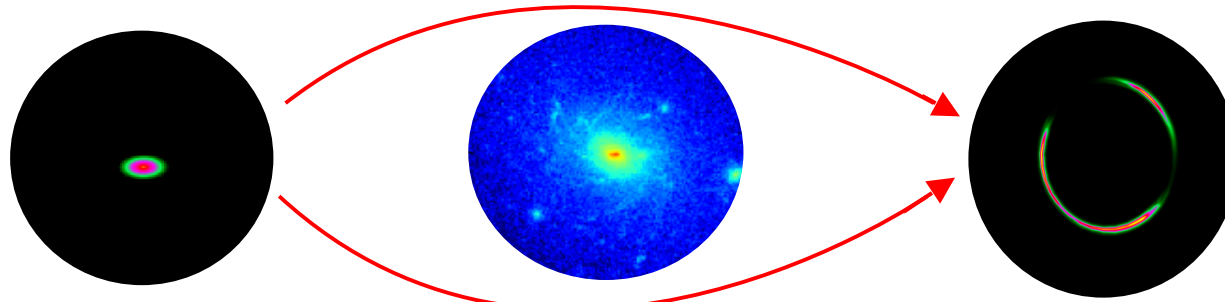


# Strong lens simulations: the 'un'-natural telescopes to probe galaxy formation and Hubble constant



**Sampath Mukherjee**

University of Groningen (RUG)  University of Liege (ULiege)

**In collaboration with**

**SEAGLE**

Prof. Léon Koopmans  
Prof. Joop Schaye  
Prof. R. Benton Metcalf  
Dr. Mathhieu Schaller  
Dr. Crescenzo Tortora  
Dr. Robert Crain  
Dr. Georgios Vernardos



**COSMICLENS**

Prof. Dominique Sluse  
Prof. Frederic Courbin  
Prof. Sherry Suyu  
Dr. Stefan Hilbert  
Lyne VandeVyvere  
+  
**HOLiCOW** collaboration



# Timeline of (Strong) Gravitational Lensing

- 1801** Soldner proposed GL in context of Newtonian theory. He found a deflection angle for the sun in **0.85''**.
- 1915** With general relativity, Einstein derived the new result for the sun as **1.7''**
- 1919** Using solar eclipse, Eddington measured a value close to GR, **1.6''**
- 1937** Zwicky suggested that galaxies would produce well separated images that could be observed.
- 1979** The discovery of QSO 957+561 A,B found at  $z \sim 1.4$  (Walsh et al. 1979).
- 1986** Lynds & Petrosian discovered cluster lensing.
- 1993** The Cosmic Lens All-Sky Survey (**CLASS**) initiated.
- 2002** The Sloan Lens ACS (**SLACS**) survey: discovery of **~100** Strong lenses.
- 2010** **SL2S**, **SWELLS** and **BELLS**, observational surveys: **~20-50** SLs each.
- 2016–2025** **DES**, **KIDS**, **EUCLID**, **LSST**, **SKA**, etc **>100,000** lenses.

# Strong Gravitational Lensing

## What can we learn from Strong Lensing?

1. Total mass (within Einstein radius) !!!
2. Stellar mass profile
3. DM mass profile
4. Ellipticity/orientation
5. Substructure
6. Hubble constant via Time-delay

## Advantage of using Gravitational Lensing

Gravitational Lensing measures the total matter distribution **independent of the nature of the matter and of its state**



**SDSS J073728.45+321618.5**

**courtesy: HST, NASA/ESA  
Auger et. al 2009**

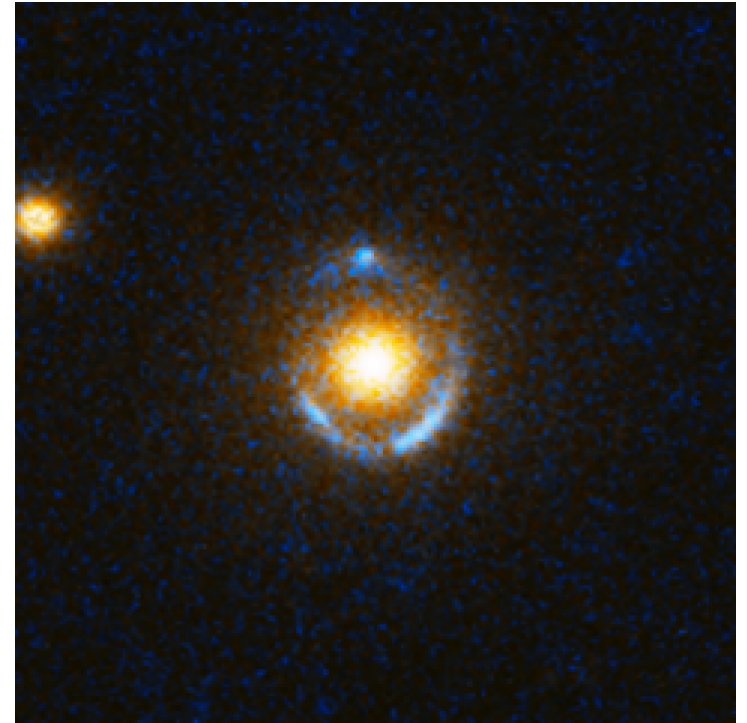
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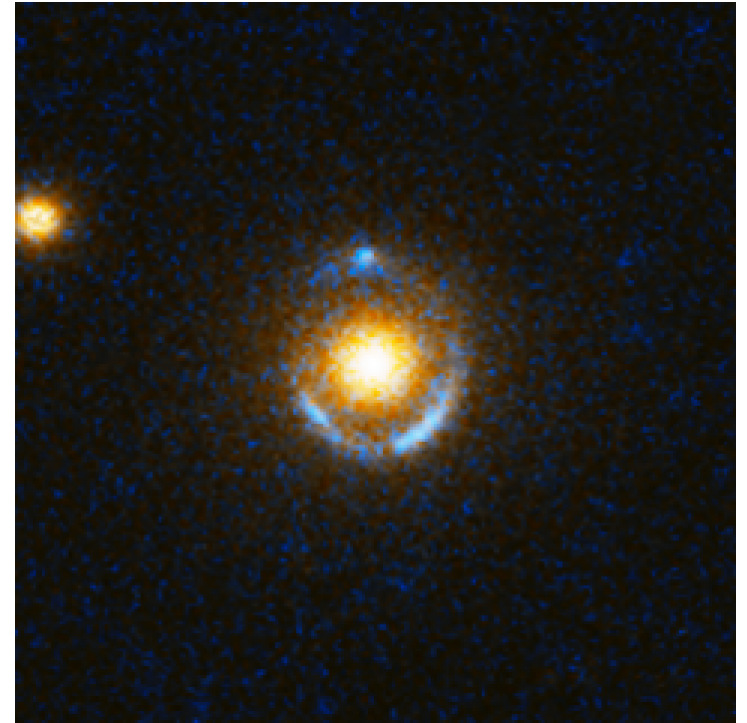
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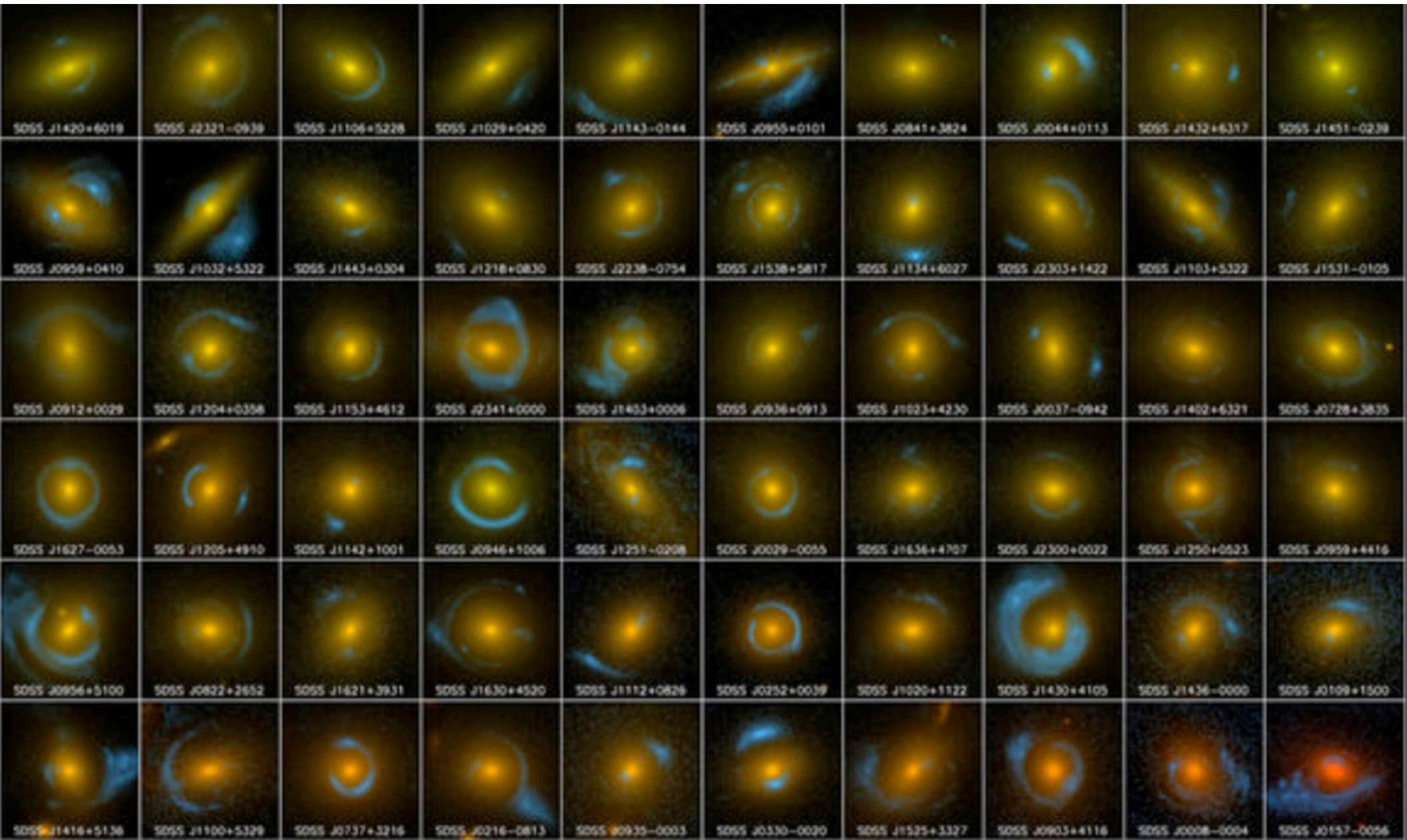
# How many strong lenses do we need & why?

**A. 1%** error on mass slopes —needs—> **50+ lenses**  
**per** parameter-space (e.g. *Barnabe et al. 2011*).

**B. 0.1%** error in the mass fraction in substructure  
—needs—> **50+ lenses** with **extended** images  
(e.g. *Vegetti & Koopmans 2009*).

Probing a wide range of masses, environments and galaxy types  
requires  **$10^{(4-5)}$  lenses**

# Lens Galaxies: SLACS



credit: Adam Bolton/SLACS

**Euclid: online in 2020-2025; will yield >100,000 lenses**



Euclid (2025+)

Credits: Koopmans/Euclid



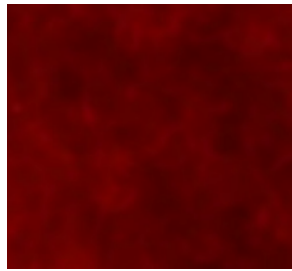
# A novel pipeline for Simulating **EAGLE** **LE**nseS

based on

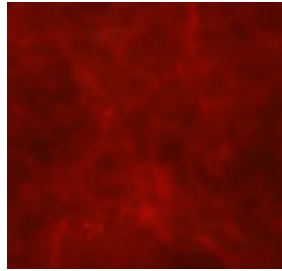
***SEAGLE—I**: A pipeline for simulating and modelling strong lenses from cosmological hydrodynamic simulations*

**Mukherjee** et al. 2018  
MNRAS 2018, 479, 4108

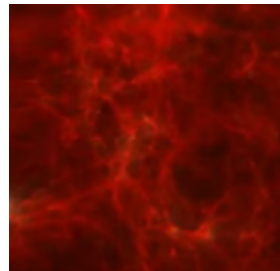
# Evolution and Assembly of **Galaxies** and their **Environments (EAGLE)**



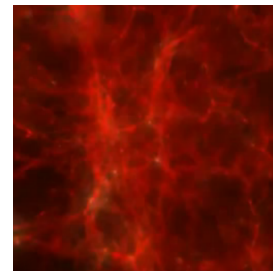
$z = 12.9$



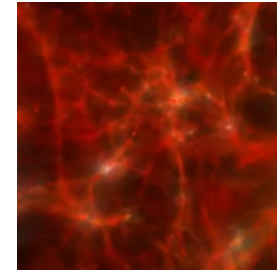
$z = 10.4$



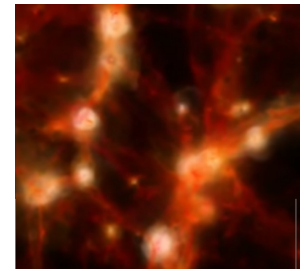
$z = 5.0$



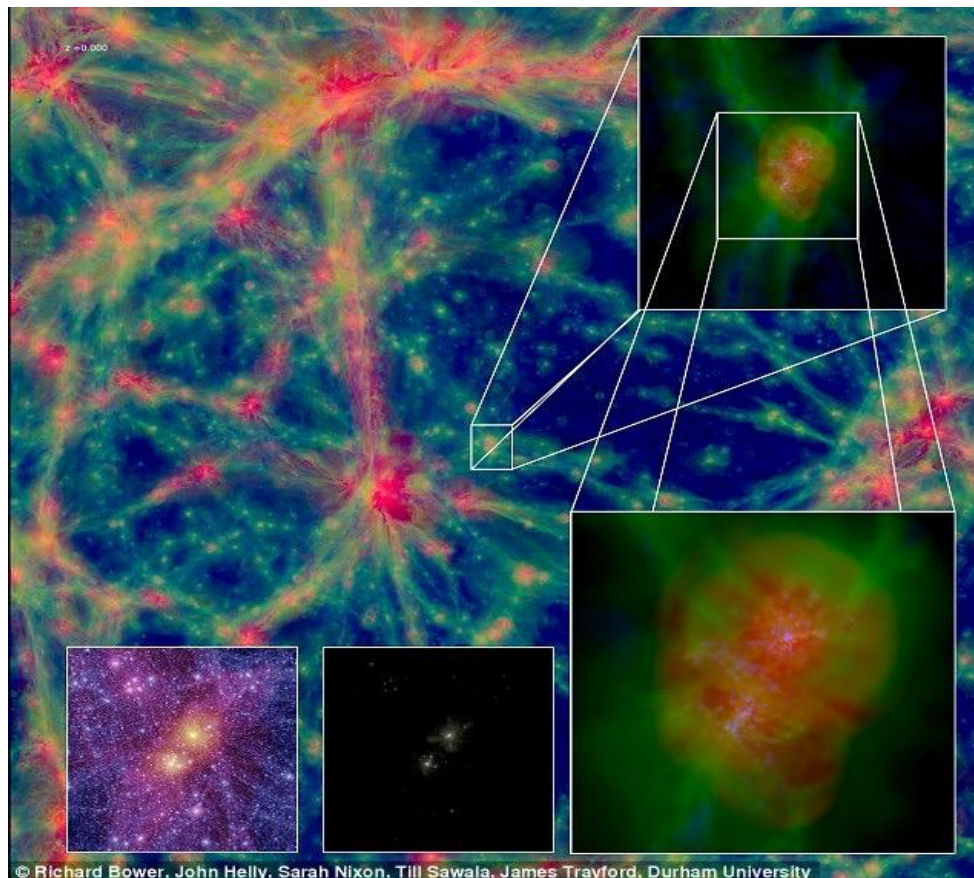
$z = 3.8$



$z = 2.6$



$z = 0.0$



© Richard Bower, John Helly, Sarah Nixon, Till Sawala, James Trayford, Durham University

100x100x20 cMpc slice of Ref-L100N1504 at  $z = 0.0$

A suite of hydrodynamical simulations  
 $\Lambda$ CDM universe

**13 galaxy formation scenarios**

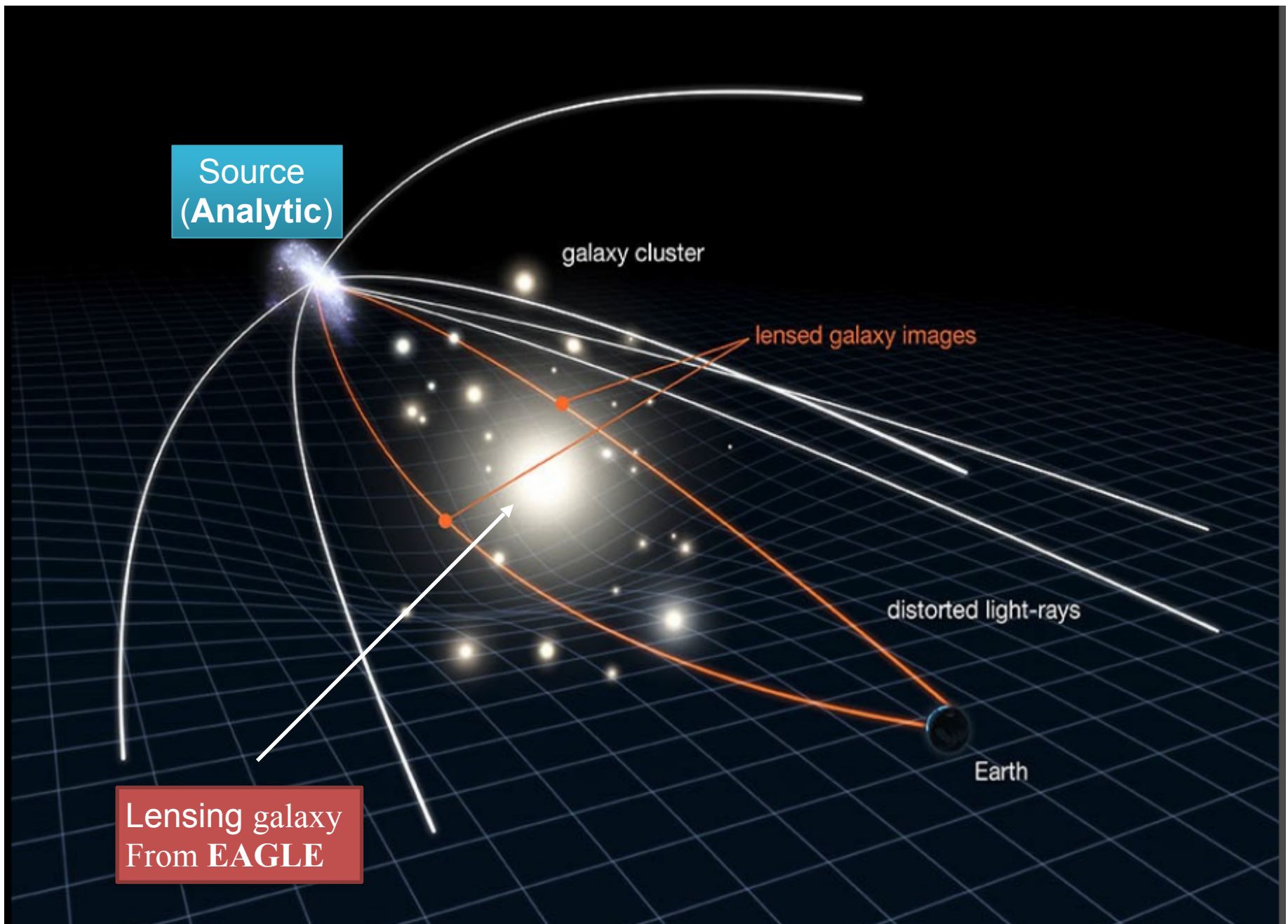
Simulation box sizes : **100, 50**, 25, 12, cMpc

