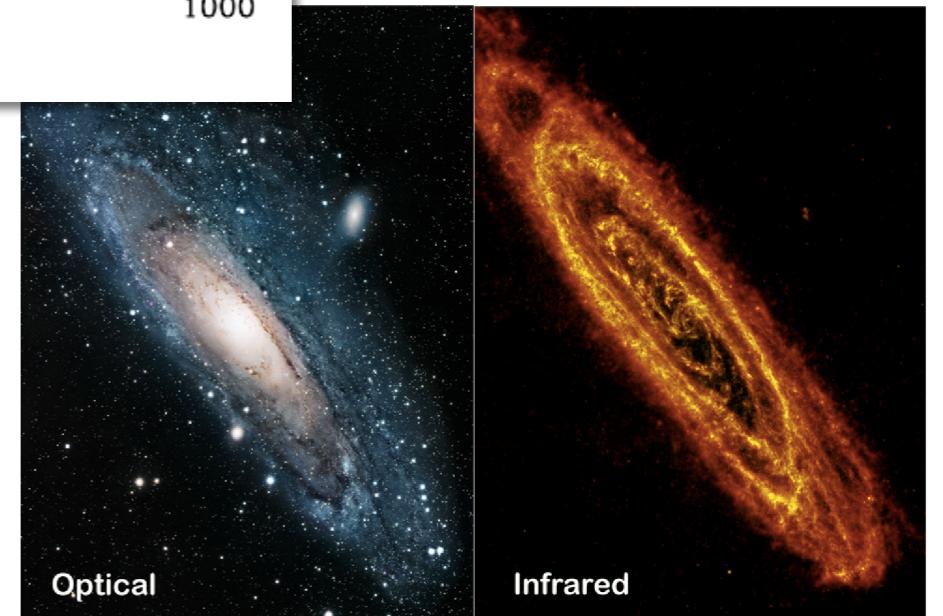
# EGA – Don't know: High-z Contribution of Dusty Galaxies



- Infrared/Submillimeter emission reprocessed starlight by dust
- IR/Submm traces star formation



- Why not determine SFRs by observe the dust directly, rather than correcting UV?



# Early Universe: What We Know and What We Don't Know

FOR

LEGA

## Know

- Planck optical depth ( $\tau = 0.065$ ) puts instantaneous reionization at  $z = 8.8 \pm 1.5$
- Reionization is Patchy: e.g., Fan+2006, Becker+2015

## Don't Know

- Details of Reionization:
  - Start, duration.
  - Sources; SFG, AGN, faint?
- Faint-end slope of Luminosity Function at high- $z$
- Where LF turns-over

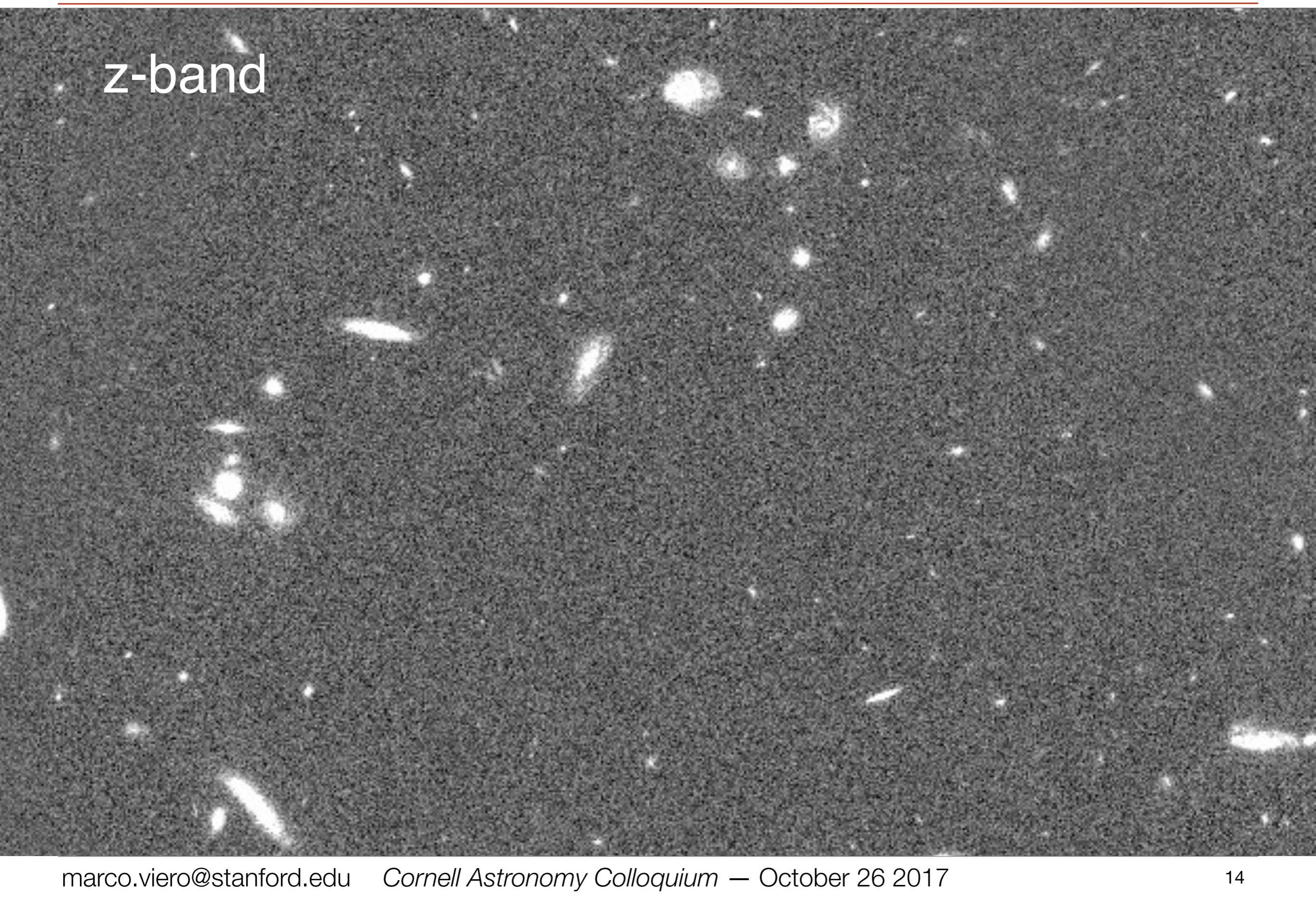
- Star formation proportional to molecular gas surface density
- Specific star-formation rate proportional to stellar mass (SF main sequence, MS)
- MS evolves strongly with  $z$

- Molecular Gas Density at high- $z$ , and its role in:
  - peak halo-mass efficiency
  - evolving main-sequence
- Contribution of dusty galaxies to high- $z$  SFRD

# EGA – Challenge: Source Confusion

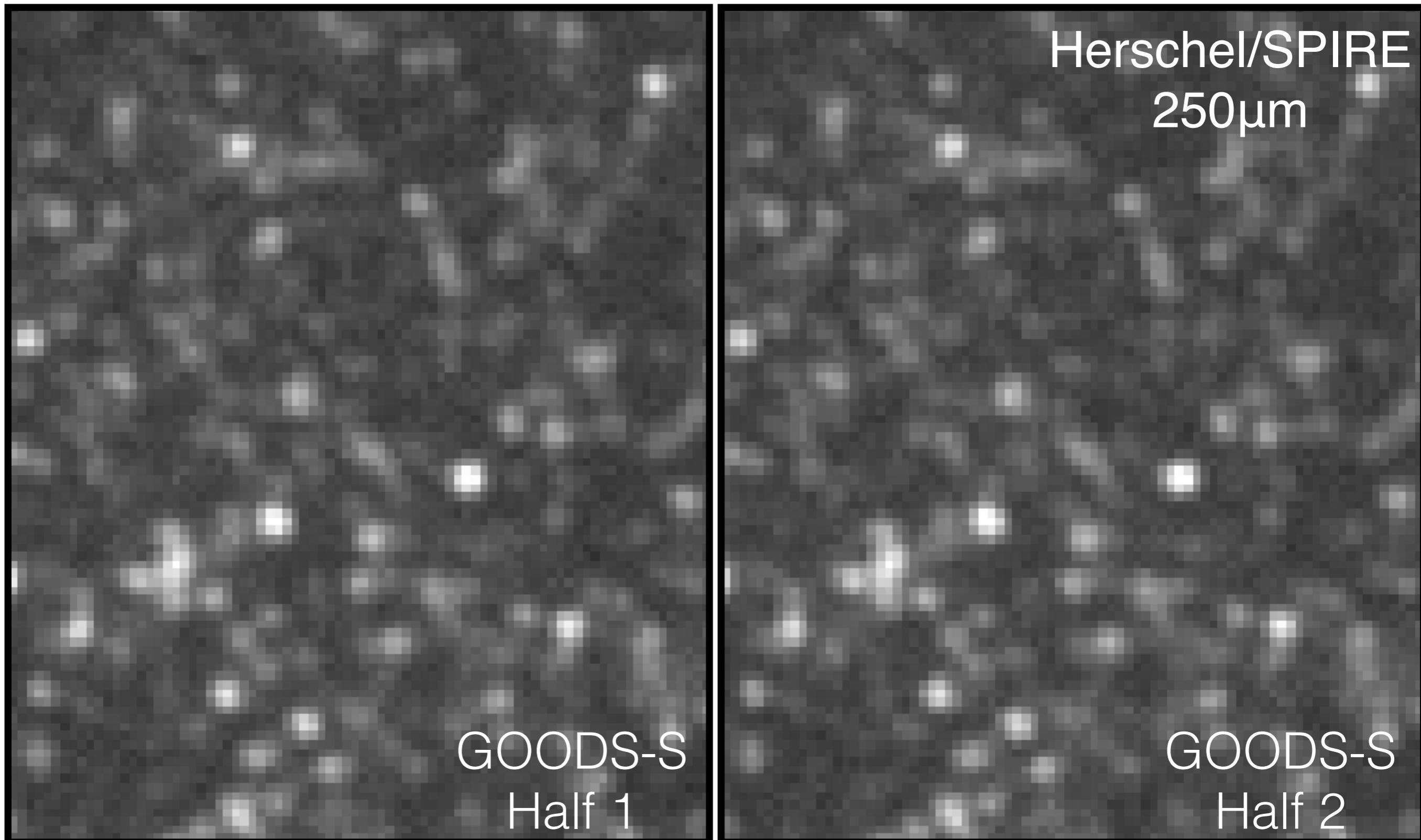
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z-band



# Solution: Embrace Statistical Methods

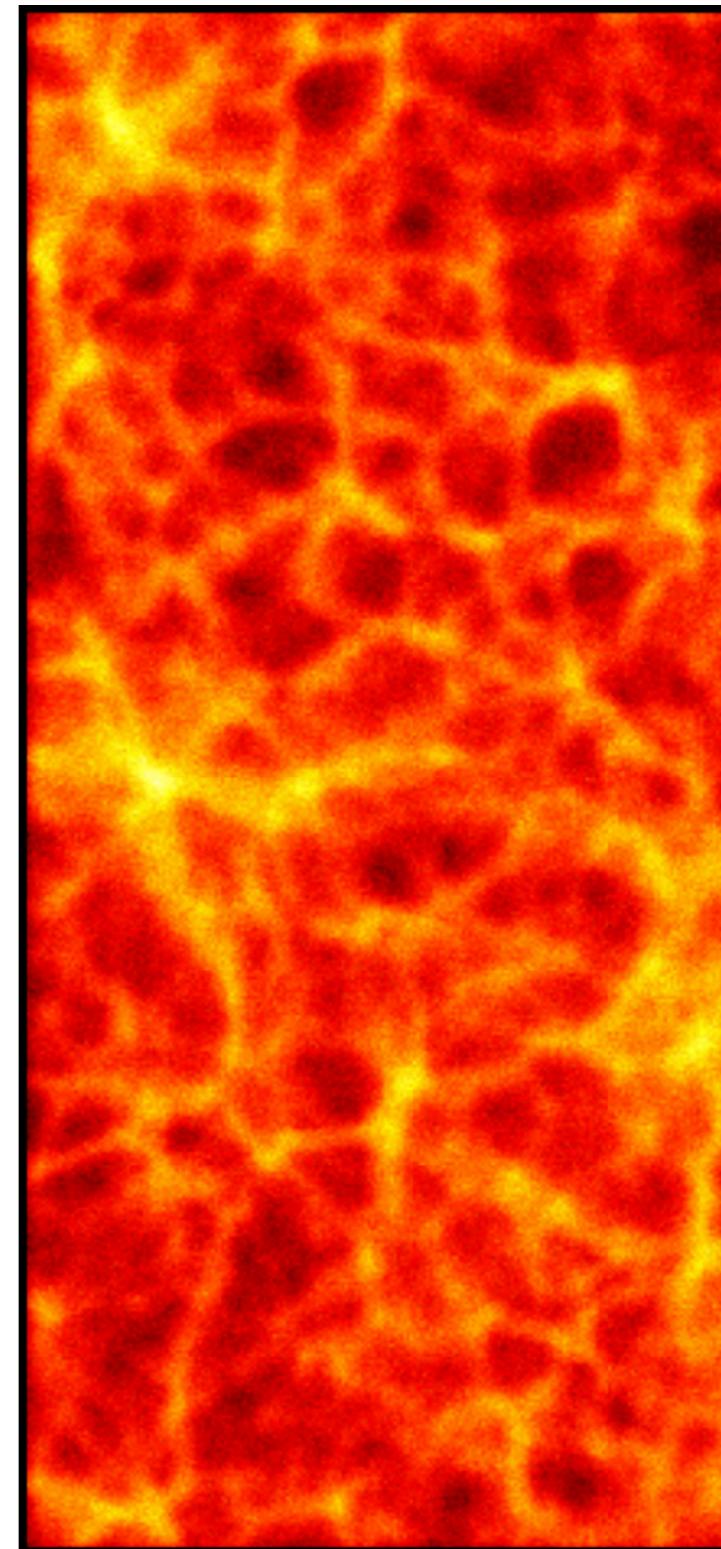
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# Embracing Statistical Methods

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- Galaxies are *biased tracers* of the dark matter distribution.
- Usually want to know about the entire population, but we use what we can see: galaxies.
  - Depending on survey depth and wavelength, make up  $\sim 1 - 50\%$  of the extragalactic background light; e.g., Dole+2006, Viero+2013
- Statistical methods aim to use the aggregate intensities of all the sources of emission.



Dore et al. (2015)

# Embracing Statistical Methods

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- Statistical Methods Include:
  - N-point functions
    - ▶ 1-point, i.e., the histogram/ $P(D)$
    - ▶ 2-point, i.e., the power spectrum
    - ▶ 3-point, i.e., bi-spectrum (skewness)

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## A STATISTICAL METHOD FOR ANALYSING OBSERVATIONS OF FAINT RADIO STARS

By P. A. G. SCHEUER

Communicated by M. RYLE

Received 3 December 1956

## SUBMILLIMETER NUMBER COUNTS FROM STATISTICAL ANALYSIS OF BLAST MAPS

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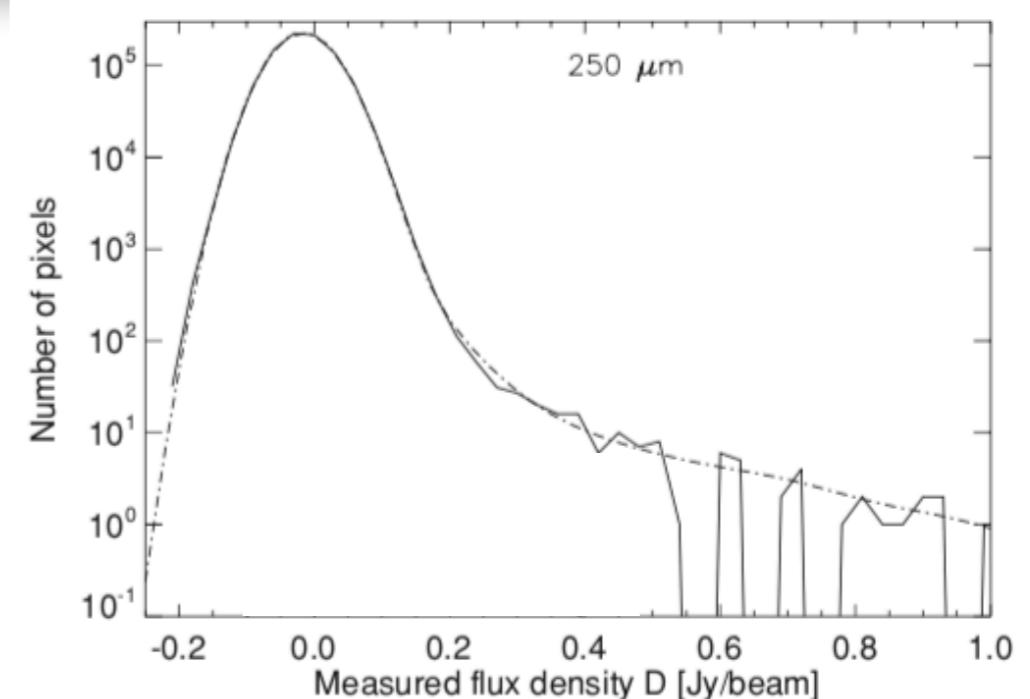
<sup>9</sup> Department of Physics, University of Toronto, 60 St. George Street, Toronto, ON M5S 1A7, Canada

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Received 2009 June 5; accepted 2009 October 16; published 2009 December 7



# Embracing Statistical Methods

- Statistical Methods Include:
  - N-point functions
    - ▶ 1-point, i.e., the histogram/P(D)
    - ▶ 2-point, i.e., the power spectrum

## THE THREE-DIMENSIONAL POWER SPECTRUM OF GALAXIES FROM THE SLOAN DIGITAL SKY SURVEY

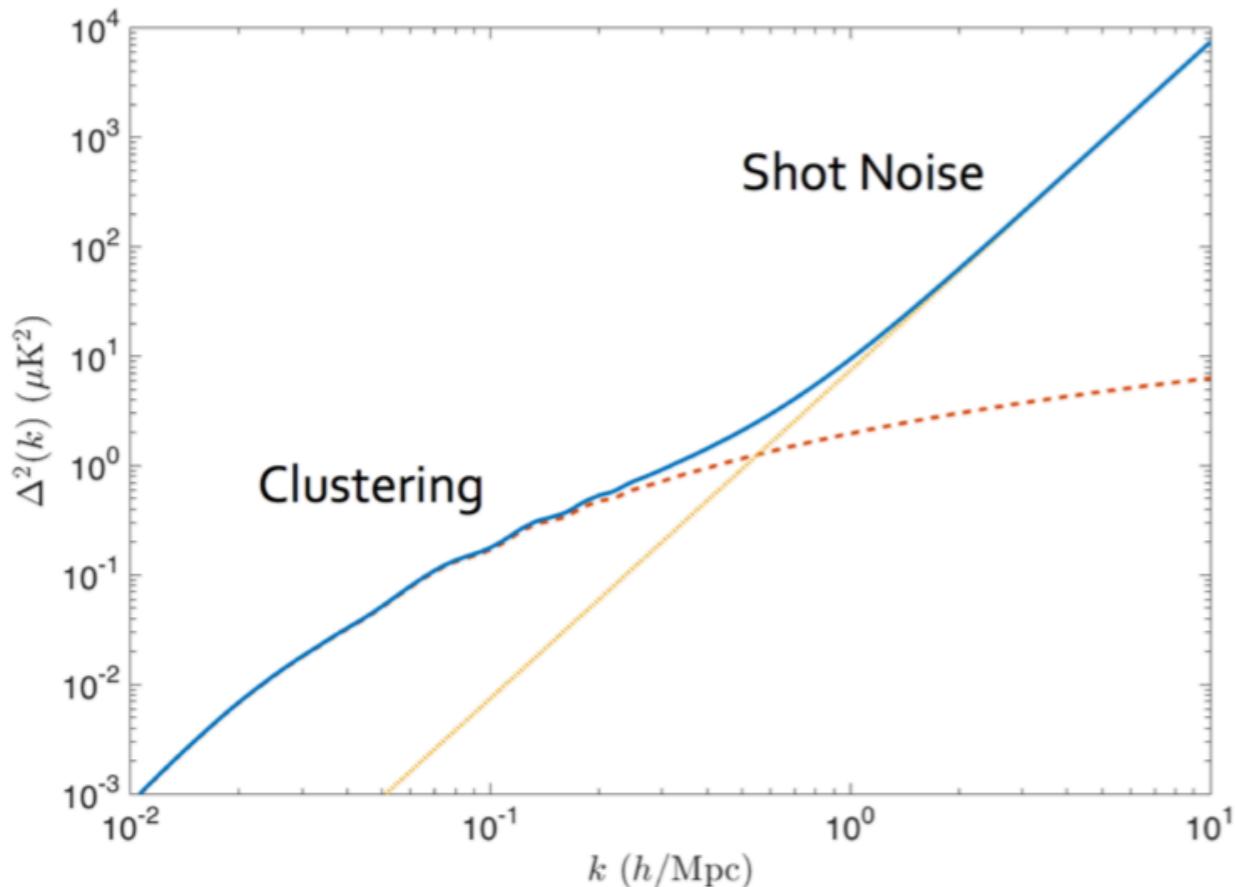
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(FOR THE SDSS COLLABORATION)

Received 2003 June 18; accepted 2003 December 17

## ABSTRACT

We measure the large-scale real-space power spectrum  $P(k)$  by using a sample of 205,443 galaxies from the Sloan Digital Sky Survey, covering 2417 effective square degrees with mean redshift  $z \approx 0.1$ . We employ a new method using pseudo-Karhunen-Loeve eigenmodes, producing uncorrelated minimum-variance measurements in 22  $k$ -bands of both the clustering power and its anisotropy due to redshift-space distortions, and well-behaved window functions in the range  $0.02 h \text{ Mpc}^{-1} < k < 0.3 h \text{ Mpc}^{-1}$ . We pay particular attention to modeling, quantifying, and correcting for potential systematic errors, nonlinear redshift bias, and the artificial red-tilt caused by luminosity-dependent bias. Our results are robust to omitting radial density fluctuations and are consistent between different parts of the sky. Our final result is a measurement of the real-space matter power spectrum  $P(k)$  up to an unknown overall multiplicative bias factor. Calculations suggest that this bias factor is independent of scale to better than a few percent for  $k < 0.1 h \text{ Mpc}^{-1}$ , thereby making our results useful for precision measurements of cosmological parameters in conjunction with data from other experiments such as the *Wilkinson Microwave Anisotropy Probe* satellite. The spectrum is not well-characterized by a single power law but unambiguously shows curvature. As a simple realization of the data, our measurements are well fitted by a flat scale-invariant adiabatic cosmological model with  $h \Omega_m = 0.213 \pm 0.023$  and  $\sigma_8 = 0.89 \pm 0.02$  for  $L_*$  galaxies, when fixing the baryon fraction  $Y_B = 0.17$  and the Hubble parameter  $h = 0.72$ ; cosmological interpretation is given in a companion paper.



# Embracing Statistical Methods

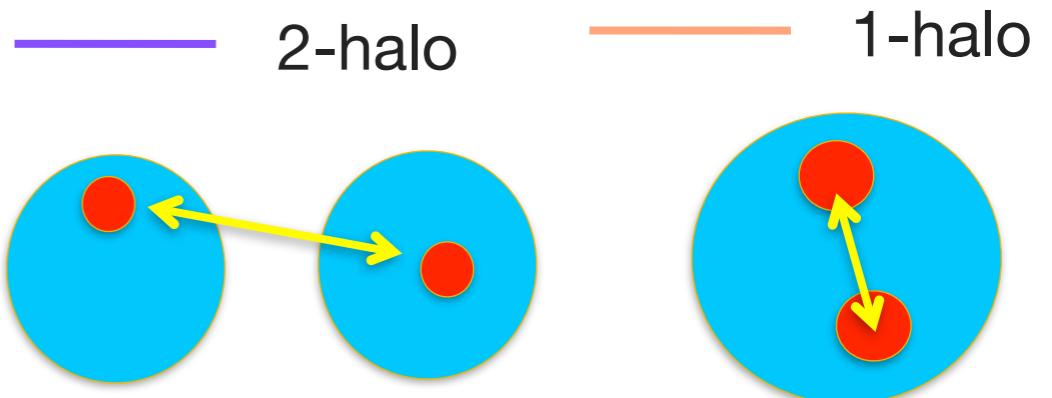
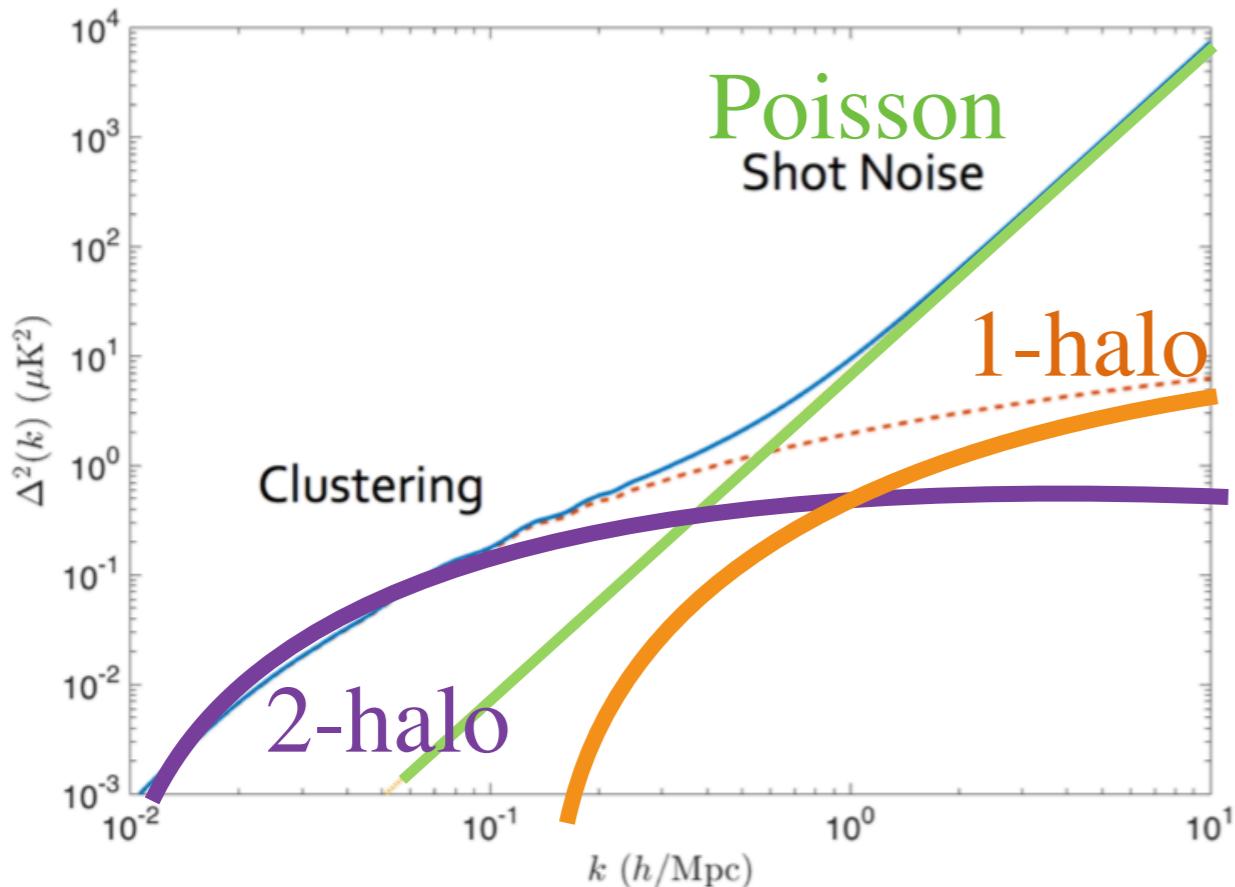
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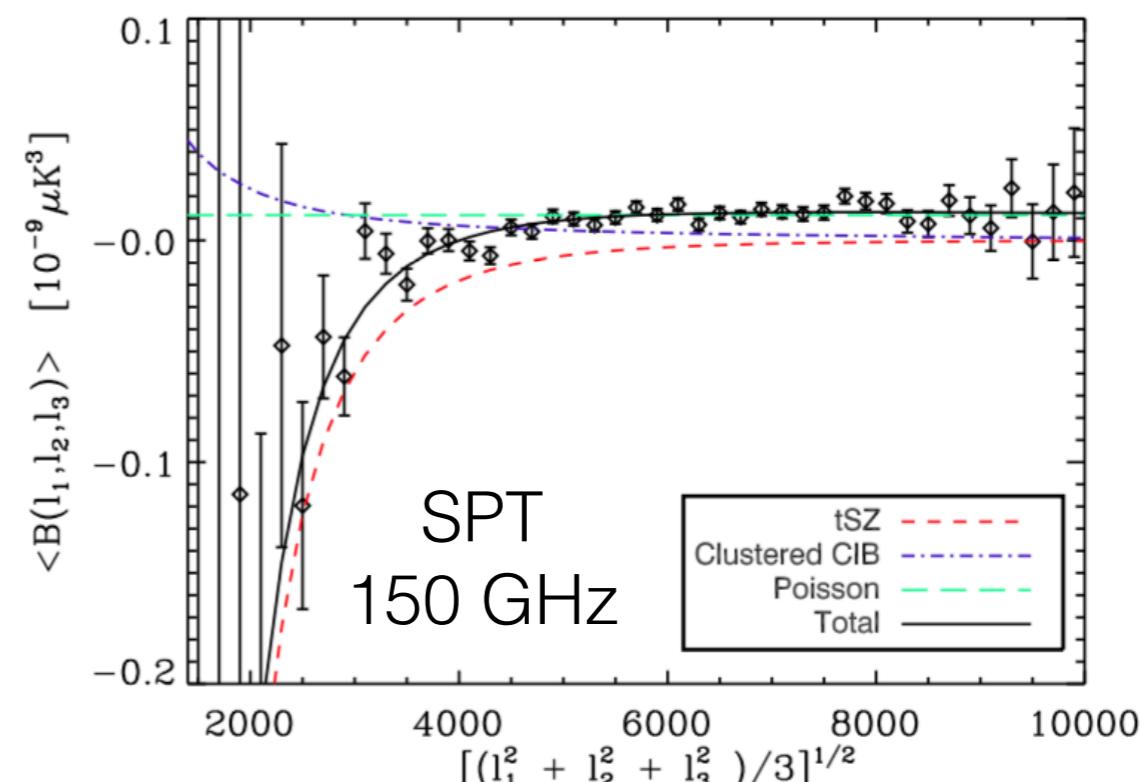
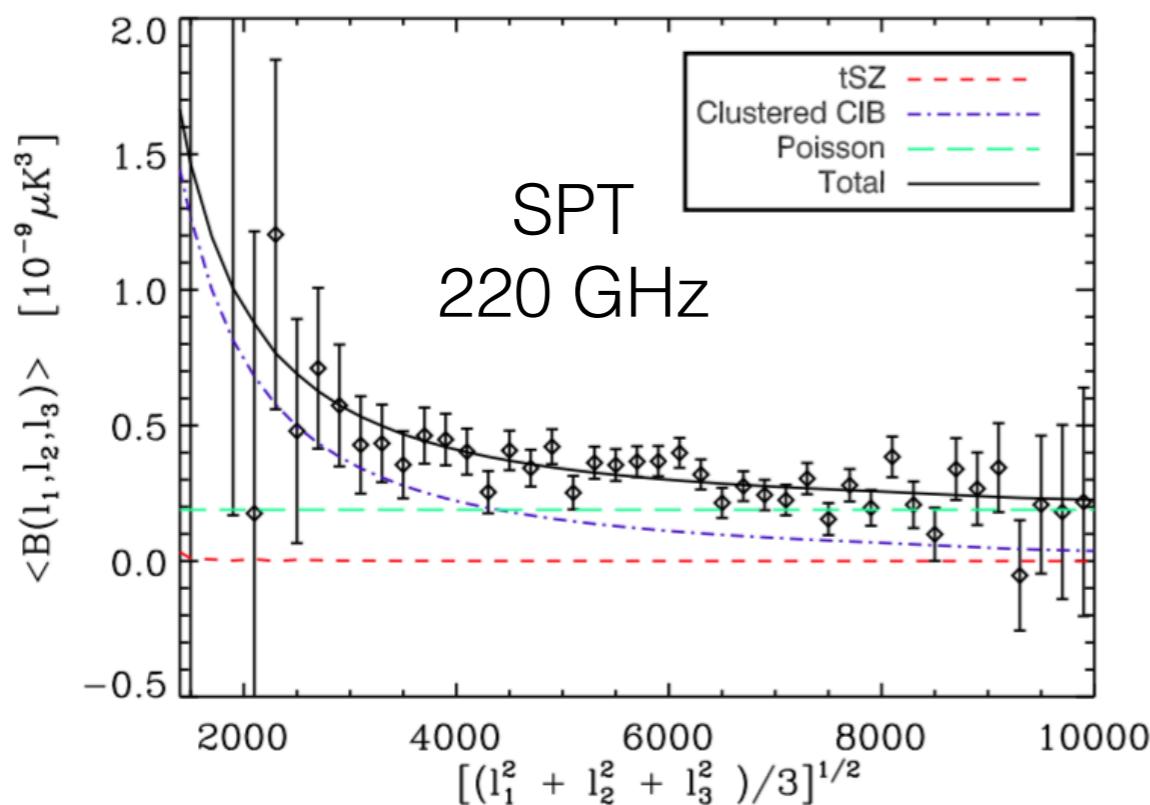
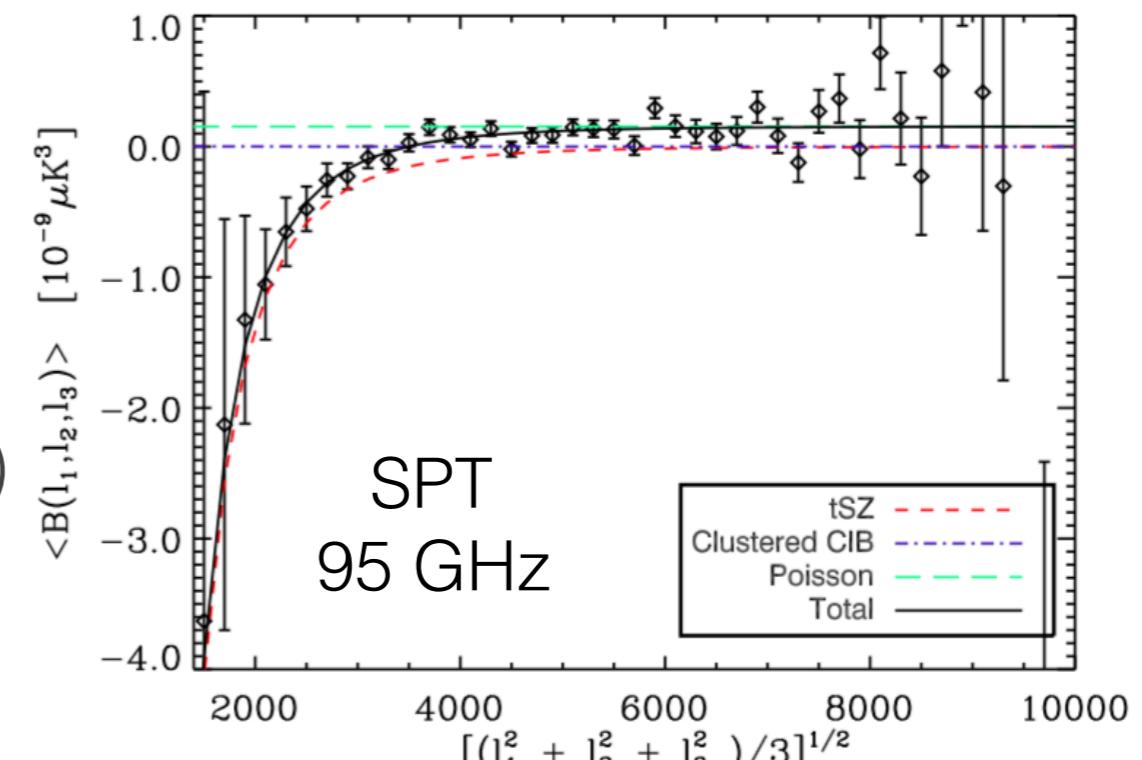


