

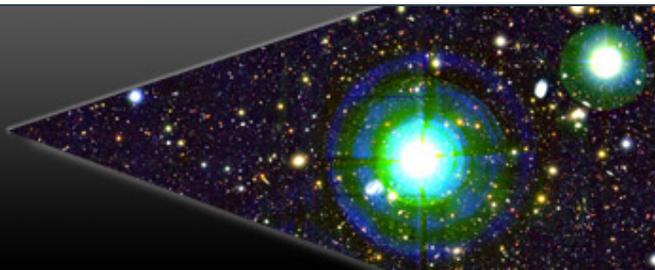
Developing a Detailed Picture of Galaxy and Dark Matter Evolution with WFIRST



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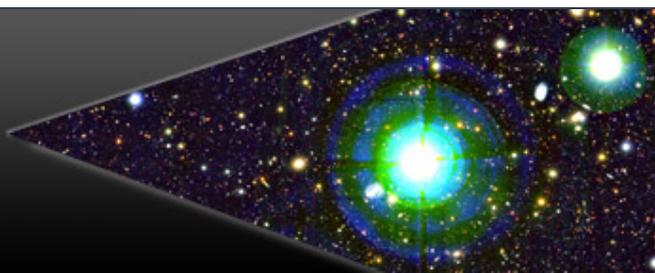
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SPLASH

Overview

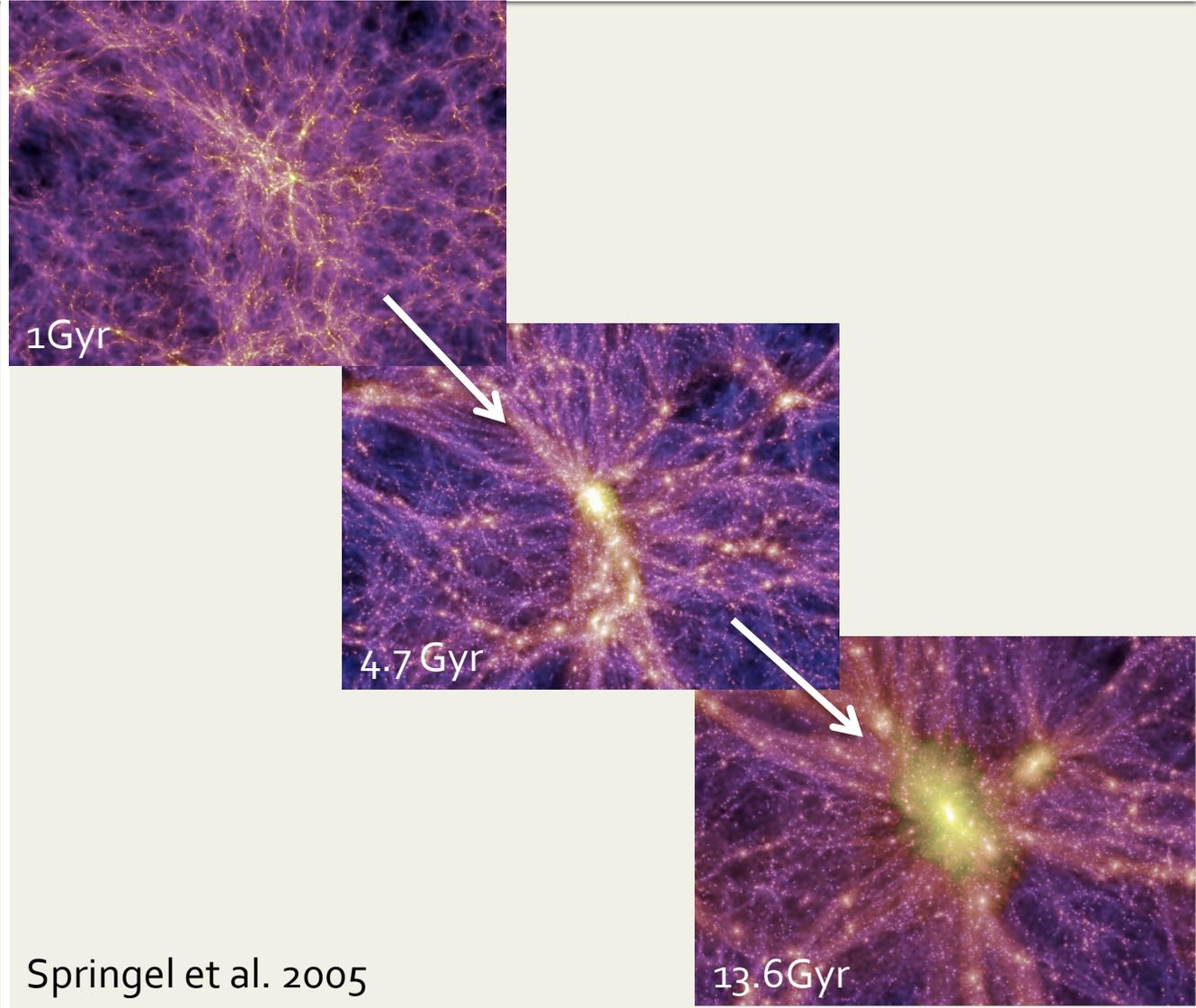
- Large survey astronomy will change how we do galaxy evolution in the 2020s
 - We will form a continuous and granular picture of galaxy evolution
- But this makes detailed studies of individual objects even more important
 - Correlations are only interesting if you understand the physics behind them

2020S



2020S

- Matter makes up ~30% of the universe, the rest is some form of energy
- >90% of matter in the universe is in a dark collisionless form
- Dark Matter (DM) Halos Grow with time
- Evolution determined by gravity



