

Baryon Acoustic Oscillation and photometric redshift with LSST

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Accelerating universe and Dark Energy

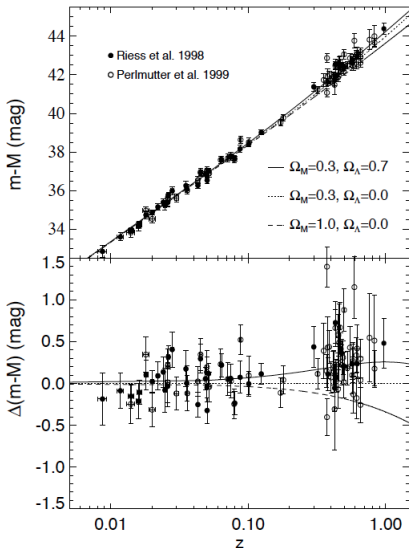
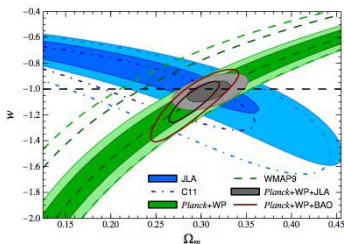
1998 : distant Type Ia supernovae have lower recession velocity than expected (Riess and Perlmutter, nobel prize 1991)

⇒ universe is accelerating

⇒ **Dark Energy** ($p < 0$)

$$p = w\rho = [w_0 + w_a(1 - a)]\rho$$

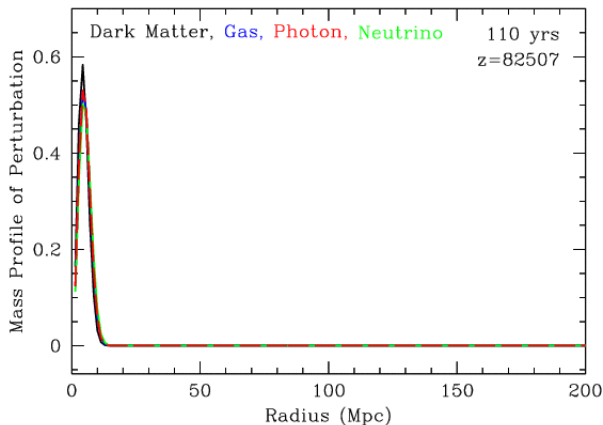
- observation is needed :
CMB, SN, **BAO**, WL...



What is BAO?

Structure formation in the universe relies on gravitational instability to aggregate the material.

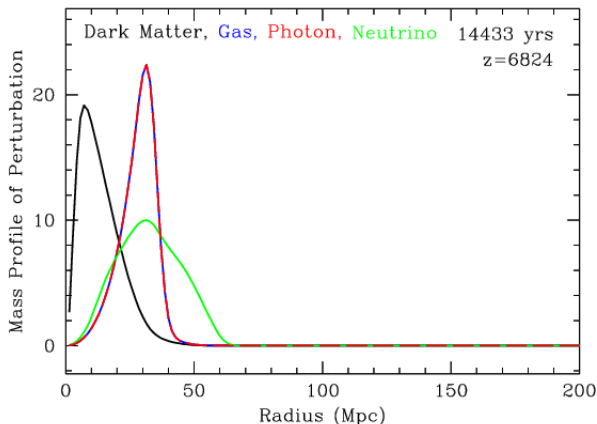
- 0) **Initial perturbations** : adiabatic \rightarrow all of the species are perturbed the same fractional amount



What is BAO?

Structure formation in the universe relies on gravitational instability to aggregate the material

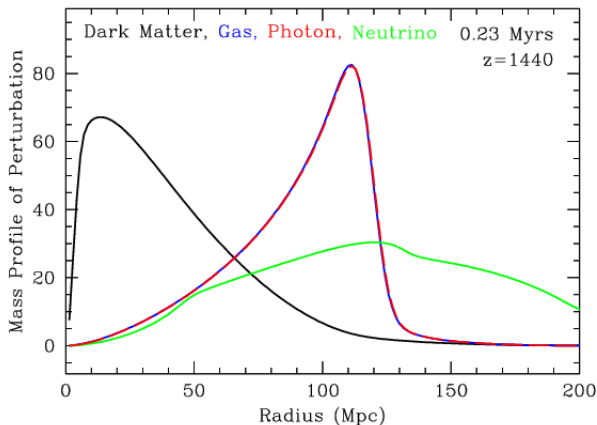
- 1) Spherical acoustic wave; baryons coupled to photons; **neutrinos escape**, dark matter moves only in response to gravity and has no intrinsic motion



What is BAO?

