

# Cosmological Likelihood and Theory pipeline overview

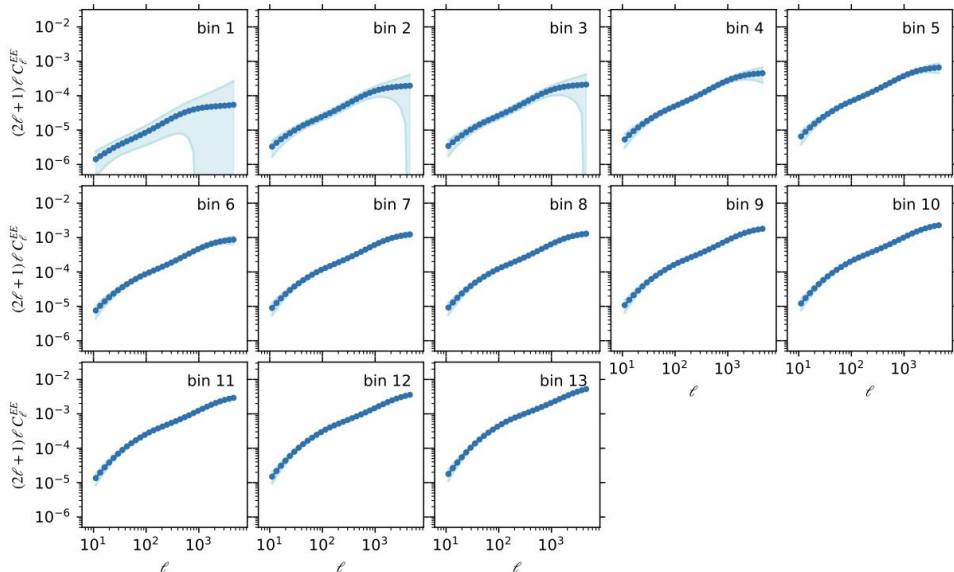
**Martin Crocce**

IST:likelihood : IST:nonlinear : GC SWG : WL SWG



# The Core Cosmology Science of Euclid

## From VIS (photometric science)



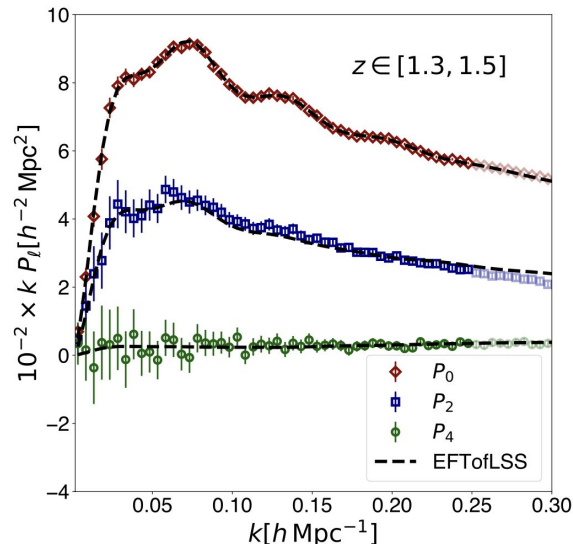
- 2-pt correlation of background shapes (WL)
- 2-pt correlation of foreground positions (GC phot)
- 2-pt cross-correlation of position - shape (XC)