Matter content : **Gas**, **Star**, **Dark Matter**, **Bhs**

**Major improvement:**

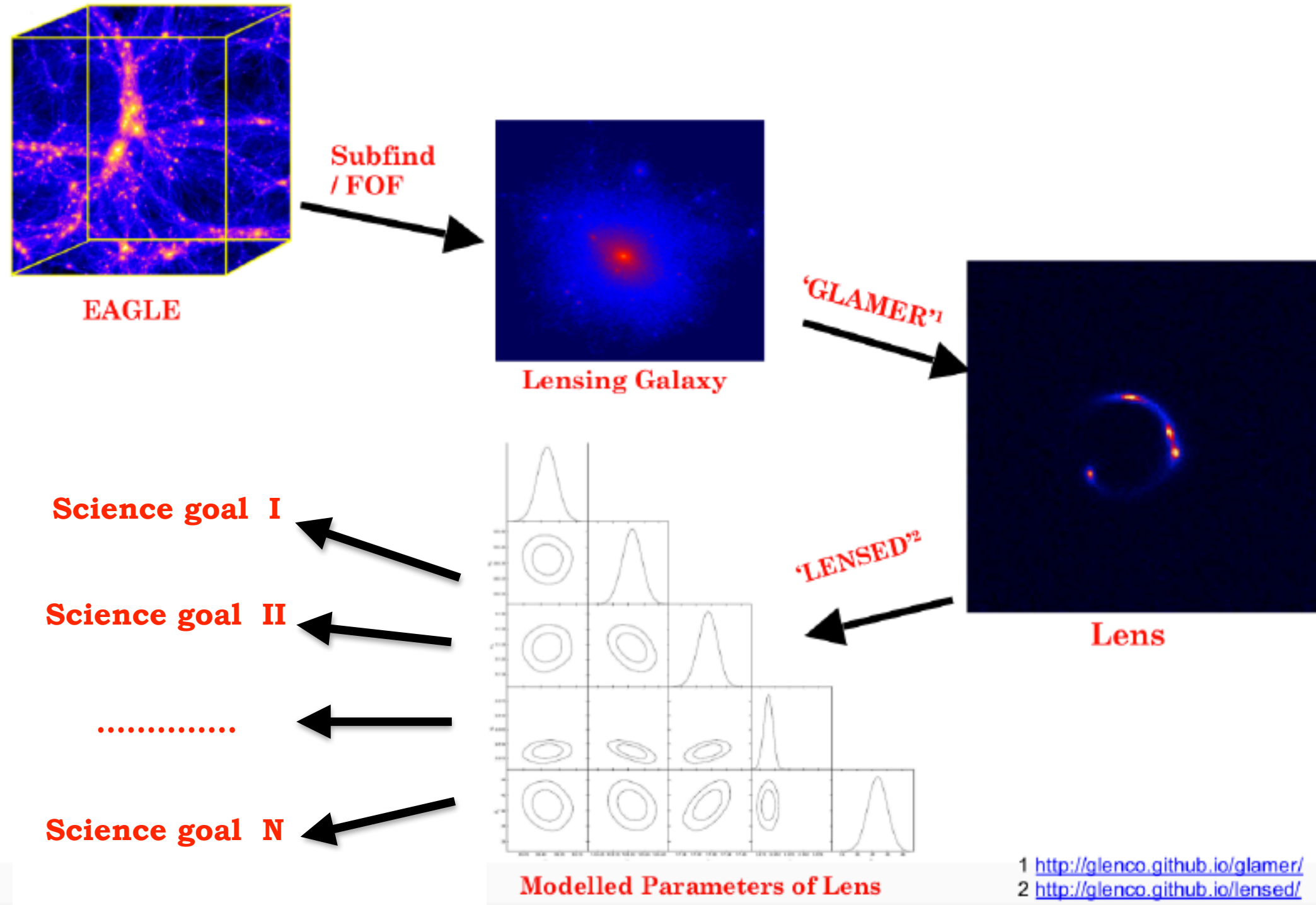
**Feedback from Stars & AGN**

Image courtesy: Durham University & Schaye et al. 2015

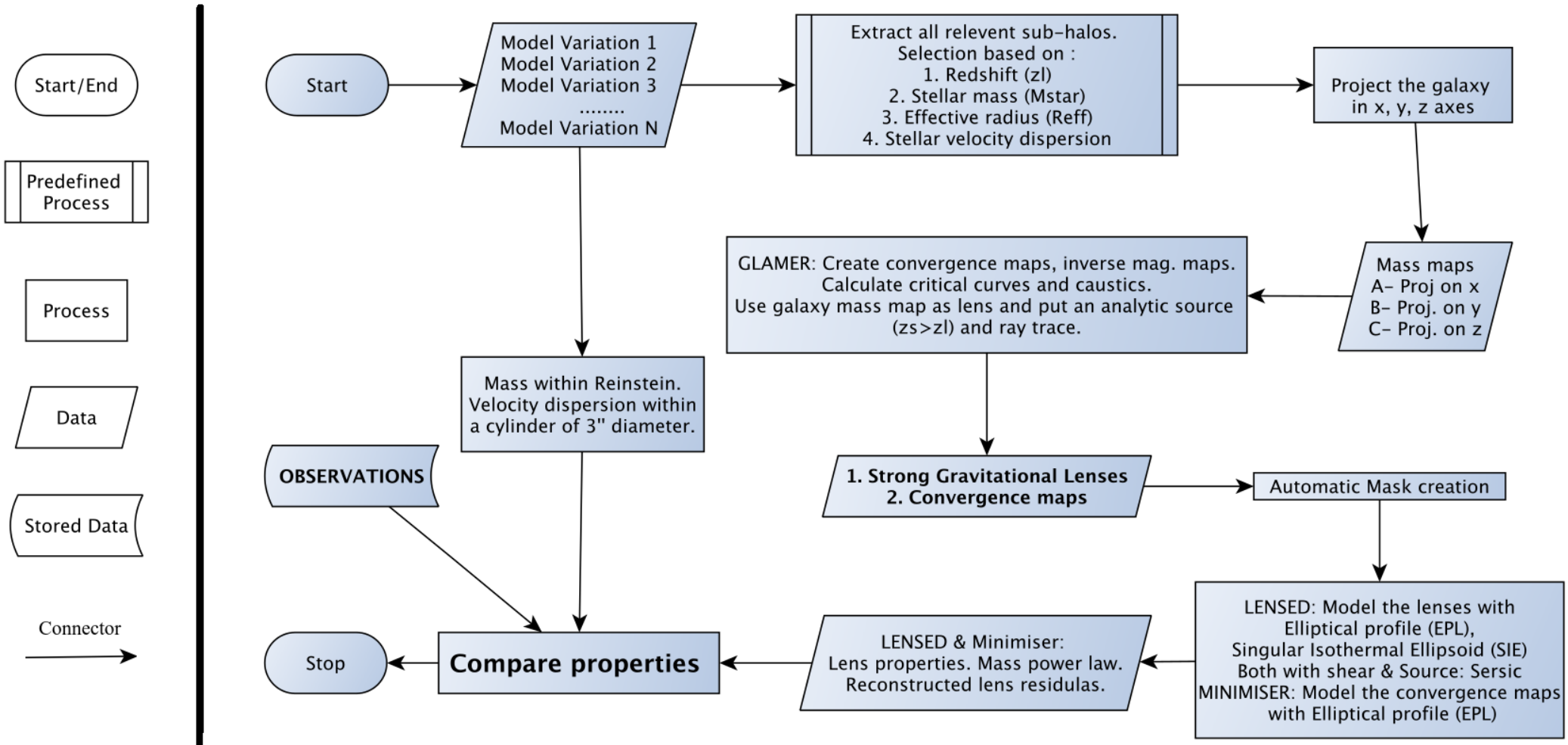


**Gravitational Lensing (Courtesy: NASA/ESA)**

# The Pipeline: Simulations & Modeling of Mock Strong Lenses



# The SEAGLE pipeline



SEAGLE-I: Mukherjee+ 2018 MNRAS



**GLAMER** (Metcalf+ 14, Petkova+ 14)

**The ray-tracer**

**LENSED** (Tessore+ 16)

**The modelling code**

Galaxy Selection		
Observable	Value	Comments
$M_*$	$\geq 1.76 \times 10^{10} M_\odot$	Stellar mass lower threshold. Taken from Auger et al. (2010a)
$\sigma$	$> 120$ km/sec	Stellar Velocity dispersions are kept lower than SLACS
$R_{50}$	$> 1$ kpc	Half mass projected radius
Lens Candidates		
Object-properties	Value	Comments
Sim. used	REFERENCE (L050N0752)	50 cMpc box is best for
Orientation	x, y and z axis	Projected surface density maps are made for each axis
Redshift	$z_{\text{lens}} = 0.271$	Consistent with SLACS' mean lens-redshift of 0.3
No. of galaxies	252	-
No. of proj. galaxies	756	-
Source Properties		
Parameters	Value	Comments
Source Type	Sérsic	Consistent with analysed SLACS lenses (Newton et al. 2011)
Brightness	23 apparent mag.	"
Size ( $R_{\text{eff}}$ )	0.2 arcsec	"
Axis ratio ( $q_s$ )	0.6	"
Sérsic Index	1	"
$z_{\text{source}}$	0.6	"
Position	Random within caustics	Producing more rings and arcs lens systems, consistent with SLACS
Instrumental Settings		
Parameters	Value	Comments
PSF	Gaussian, FWHM=0.1 arc-sec	-
Noise	HST ACS-F814W, 2400 sec	-
Image Properties		
Map used	Properties	Value
Surface density	(a) Size	512×512 pixels
	(b) Units	kpc
$\kappa$ , Inv. mag. map and Lens	(a) Size	161×161 pixels
	(b) Units	degrees (converted from arcsec)

Lensing galaxies from EAGLE

SOURCE- Analytic

# Results

*Are we getting what we wanted ?*

## Some Strong Lenses from Sloan Lens ACS (SLACS) Survey

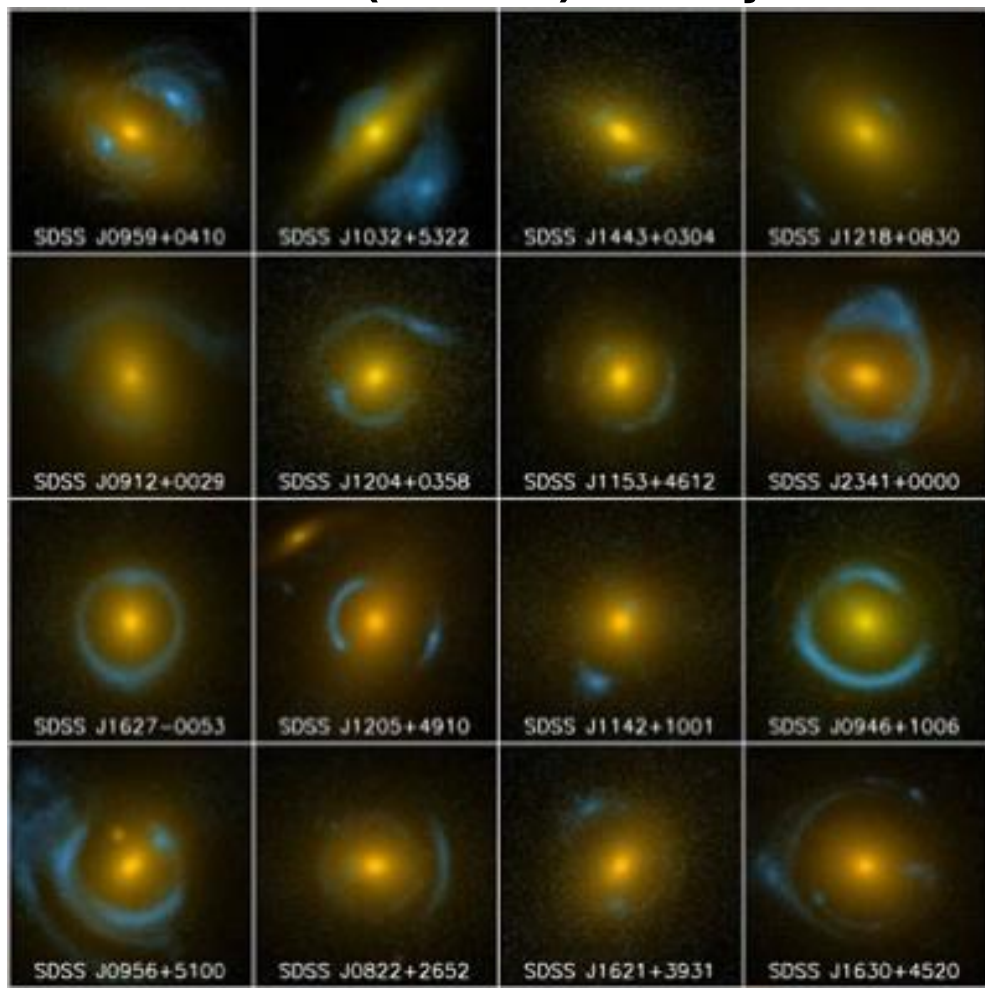
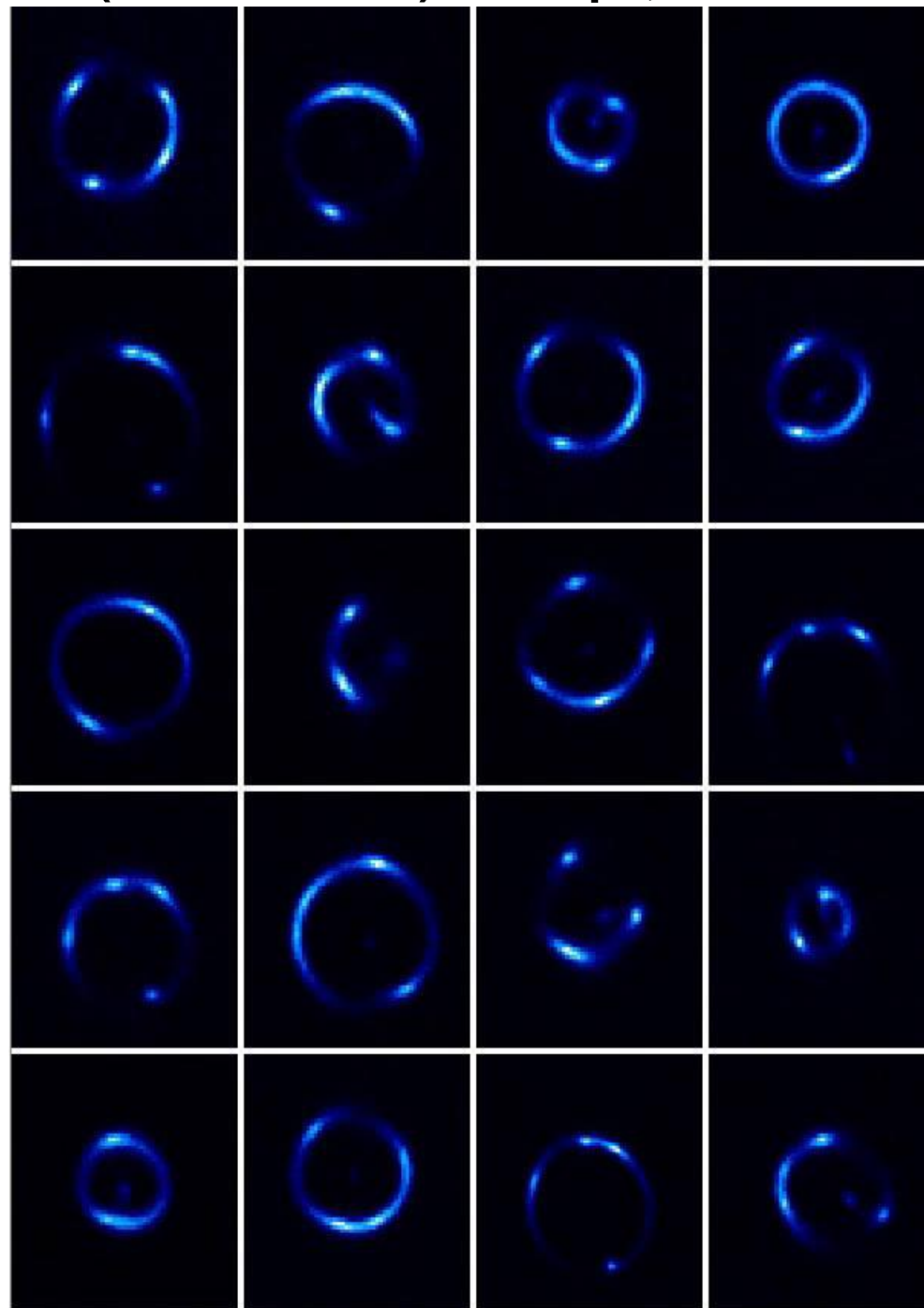


