

Probing Dark Matter with strong gravitational lensing

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Collaborators:

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Anna Nierenberg, Chuck Keeton, Andrew Benson**

UCLA, Apr 3rd 2018

Strong gravitational lensing

Source
unknown



Lens
unknown

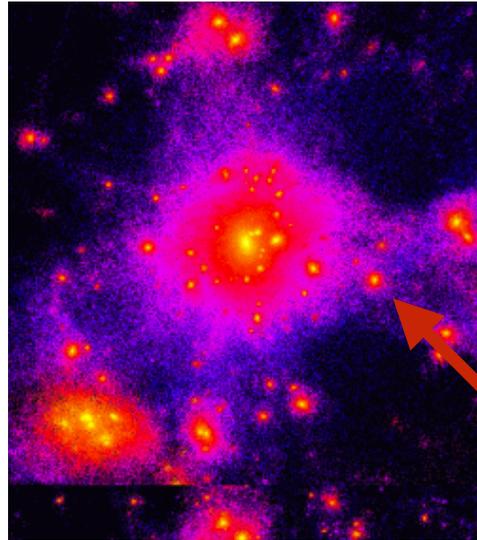
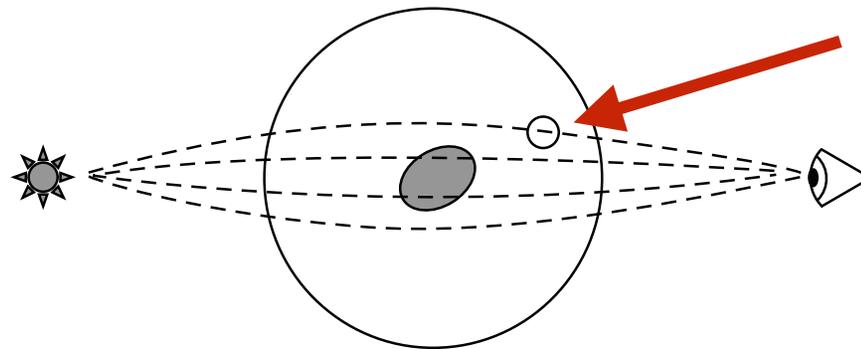


Image
data



can be dark!

Metcalfe & Madau 2001
Dalal & Kochanek 2002
Moustakas & Metcalfe (2003)
Koopmans 2005

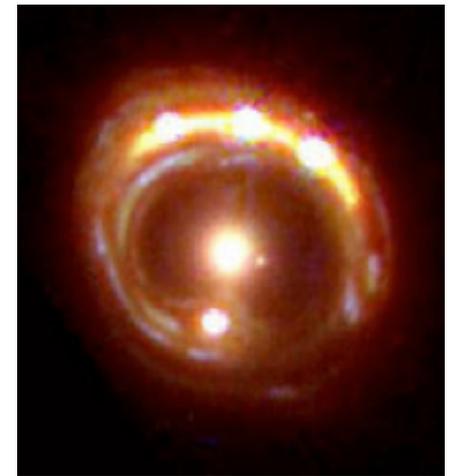
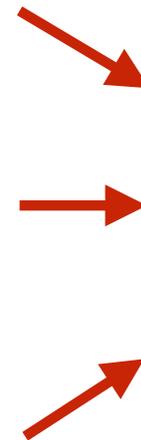
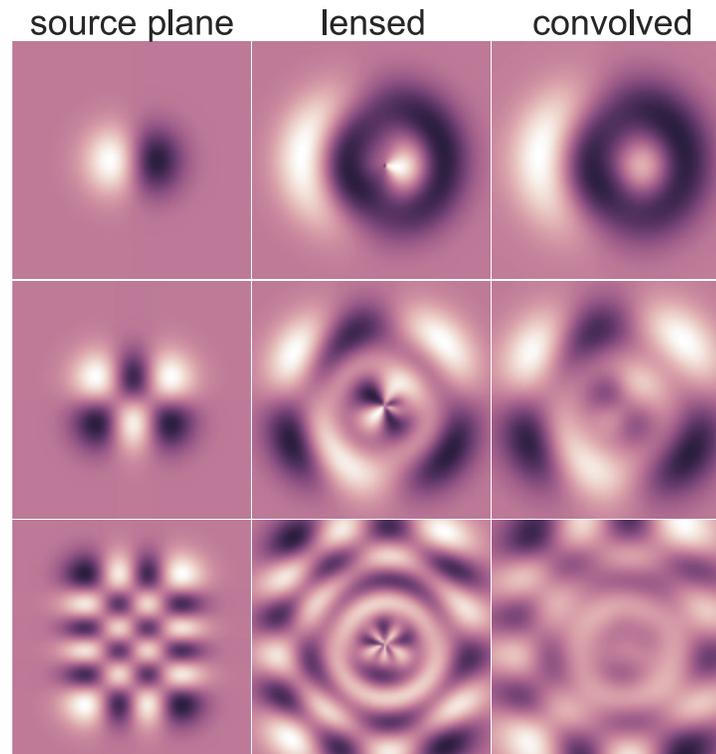
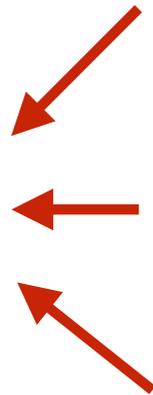
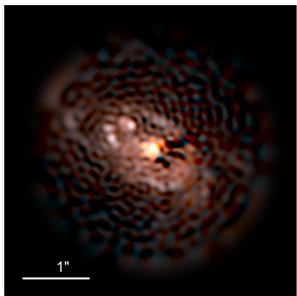
Vegetti+ 2010, 2012
Hezaveh+ 2016
Nierenberg+ 2014, 2017
Birrer+ 2017

