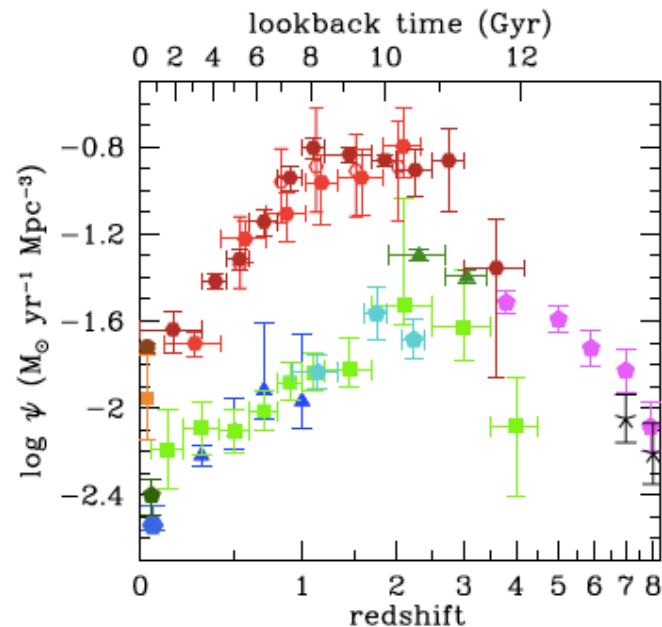


# What do we know about the evolution with redshift of dust attenuation in galaxies?

Véronique Buat

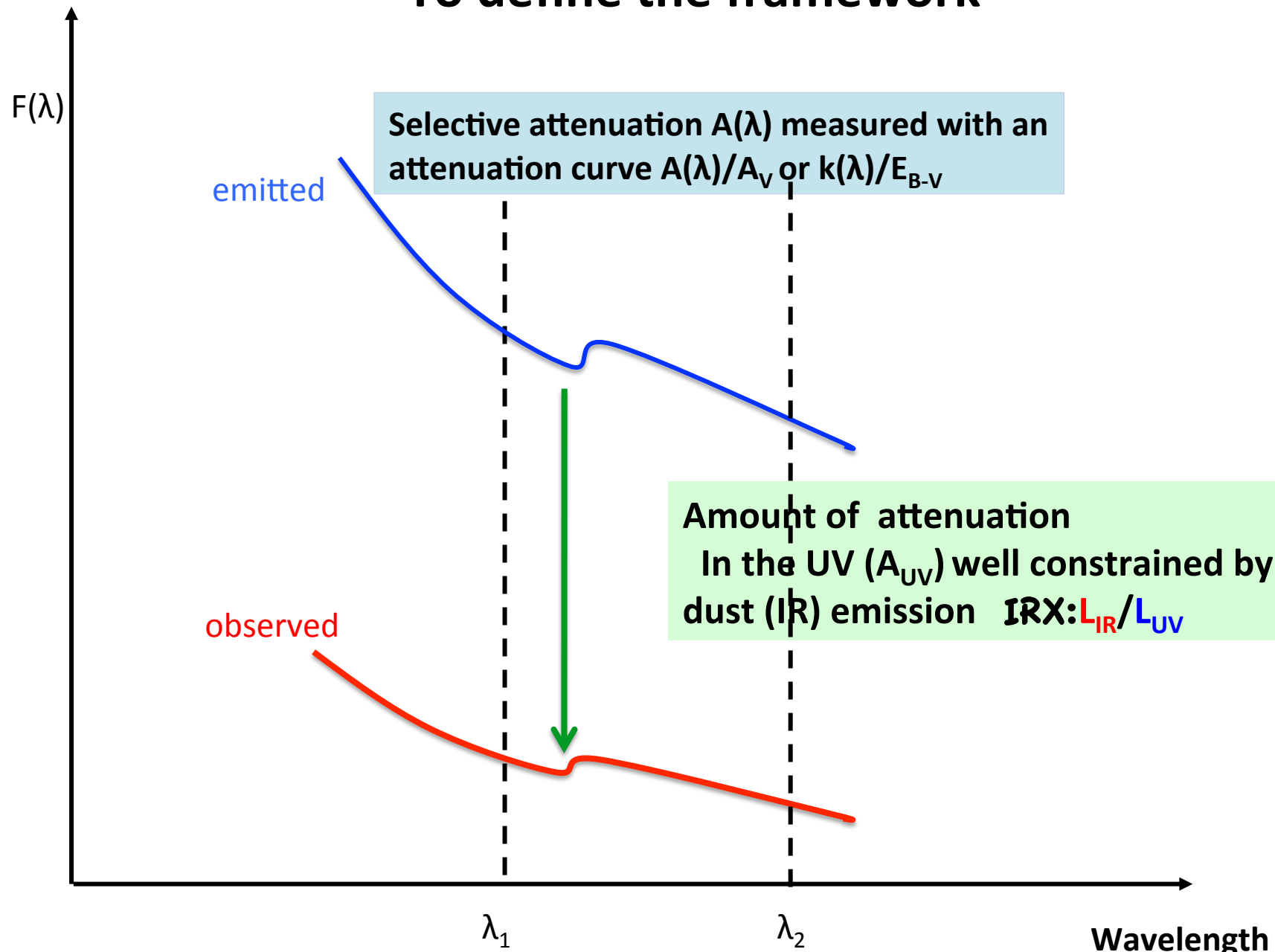
With the contribution of Barbara Lo Faro  
LAM, Marseille, France



*Madau & Dickinson, 2014*

JWST@ROE, Edinburgh, july 2016

# To define the framework



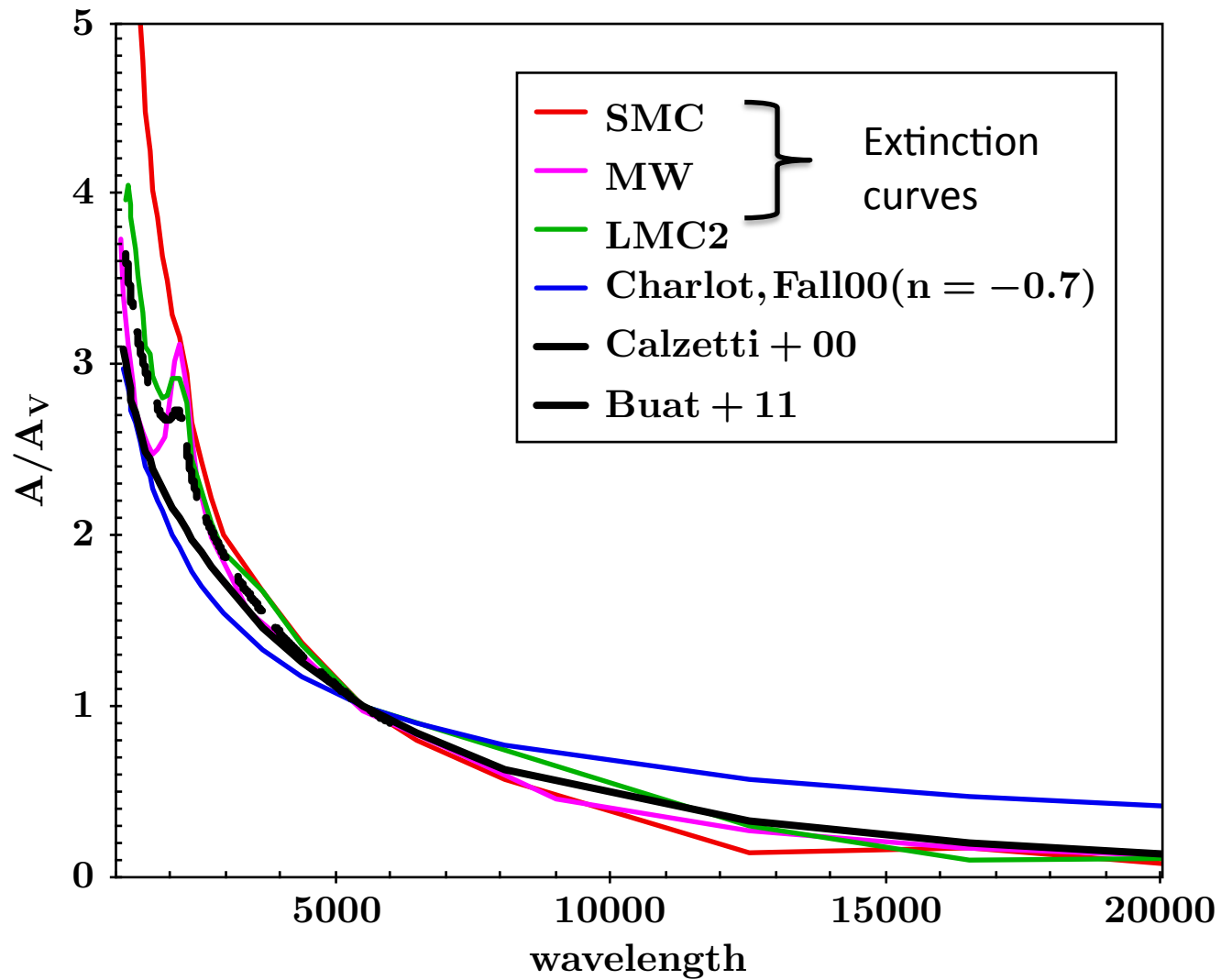
# Outline

- The **attenuation law** from the local to the distant universe:
  - ✓ Formalisms and shapes of the laws
  - ✓ Attenuation laws for UV/optically selected galaxies
  - ✓ Attenuation laws for Dusty IR selected galaxies
- The measure of **the amount of dust attenuation**
  - ✓ Using the UV slope  $\beta$
  - ✓ Using optical/NIR colors
  - ✓ Using stellar masses