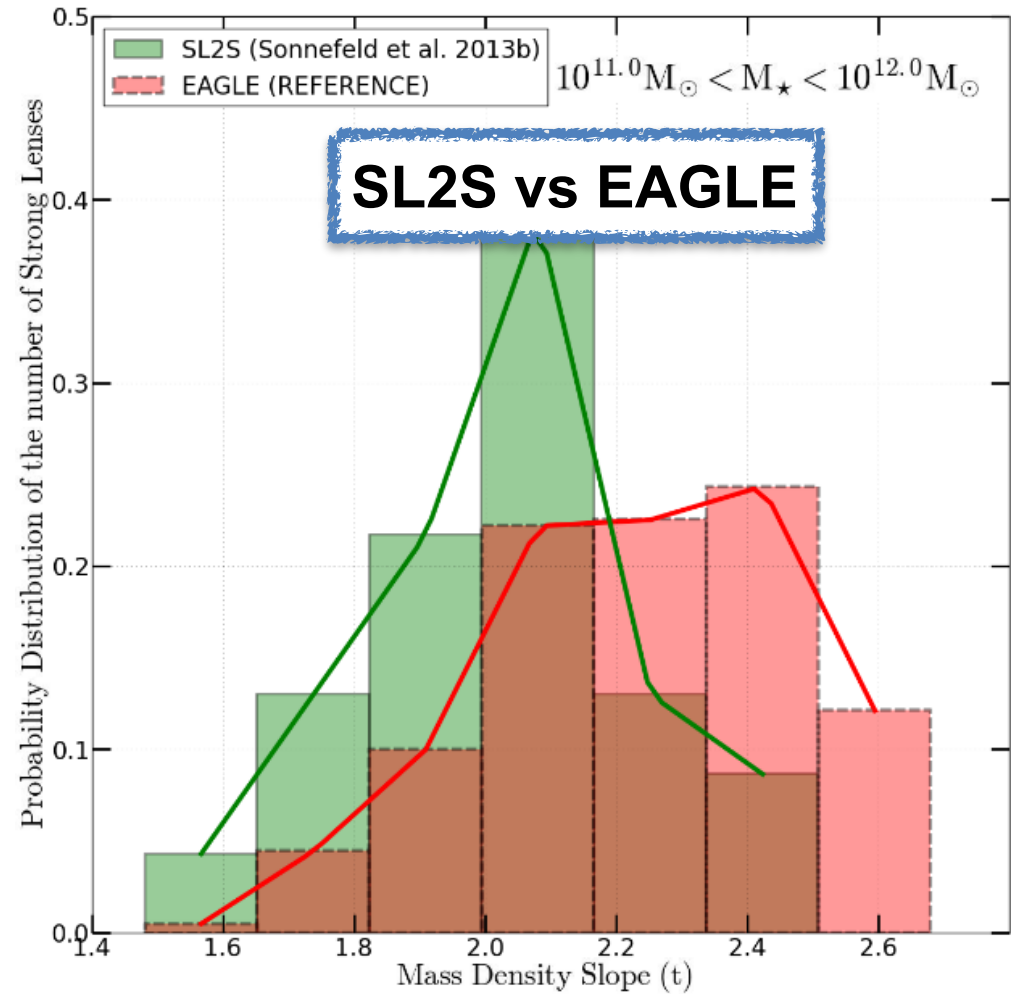
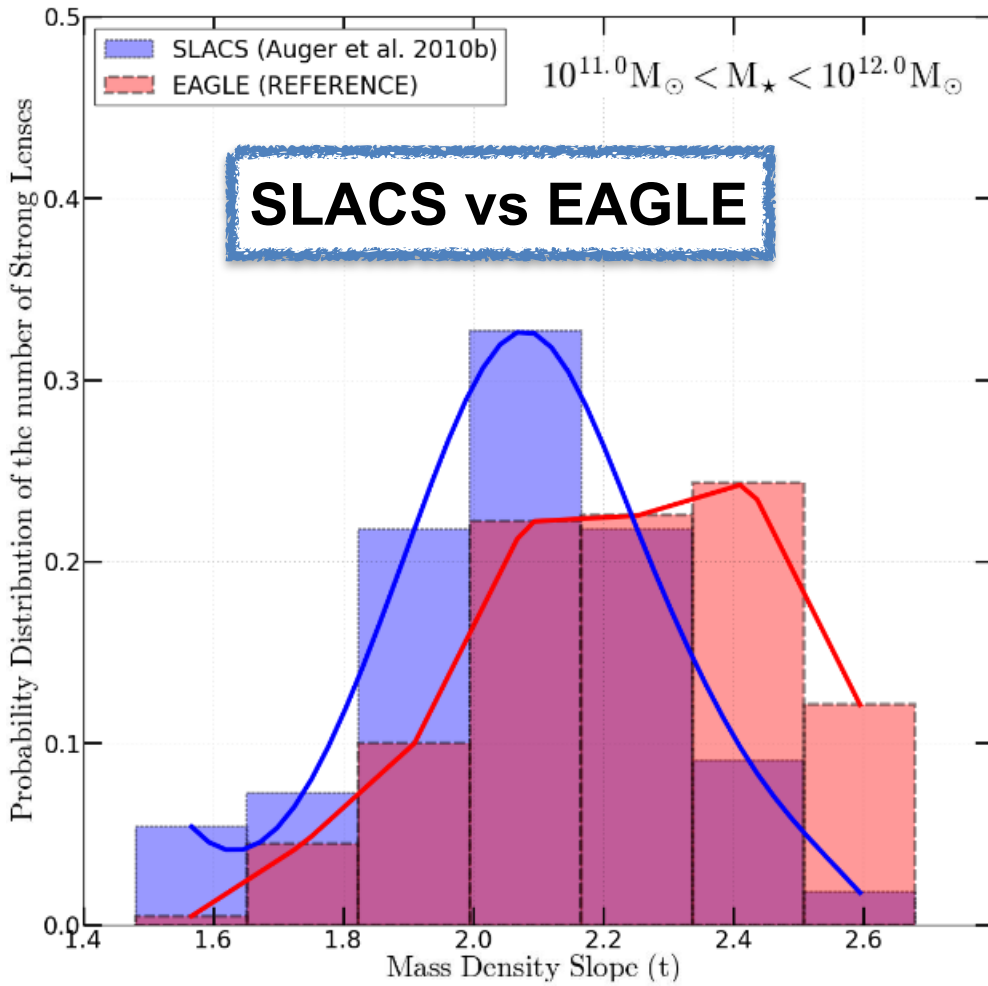
Image: A. Bolton (UH/IfA) for SLACS and NASA/ESA.

**Comparison of observables like Stellar Mass, Einstein radius, etc with SLACS Lenses, will put constraints on the galaxy formation scenarios of EAGLE**

## Some Strong lenses from EAGLE (REFERENCE) 50 cMpc, $z = 0.271$







The distribution of weighted mass density slope of EAGLE at  $z=0.271$  and also compared with SLACS & SL2S.

Mean density slope  
**SLACS** – 2.08  
**SL2S** – 2.18

$\log M_*$ ( $M_\odot$ )	Mean	RMS	Median
11.0 – 11.5	2.26	0.26	2.26
11.5 – 12.0	2.28	0.21	2.23
11.0 – 12.0	2.26	0.25	2.26

**Consistent** with  
*Remus+ 2017*  
*Xu+ 2017*  
*Tortora+ 2014*

# Impact of sub grid physics on total mass density slope

based on

***SEAGLE—II: Constraints on feedback models in galaxy formation from massive early-type strong lens galaxies***

**Mukherjee** et al.  
submitted to MNRAS  
arXiv:1901.01095

# SEAGLE- II: Constraining **10** galaxy evolution scenarios

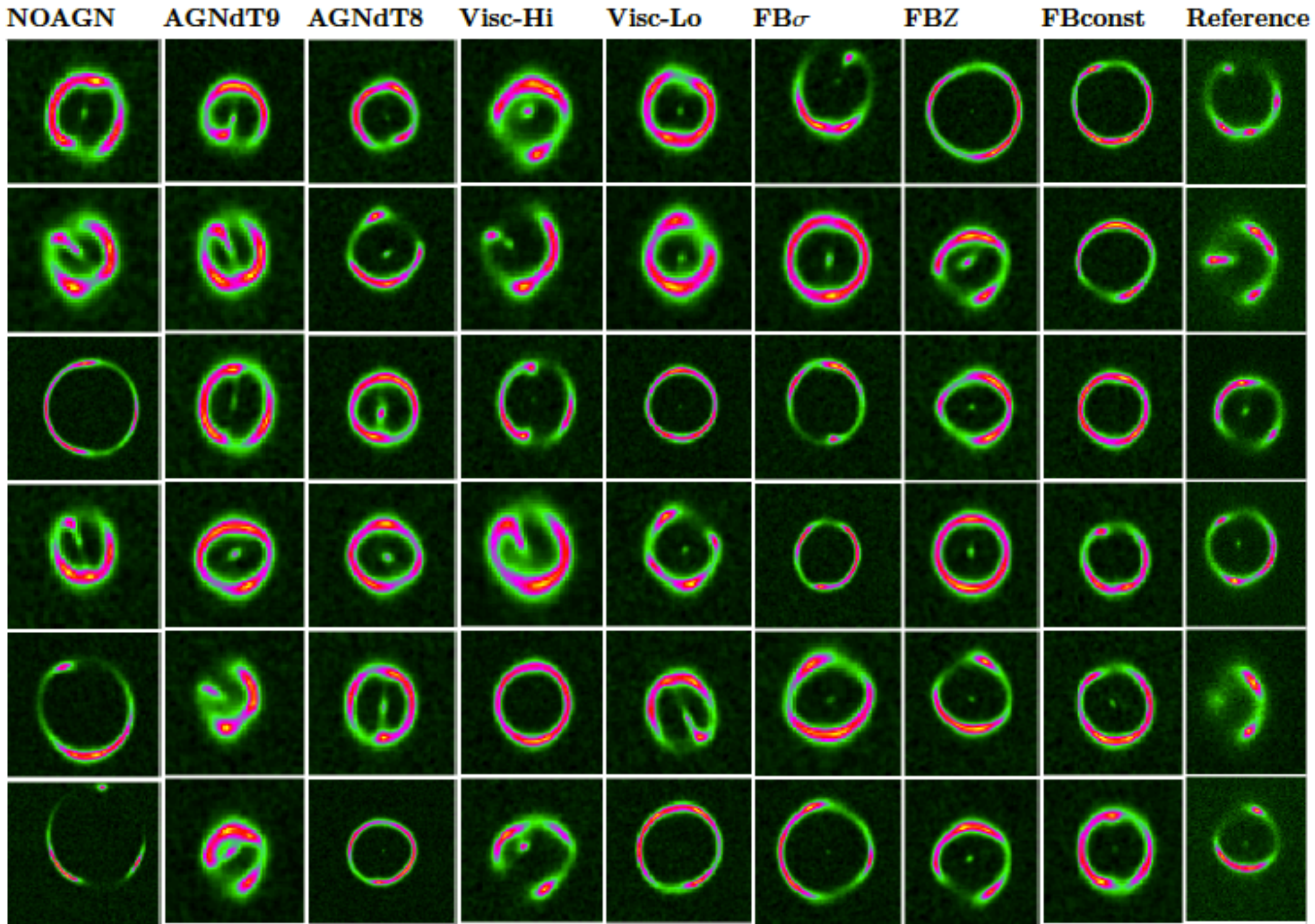
Feedback

Identifier	Side length [cMpc]	$N$	$\gamma_{\text{eos}}$	$n_{\text{H}}^*$ [ $\text{cm}^{-3}$ ]	$f_{\text{th}}\text{-scaling}$	$f_{\text{th,max}}$	$f_{\text{th,min}}$	$n_{\text{H},0}$ [ $\text{cm}^{-3}$ ]	$n_{\text{n}}$	$C_{\text{visc}}/2\pi$	$\Delta T_{\text{AGN}}$ $\log_{10}$ [K]
<i>Calibrated models</i>											
FBconst	50	752	4/3	Eq. 1	–	1.0	1.0	–	–	$10^3$	8.5
FB $\sigma$	50	752	4/3	Eq. 1	$\sigma_{\text{DM}}^2$	3.0	0.3	–	–	$10^2$	8.5
FBZ	50	752	4/3	Eq. 1	$Z$	3.0	0.3	–	–	$10^2$	8.5
Ref (FBZ $\rho$ )	50	752	4/3	Eq. 1	$Z, \rho$	3.0	0.3	0.67	2/ln 10	$10^0$	8.5
Ref-100 (FBZ $\rho$ )	100	1504	4/3	Eq. 1	$Z, \rho$	3.0	0.3	0.67	2/ln 10	$10^0$	8.5
<i>Reference-variations</i>											
ViscLo	50	752	4/3	Eq. 1	$Z, \rho$	3.0	0.3	0.67	2/ln 10	$10^2$	8.5
ViscHi	50	752	4/3	Eq. 1	$Z, \rho$	3.0	0.3	0.67	2/ln 10	$10^{-2}$	8.5
AGNdT8	50	752	4/3	Eq. 1	$Z, \rho$	3.0	0.3	0.67	2/ln 10	$10^0$	8.0
AGNdT9	50	752	4/3	Eq. 1	$Z, \rho$	3.0	0.3	0.67	2/ln 10	$10^0$	9.0
NOAGN	50	752	4/3	Eq. 1	$Z, \rho$	3.0	0.3	0.67	2/ln 10	$10^0$	–

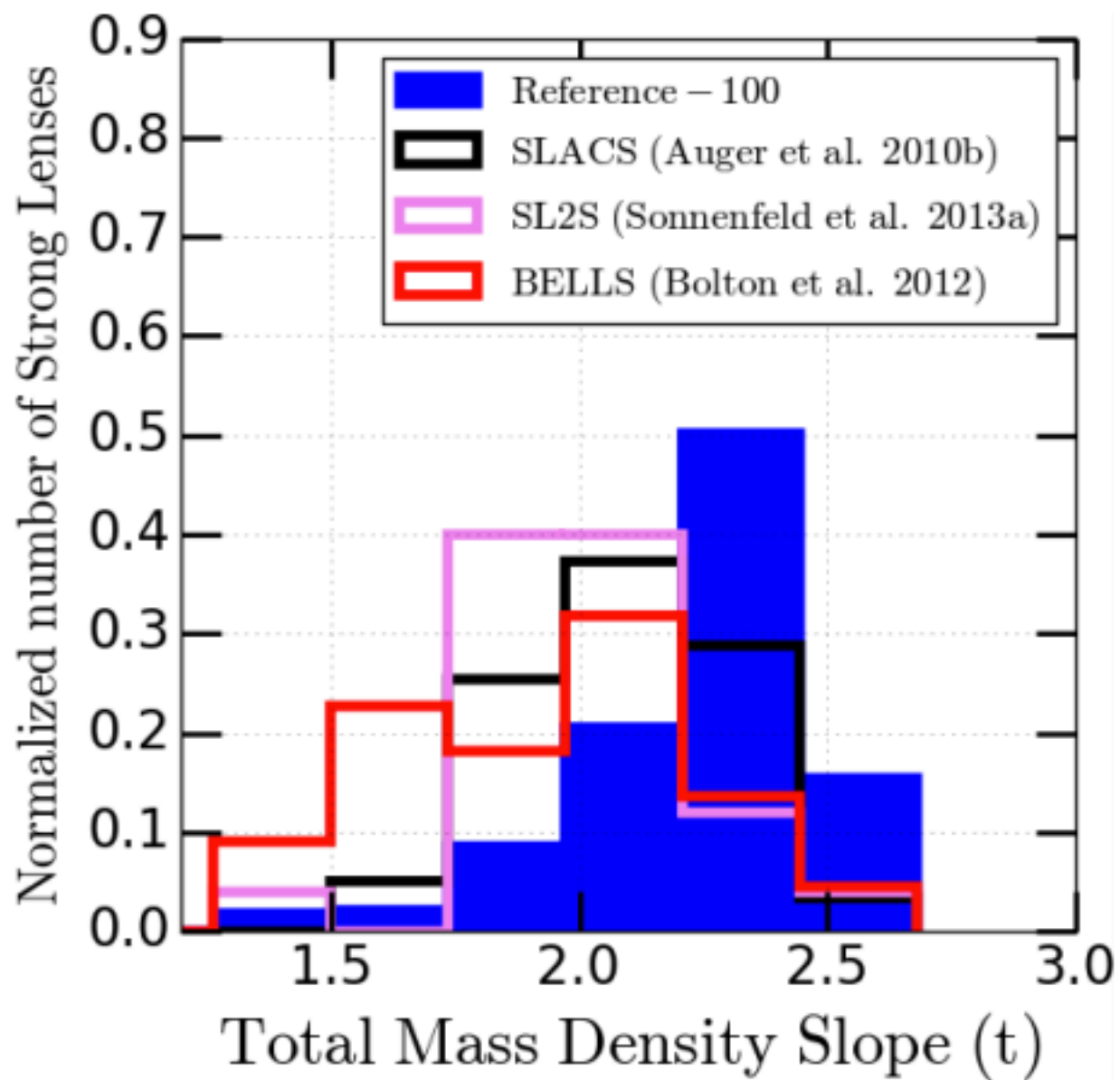
(Crain et al. 2015)

