



*LePhare Download Install Syntax Examples Acknowledgement*

<http://www.lam.fr/lephare.html>

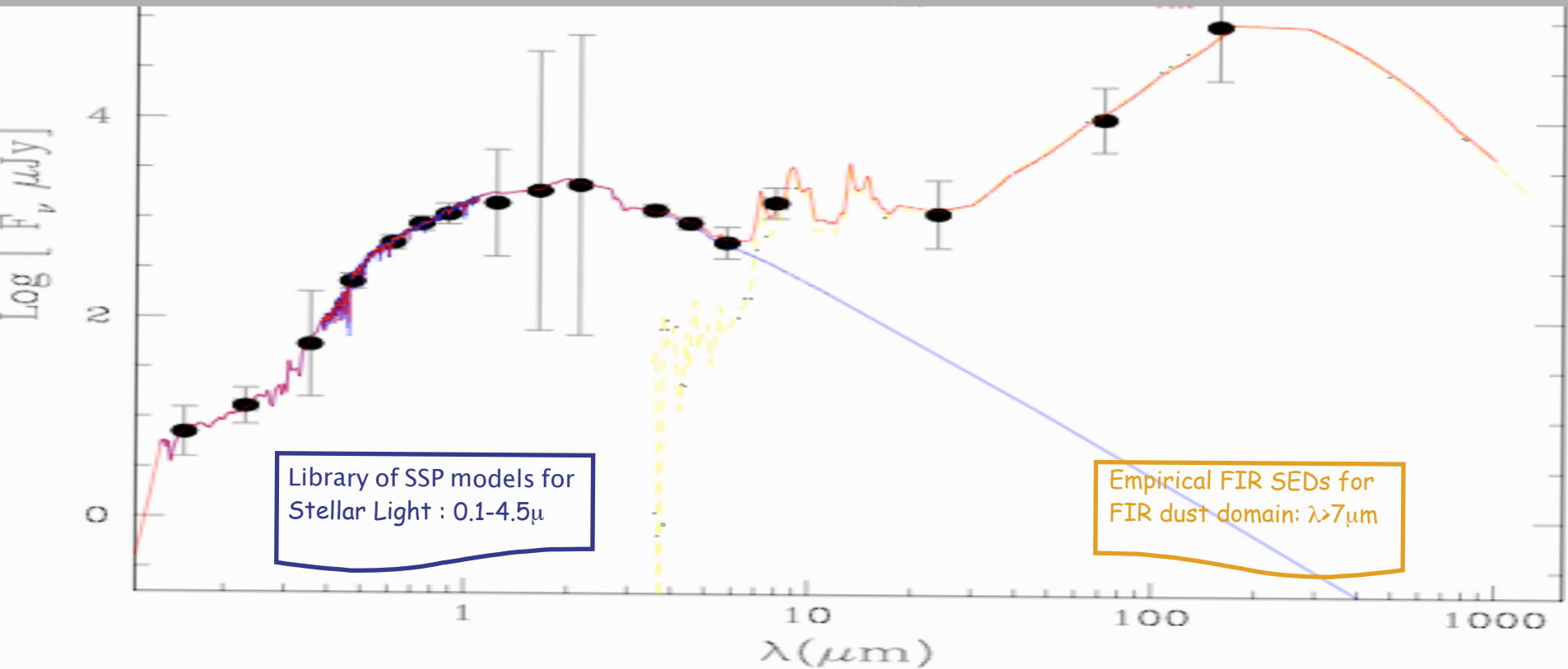
# Le Phare

A Photometric software  
to measure redshifts  
&  
galaxy properties

*Arnouts S. & Ilbert O.*

# Basic concept

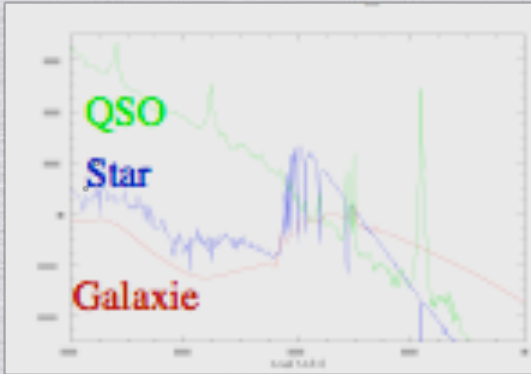
## SED Fitting of the UV to FIR photometry



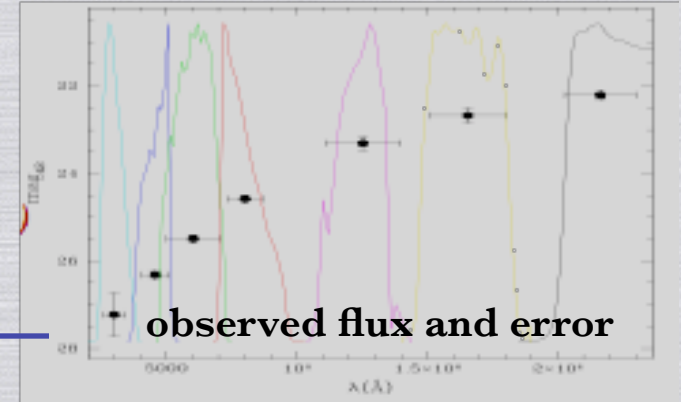
Comparison of the observed and predicted fluxes [SED(z,Type,...)]  
via standard  $\chi^2$  fitting technique

# Basic concept

## SED's Libraries



## Set of Filters



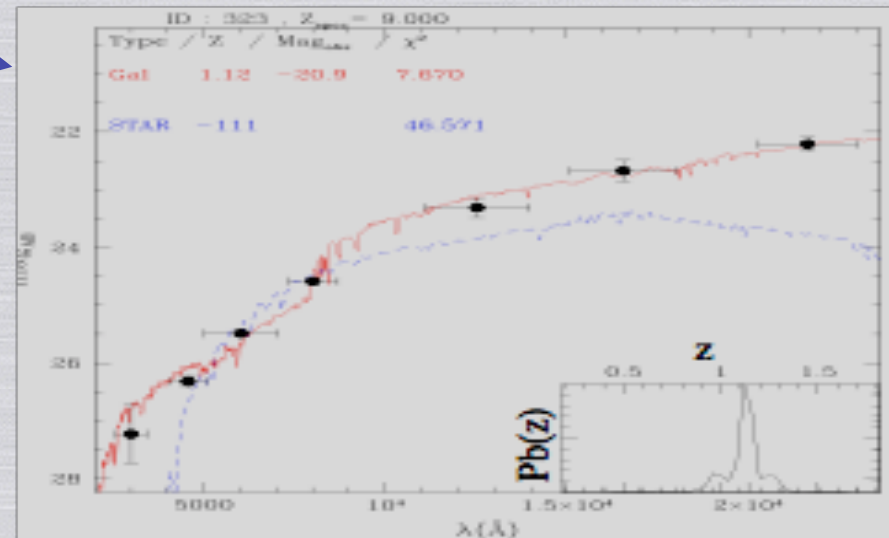
+  
Extinction  
IGM

Theoretical flux

$$\chi^2 \text{ fitting : } \chi^2(z, T, A) = \sum_{f=1}^{N_f} \left( \frac{F_{\text{obs}}^f - A \times F_{\text{pred}}^f(z, T)}{\sigma_{\text{obs}}^f} \right)^2$$

## Outputs

Best Redshift  $z$   
 $z$  uncertainties ( $z$ -PDFs)  
 Types , attenuation  
 +  
 Physical parameters:  
 Masses, Mean Age, SFR,  $Z_0$ , ...  
 & uncertainties (marg. PDFs)





# Basic concept

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$\chi^2$  SED fitting technique

## Assumptions:

- \* SED library provides a fair sampling of galaxy's SEDs

## Strength :

- \* Independent of any training datasets [works all  $z$ ,  $0 < z < 9+$  ]
- \* uncertainties measure from the Redshift probability distribution function (PDF)
- \* optimal classifier : Stars / QSOs / Galaxies
- \* physical parameters for each galaxy [Mass, SFR, Dust,  $L_{\text{IR}}$ ,...]

## Weakness :

- \* Can be time consuming compared to NNs

## SED fitting Bonus :

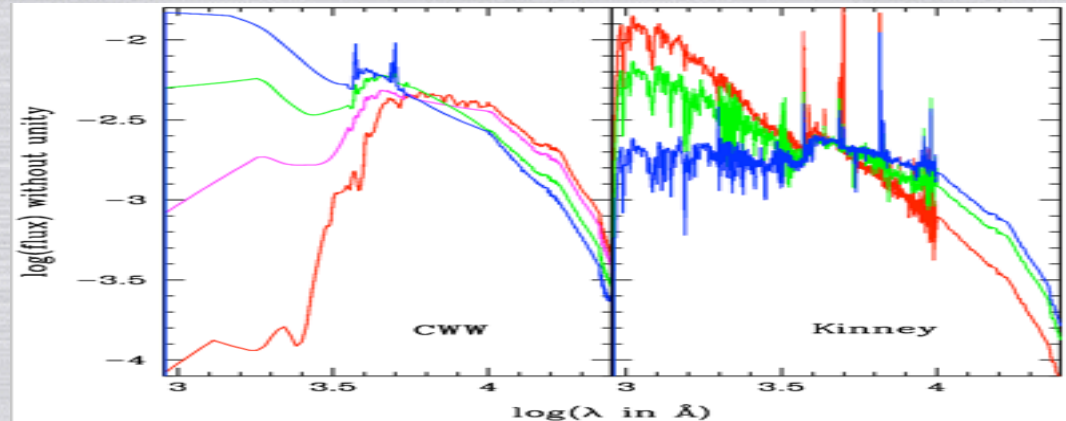
- \* Easy to perform simulation/mock catalogs in any filterset
  - 1- theoretical description of LFs + surface brightness effects
  - 2- existing deep catalog (like COSMOS)

# SED templates

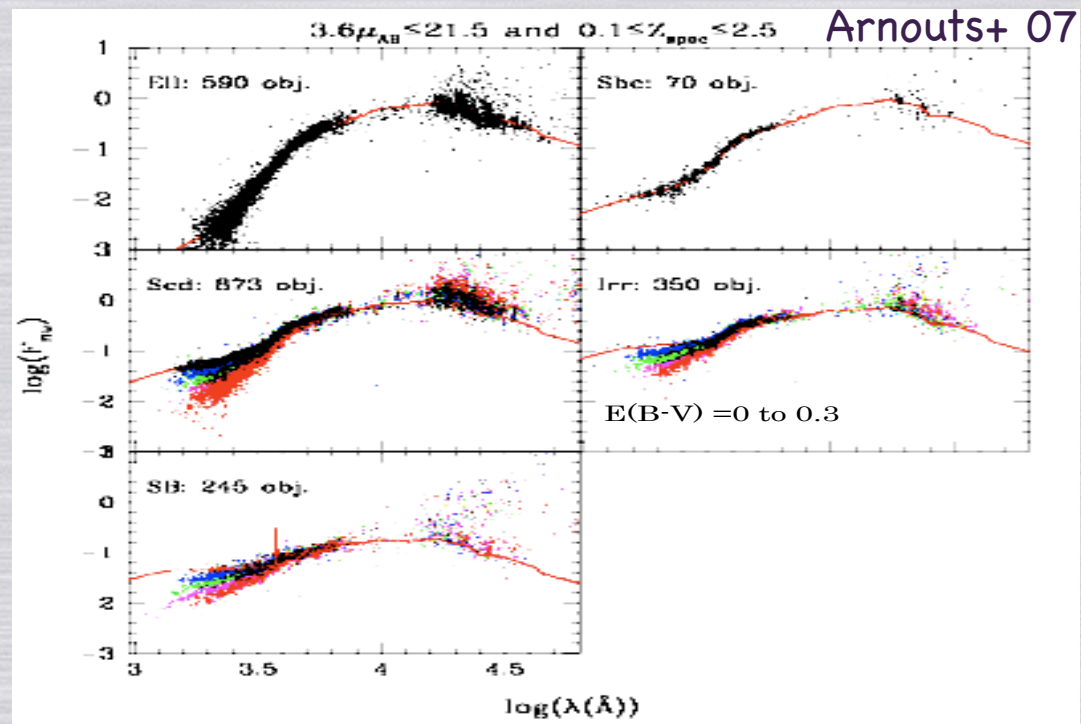
- \* Observed SED templates in local universe