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# The shapes of some popular attenuation/extinction curves



# The formalisms of the attenuation laws currently used

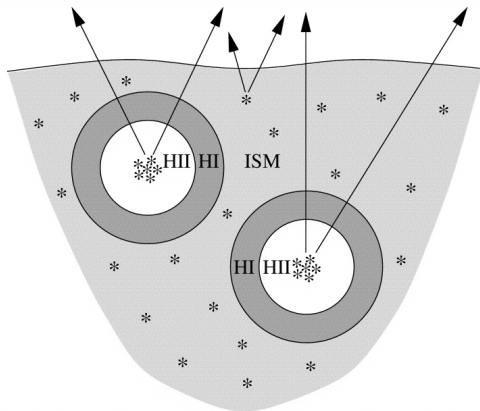
## Charlot & Fall 2000: power laws

$$\hat{\tau}_\lambda^{BC} = (1 - \mu) \hat{\tau}_V (\lambda / \lambda_V)^{n^{BC}}$$

$$\hat{\tau}_\lambda^{ISM} = \mu \hat{\tau}_V (\lambda / \lambda_V)^{n^{ISM}}$$

$$\hat{\tau}_\lambda(t) = \hat{\tau}_\lambda^{ISM} + \hat{\tau}_\lambda^{BC} \text{ for } t \leq 10^7 \text{ years}$$

$$\hat{\tau}_\lambda(t) = \hat{\tau}_\lambda^{ISM} \text{ for } t > 10^7 \text{ years}$$



$n^{BC}$  &  $n^{ISM}$  may be different and/or not fixed  
**(Magphys code (da Cunha+08), , Wild+11  
 Chevallard+13...)**

## Calzetti and Calzetti modified laws

$$k(\lambda) = \left( \frac{A(\lambda)}{E(B-V)} + \frac{E_b \lambda^2 \gamma^2}{(\lambda^2 - \lambda_0^2) + \lambda^2 \gamma^2} \right) \left( \frac{\lambda}{\lambda_V} \right)^\delta$$

(Calzetti+00 + UV bump) X power law

**CIGALE code's recipe (Noll+09)**

$E(B-V)_{young}$  for young stars

$E(B-V)_{old} = f_{att} E(B-V)_{young}$  old stars

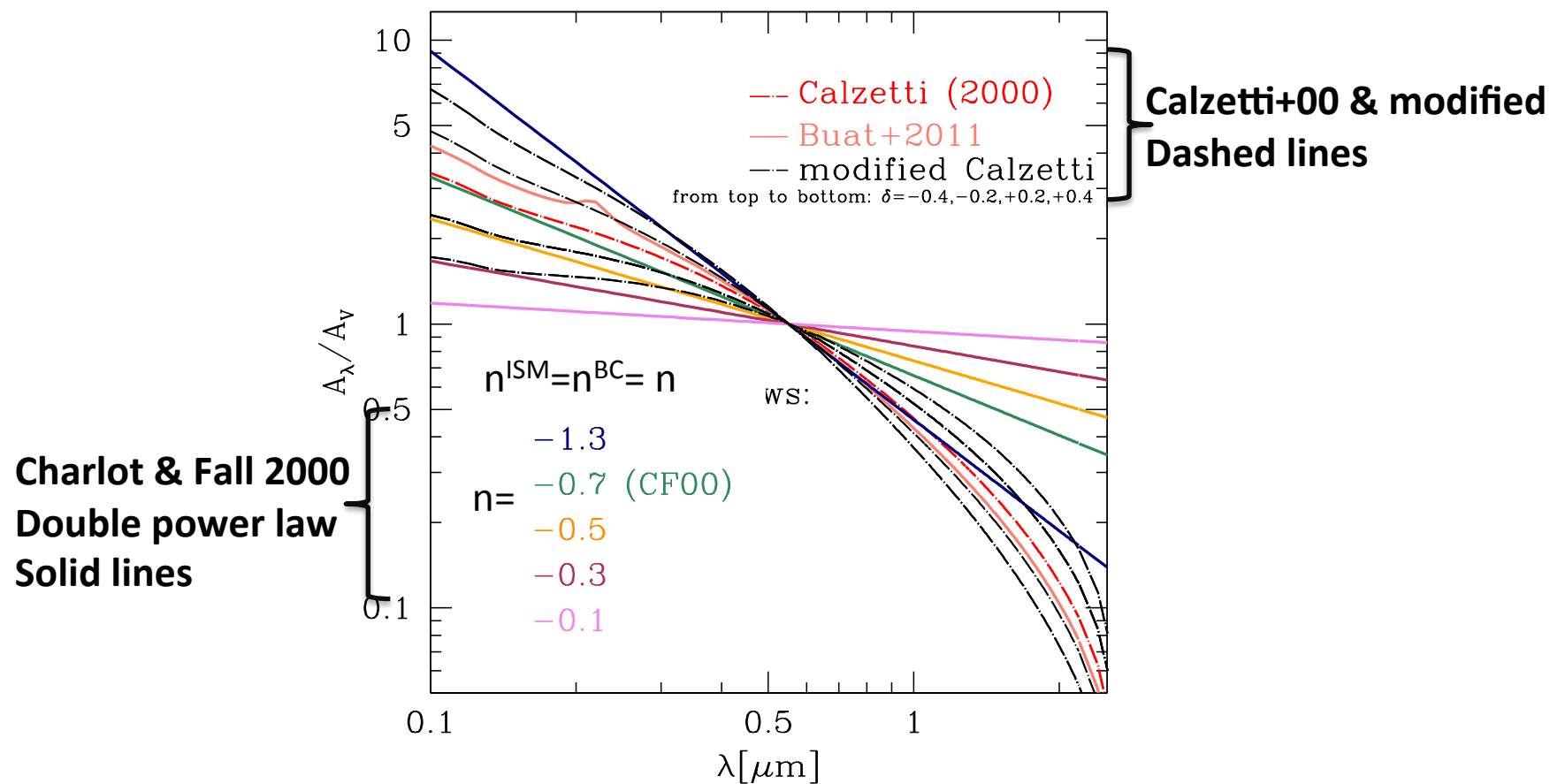
$$0 < f_{att} < 1$$

Calzetti+00, Cigale code (Noll+09), Buat+11,12

Kriek&Conroy13, Zeimann+15, Salmon+15...

with or without  $f_{att}$

# The formalisms of the attenuation laws currently used induce different shapes in the optical-NIR



Courtesy of Barbara Lo Faro

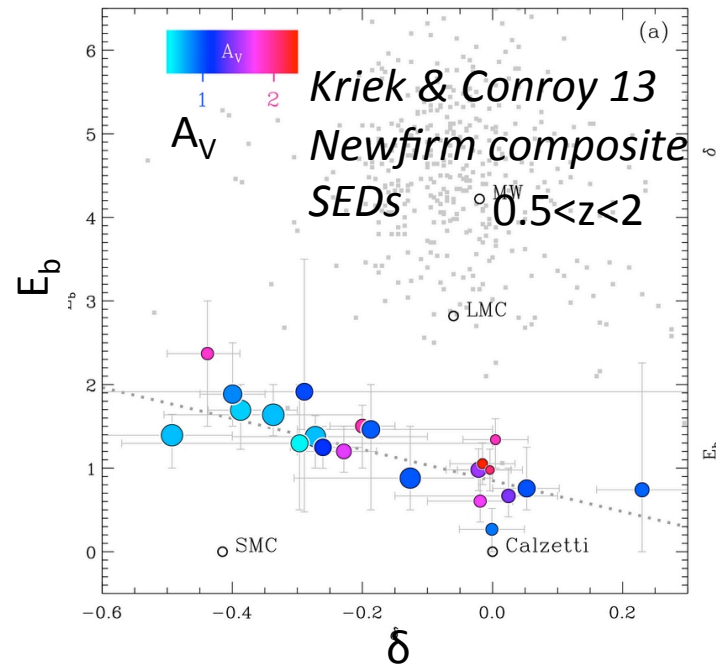
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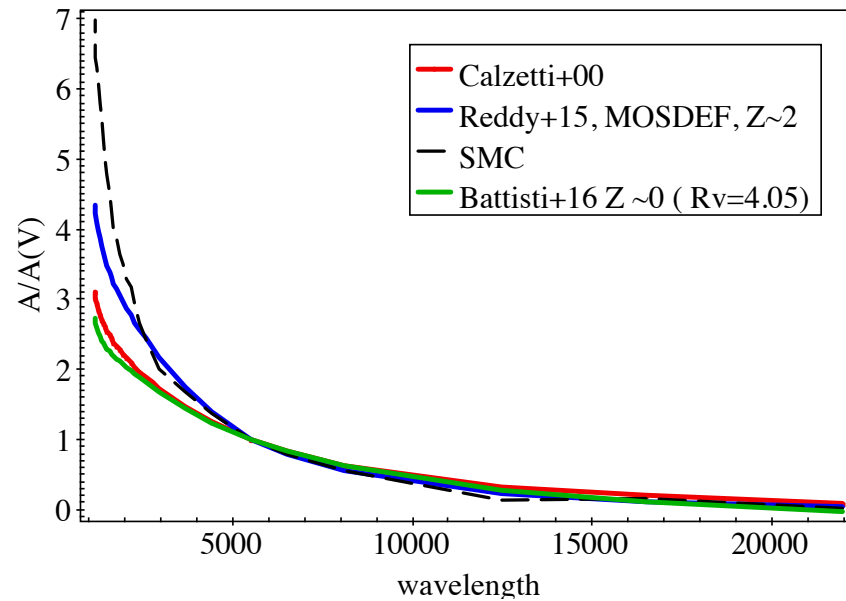
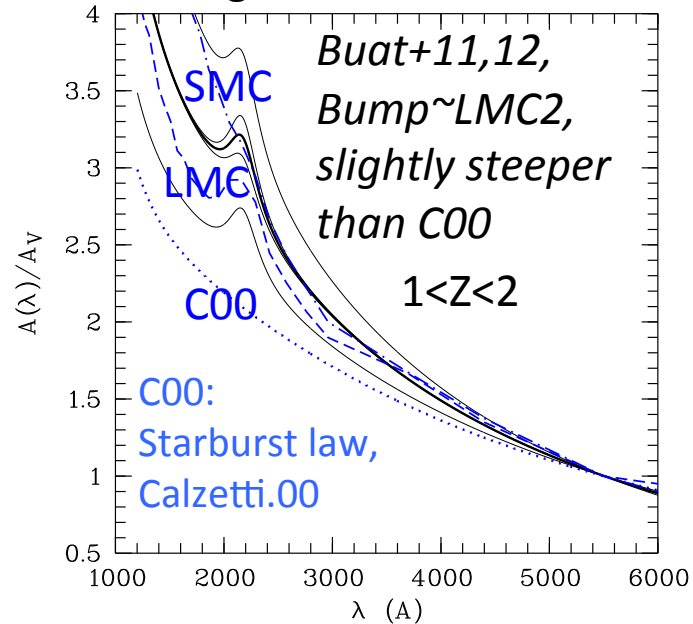