Remus+ 2017 — 3 sims  
 Xu+ 2017 — 2 sims  
 Peirani+ 2018 — 2 sims

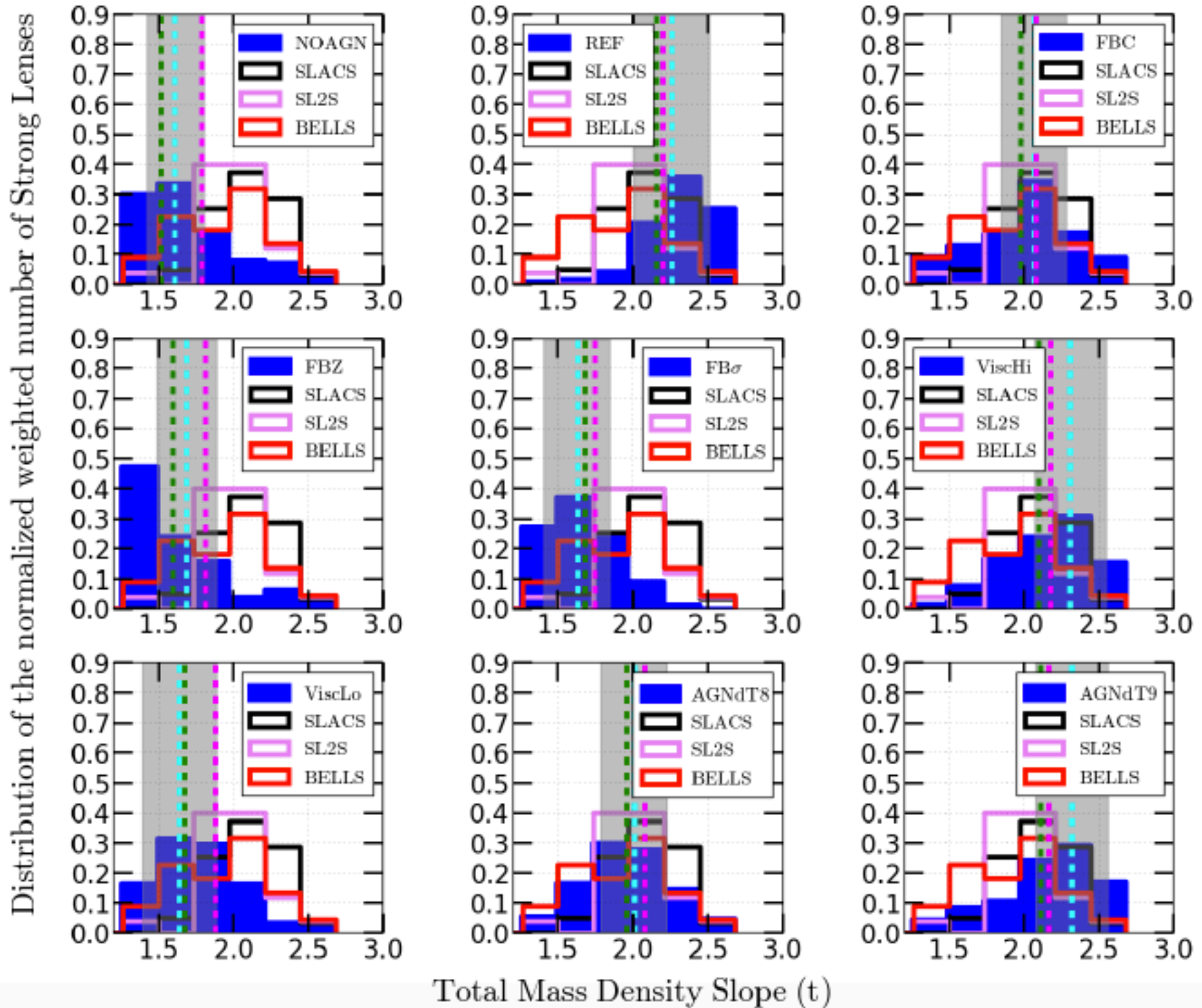
Reference  
 Variations



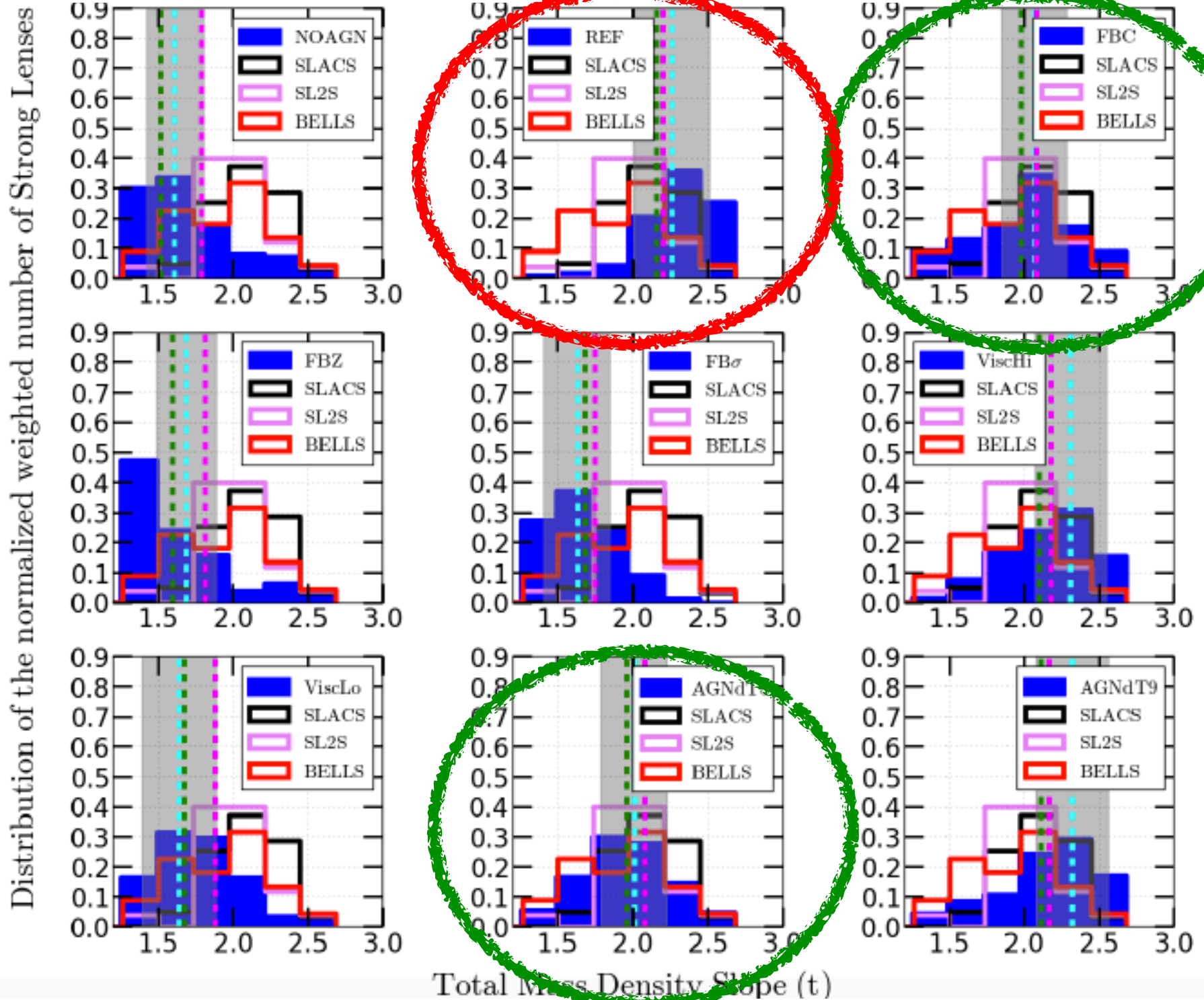
**SEAGLE-II.** Mukherjee et al. sub. MNRAS, arXiv:1901.01095

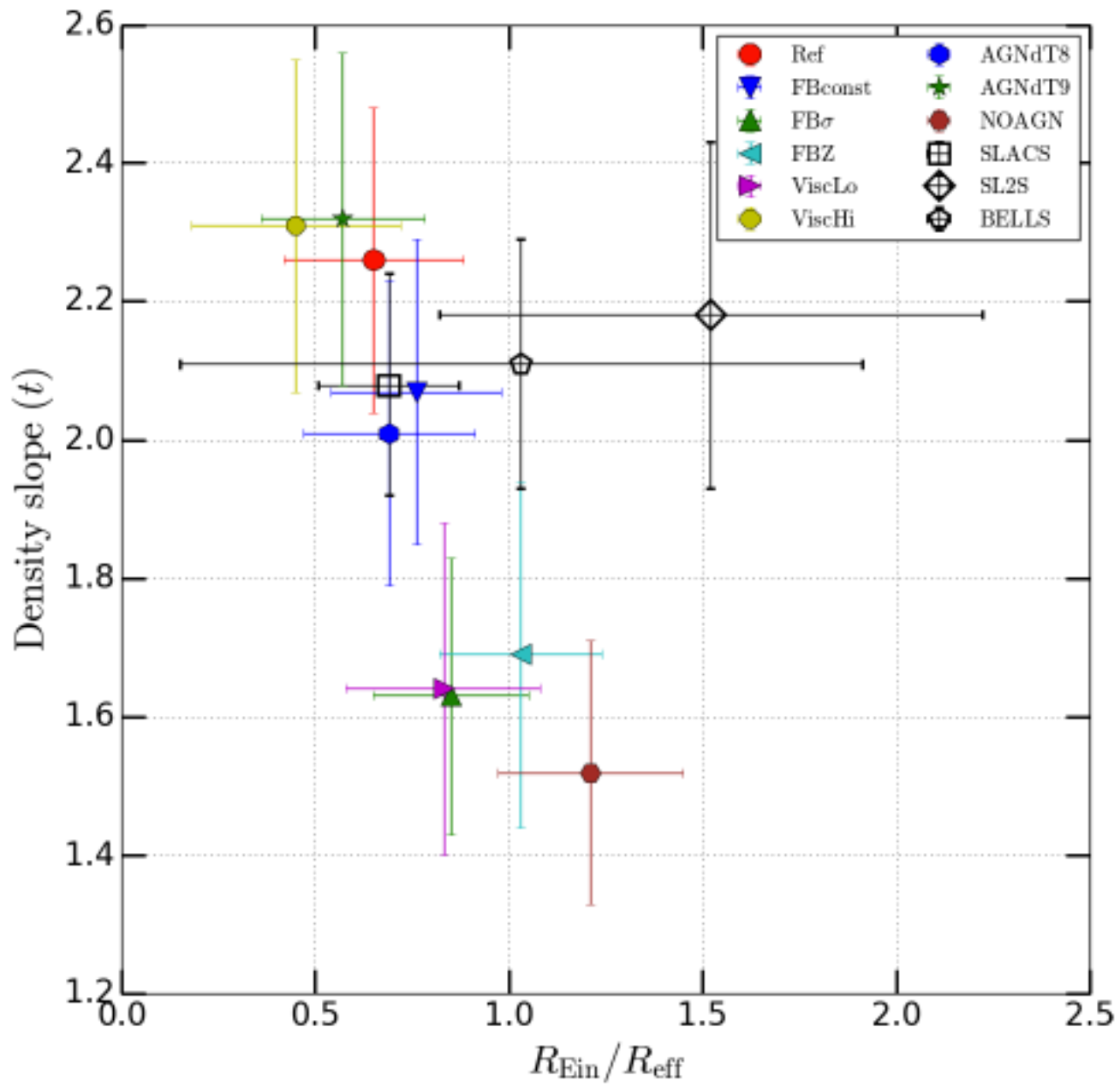


# Total Mass density slopes of EAGLE's 9 model variations



# Total Mass density slopes of EAGLE's 9 model variations







# Inner dark matter fractions of early type galaxies in EAGLE model variations

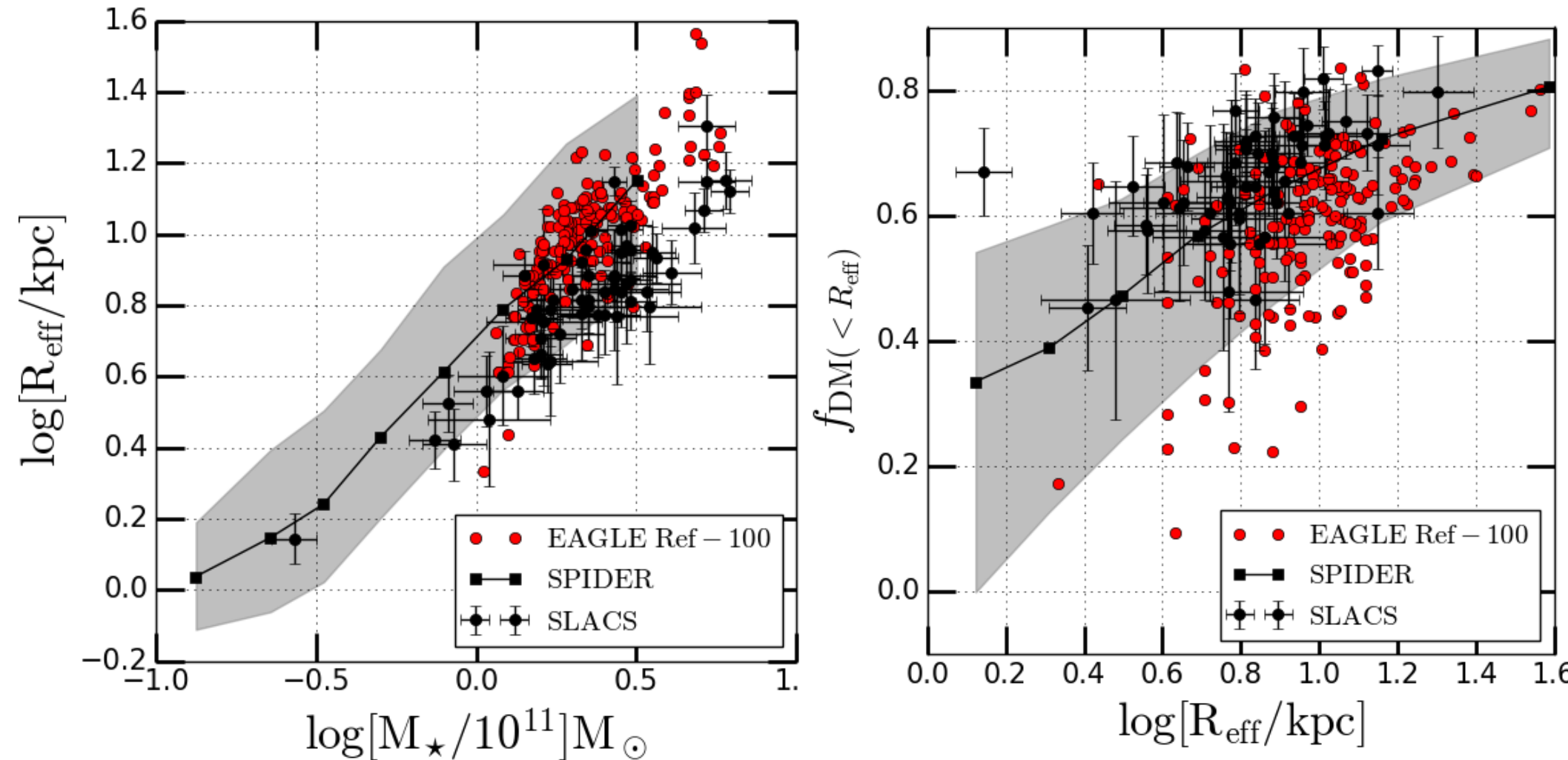
based on

***SEAGLE—III: The observed and simulated dark matter fractions in the central regions of early-type lens galaxies***

**Mukherjee** et al.

To be submitted in few week(s) to MNRAS

# SEAGLE- III: Dark Matter Fraction (DMF) of EAGLE galaxies



Comparison of DMF in **EAGLE-Ref 100** with **SLACS** & **SPIDER**

See [Tortora+ 2012 MNRAS](#) for **SPIDER**

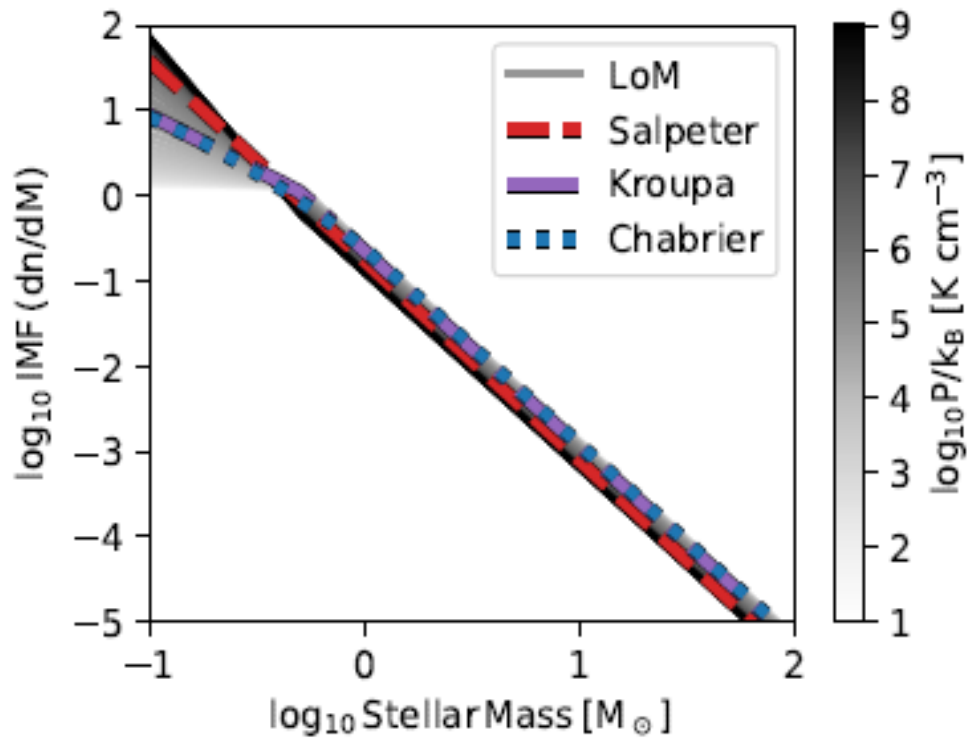
SEAGLE-III: *Mukherjee+* to be sub. in MNRAS

# Lensing properties of early type galaxies in variable IMF scenarios

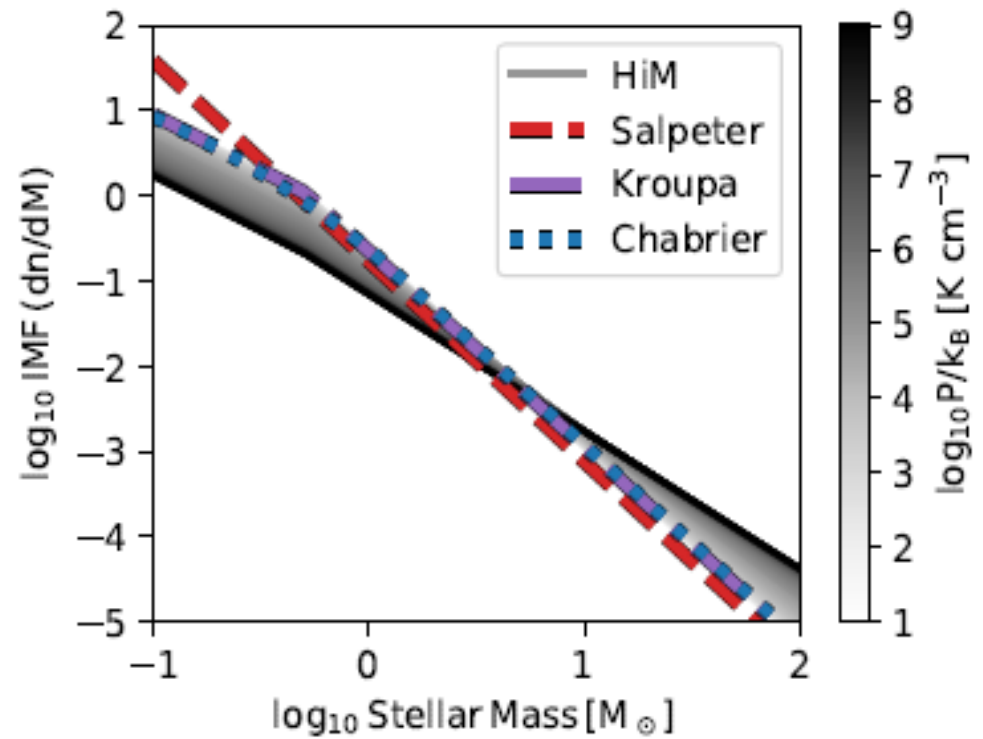
***SEAGLE—IV: Impact of IMF variation on dark matter fraction and dark matter slope of EAGLE strong lenses***