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- **N-point functions**

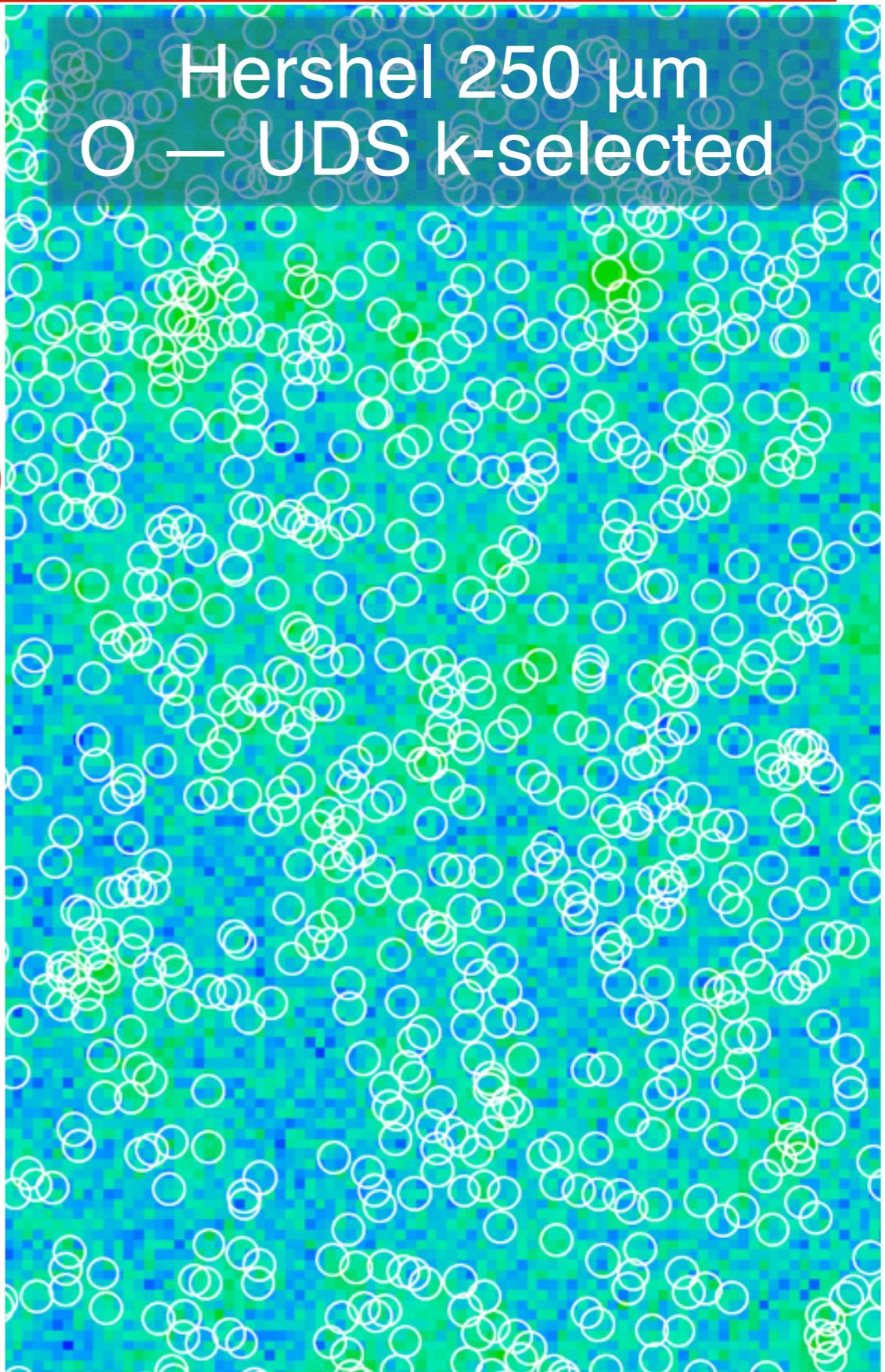
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Crawford et al. (2014)

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    - ▶ 3-point, i.e., bi-spectrum (skewness)
  - Stacking (i.e, Covariance with Catalogs)
    - ▶ Thumbnail (2-pt function catalog-pixels)



# Embracing Statistical Methods

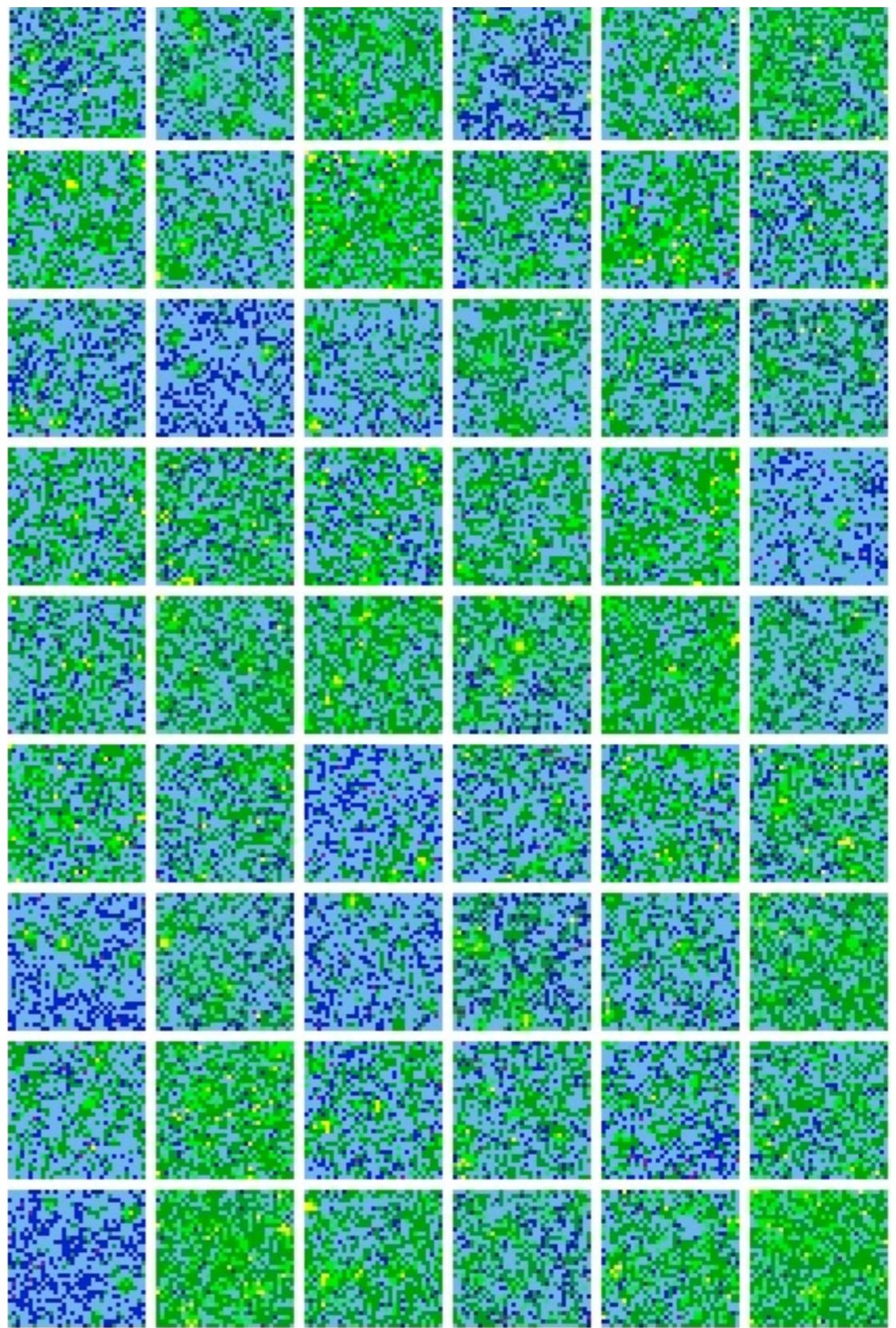
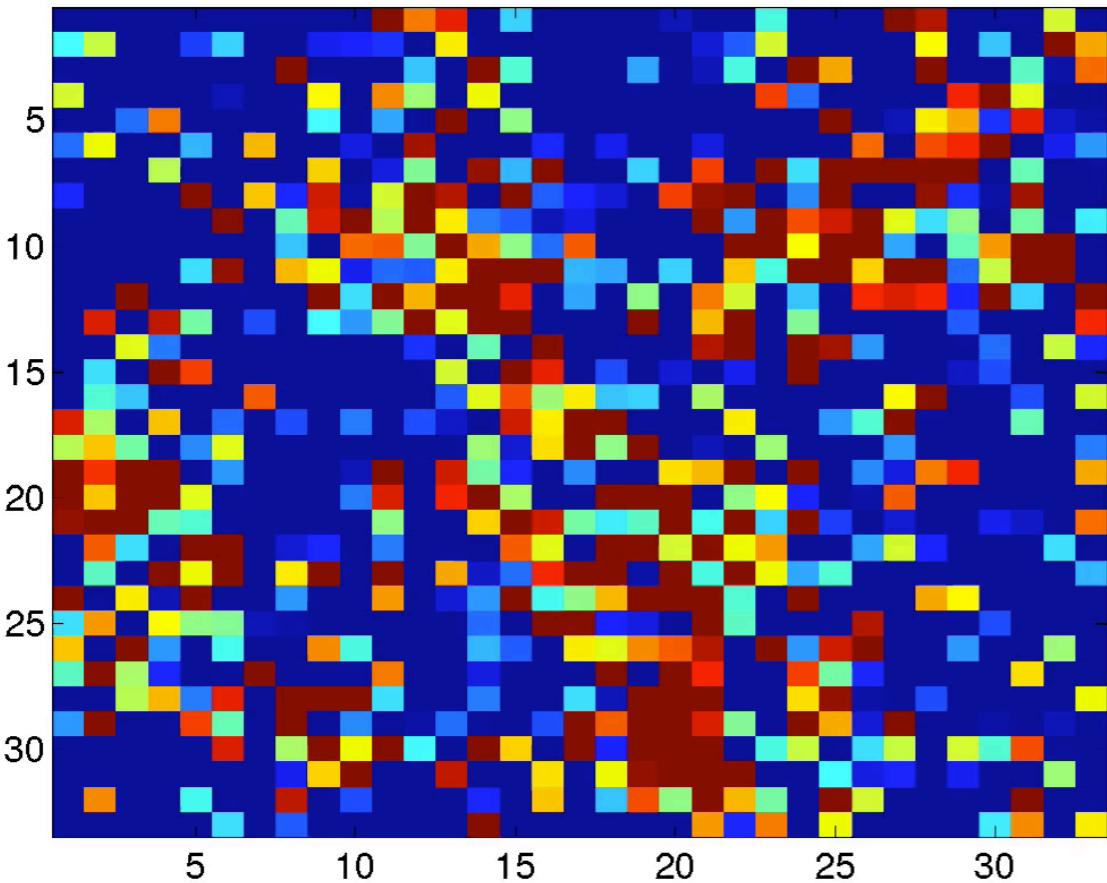
- Statistical Methods Include:

- N-point functions

- ▶ 1-point, i.e., the histogram/ $P(D)$
  - ▶ 2-point, i.e., the power spectrum
  - ▶ 3-point, i.e., bi-spectrum (skewness)

- Stacking (i.e. Covariance with Catalogs)

- ▶ Thumbnail (2-pt function catalog-pixels)



# Embracing Statistical Methods

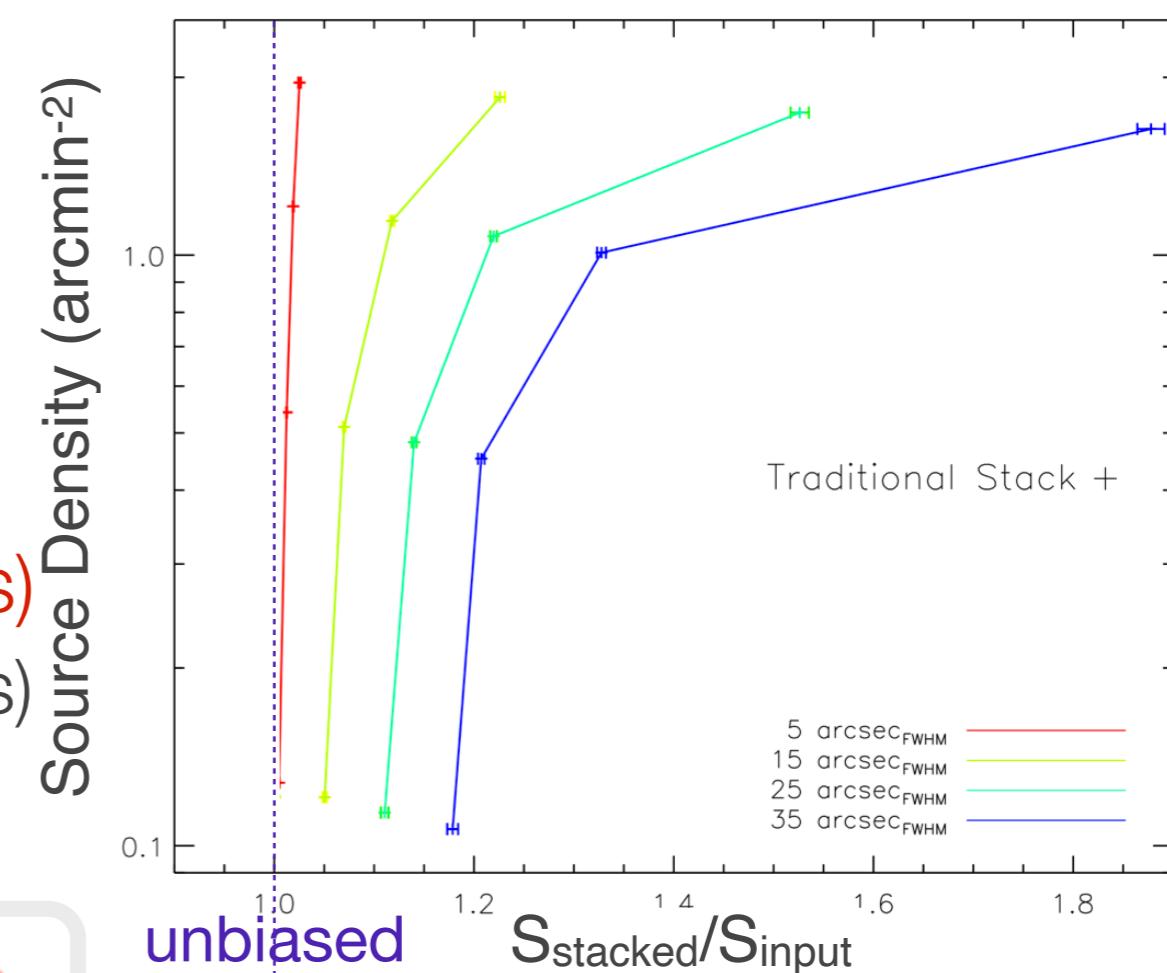
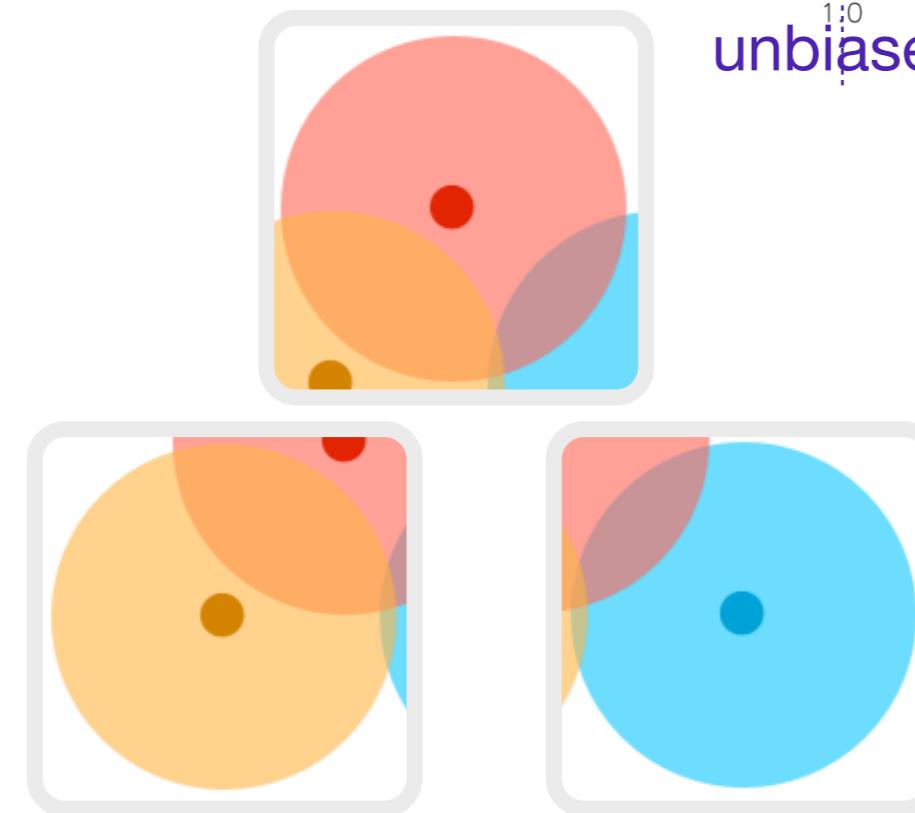
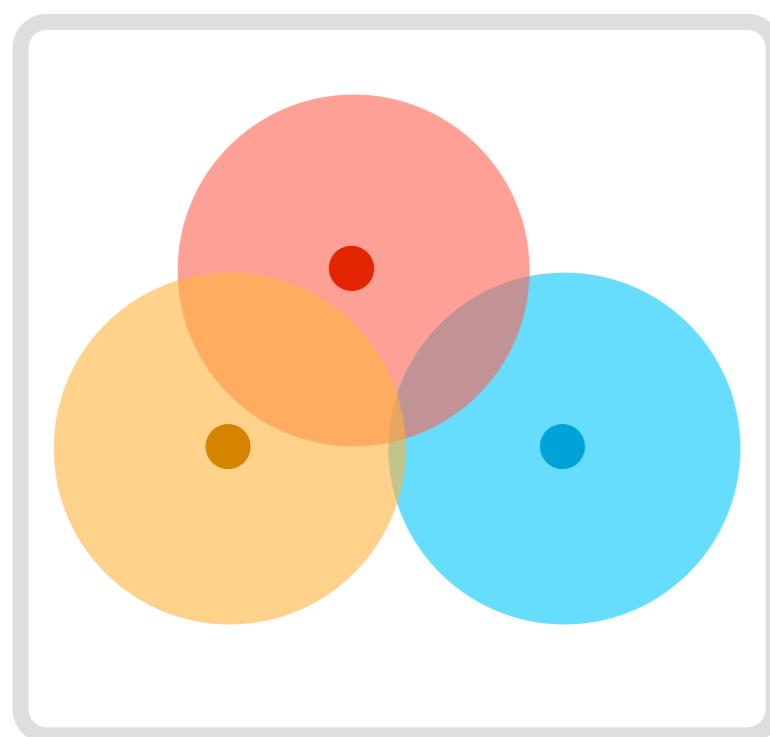
- Statistical Methods Include:

- N-point functions

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  - ▶ 2-point, i.e., the power spectrum
  - ▶ 3-point, i.e., bi-spectrum (skewness)

- Stacking (i.e. Covariance with Catalogs)

- ▶ Thumbnail (2-pt function catalog-pixels)



Traditional Stack +

5 arcsec<sub>FWHM</sub>  
15 arcsec<sub>FWHM</sub>  
25 arcsec<sub>FWHM</sub>  
35 arcsec<sub>FWHM</sub>

# Embracing Statistical Methods

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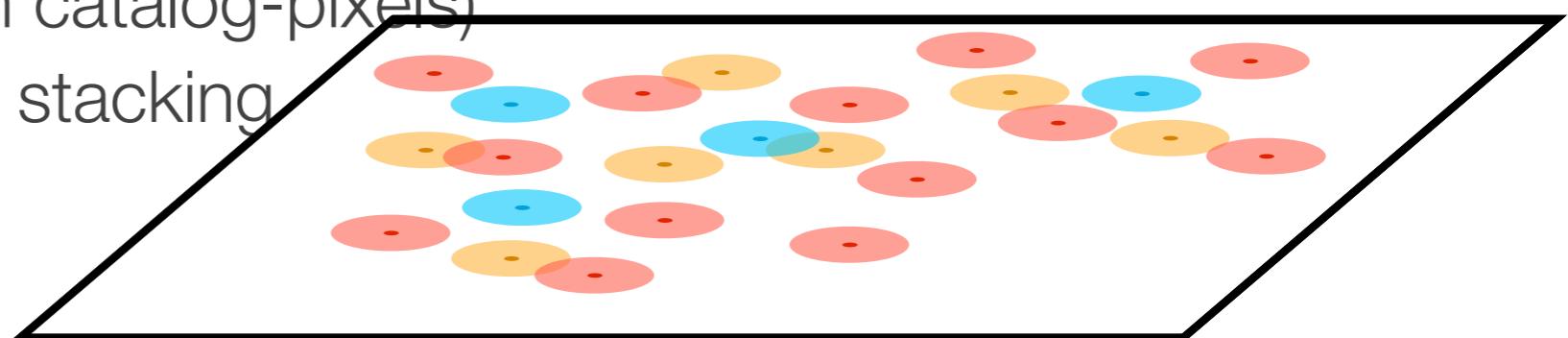
- Statistical Methods Include:

- N-point functions

- ▶ 1-point, i.e., the histogram/ $P(D)$
  - ▶ 2-point, i.e., the power spectrum
  - ▶ 3-point, i.e., bi-spectrum (skewness)

- Stacking (i.e. Covariance with Catalogs)

- ▶ Thumbnail (2-pt function catalog-pixels)
  - ▶ SIMSTACK – unbiased stacking algorithm



Viero et al. 2013b – arXiv:1304.0446

# Embracing Statistical Methods

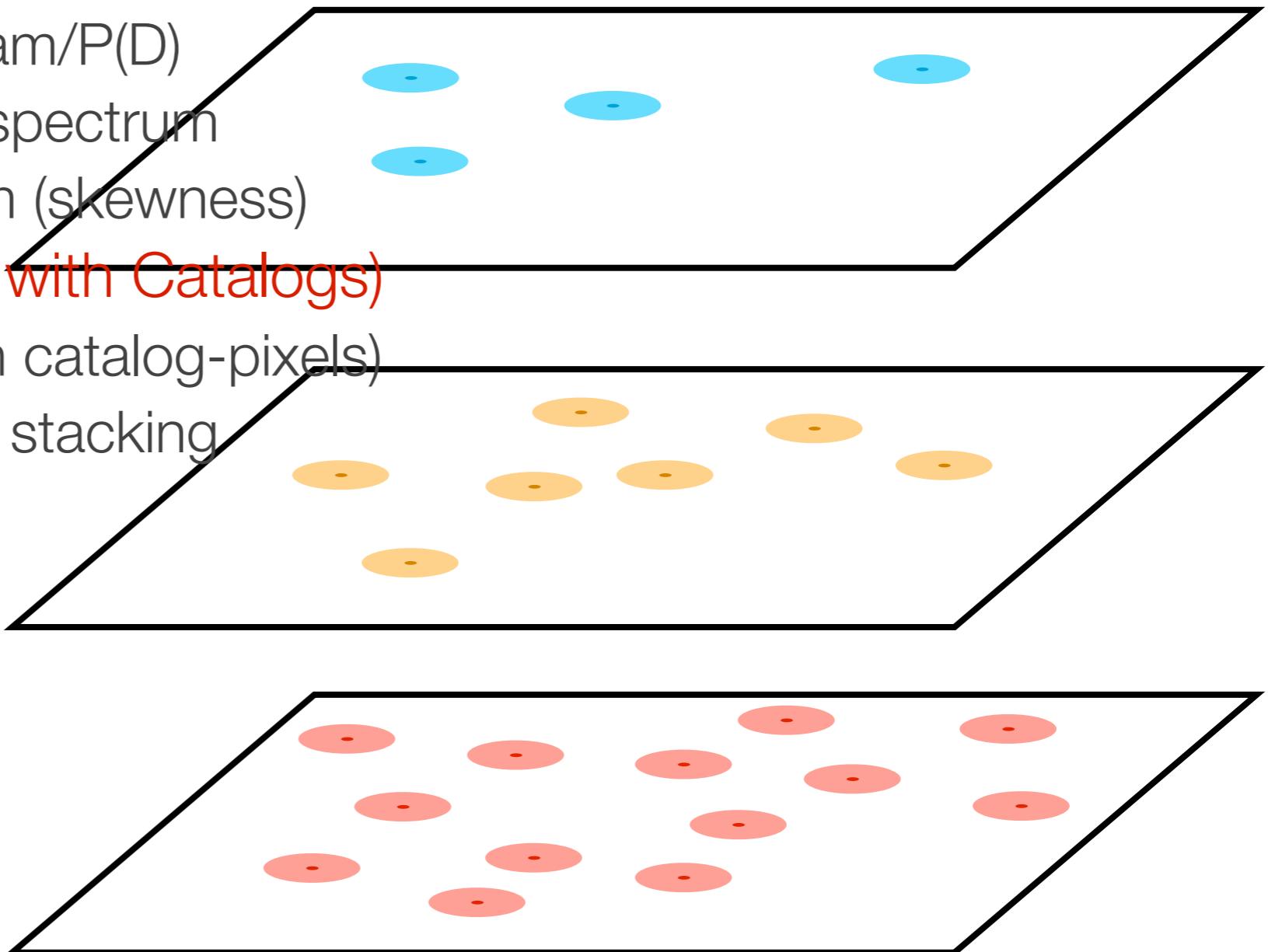
- Statistical Methods Include:

- N-point functions

- ▶ 1-point, i.e., the histogram/ $P(D)$
  - ▶ 2-point, i.e., the power spectrum
  - ▶ 3-point, i.e., bi-spectrum (skewness)

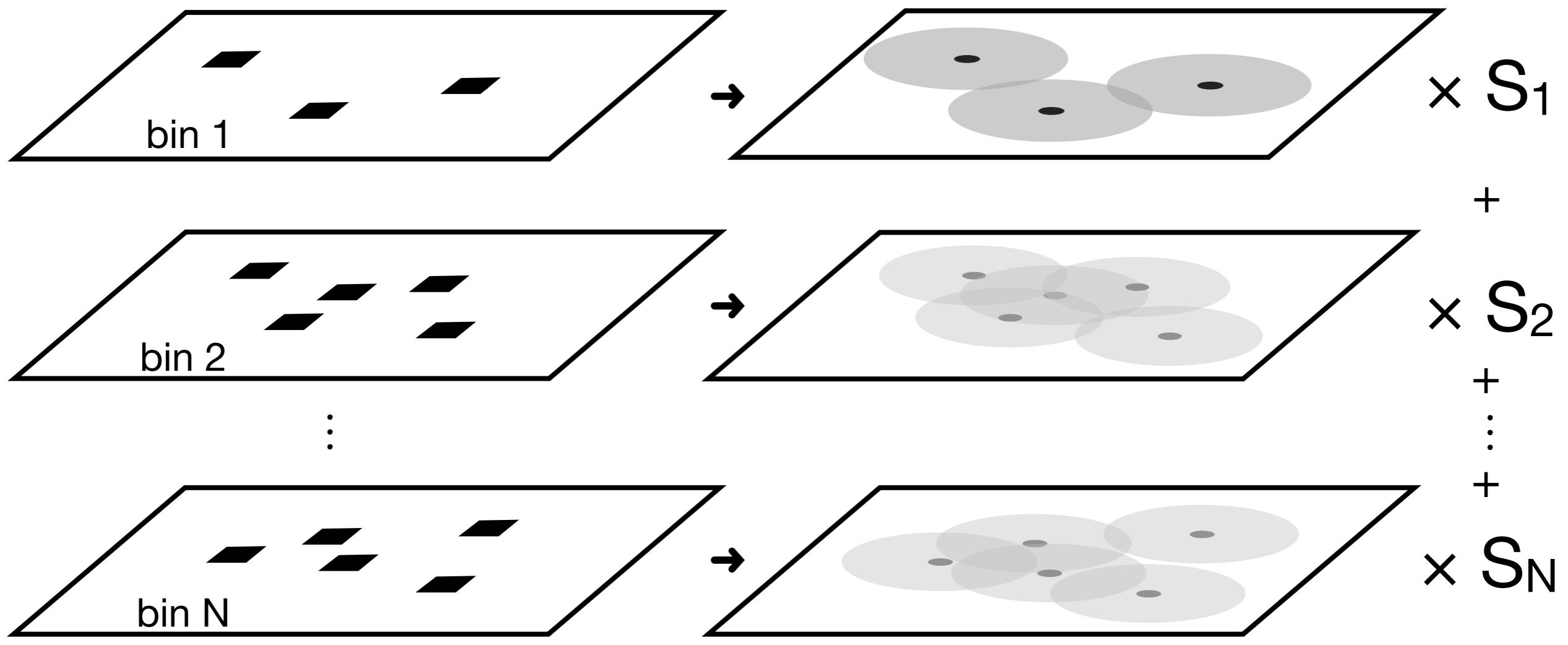
- Stacking (i.e. Covariance with Catalogs)

- ▶ Thumbnail (2-pt function catalog-pixels)
  - ▶ SIMSTACK – unbiased stacking algorithm