Structure formation in the universe relies on gravitational instability to aggregate the material

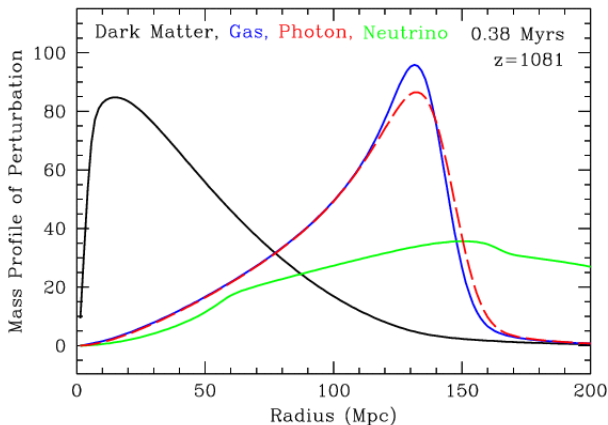
- 2) Spherical shell of gas and photons continues to expand. The **neutrinos spread out**. The dark matter collects in the overall density perturbation.



What is BAO?

Structure formation in the universe relies on gravitational instability to aggregate the material

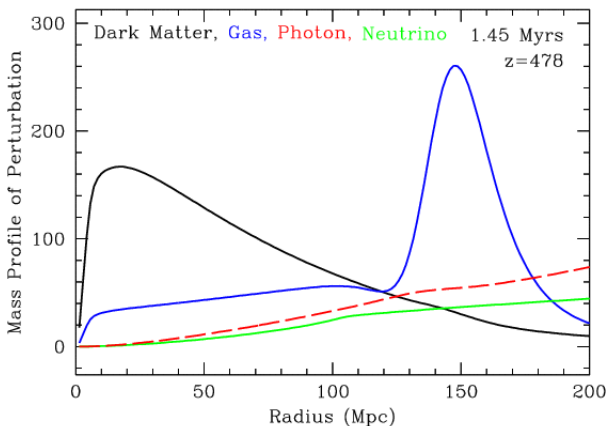
- 3) Electrons and nuclei begin to combine into neutral atoms. The expanding universe is cooling. **Photons and gas coupling is reduced.**



What is BAO?

Structure formation in the universe relies on gravitational instability to aggregate the material

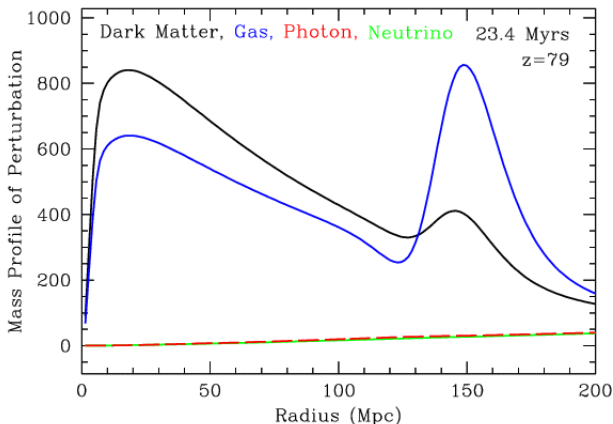
- 4) **Decoupling** : sound speed vanished ; baryon carry the footprint of fluctuations in a shell about 150 Mpc. Photon escape (CMB)



What is BAO?

Structure formation in the universe relies on gravitational instability to aggregate the material

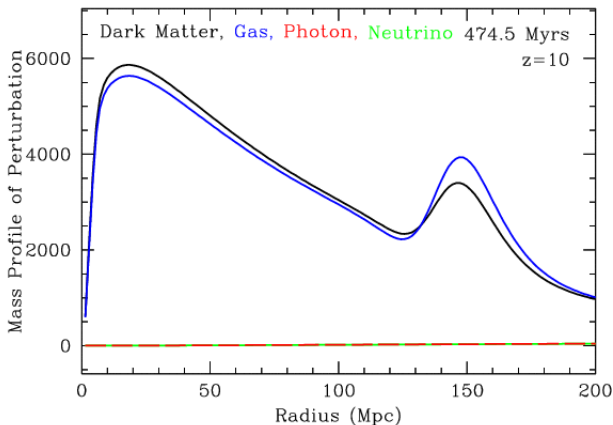
- 5) DM and baryons coupled by gravitation : the spherical shell of the gas perturbation has imprinted itself in the dark matter \Rightarrow **acoustic peak**.