Springel et al. 2005

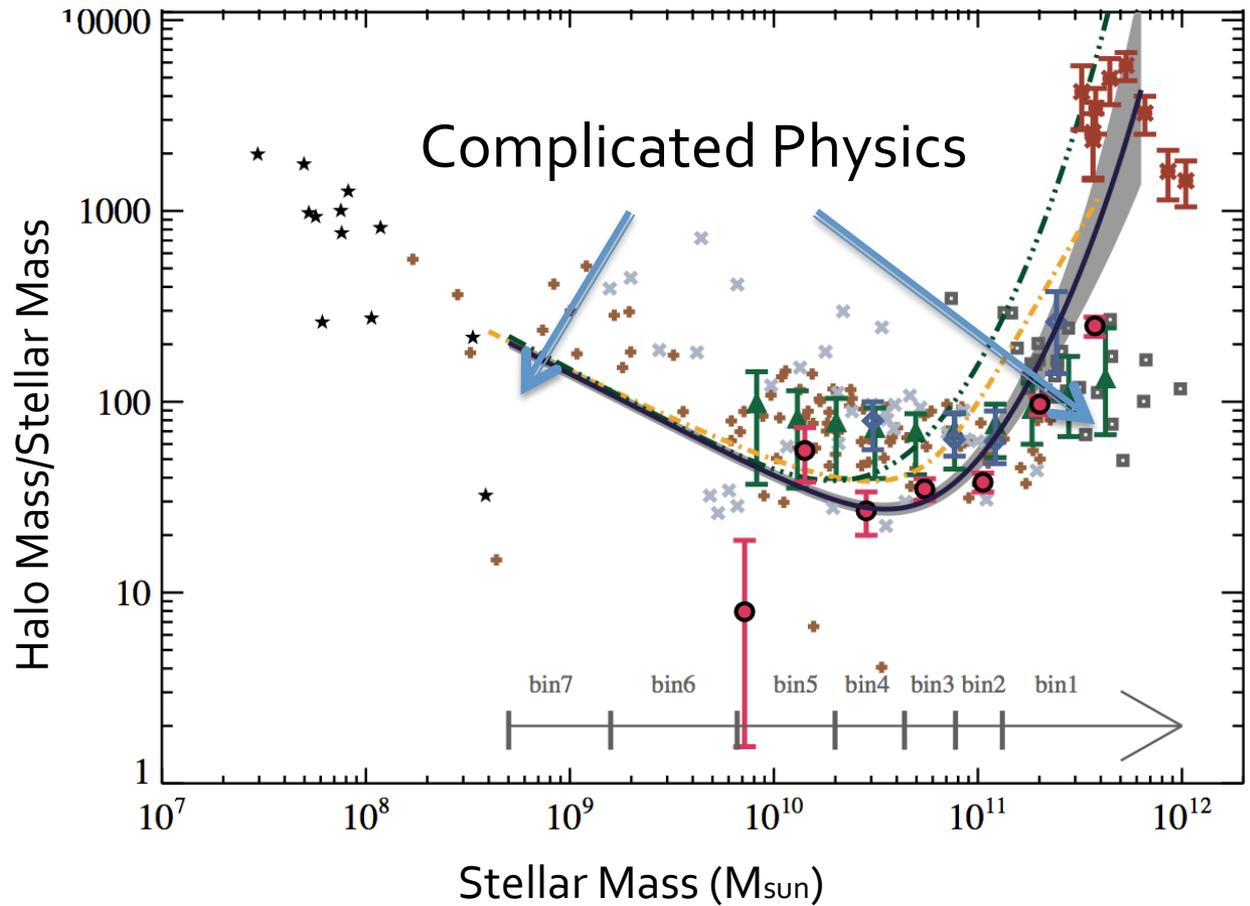
2020s

- Evolution of the DM mass \neq evolution of stellar mass

- Gas accretion / Star formation suppressed at high and low masses

- Best way to link dark matter and galaxy evolution is via statistics

- Clustering
- Lensing shear
- Lensing magnification
- Redshift Space Distortions
- Dynamics
- Abundance Matching

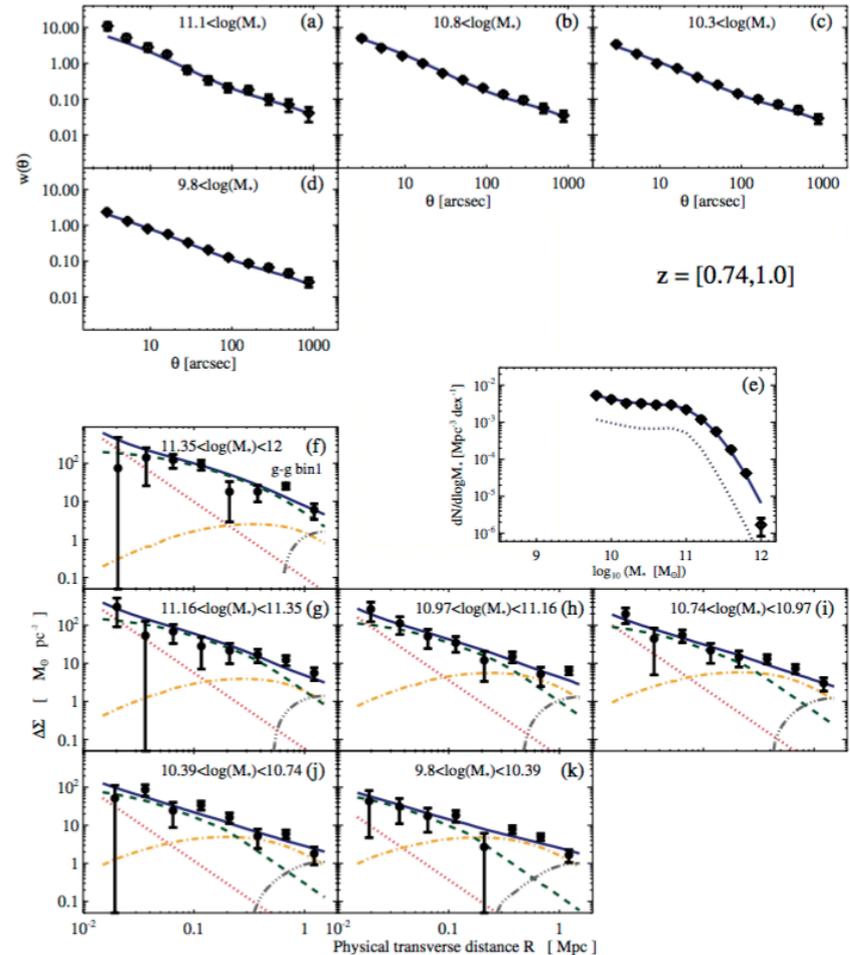


Massey et al. 2007a, 2007b, Leauthaud et al. 2012

2020s

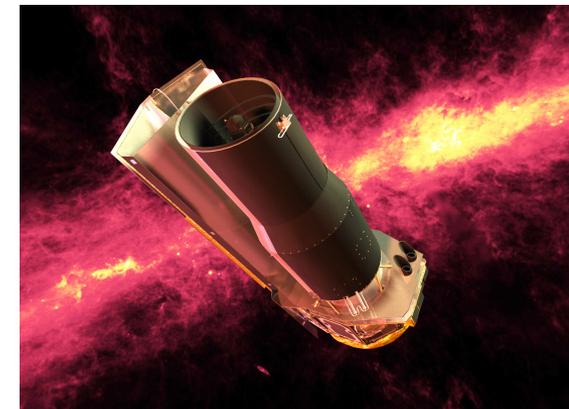
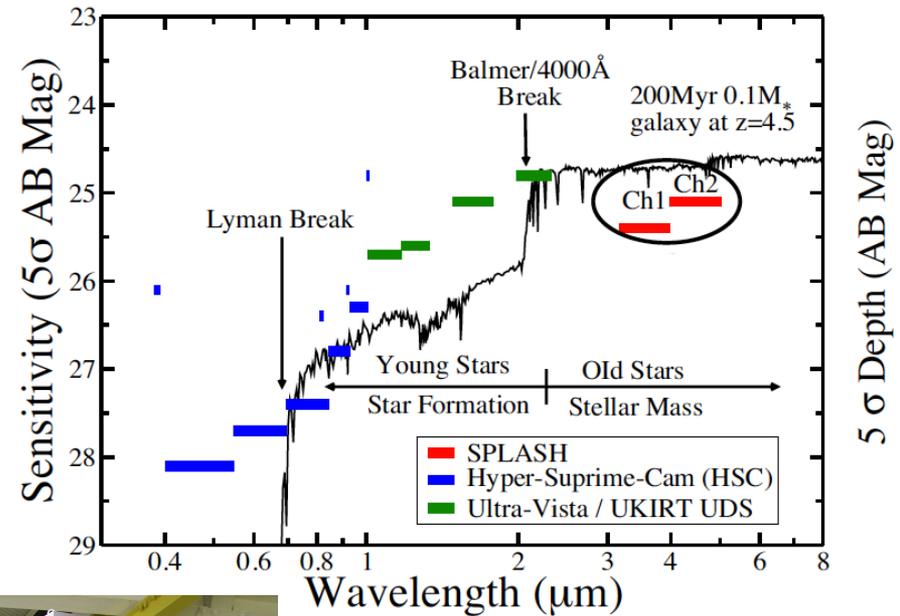