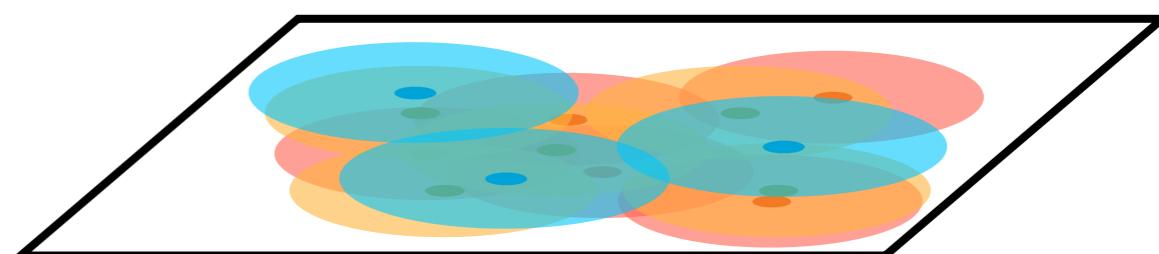


Viero et al. 2013b – arXiv:1304.0446

# SIMSTACK – Unbiased Stacking Algorithm



Formalism  
developed w/  
Lorenzo Moncelsi  
(Caltech)

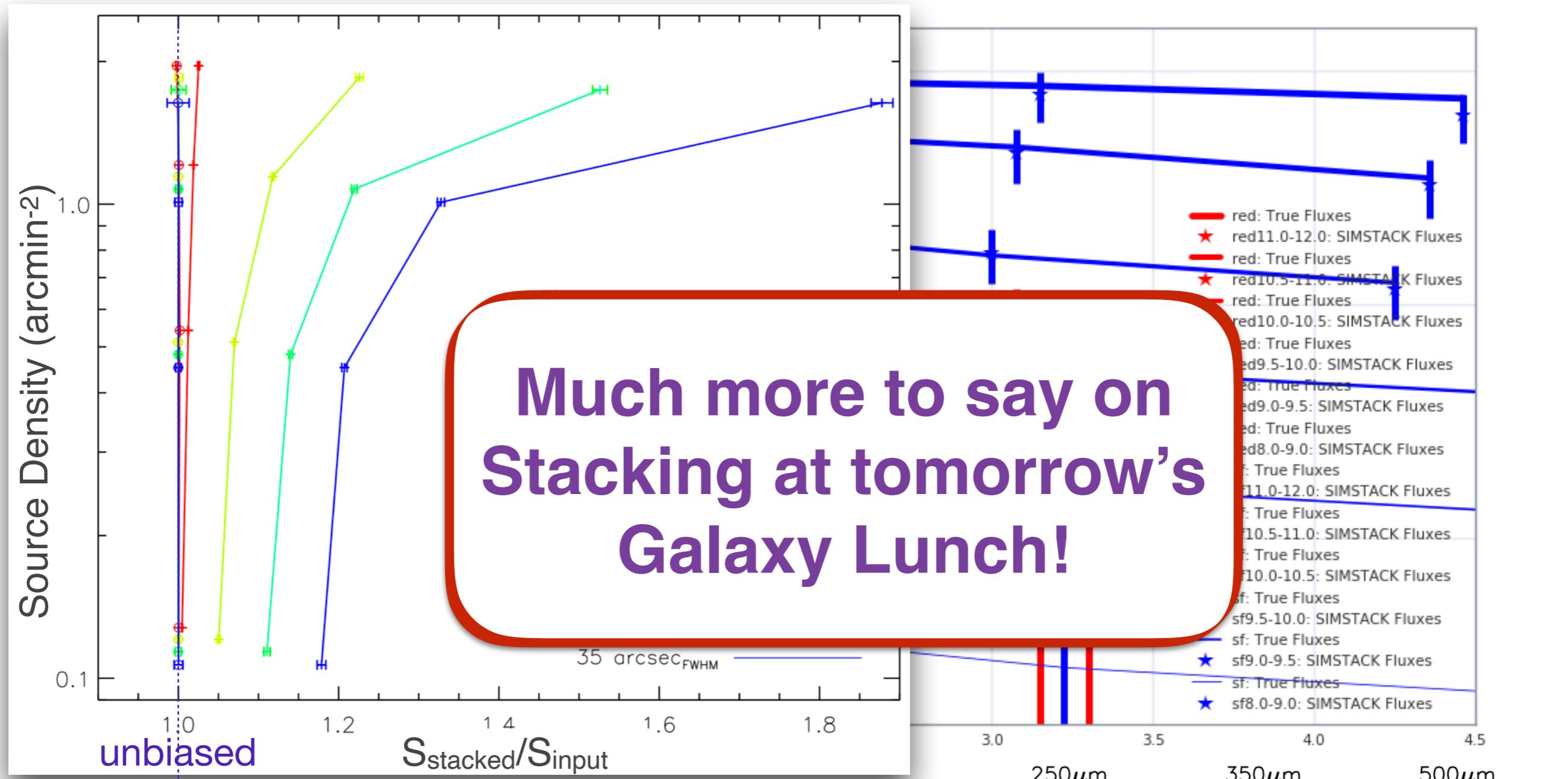


sky  
map

Viero et al. 2013b – [arXiv:1304.0446](https://arxiv.org/abs/1304.0446)

Python Code at <https://github.com/marcoviero/simstack>

# Embracing Statistical Methods



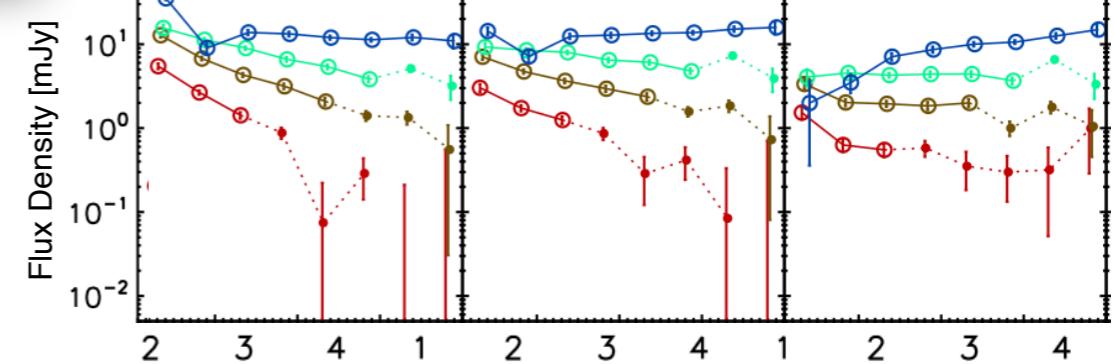
Viero et al. 2013b – arXiv:1304.0446

Simulations made using SIDES model

Bethermin et al. 2017 – arXiv:1703.08795

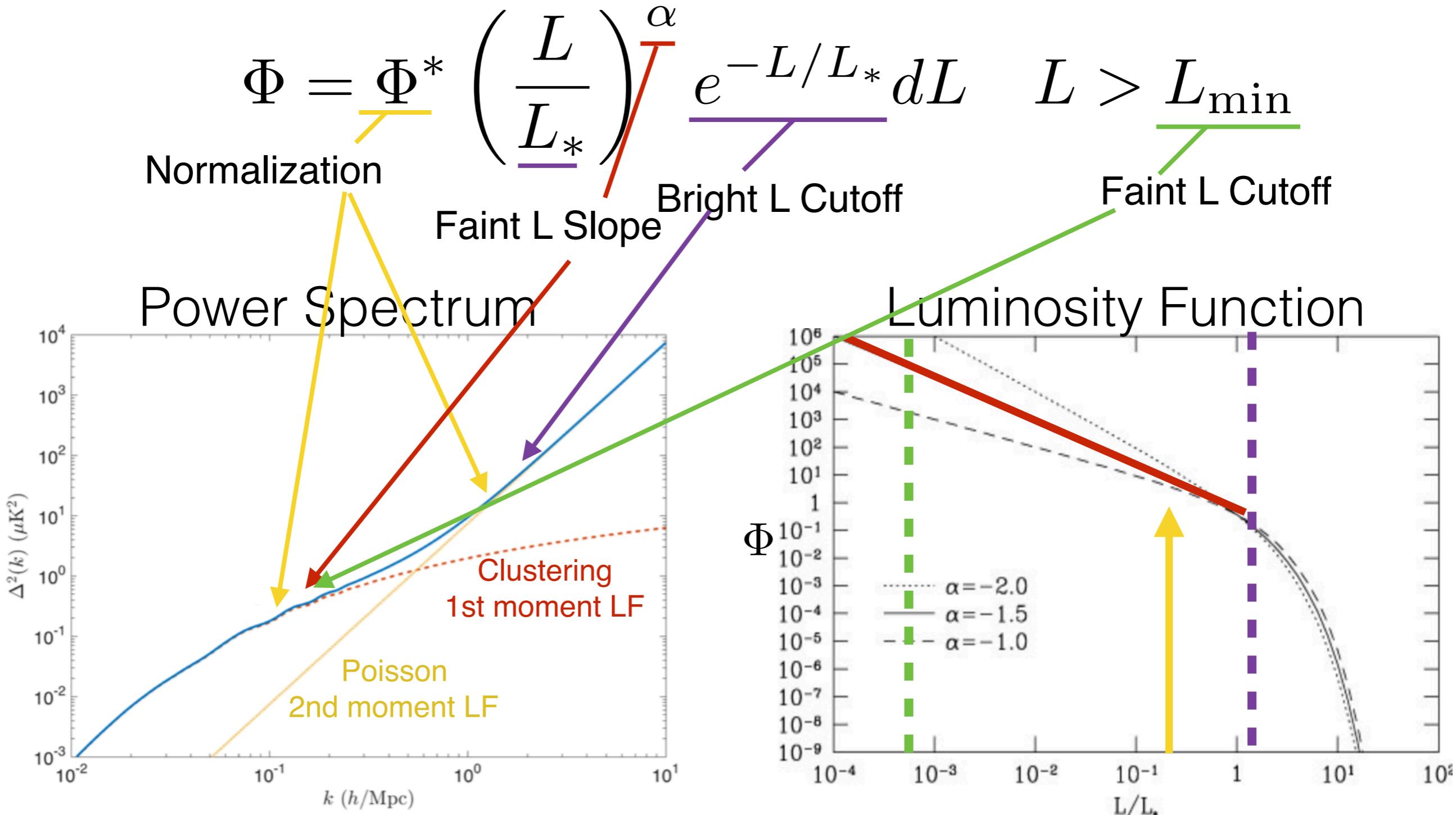
**SIMSTACK code publicly available**

<https://github.com/marcoviero/simstack>



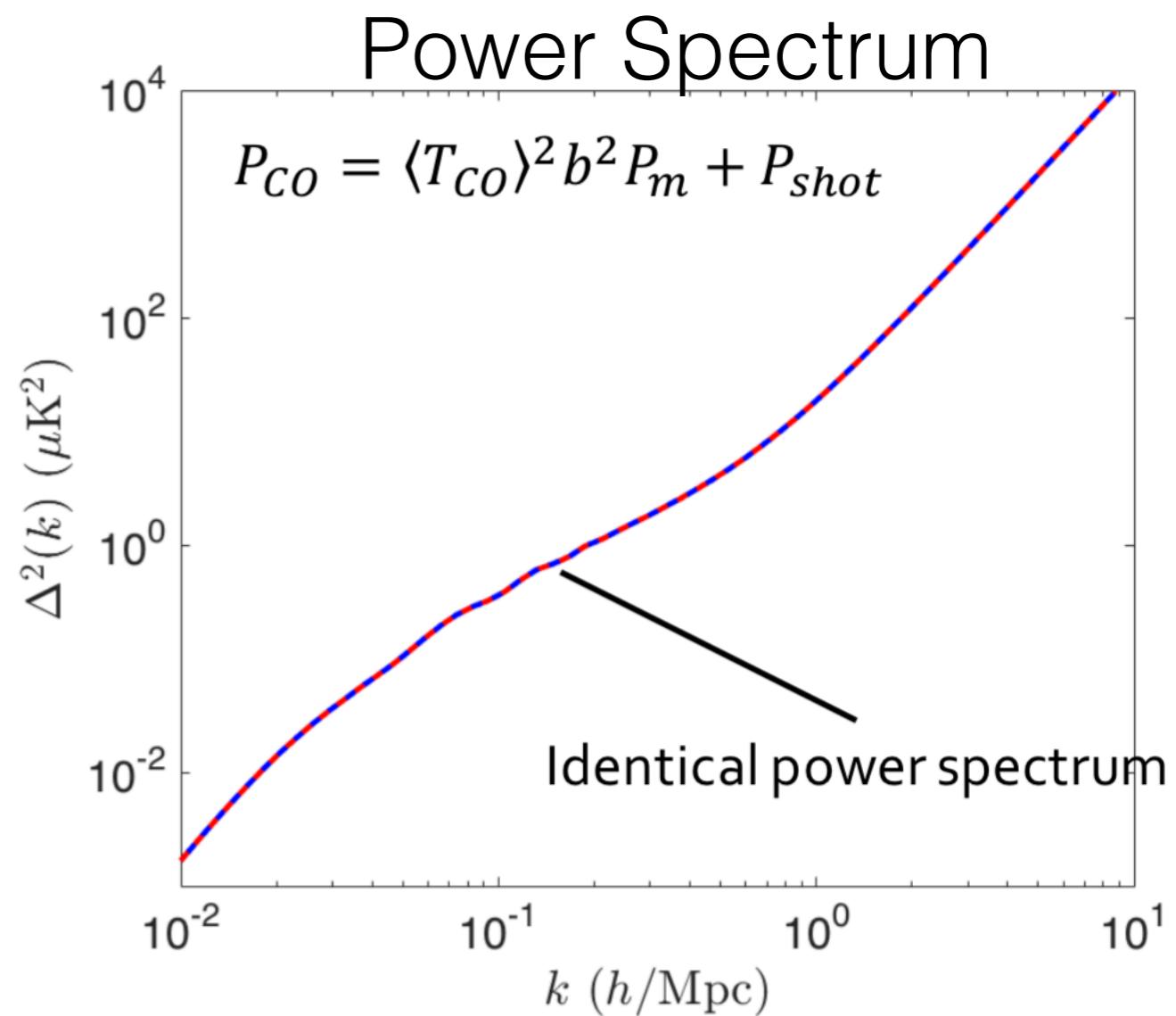
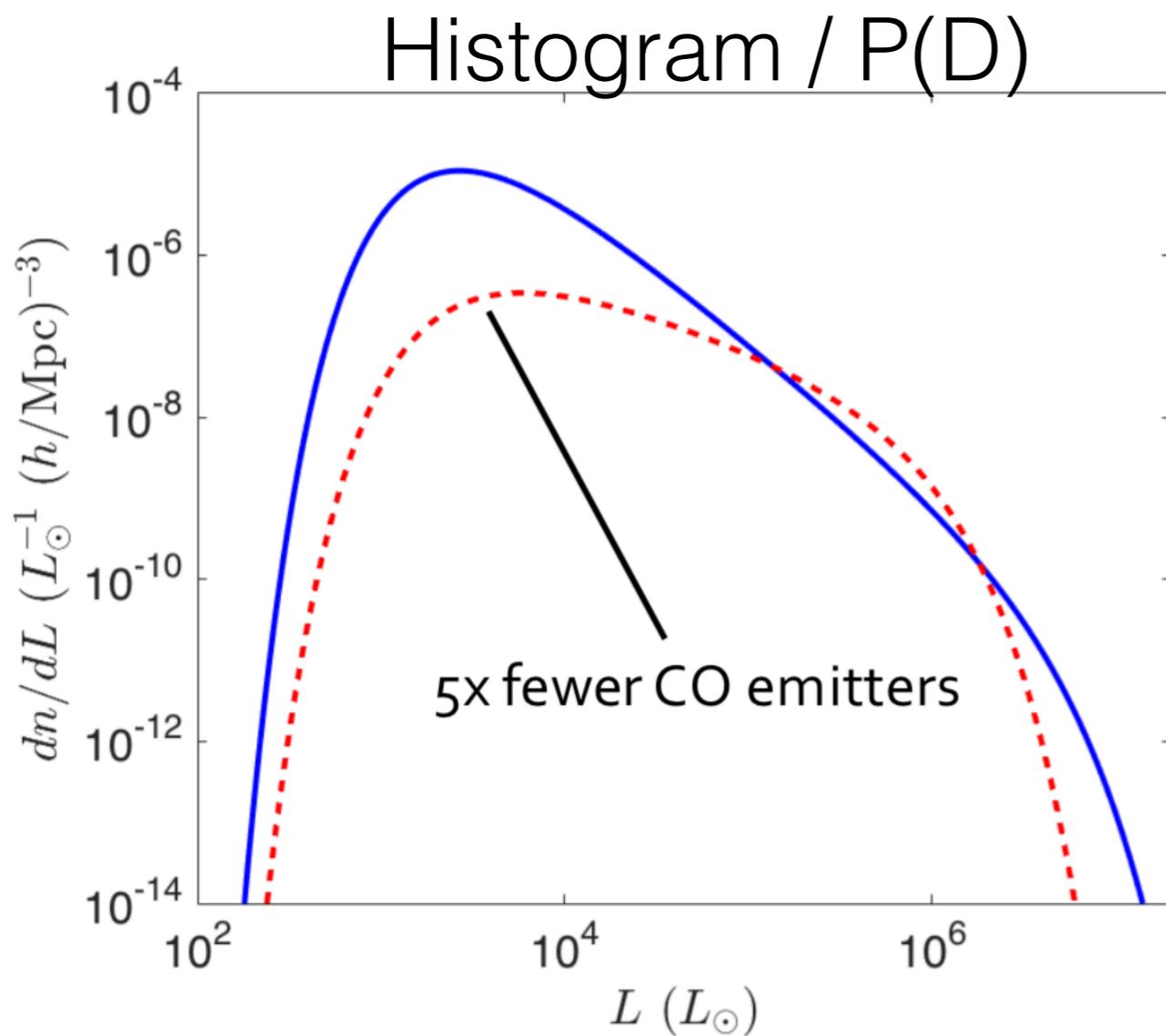
# Embracing Statistical Methods

- Statistically-based Measurements Map to Physical Distributions
  - e.g., the Power Spectrum to the Luminosity Function as:



# Embracing Statistical Methods

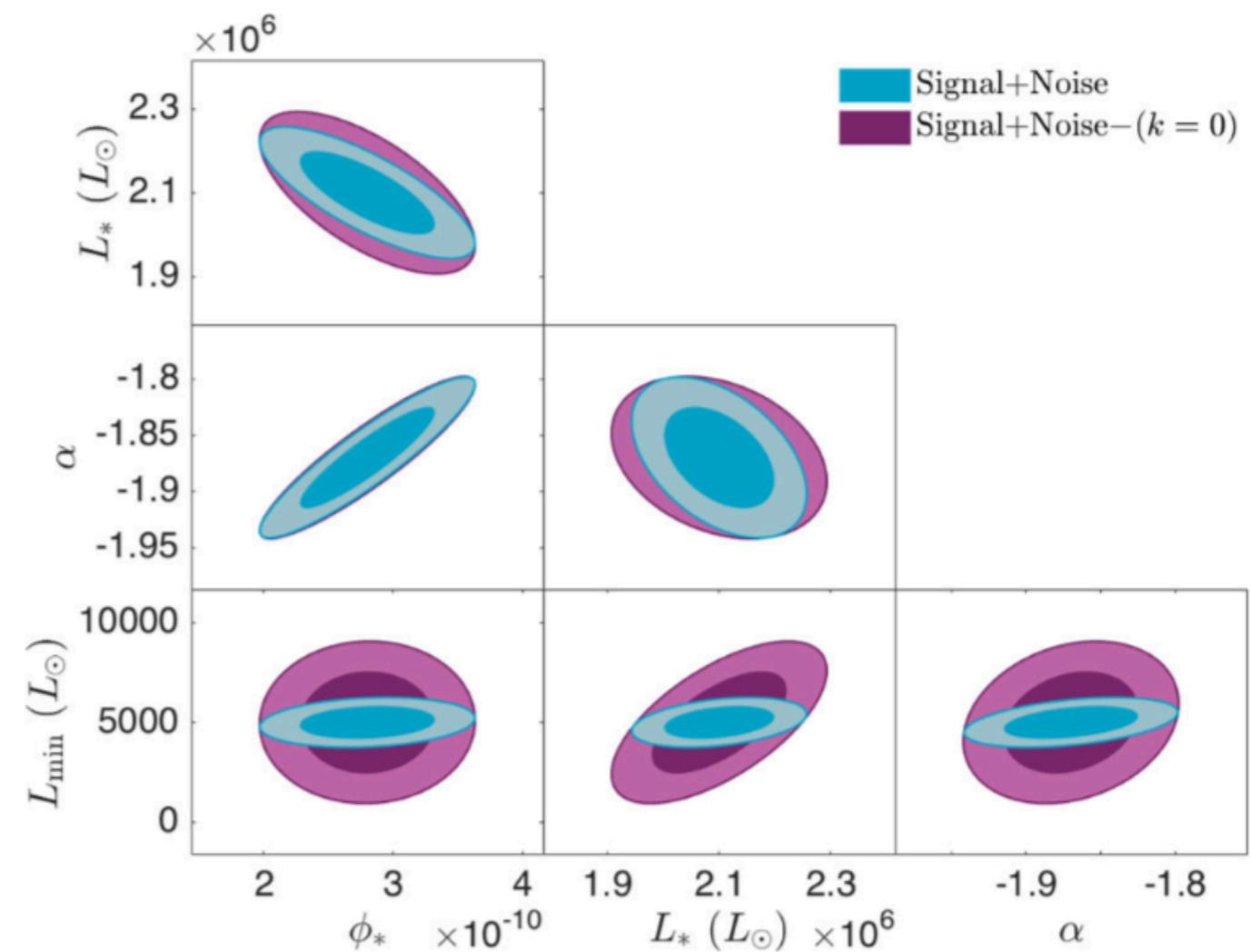
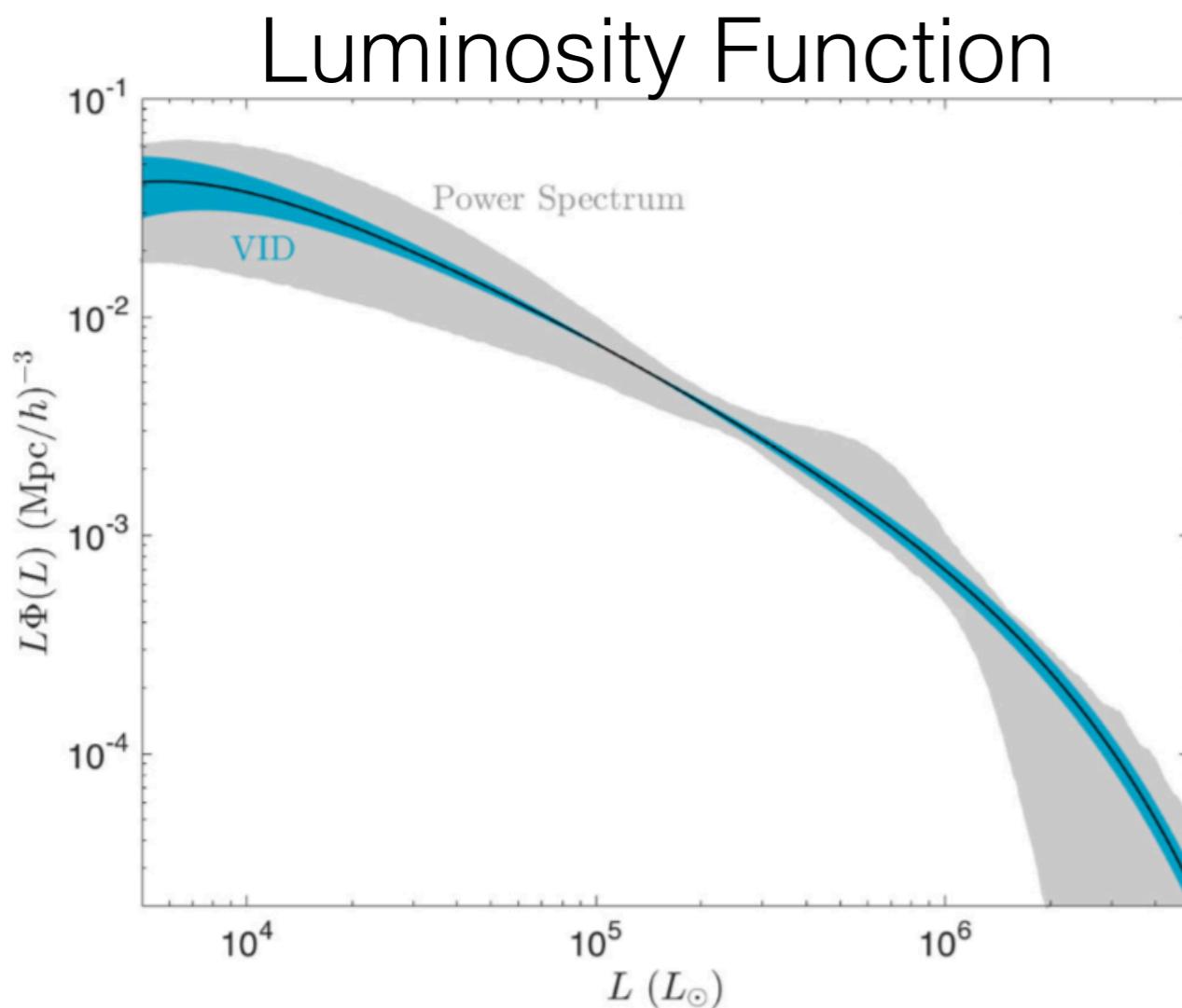
- Statistically-based Measurements Map to Physical Distributions
  - e.g.,  $P(D)$ :



Breysse et al. 2017 – [arXiv:1609.01728](https://arxiv.org/abs/1609.01728)

# Embracing Statistical Methods

- Statistically-based Measurements Map to Physical Distributions
  - e.g.,  $P(D)$ , also known as Voxel Intensity Distribution (VID):

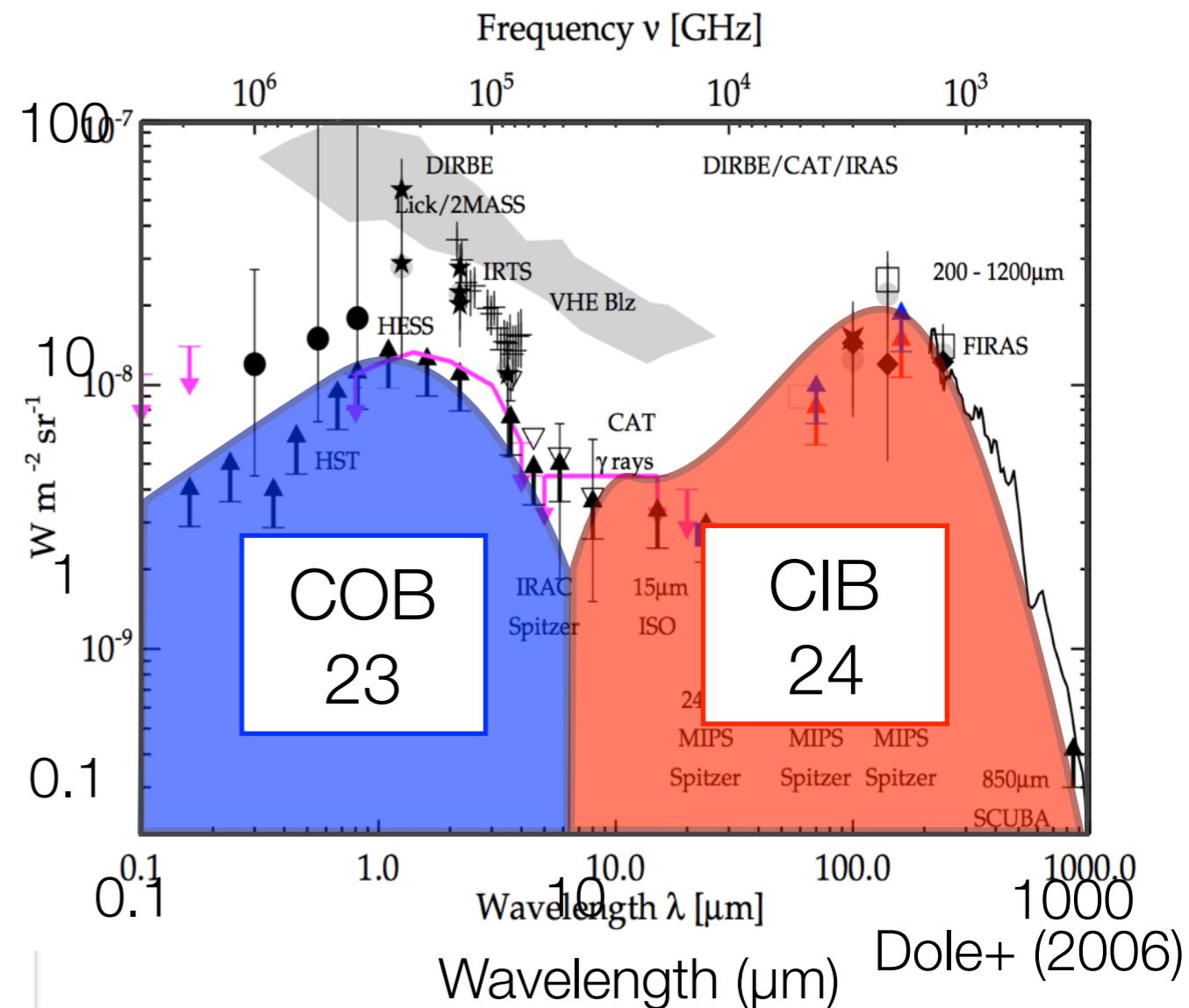


Breysse et al. 2017 – arXiv:1609.01728

# Statistical Methods & CIB: A Success Story

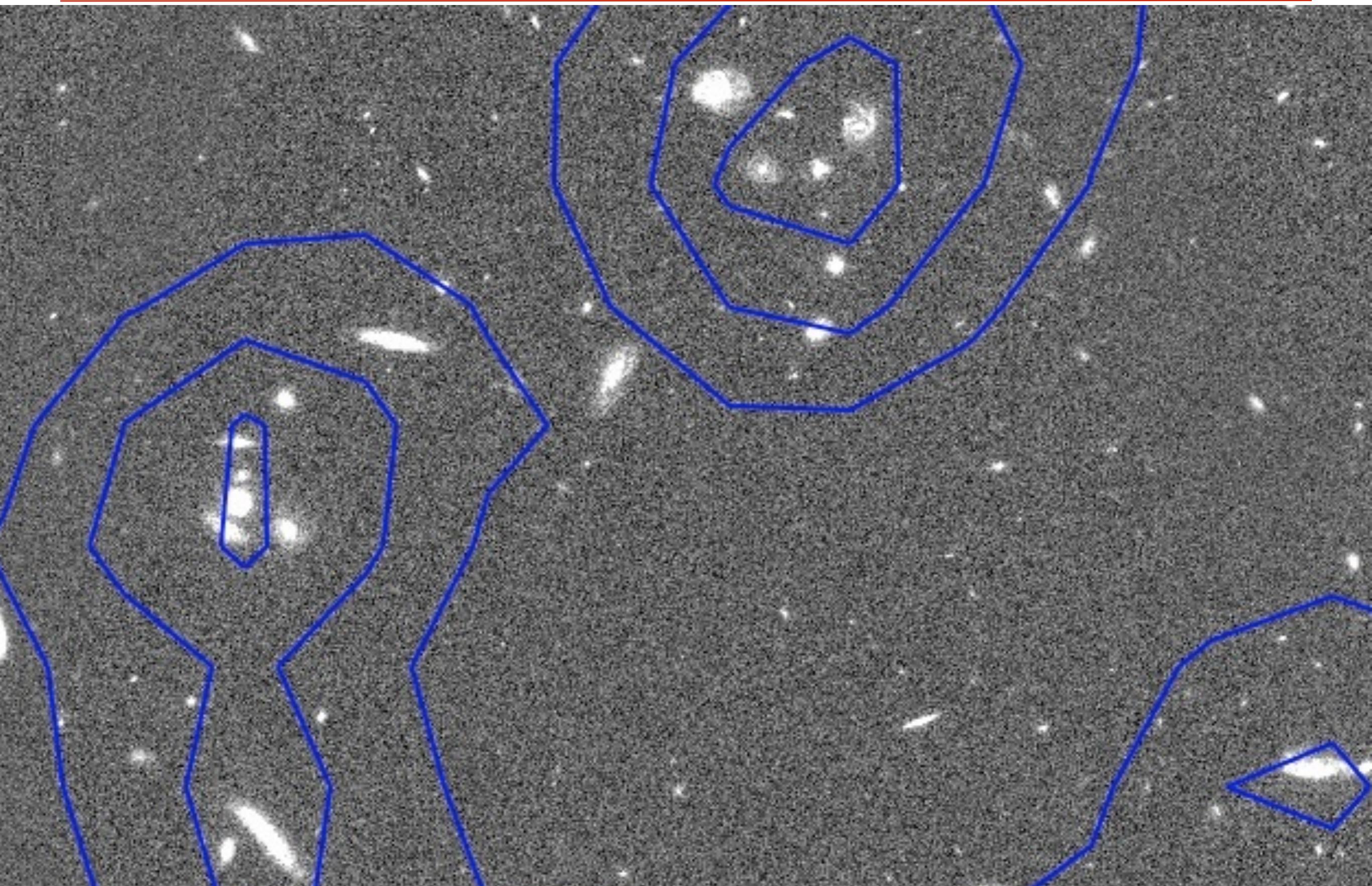
- CIB provides potential blueprint for line-intensity mapping.
- Keys to CIB progress:
  - Technology and better data.
  - Statistical Techniques.
  - Modeling.