# The variation of the attenuation curve in UV/optically (emission lines) selected star-forming galaxies

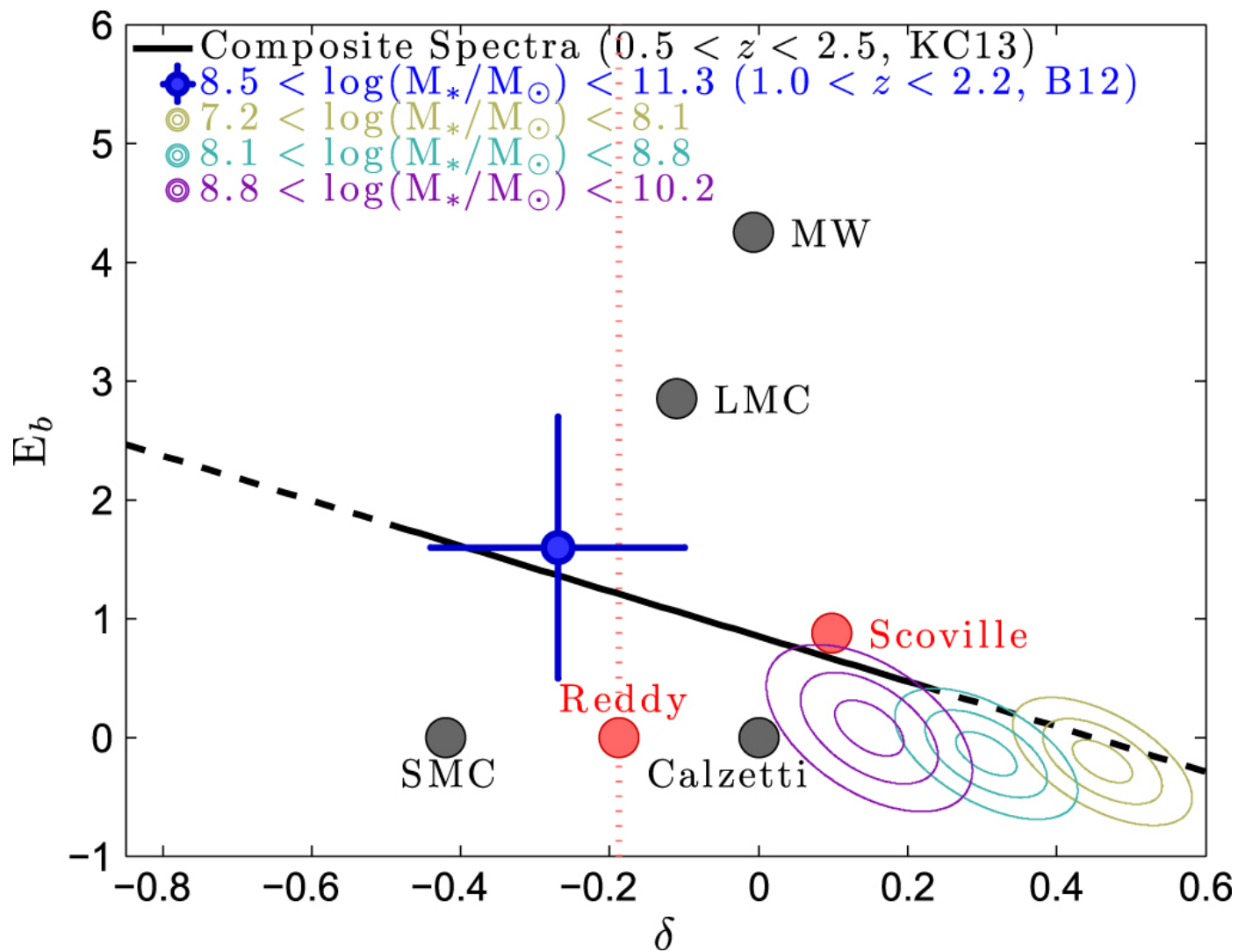
'Calzetti modified' formalism or method



UV selected galaxies with IR detections

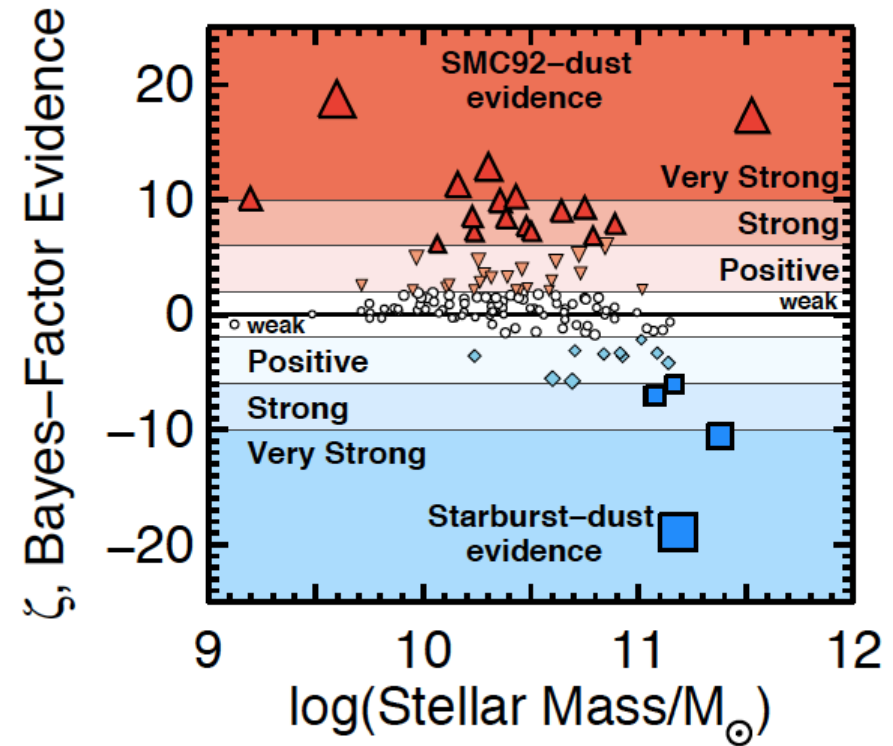
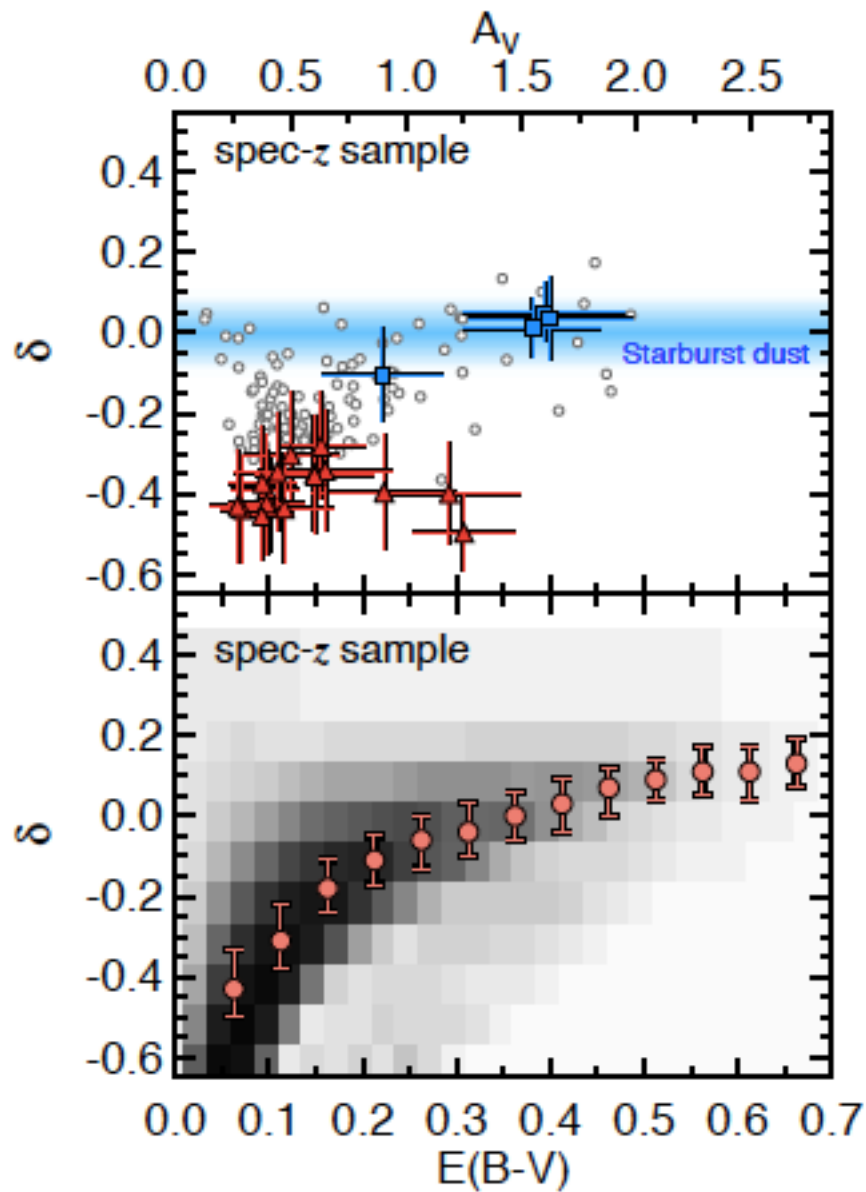


Calzetti+94 method



*Zeimann+15, emission line galaxies*

Salmon+15, arXiv , CANDELS data,  $1.5 < z < 3$   
galaxies detected in the UV rest-frame and with  
SPITZER



**Tentative conclusion?:**

A shallower attenuation law for increasing  
attenuation and mass(?)