What is BAO?

Structure formation in the universe relies on gravitational instability to aggregate the material

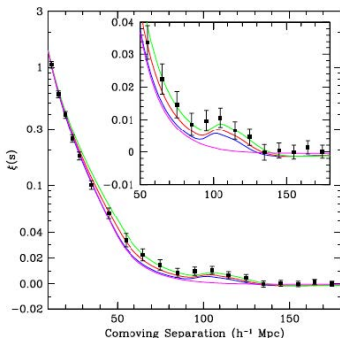
- 6) **The acoustic peak decreases** in contrast as the gas come into lock-step with the dark matter.



BAO as a cosmological probe

- Measure of the probability to find a galaxy from an other
⇒ **correlation function** $\xi(r)$.
→ $\chi = 100h^{-1} \text{Mpc}$
- First measurement :
2005 (2dFGRS and SDSS)
- A 3D measurements :
 - Position of acoustic peak
⇒ Size of the sound horizon $rs(\Omega_m, \Omega_B)$
 - Transverse direction :
 $\Delta\theta = rs/(1+z)/DA(z)$
⇒ Sensitive to angular distance $DA(\mathbf{z})$
 - Radial direction :
 $\Delta z = rs * H(z)/c$
⇒ Sensitive to Hubble parameter $H(\mathbf{z})$:

$$H(z) = H_0 \sqrt{\Omega_m(1+z)^3 + \Omega_\lambda + (1 - \Omega_m - \Omega_\lambda)^2}$$



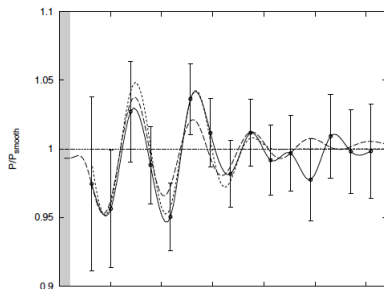
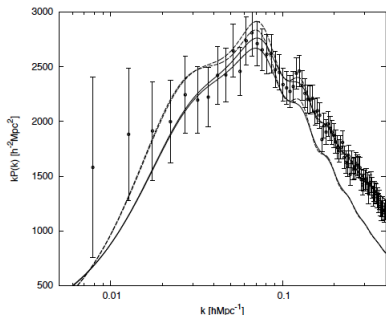
Determination of the acoustic scale

- Power spectrum :

$$P(k) = TF(\xi(r)) = \int \frac{d^3r}{(2\pi)^3} \exp(-ikr)$$

- Method "wiggle only"

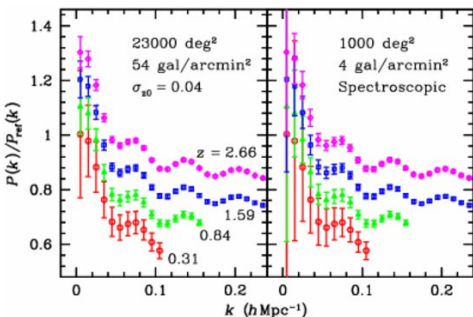
- $P(k)$ is divided by a spectrum without wiggle
- FKP method : $P_R(k)$ compute on a random catalogue with same selection function as the data catalogue.
- fit with a parametrized function.



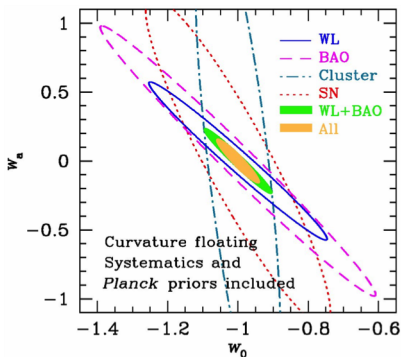
BAO with LSST

- Instrument for BAO :

- BOSS, eBOSS (2014-2020),
- DASI (2019-2024)
- Euclide (2020)
- **LSST** (2021-2031) : 10 billions of galaxies, up to $z = 3$



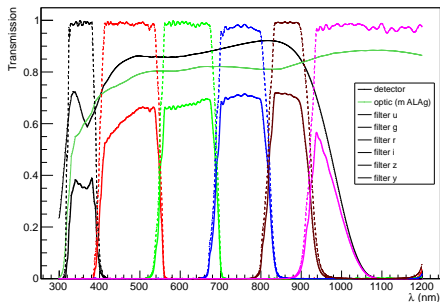
⇒



- power spectrum is measured at different redshift bins.