• Cosmic Infrared Background (CIB;  $\lambda = 8\text{-}1000 \mu\text{m}$ ) contains energy similar to UV/Optical/Near-infrared background.



# Challenge: Source Confusion

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# Statistical Methods & CIB: A Success Story

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## SPECTRUM AND ANISOTROPY OF THE COSMIC INFRARED BACKGROUND

J. R. BOND<sup>1</sup>

Physics Department, Stanford University; and Institute for Theoretical Physics, University of California–Santa Barbara

B. J. CARR

Institute for Theoretical Physics, University of California–Santa Barbara; Queen Mary College, London University; and Astrophysics Group, Fermilab

AND

C. J. HOGAN

- Measuring the power spectrum of the CIB was first proposed by Bond, Carr, & Hogan (1984)
- The CIB was first detected with FIRAS on COBE, in papers by Puget et al. (1998) and Fixsen et al. (1998)

*Letter to the Editor*

## Tentative detection of a cosmic far-infrared background with COBE

J.-L. Puget<sup>1</sup>, A. Abergel<sup>1</sup>, J.-P. Bernard<sup>1</sup>, F. Boulanger<sup>1</sup>, W.B. Burton<sup>2</sup>, F.-X. Désert<sup>1</sup>, and D. Hartmann<sup>2,3</sup>

<sup>1</sup> Institut d'Astrophysique Spatiale, Bât. 121, Université Paris XI, F-91405 Orsay Cedex France (puget@ias.fr)

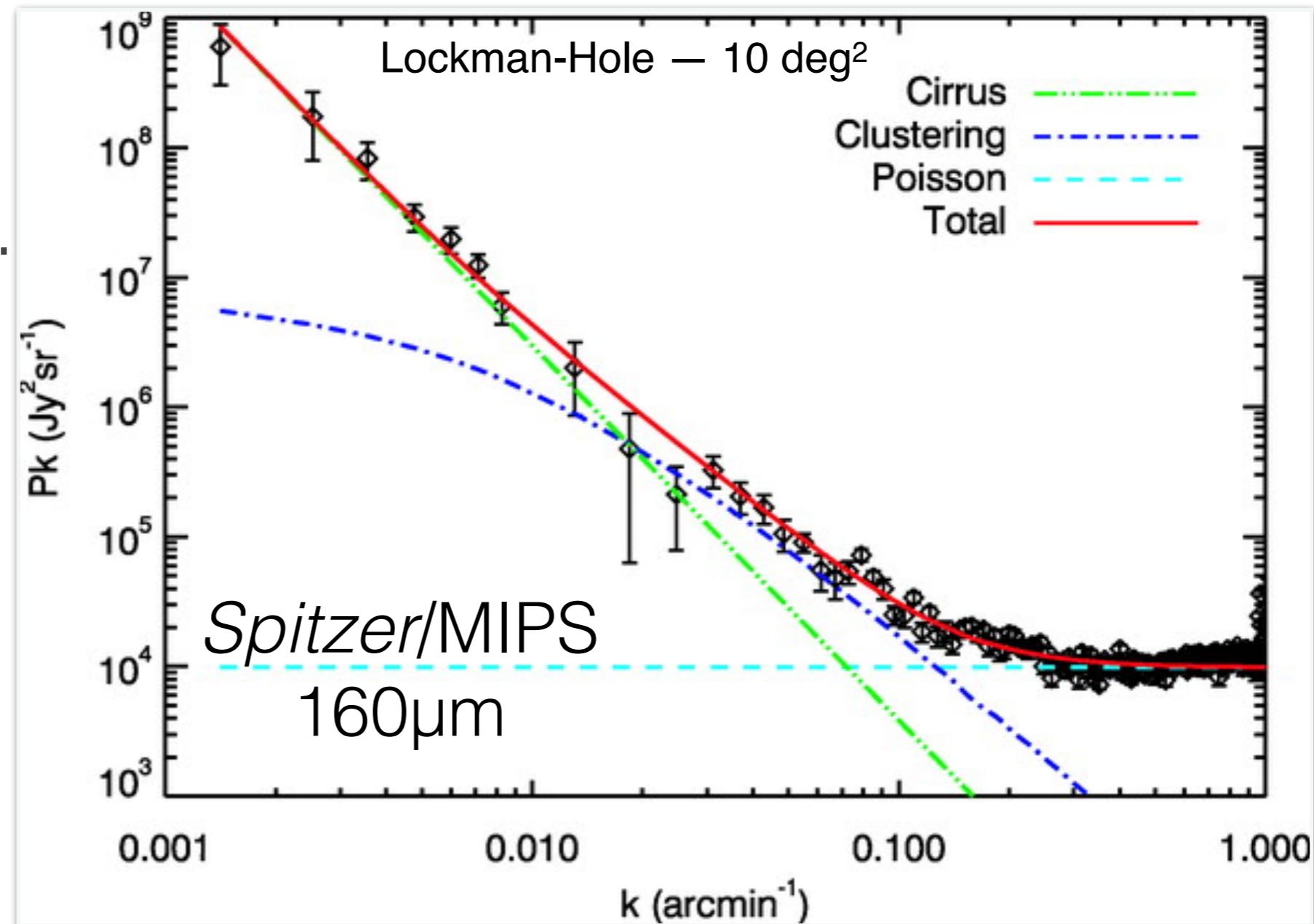
<sup>2</sup> Sterrewacht Leiden, Postbox 9503, 2300 RA Leiden, The Netherlands

<sup>3</sup> Harvard-Smithsonian Center for Astrophysics, 60 Garden St., Cambridge, MA 02138, USA

Received 4 August 1995 / Accepted 12 December 1995

# Statistical Methods & CIB: A Success Story

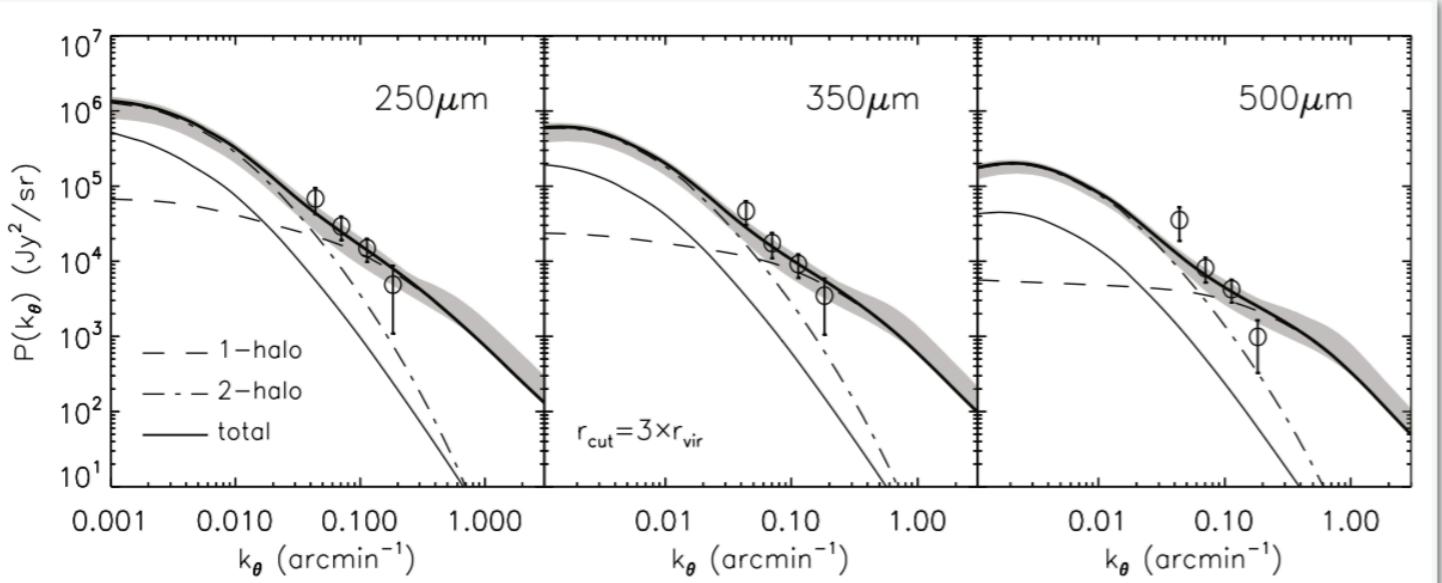
- First detection of the CIB power spectrum *Spitzer/MIPS* 160 $\mu$ m.
- Key Finding  
→ bias = 1.74+0.16
- Galactic Cirrus dominates the low-ell signal.



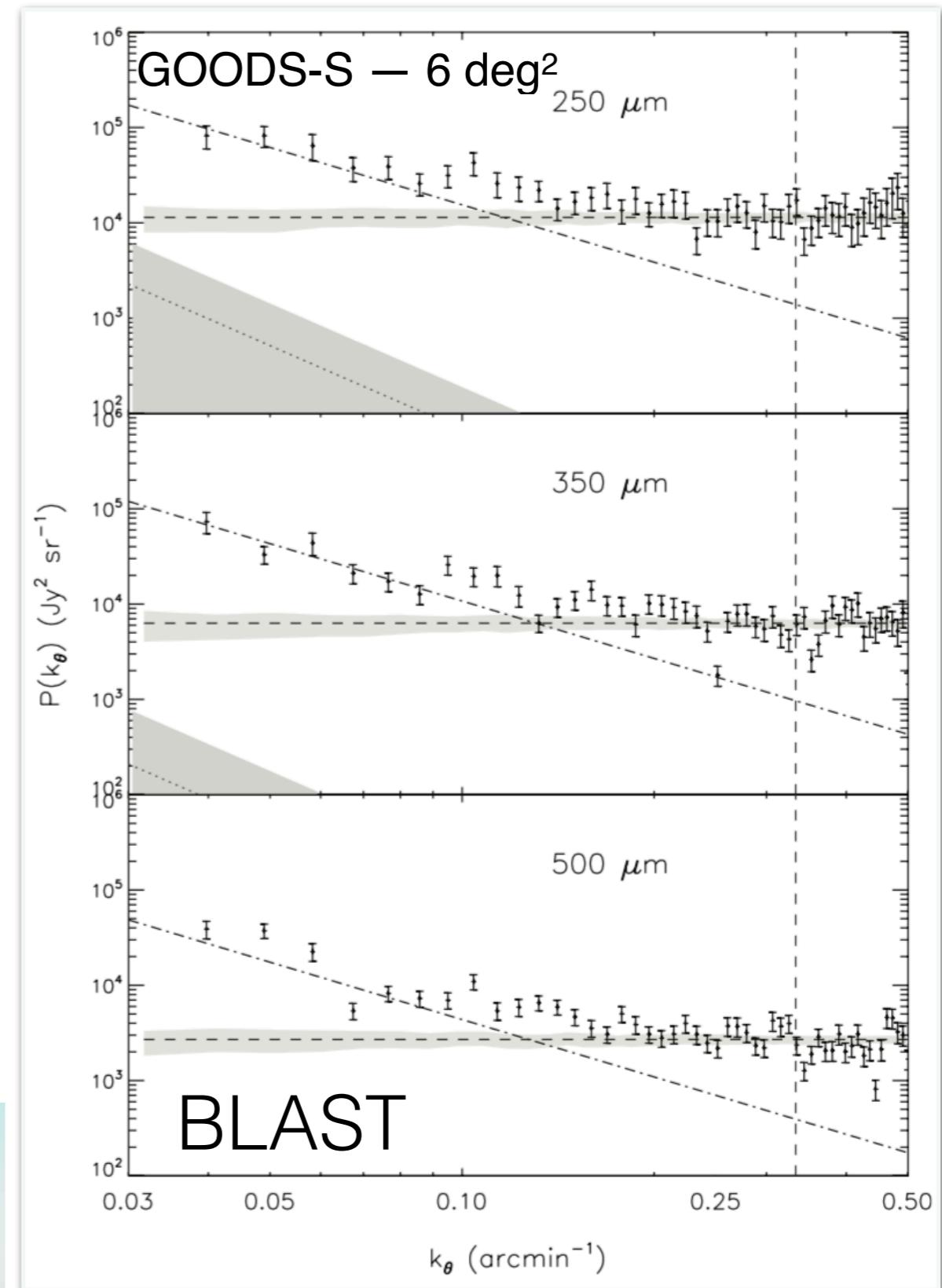
Lagache et al. (2007) — arXiv:0707.2443

# Statistical Methods & CIB: A Success Story

- **BLAST!** — balloon-based pathfinder to SPIRE on the *Herschel Space Observatory*
- Key Findings:
  - bias = 2.2-2.6
  - $\log(M_{\min}/M_{\odot}) = 11.5$
  - $\log(M_{\text{eff}}/M_{\odot}) = 12.8$

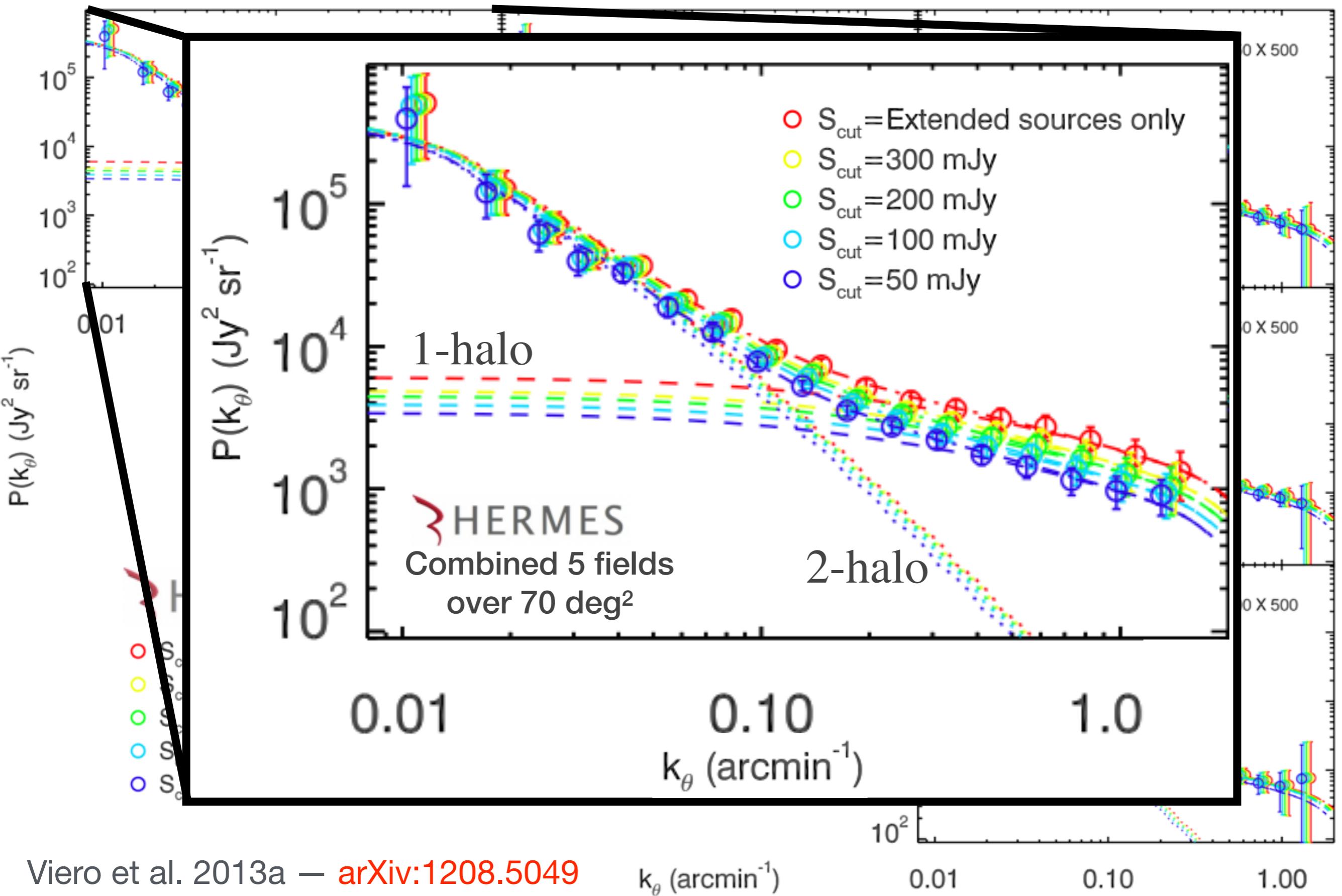


Halo Model: Mattia Negrello (Cardiff)



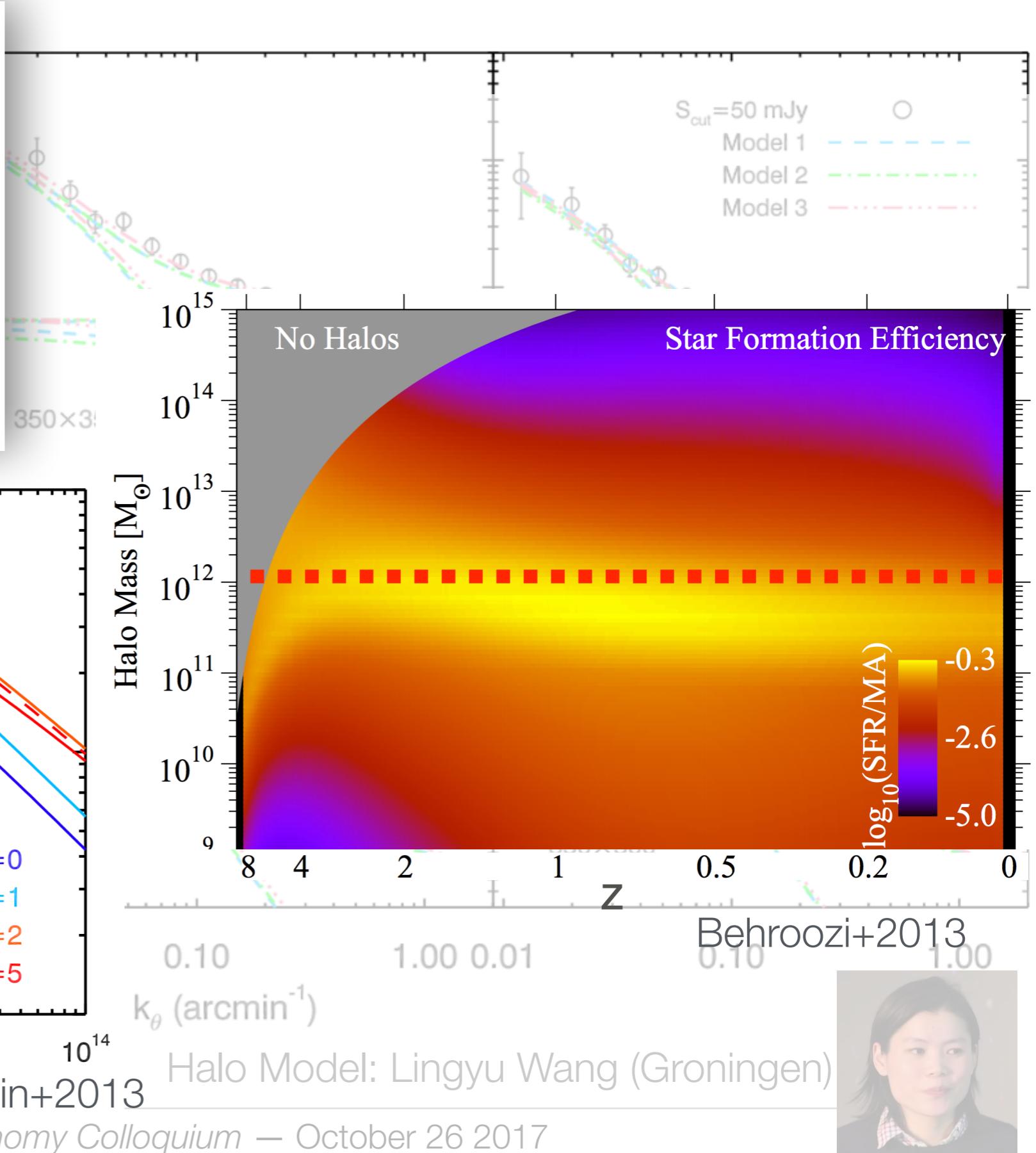
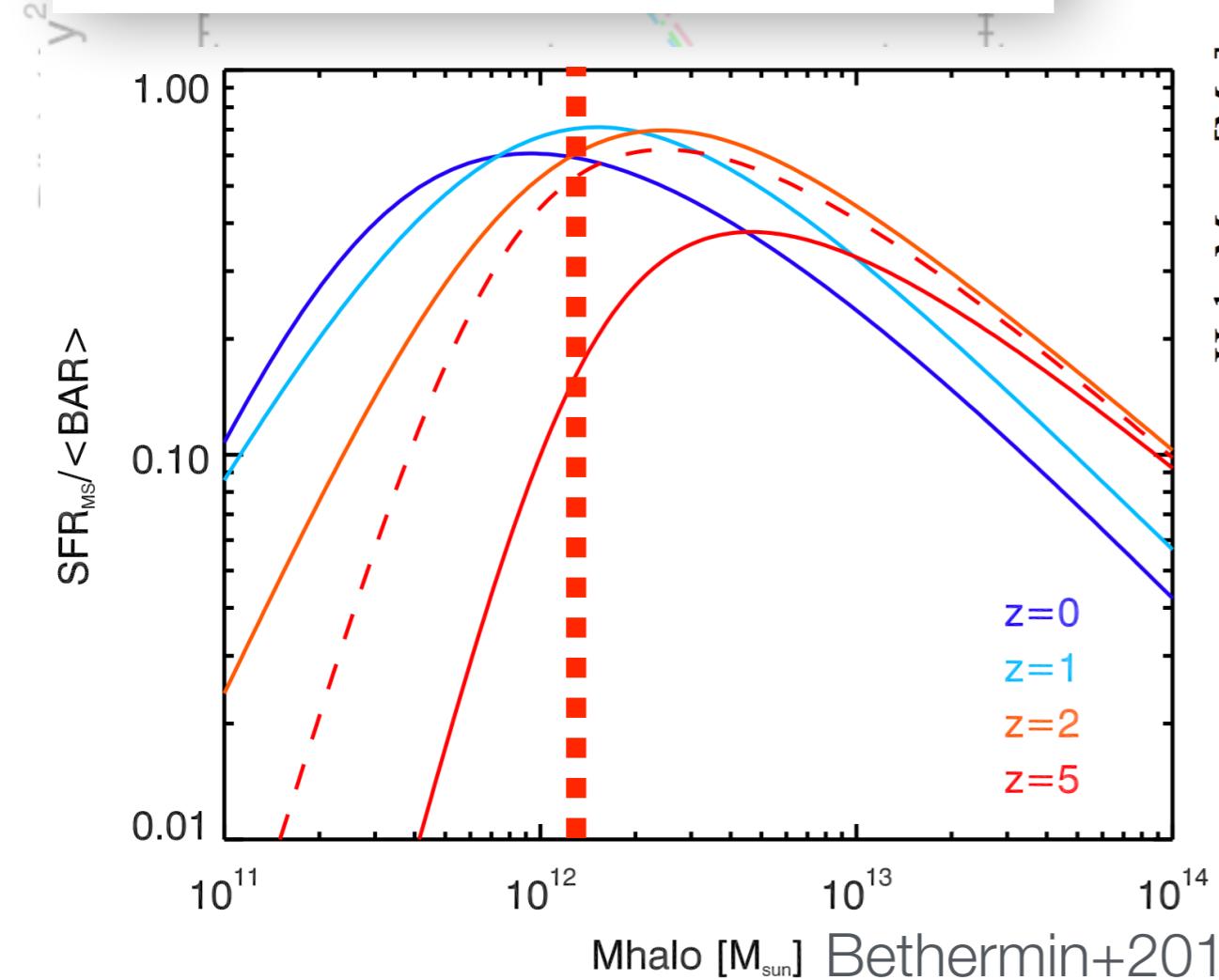
Viero et al. (2009) – arXiv:0904.1200

# Statistical Methods & CIB: A Success Story



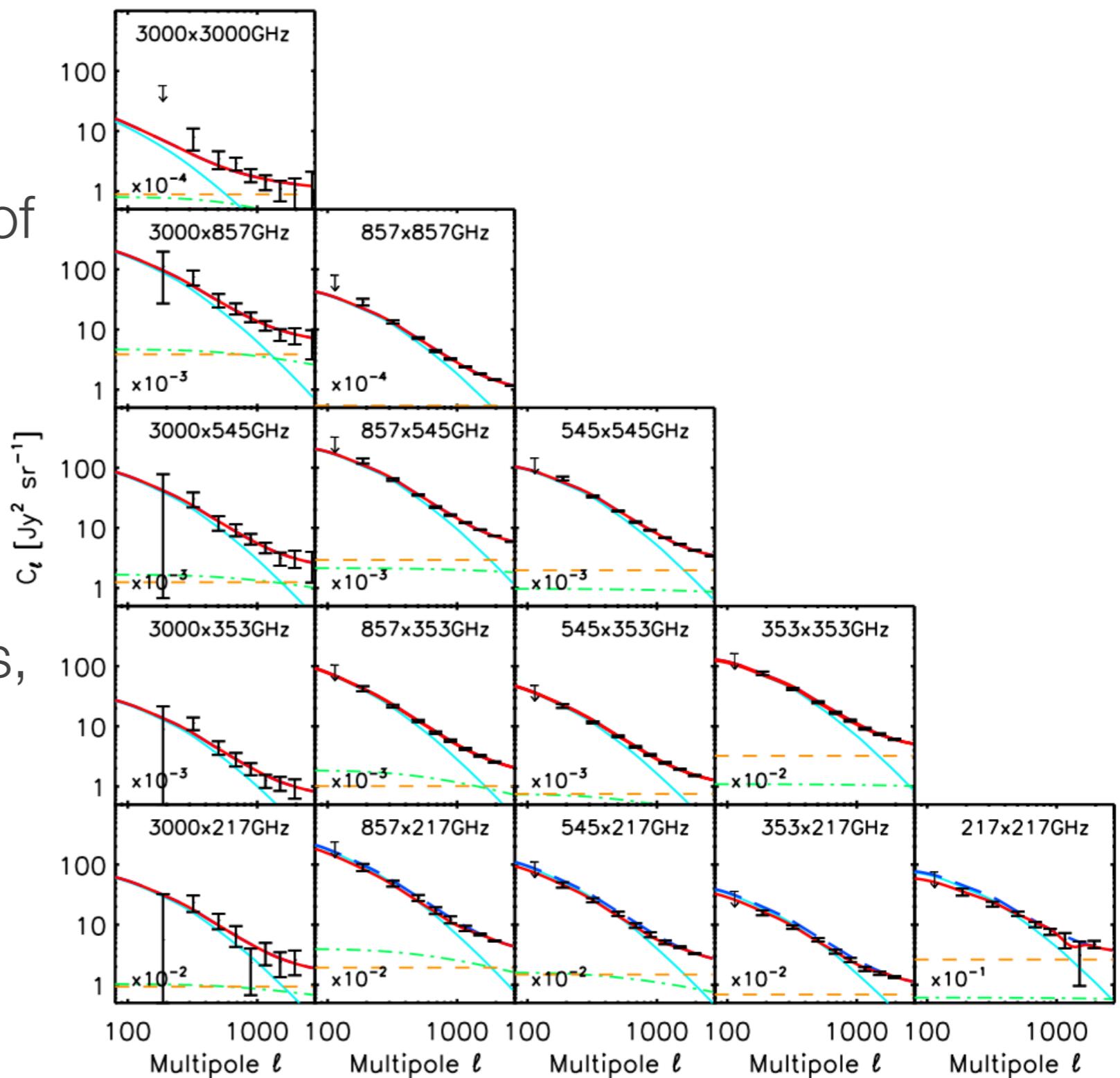
# Statistical Methods & CIB: A Success Story

- Adopt the Shang+2012 luminosity-weighted halo model.
- Key Findings:
  - $\log(M_{\min}/M_{\odot}) = 10.1 \pm 0.6$
  - $\log(M_{\text{eff}}/M_{\odot}) = 12.1 \pm 0.5$



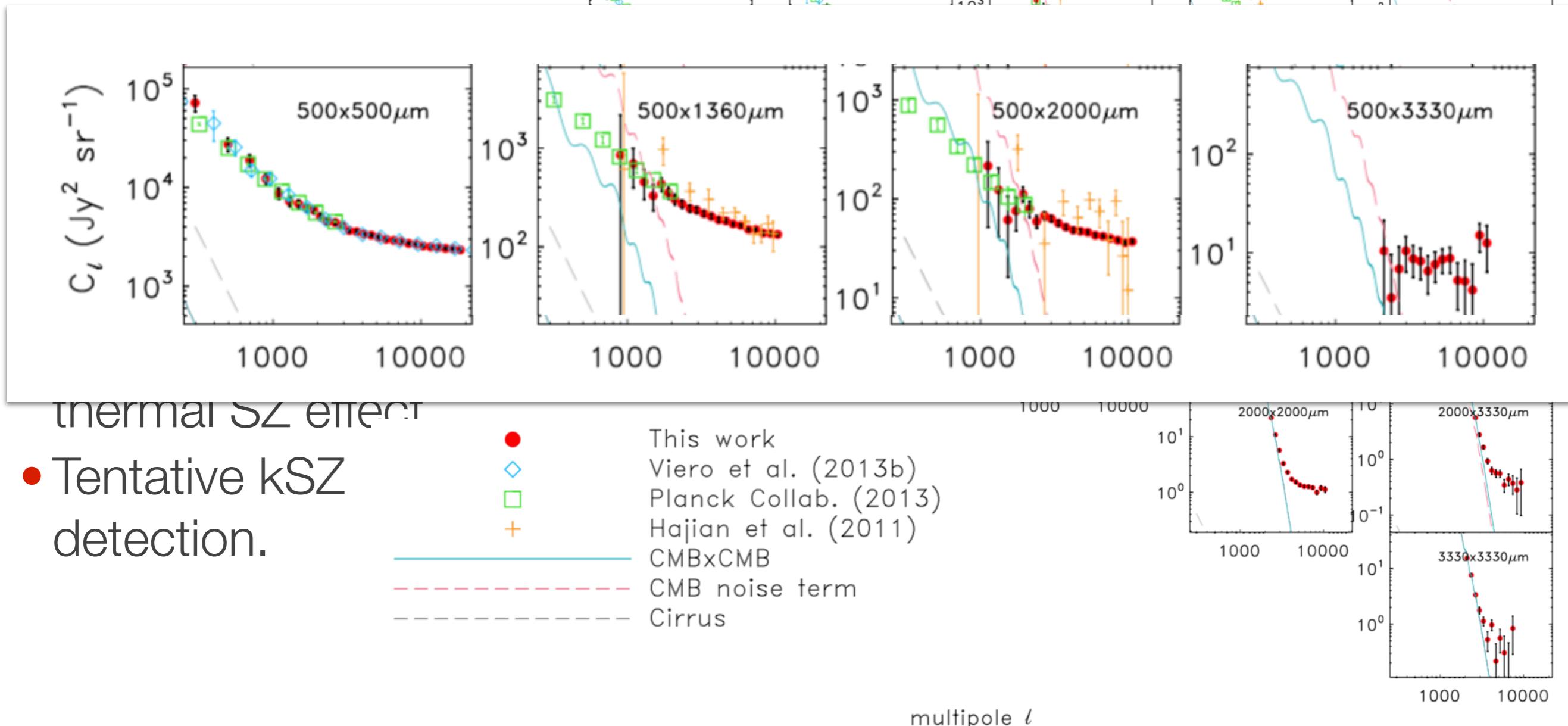
# Statistical Methods & CIB: A Success Story

- Cross-Frequency includes 100um (IRAS)
- Also adopt halo model of Shang+(2012)
- Key Findings:
  - $\log(M_{\text{eff}}/M_{\odot}) = 12.6$
  - first measurement of the bi-spectrum
- Sensitive to large-scales, but find Poisson and 1-halo term degenerate.
  - Poisson levels high
  - Mak et al. 2017 find values closer to Viero et al. 2013



Planck Collaboration XXX (2013) — arXiv:1309.0382

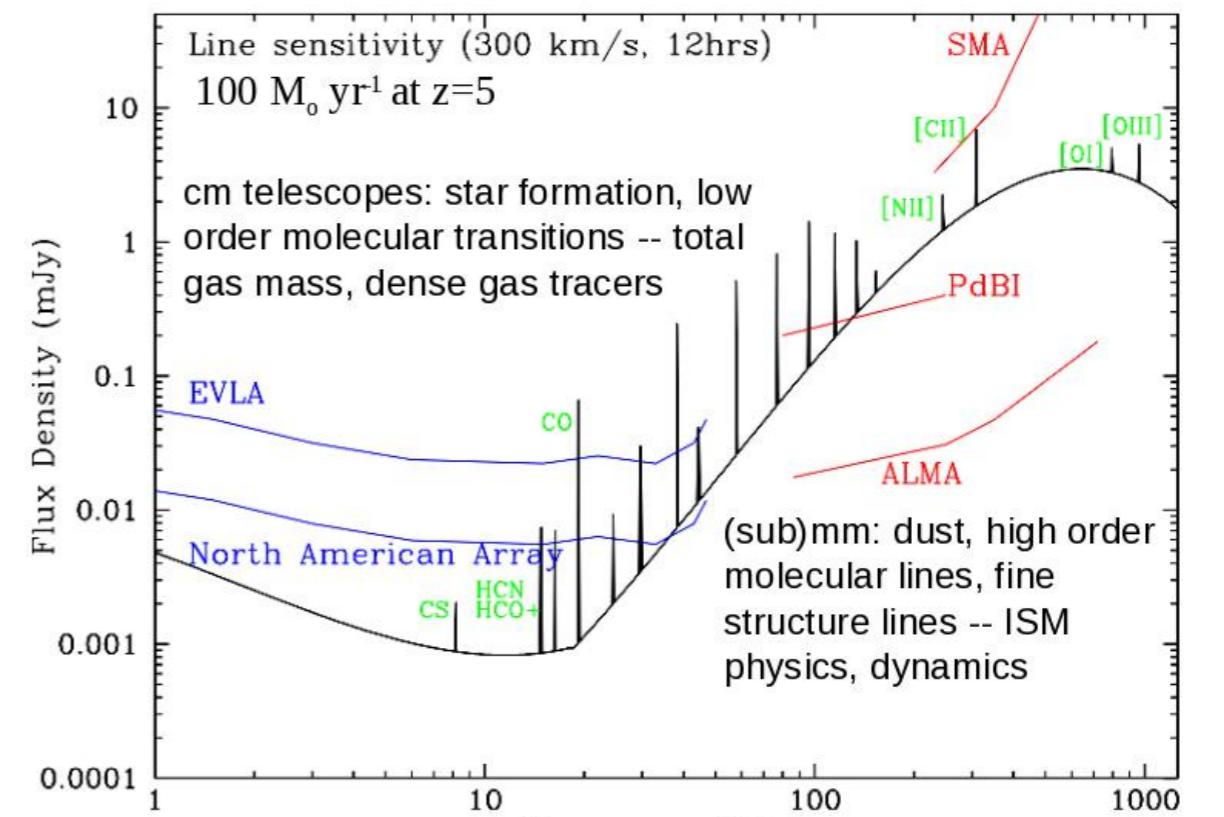
# Statistical Methods & CIB: A Success Story



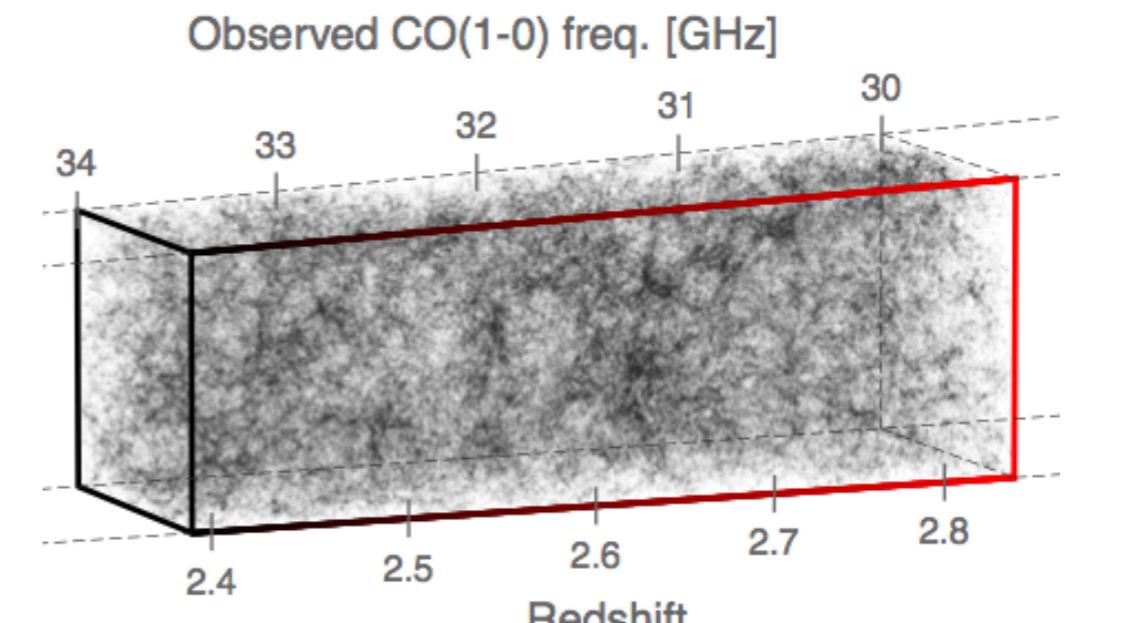
Viero et al. (2018, in prep.)