- Same data that measures dark energy measures galaxies
- Can access the dark matter halo properties for samples of galaxies
- Need to define those samples



SPLASH

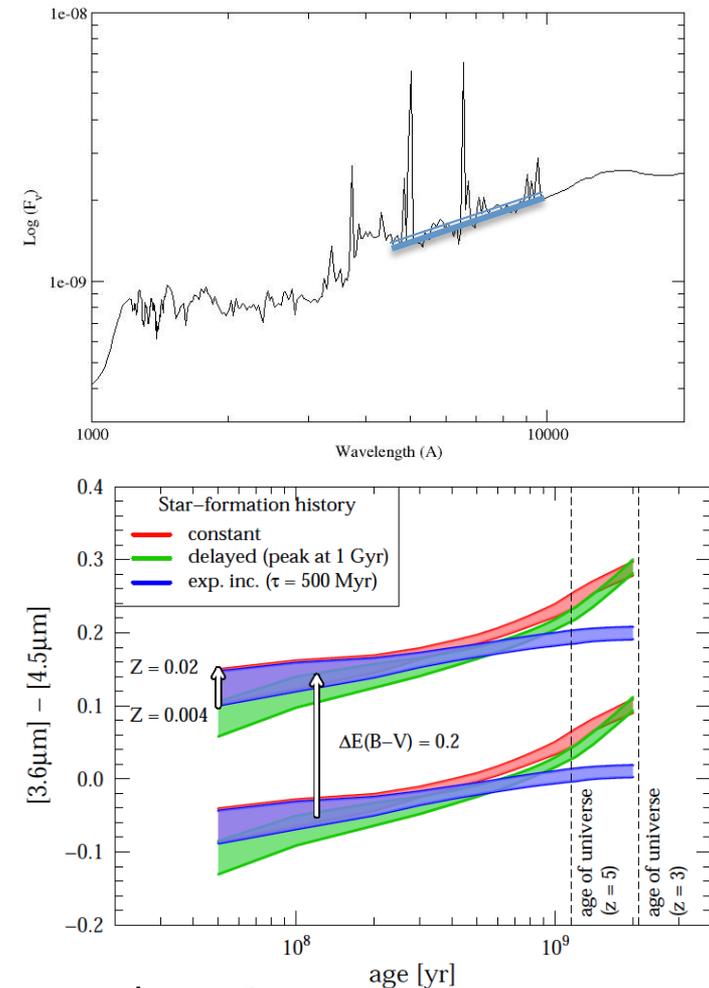
- Survey with Spitzer and Hyper-Suprime-Cam (SPLASH)
- Builds on COSMOS and SXDS/UDS, total of 3.6 sq degrees
- Designed to link visible and dark matter at $3 < z < 7$
 - Deep enough to reach $\sim 0.1 M^*$ at $z \sim 7$ (ch1 ~ 25.5)
 - Wide enough to probe large scale structure at $z > 3$ (3.6 square degrees)
 - Enough objects to enable statistical studies
 - Taken in 18-24 epochs to enable variability studies
- Spitzer is done
- HSC started in 2014
 - Ongoing until 2020



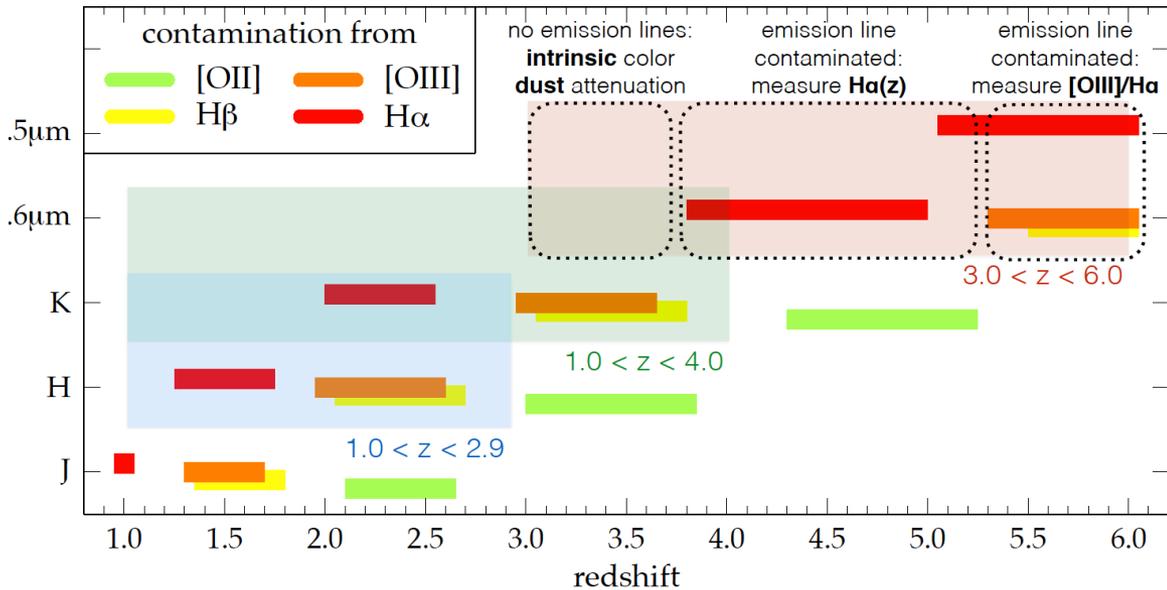
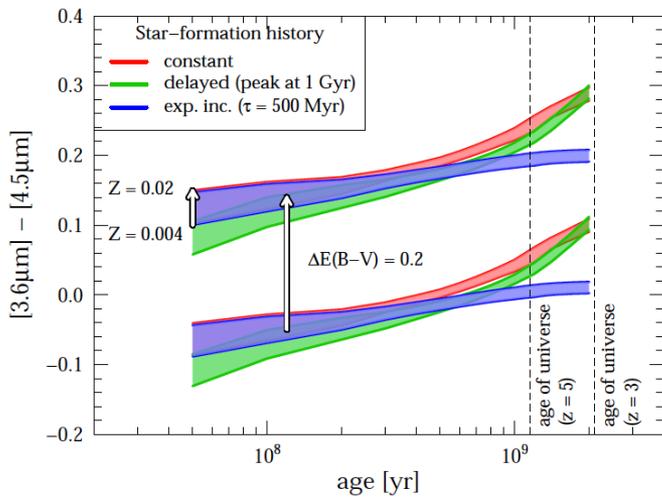
Properties of $z > 4$ galaxies



- Star-formation-Mass relation (Main Sequence) untested at $z > 4$
- Heavily reliant on SED fitting
 - Lots of assumptions
- Specific Star Formation Rate (sSFR) can be measured without any SED fitting
 - $H\alpha$ line luminosity is proportional to prompt star formation
 - Continuum at $0.5\text{-}1\mu\text{m}$ is proportional to accumulated stellar mass
 - So $H\alpha$ equivalent width is proportional to sSFR