gravitational imaging with basis sets

Requirement: **Simultaneous** reconstruction of source and lens

computational cost of linear inversion and number of non-linear parameters as limitations

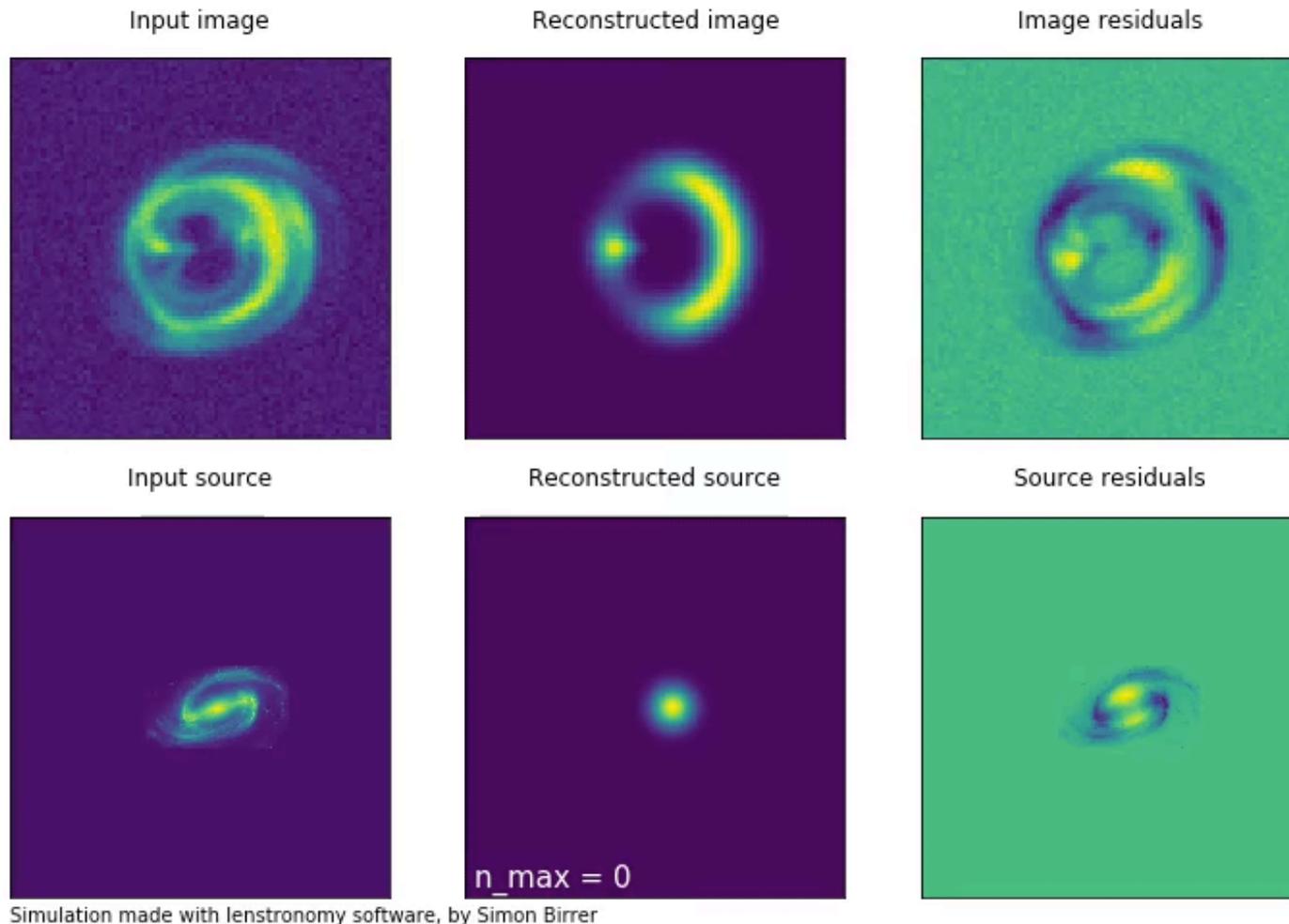
$10^5 - 10^6$
proposals required