What do we need ?

- a huge statistics : not a problem for LSST
- a high precision on redshift measurement.



LSST : 6 photometric bands ugrizy
 \Rightarrow **photometric redshift**

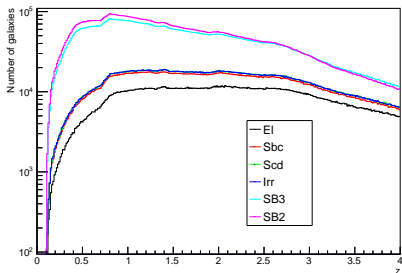
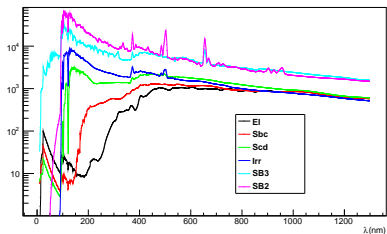
- machine learning method
- **template fitting method**
 - \rightarrow we compute the integrated flux in each bands,
 - \rightarrow we compare expected flux to some known emission spectrum at a range of redshift.

LSST specification on $|\Delta z| = \left| \frac{z_p - z_s}{1 + z_s} \right|$:

- 0.05 random error (RMS),
- bias $< 3 \cdot 10^{-3}$,
- % outliers $< 10\%$.

1) Simulated Galaxies Catalogue

- Λ CDM cosmology is assumed
 - computation of over density
 - luminosity function (Dalhen and al.)
- Absolute Magnitude, color excess $E(B-V)$, z_{true} ,
- 51 galaxies spectral type interpolated between 6 main SED.
 - main spectral type : E1, Sbc, Scd, Irr, SB3, SB2.



2) Photometric redshift reconstruction

- apparent magnitude : $m_X = MA + K_{BX} + MD \sim -2.5 \log(F_x)$ with :

$$K_{BX} = -2.5 \log \left[\frac{1}{1+z} \frac{\int d\lambda \lambda T\left(\frac{\lambda}{1+z}\right) X(\lambda) \int \frac{d\lambda}{\lambda} B(\lambda)}{\int \frac{d\lambda}{\lambda} X(\lambda) \int d\lambda \lambda T(\lambda) B(\lambda)} \right]$$

Diagram annotations:

- Box: flux: SED, reedening, Inter Galactic Medium (points to $T(\frac{\lambda}{1+z})$)
- Box: B band Of GOODS (points to $B(\lambda)$)
- Box: Filter (points to $X(\lambda)$)

- error on apparent magnitude : atmosphere, systematics ...
- template fitting method :

$$P(z, T, E(B - V) | \vec{m}) = \frac{\mathcal{L}(z, T, E(B - V)) * \Pi(z, T | \vec{m})}{P(\vec{m})}$$

Diagram annotations:

- Box: Likelihood function (points to $\mathcal{L}(z, T, E(B - V))$)
- Box: Prior (points to $\Pi(z, T | \vec{m})$)

⇒ photometric value z_p, T_p, ebv_p such as

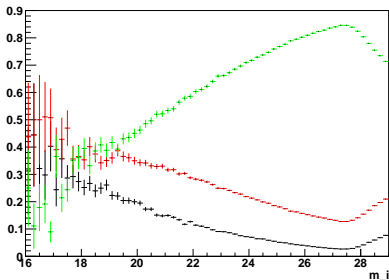
$$\frac{dP(z, T, E(B - V) | \vec{m})}{d(z, T, E(B - V))} = 0.$$

Prior computation

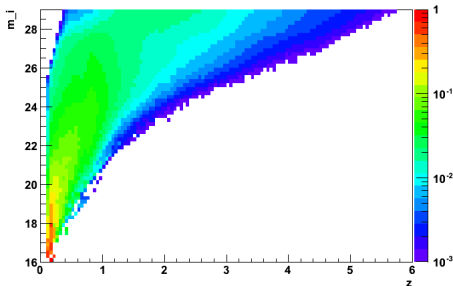
- $\Pi(\mathbf{z}, \mathbf{T}, \mathbf{E}(\mathbf{B} - \mathbf{V}) | \mathbf{m}_i)$: probability for a galaxy with an m_i apparent magnitude in the i filter to be at a redshift z , with a spectral type T and color excess $E(B-V)$: (*Benitez method*)

$$\Pi(z, T, E(B - V) | m_i) = P(T | m_i) * P(z | T, m_i)$$

- Computed for 3 spectral type : Elliptic, **Spiral** and **Starburst**.
- A spectroscopic sample is needed.