# 2D (Continuum-) to 3D (Line-) Intensity Mapping

- Rapid progress in CIB was made possible through combination of:
  - New technology and better data.
  - Statistical Techniques.
  - Modeling.
- Limitations of the CIB thus far include:
  - 2D – no redshift information.
  - Tells us about dust but not about gas.
- Opening up the z-direction (frequency) will allow us to extend the technique to 3D, exploiting fine-structure lines in the galaxy SED.



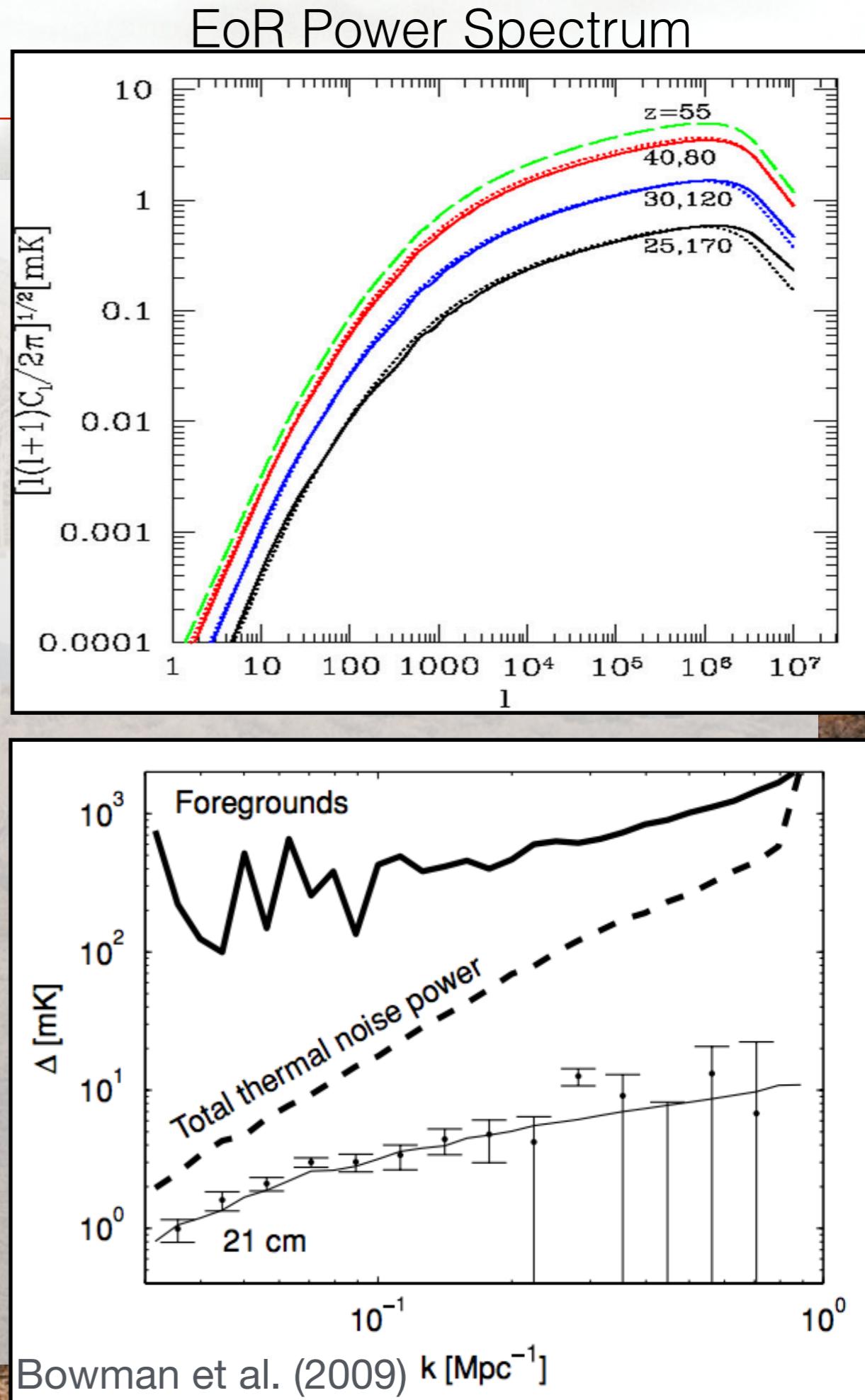
Carilli et al. (2010) — [arXiv:1006.0988](https://arxiv.org/abs/1006.0988)



Li et al. (2016) — [arXiv:1503.08833](https://arxiv.org/abs/1503.08833)

# HI Intensity Mapping

- Neutral Hydrogen, HI, is incredibly abundant (90% of all atoms!), emits at 21cm, and traces the evolution of the IGM during EoR, making it a perfect candidate line for IM.
- Instruments underway include:
  - Square Kilometer Array (SKA)
  - Hydrogen EoR Array (HERA)
  - Precision Array for Probing Epoch of Reionization (PAPER)
  - Murchison Widefield Array (MWA)
- But noise/foregrounds swap signal
  - Smooth in frequency, but must be extremely well characterized!

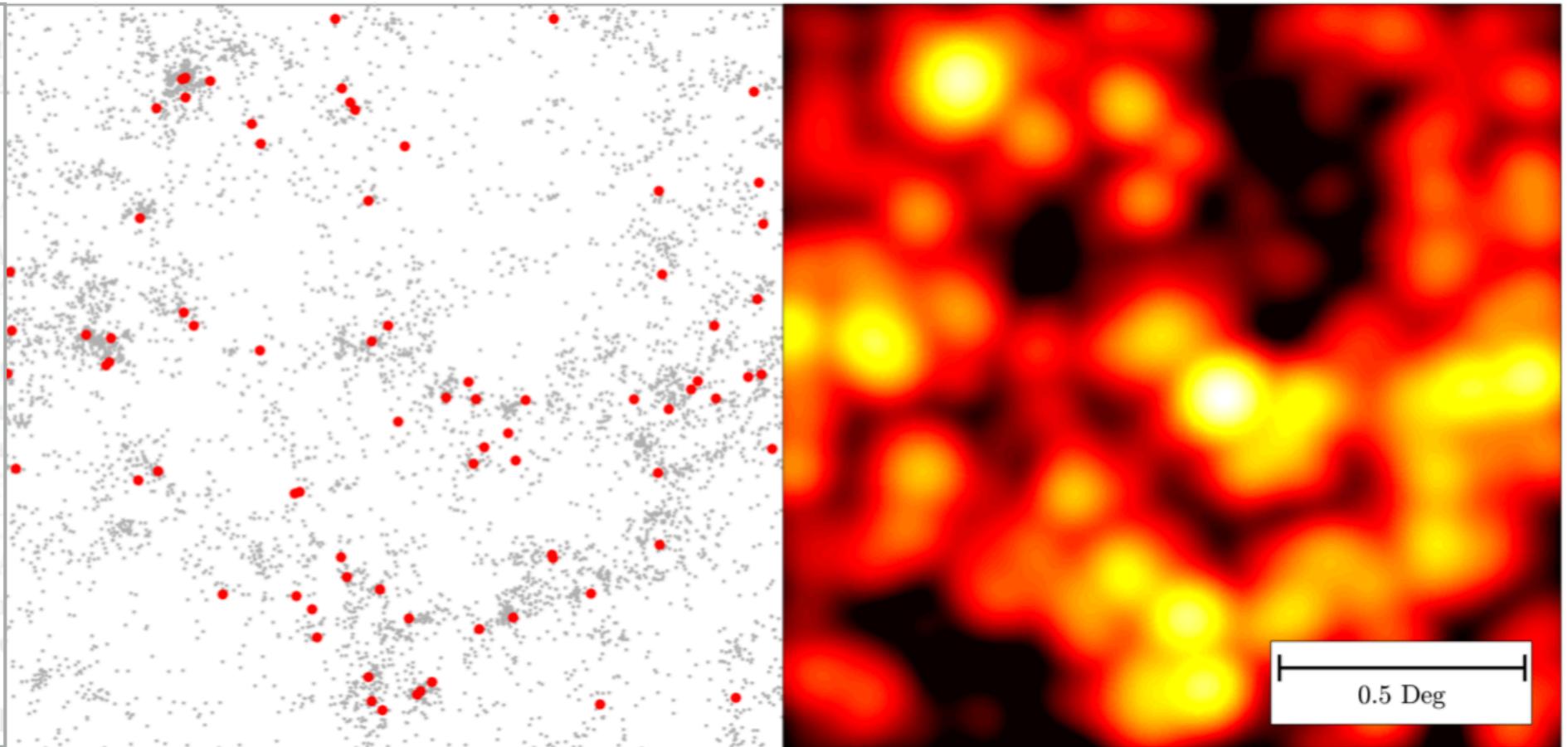


# Line-Intensity Mapping

- Line-Intensity Mapping borrows the principle idea from HI intensity mapping, but instead observes the collected emission from **Galaxies**.
- Efficient! Small telescopes, shorter integrations.
- Multiple line candidates (CO, CII, Ly $\alpha$ ) probe different physics.

## 2.5 deg $^2$ field

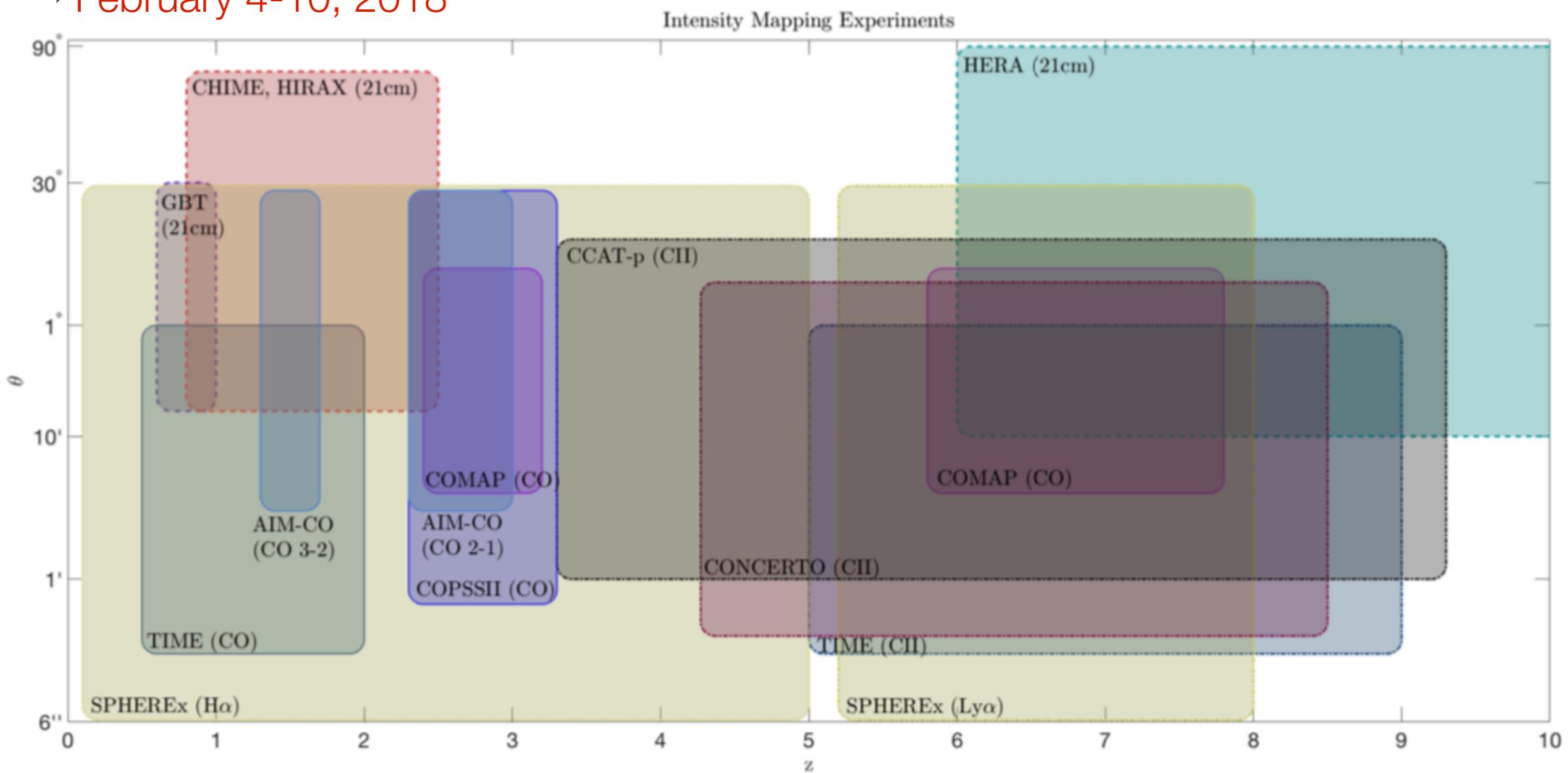
- VLA (left)
  - 27 dishes
  - 4500 hours
  - 1% sources
- COMAP (right)
  - 1 dish
  - 1500 hours



From the Line-Intensity Mapping Status Report (Kovetz, Viero et al. 2017 — arXiv:1709.09066)

# Line-Intensity Mapping

- Opportunities and Challenges in Intensity Mapping
  - March 21-23, 2016, SLAC/Stanford
- Second Annual Intensity Mapping Workshop
  - June 12-14, 2017, Johns Hopkins University
- Cosmological Signals from Cosmic Dawn to the Present
  - February 4-10, 2018

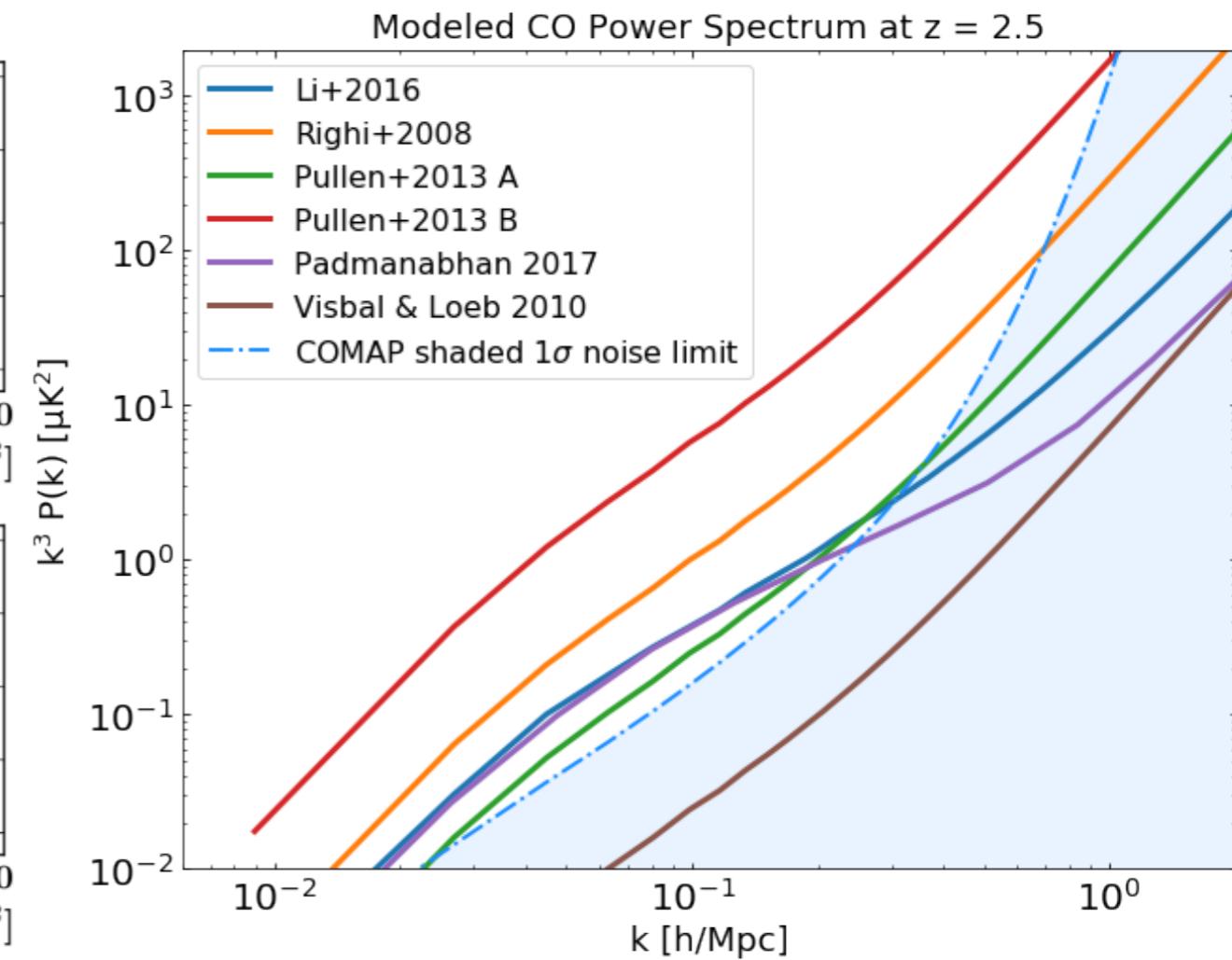
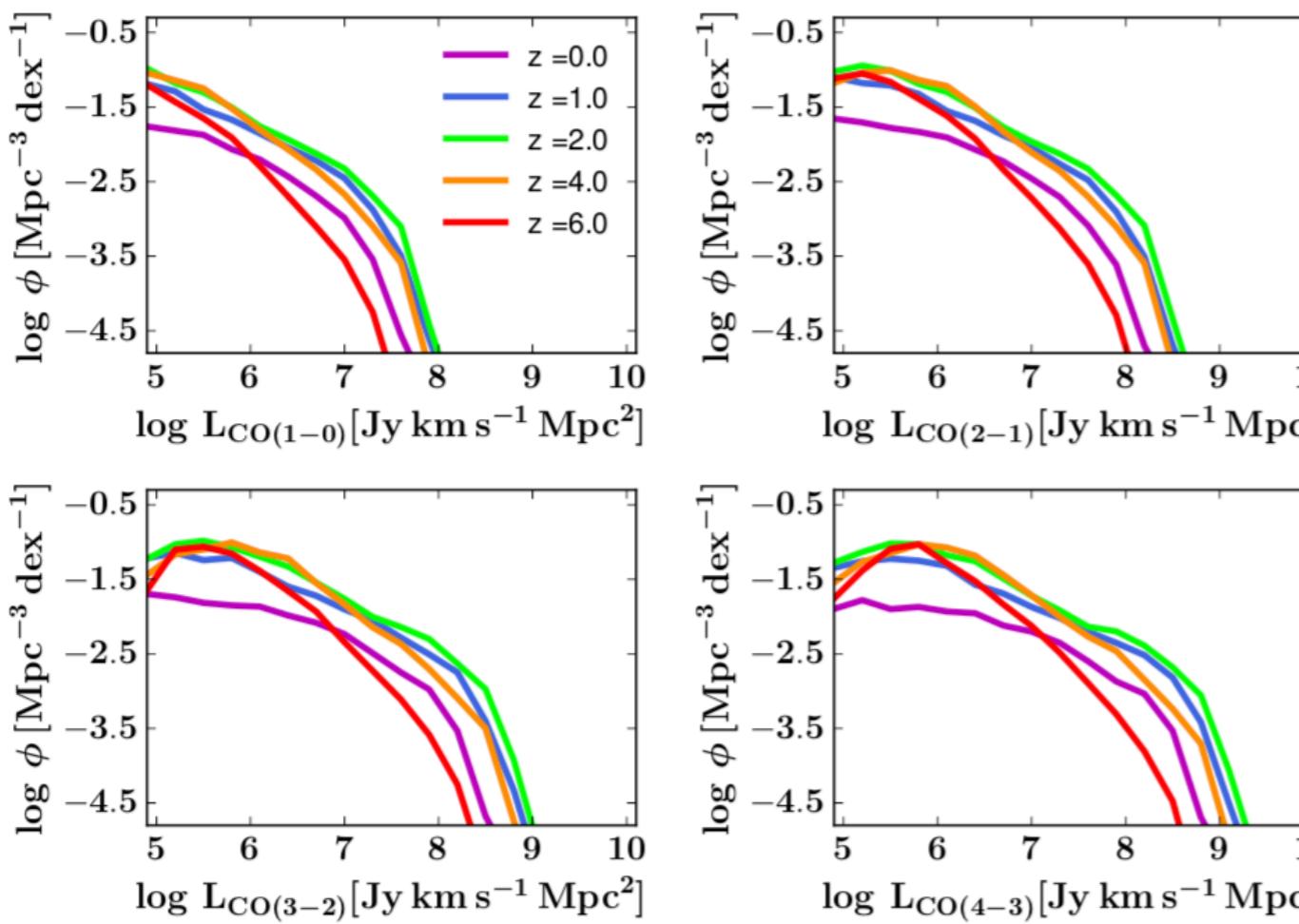


Kovetz and Breysse for the Line-Intensity Mapping Status Report — arXiv:1709.09066

# Line-Intensity Mapping – CO

- CO next most abundant molecule after H<sub>2</sub>.
- Traces star formation.
- Emission arises from “ladder” of transitions  $v_{1\rightarrow 0} = 115.27$  GHz.  
Leads to unambiguous redshift determination.

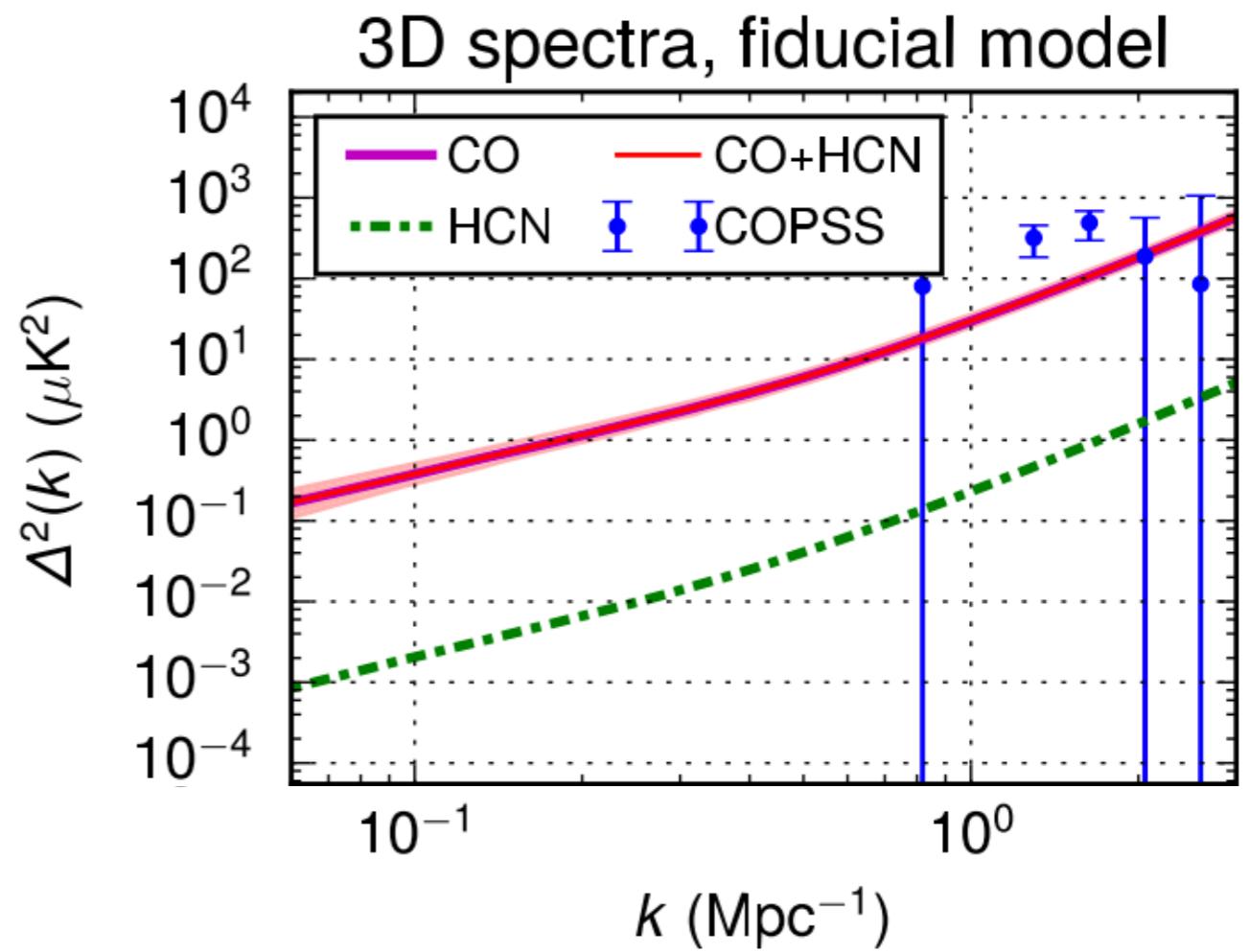
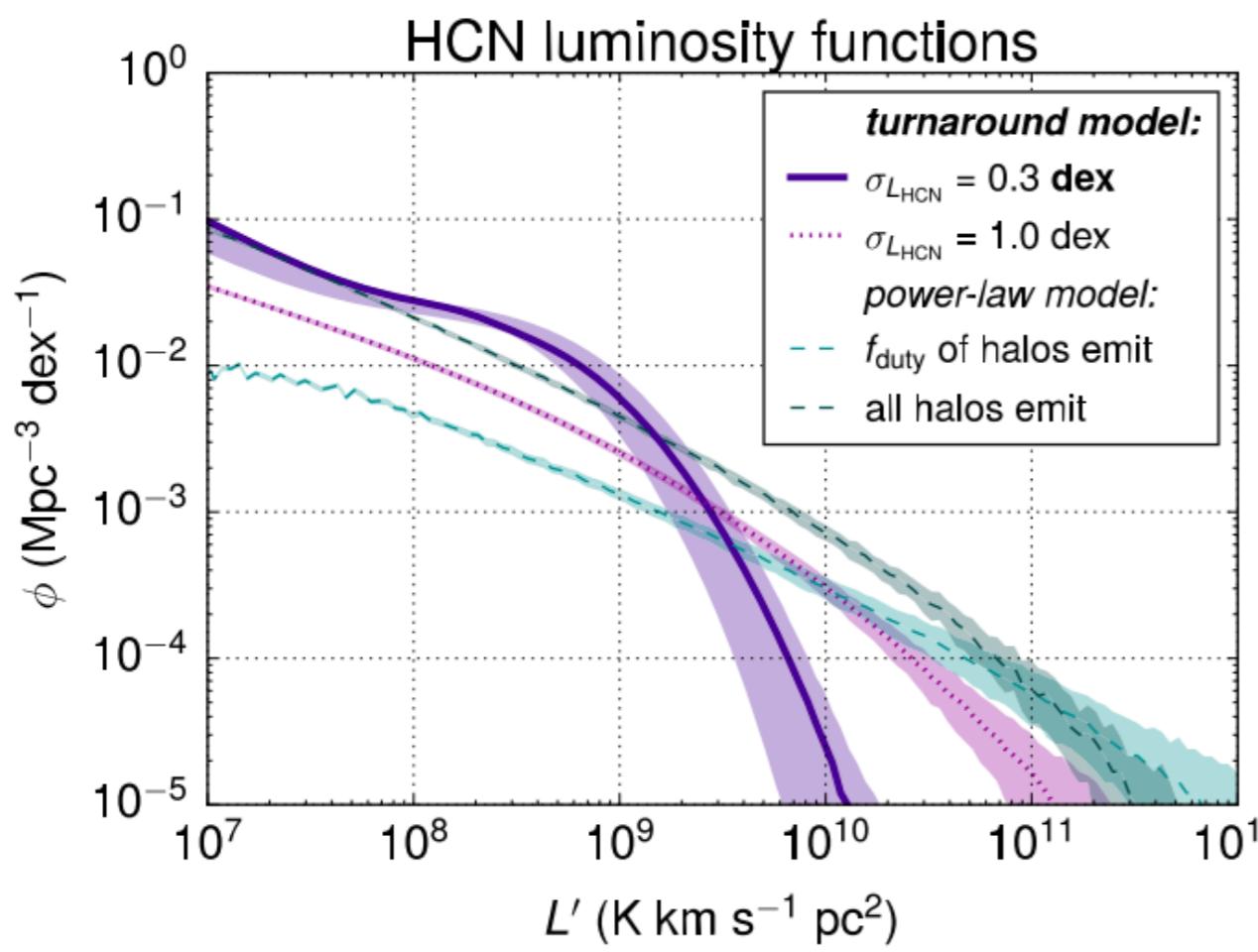
CO Luminosity Functions



Popping+2016 for the Line-Intensity Mapping Status Report — [arXiv:1709.09066](https://arxiv.org/abs/1709.09066)

# CO Foregrounds – HCN

- HCN was previously suggested to be a problem foreground.
- Chung+2017 showed that the high Poisson levels were the result of unrealistic assumptions\* about the shape of the luminosity function: i.e., assuming an unbroken power-law.