Attenuation laws which can be steeper  
than the Calzetti one with a moderate

bump

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# Herschel Extragalactic Legacy Project FP7/SPaCE

P.I. Seb Oliver



**A census of galaxy populations and their star formation history from the local to the distant universe**



« Ultimate » source extraction in all the cosmological Herschel fields (including HerMES and H-ATLAS surveys), UV to radio complementary data  
→ **photo-z, SFR,  $M_*$  for all the sources**



**UV-to-FIR SED fitting**  
**comparison with radiative transfer modelling**  
*Lo Faro et al. to be submitted*



**Physically-motivated SED modelling**

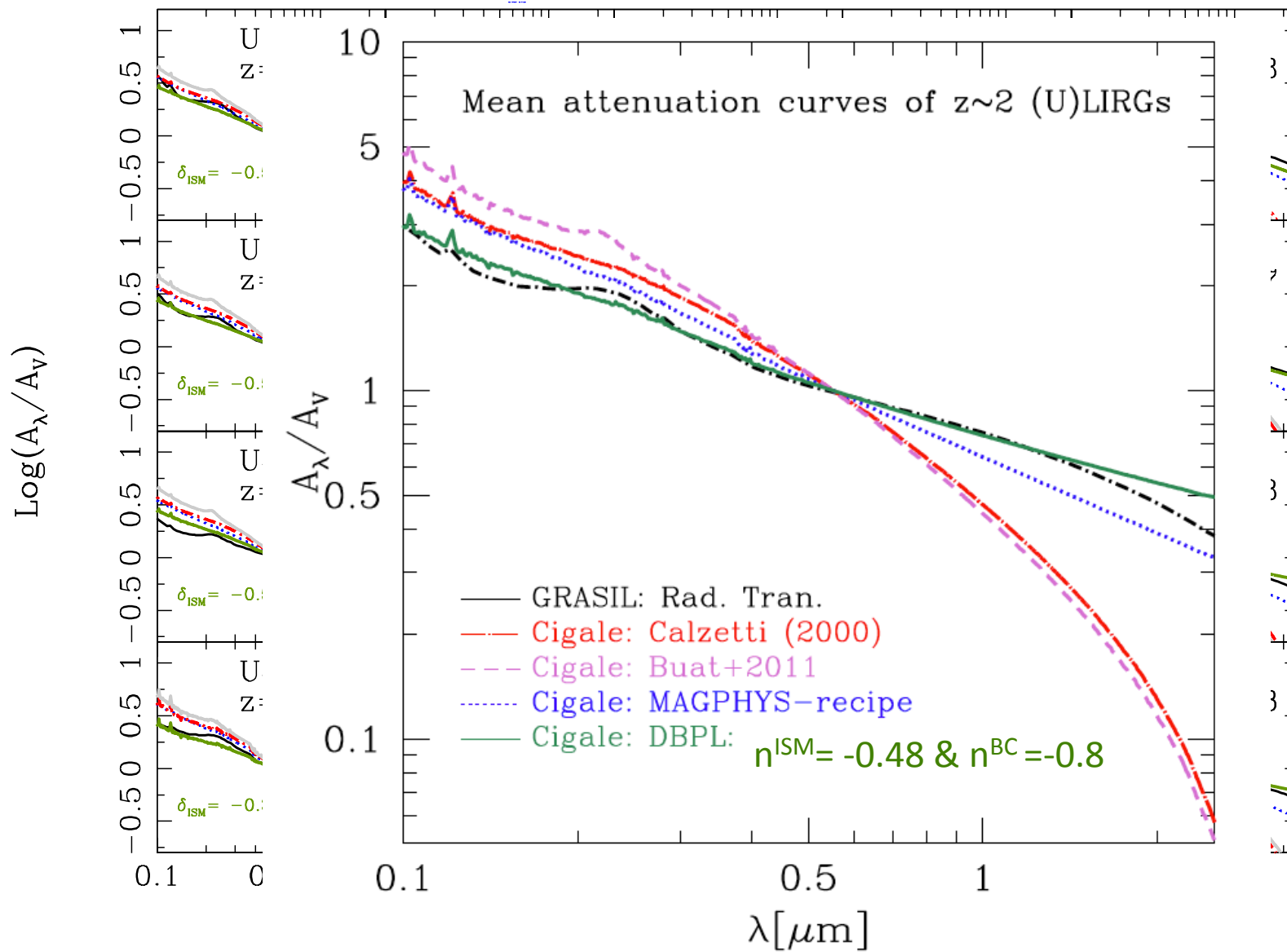
Calzetti & modified, Double Power law  
[cigale.lam.fr](http://cigale.lam.fr)

**Radiation transfer SED modelling**

GRASIL  
[adlibitum.oats.inaf.it/silva/grasil/grasil.html](http://adlibitum.oats.inaf.it/silva/grasil/grasil.html)

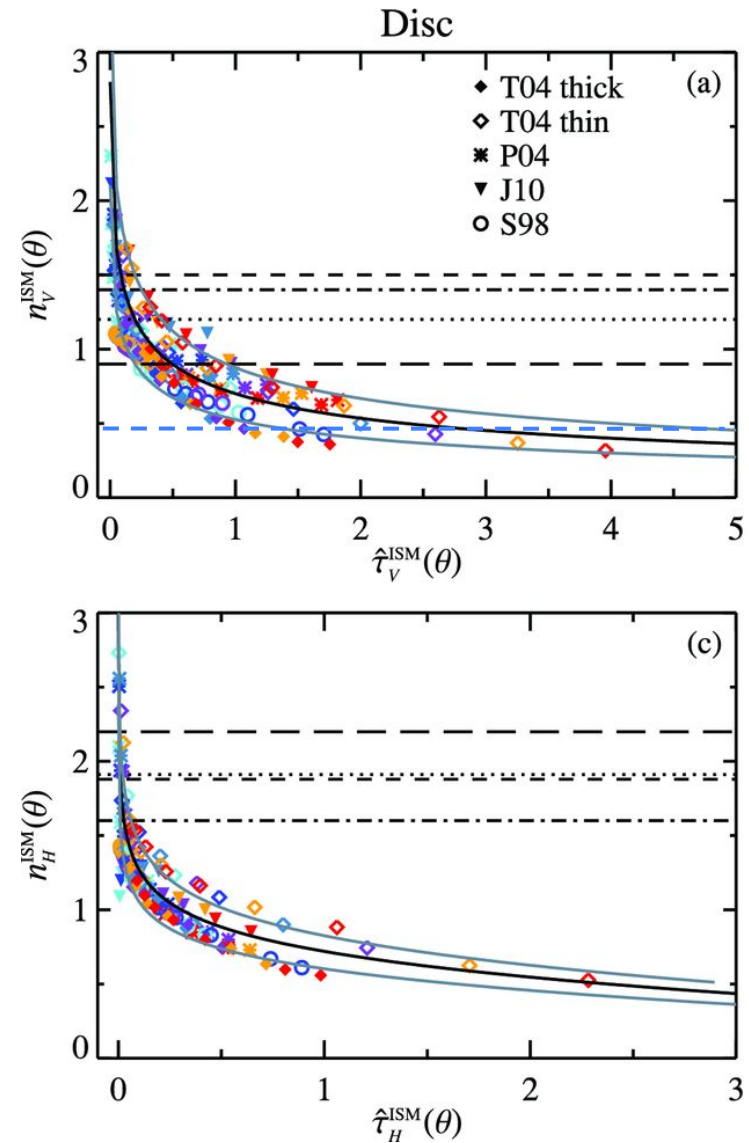
Z $\sim$ 1 LIRGs and Z $\sim$ 2 ULIRGs (from Lo Faro+13,15)  
Nearby (U)LIRGs from the GOALS sample (Armus+09)

Grasil power law fixed power law free Calzetti+00 Buat+11



Flattening of the attenuation curve in high attenuated objects  
→ In agreement with Chevallard et al. 2013:

