

Status report of Pix2LSST

from **Pixel** to Large Scale Structure with Vera Rubin Telescope

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Pix2LSST Members

CPPM: D. Fouchez, J. Bautista, B. Racine, J. Cohen-Tanugi

LAM: S. Arnouts, O. Ilbert, R. Ait-Ouahmed, J. Pasquet

K. Kraljic, M. Treyer, R. Arango-Toro, T. Moutard

a long term collaboration: OCEVU, ANR DEEPDIP, iPhU - CLASS

Galaxy Evolution

- **Deep** : exploring the high redshift universe
- **Wide** : a unique view on the growth of cosmic structures
—> Revealing the Cosmic Web at high z
- **Big Data** : extend to ML techniques for Photo- z and galaxy's physical parameters

Cosmology

- **Cosmic shear** : constraints on the mean redshift measurements
- **SNe** : extend the Hubble diagram with photo- z

Synergy

- HSC <-> Vera-Rubin - Euclid - Roman

2 LSST tickets used to contribute on Vera Rubin science

* **Funding 2022** : 1/2 by PNCG / **1/2 by IPhU**

* **Funding 2023** : 1/2 by PNCG / **1/2 by IPhU** —> **IPhU contribution = 7000 E / yr**

with associated participants : R. Ait-Ouahmed, R. Arango-Toro (PhD)

T. Moutard (Postdoc)

Highlights on recent works in Vera Rubin perspectives

Photometric Redshift developments (collaboration LAM -IN2P3)

- SED fitting code Le Phare (O. Ilbert and J. Cohen-Tanugi)
- CNN photo-z code DEEPz (see Reda's talk)

HSC-CLAUDS analysis

- SFR functions (V. Picouet, G. Desprez)

Large Scale Structure analysis

- Cosmic Web analysis in 2D (L. Herscouet)
- SDSS CNN photo-z (M. Treyer)

Development for Le Phare photo-z code

—> **Le Phare++** (O. Ilbert and J. Cohen-Tanugi)

- * Strong collaboration with Johann Cohen-Tanugi (IN2P3) to work on a new version of Le Phare in C++
- * Development of a tool oriented toward large-scale surveys (git versioning, doxygen doc, etc)
 - > one version publicly available: <https://gitlab.lam.fr/Galaxies/LEPHARE/-/releases>
- * Work in collaboration with MPE (Mara Salvato) to improve the AGN template-fitting part for LSST

—> **LSST Open call (Sep 21): Le Phare++ will be used for the LSST survey**

<https://community.lsst.org/t/pz-lor-a-summary-of-the-proposed-pz-estimators-dm-shortlist/6308>

LOR for the LePhare PZ Estimator

Contributors

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Co-signers: , Clotilde Laigle (IAP)

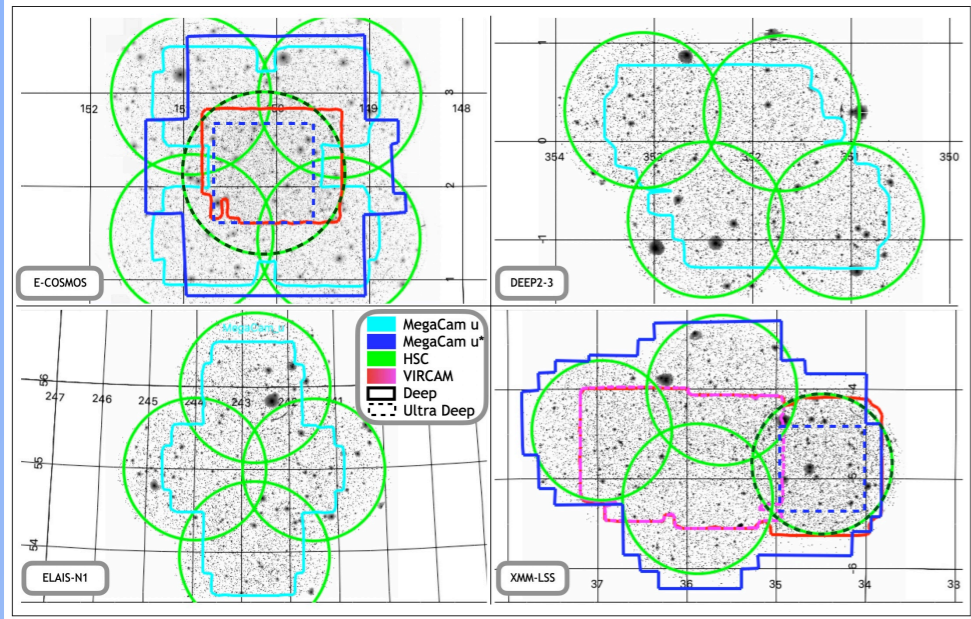


- * **Five codes able to meet the scientific performance & technical aspects: GPz, DEmP, DNF, LePhare, and BPZ.**
- * **Additional codes, such as CNN would be appropriated for the task**