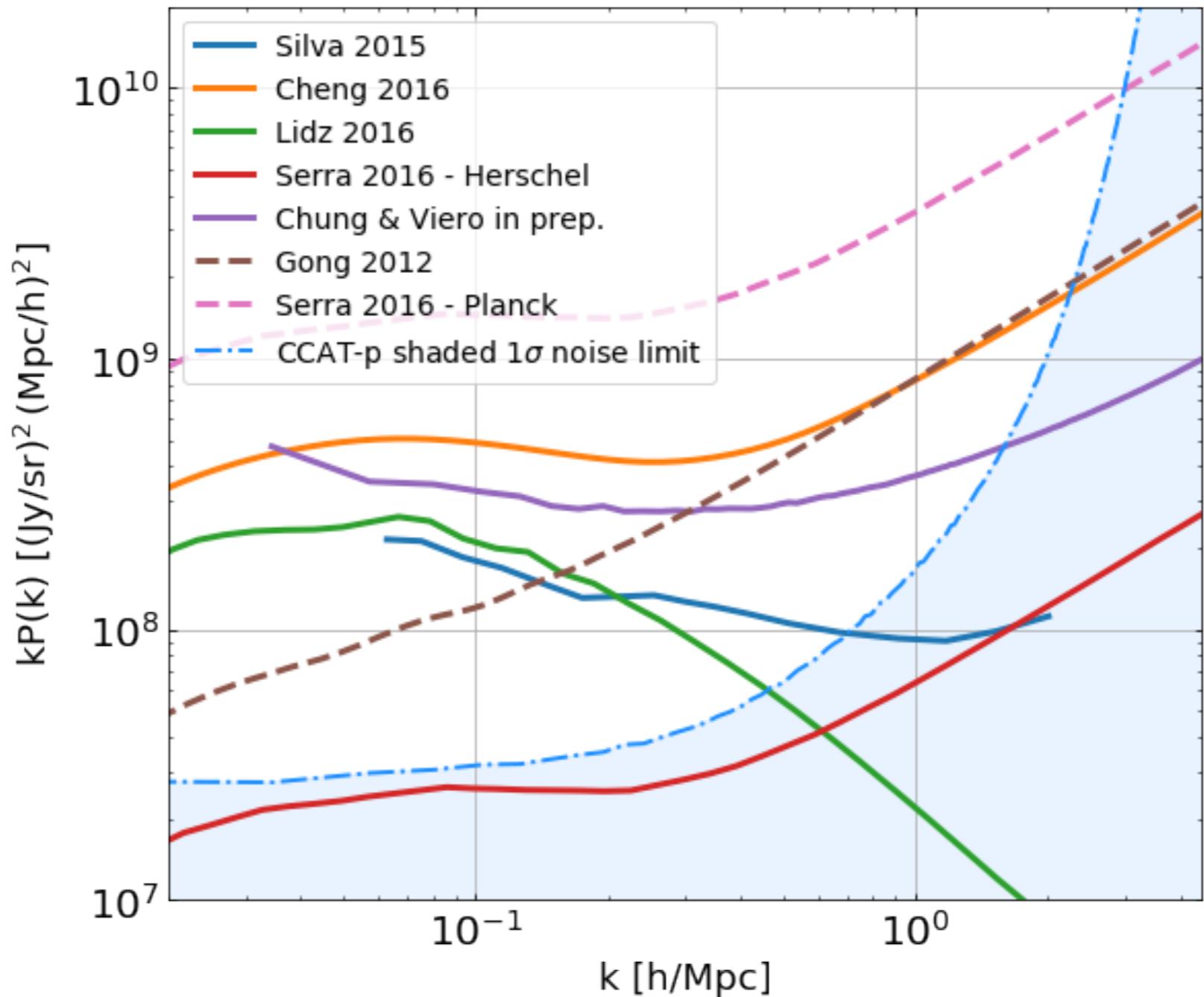


Chung, Viero et al. 2017  
arXiv:1706.03005

\* by now I hope you've noticed a theme!

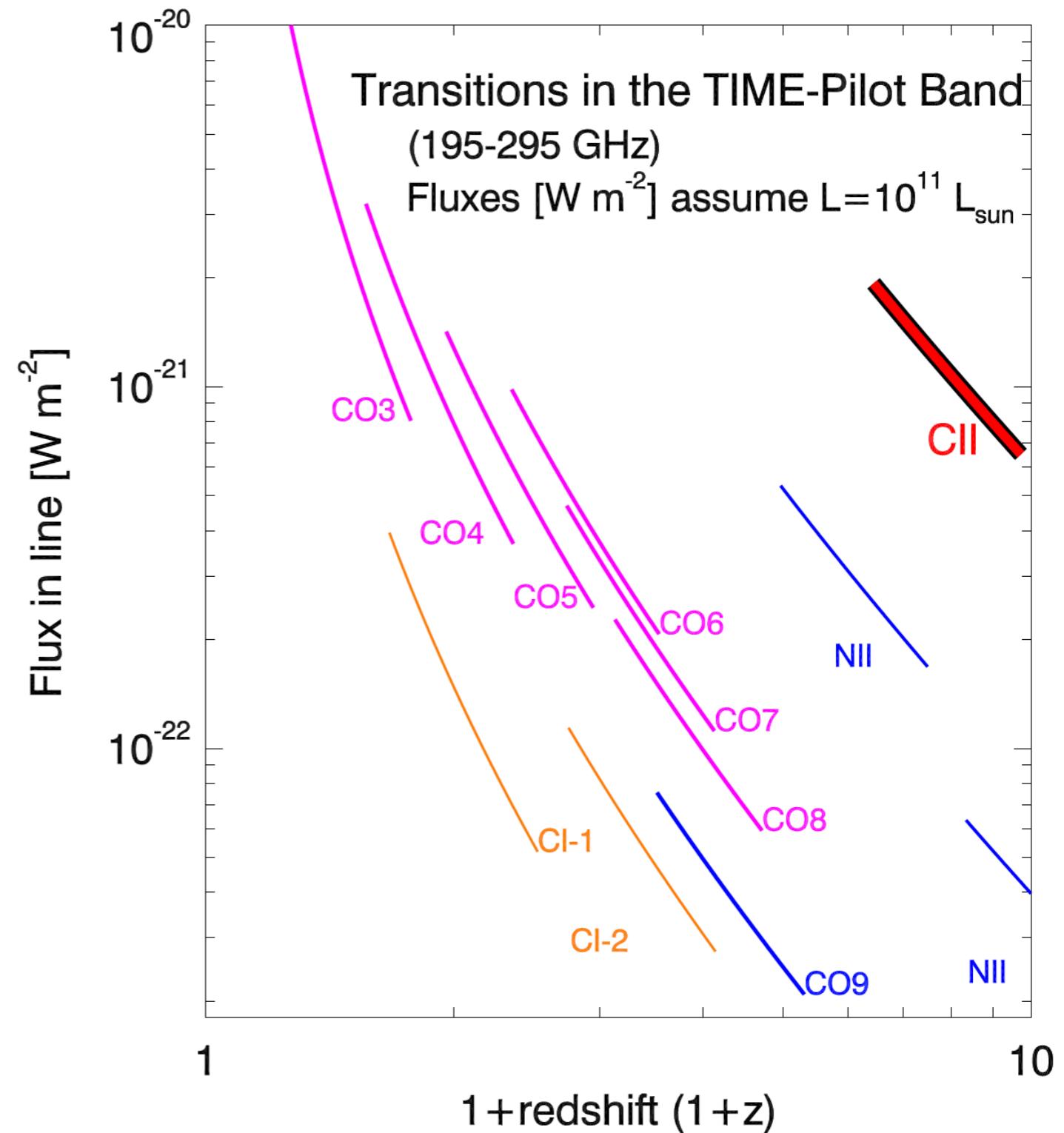
# Line-Intensity Mapping – [CII]

- [CII] – singly ionized carbon fine-structure line ( $157.7\mu\text{m}$ )
- Makes up as much as 1% of bolometric infrared luminosity.
- Low ionization energy, is a major coolant of the ISM and tracer of star formation.
- EoR redshifts into the submm/mm.



# CO Foreground Cleaning

- Targeting CII at  $z = 6-10$  means separating signal from lower- $z$  CO.
- In deep fields (e.g., COSMOS, UDS, GOODS), all potentially significant CO emitters ( $z=1-3$ ) will be cataloged in the UV, optical, and NIR with great detail.
  - In these cases, estimators for CO can be constructed from optical predictors of the mean LIR.
  - How much variance is there from the mean, and how aggressively does masking need to be to play it safe?



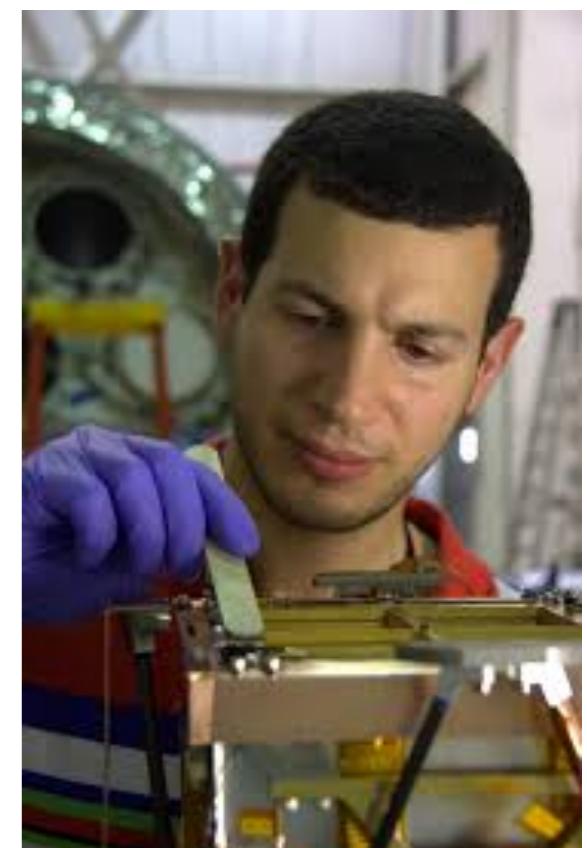
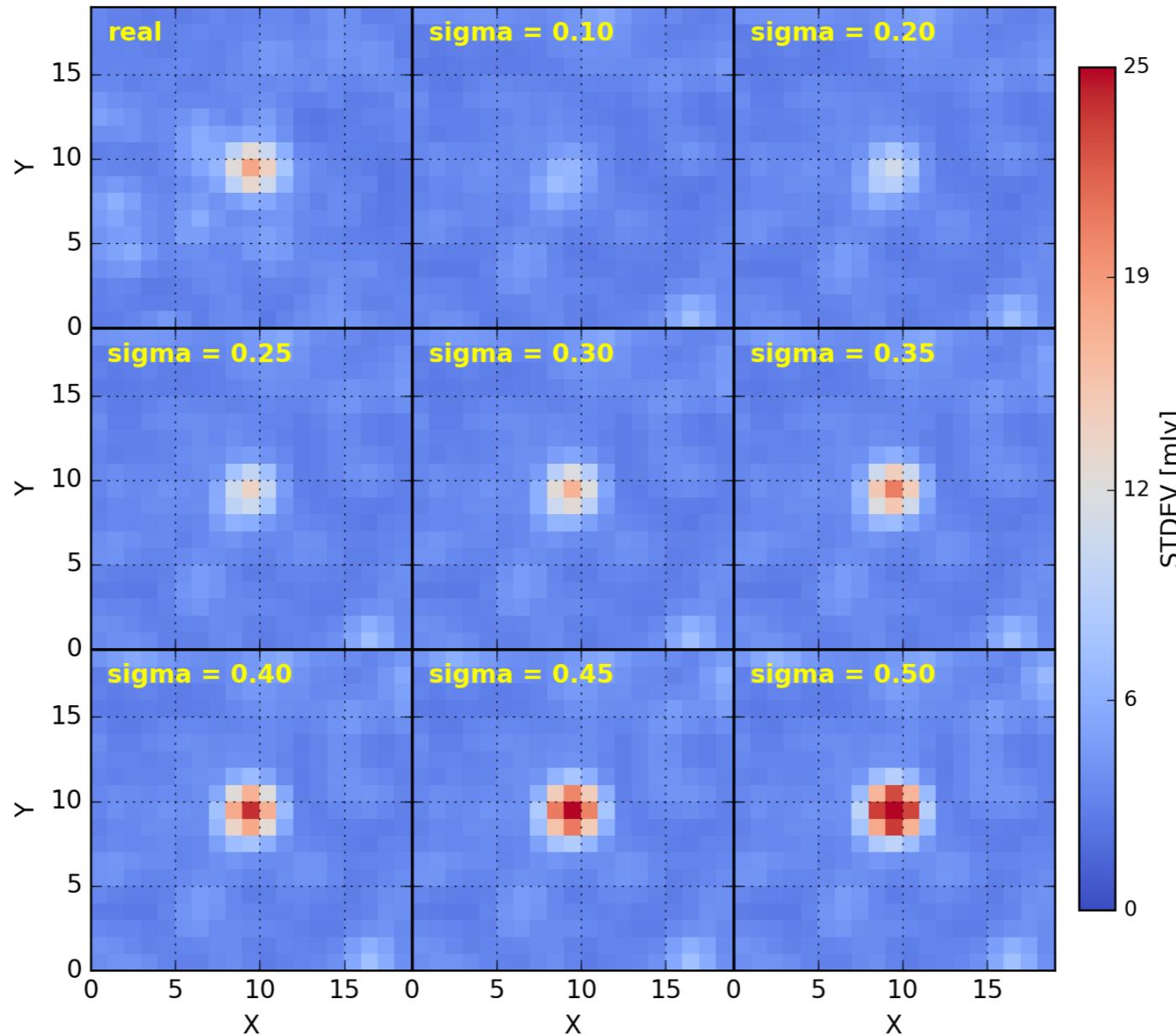
# CO Foreground Cleaning

Variance in the LIR estimator determined by comparing scatter in the difference map with simulations.

- Find  $\sigma = 0.33$



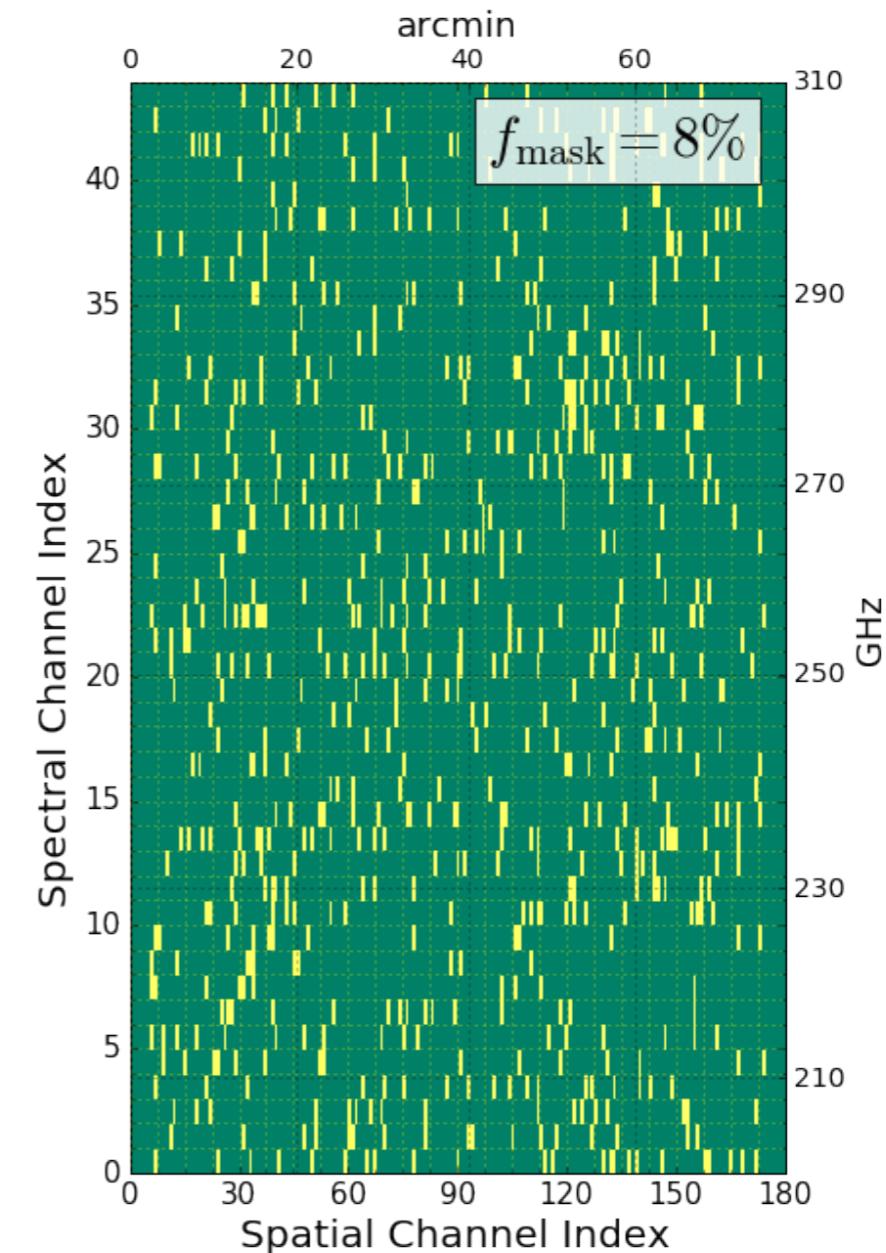
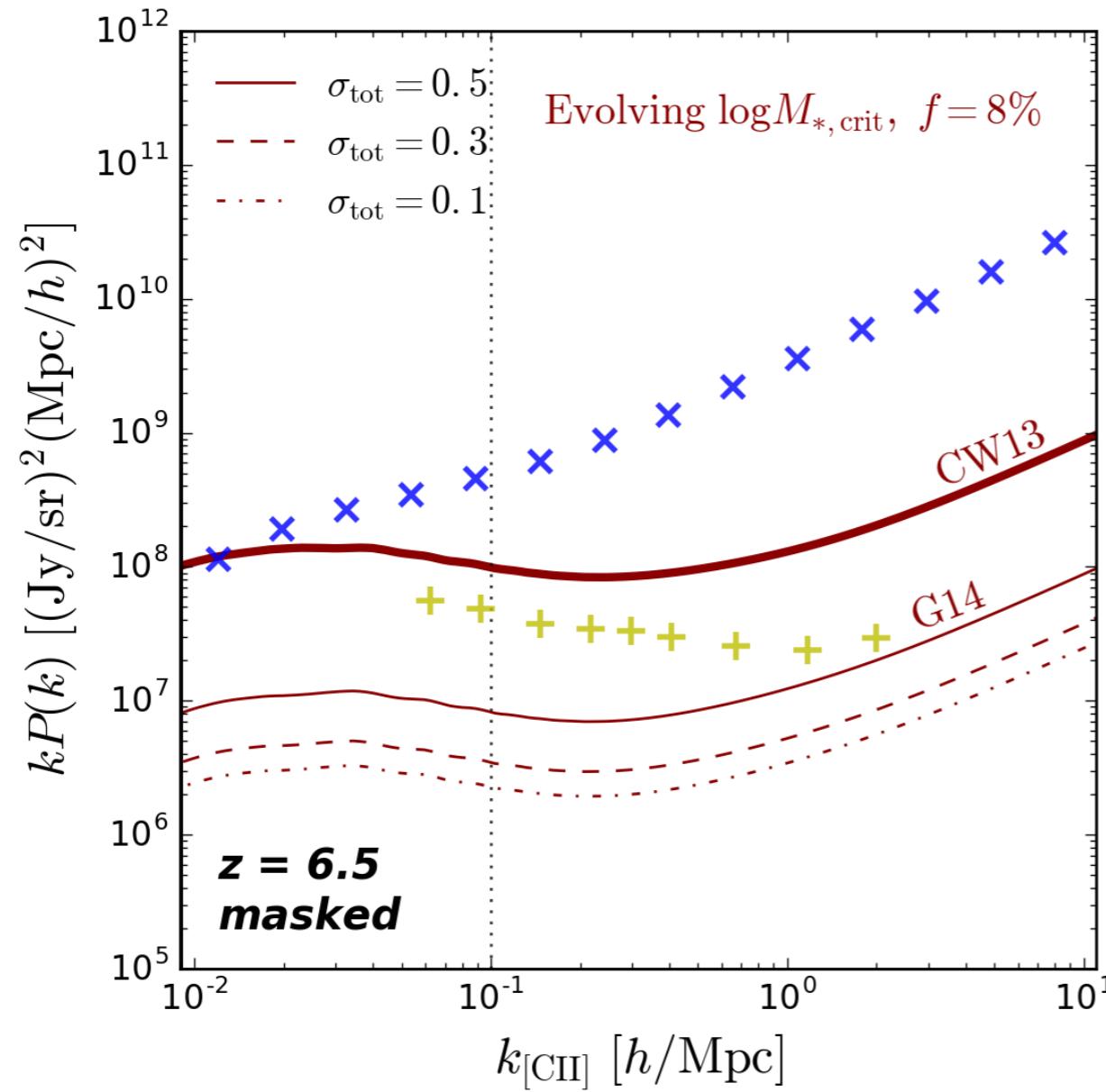
Guaocho (Jason)  
Sun — Caltech



Lorenzo Moncelsi  
— Caltech

Sun, Moncelsi, Viero & TIME collaboration 2017 — arXiv:1610.10095

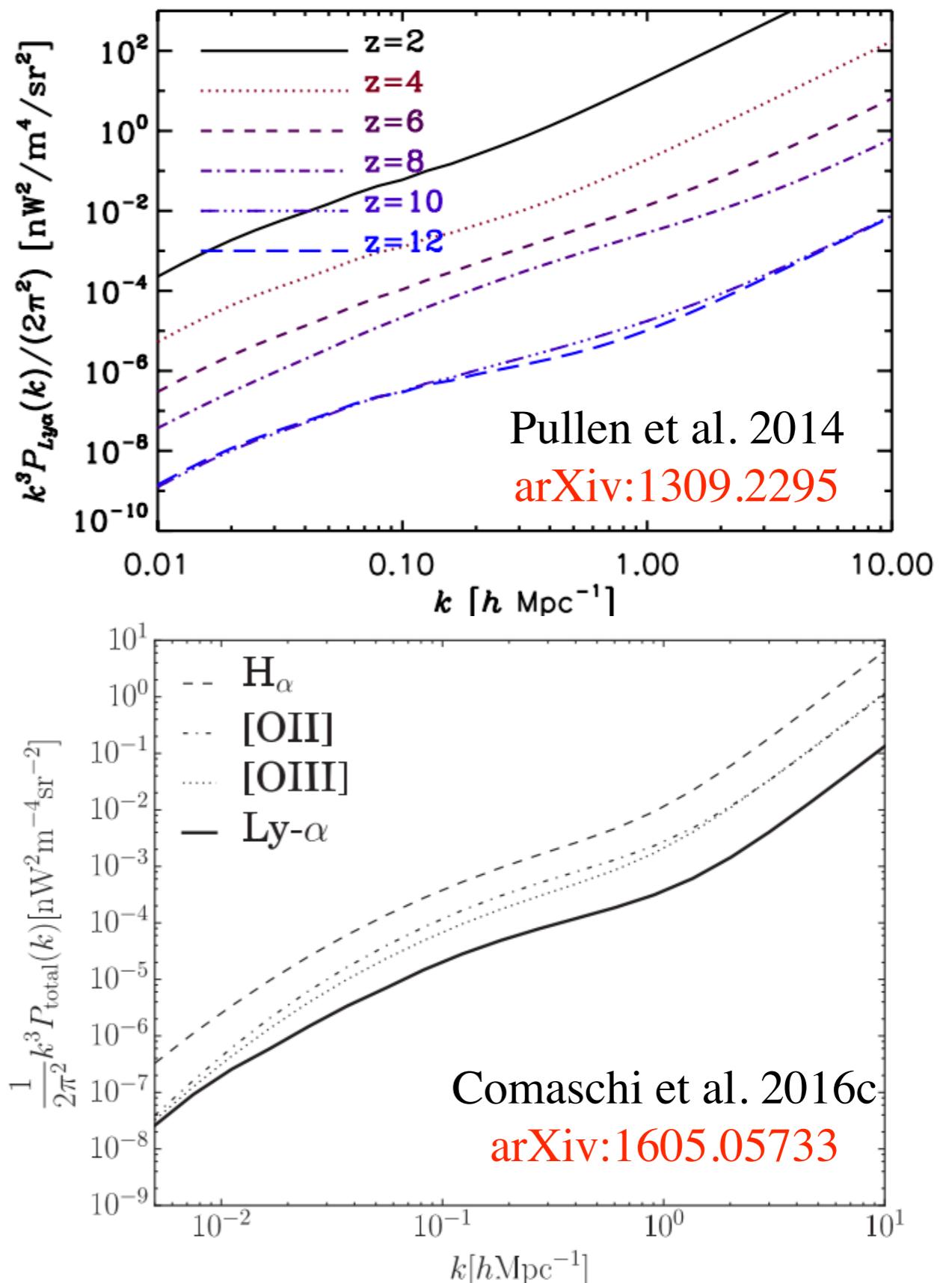
# CO Foreground Cleaning



Sun, Moncelsi, Viero & TIME collaboration 2017 – arXiv:1610.10095

# Line-Intensity Mapping – Lyman-alpha

- Lya is the most luminous UV line.
- High-z Lya-emitting (LAE) galaxy searches suffer from scattering by HI.
- Intensity mapping sensitive to diffuse ISM
- Interlopers (H $\alpha$ , [OII], [OIII]) present a significant challenge:
  - requires ancillary data to AB mag  $\sim 26$  to identify sources to mask.



# Experimental Landscape

ments

- First Detections
- Upcoming Experiments



# First Detections: 21cm × Galaxy Surveys at $z = 0.8$

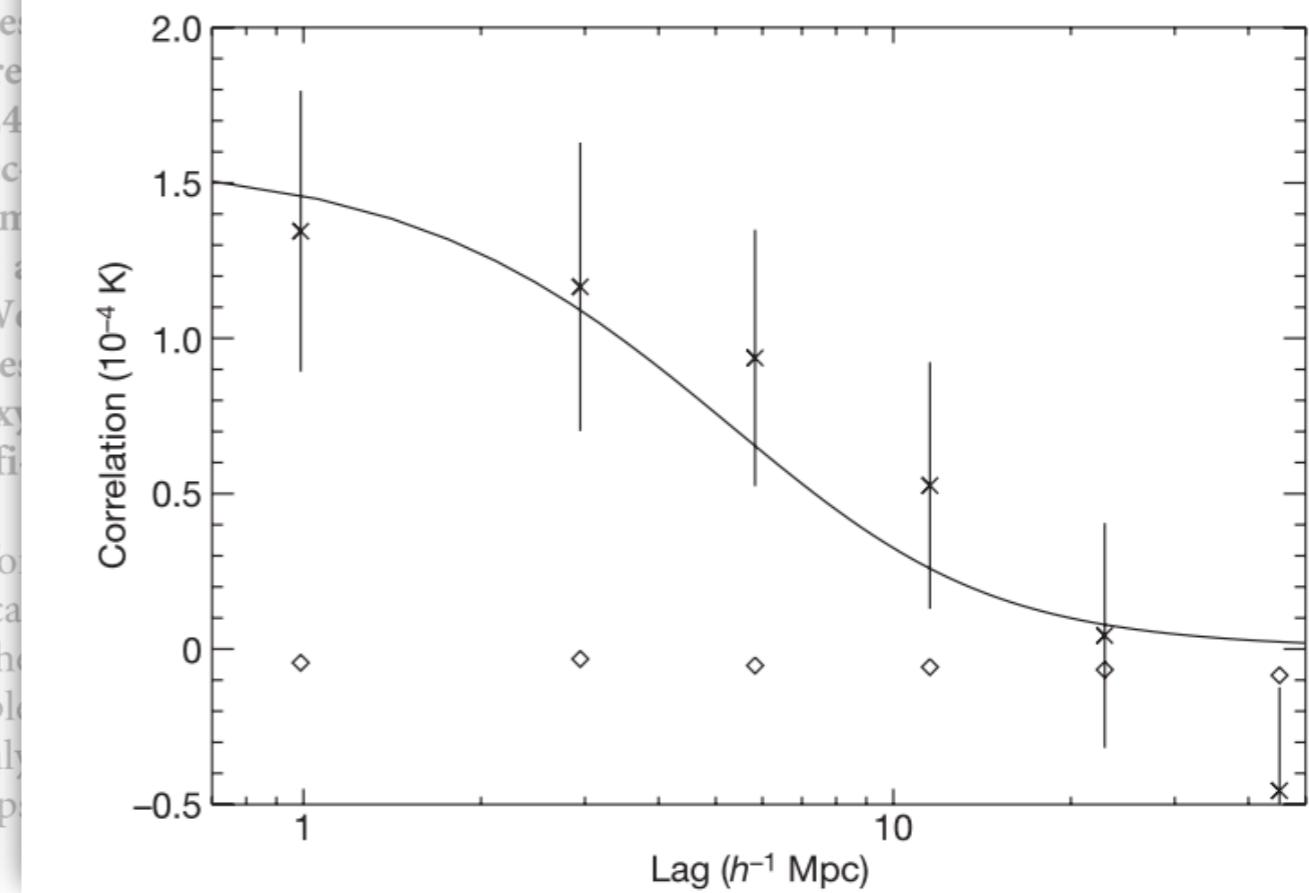
## An intensity map of hydrogen 21-cm emission at redshift $z \approx 0.8$

Tzu-Ching Chang<sup>1,2</sup>, Ue-Li Pen<sup>2</sup>, Kevin Bandura<sup>3</sup> & Jeffrey B. Peterson<sup>3</sup>

Observations of 21-cm radio emission by neutral hydrogen at redshifts  $z \approx 0.5$  to  $\sim 2.5$  are expected to provide a sensitive probe of cosmic dark energy<sup>1,2</sup>. This is particularly true around the onset of

(RFI) from terrestrial transmitters and broadband (continuum) emission by astronomical sources within and outside the Milky Way. We use polarization to identify and excise unwanted signals.