➔ **3x2 analysis in  $0 < z < 2$**

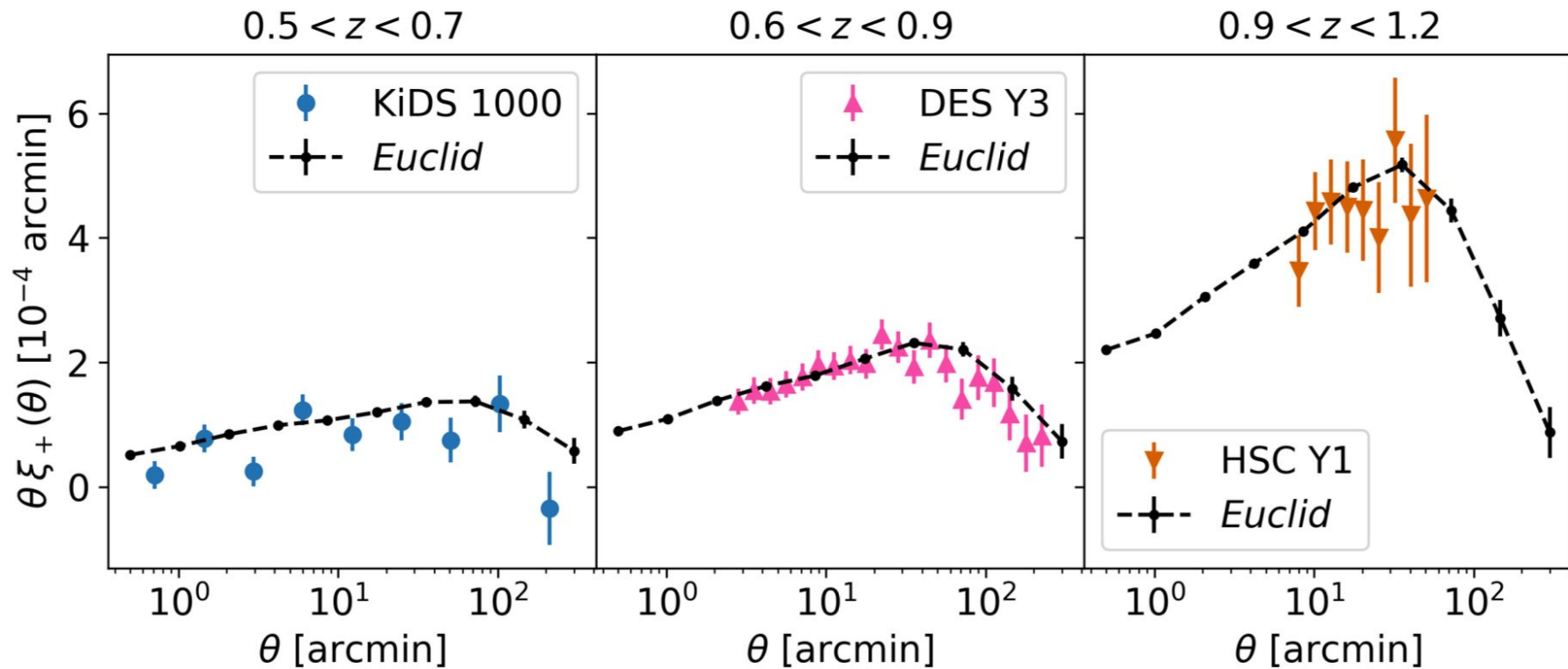
## From NISP (spectroscopic one)

### GC spec in $1 < z < 2$

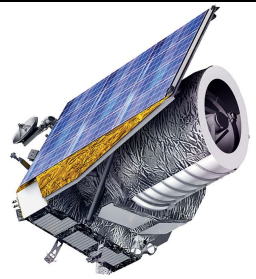
- Growth Rate = Anisotropic clustering of galaxies
- Baryon Acoustic Oscillations



# Stage III to Stage IV challenge



# From the satellite



# to cosmology ...

## Read Data Vectors as input

e.g. 2pt functions provided the Euclid Ground Segment LE3

## + other data specifications

redshift distributions, mask

## Produce Theory Models

Rely on  $P(k)$  at nonlinear scales

## Specify Cosmological Model

$\Lambda$ CDM,  $w$ CDM,  $w_0w_a$ CDM, etc

## Input Estimated Covariance

Distribution of stat + syst error

Analytical or based on Mocks



## Likelihood Computation

Compare theory and data weighted by the estimated errors via the likelihood function

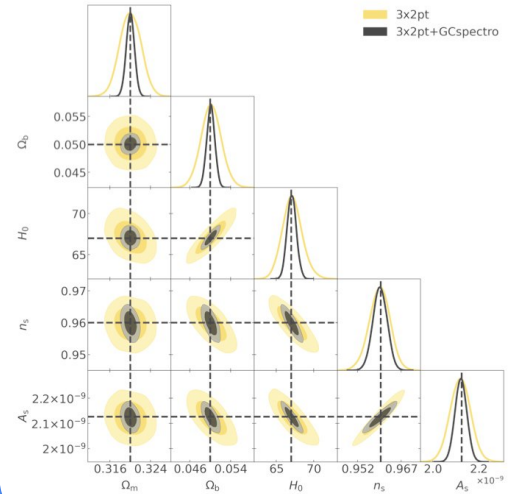
$$-2 \log \mathcal{L}(\mathbf{d}|\theta, M) = [\mathbf{d} - \mathbf{t}(\theta)]^T \mathbf{C}^{-1} [\mathbf{d} - \mathbf{t}(\theta)]$$