(Coleman, Wu Weedman, 1980 + Kinney+, 1996)

- CWW + Kinney extrapolated in UV and NIR using BC03 library



Empirical Template reconstruction improved in NIR with CFHTLS+SWIRE + spectroscopy



# SED templates

\* Observed SED templates for COSMOS (*Ilbert 2009*)

Synthetic set  
of templates

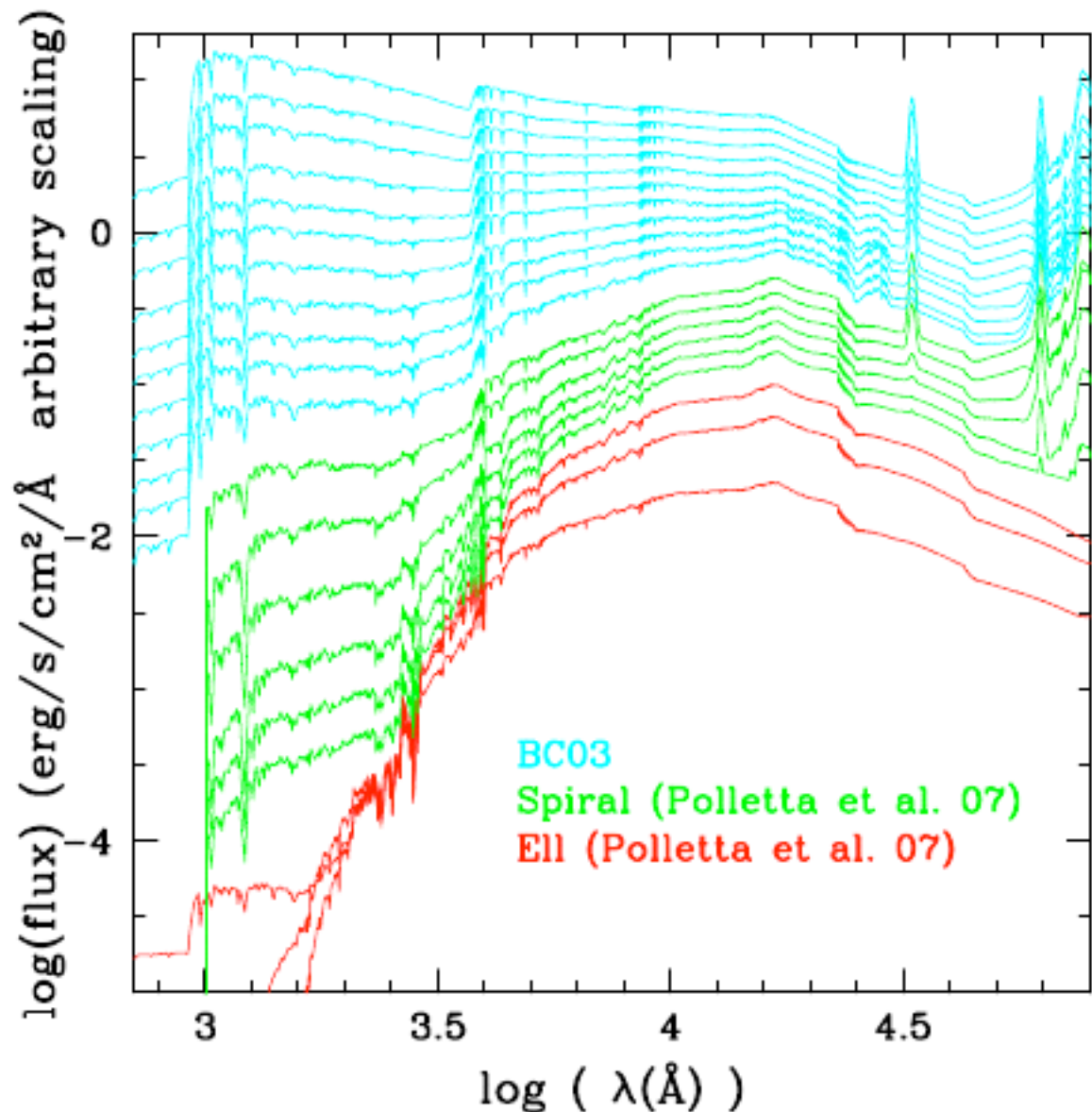
-> Pegase

-> BC03/CB07

Empirical set  
of templates

-> CWW

-> Polletta et al.





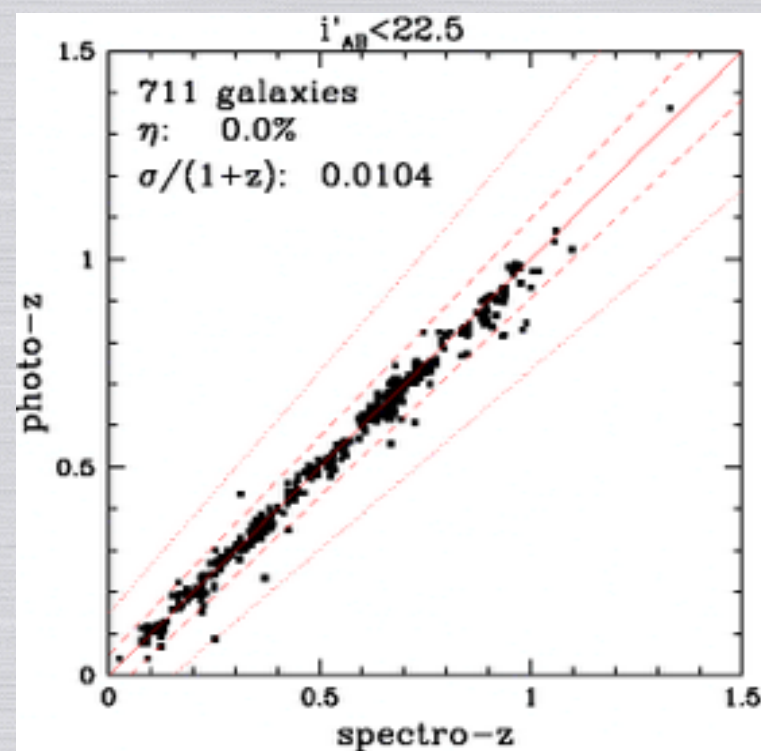
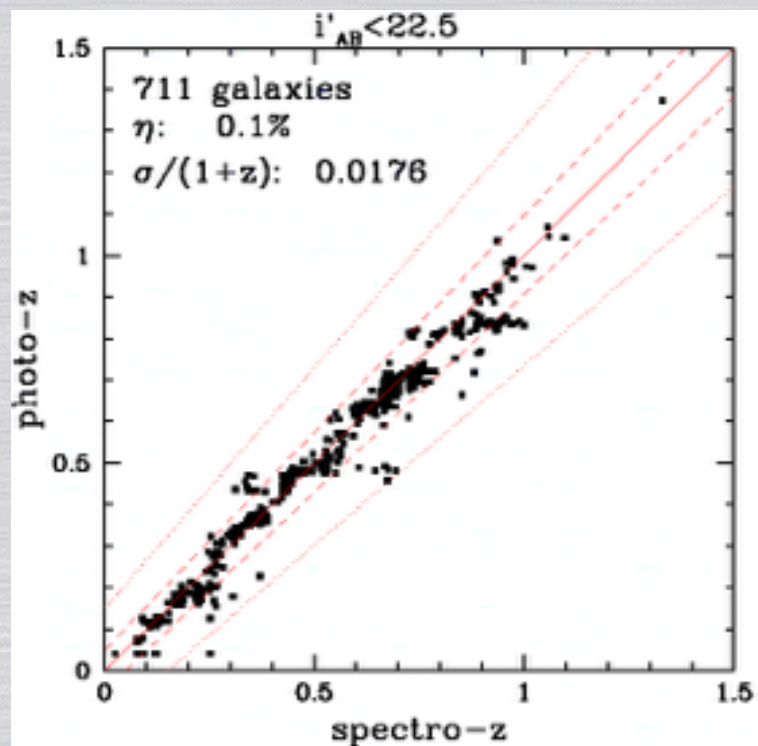
# Le Phare's features

\* Many codes on shelves : Hyper-Z, EAZY, ZEBRA, BPZ, Photo-Z, ANNz, DESDM, SkyNet, RVMz, ...

\* LePhare's features helping for photo-zs

-1- Automatic Zero-Point Correction of the photometry with spectroscopic sample (*Ilbert+,09*)

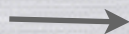
$$\psi^2 = \sum_{i' \leq 21.5}^{N_{\text{gal}}} \left( (A \times F_{\text{pred}}^f - F_{\text{obs}}^f + s^f) / \sigma_{\text{obs}}^f \right)^2$$



# Le Phare's features

-2- Inclusion of Emission Line scaled with dust-free UV luminosity (*Ilbert+,09*)

$$\text{SFR} \propto L_v(\text{H}\alpha)$$

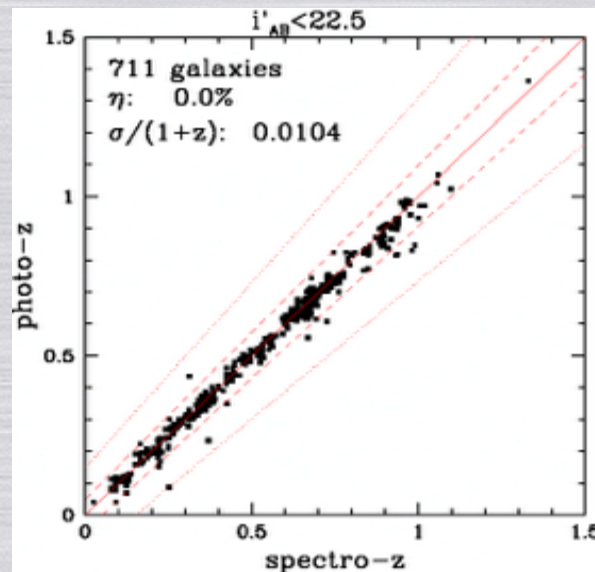
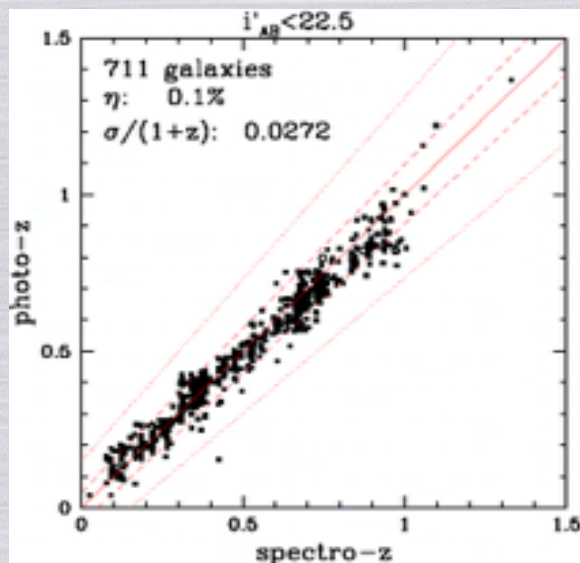
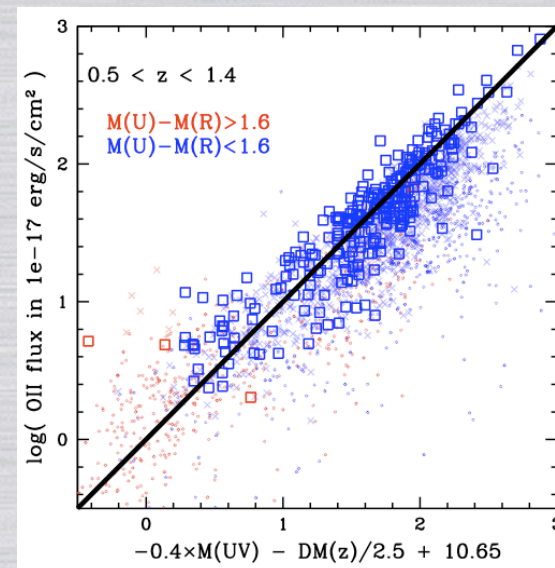
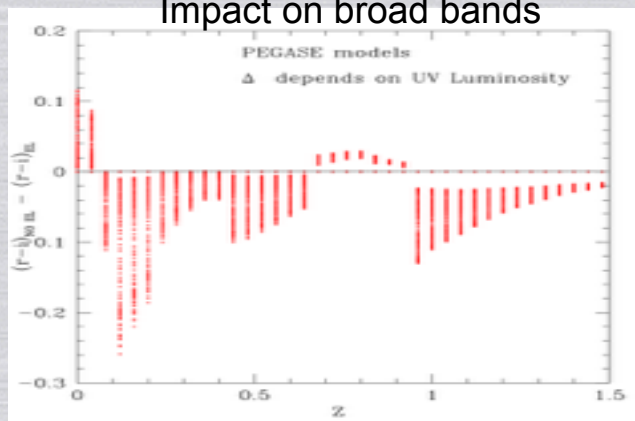