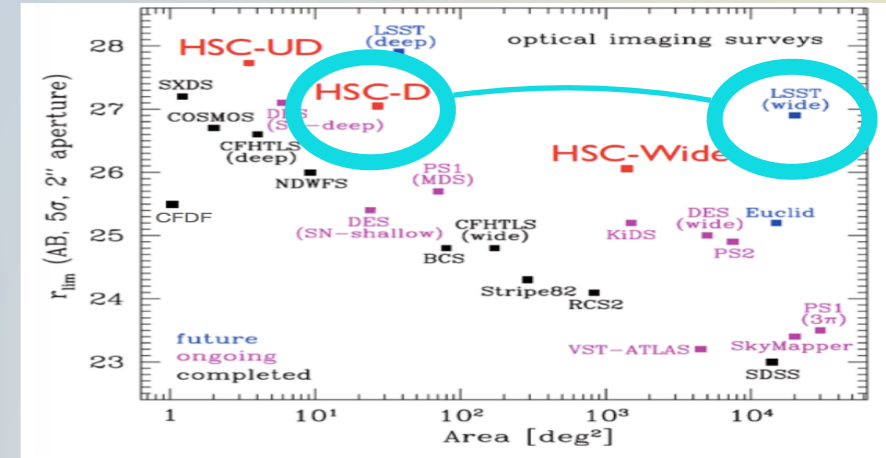
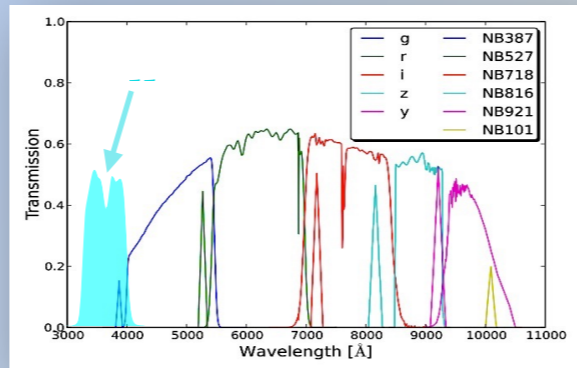
Prepare LSST with CLAUDS - HSC Deep

→ Photometric catalogues + Photo-z release

Desprez et al., 2023 (A&A in press)



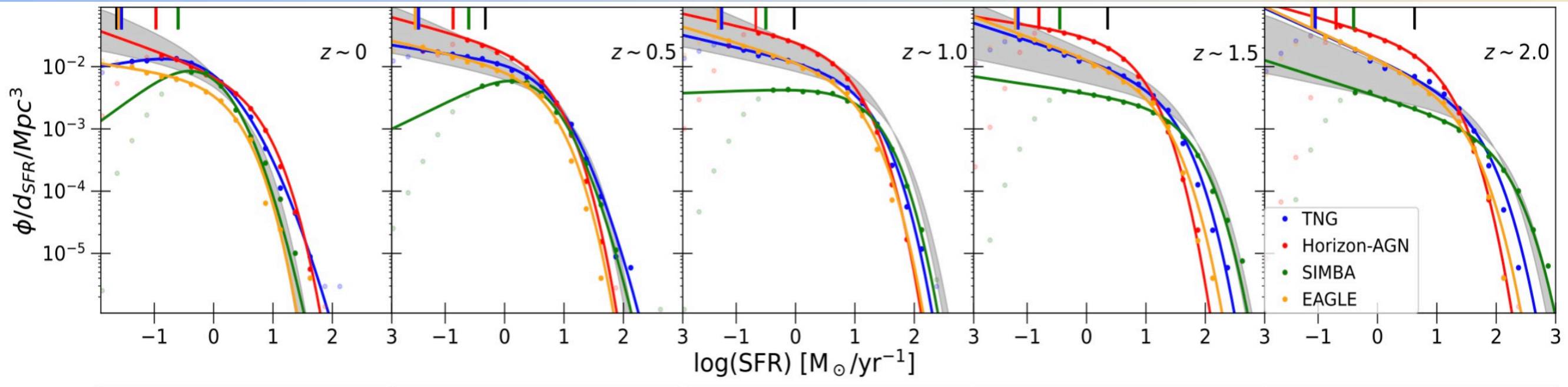
we used LSST pipeline to combine multi-band data