Properties of $z > 4$ galaxies

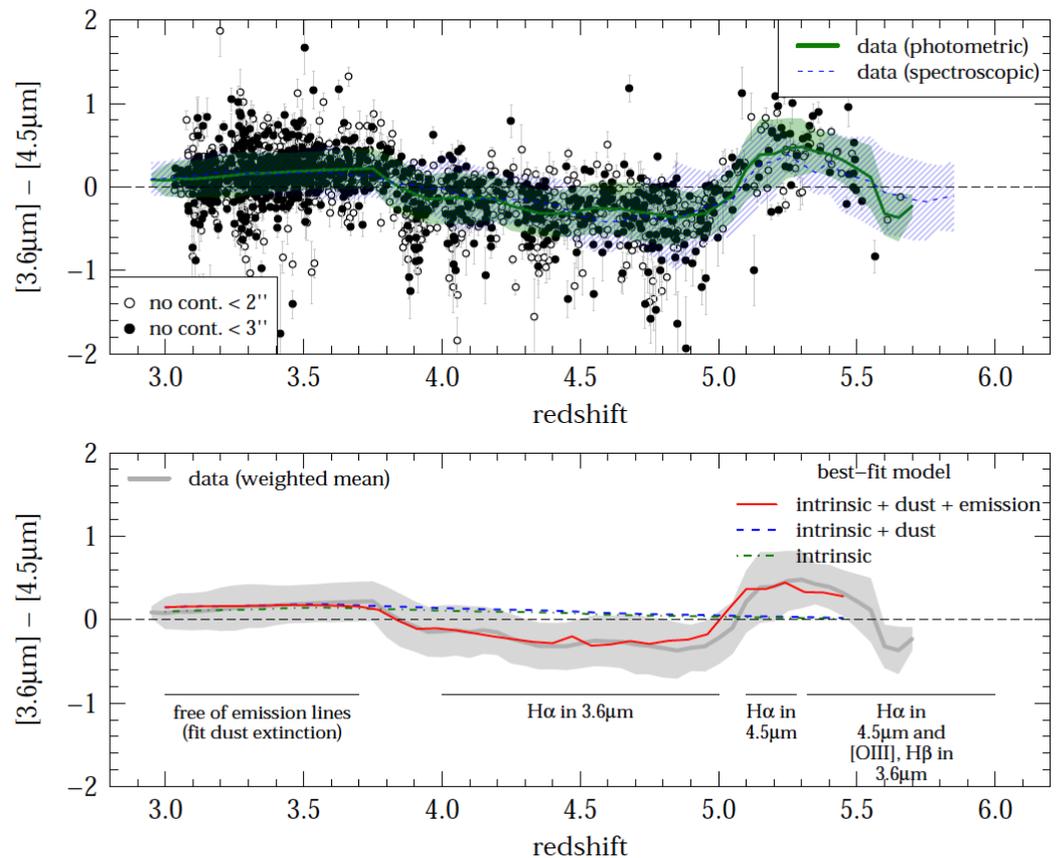


- Can measure $H\alpha$ EW (and other lines) from photometry if redshift is known
 - Need to estimate continuum under line
 - Insensitive to most parameters except extinction
- Need to identify line-free continuum to estimate continuum distribution
- Create a forward model of the galaxy population
 - Age distribution of population, $e(B-V)$ of continuum, $e(B-V)$ of lines, line strengths
 - Smooth evolution in all properties with redshift

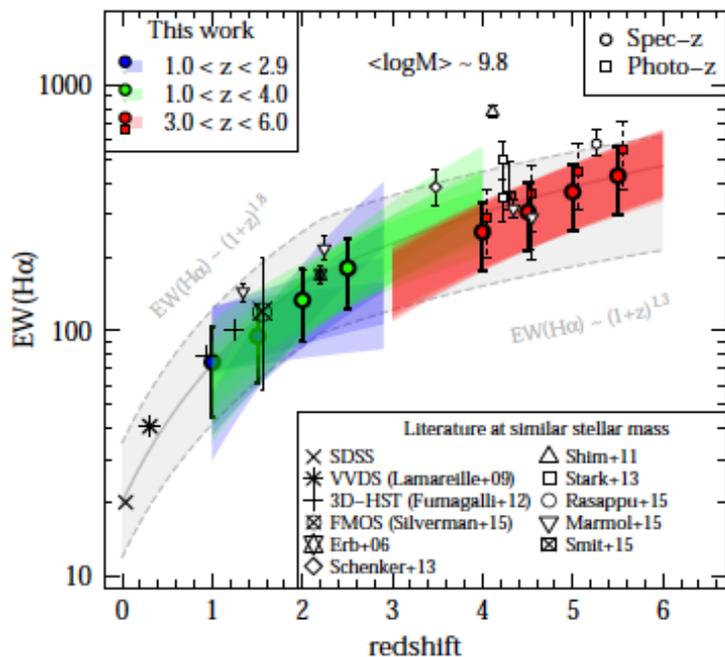
Properties of $z > 4$ galaxies



- Can clearly see signatures in raw photometry
- Both in spec-z and photo-z sample
- Fit our forward model to the data to extract line EW

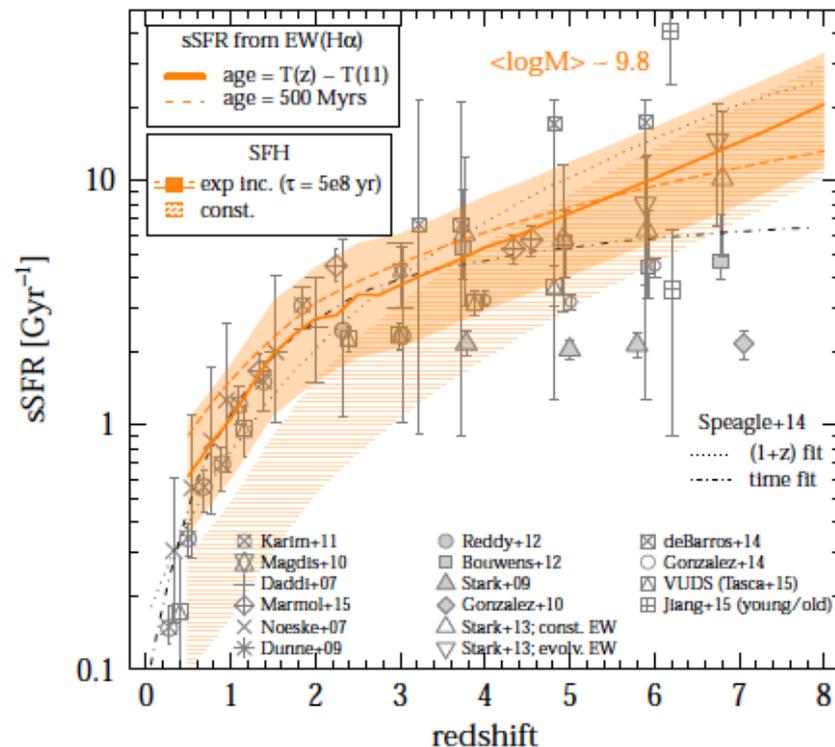


Properties of $z > 4$ galaxies



- Estimate $H\alpha$ EW distribution agrees with direct measurements at lower- z
- Evolution at high- z is lower than but consistent with SED fitting results