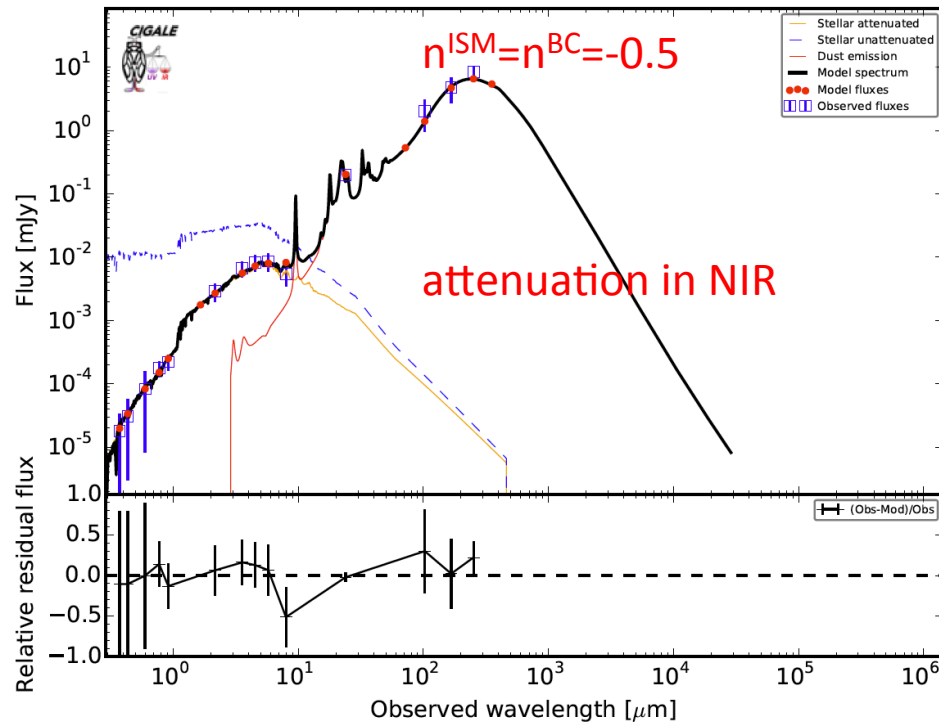
Compilation of Radiative Transfer modeling results, confirming GRASIL calculations  
→ All predict a grayer attenuation for an increasing attenuation



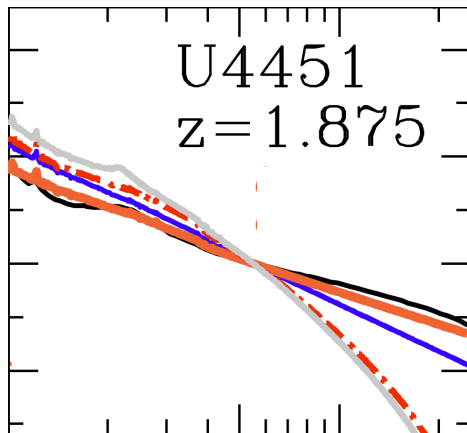
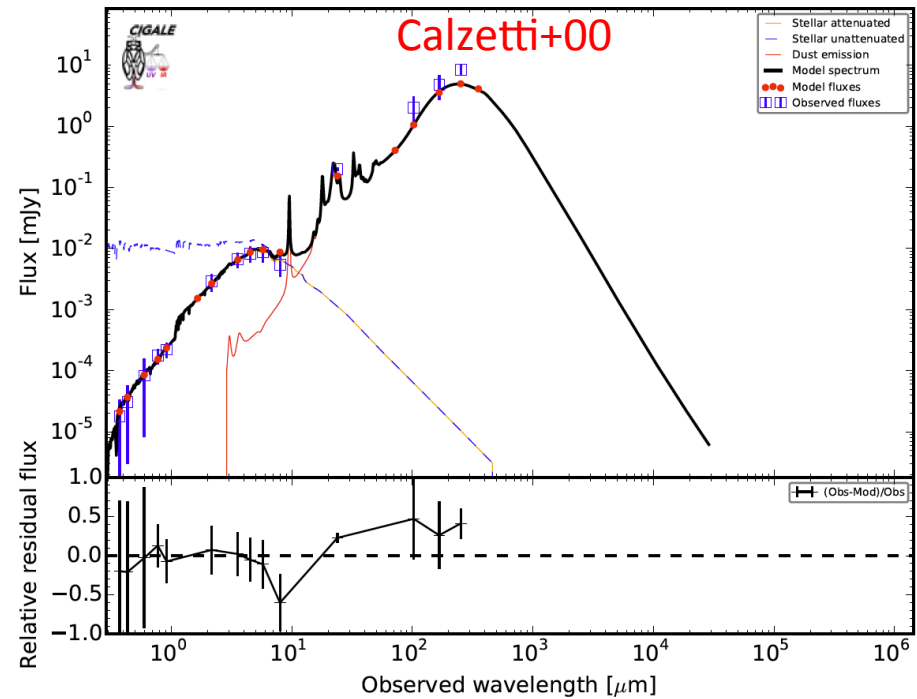


# How do these “flatter” attenuation curves affect the SED ?

Best model for U4451 at  $z = 1.875$ . Reduced  $\chi^2 = 1.65$



Best model for U4451 at  $z = 1.875$ . Reduced  $\chi^2 = 3.28$



**A larger amount of attenuation at longer wavelengths (NIR) than allowed by Calzetti+00 att. law.**

*(Mitchell+13, Da Cunha+10)*

**→ Affects the determination of the stellar mass**

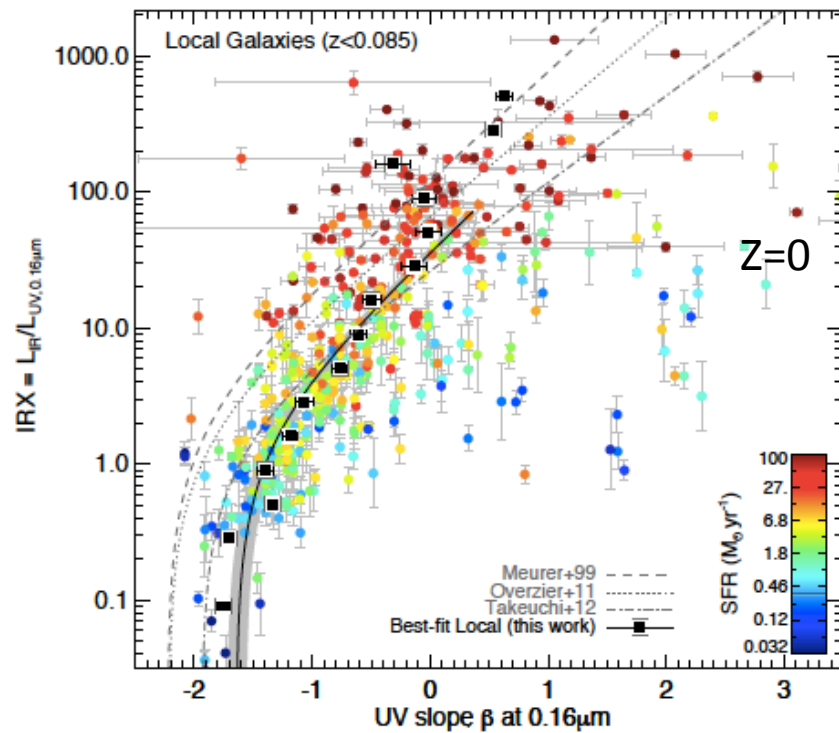
*(Mitchell+13, Lo faro+13)*

# Outline

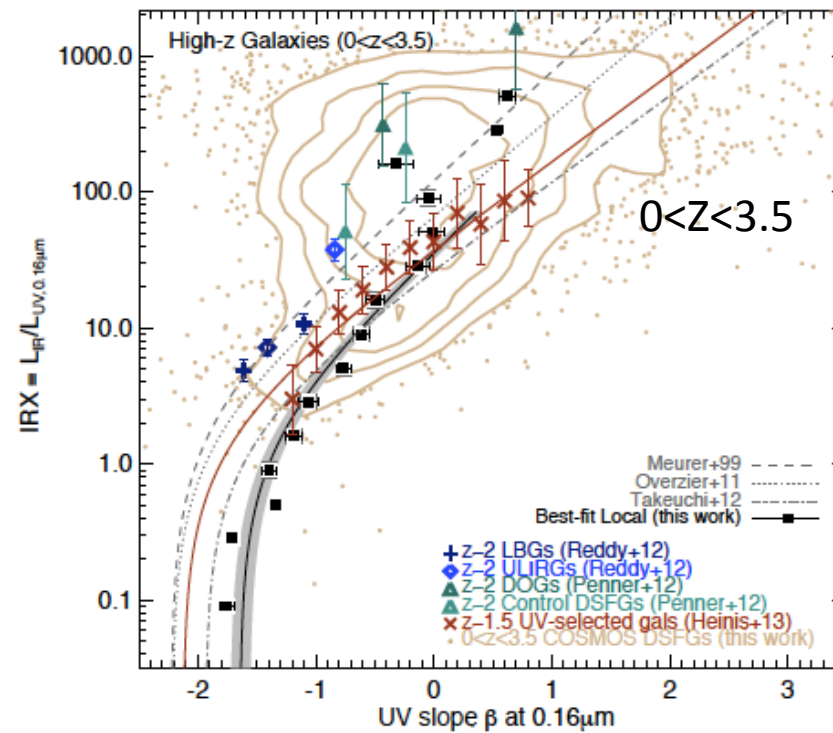
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# Measuring dust attenuation without IR data : the slope of the UV continuum: $\beta$