$$\text{H}\alpha \longrightarrow \text{H}\beta, \text{H}\delta$$

$$\text{SFR} \propto L_v(\text{OII})$$

$$\text{OII} \longrightarrow \text{OIII}_{4959}, \text{OIII}_{5007}$$

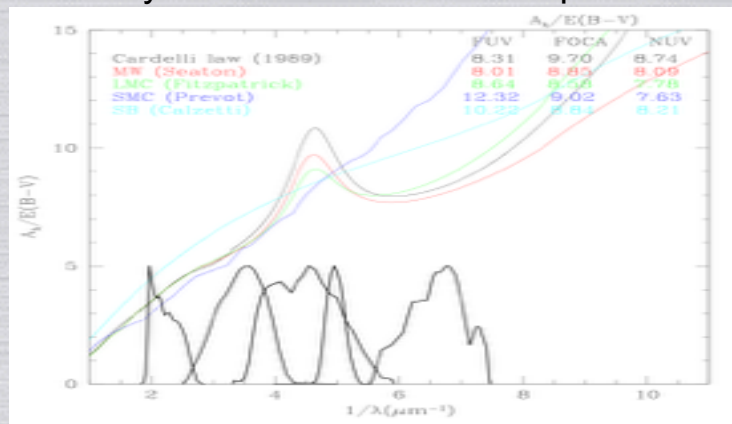
Impact on broad bands



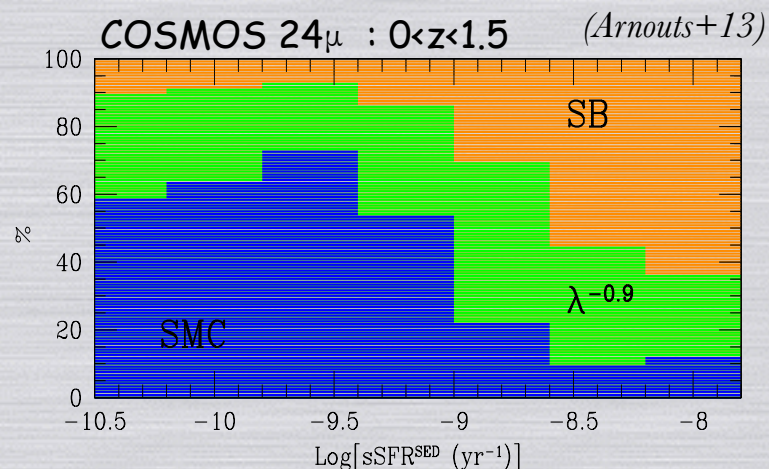
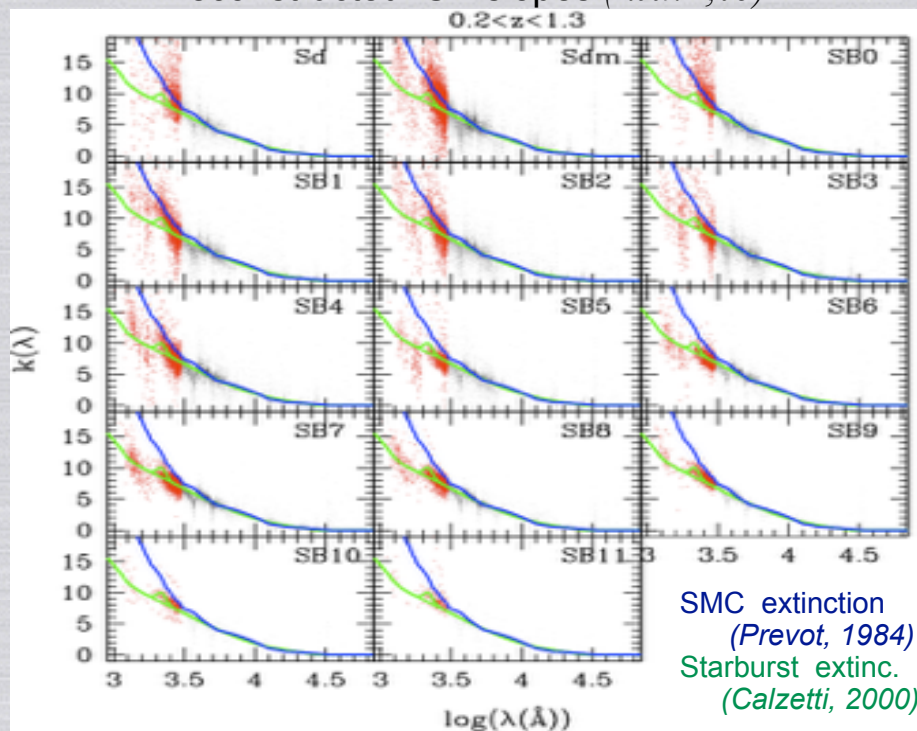


# Le Phare's features

-3- Several attenuation Laws for diversity of the observed UV slopes



reconstructed UV slopes (Ilbert+,09)

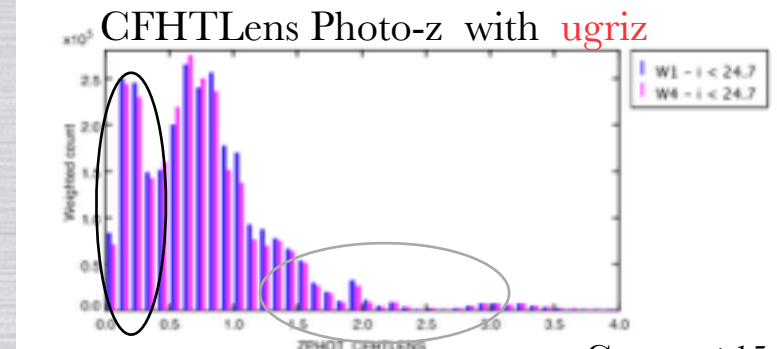
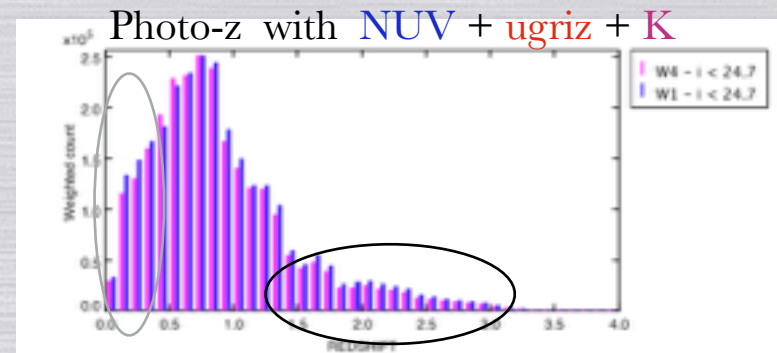
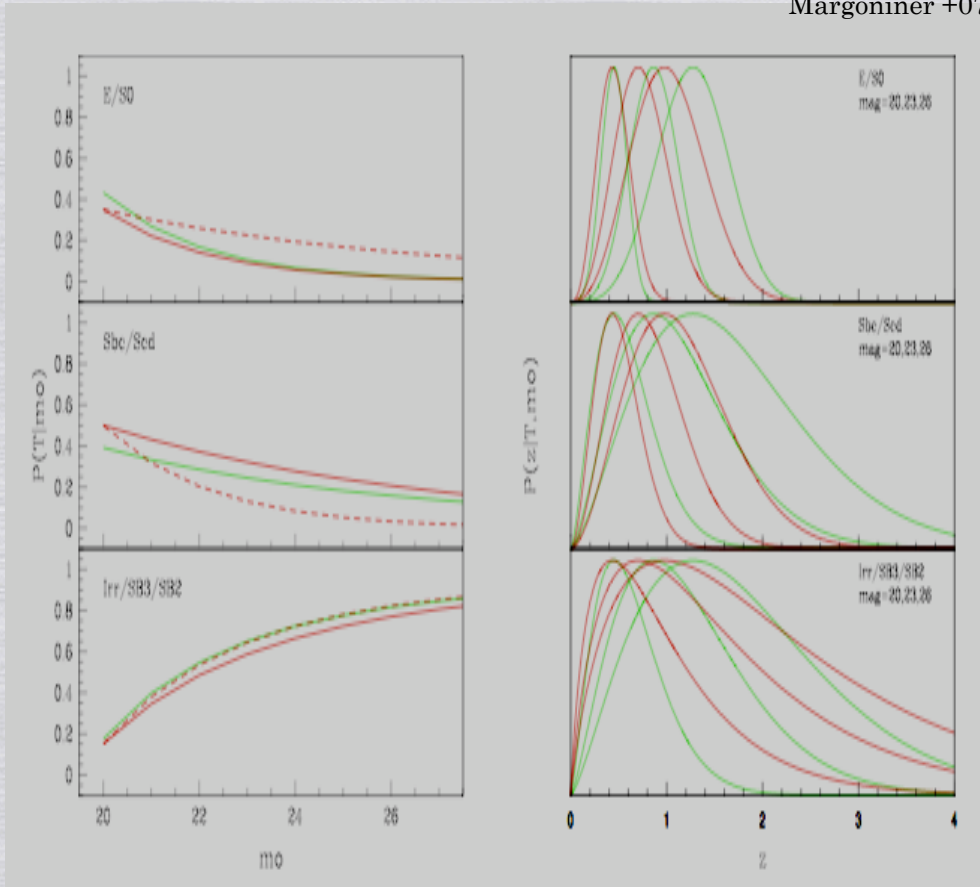