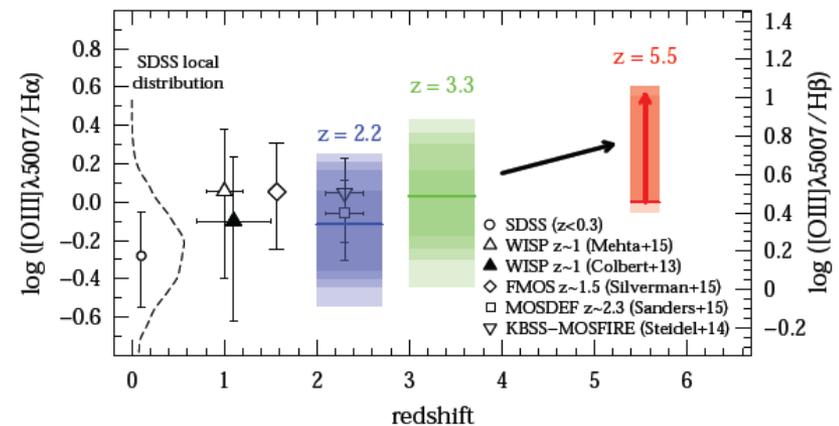
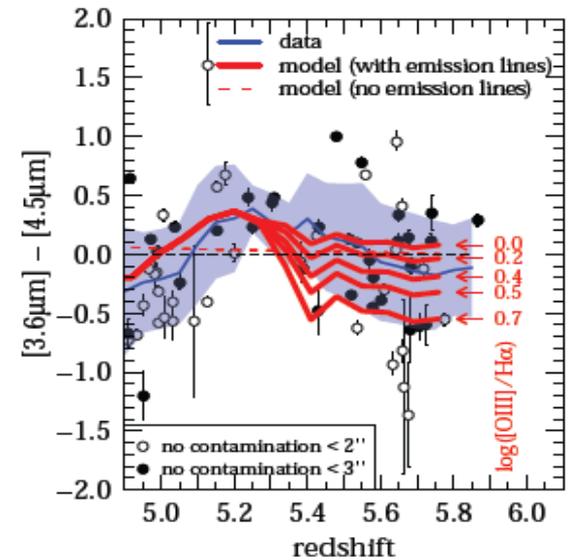
- sSFR also agrees
- Implies continued increase in sSFR to higher redshift



Properties of $z > 4$ galaxies



- $O[III]/H\alpha$ is also measured by our forward model
- Currently just a lower limit
 - Need deeper HSC data to get full distribution at $z > 5.6$



Oceans of Data



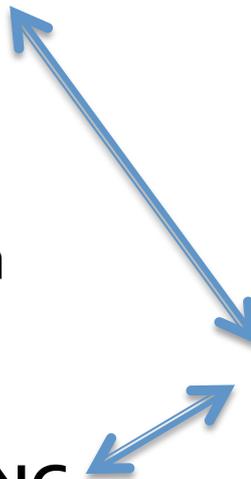
ANALYTIC MODELS

- Fundamental understanding of underlying problem



SUPERVISED LEARNING

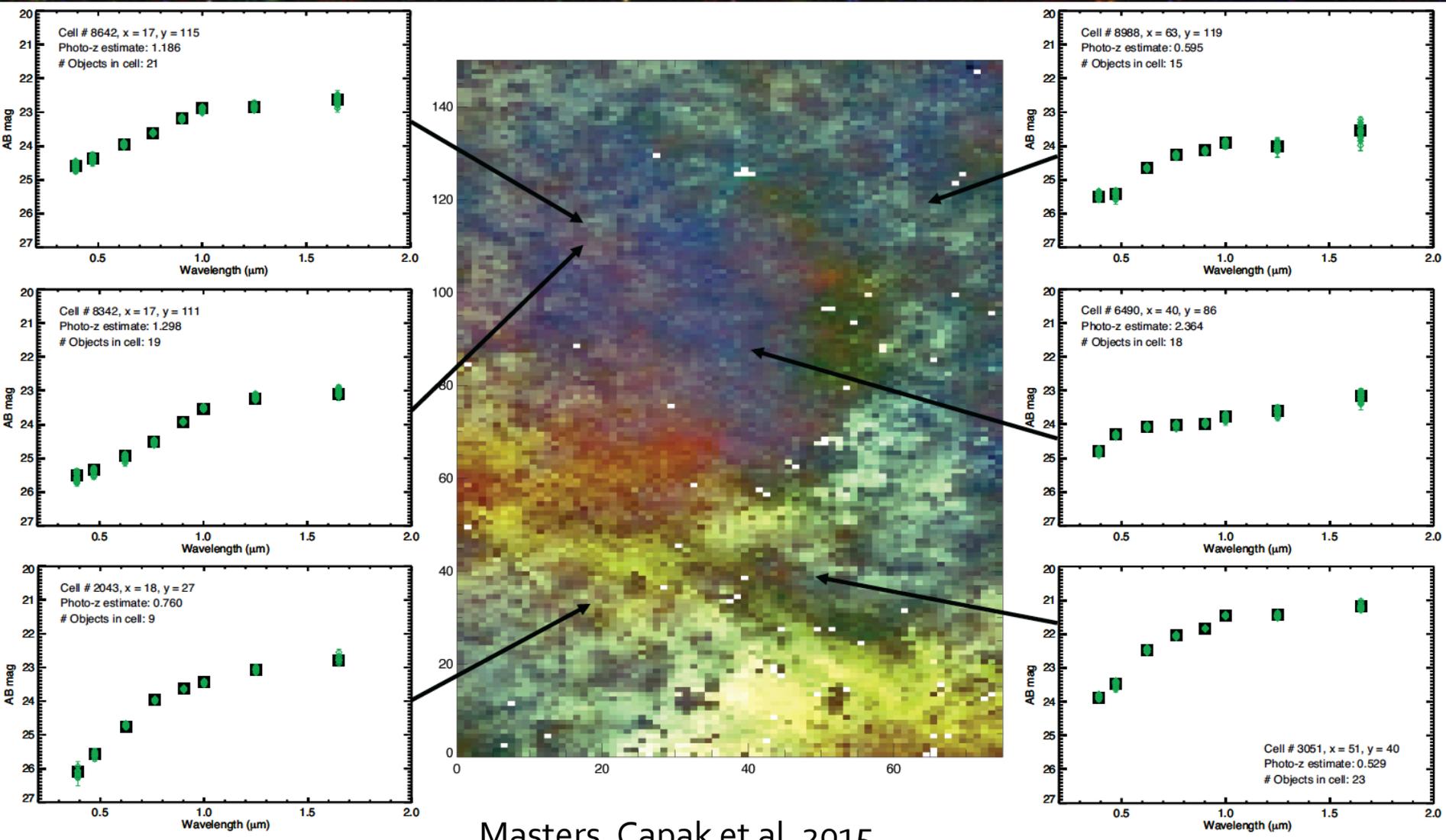
- Create an empirical model of complex systems based on data
- Reproduce human vision/intuition on large data sets



UNSUPERVISED LEARNING

- Discover correlations you didn't know existed
- Visually explore high-dimensional data sets
- Compare analytic models and complex data to look for discrepancies