$P(T | m_i)$



$P(z | T, m_i)$ (**Starburst** galaxies)

Likelihood computation

$$\mathcal{L}(z, T, E(B - V)) = \exp\left[-\frac{1}{2}\chi^2(z, T, E(B - V))\right]$$

- 1) Observation $\Rightarrow F_i^{obs}(m_i)$
- 2) 3D gride over z , spectral type T and colore excess $E(B-V)$
 $\Rightarrow F_i^{exp}(z, T, E(B - V))$

The diagram shows the chi-squared formula with several components highlighted and labeled with boxes and arrows:

- Observed flux**: A red box pointing to $F_i^{obs}(m_i)$ in the numerator.
- Normalization factor**: A blue box pointing to N in the numerator.
- Expected flux**: A red box pointing to $F_i^{exp}(z, T, E(B - V))$ in the numerator.
- Error on apparent magnitude**: A purple box pointing to $\sigma(F_i^{obs}(m_i), \sigma(m_i))$ in the denominator.

The entire fraction is squared, as indicated by a red arrow pointing to the 2 superscript.

$$\chi^2(z, T, E(B - V)) = \sum_{i=1}^{Nbands} \left(\frac{F_i^{obs}(m_i) - N F_i^{exp}(z, T, E(B - V))}{\sigma(F_i^{obs}(m_i), \sigma(m_i))} \right)^2$$

- 3) χ^2 minimisation ($\Leftrightarrow \mathcal{L}$ maximisation)
 \Rightarrow photometric value z_p, T_p, ebv_p

Quality cut

Outliers : $|\Delta z| = \left| \frac{z_p - z_{true}}{1 + z_{true}} \right| > 0.15$

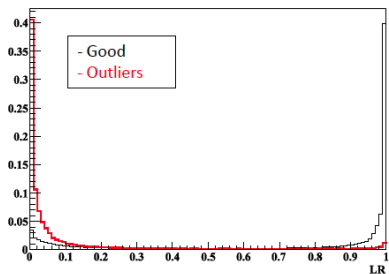
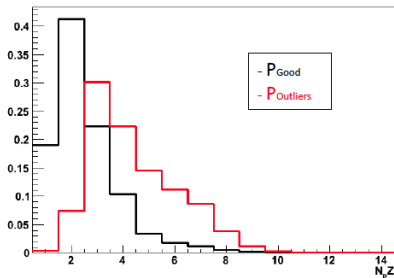
LikelihoodRatio

- training set $\sim 450\,000$ galaxies
- 16 discriminant variables
 - form variable : N_{peak} in the z marginalised pdf ...
 - color terme (ex : $r-i$)

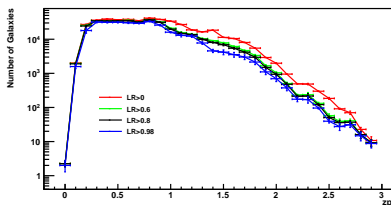
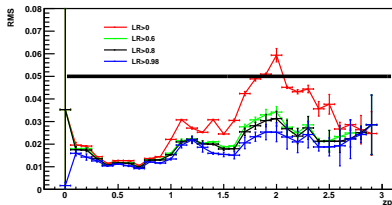
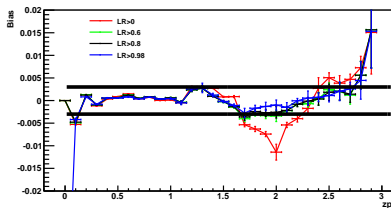
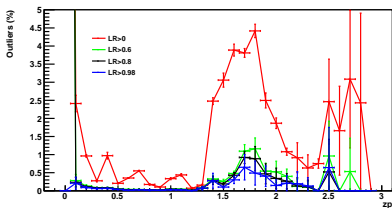
$$\bullet LR = \frac{\prod_{i=1}^N P(\mu_i|G)}{\prod_{i=1}^N P(\mu_i|G) + \prod_{i=1}^N P(\mu_i|O)}$$