# Le Phare's features

-4- Prior on  $N(z)$  for type (T) and mag. Bayesian approach from Benitez+00

$$p(z, T | i'_{AB}) = p(T | i'_{AB}) p(z | T, i'_{AB})$$

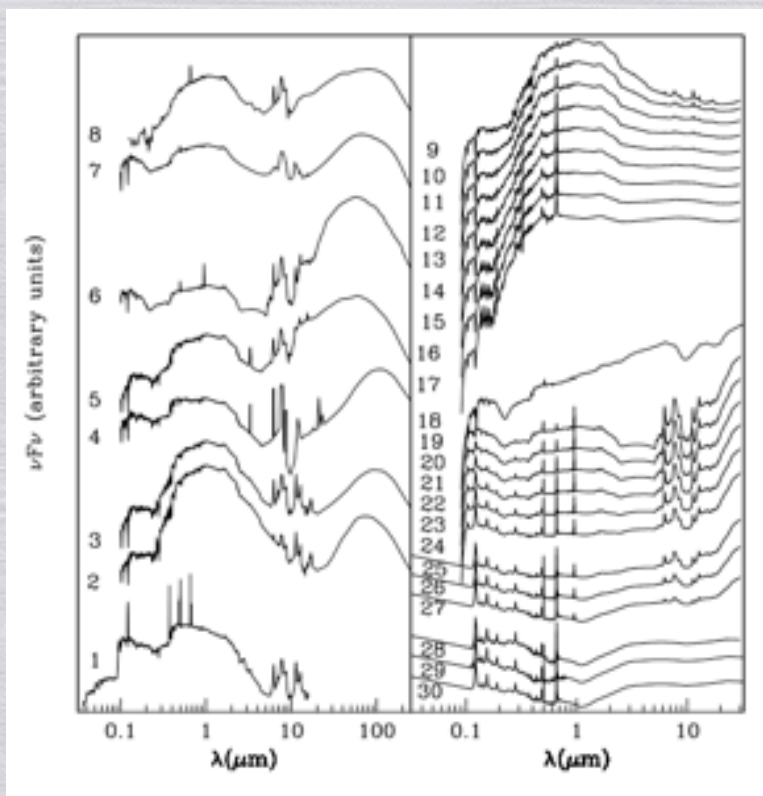
Margoniner +07



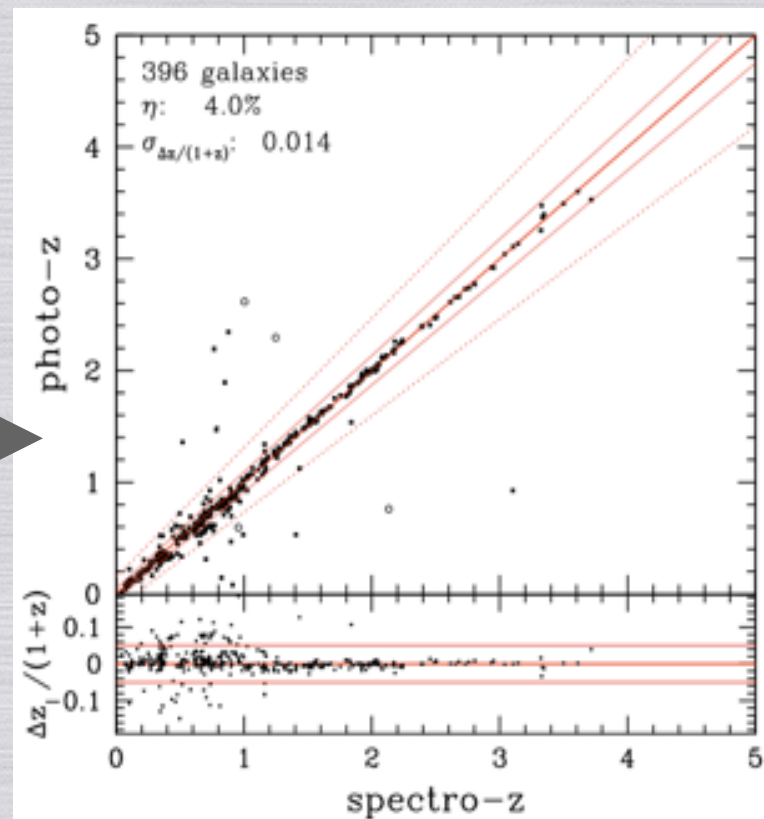
# Le Phare's features

## -5- Photo-z for QSO/AGN in COSMOS (Salvato +08)

combines QSOs and hybrid models (AGN+galaxy)



application of a  
Luminosity prior





# Redshifts and uncertainties

## Standard approach:

$Z_{\text{best}} = \text{lowest } \chi^2_{\text{min}}(z)$

$\text{PDF} \propto \exp(-0.5 \chi^2_{\text{min}}(z))$

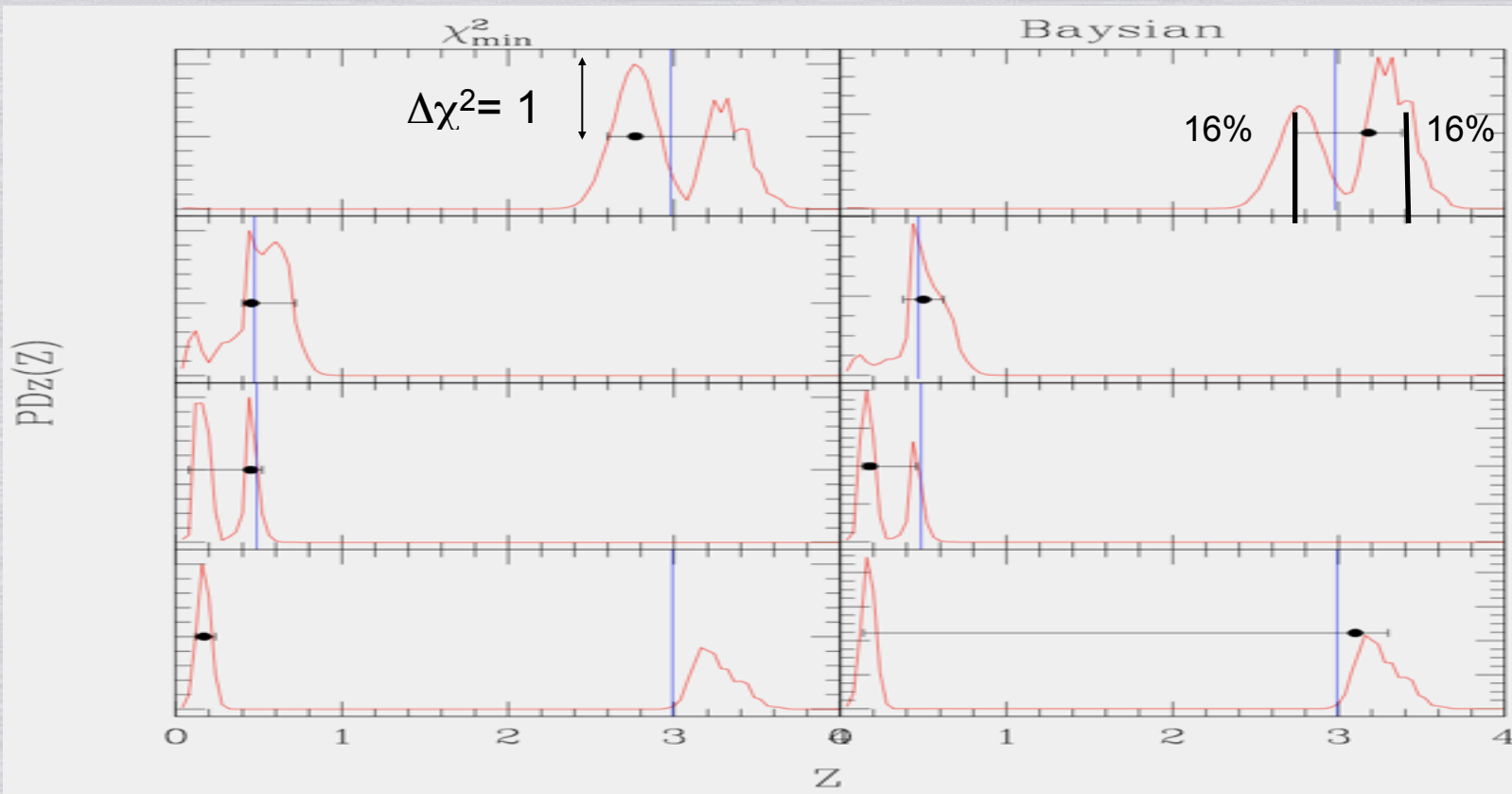
$1\sigma$  (68%) errorbar computed with  $\Delta\chi^2 = 1$

## Kauffmann's approach (Kauffmann+03)

$\text{PDF} \propto \sum_i^{\text{mod}} \exp(-0.5 \chi^2_i(z))$

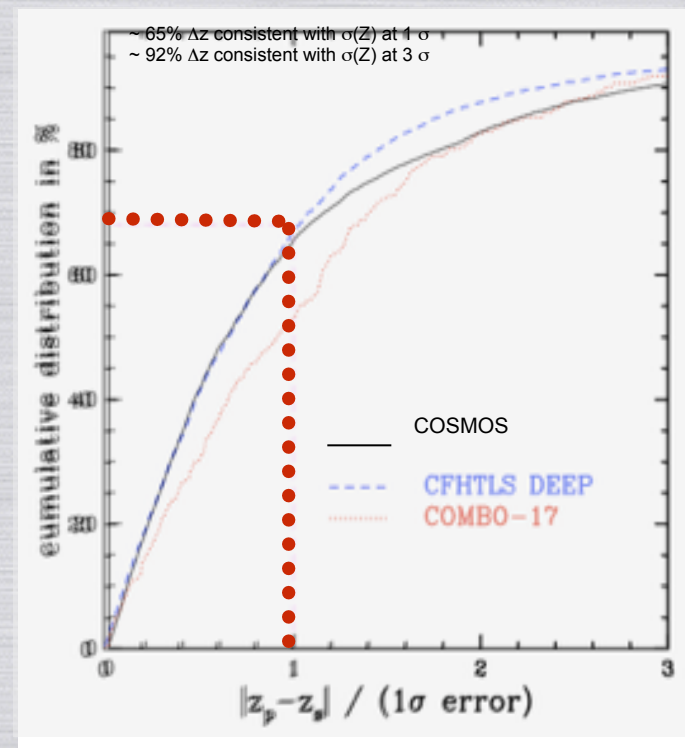
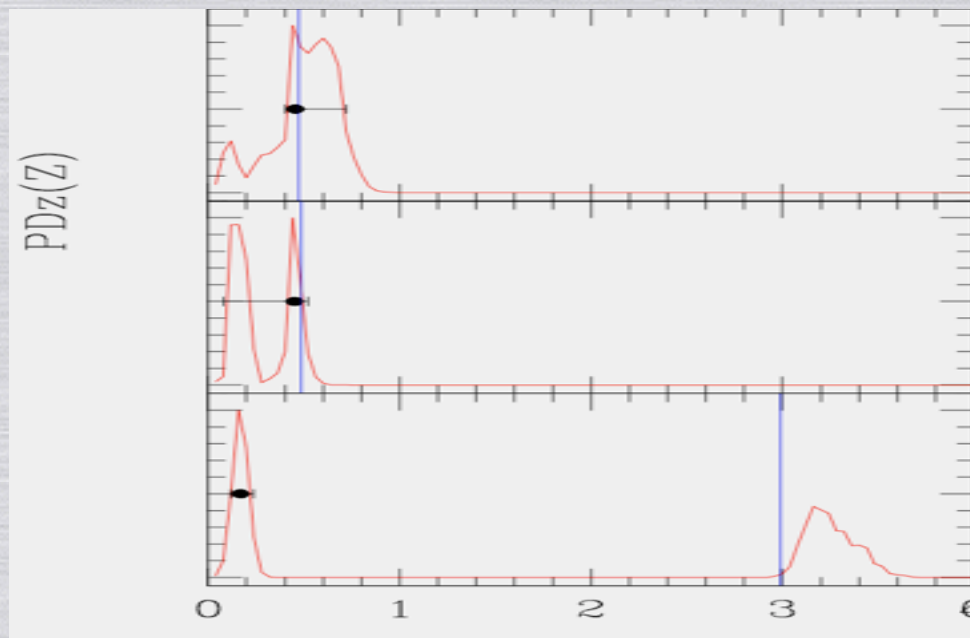
$Z_{\text{best}} = \text{Median of the PDF}$

68% errors from the PDF



# Redshifts and uncertainties

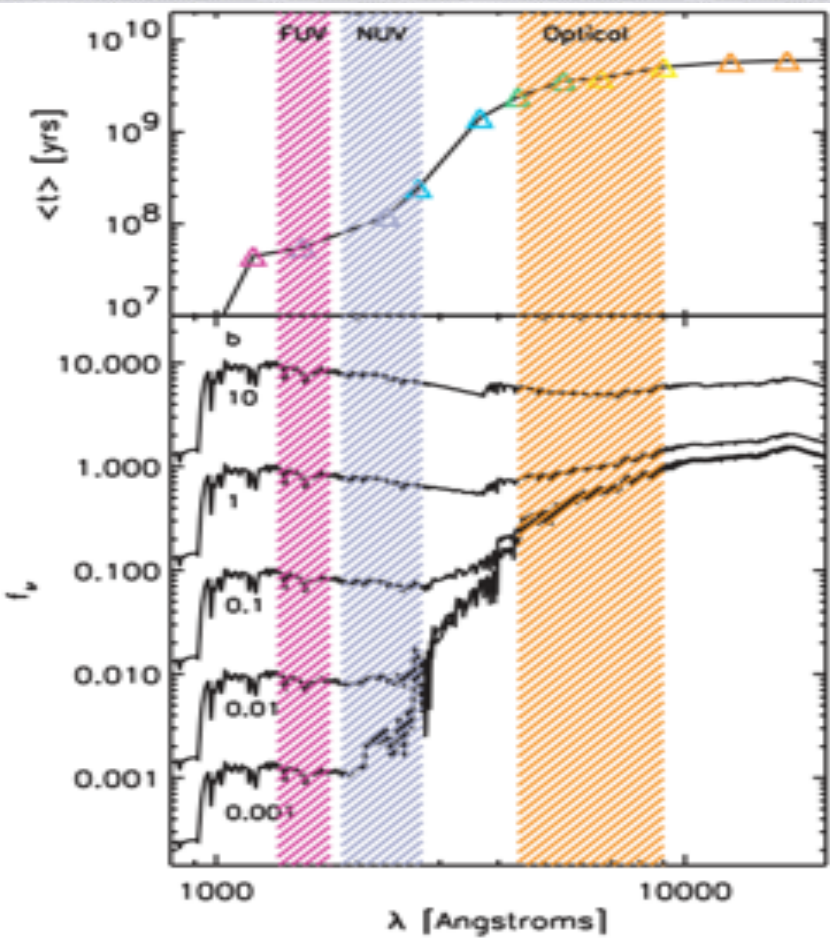
- \* Redshift errors and  $\text{PDF}(z)$  are critical in most of statistical analysis and must be as robust as possible



# Galaxy properties

- 1- Physical parameters from large stellar population synthesis model libraries (PEGASE, BC03, CB07, Maraston,...) with errors from marginalized PDFs.