Oceans of Data

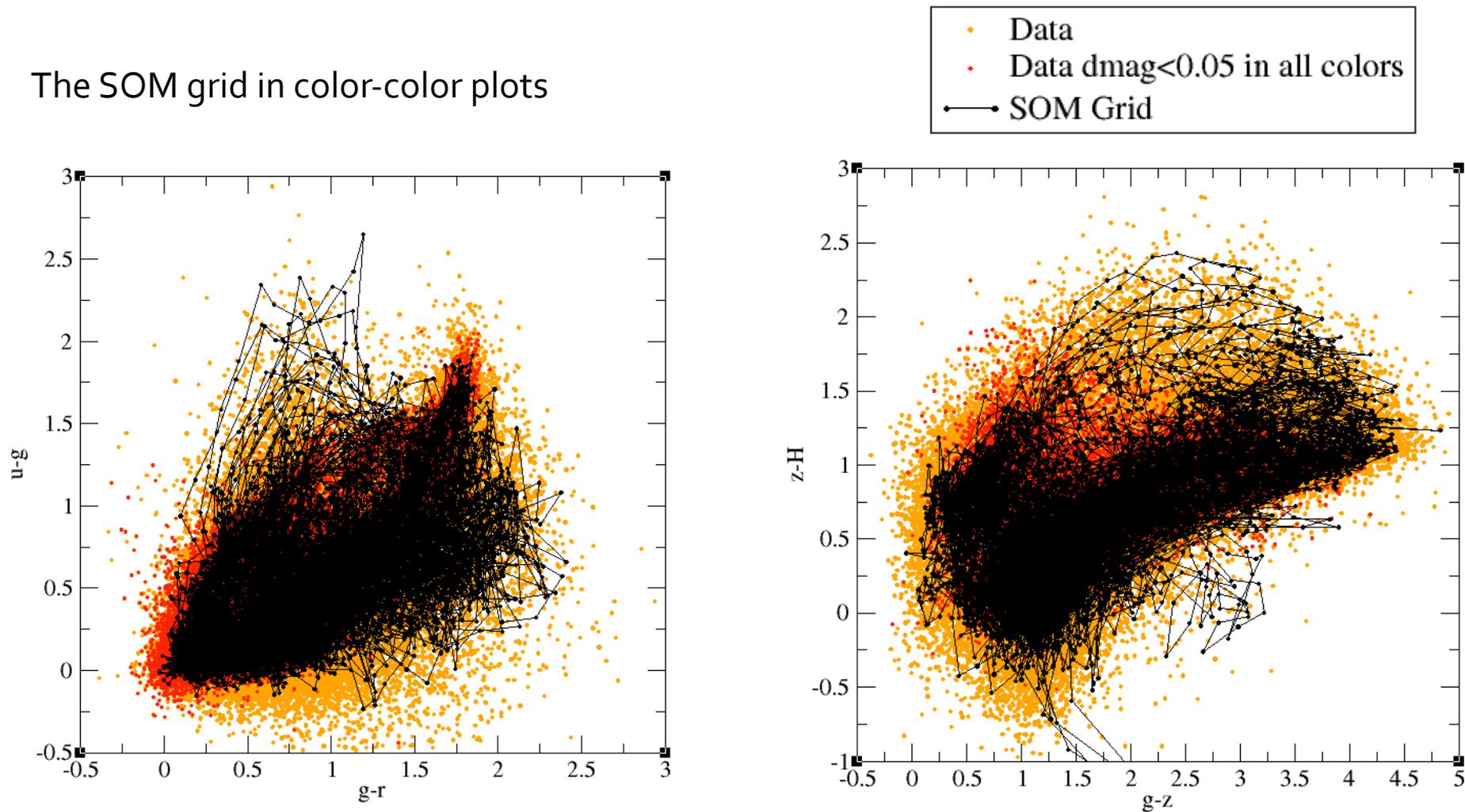


Masters, Capak et al. 2015

Oceans of Data



The SOM grid in color-color plots

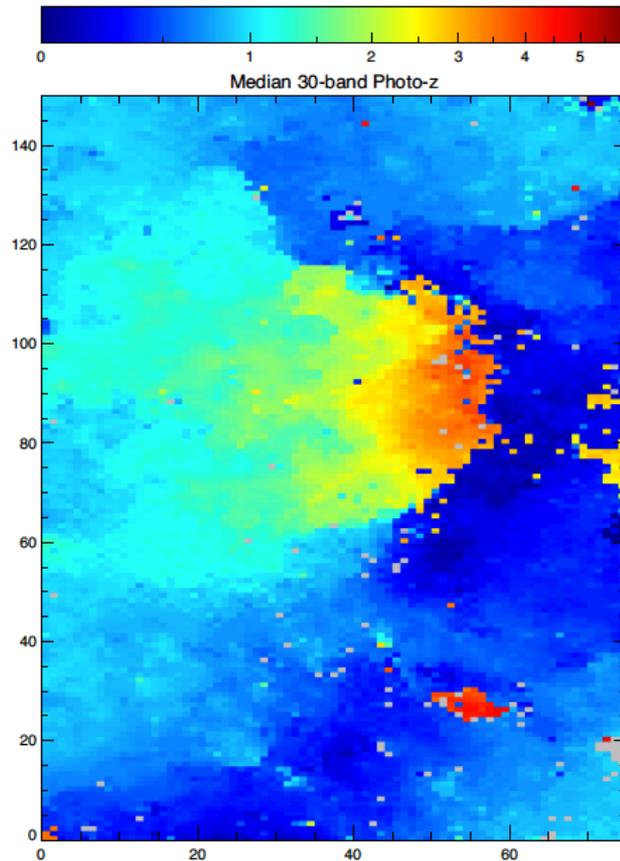


Oceans of Data

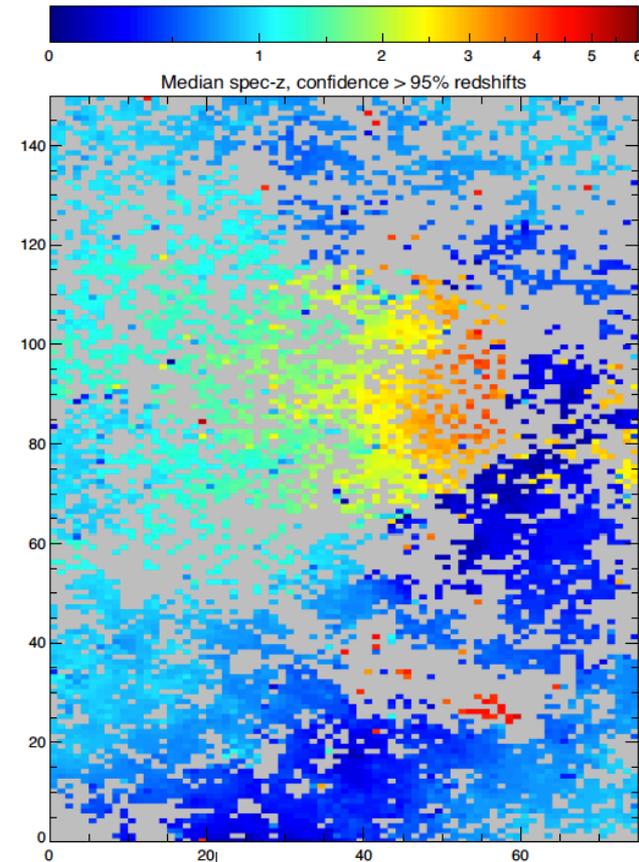


- Photo-z distribution is very smooth over most of color space
- Spec-z are not representative of data
 - Lots of missing area
- Can use SOM to select optimal spectroscopic sample
 - Masters, Capak et al. 2015