**Mukherjee** et al. 2019  
to be submitted to MNRAS

# SEAGLE- IV: Impact of IMF variation on DMF



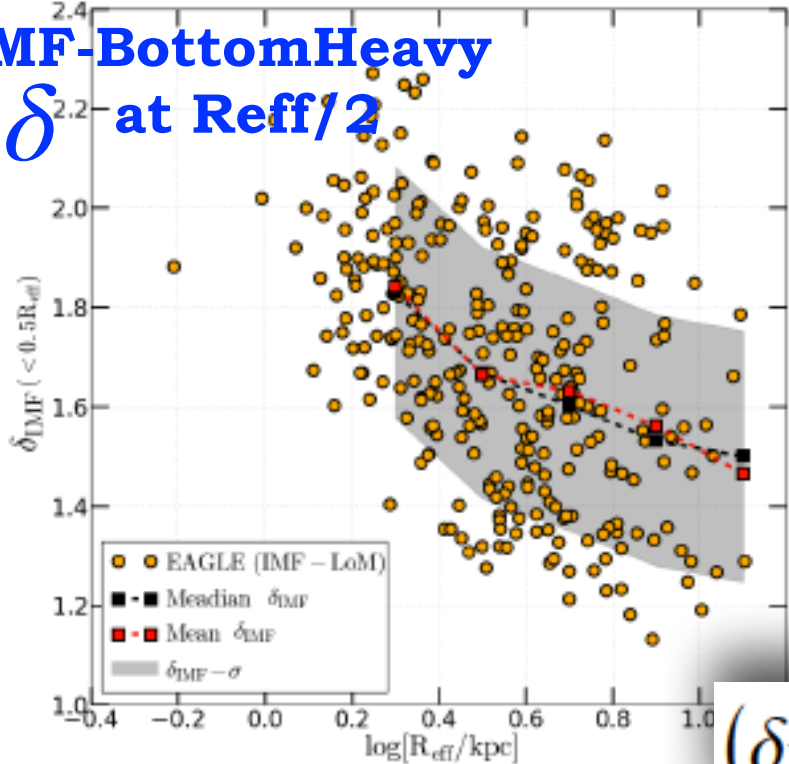
**IMF-BottomHeavy (LoM)**



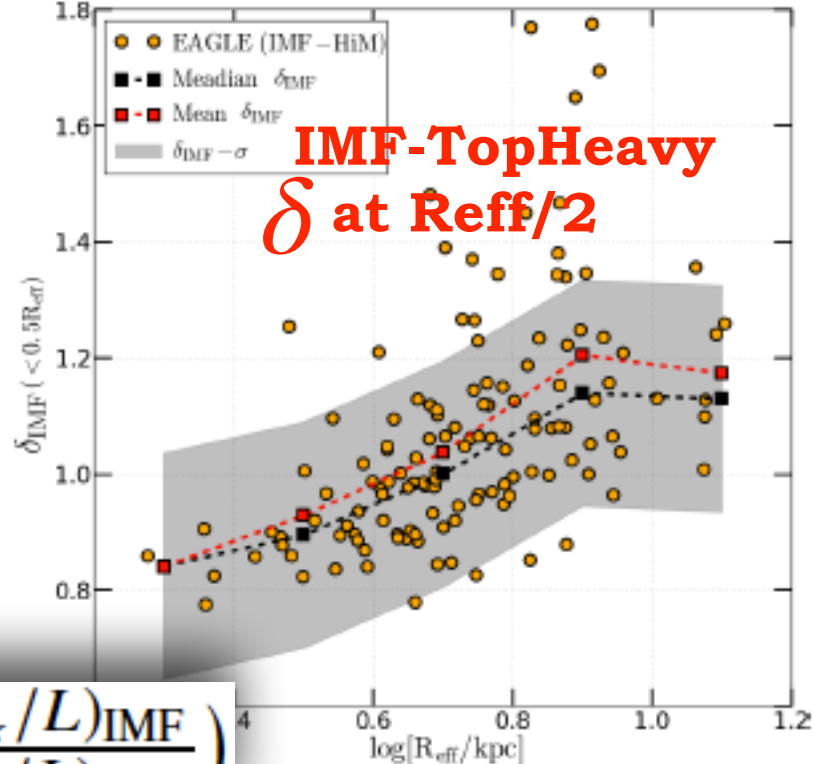
**IMF-TopHeavy (HiM)**

See Barber et al. 2018a MNRAS

**IMF-BottomHeavy**  
 $\delta$  at  $R_{\text{eff}}/2$

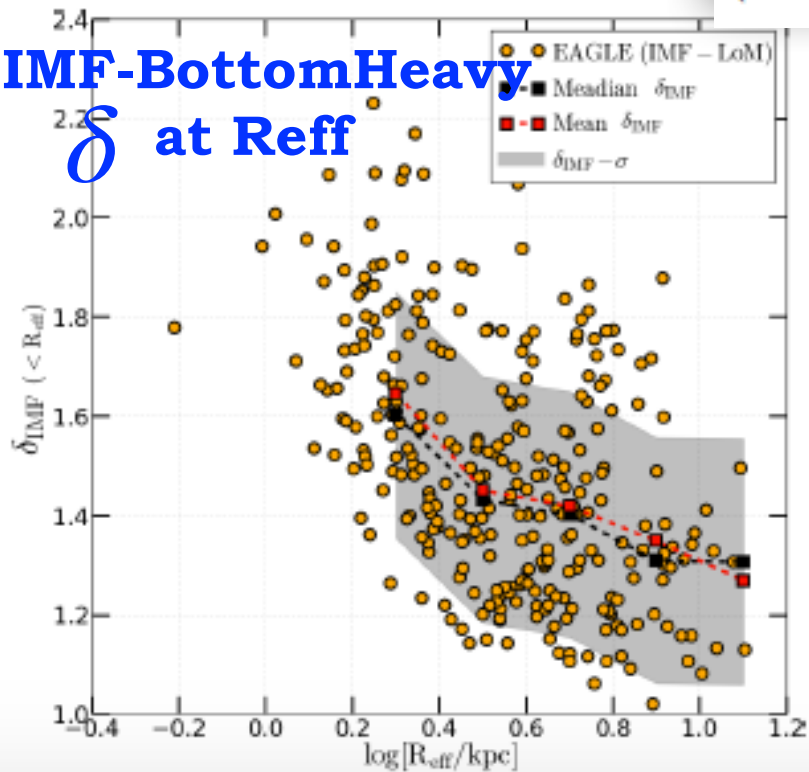


**IMF-TopHeavy**  
 $\delta$  at  $R_{\text{eff}}/2$

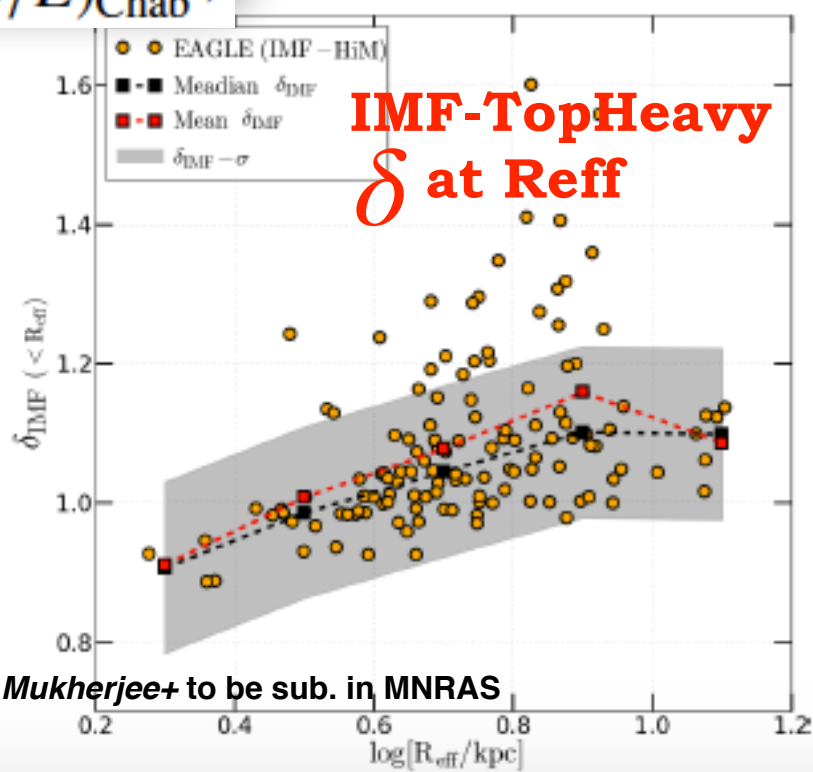


$$\left( \delta_{\text{IMF}} = \frac{(M_{\star}/L)_{\text{IMF}}}{(M_{\star}/L)_{\text{Chab}}} \right)$$

**IMF-BottomHeavy**  
 $\delta$  at  $R_{\text{eff}}$



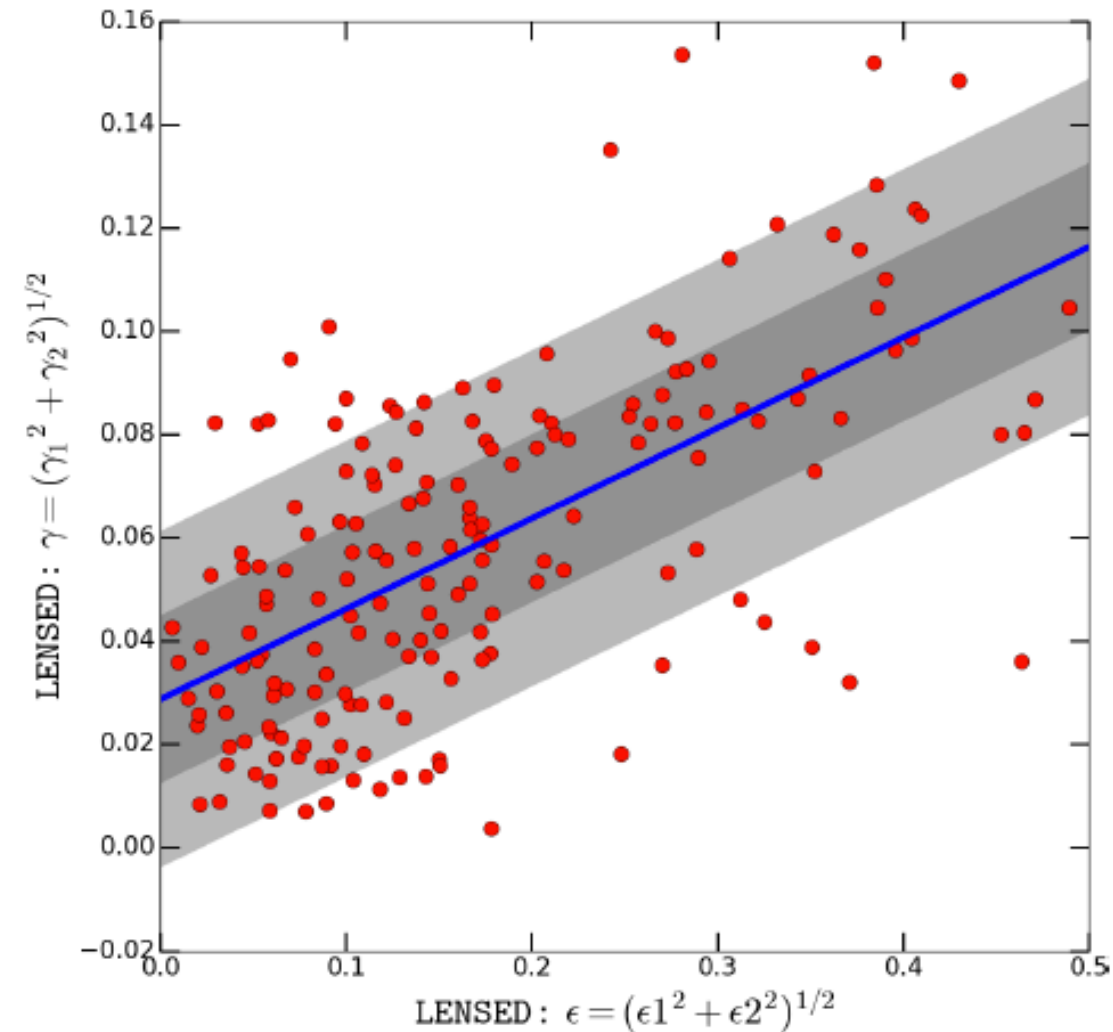
**IMF-TopHeavy**  
 $\delta$  at  $R_{\text{eff}}$



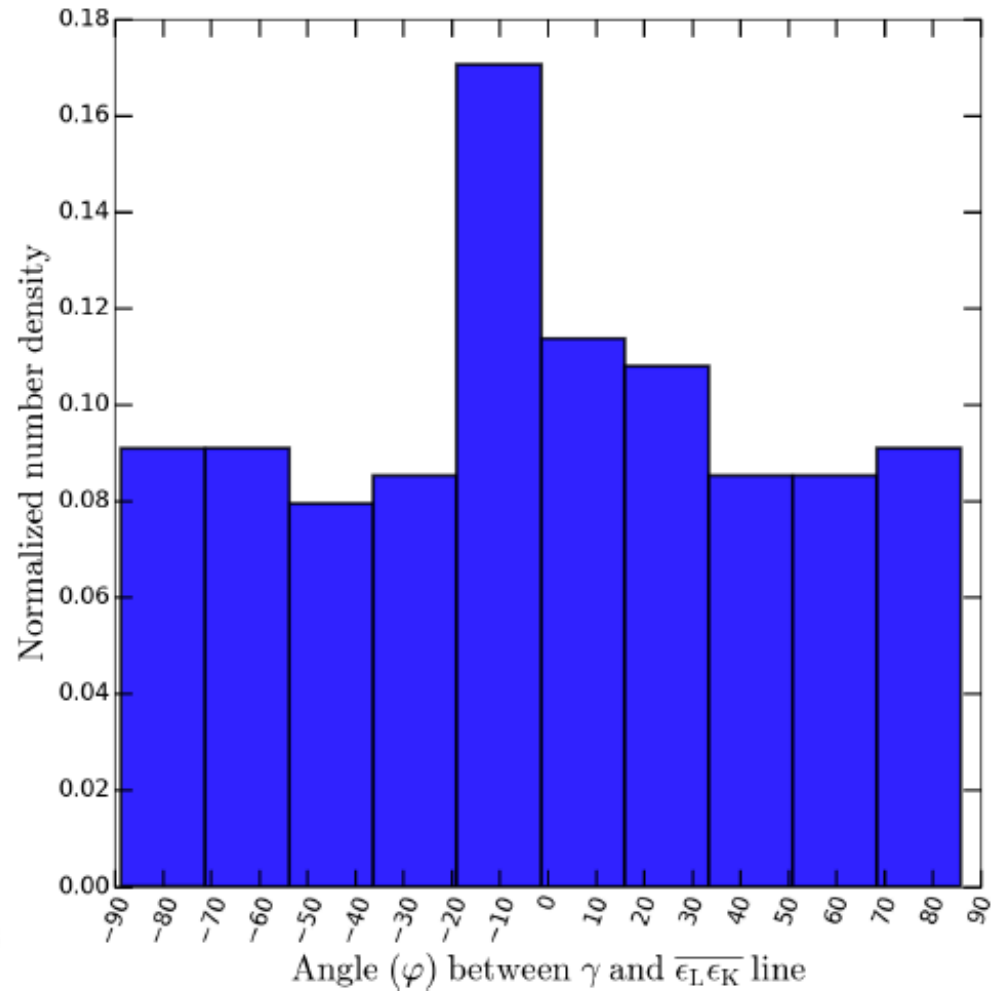
# Shear-Ellipticity degeneracy

***SEAGLE VI:** Impact of galaxy formation physics on 'shear-ellipticity' degeneracy in strong lens modeling*

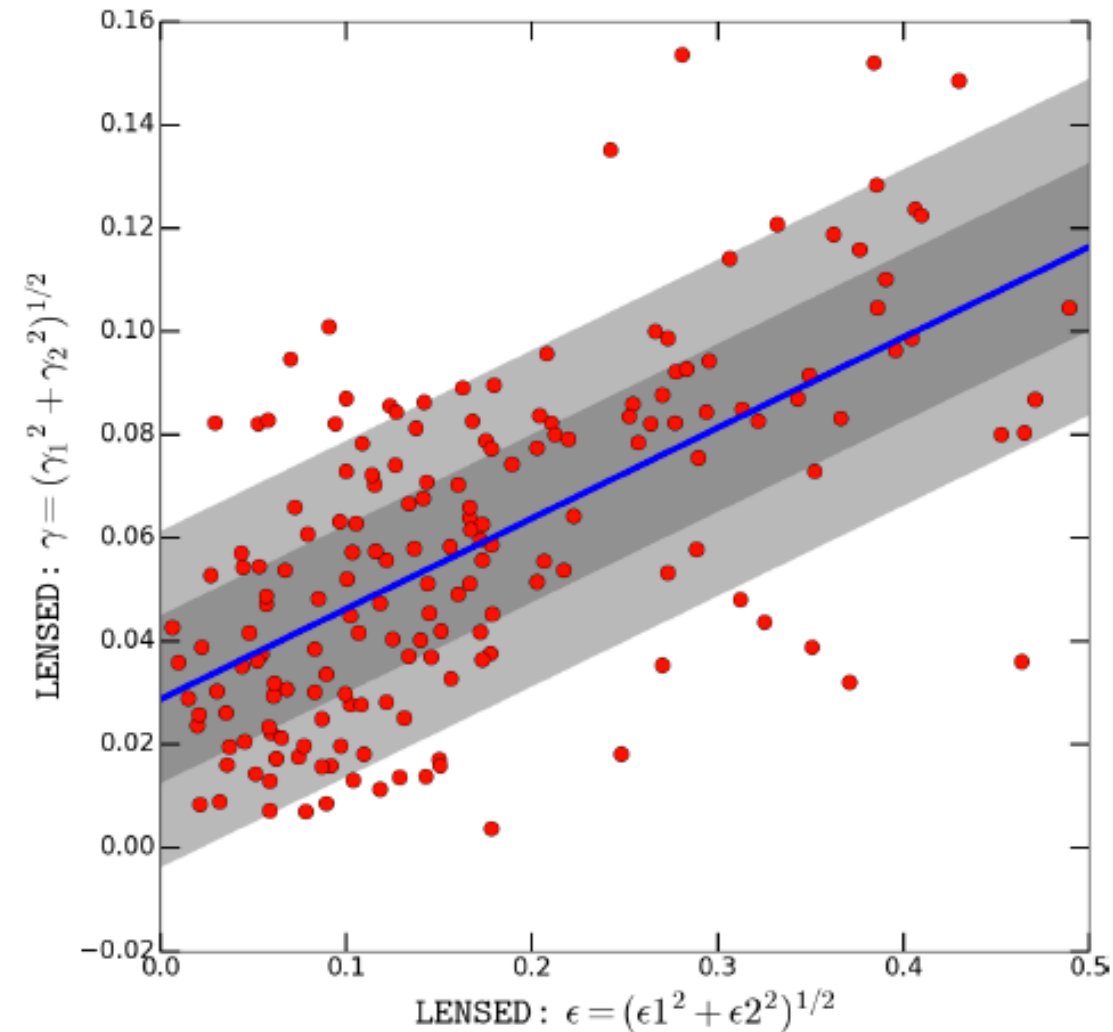
**Mukherjee** et al. 2019  
to be submitted to MNRAS