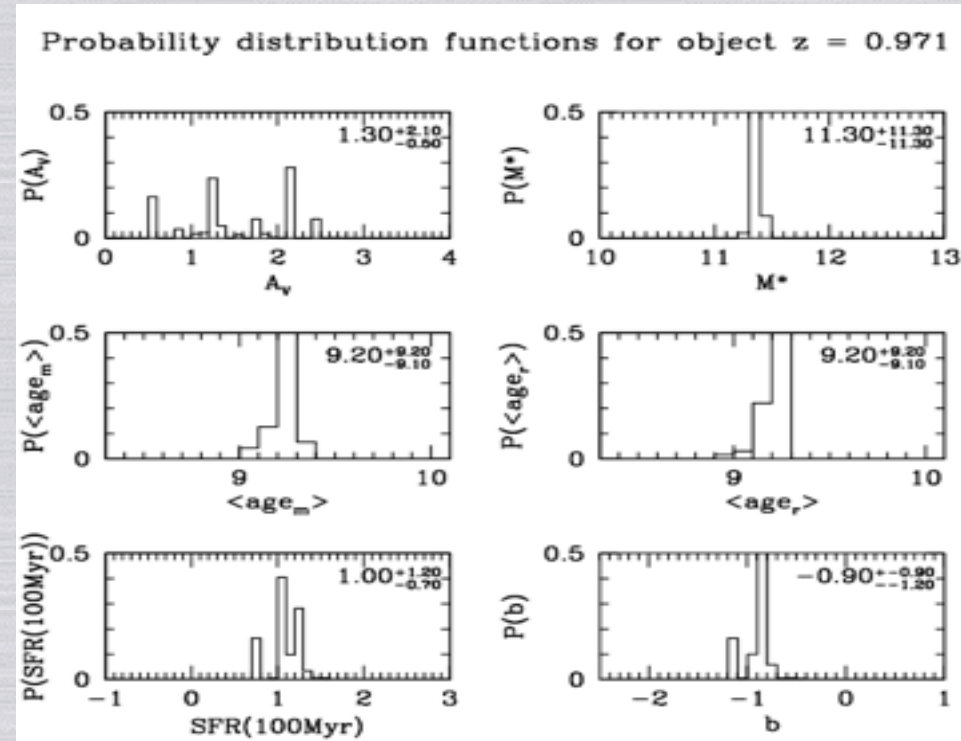
Martin+05



- Probabilities for all models are marginalized over all parameters but the one to be measured.

(Kauffmann+03)

Walcher+07

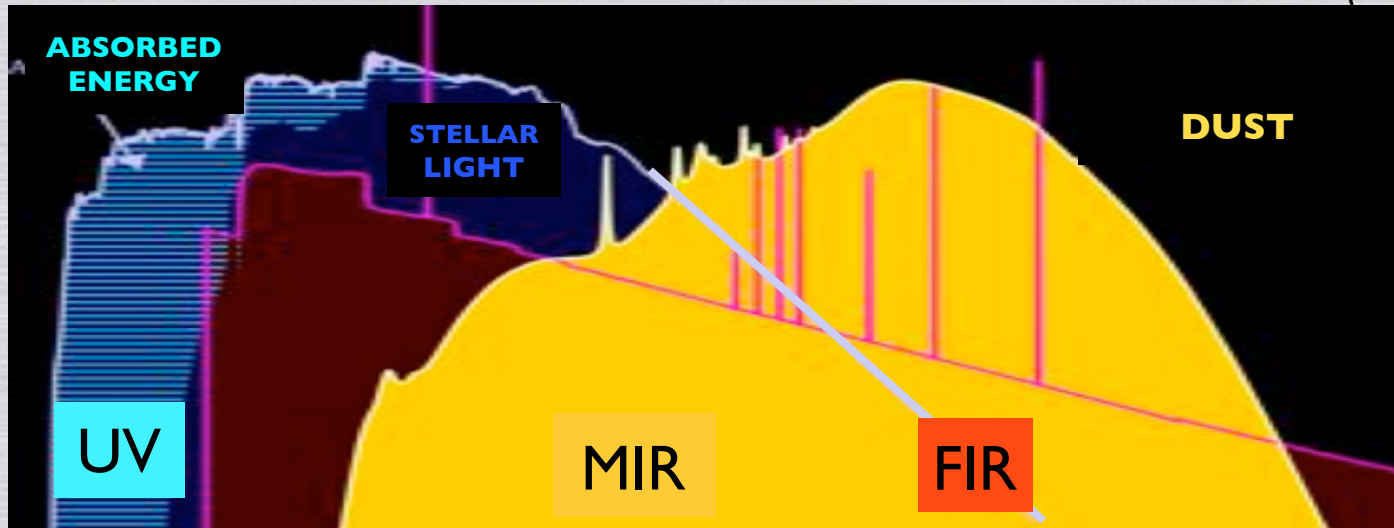




# Galaxy properties

- 2- Also it includes FIR to Radio libraries to derive Far-IR luminosity  
(with various calibration schemes depending on Instrument)

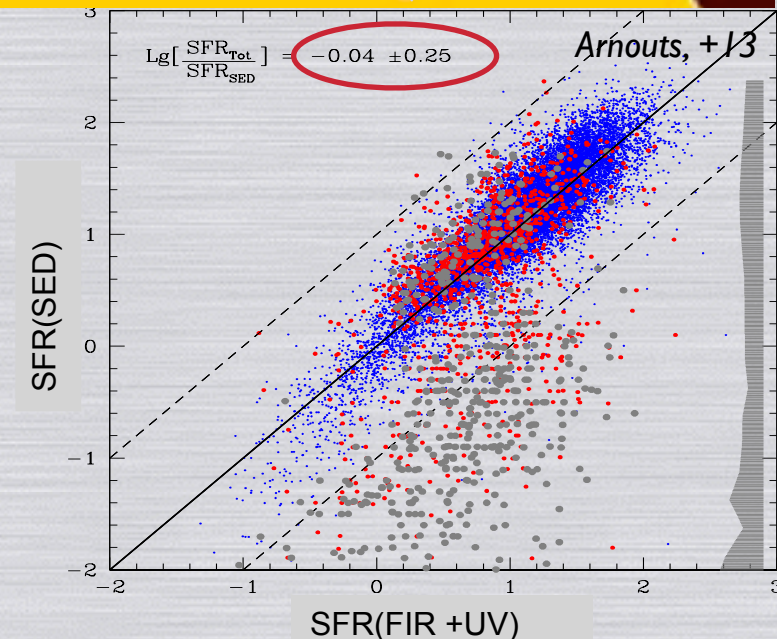
*Desert (90)*



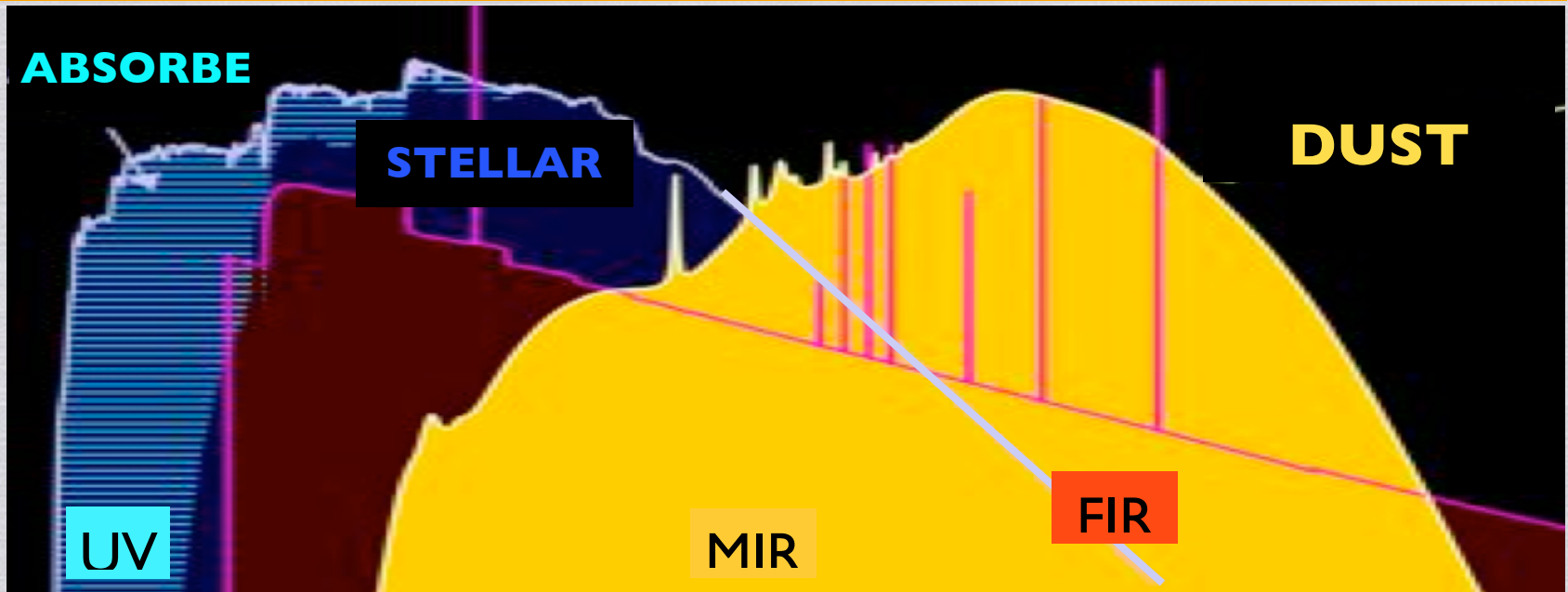
Comparison of SFR derived with SED fitting and SFR from FIR + UV

SED fitting:  $0.15 < \lambda < 4.5 \mu + 3$  Attenuation Laws

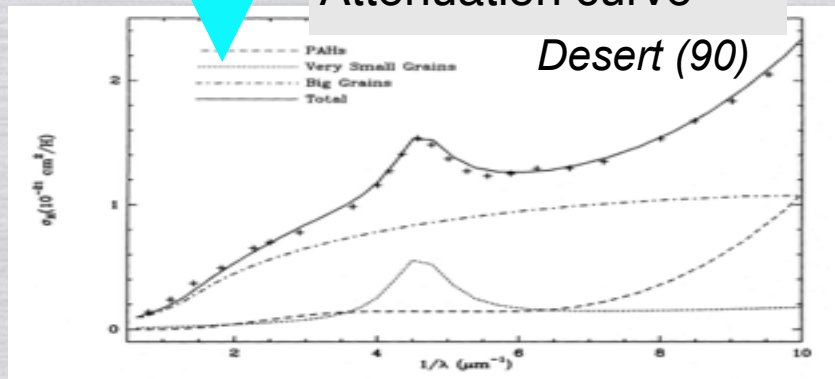
Good agreement over 3 dex of SFR.