Mean photo-z of cell from COSMOS 30-band data



Mean spec-z of cell from COSMOS



Oceans of Data



Explore how well our SED models represent the data

Goodness of fit

Good

Bad

Model

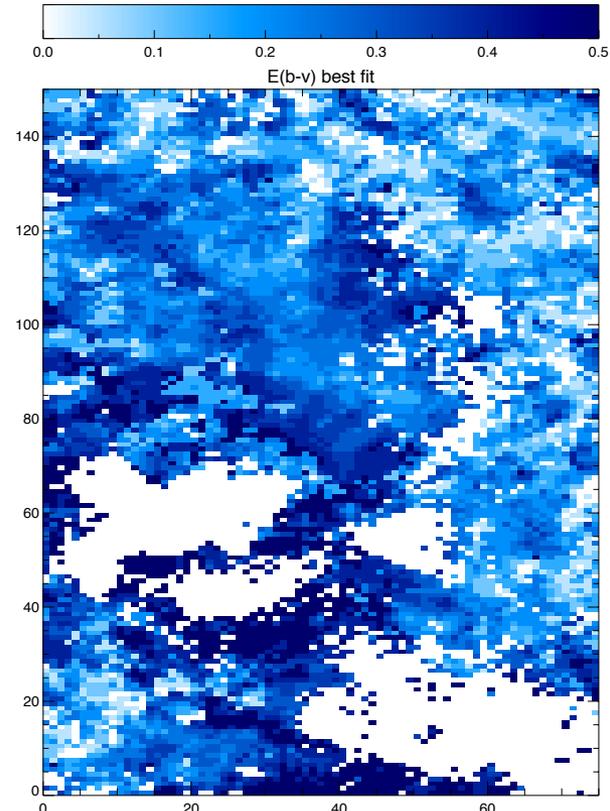
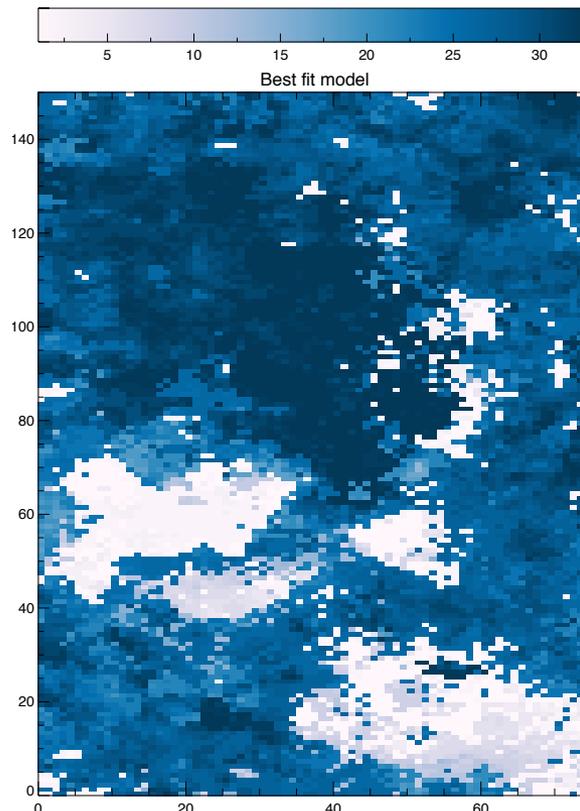
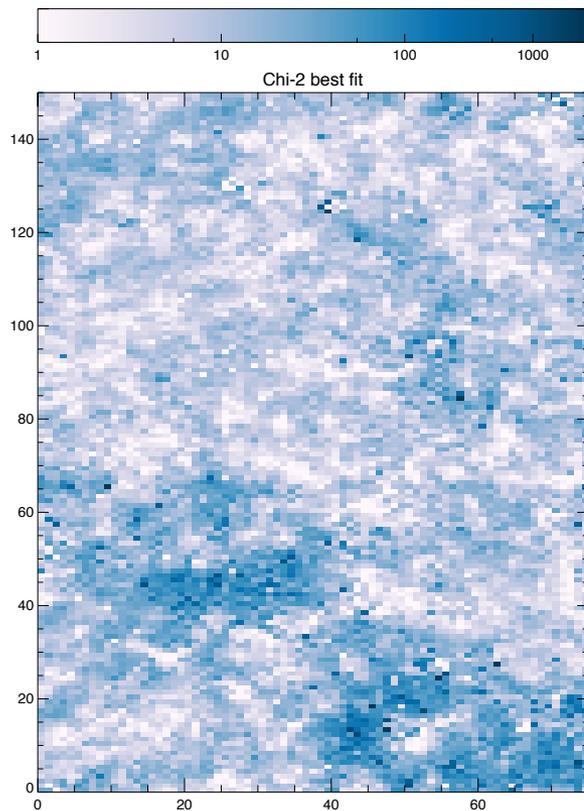
Red

Blue

Dust Obscuration

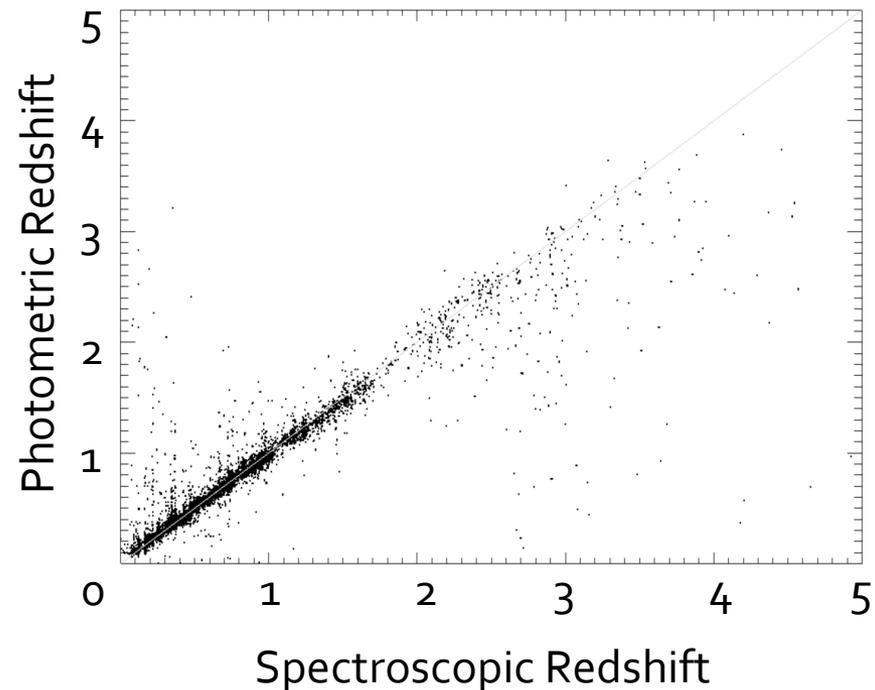
Blue

Red



Oceans of Data

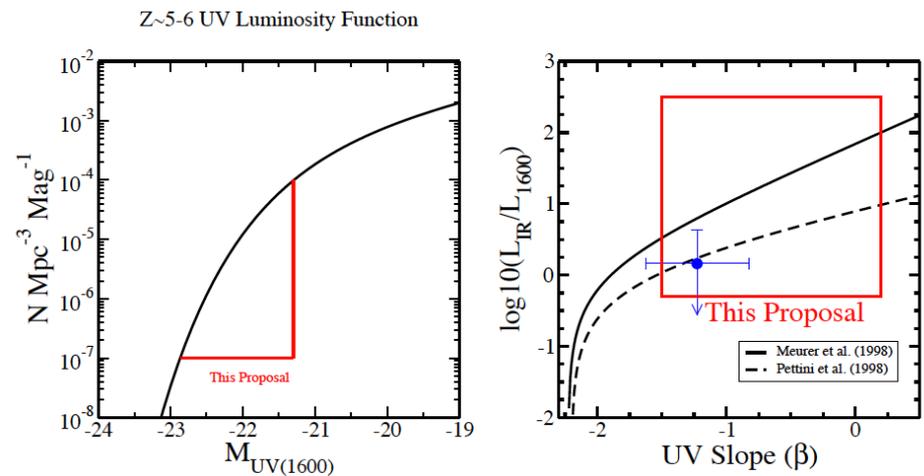
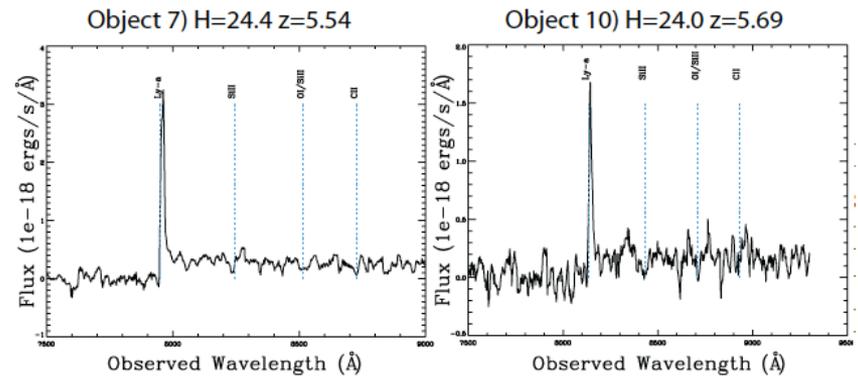
- Preliminary test of photo-z improvement
 - Weight photo-z by likely-hood of model occurring in the data
 - Based on the **photometry and template fitting**, no spectra
 - Using only u,g,r,i,z,Y,J,H photometry
- Significantly improve over raw template fitting
 - Outlier fraction 10.2 -> 1.5%
 - Sigma_NMAD=0.03 -> 0.02
 - Bias = 0.004
- Very preliminary