CLAUDS+HSC : A unique dataset until LSST-10yr

→ SFR functions with HSC-CLAUDS survey

Picouet et al., 2023 (A&A submitted)

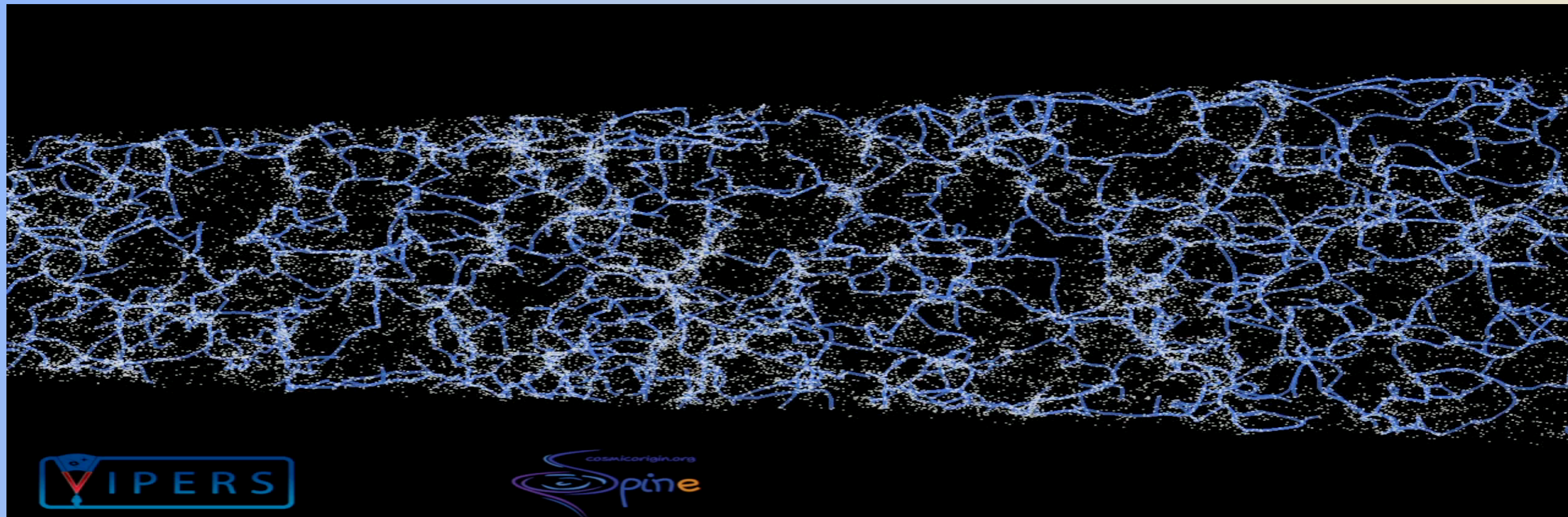


Comparison with 4 state-of-the-art hydro-dynamical simulations

Revealing the Cosmic Web in 3D and 2D

—> Spectroscopic surveys revealed Cosmic Web with exquisite details

Malavasi+2017 ; Kraljic+18



- > Influence of the CW on galaxy properties
 - A natural metric to interpret galaxy evolution
- > Analyses convincingly extended in 2D (*Laigle + 2018*)
 - A major interest for LSST.
 - Depends on photo-z accuracy

Photo-z with Convolutional Neural Network

→ CNN photo-z's in SDSS $r < 18$:

$$\sigma = 0.0083$$
$$\eta = 0.18\%$$

Pasquet et al., 2019

→ SDSS extended to $r < 20$ with GAMA+BOSS training set

Treyer et al. (2023 submitted)