# The Role of Dust

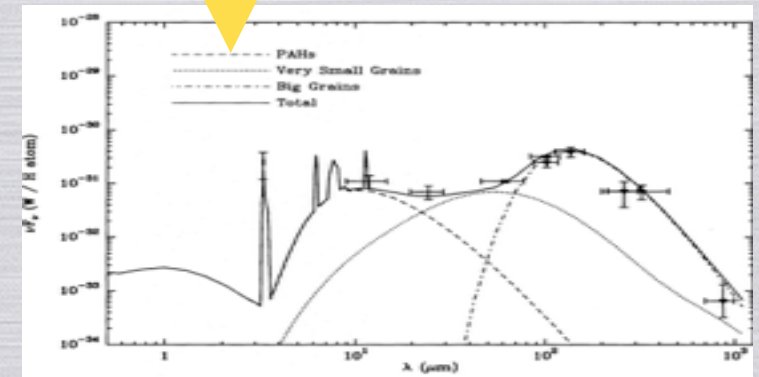


Attenuation curve



- \* extinction law (dust composition)
- \* star / dust distribution
- \* galaxy geometry

Far IR emission

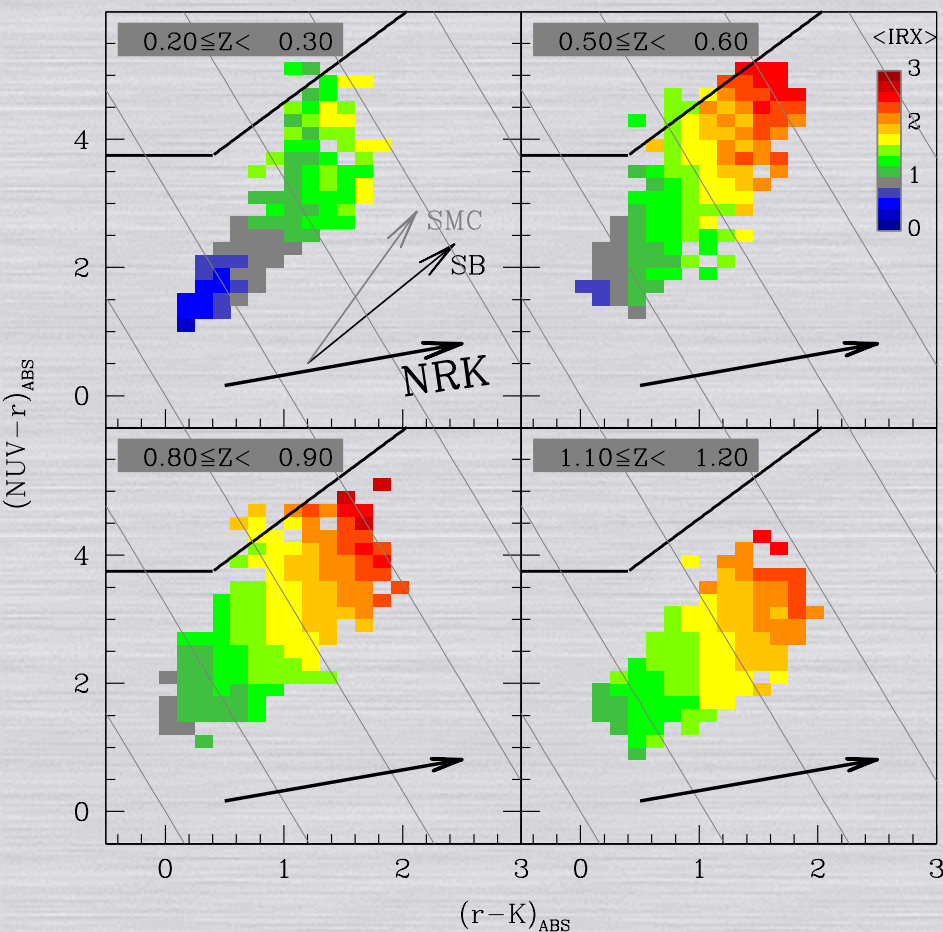


- \* Dust grain size + composition

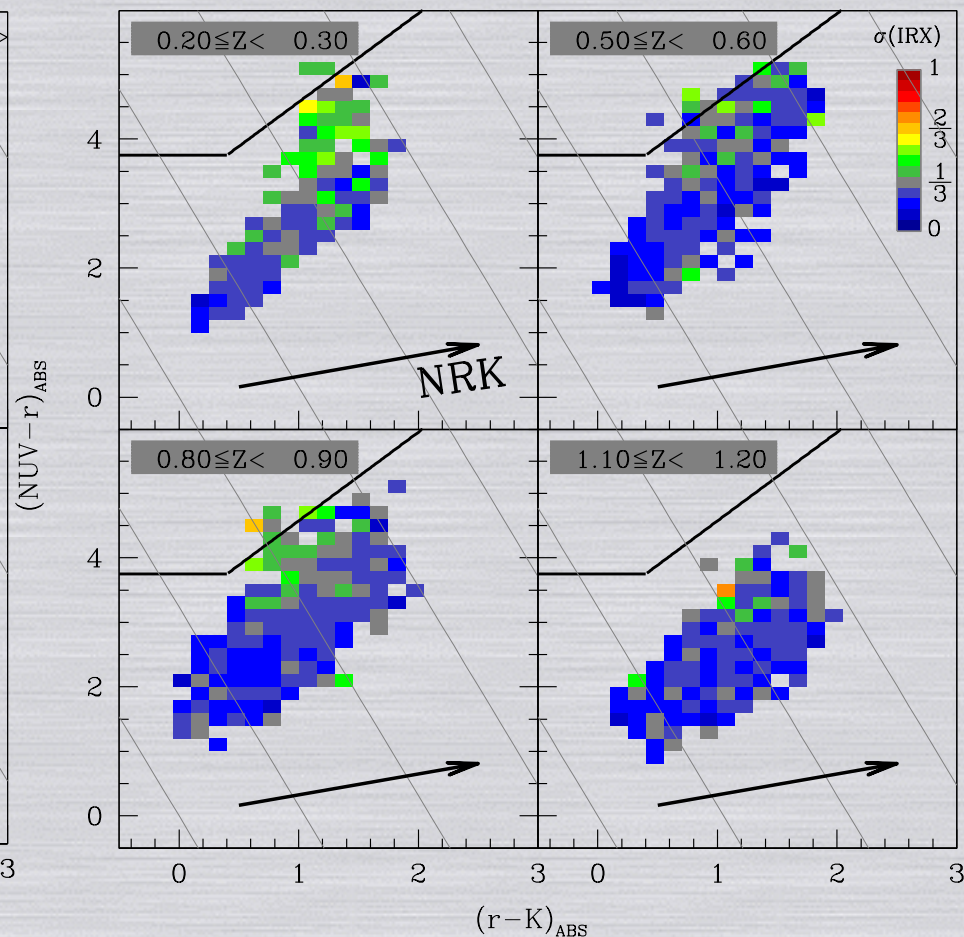
# Recovering the missing UV photons

## Behaviour of the IRX ( $\sim L_{\text{IR}}/L_{\text{UV}}$ ) in the NUV - r - K diagram

Arnouts, +13



a Stripes of constant IRX  $\perp$  NRK



r.m.s  $< 0.3\text{dex}$



# What is the origin of the IRX stripes ?

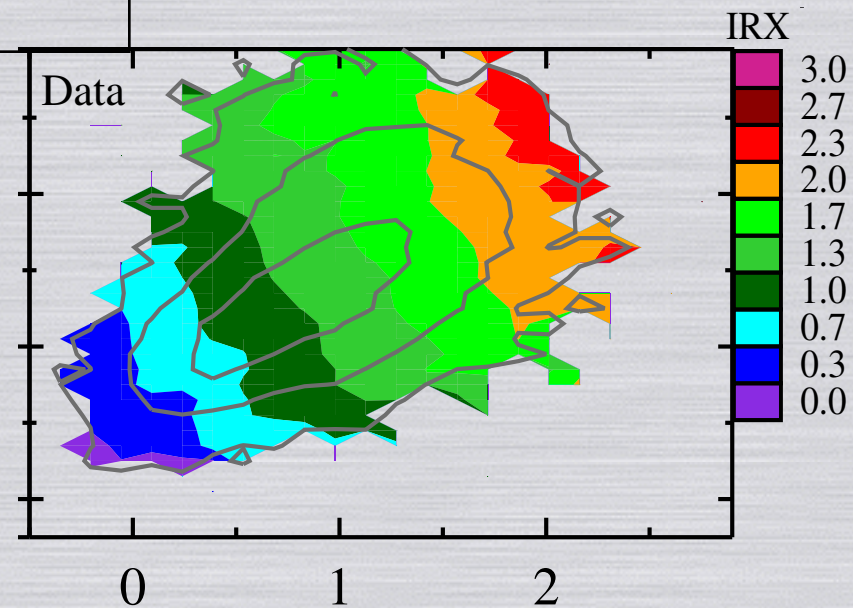
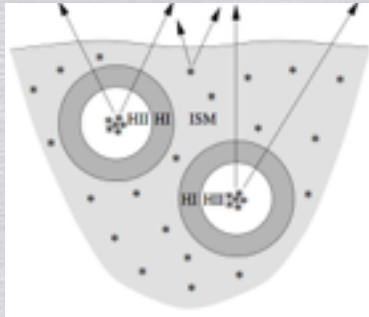
Can we understand the shape & location of the IRX ?

## *The model's ingredients :*

-1- Stochastic SFH from SAM (*Pacifici, 12*) to reproduce the global sSFR distribution of 24um sample

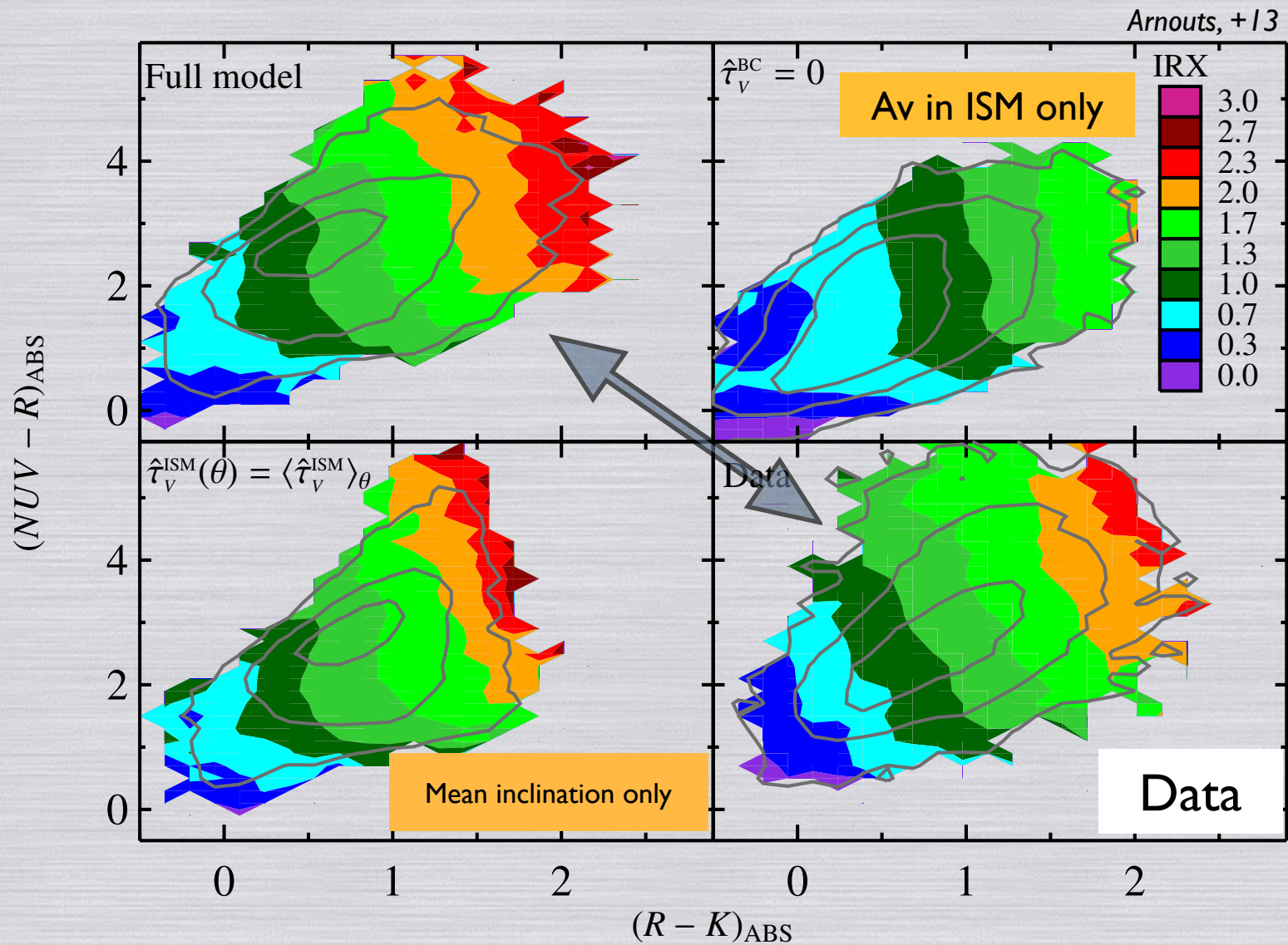
-2- Attenuation :  
balance between the ambient ISM  
and the Birth Clouds  
(*Charlot & Fall, 00*)