## → MCMC runs

Sample the parameter space



## Estimate Confidence Intervals



# The likelihood pipeline : Cosmological Likelihood for Observables in Euclid



- ★ Fully written in python and validated against external codes (pyccl, cosmosis)
- ★ Observables considered
  - Weak Lensing (Cosmic Shear)
  - Photometric Galaxy Clustering
  - Photometric Galaxy - Galaxy Lensing
  - Spectroscopic Galaxy Clustering (angular power spectra and correlation functions)
- ★ Other secondary probes available: clusters of galaxies, cross-correlations with CMB
- ★ Boltzmann solver for the background physics: CAMB | CLASS | HiCLASS | EFTCAMB
- ★ Statistical analysis: **Cobaya (Metropolis Hastings & Polychord)**, CosmoSIS
- ★ Development in the [Euclid Consortium Gitlab](#) following good coding practices
- ★ Several systematics considered to marginalise over (photo-z's, contamination, shear bias, etc)

# The theory pipeline : A library of Nonlinear models

## Weak Lensing and 3x2

- BACCO linear theory emulator
- [Nonlinear Dark matter](#) = HMCode 2020 Emulator + BACCO v2 + Euclid Emulator 2
- [Baryonic suppression factors from baryonification emulators](#) = BACCO + BCEmu (7 params each)
- [Baryonic suppression from halo model](#) = HMCode 2020 emulator (1 param)
- [Intrinsic Alignment](#) =
  - Nonlinear Alignment Models (NLA)
  - Tidal Alignment Tidal Torquing (TATT) model (w/ FastPT)
- [Nonlinear Galaxy Bias](#) = eulerian one loop expansion (w/ FastPT)

## Spectro Galaxy Clustering ([EFTofLSS](#) baseline in DESI)

- [Nonlinear galaxy bias](#) and dark matter = Perturbation Theory to one loop (w/ FastPT)
- [BAO damping](#) Infrared resummation using Wiggle-no Wiggle Split + Direct Sine Transforms
- [Redshift Space Distortions](#) = counter-terms (option to adopt parametric functions)

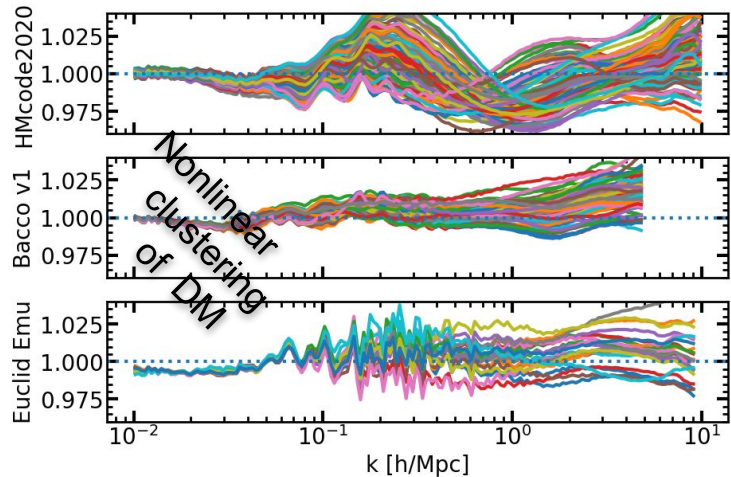
## Analytical covariance

- Improved version of PySSC : SpaceBorne 3x2pt covariance
- Improved version of CovaPT : clustering multipoles covariance

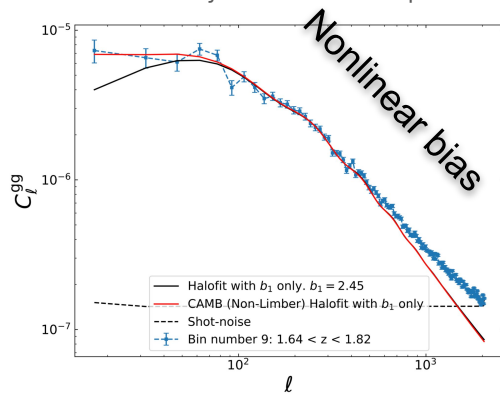
★ Development in the [Euclid Consortium Gitlab](#) following good coding practices + external validation