- Chang+2010 made the first IM detection ( $4\sigma$ ) by cross-correlating HI intensity map (with GBT 21cm observations of 15 hrs,  $2 \text{ deg}^2$ ) with DEEP2 galaxy survey ( $\sim 10,000$  gals) at  $z = 0.8$



Chang et al. (2010)

# First Detections: 21cm × Galaxy Surveys at $z = 0.8$

## MEASUREMENT OF 21 cm BRIGHTNESS FLUCTUATIONS AT $z \sim 0.8$ IN CROSS-CORRELATION

K. W. MASUI<sup>1,2</sup>, E. R. SWITZER<sup>1,3</sup>, N. BANAVAR<sup>4</sup>, K. BANDURA<sup>5</sup>, C. BLAKE<sup>6</sup>, L.-M. CALIN<sup>1</sup>, T.-C. CHANG<sup>7</sup>, X. CHEN<sup>8,9</sup>, Y.-C. LI<sup>8</sup>, Y.-W. LIAO<sup>7</sup>, A. NATARAJAN<sup>10</sup>, U.-L. PEN<sup>1</sup>, J. B. PETERSON<sup>10</sup>, J. R. SHAW<sup>1</sup>, AND T. C. VOYTEK<sup>10</sup>

<sup>1</sup> Canadian Institute for Theoretical Astrophysics, University of Toronto, 60 St. George St., Toronto, Ontario, M5S 3H8, Canada

<sup>2</sup> Department of Physics, University of Toronto, 60 St. George St., Toronto, Ontario, M5S 1A7, Canada

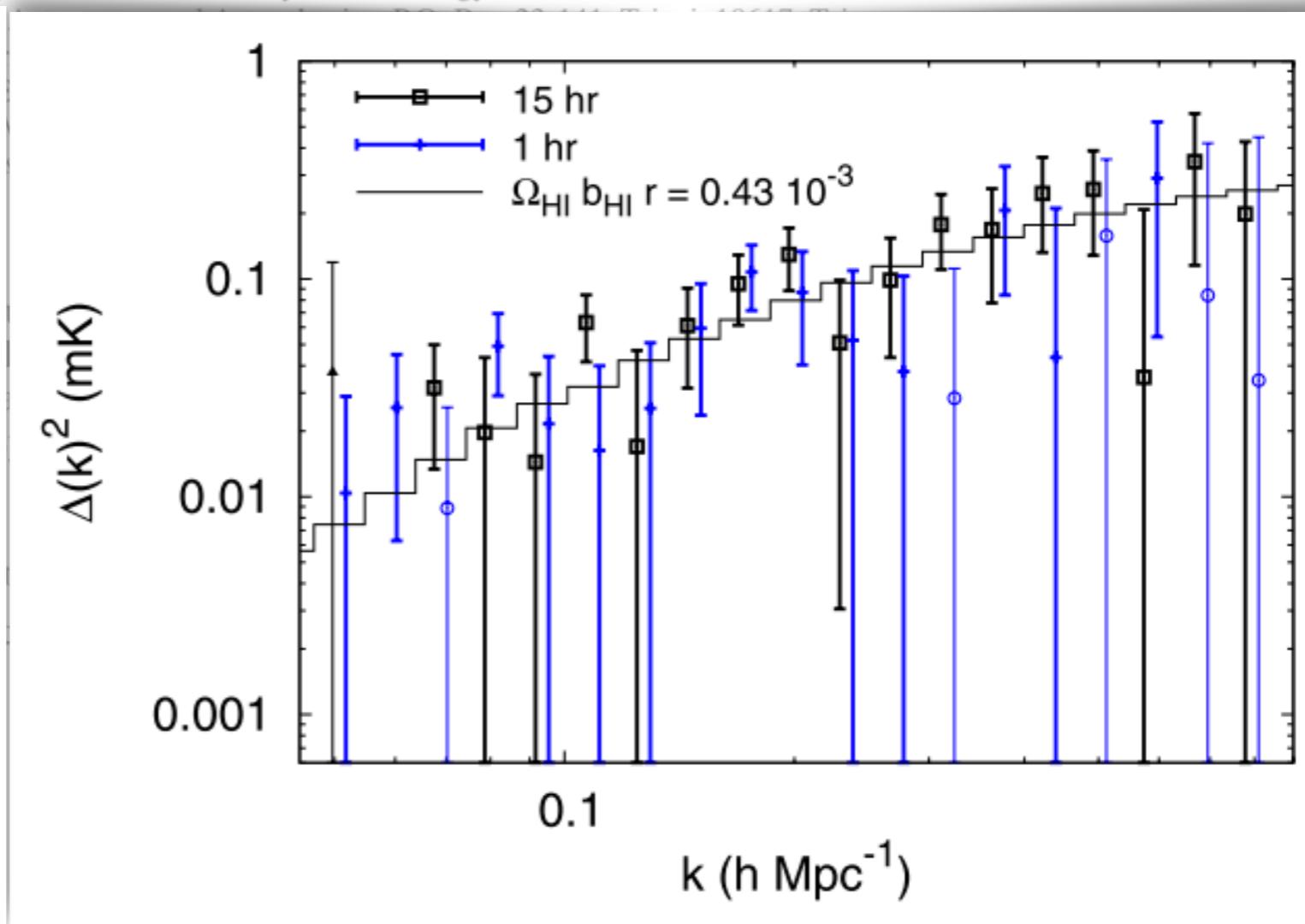
<sup>3</sup> Kavli Institute for Cosmological Physics, University of Chicago, 5640 South Ellis Avenue, Chicago, IL 60637, USA

<sup>4</sup> Department of Astronomy & Astrophysics, University of Toronto, 50 St. George St., Toronto, Ontario, M5S 3H4, Canada

<sup>5</sup> Department of Physics, McGill University, 3600 Rue University, Montreal, Quebec, H3A 2T8, Canada

<sup>6</sup> Centre for Astrophysics & Supercomputing, Swinburne University of Technology, P.O. Box 218, Hawthorn, VIC 3122, Australia

- Masui+2013 improve upon Chang+2010 measurement, by cross-correlating two fields (deep:  $4.5 \times 2.4$  deg $^2$ , 105hr; wide:  $7.0 \times 4.3$  deg $^2$ , 84hr) and WiggleZ galaxy catalog.



Masui et al. (2013) - arXiv:1208.0331

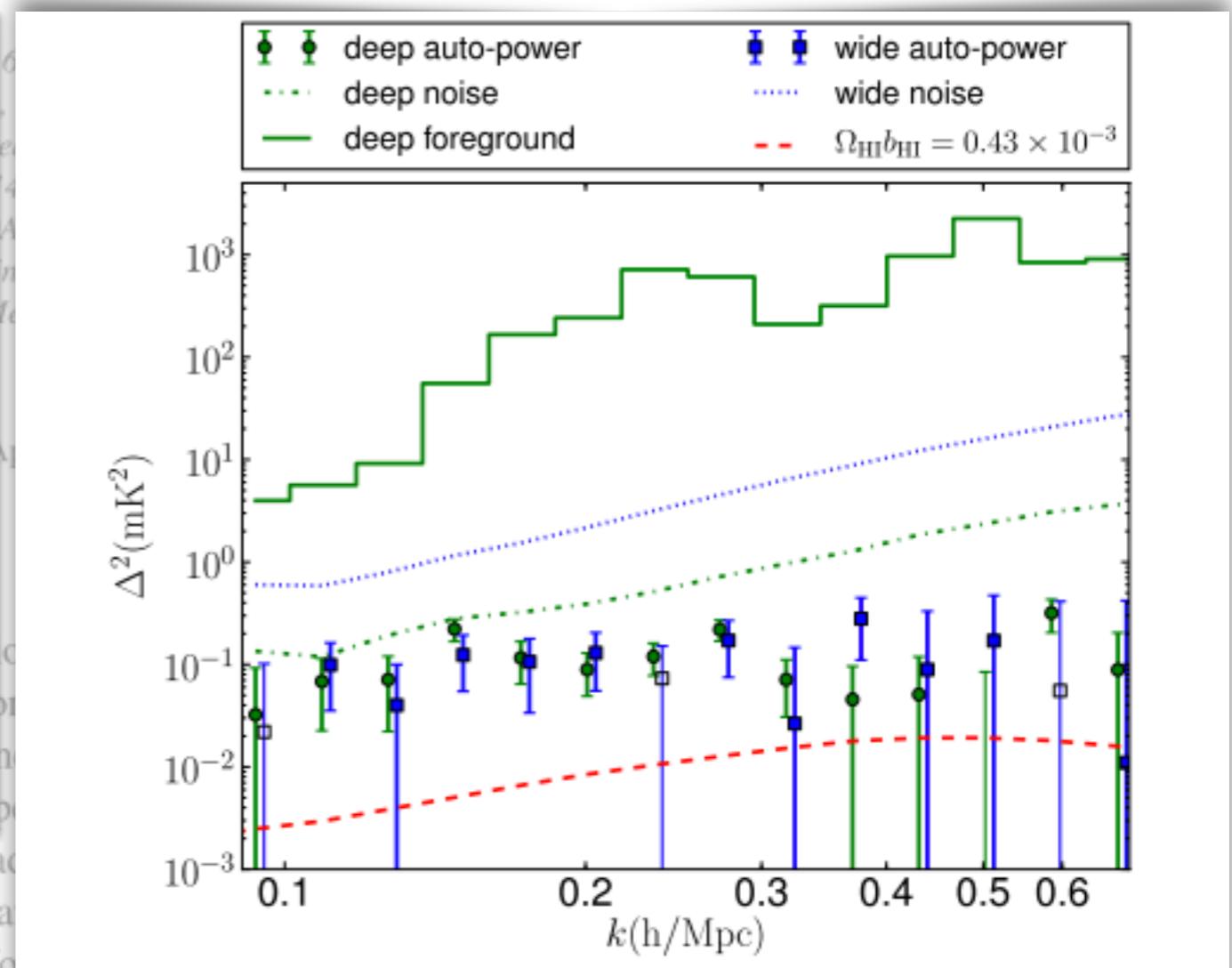
# First Detections: 21cm Auto-Spectrum with GBT

Determination of  $z \sim 0.8$  neutral hydrogen fluctuations using the 21 cm intensity mapping autocorrelation

E. R. Switzer,<sup>1</sup>★ K. W. Masui,<sup>1,2</sup>★ K. Bandura,<sup>3</sup> L.-M. Calin,<sup>1</sup> T.-C. Chang,<sup>4</sup>  
X.-L. Chen,<sup>5,6</sup> Y.-C. Li,<sup>5</sup> Y.-W. Liao,<sup>4</sup> A. Natarajan,<sup>7</sup> U.-L. Pen,<sup>1</sup> J. B. Peterson,<sup>7</sup>  
J. R. Shaw<sup>1</sup> and T. C. Vovtek<sup>7</sup>

- Switzer+2013 claim HI auto-spectrum measurement
- Broadly consistent with cross-correlation, but concerns about foreground residuals after removing to 1 part in 1000

$\approx 41 \text{ deg}^2$  and 190 h of radio time, which increases the signal by  $\sim 10^3$ , but has not removed the presence of residual foregrounds on the 21 cm signal. Our

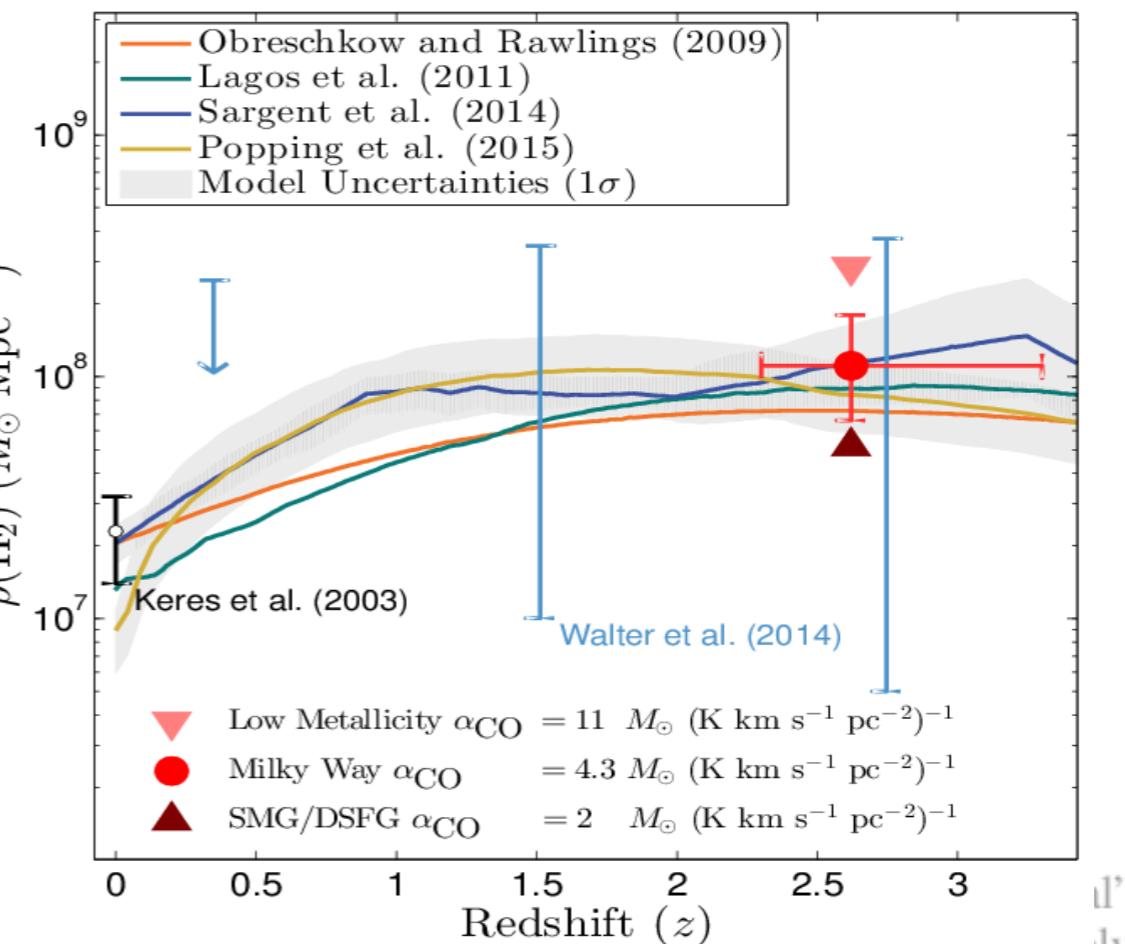
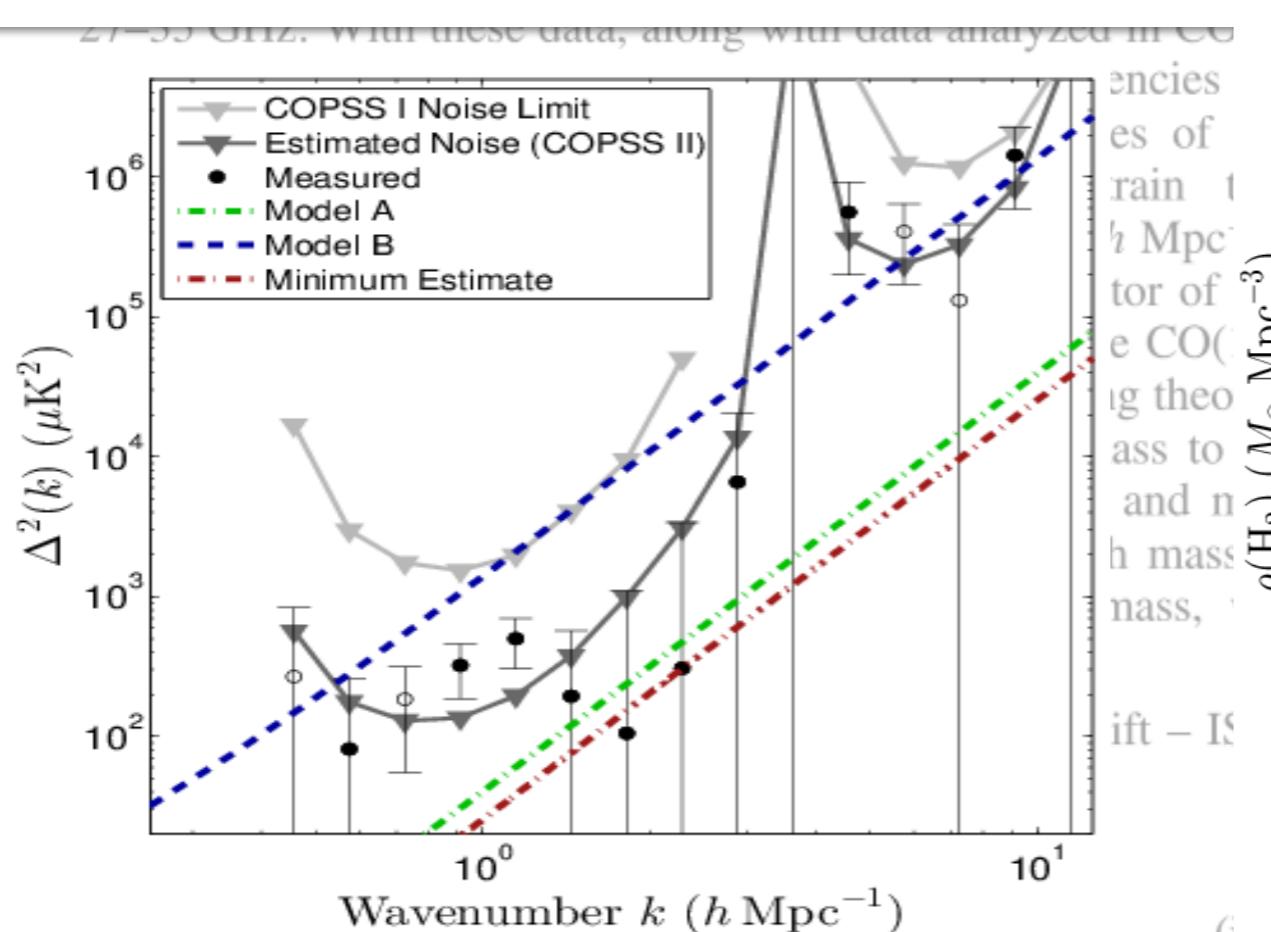


Switzer et al. (2013) - arXiv:1304.3712

# First Detections: CO Power Spectrum Survey (COPSS)

COPSS II: THE MOLECULAR GAS CONTENT OF TEN MILLION CUBIC MEGAPARSECS AT REDSHIFT  $z \sim 3$

- Targeting CO(1-0) at  $z \sim 3$  with SZA (27-35GHz).
- Tentative detection ( $2.5\sigma$ ) combining:
  - archival data (1,400 hrs, 44 fields;  
**Keating et al. 2015**)
  - dedicated observing campaign (5,000 hrs, 12 fields;  
**Keating et al. 2016**)
- Results suggest models under-predict abundance of CO emitters at  $z = 2-3$ .



# Experimental Landscape

Experiment	Line	Frequency	Redshift range	Location
HERA	HI	50 – 250 MHz	5 – 27	South Africa
SKA-LOW	HI	50 – 350 MHz	3 – 7	Australia
CCAT-prime	[CII]	185 – 440 GHz	3.3 – 9.3	Chile
TIME	[CII]	200 – 300 GHz	5.3 – 8.5	North America
CONCERTO	[CII]	200 – 360 GHz	4.3 – 8.5	Chile
COPSS	CO	27 – 35 GHz	2.3 – 3.3	North America
mmIME	CO, [CII]	300, 100, 30 GHz	1 – 5	various
AIM-CO	CO	86 – 102 GHz	1.2 – 1.7, 2.4 – 3.0	China
COMAP	CO	26 – 34 GHz	2.4 – 3.4, 5.8 – 7.8	North America
STARFIRE	[CII], NII	714 – 1250 GHz	0.5 – 1.5	Sub-orbit (balloon)
SPHEREx	H $\alpha$ (H $\beta$ , [OII] [OIII]), Ly $\alpha$	60 – 400 THz	0.1 – 5, 5.2 – 8	Space
CHIME	HI	400 – 800 MHz	0.8 – 2.5	North America
HIRAX	HI	400 – 800 MHz	0.8 – 2.5	South Africa
SKA-MID	HI	350 MHz – 14 GHz	0 – 3	South Africa
BINGO	HI	939 – 1238 MHz	0.13 – 0.48	South America

From the Line-Intensity Mapping Status Report (Kovetz, Viero et al. 2017 — [arXiv:1709.09066](https://arxiv.org/abs/1709.09066))

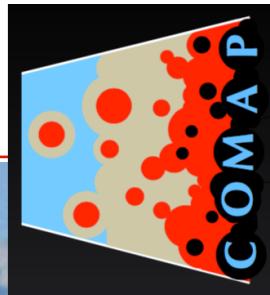


Photo credit Dongwoo Chung

**Caltech**

Kieran Cleary [PI]  
Tony Readhead  
Tim Pearson  
James Lamb  
David Woody

**Stanford**

Sarah Church  
Risa Wechsler  
Marco Viero

Dongwoo Chung  
Tzu-Ching Chang  
Todd Gaier  
Charles Lawrence  
Brandon Hensley

**JPL**

Andrew Harris

Joshua Gundersen



**UiO : Universitetet i Oslo**



**MANCHESTER**  
1824  
The University of Manchester



**ETH zürich**

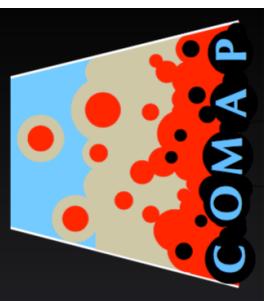
Hans Kristian Eriksen  
Ingunn Wehus  
Marie Foss  
Håvard Ihle

Clive Dickinson  
Stuart Harper

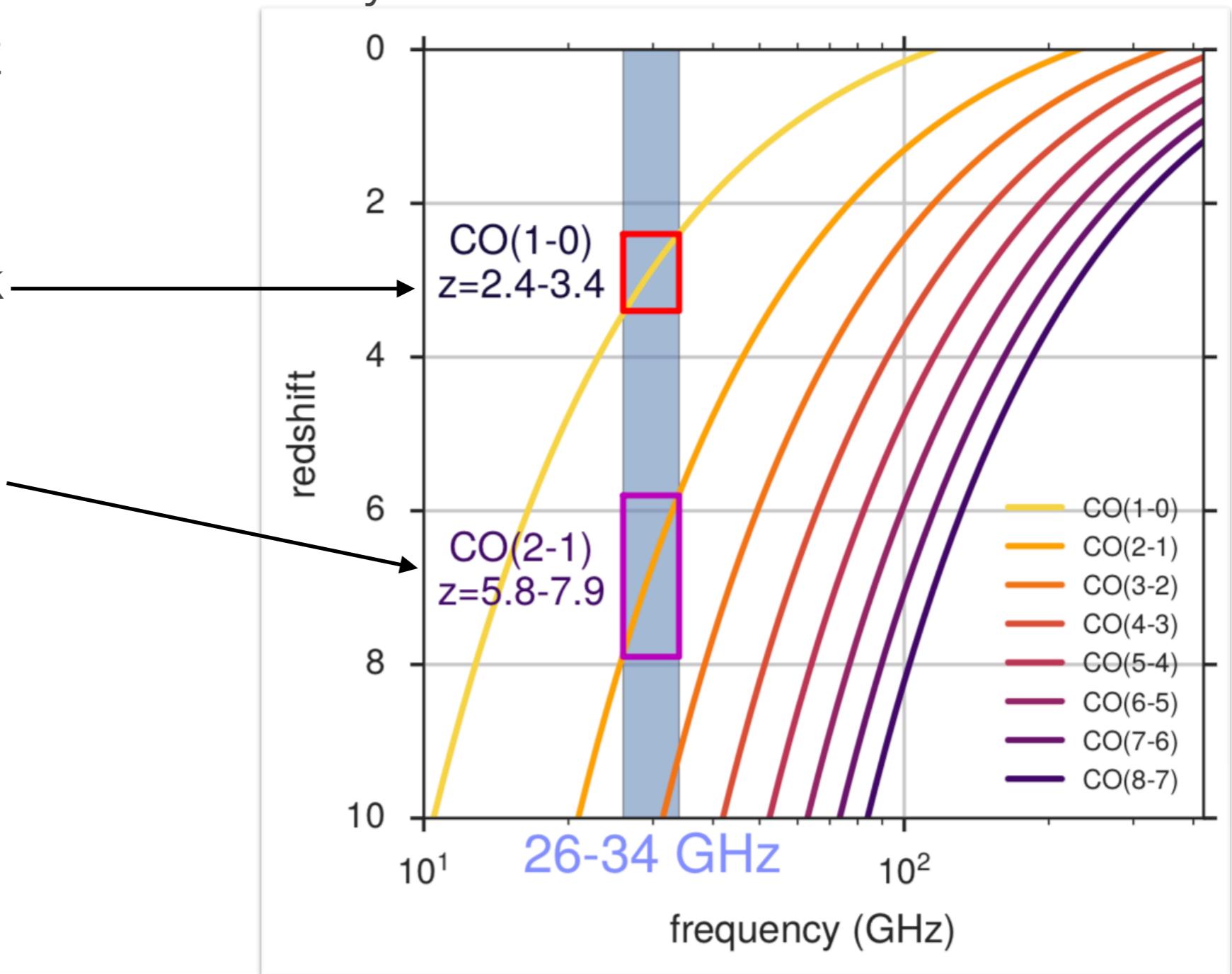
J Richard Bond  
Norm Murray  
Marcelo Alvarez  
Gunjan Lakhiani  
George Stein

Hamsa Padmanabhan

# COMAP

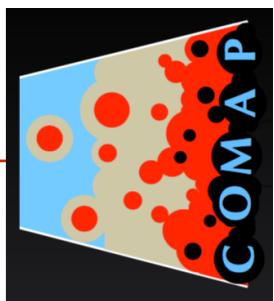


- 10 m telescope (formerly CARMA) at Owens Valley Radio Observatory
- 19 pixel, 26-34 GHz
- Targeting:
  - CO(1-0)
    - $z = 2.4\text{-}3.4$ : peak galaxy assembly
  - CO(2-1)
    - $z=5.8\text{-}7.9$ : EoR

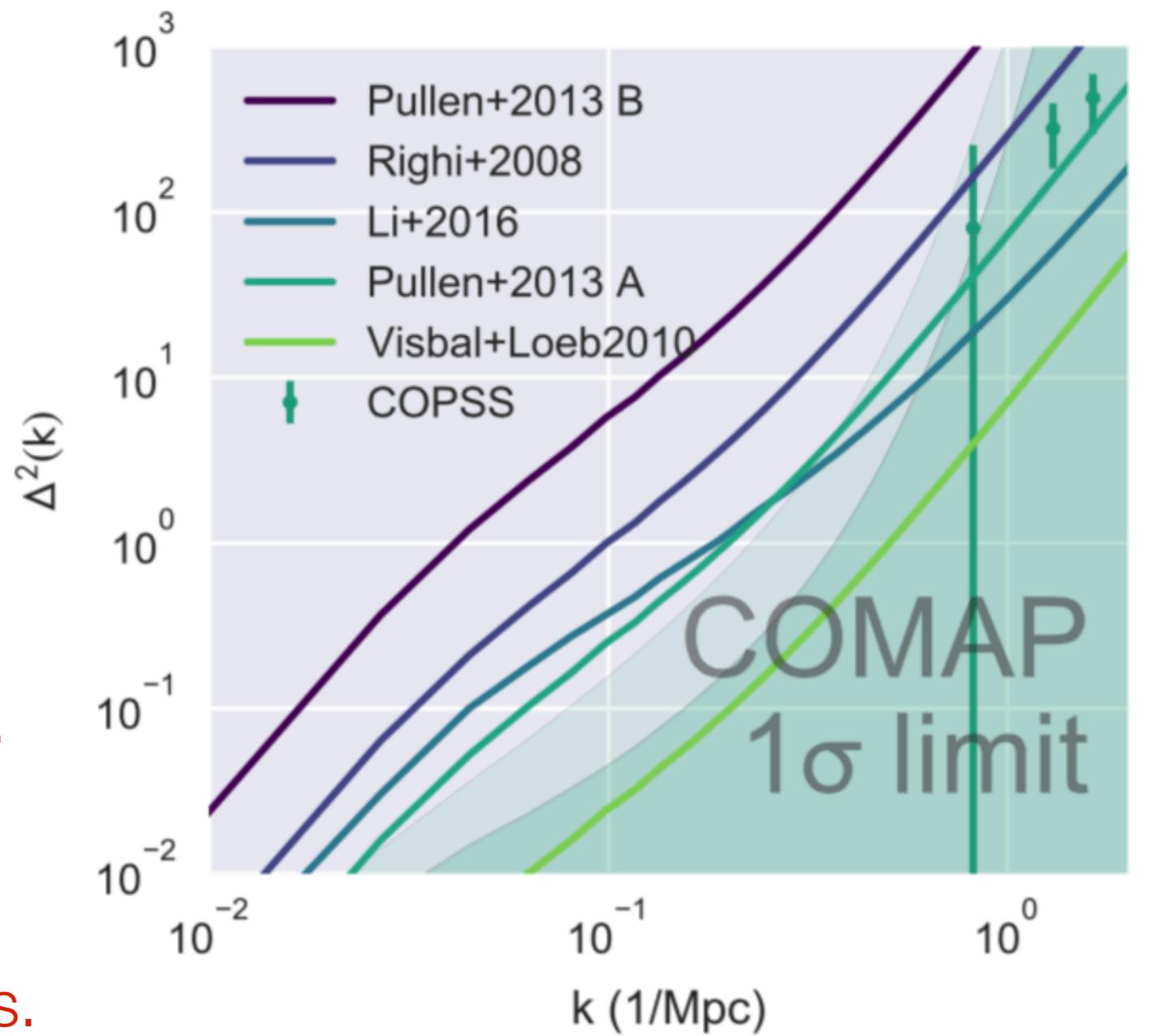


Courtesy Dongwoo Chung

# COMAP

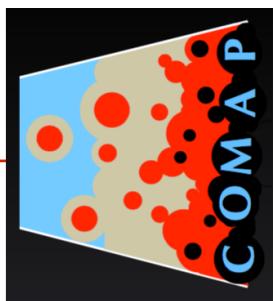


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  - CO(1-0)
    - $z = 2.4\text{-}3.4$ : peak galaxy assembly
  - CO(2-1)
    - $z=5.8\text{-}7.9$ : EoR
- Phase I
  - 1 telescope, 2 years, 3 fields.
  - Project  $>3\sigma$  detection.
- Phase II
  - 5 telescopes, 3 years, 3 fields.
  - Project  $>>5\sigma$  detection.

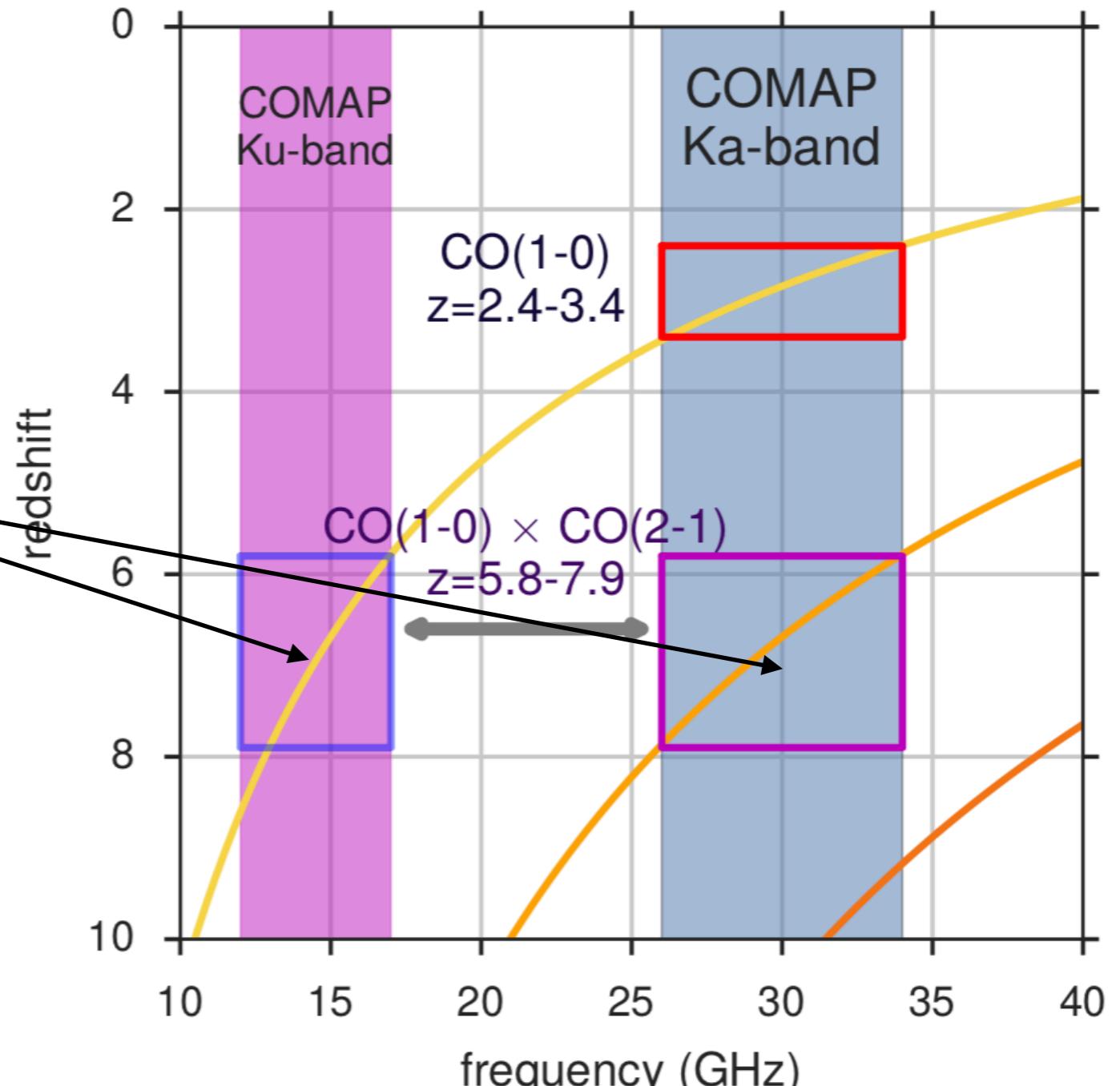


Courtesy Dongwoo Chung

# COMAP



- Phase III ( $z = 5.8-7.9$ )
- Addition of 12-17 GHz (Ku-band)
- Targeting:
  - CO(1-0)
    - $z = 5.8-7.9$ : EoR
  - Cross-correlate to distinguish high- $z$  signal from lower- $z$  foreground in Ka-band
- COMAP commissioning underway:
  - First light expected early 2018.