GALEX+IRAS



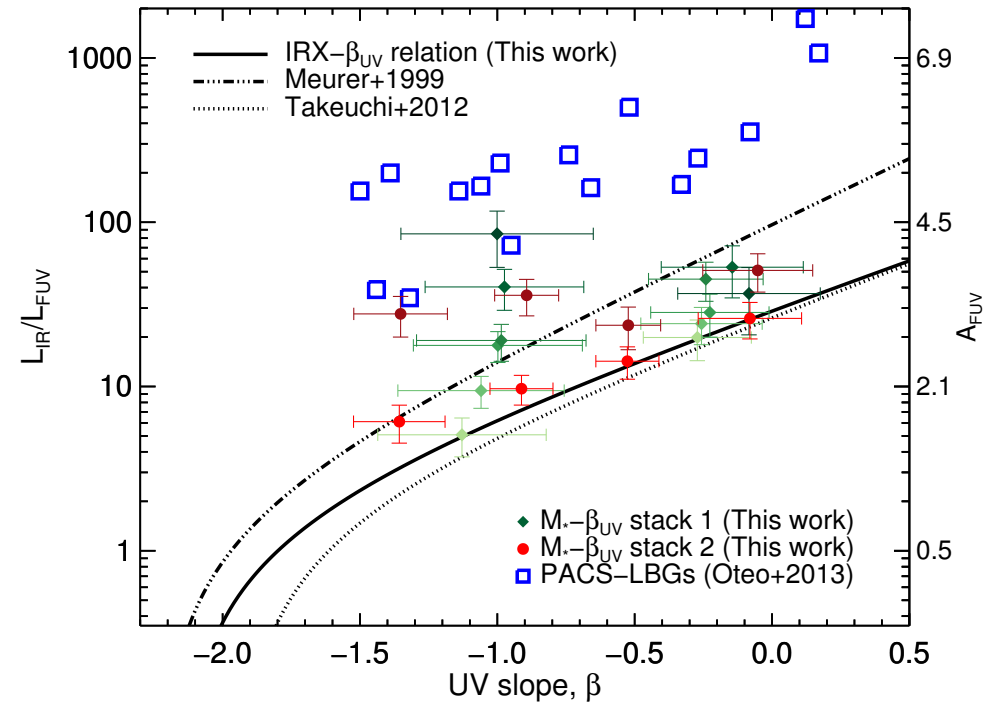
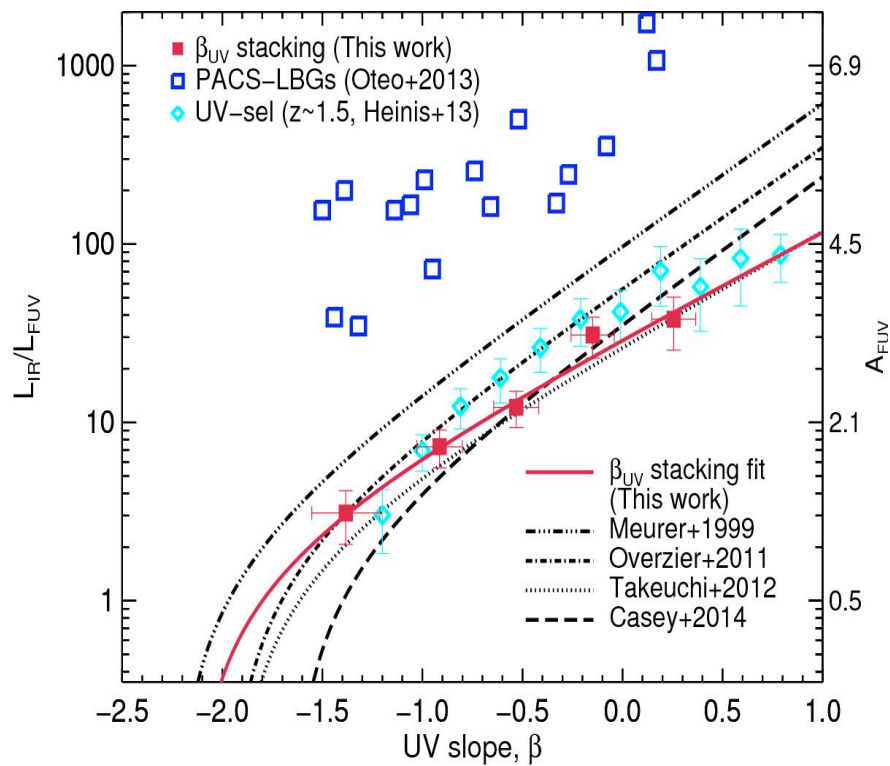
Cosmos field



Casey+14

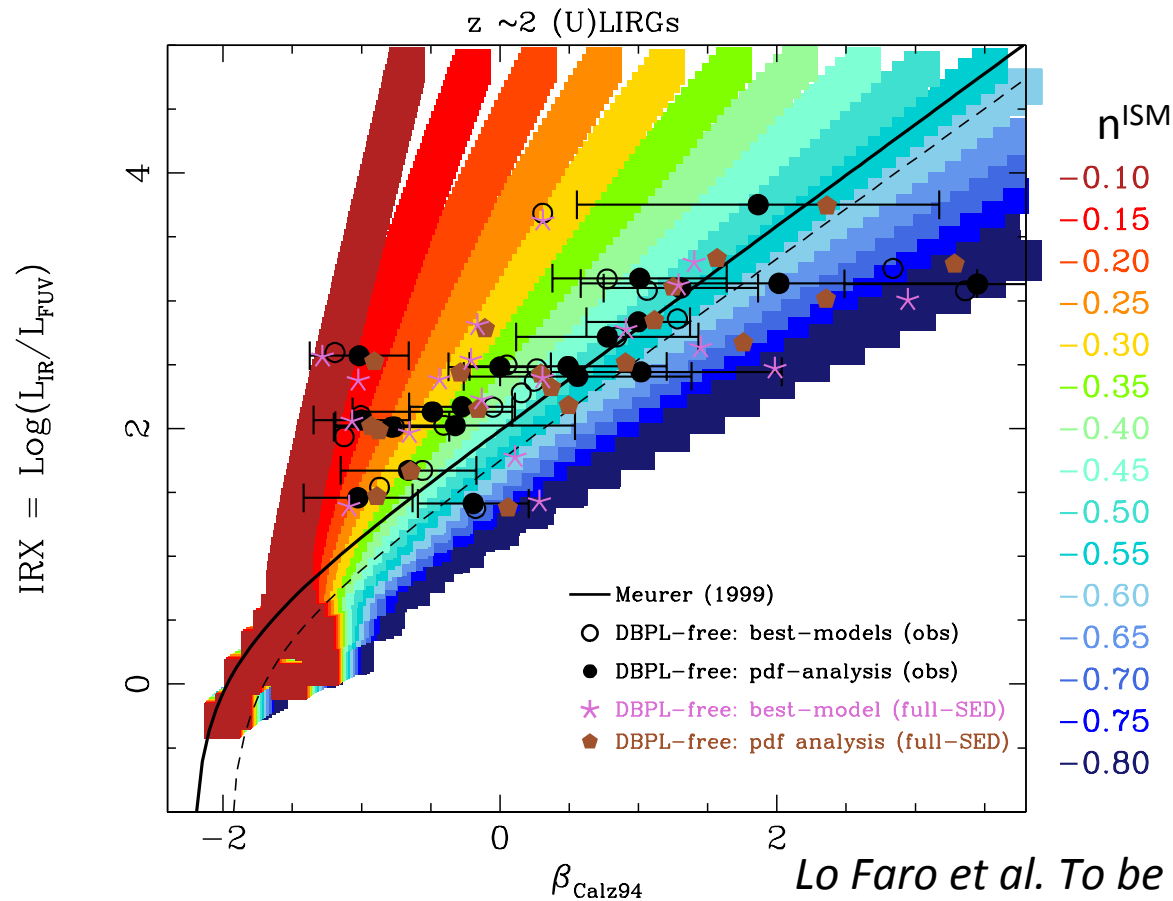
# IRX- $\beta$ : LBG selection at $z \sim 3$ & stacking of Herschel data

*Alvarez-Marquez et al. 2016*



The IRX- $\beta$  plot is very sensitive to the shape of the attenuation curve in the UV