# The theory pipeline : A library of Nonlinear models

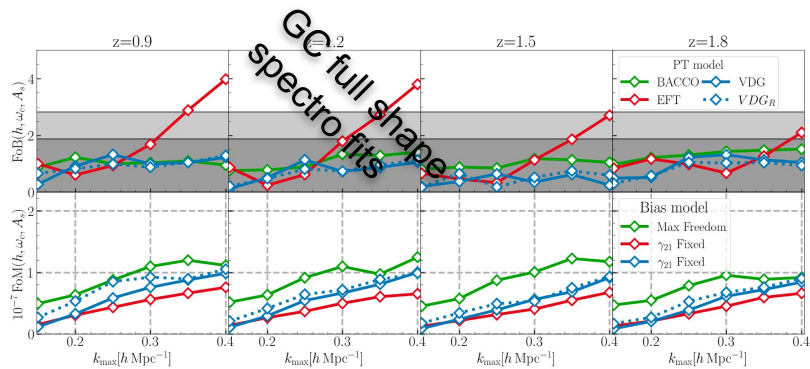
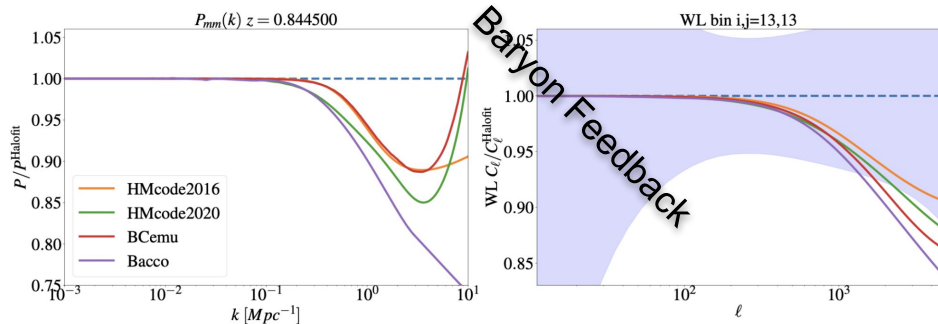
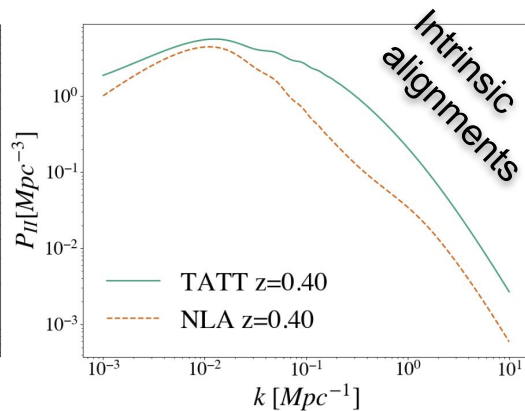
CREDIT = Raul Angulo & BACCO group