-3- Inclination effects (*Chevallard+,2013*)



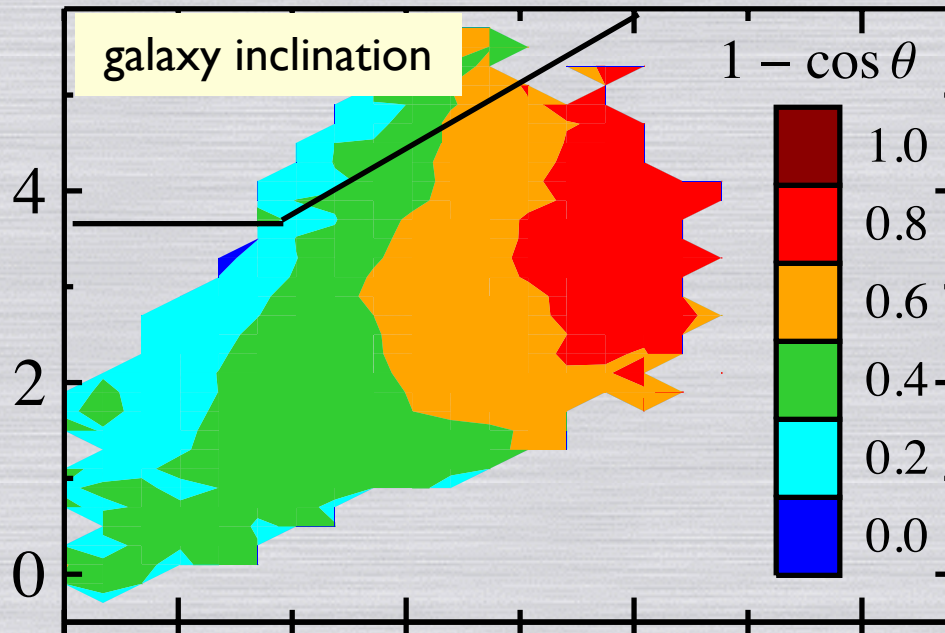
# What is the origin of the IRX stripes ?

... Good modeling if we include all the ingredients !



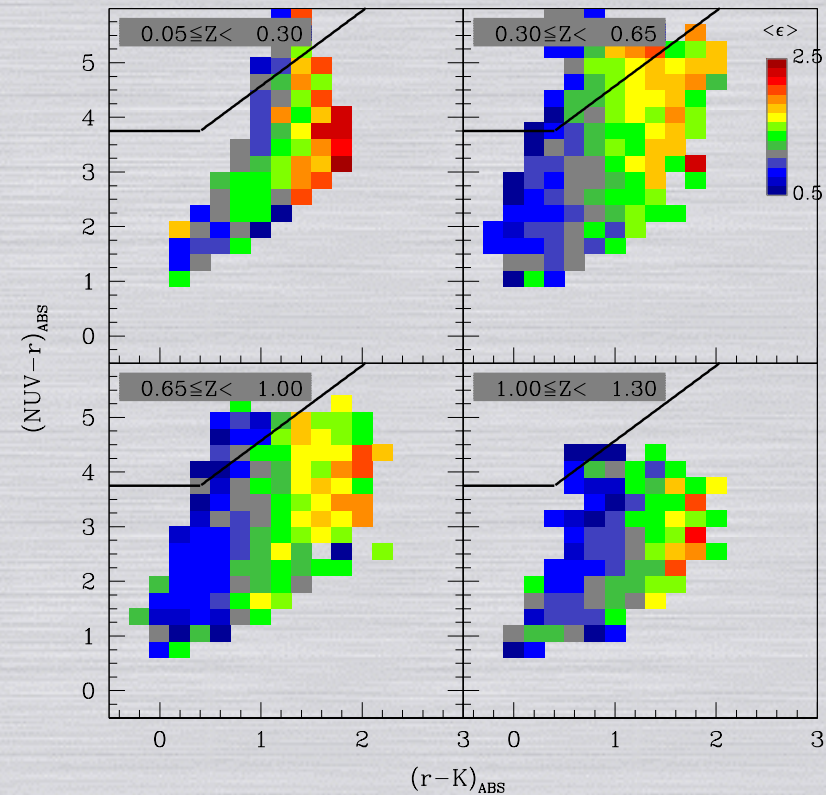
# Impact of galaxy inclination

Model prediction for galaxy inclination



a strong dependence with (R-K) color  
as observed in the data

COSMOS ellipticities (Scarlatta+07)

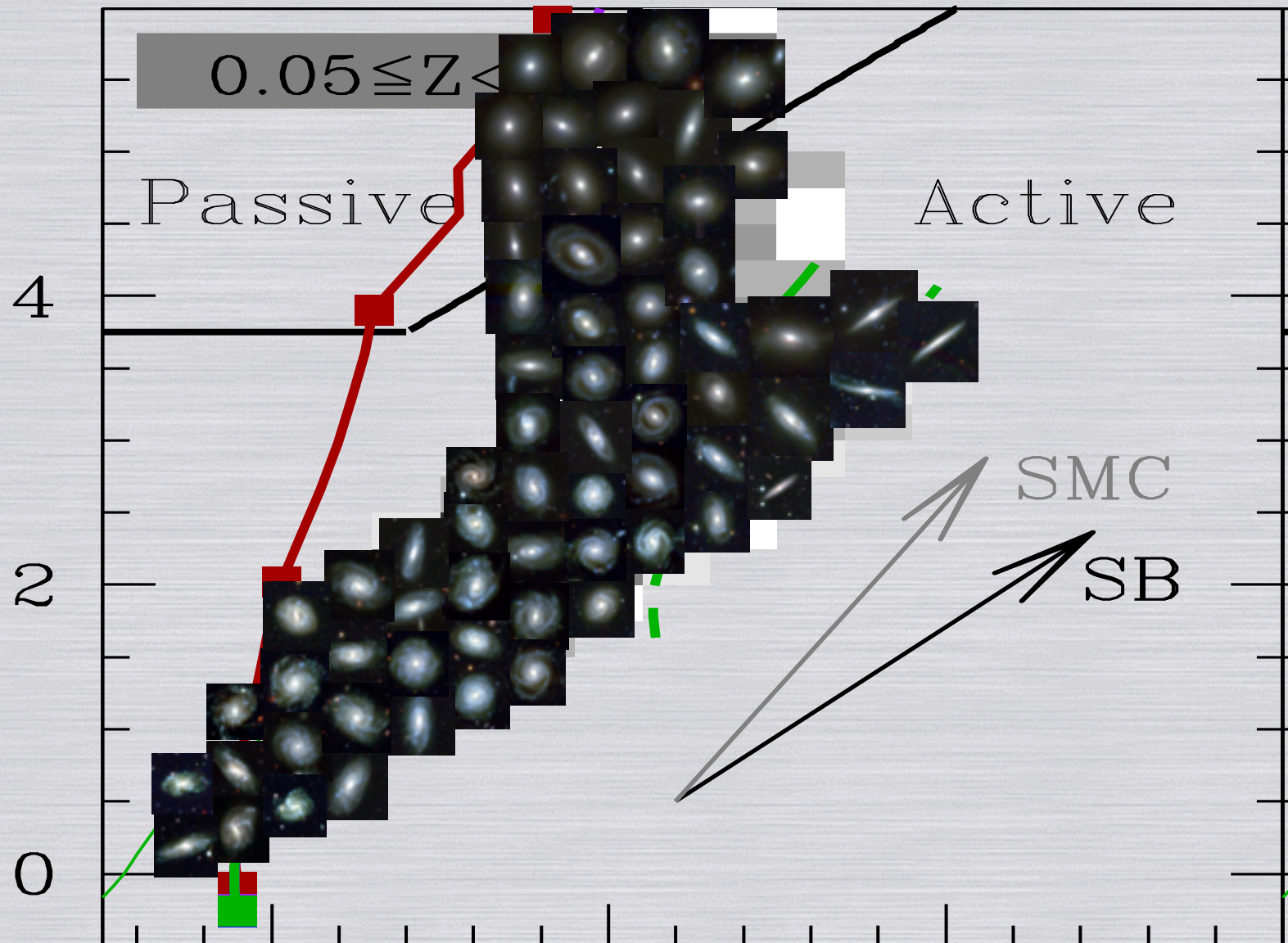




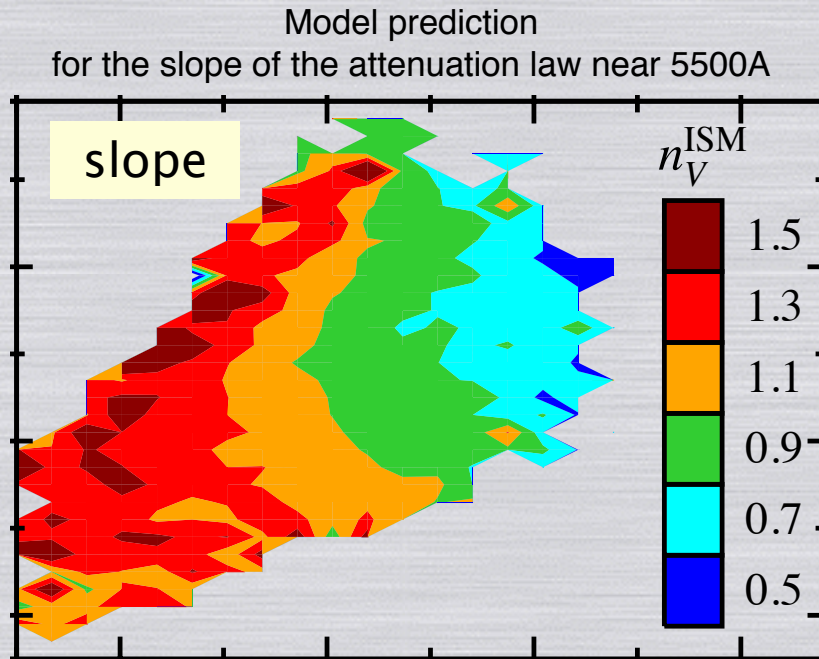
# Impact of galaxy inclination

CFHTLS galaxies @  $z < 0.2$

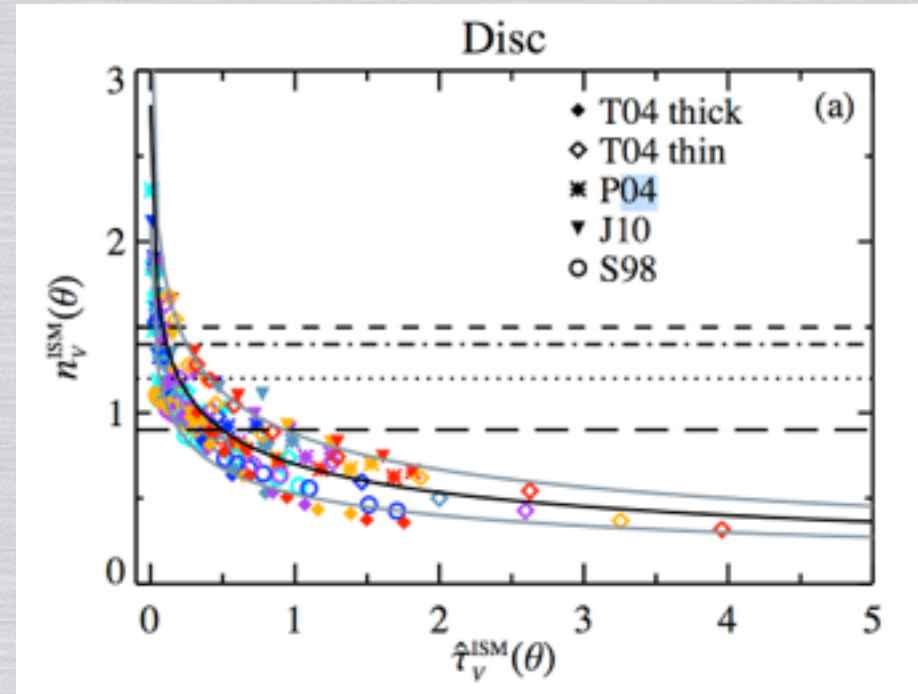
with STIFF U+G+I [Bertin 2006]



# a new dust treatment ?



- Large range of slope for the attenuation curves
- \* steeper/shallower slopes than LMC and SB laws
  - \* how many attenuation laws do we need ?? :-(  
... BUT ...