High resolution reconstruction of source with Shapelet **basis set**

Lensing: Birrer+ 2015, 2016, 2017
Shapelets: Refregier 2003
Software: Birrer&Amara 2018

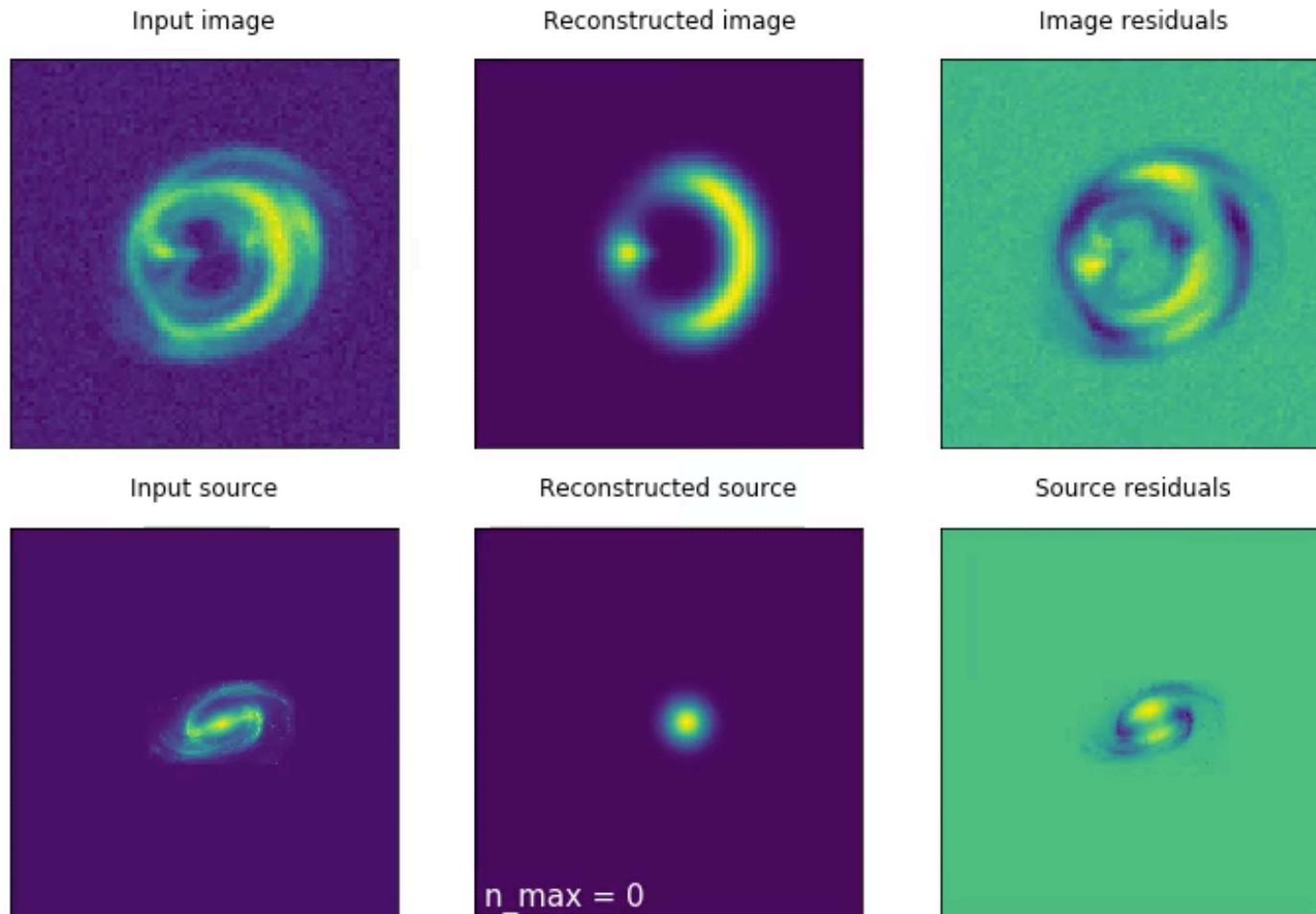
gravitational imaging: example with perfect lens model