Expected accuracy

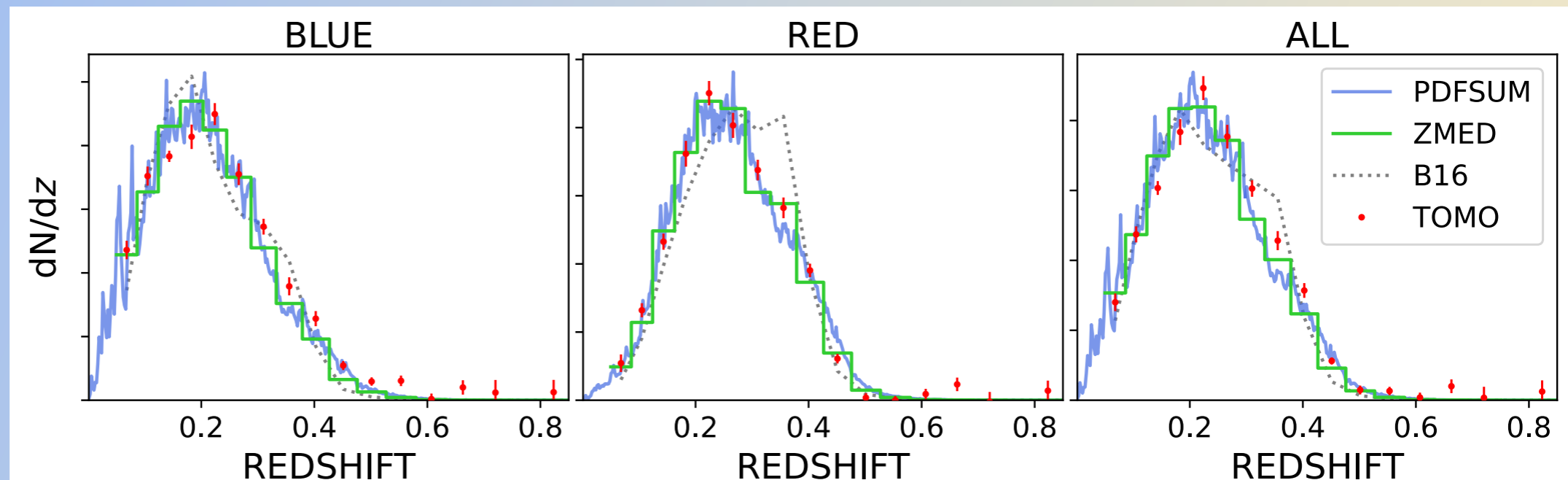
$$\sigma < 0.015$$

$$\eta < 3\%$$

Release:

15 millions Z_{CNN}

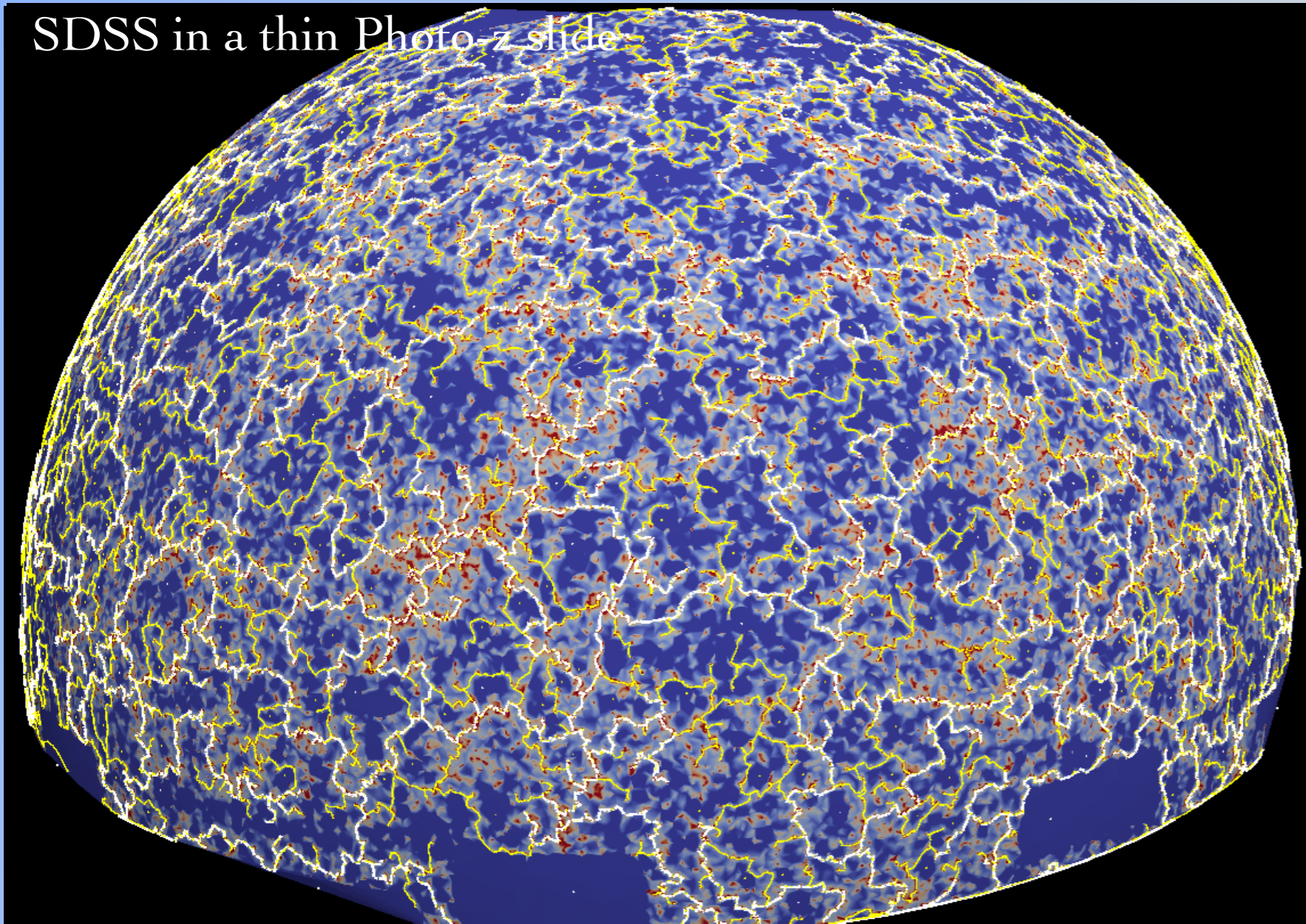
Comparisons of the $N(z)$ with clustering redshift technique