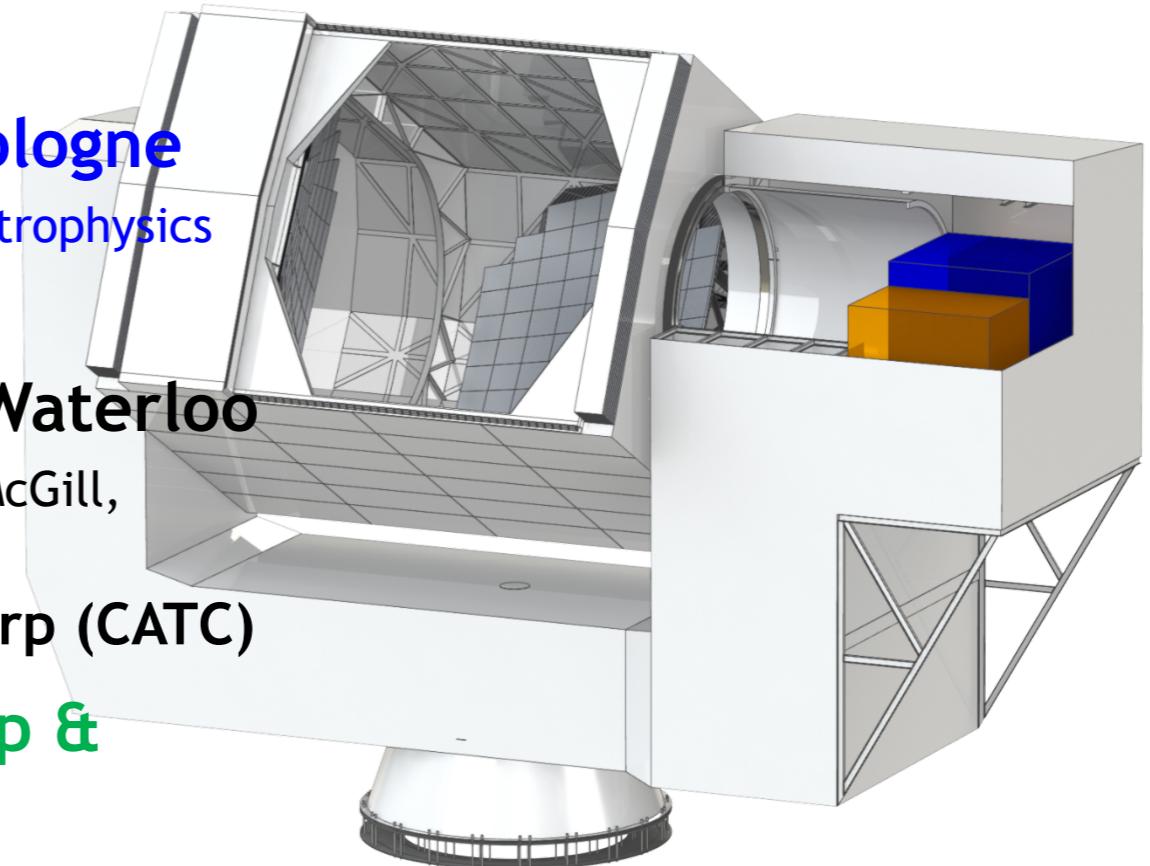


Courtesy Dongwoo Chung

# CCAT-prime



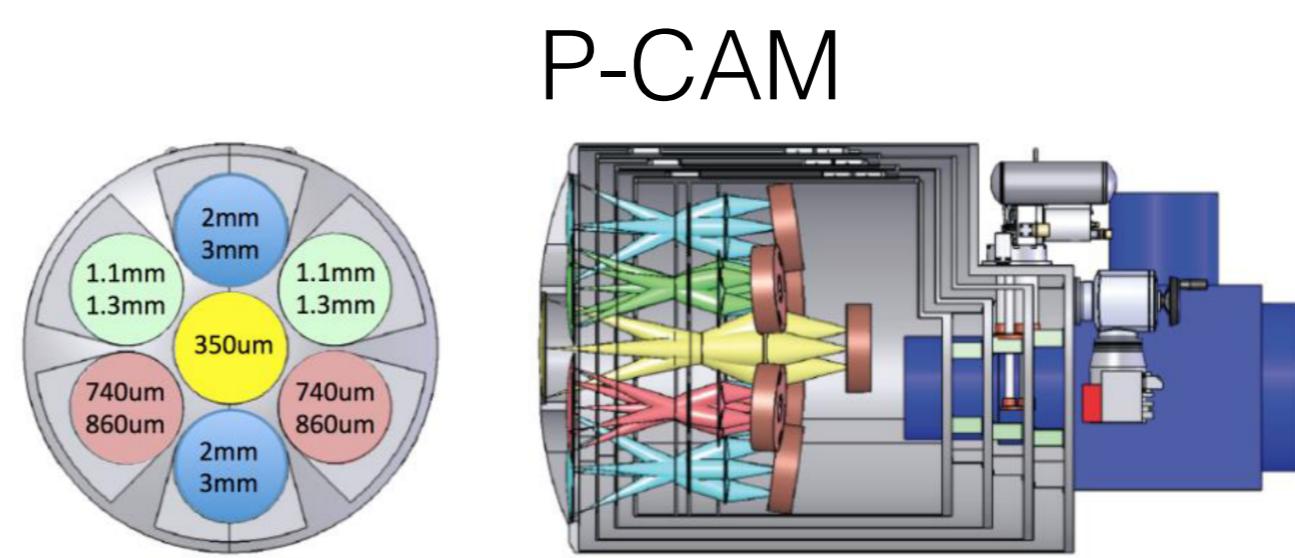
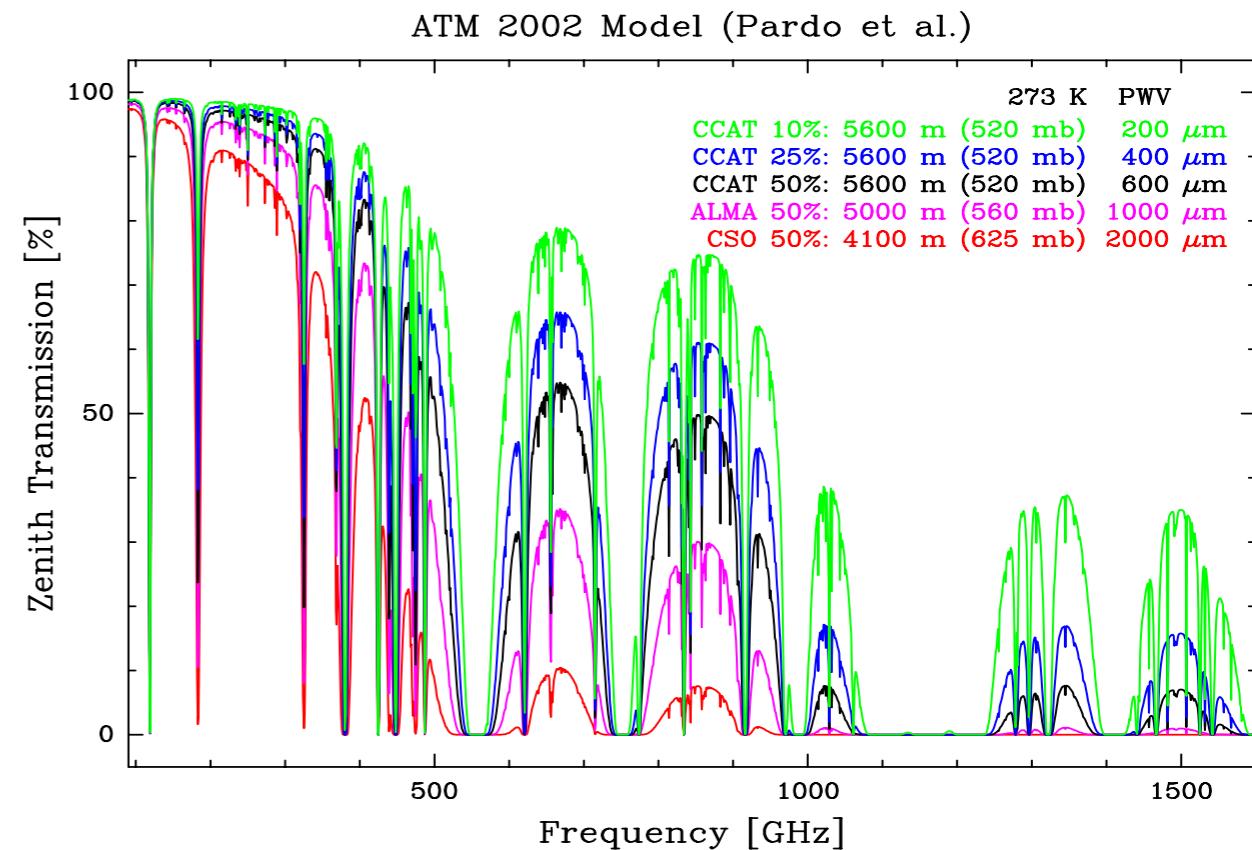
- Cornell University
- German consortium led by University of Cologne
  - Cologne, Bonn, Ludwig Maximilian, Max Planck Inst. for Astrophysics
    - ❖ Formed CCAT Observatory, Inc.
- Canadian consortium led by University of Waterloo
  - Waterloo, Toronto, British Columbia, Calgary, Dalhousie, McGill, McMaster, Western Ontario
    - ❖ Formed Canadian Atacama Telescope Corp (CATC)
- ❖ CCAT is a Joint Venture between CCAT Corp & CATC



Stacey for the Line-Intensity Mapping Status Report – arXiv:1709.09066

# CCAT-prime – Intensity Mapping of CII at High-z

- 6 m crossed Dragone telescope design (Niemack et al. 2015)
- High accuracy (11  $\mu\text{m}$  rms) and throughput optimized for high surface brightness sensitivity.
- ~5 deg FOV
- 20-60,000 pixels per subcamera
- Optimal for science enabled by large-scale (e.g., line-intensity mapping) surveys.
- Will observe [CII] 157  $\mu\text{m}$  line:
  - $z = 3.3\text{-}9.3$ .
  - ~4000 hr over 5 years.
  - 16  $\text{deg}^2$  (COSMOS, UDS, and/or Euclid)



# TIME – Tomographic Ionized-Carbon IM Experiment



**Caltech**

Jamie Bock  
Matt Bradford  
Yun-Ting Cheng  
Abby Crites  
Steve Hailey-Dunsheath  
Jonathon Hunacek  
Roger O'Brient  
Lorenzo Moncelsi  
Corwin Shiu  
Zak Staniszewski  
Jason Sun  
Bade Uzgil (UPenn)

R·I·T

Mike Zemcov

**Stanford**

**UCIRVINE**

**中央研究院**  
ACADEMIA SINICA

**THE UNIVERSITY OF**  
**CHICAGO**

**THE UNIVERSITY**  
**OF ARIZONA**

Marco Viero

Asantha Cooray  
Yan Gong

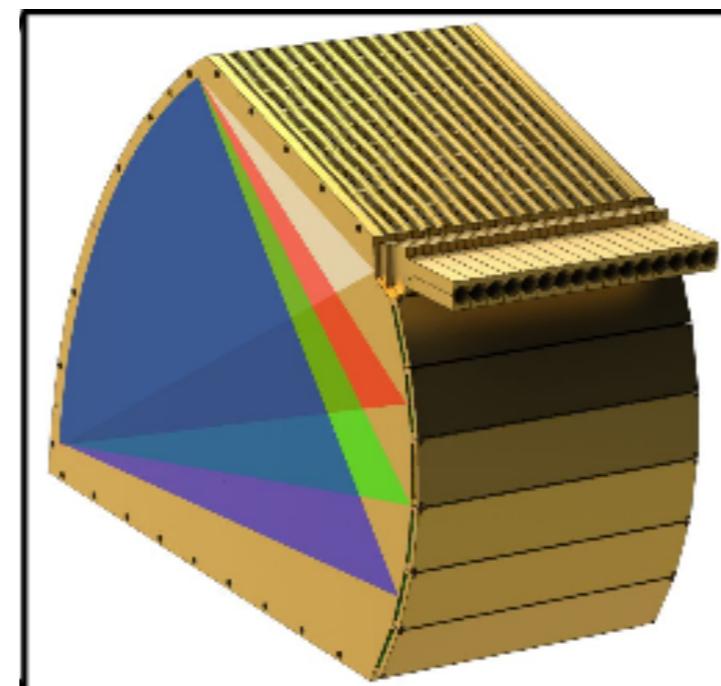
Tzu-Ching Chang  
Patrick Koch  
Chao-Te Li

Erik Shirokoff

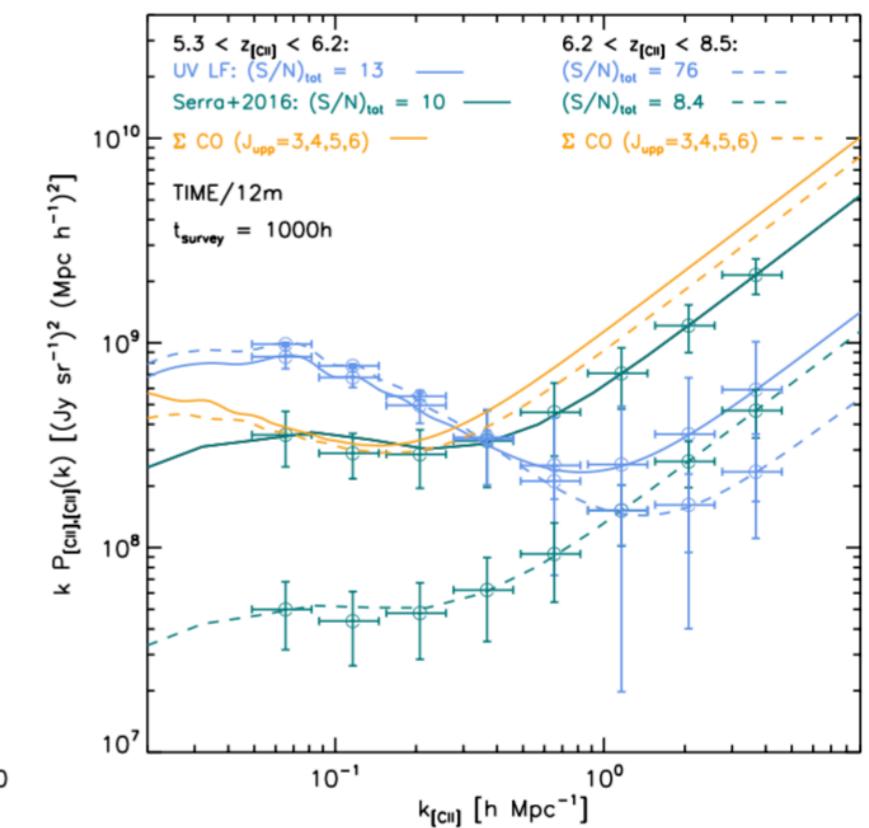
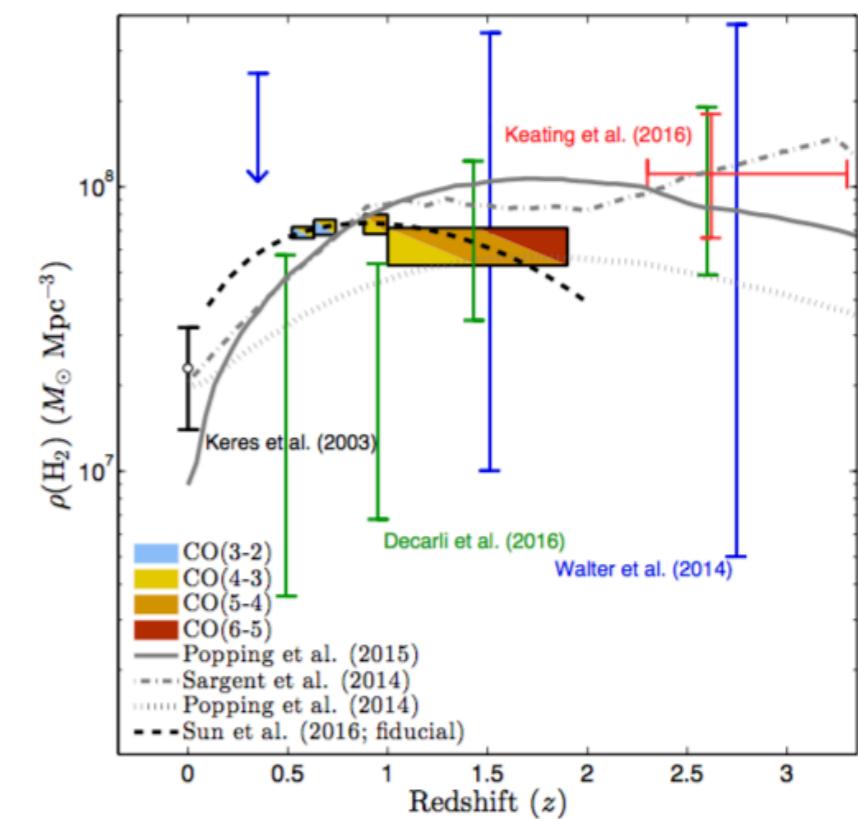
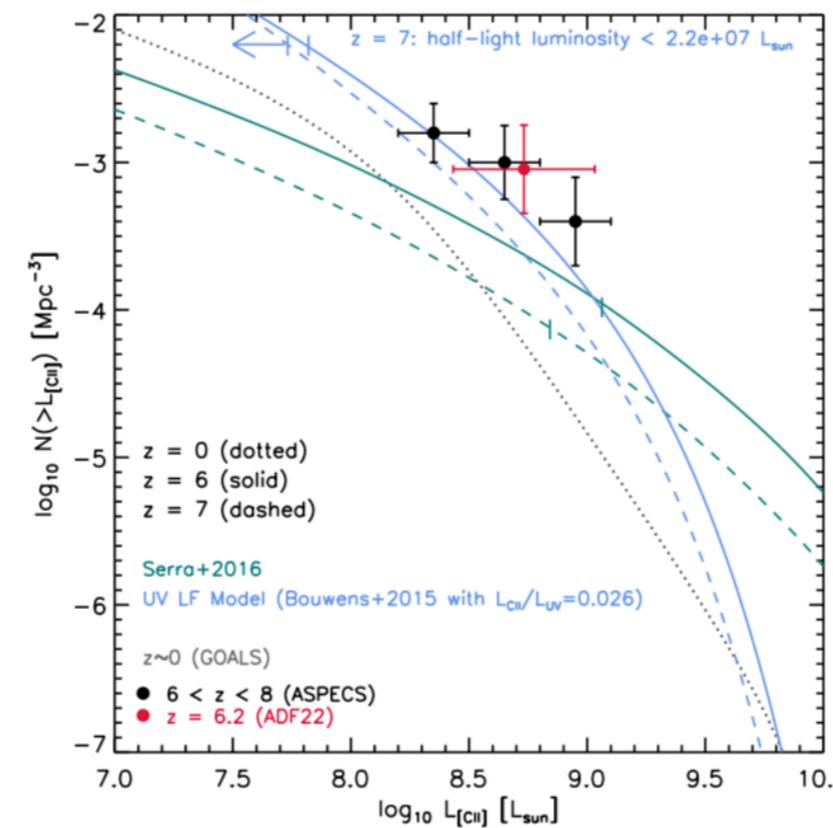
Dan Marrone  
Isaac Trumper  
Karto Keating

# TIME – Tomographic Ionized-Carbon IM Experiment

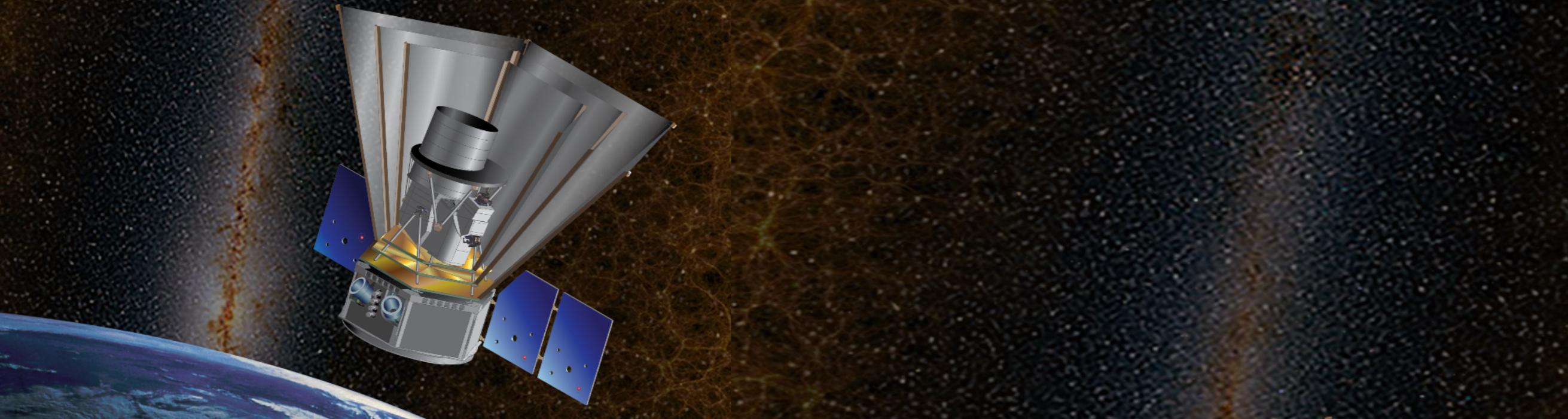
- Targeting:
  - CII
    - $z = 6\text{-}8$ : EoR
  - CO(2-1)
    - $z = 1\text{-}2$ : peak galaxy assembly



- Instrument
  - 2x16 Grating Spectrometers
  - 2000 Transition Edge Sensor Bolometers (TESS)
  - Spectrometer resolution  $\sim 100$



# SPHEREx



**Caltech**

Jamie Bock  
Matt Bradford  
Philip Korngut  
Peter Capak  
Dan Masters

And many  
more..

**JPL**

**Argonne**   
NATIONAL LABORATORY

Salmon Habib  
Katrin Heitmann  
Lindsey Bleem

**OHIO STATE**

Chris Hirata

**UCIRVINE**

**R·I·T**

Michael Zemcov

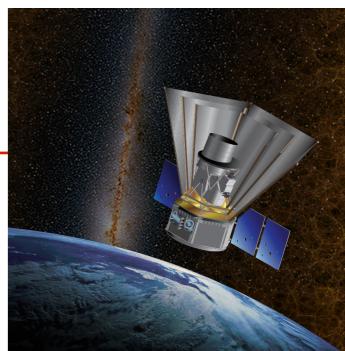
**Stanford**

Olivier Doré  
Steve Unwin  
Michael Werner  
Roland de Putter  
Tim Eifler  
Hien Nguyen  
Brandon Crill  
Tzu-Ching Chang

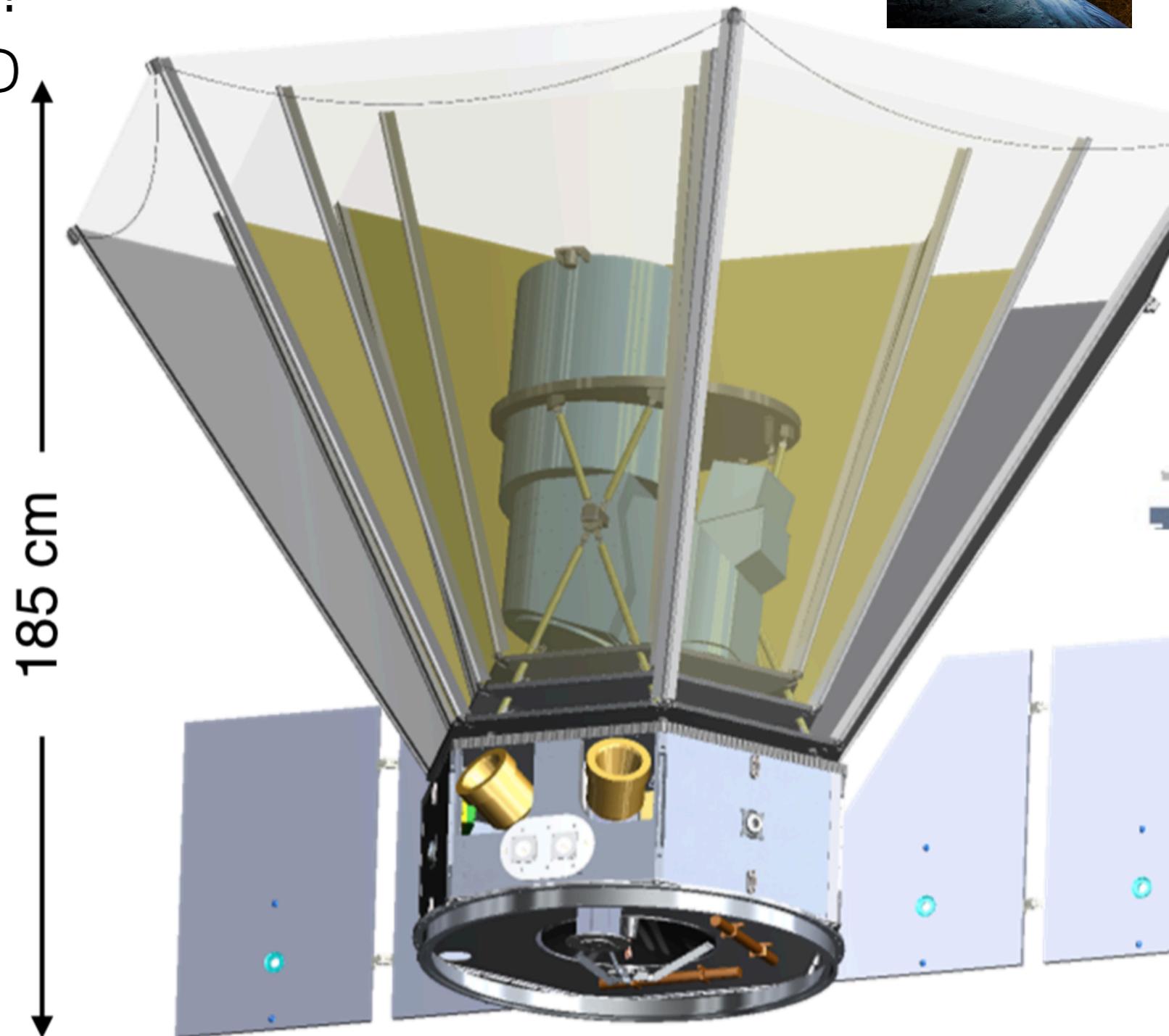
Asantha Cooray  
Yan Gong

Elisabeth Krause  
Marco Viero

# SPHEREx – All Sky Spectral Survey



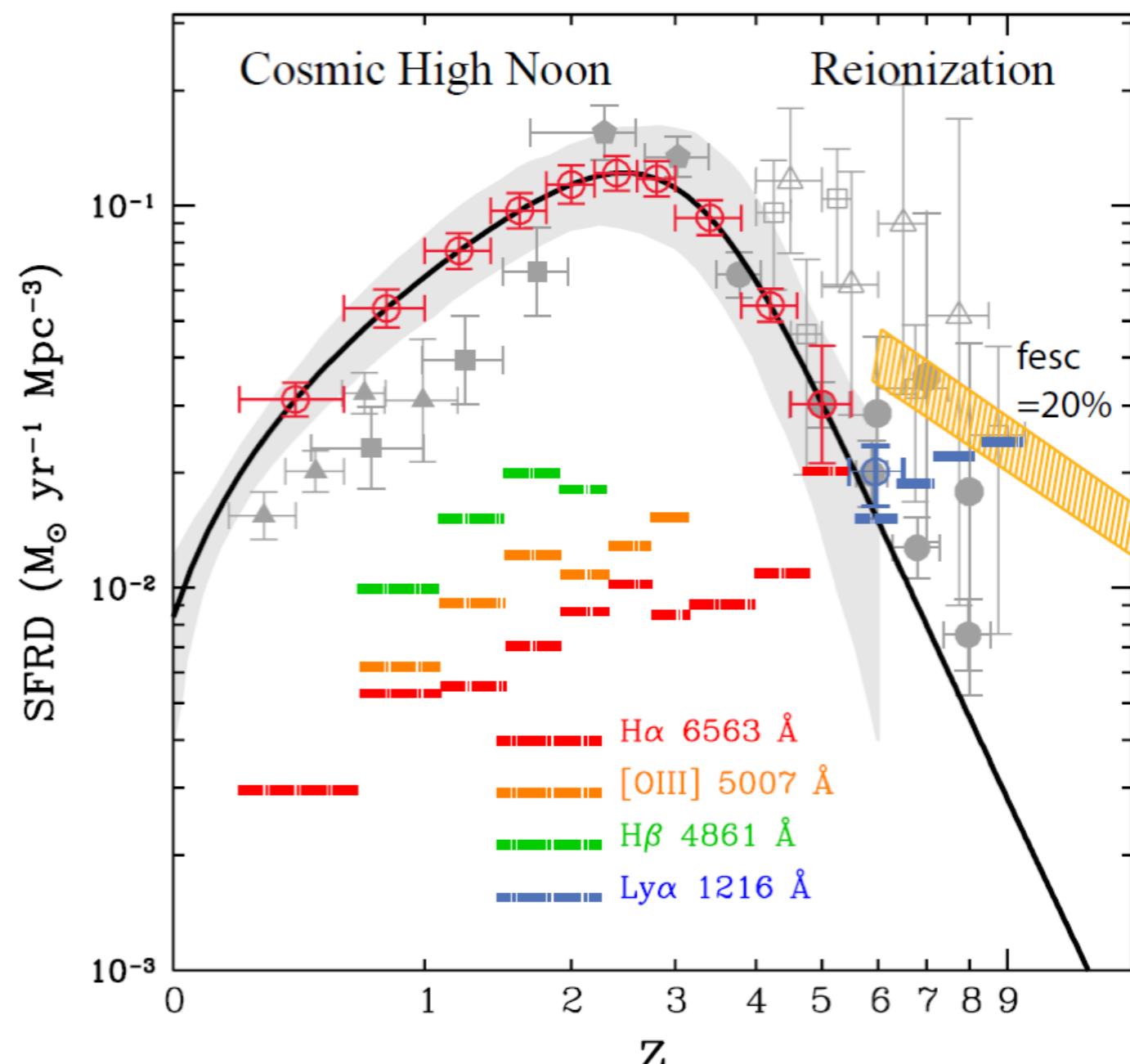
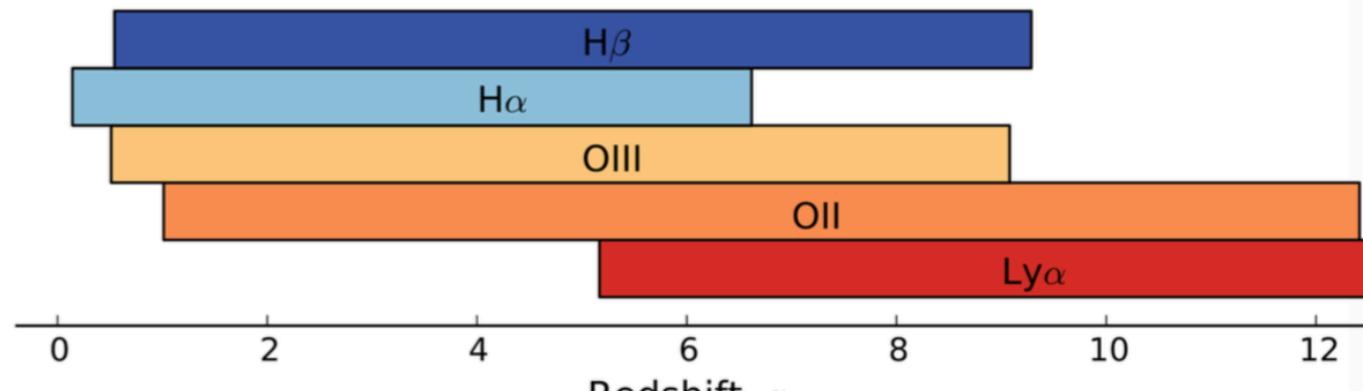
- How did the Universe Begin?
  - Probe Inflation through 3D clustering of galaxies
- How did Galaxies Form?
  - Measure Extragalactic Background Light (EBL) with intensity mapping to probe EoR
- What are the conditions for Life outside Solar System?
  - Measure ice absorption features interstellar ices bring water and organic molecules into protoplanetary systems.



# SPHEREx

- All-sky spectral survey:
  - 20 cm telescope
  - $3.5^\circ \times 7^\circ$  FOV
  - 6" pixels
  - $\lambda = 0.75 - 5 \mu\text{m}$
  - $\lambda/\Delta\lambda = 41.5 \& 135$  (96 channels)
- 100 square degree deep-fields targeting:
  - H $\alpha$ , H $\beta$ , OIII at  $z=0.5-5$
  - Probes Ly $\alpha$  at  $z > 5$
- NASA MIDEX Phase A finalist (decision pending)

Redshift coverage of SPHEREx measured emission lines:



# Summary

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- Since reionization is likely dominated by faint galaxies below the detection limit of upcoming observatories (e.g., JWST, WFIRST), line-intensity mapping will fill the gap in understanding the role of low-luminosity systems in reionization.
- Line-intensity mapping will constrain the evolution of gas in galaxies, helping us describe the star-formation efficiencies in the early Universe.
- Continuum-intensity mapping provides a successful blueprint for measuring and interpreting/modeling statistical measurements.
- The experimental landscape is off to a running start!
  - Its going to be a HARD measurement. But if CIB is a guide, progress will be fast!