Rosetta Stones



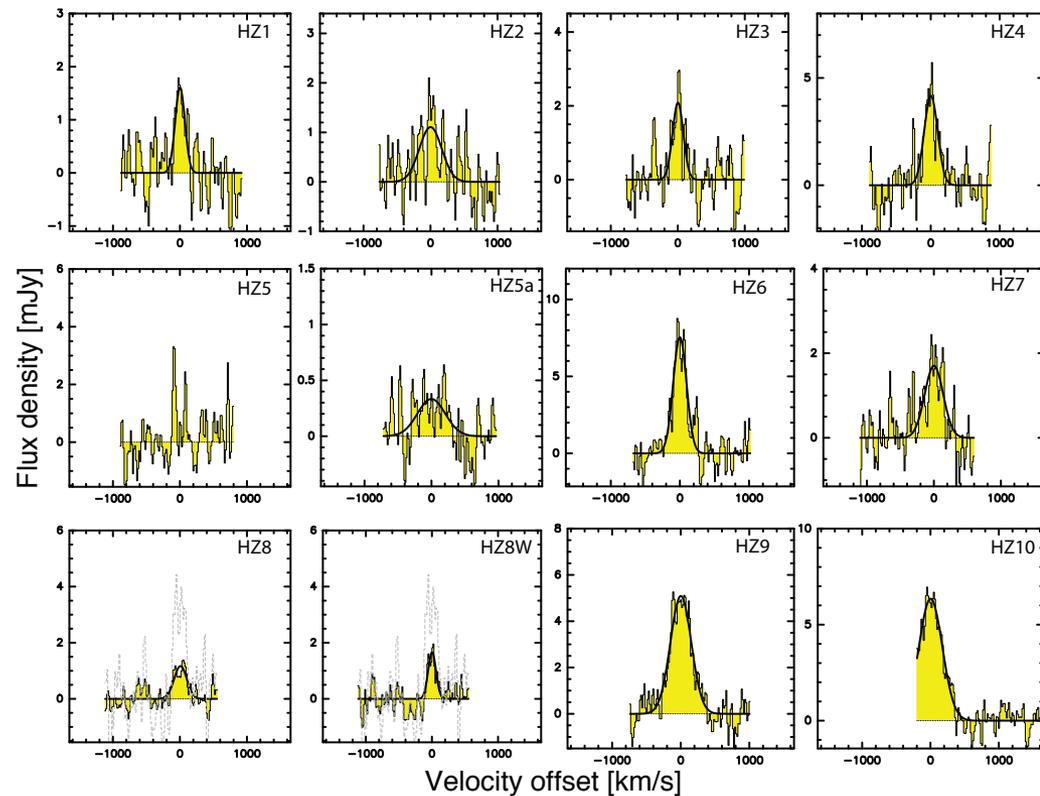
- Are the SFR and Mass estimates correct at $z > 5$?
- Are changes in the ISM driving the main sequence and early galaxy formation?
- Lets check with ALMA!
- Selected 9 “Normal” objects and 1 quasar between $5.2 < z < 6$
- Observed [CII] and continuum
- Set exposure times to unobscured SFR and $L_{\text{CII}} = 10^{-3} L_{\text{IR}}$



Rosetta Stones



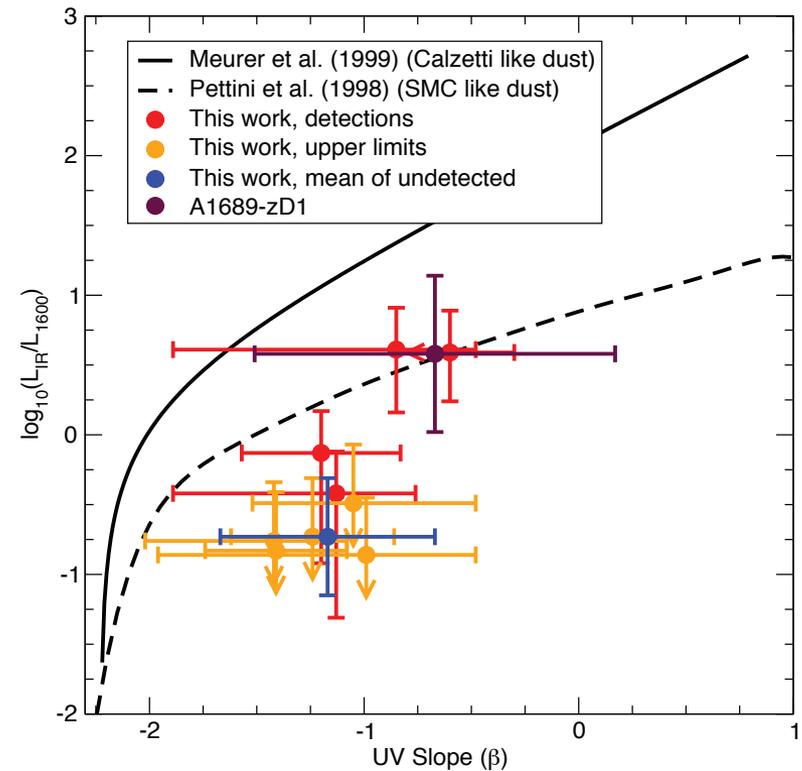
- All detected in [CII]
- Only three objects detected in continuum



Capak et al. (2015)

Rosetta Stones

- Continuum is much fainter than expected
 - $Z \sim 6$ L^* galaxies is $30\mu\text{Jy}$
- $Z \sim 5.5$ galaxies are significantly less obscured than similar $z \sim 3$ systems
 - Factor of $\sim >12$, average >40
- Dust is like that found in low-metallicity systems
- New HST data pushed Beta's blue-ward by $\sim 0.5\text{dex}$
 - Consistent with expected systematic error
 - Probably due to Mamqest bias in Ultra-Vista photometry



Capak et al. (2015)

Conclusions

- In the 2020s large surveys will change how we do astronomy
 - Large statistical analysis to define “normal” and unique objects
 - Links to dark matter
 - All of galaxy evolution is encoded in these statistical distributions
 - Can form a very granular picture of galaxy evolution
- We need to think about what tools we need for this
 - New types of statistics and tools
- We are starting to do this now
 - SPLASH is a pathfinder/precursor to WFIRST surveys
 - Starting to characterize the high- z galaxy population
 - Finding representative and “Rosetta stone” objects to study in detail