Chevallard +, 2013 ran full set of RT models. They all predict a quasi-universal relation between slope of the attenuation curves and V-band attenuation optical depth at all galaxy inclinations

In principle, this should simplify the treatment of dust for SED fitting !



# Le Phare's structure

\* LePhare is defined by 2 environments :

1 : all the inputs, SED, filters, ...

2 : user's env. with intermediate and final products

\* it runs in command line with a configuration file

> easy to encapsulate in scripts

\* To get informations about your filters

```
waimea-dhcp5:~ stephane$ filter_info -f filter_hdfn.dat
```

# NAME	IDENT	area(A)	lb_wav(A)	lb_eff(A)	FWHM(A)	AB-cor	TG-cor	VEGA	M_sun(M8)
F300W	1	853.7	2999.5	2993.3	864.0	1.398	89.990	-21.152	7.433
F450W	2	875.7	4573.4	4512.5	1076.6	-0.074	0.339	-20.609	5.295
F606W	3	1877.4	6028.1	5827.1	2033.8	0.095	0.161	-21.367	4.720
F814W	4	1445.8	8012.8	7864.4	1373.1	0.417	0.641	-22.322	4.529
Jbb	5	2034.0	12369.9	12211.7	2066.0	0.890	89.990	-23.740	4.559
H	6	3227.4	16499.9	16251.6	3377.0	1.361	89.990	-24.839	4.702
K	7	3853.8	22210.2	21971.0	3967.0	1.881	89.990	-26.012	5.178

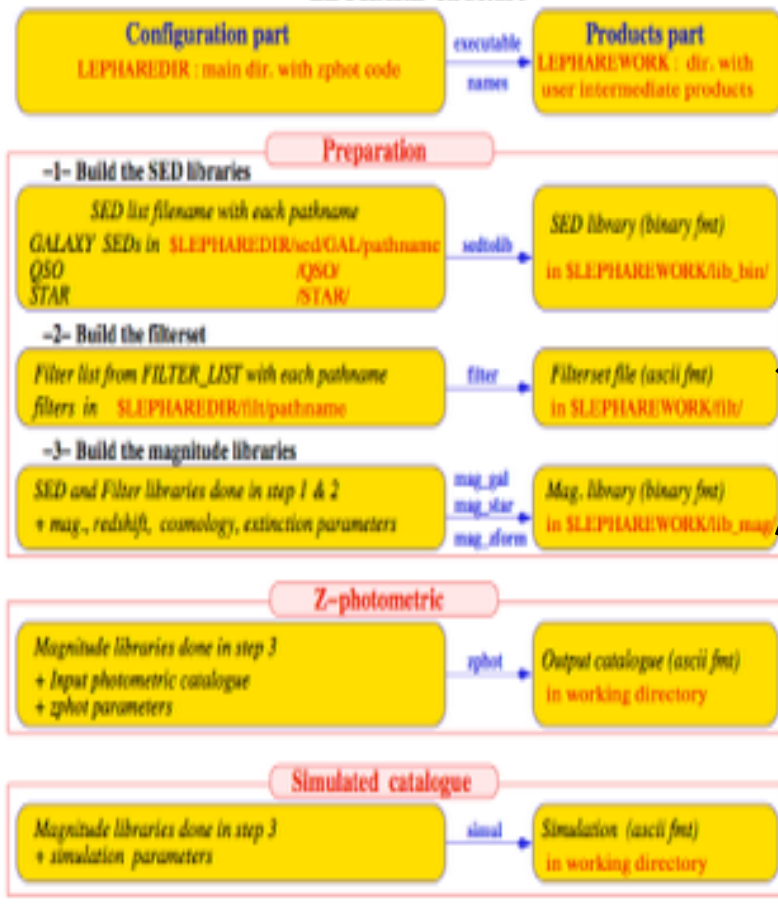
```
waimea-dhcp5:~ stephane$ filter_extinc -f filter_hdfn.dat -e extinc_ctio.dat
```

Option "-g" not defined  
Option "-o" not defined

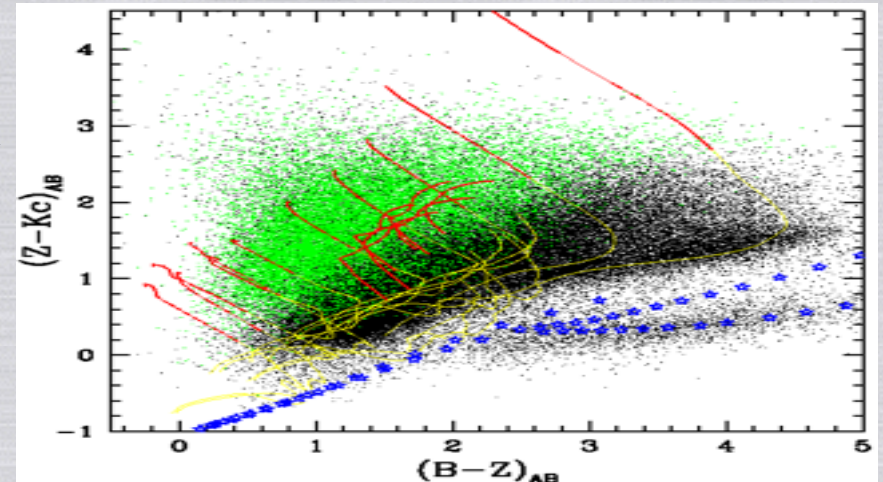
```
*****
# Computing the ATMOSPHERIC/GALACTIC EXTINCTION #
# with the following OPTIONS #
# FILTER_FILE : /Users/stephane/zpuwork/Filter/filter_hdfn.dat
# EXT_CURVE : /Users/stephane/lephare/ext/extinc_ctio.dat
# GAL_CURVE : CARDELLI law
# OUTPUT : NONE
*****
```

Filters	Ext(mag/airmass)	Albda/A	Albda/E(B-V)
F300W	0.718	1.905	5.904
F450W	0.266	1.266	3.924
F606W	0.132	0.913	2.831
F814W	0.051	0.604	1.873
Jbb	0.030	0.289	0.896
H	nan	0.183	0.566
K	nan	0.112	0.349

## LE PHARE structure



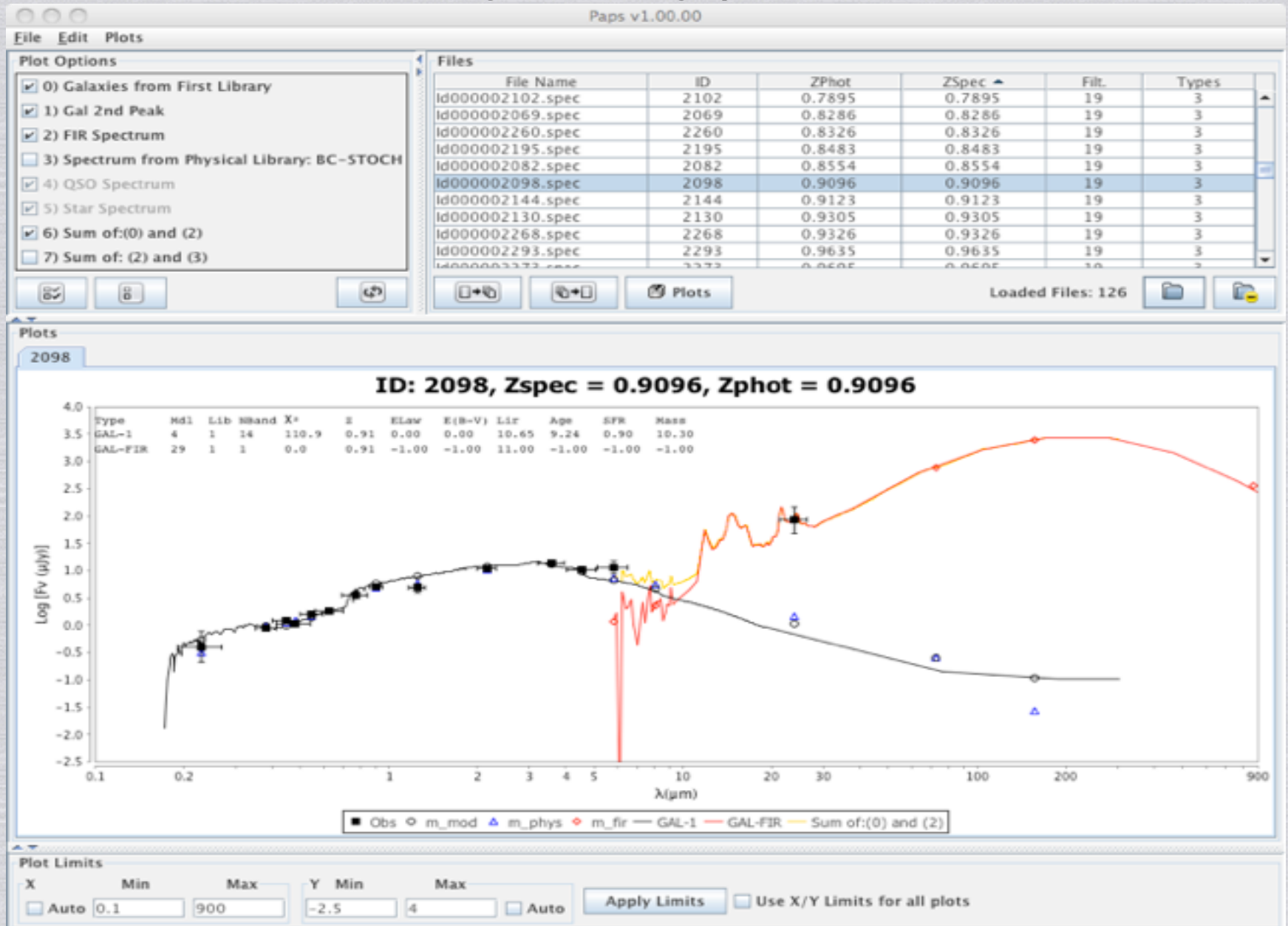
\* color-color tracks for the libraries vs obs.





# Visualization tool : PAPS

*P*Arsing and *P*lotting *S*pectra by A. Draginda (@CFHT, java script)



# Future scientific developments

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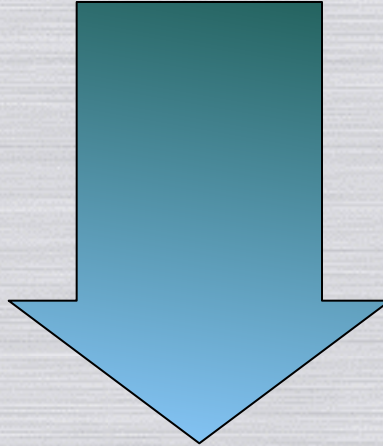
- \* Photo-z + Physical parameters :
  - New treatment of the dust to account for results from Chevalard+14.  
This could simplify the current modeling.
  - AGN contribution ?
- \* Physical parameters
  - treat simultaneously the energy budget (FIR and UV emission)
- \* Extend the SED fitting to a combined approach : Photometry + Spectra



*LePhare Download Install Syntax Examples Acknowledgement*

<http://www.cfht.hawaii.edu/~arnouts/lephare.html>

*Le Phare will migrate  
from  
Hawaii to Marseille*



<http://www.lam.fr/lephare.html>



*LePhare Download Install Syntax Examples Acknowledgement*