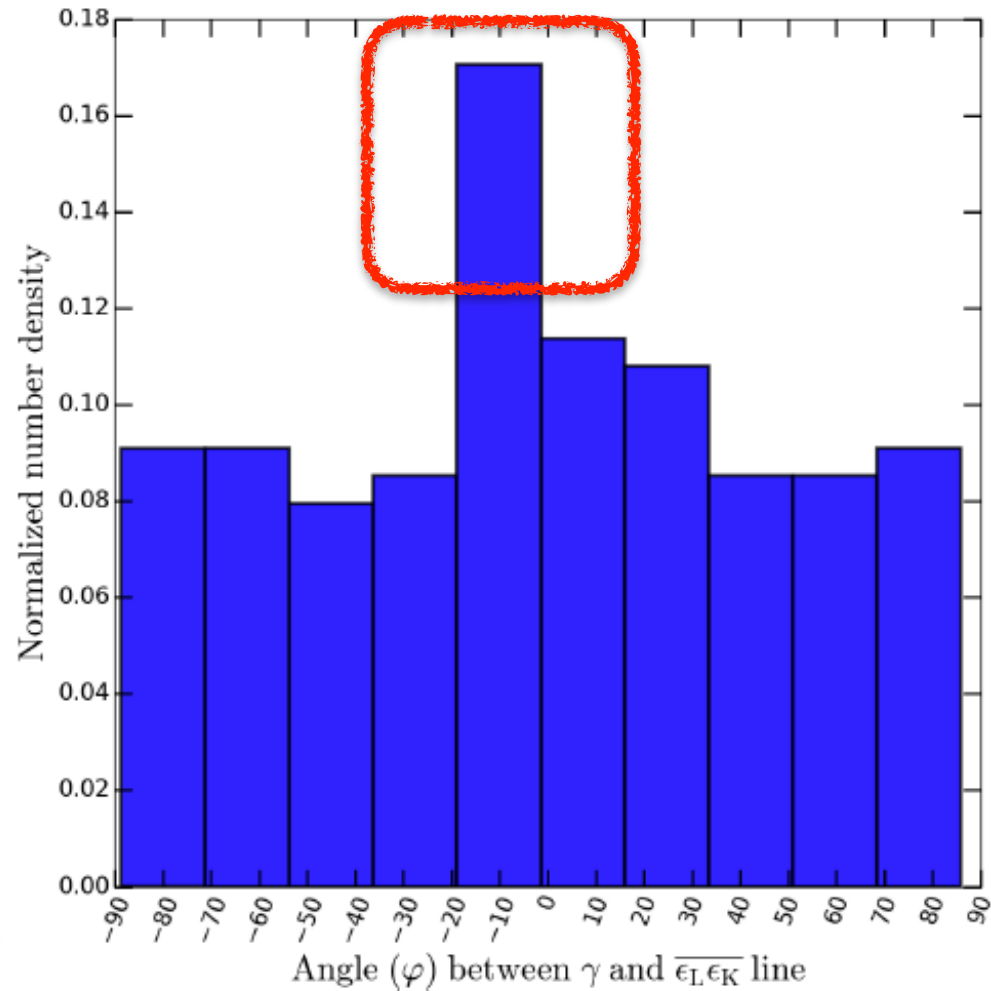
**Shear-Ellipticity correlation**



**Normalized distribution of Angle between shear and ellipticity**



**Shear-Ellipticity correlation**



**Normalized distribution of Angle between shear and ellipticity**

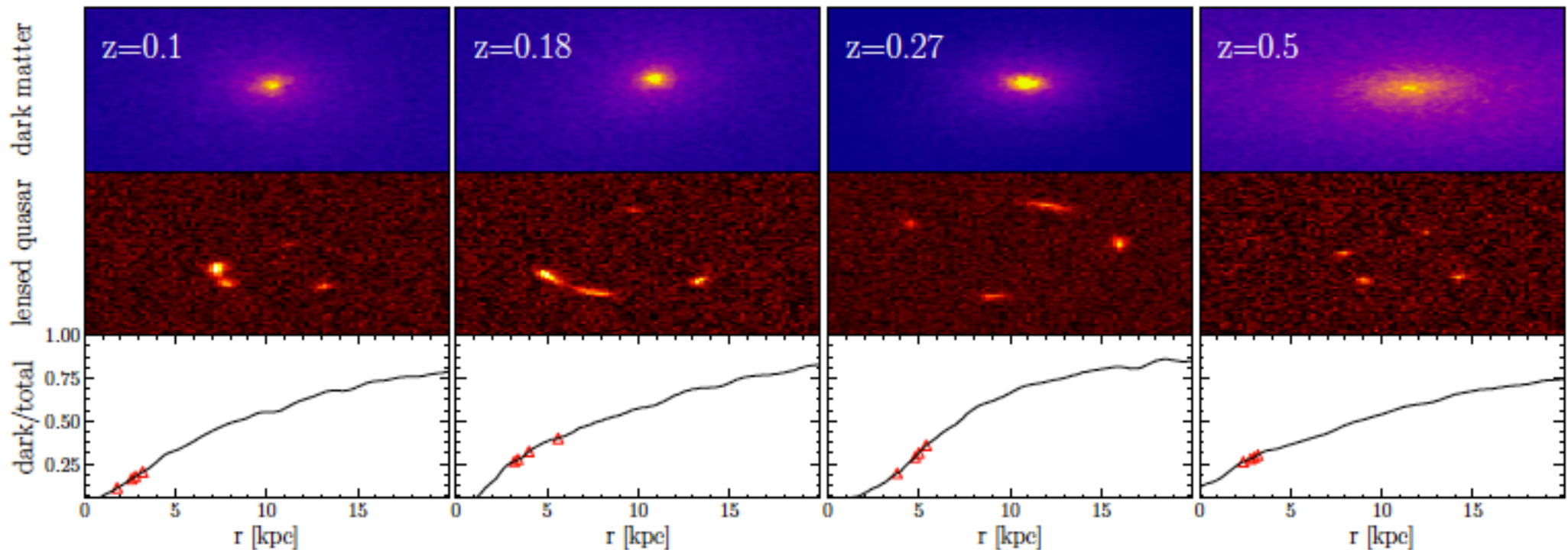


**Can we do some Microlensing too?**



## The Most Powerful Lenses in the Universe: *Pooley et al. 2019* Quasar Microlensing as a Probe of the Lensing Galaxy

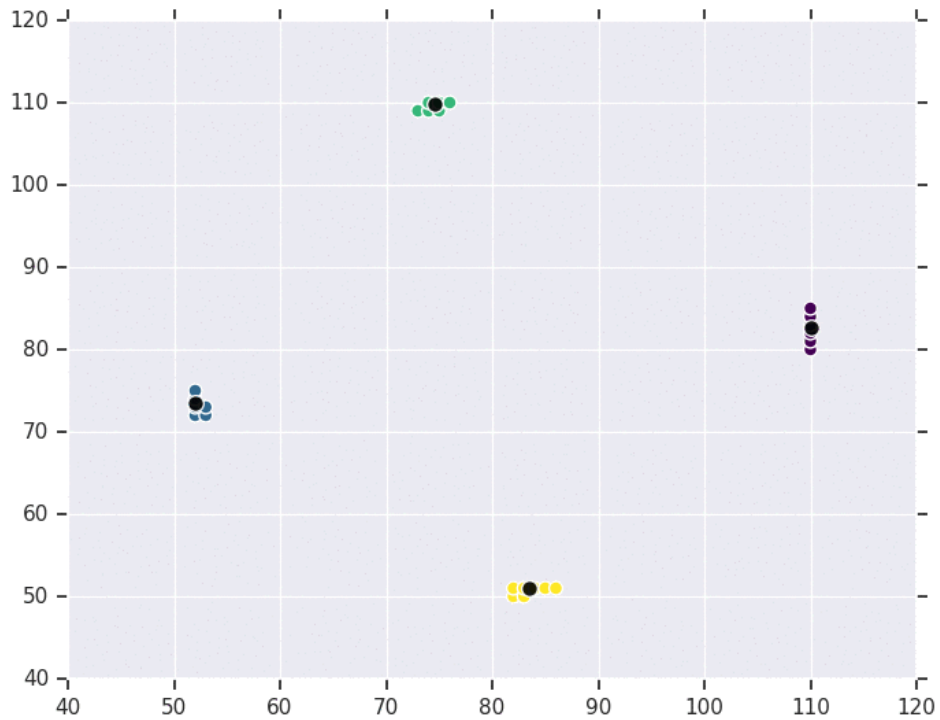
- Thematic Areas:**
- Planetary Systems
  - Star and Planet Formation
  - Formation and Evolution of Compact Objects
  - Cosmology and Fundamental Physics
  - Stars and Stellar Evolution
  - Resolved Stellar Populations and their Environments
  - Galaxy Evolution
  - Multi-Messenger Astronomy and Astrophysics



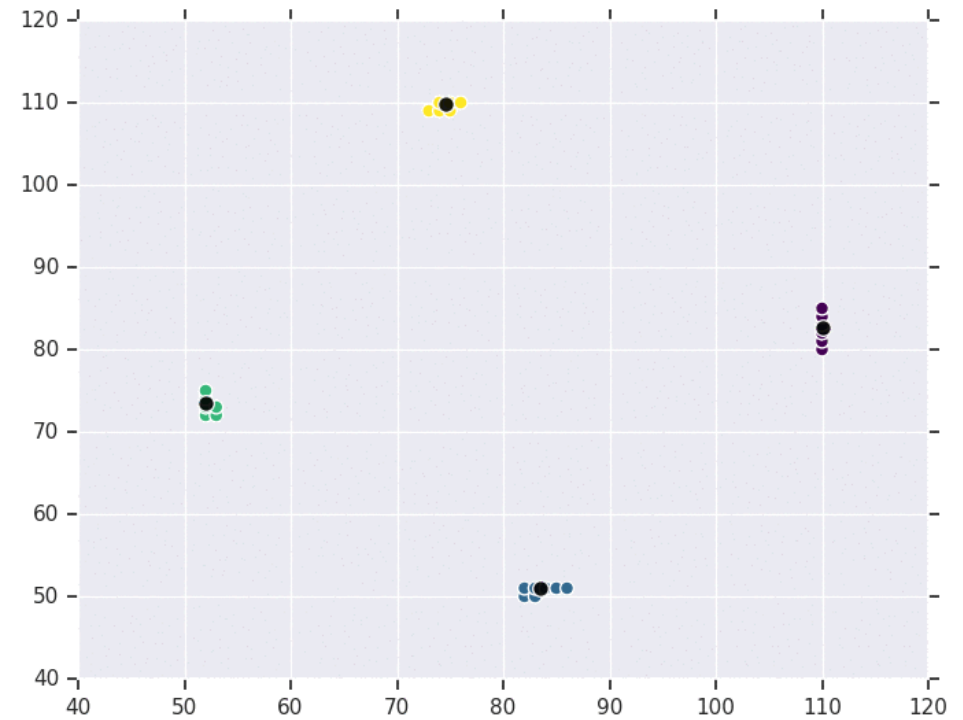
# Microlensing with **SEAGLE**

*Mukherjee+ in prep*

## Implementing clustering algorithm



**Stacked lensed systems  
with their brightest pixel**



**Individual lensed systems  
with their brightest pixel**

**$z_{\text{lens}} = 0.271$  and  $z_{\text{source}} = 1.0$**

# Upcoming SEAGLE Papers in 2019-2020

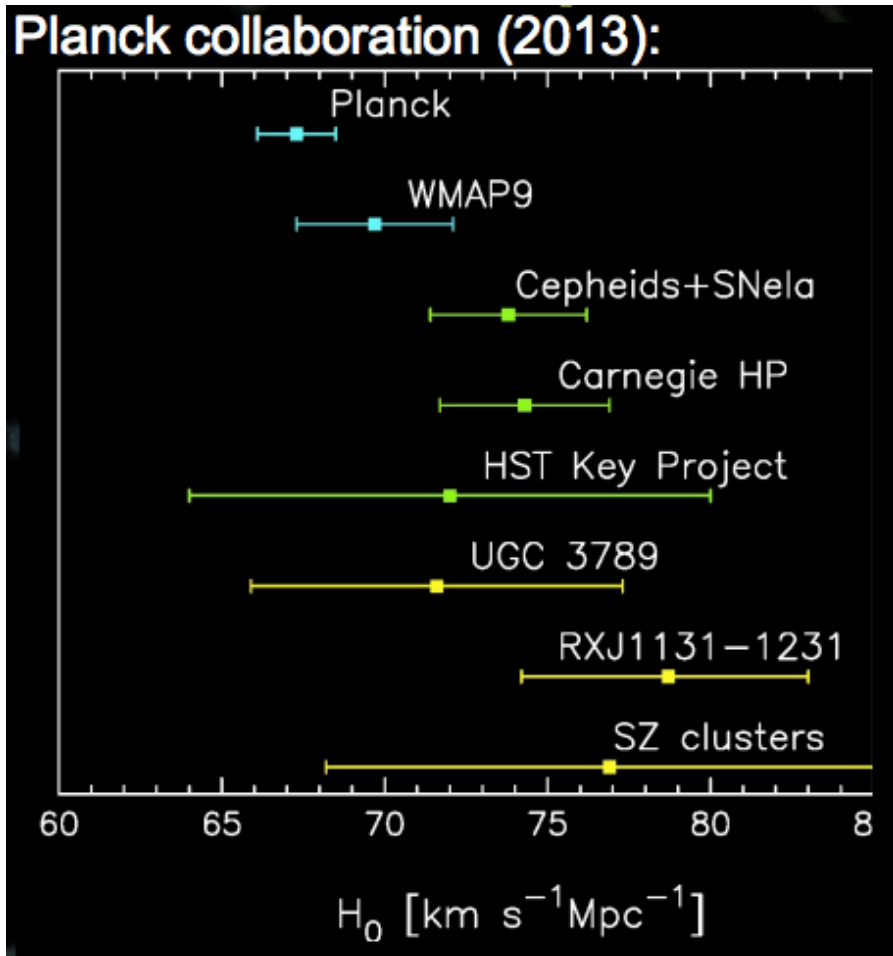
1. **Mukherjee** et al. — Shear Ellipticity degeneracy
2. Chatterjee, **Mukherjee** et al.— Mass power spectrum with EAGLE
3. Bayer, **Mukherjee** et al. — HST lens P.S. with EAGLE.

---

## Using SEAGLE pipeline

4. Tortora, **Mukherjee** et al. — EAGLE lenses in KiDS.
5. Tortora, **Mukherjee** et al. — EAGLE lenses in KiDS II.
6. Spiniello, **Mukherjee** et al. — EAGLE quasar lenses in KiDS.
7. Vernardos, **Mukherjee**, **Sluse** — GERLUMPH and EAGLE.
8. **Mukherjee**, Vernardos, **Sluse** — Shear-convergence correlation in EAGLE
9. Denzel, Saha, **Mukherjee** — New strong lens modelling code

# Time delay and Hubble constant



**Independent measurements  
are needed!**

Time delay:

$$t = \frac{1}{c} D_{\Delta t} \phi_{\text{lens}}$$

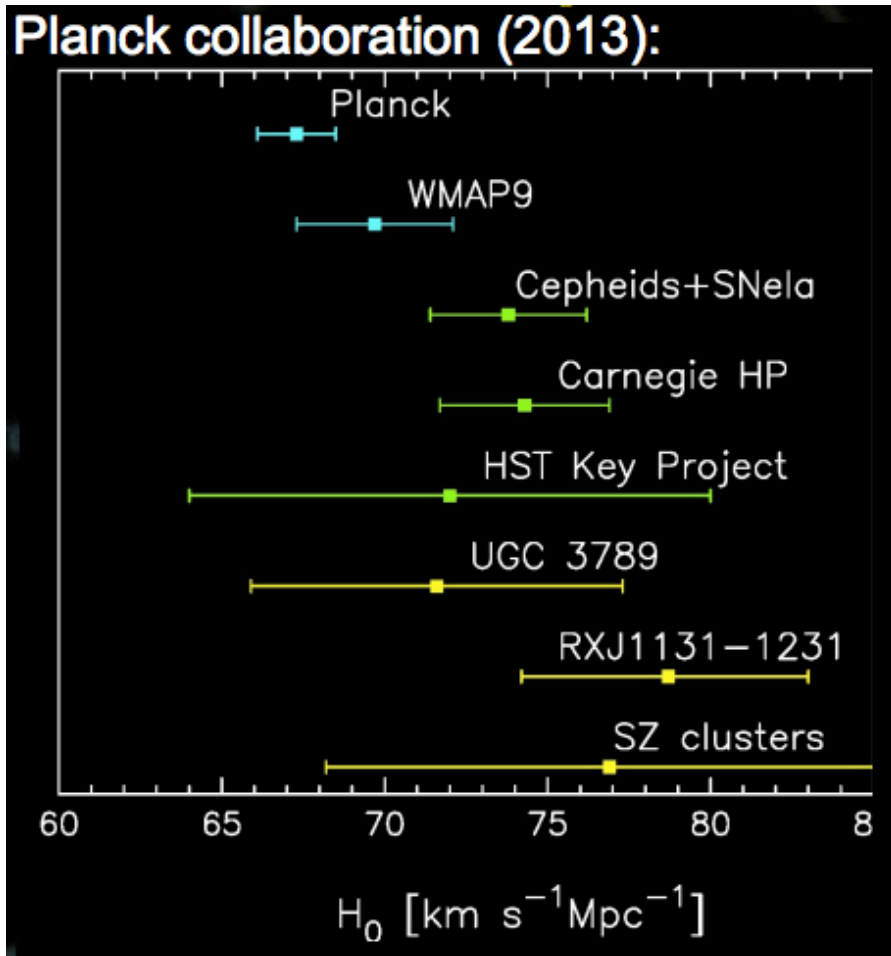
Time-delay distance:  $D_{\Delta t} \propto \frac{1}{H_0}$

Obtain from lens mass model

**For cosmography we need:**

- 1. Lens mass model**
- 2. Time-delay**
- 3. Mass along Line of sight**

# Time delay and Hubble constant



Independent measurements  
are needed!