$\Rightarrow LR \in [0, 1]$

- Limitation of the method :
 - $P(\mu_i|G) = 0 \rightarrow LR = 0$
Goods \Rightarrow Otliers
 - $P(\mu_i|O) = 0 \rightarrow LR = 1$
Outliers \Rightarrow Goods



Result



\Rightarrow photo- z is in LSST requirement up to $z \sim 2.6$ if $LR > 0.98$

Gorecki & al : *arxiv :1301.3010*

Impact of spatial variation

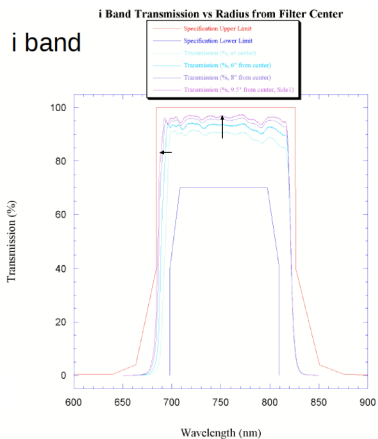
- We can get the photometric redshift with a good precision,
- The photo-z quality could be affected by different uncertainties on parameters which enter in the likelihood computation :
 - reddening or intergalactic medium law,
 - **filters** ,
 - the SED library ...

- LSST filters are quite big (78 cm diameter)

⇒ coating could't be perfect

⇒ What happen on photo-z if filters vary ?

- impact of the incidence angle :
→ effective filter
- what happen if constraints on filters can't be reach ?
- **impact of spacial variation ?**

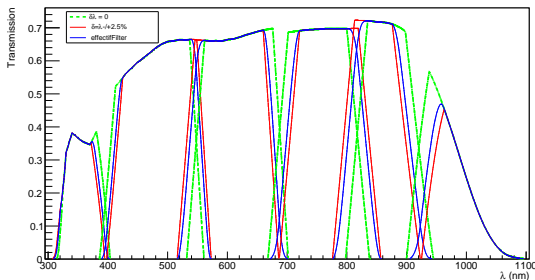


Impact of filters spatial variations

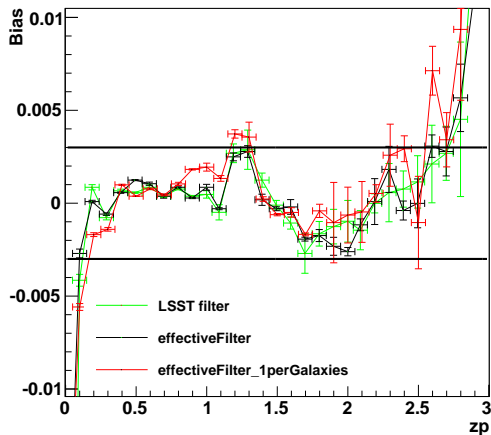
- Filter diameters : 78 cm
- Due to spatial variation filter could be shifted up to $\pm 2.5\%$ (*LSST spec.*)

u	g	r	i	z	y
± 9 nm	± 12 nm	± 16 nm	± 19 nm	± 22 nm	± 25 nm

- the worst case should be : $\delta\lambda = \{-9, 12, -16, 19, -22, 25\}$ (+- configuration) or the opposite (-+) configuration.
 - 1) computation of a medium effective filter for 10 years of observation (for +- configuration),
 - 2) reconstruction of the photometric redshift using different filters for each galaxies.



LR>0.98 type:All



- Effective filters :
 - no significant impact
 - still within LSST specification up to $z_p \sim 2.6$
- One filter per galaxies \Leftrightarrow uncertainties on filters measurement :
 - F_{exp} is computed using effective filters ,
 - F_{obs} is computed using different filters for each galaxie

\Rightarrow impact on photo-z quality for $0.8 < z_p < 1.3$

\Rightarrow if $z_p > 1.9$: higher error barres.

How important will be those effect? \rightarrow Cosmology

Conclusion

- LSST will observe billion of galaxies which allowed the measurement of BAO scale at many z bins,
 - the redshift of all of those galaxies is needed with an excellent precision.
- ⇒ Franzosa method for photometric redshift reconstruction :
 - template fitting method from 51 interpolated SED
 - we can reconstruct the redshift in LSST specification up to $z \sim 2.7$
 - we need spectroscopic data to train the method → Euclid, DASI ...
- ⇒ synergies with Euclid, BOSS ... will lead to unprecedented quality on dark energy constraints.

Perspective

- Test the method using another SED library
- A real catalogue data is in development to test the method
- BAO analysis using Franzosa tools