ULIRGs at  $z \sim 2$  detected by Herschel: a flatter curve in the UV

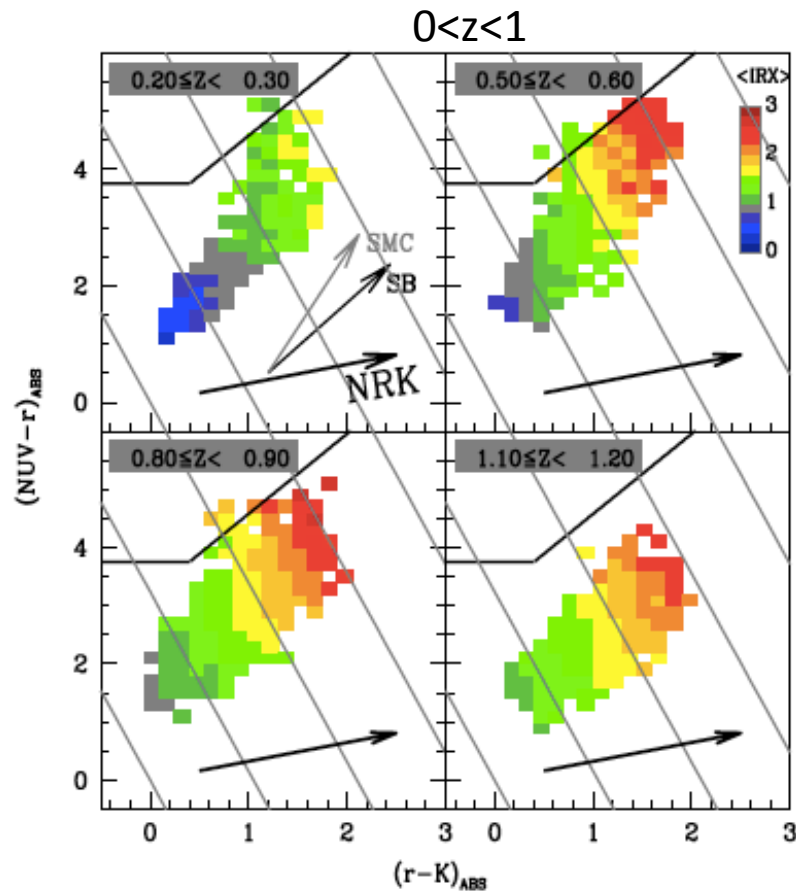


*Lo Faro et al. To be submitted,  
see also Salmon+15, Safarzadeh+16*

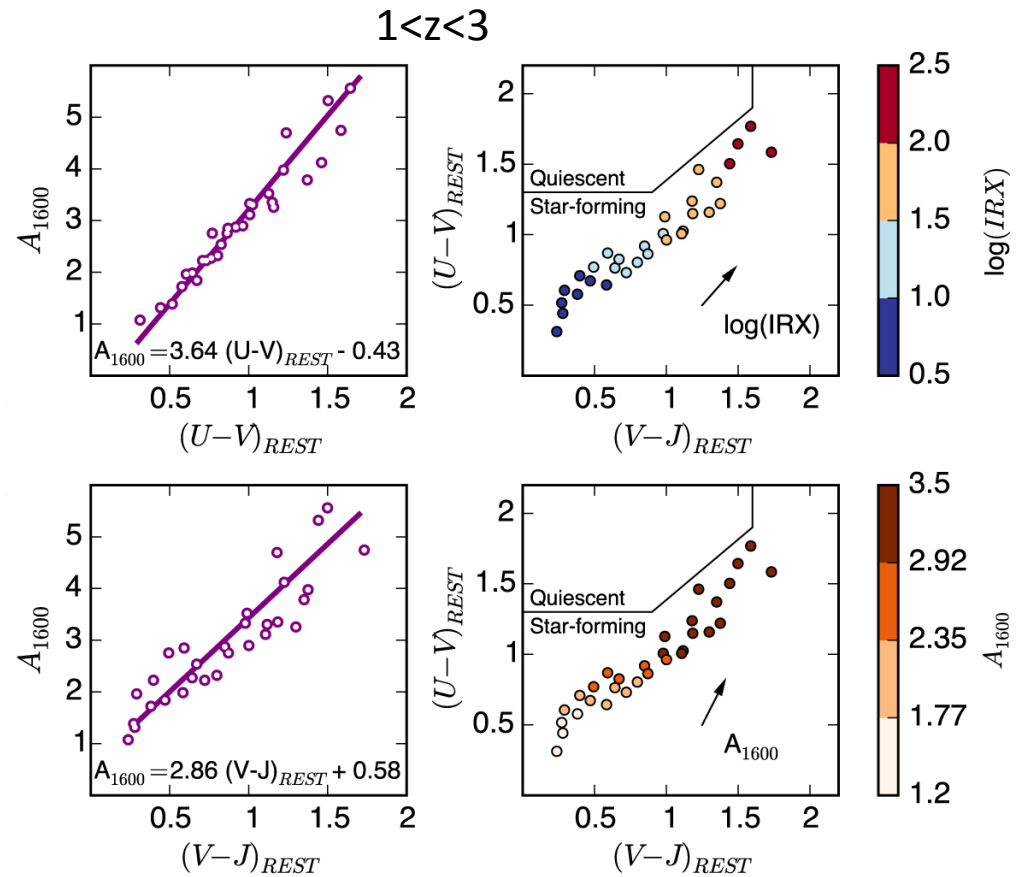
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  - ✓ Using rest-frame NIR optical colors
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# Using rest-frame colors to infer dust attenuation corrections



Arnouts+13 NUV-R, R-K colors

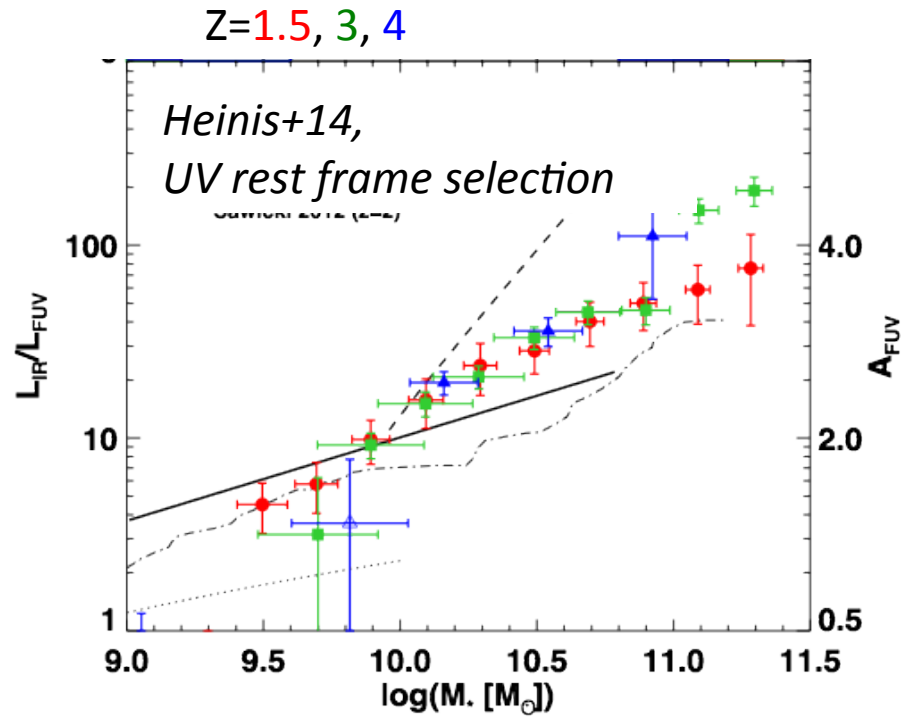


Forrest+13, U-V, V-J colors

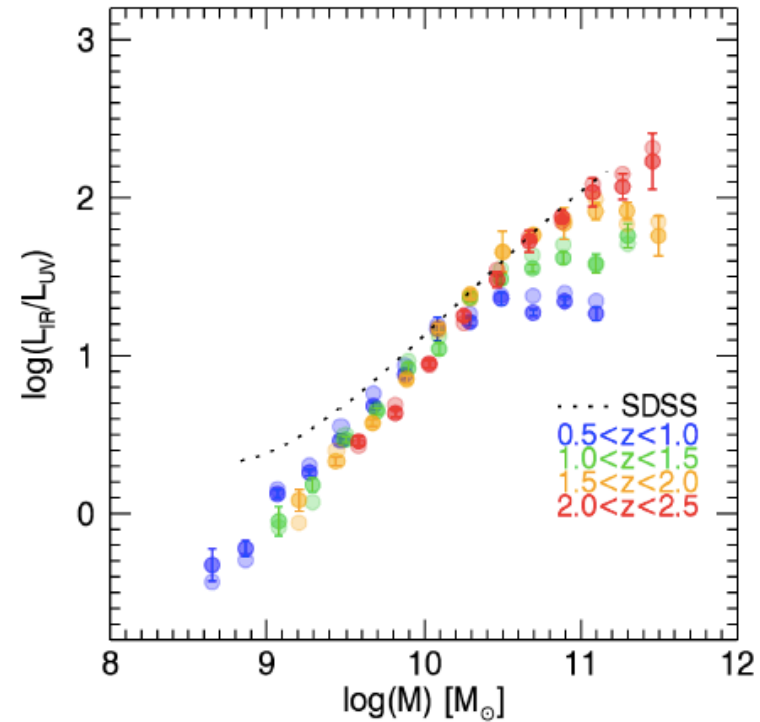
Needs to be calibrated to be used at higher/different redshifts

# Attenuation-stellar mass relation on a large range of $z$

UV selected and star forming galaxies (Stacking of Spitzer/Herschel data)



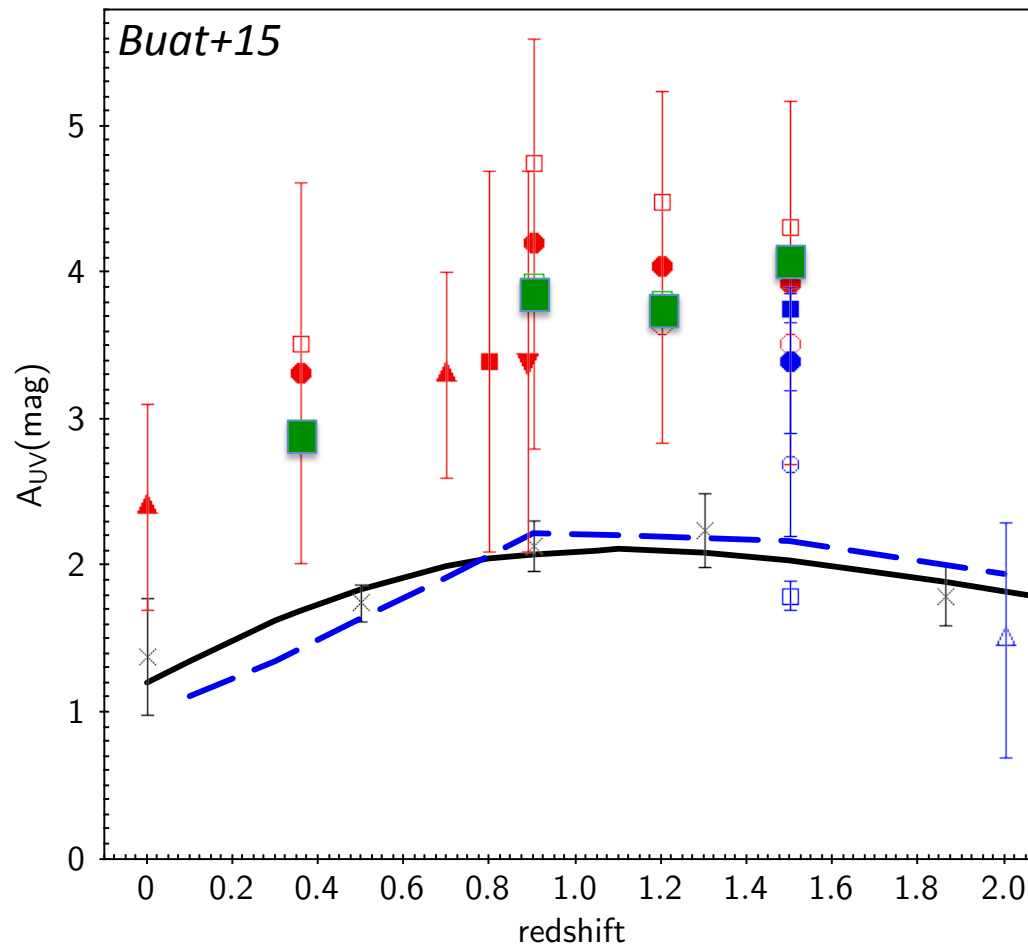
See also Oteo+14, Panella+15,  
Dunlop+16....