Time delay:

$$t = \frac{1}{c} D_{\Delta t} \phi_{\text{lens}}$$

Time-delay distance:  $D_{\Delta t} \propto \frac{1}{H_0}$

Obtain from lens mass model

For cosmography we need:

1. Lens mass model

2. Time-delay

3. Mass along Line of sight

Simulations: Hydro, DM only or semi analytic

# COSMICLENS: Cosmology with Strong Gravitational Lensing

Prof. Frédéric Courbin (EPFL)  
Prof. Dominique Sluse (U. Liege)

ERC Advanced Grant

H2020-EU.1.1. ERC-2017-ADG  
Oct 2018 — Sept 2023

# COSMICLENS: Cosmology with Strong Gravitational Lensing

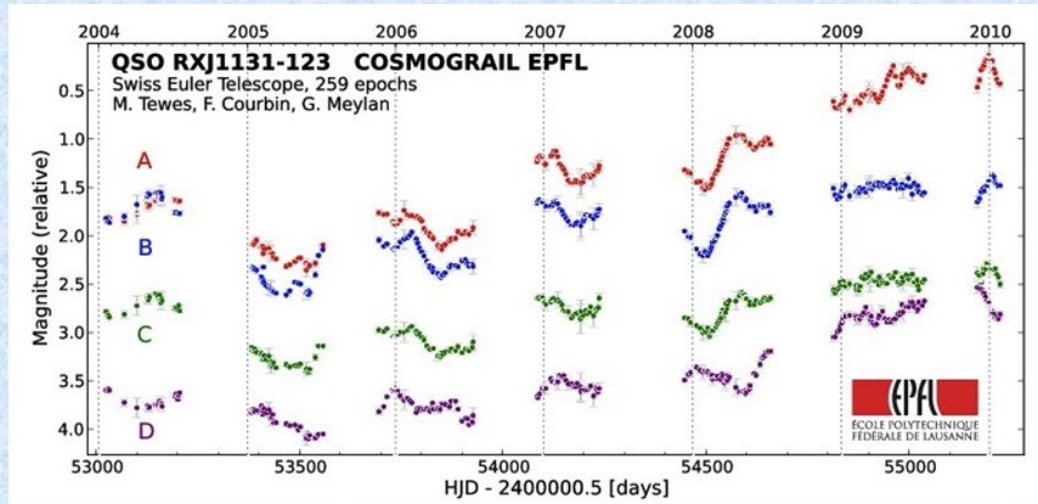
Prof. Frédéric Courbin (EPFL)  
Prof. Dominique Sluse (U. Liege)

ERC Advanced Grant

H2020-EU.1.1. ERC-2017-ADG  
Oct 2018 — Sept 2023

## COSMOGRAIL: the COSmological MONitoring of GRAvitational Lenses

- time delays of lensed quasars from optical monitoring
- expect to have delays with a few percent error for  $\sim 20$  lenses



## The H0LiCOW Collaboration: *Cosmology with Quasar Time Delays*





# COSMICLENS: Cosmology with Strong Gravitational Lensing

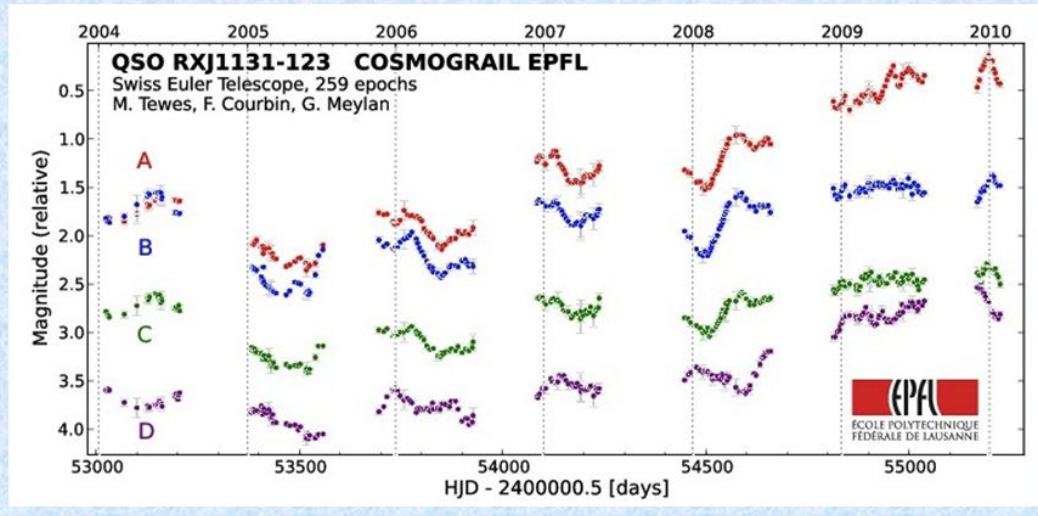
Prof. Frédéric Courbin (EPFL)  
Prof. Dominique Sluse (U. Liege)

ERC Advanced Grant

H2020-EU.1.1. ERC-2017-ADG  
Oct 2018 — Sept 2023

## COSMOGRAIL: the COSmological MONitoring of GRAvitational Lenses

- time delays of lensed quasars from optical monitoring
- expect to have delays with a few percent error for  $\sim 20$  lenses



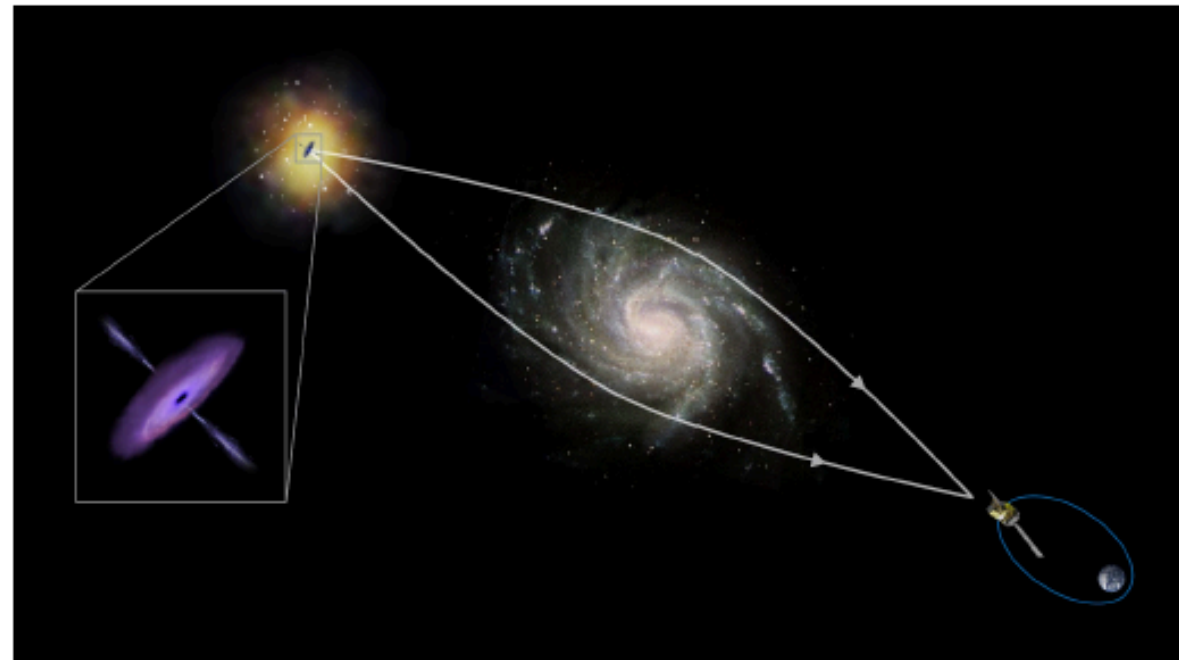
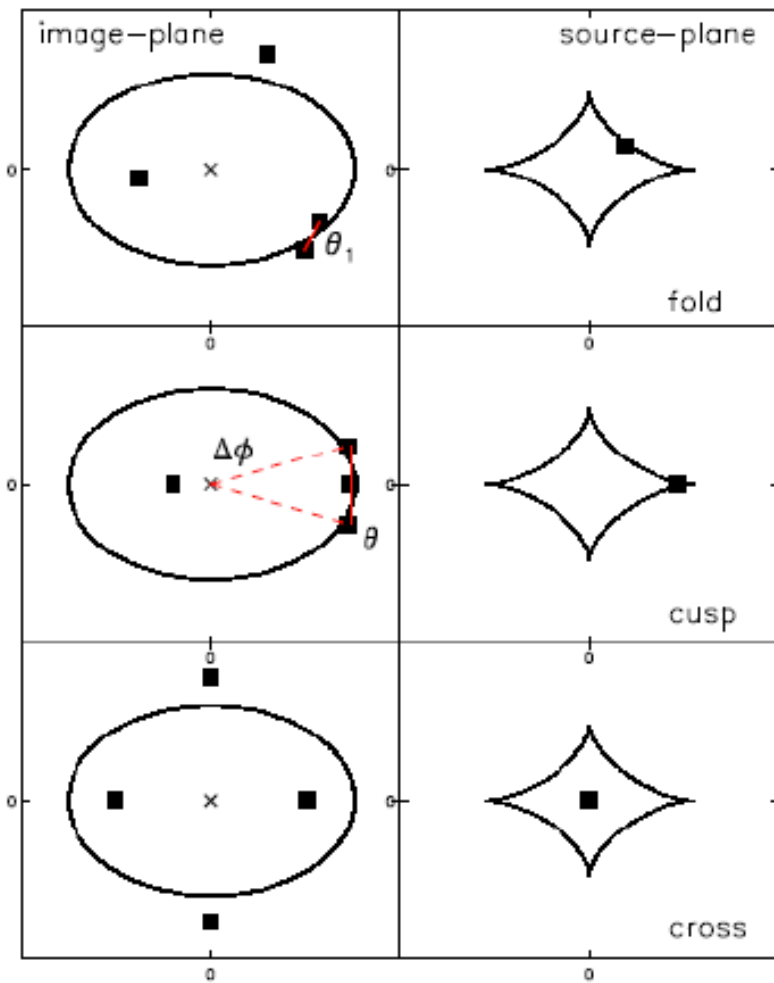
## The H0LiCOW Collaboration: *Cosmology with Quasar Time Delays*



4 work plan project

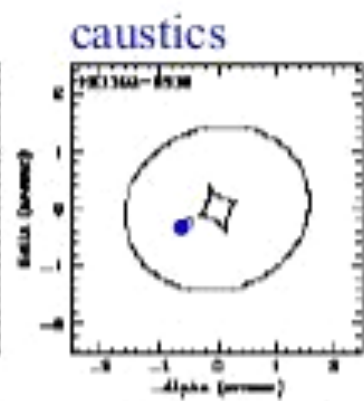
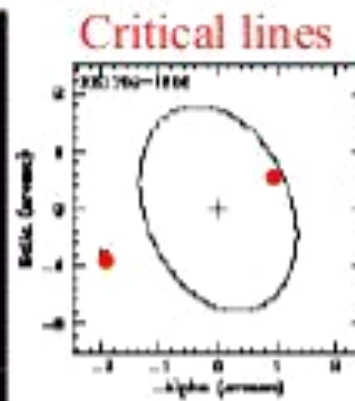
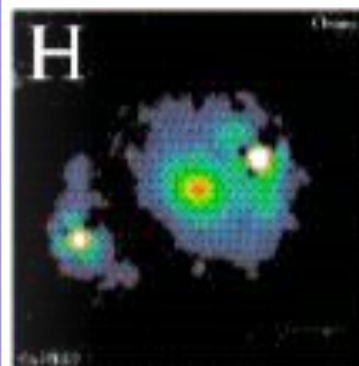
3- Providing a modular **end-to-end simulation framework** to mock lensed systems from hydro-simulations and to evaluate in detail the impact model degeneracies on Hubble constant ( $H_0$ ).

# Quasar Strong Lensing

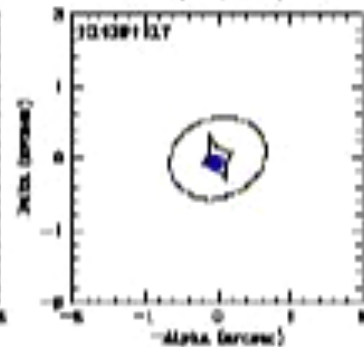
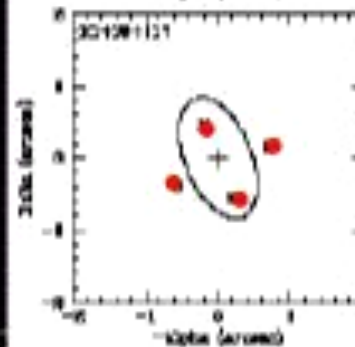
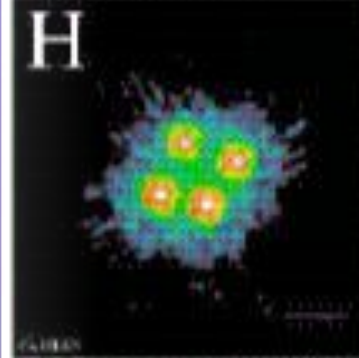


# Observed Quasar Lenses

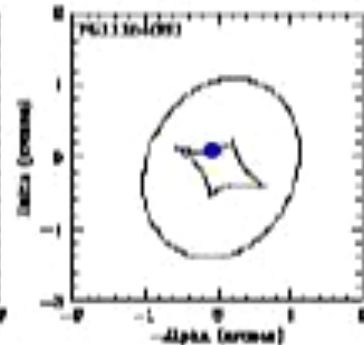
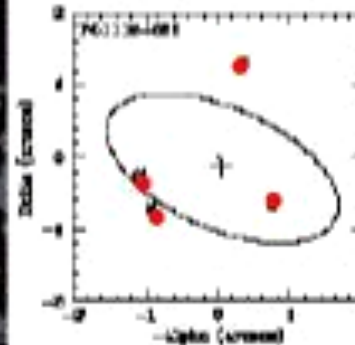
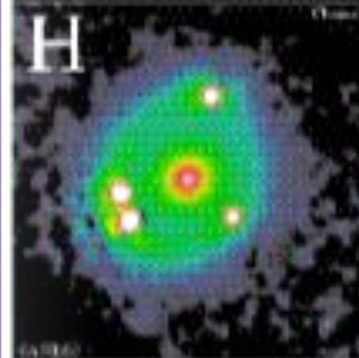
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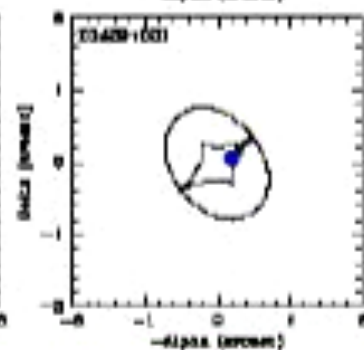
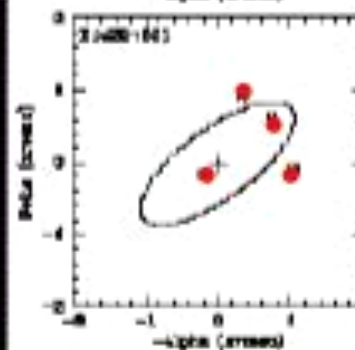
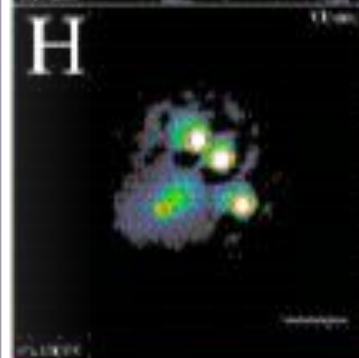
H1413+117



PG1115+080



B1422+231



# COSMICLENS



# COSMICLENS

GLAMER

SEAGLE

- **Analytic + N-body**  
Time delay ( $\delta t$ )  
Line of sight  
Multi plane/Light cone

# COSMICLENS

## Lenstronomy

- **Analytic + N-body**
- Time delay ( $\delta t$ )
- Line of sight
- Instrumentation