CREDIT = Sylvain G Beauchamps et al



CREDIT = David Navarro et al

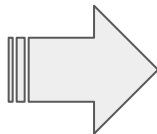


CREDIT = Benjamin Camacho, Andrea Pezzotta, Chiara Moretti et al

CREDIT = Pedro Carrilho et al

## The pipeline is running - 3x2 chains

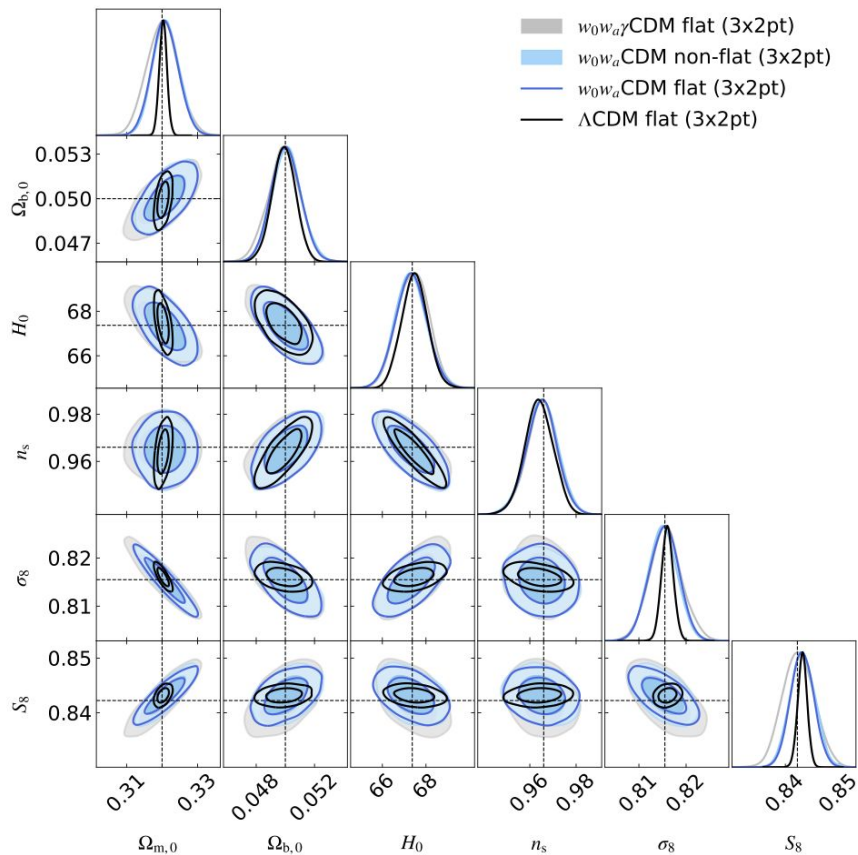
- **Cosmological models:** LCDM,  $w_0wa$ CDM,  $w_0w\gamma$ CDM
- **Probes:** WL, 3x2pt (harmonic space)
- **Scale cuts:**  $l_{\max} = 3000$
- **Covariance matrix:** gaussian + SSC
- **Non-linear model:** HMCode (2020) with baryonic feedback
- **Intrinsic alignment model:** NLA
- **Systematics:** galaxy bias, magnification bias, multiplicative shear bias, shift in mean redshifts
- **Boltzmann code:** CAMB
- **Sampler:** `polychord`
- Assuming full survey area and 13 tomographic bins → almost 380 2-pt functions being fitted
- Self-generated synthetic data with CLOE assuming 32 logarithmically-spaced  $l$  values



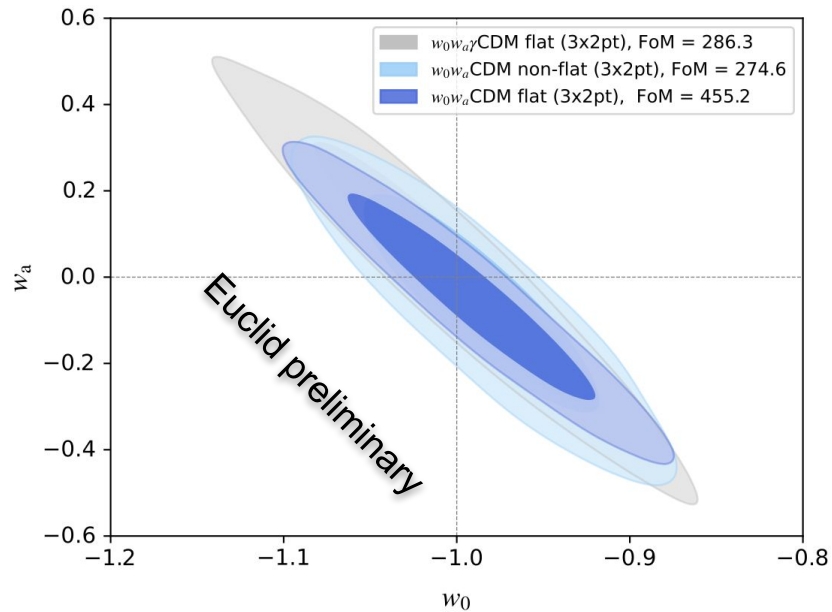
**Need to sample over 60 parameters !! (cosmo+nuisance)**