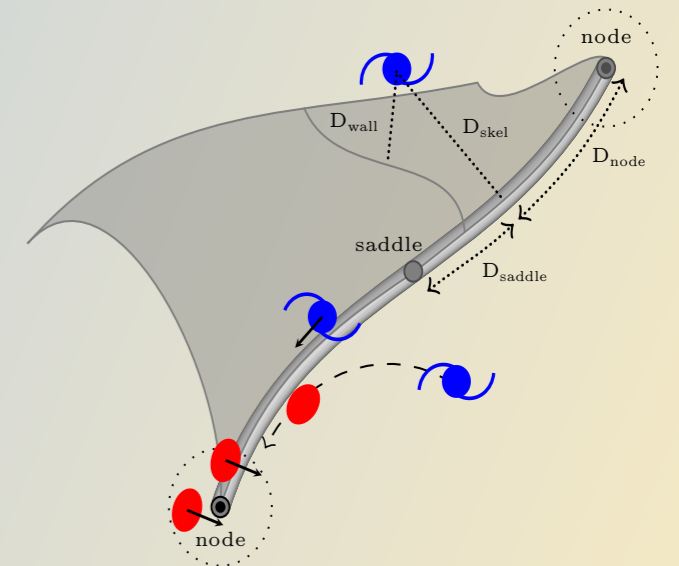
→ HSC-CLAUDS photo-z : Similar accuracy expected down to $i \sim 24$ Reda's talk

Revealing the Cosmic Web in photo-z redshift slides

SDSS in a thin Photo-z slide



- * **internship Lea Harscouet**
- > adapted DisPerSE inputs to work on 2D sphere
- > measured distances and useful quantities on 2D sphere



CW filaments and peaks :

- * Influence on Galaxy properties
- * Spin alignment (IA)

Connectivity (number of filaments/peak)

- * Group/clusters assembly (*Darragh Ford + 2019; Sarron+19*)
- * Connectivity increases with DM halo mass and evolves with time in a cosmological dependent way (*Codis+18*)

Planning for the next two years

- ◆ Final version of LePhare++ code + Test the performance on LSST simulated catalogues
(O. Ilbert & J. Cohen-Tanugi)
- ◆ Physical parameters with imaging surveys based on SOM and CNN networks
+ Test with LSST simulated catalogues/images and Horizon-AGN simulations (R. Arango-Toro)
- ◆ Estimates of the $N(z)$ and mean redshifts with LSST and Horizon-AGN simulations with two approaches (SED fitting and CNN)
(O. Ilbert & S. Arnouts)
- ◆ Reconstruction of the cosmic web in redshift slides
 - Test connectivity with different cosmological simulations
 - Application with the SDSS data(K. Kraljic & M. Treyer)
- ◆ Release the CNN photo-z's for the HSC-CLAUDS surveys
(R. Ait-Ouahmed)
- ◆ Propagation of the CNN photo-z accuracy in the SN science
(D. Fouchez)