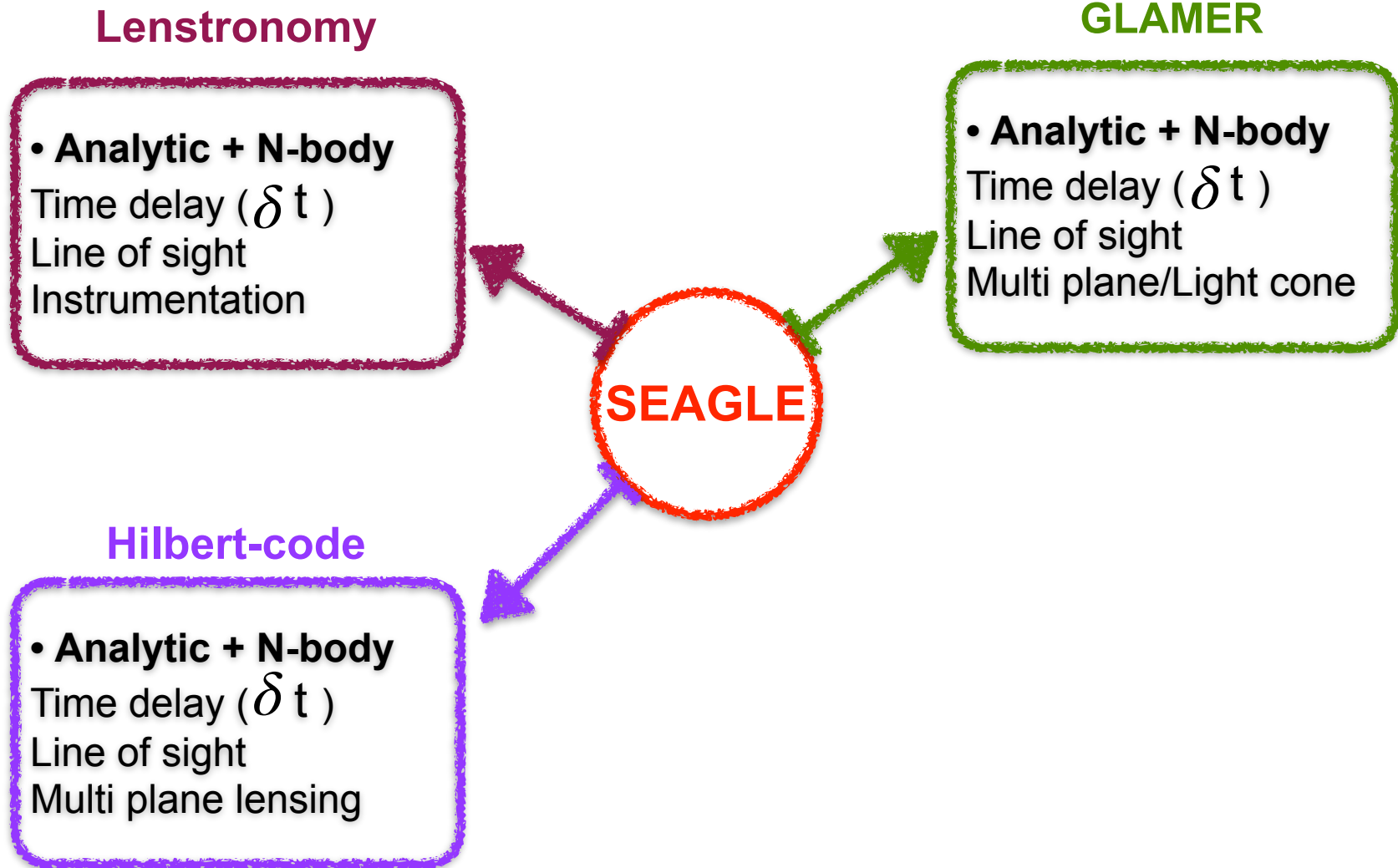
## GLAMER

- **Analytic + N-body**
- Time delay ( $\delta t$ )
- Line of sight
- Multi plane/Light cone

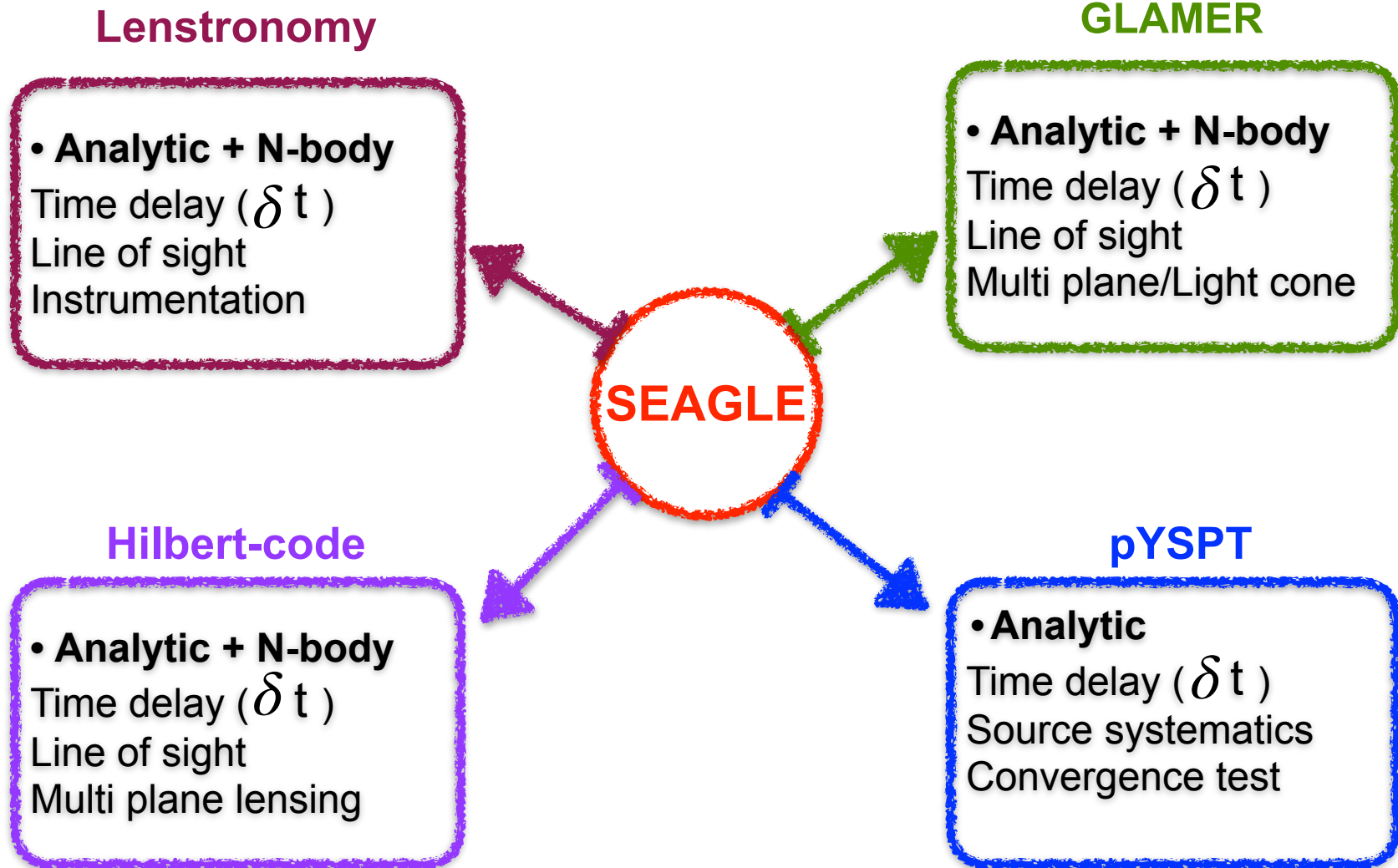
**SEAGLE**

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graph TD; SEAGLE((SEAGLE)) --> Lenstronomy; SEAGLE --> GLAMER;
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# COSMICLENS

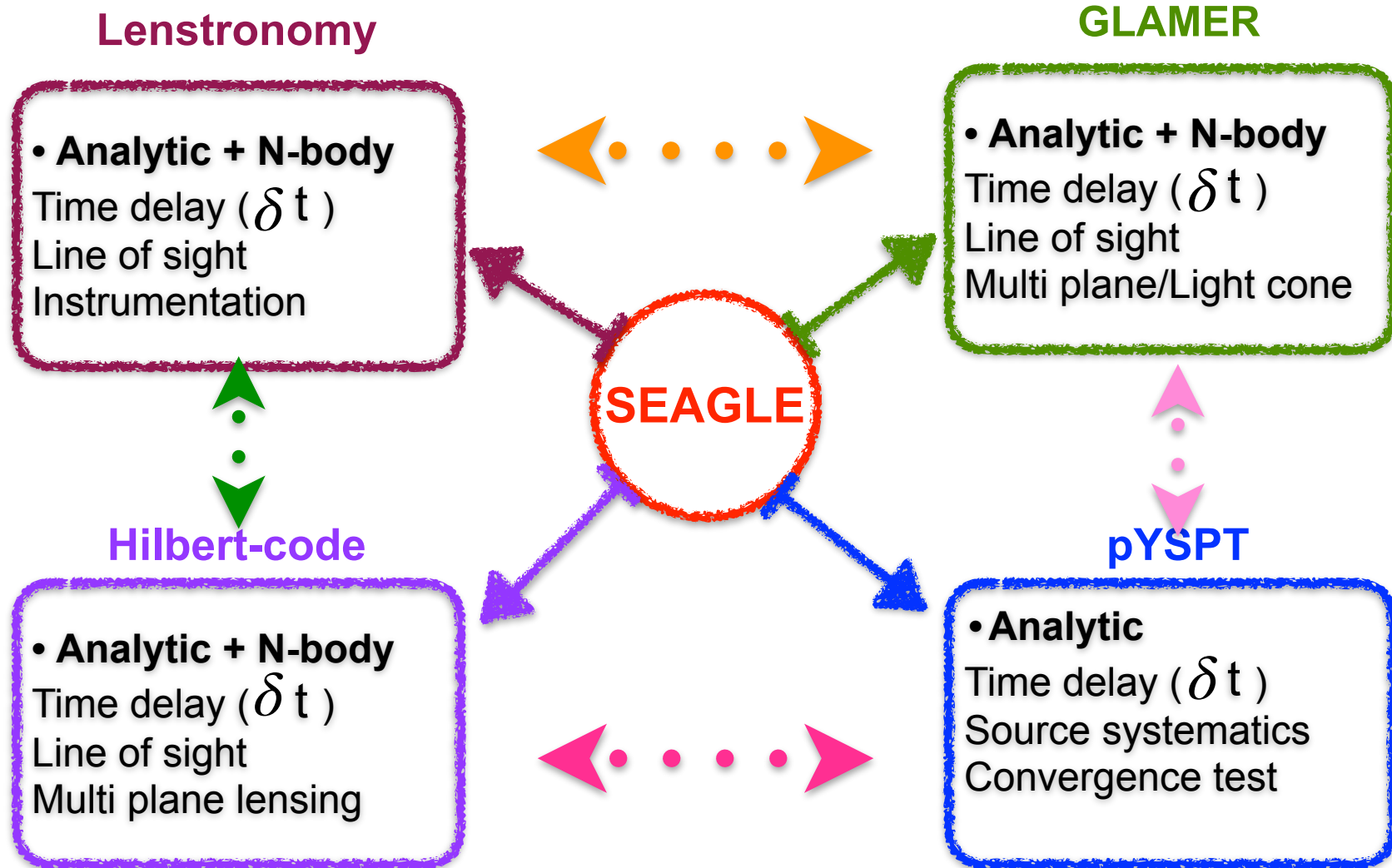


# COSMICLENS

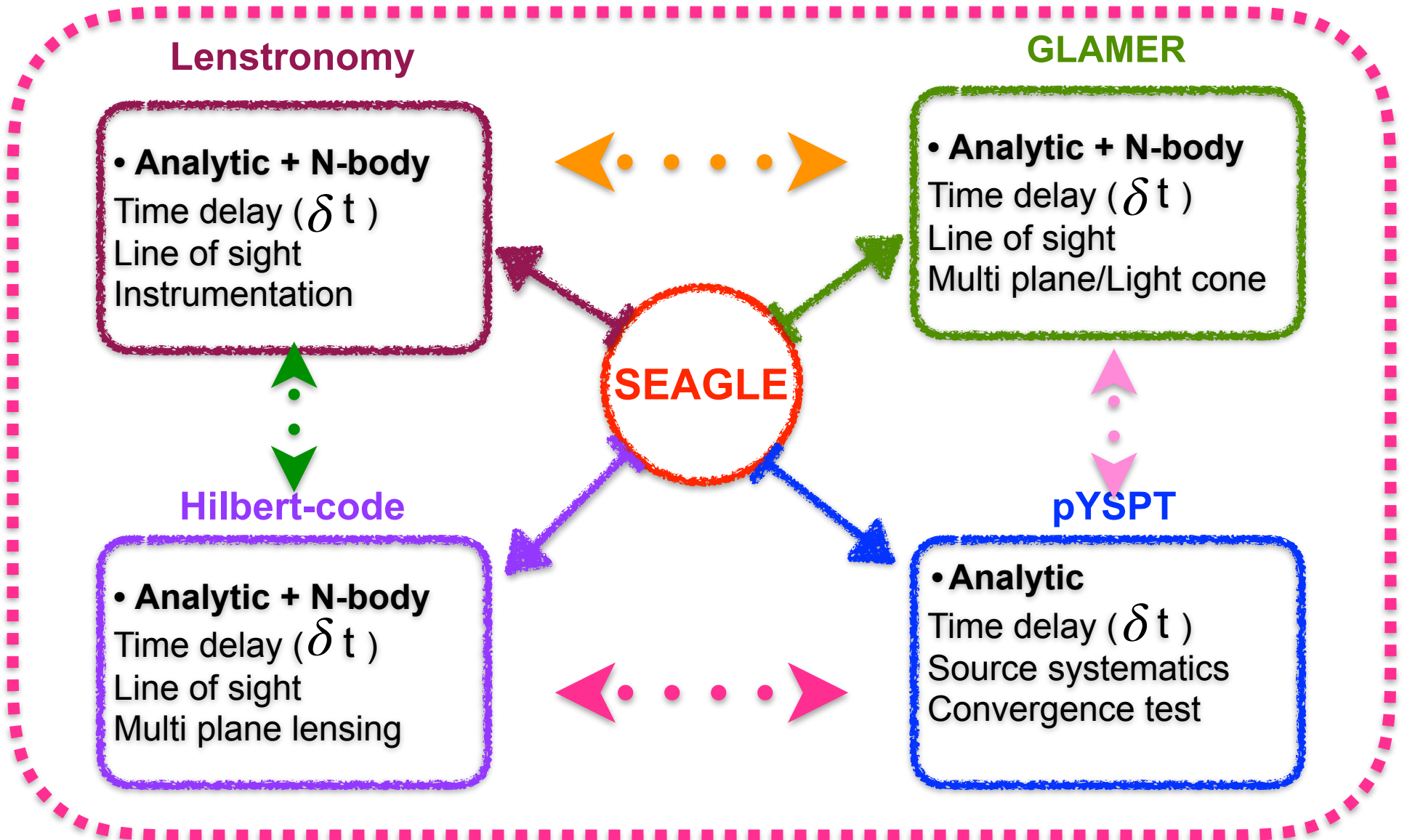




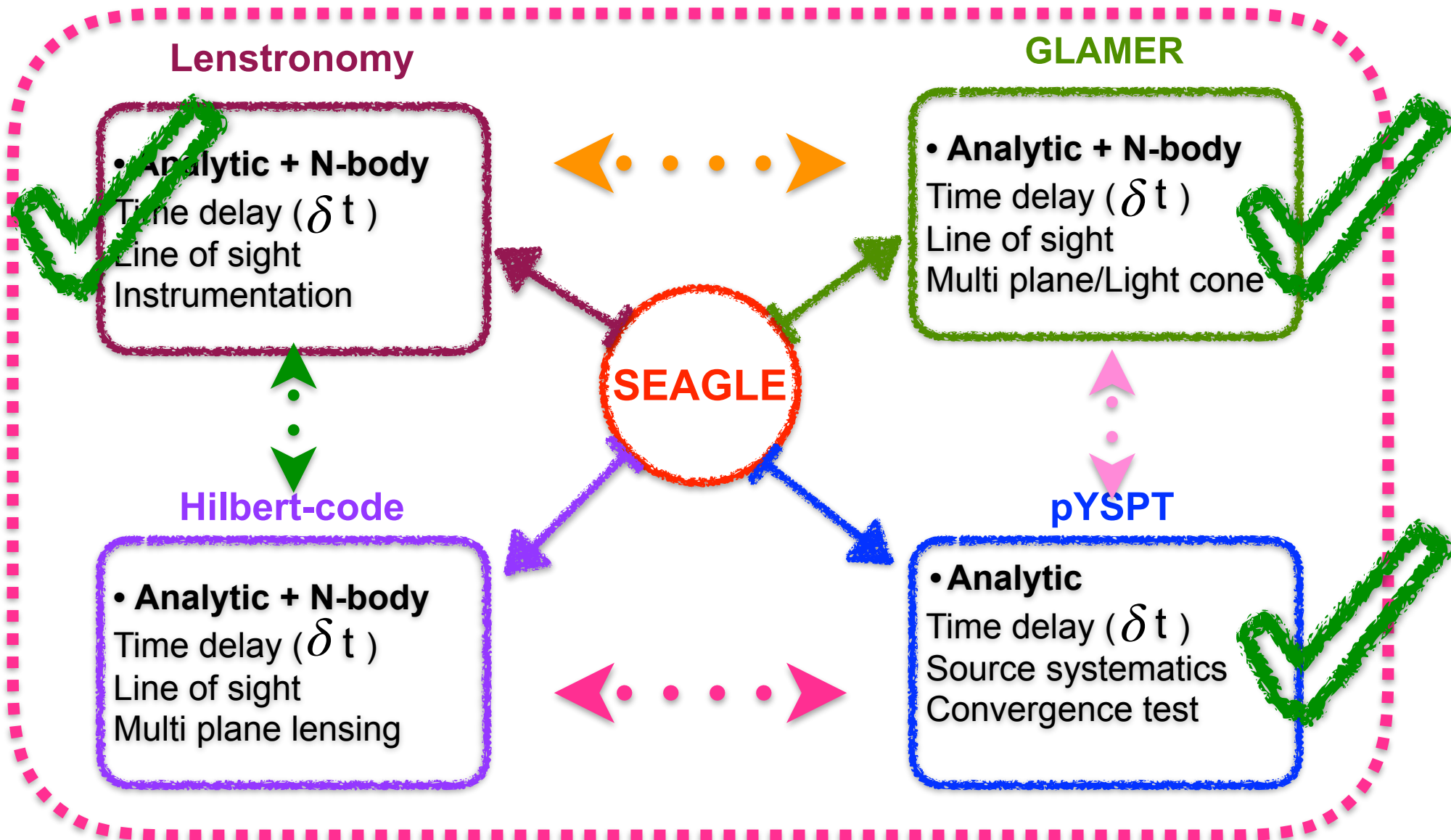
# COSMICLENS



# COSMICLENS



# COSMICLEN



# Conclusions

1. An automatic pipeline for creating & modelling mock lenses with a suite of hydrodynamic simulations, EAGLE, mimicking observational surveys and analysing them similar to real lenses.  
(**SEAGLE-I:** [Mukherjee et al. 2018 MNRAS](#))
2. Applying the pipeline to a variety of EAGLE scenarios can constrain the galaxy-formation mechanisms via total mass density slope and mass-size relationship. (**SEAGLE-II:** [Mukherjee et al. sub. MNRAS, arXiv:1901.01095](#))
3. **SEAGLE-III to VI** and **others:** with one pipeline it is possible to deal with multiple science questions and mock lensed images from simulations has a variety of applications.
4. Time-delay measurement is independent probe to calculate Hubble constant. A systematic and flexible pipeline (**COSMICLENS**) will be very effective in giving crucial handle to constrain it **<1% uncertainty.**

## *Take home message*

**Simulation of realistic mock Strong Lenses is a very promising tool to probe galaxy formation and H0**