# The pipeline is running - 3x2 chains (full mission, DR3)

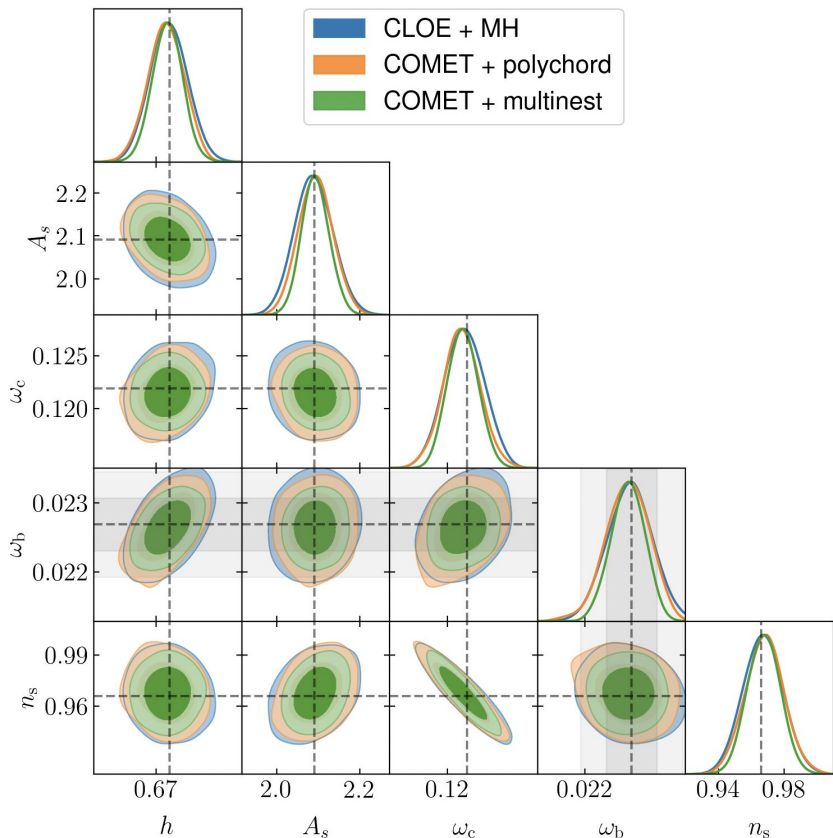


CREDIT = Guadalupe Cañas Herrera



Model	ISTF (pessimistic)	ISTF (optimistic)	CLOE
$w_0 w_a$ CDM (flat)	367	1033	455
$w_0 w_a$ CDM (non-flat)	59	326	274

# The pipeline is running - GC spectro chains (full mission, DR3)



CREDIT = Andrea Pezzotta

- **Cosmological models:** LCDM,  $w$ CDM
- **Probe:** Power Spectrum multipoles (P0, P2, P4)
- **Scale cuts:**  $k_{\max} = 0.3$
- **Covariance matrix:** gaussian
- **Non-linear model:** EFTofLSS
- **Parameters :** galaxy bias (linear, nonlinear, nonlocal), redshift space distortions, noise [5 per z-bin]
- **Intrinsic alignment model:** NLA
- **Systematics:** purity, incompleteness, redshift errors
- **Boltzmann code:** CAMB
- **Sampler CLOE:** polychord
- Comparison to public COMET emulator
- Assuming 4 redshift bins [ $1 < z < 2$ ] tomographic bins
- Self-generated synthetic data with CLOE

## The IST:likelihood + IST:nonlinear teams responsible for all these ..

- Amandine Le Brun
- Andrea Pezzotta
- Davide Sciotti
- Domenico Sapone
- Fabien Lacasa
- Emiliano Sefusatti
- Felicitas Keil
- Guadalupe Cañas Herrera
- Isaac Tutusaus
- Jesus Torrado
- Konstantinos Tanidis
- Linda Blot
- Lisa Goth
- Marco Bonici
- Matteo Martinelli
- Samuel Farrens
- Santiago Casas
- Shahab Joudaki
- Stefano Camera
- Stefano Davini
- Sylvain G. Beauchamps
- Vincenzo Cardone
- Valeria Pettorino
- Alkistis Pourtsidou
- Benjamin Camacho
- Carlo Giocoli
- Carmelita Carbone
- Chiara Moretti
- David Navarro
- Giovanni Aricò
- Jonathan Blazek
- Pedro Carrilho
- Raul Angulo
- Alex Eggemeier
- Anna Porredon
- Jacopo Salvalaggio
- I'm sorry if I missed you

# Summary

**CLOE v2.0** : a 5 years project involving two teams of incredible students and postdocs, and synergies / feedback from many science teams across EC.

**Running now** in realistic settings [various clusters across Europe & ESA Datalabs]

Still a good way ahead to confront DR1

**Optimising** speed up of likelihood evaluations, samplers, extensions, and usability

Currently comparing **nonlinear models vs. simulation** measurements (including Flagship) for all main probes and covariances.

**DR1 Key Projects** will be announced soon, this pipeline will play a central role if all goes well 🙌

# Data Release 1 key projects structure