Whitaker+14, CANDELS, UVJ selection,  
MIPS stacking



# Dust attenuation in **IR** and **UV** selected samples: a difference in stellar mass



■ IRX-M\* relation assumed,  
Bernhard+14

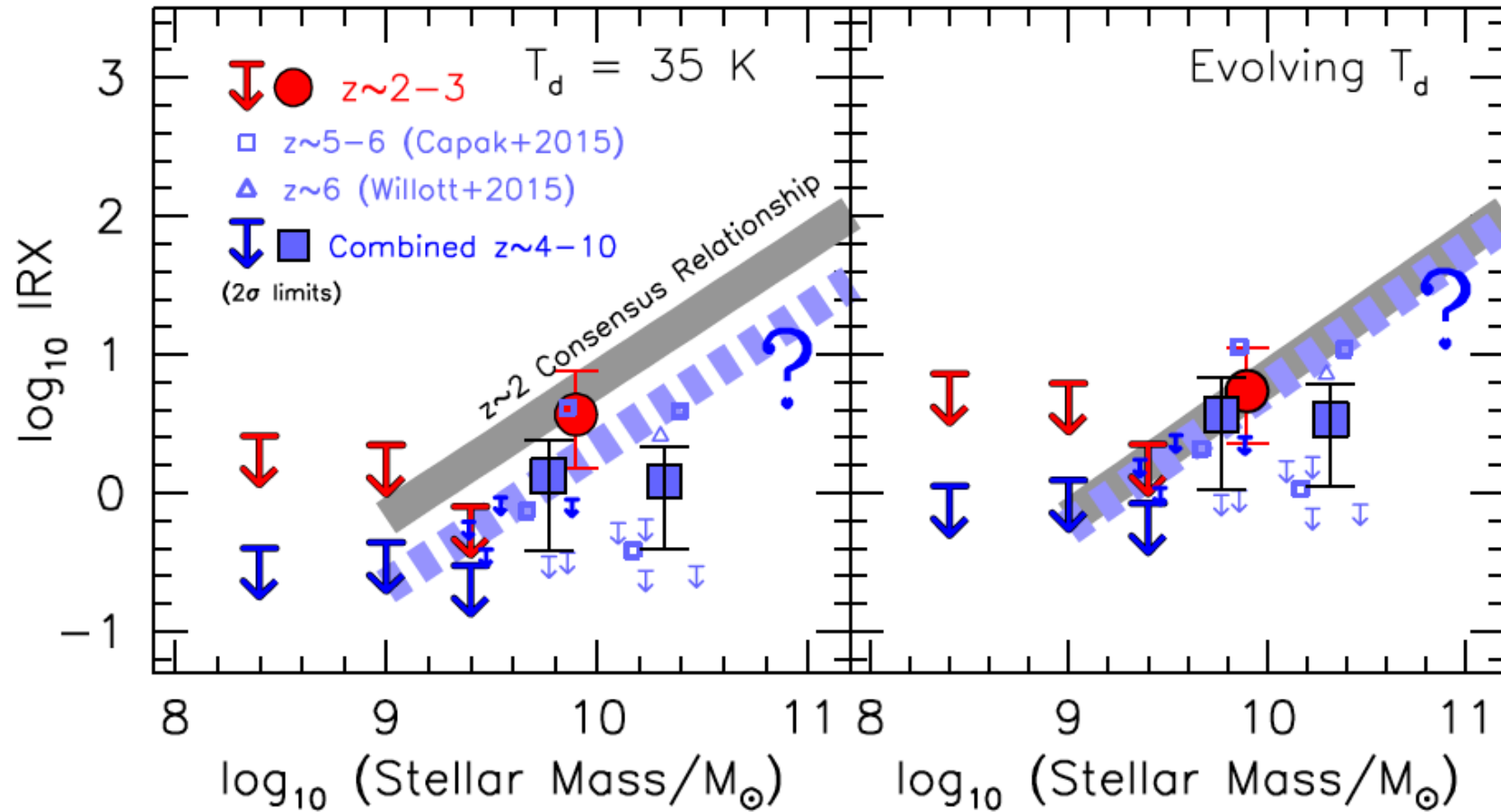
IR selected samples:  
IRAS/Spitzer/AKARI

UV rest-frame  
selections

## At higher redshift: ALMA observations

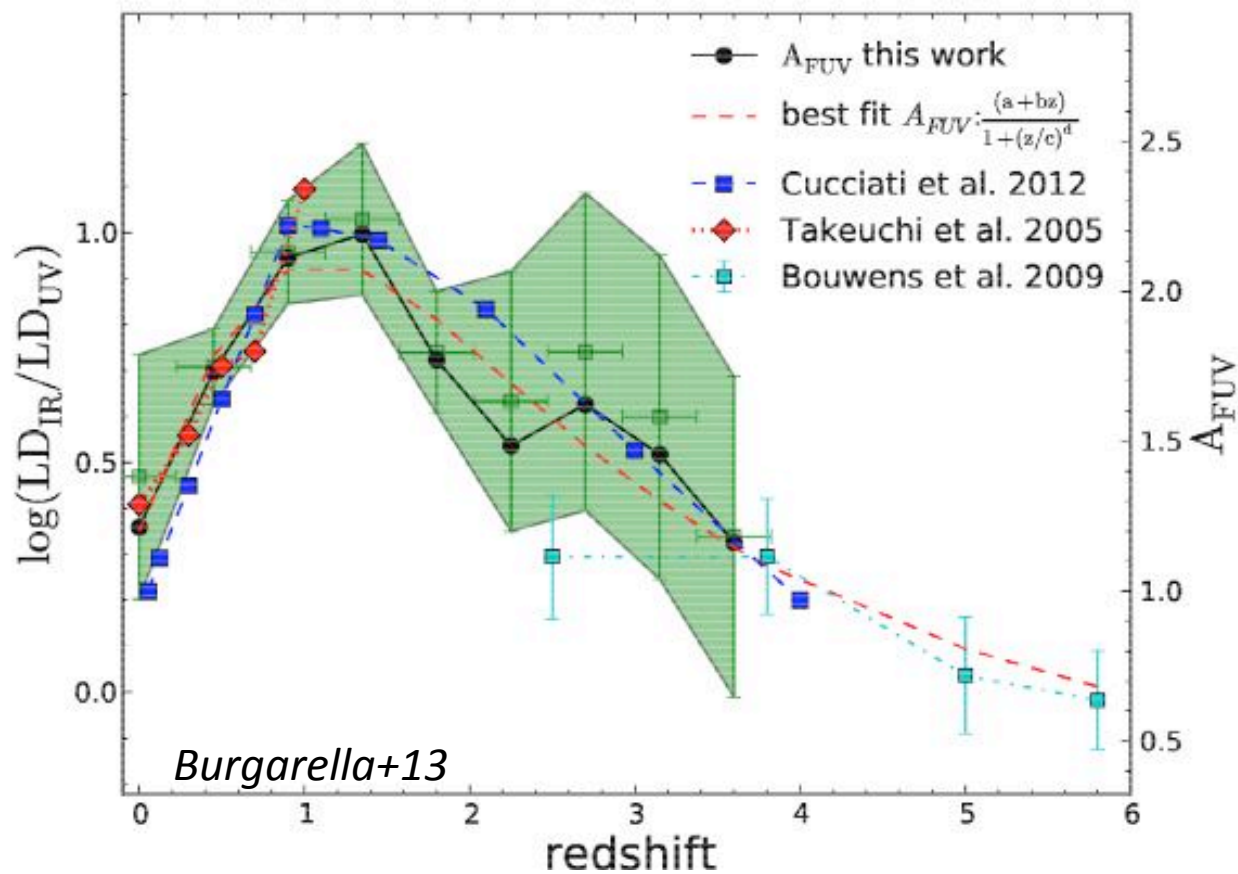
Either an evolution of the IRX-M\* relation or an increase of T(dust) with z

*HUDF-ASPECS, Bouwens+16 arXiv*



An evolution of the IRX-M\* relation is needed to understand the variation of IR to UV luminosity density ratio

*Burgarella et al. in prep*



## To conclude

Witt & Gordon 00 . No justification was found for the use of a universal attenuation function for the analysis of a large sample of galaxies.

Only the measurement of the  $F_{\text{FIR}}/F_{\text{F160BW}}$  (IRX) flux ratio promises reasonable certainty for the determination of the UV attenuation correction factor in individual galaxies.

- ✓ **Confirmation of the variation of the attenuation curve among galaxies:** shape in UV/NIR, UV bump: as a function of the amount of attenuation, stellar mass, sSFR... → sample selection)
- ✓ Fortunately, **some recipes seem reliable to measure the total amount of attenuation:** colors, stellar mass, but need to be well calibrated, at different redshifts
- ✓ The IRX- $\beta$  diagnostic is very sensitive to the attenuation curve and very likely to the stellar mass of galaxies