software available: `$pip install lenstronomy`
<https://github.com/sibirrer/lenstronomy>

Lensing: Birrer+ 2015, 2016, 2017
Shapelets: Refregier 2003
Software: Birrer&Amara 2018

gravitational imaging: example with missing substructure



Simulation made with lenstronomy software, by Simon Birrer

software available: `$pip install lenstronomy`
<https://github.com/sibirrer/lenstronomy>

Lensing: Birrer+ 2015, 2016, 2017
Shapelets: Refregier 2003
Software: Birrer&Amara 2018

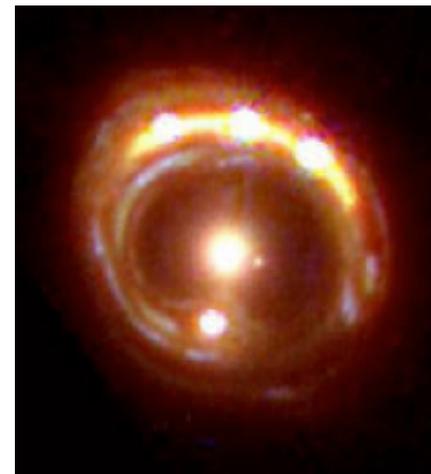
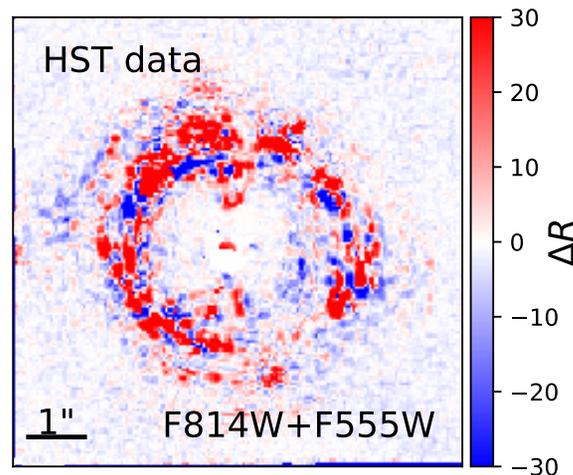
statistical analysis of gravitational imaging

Extract **statistical features** attributed to substructure

Can probe substructure at the **sensitivity limit**

smooth preferred

clump preferred

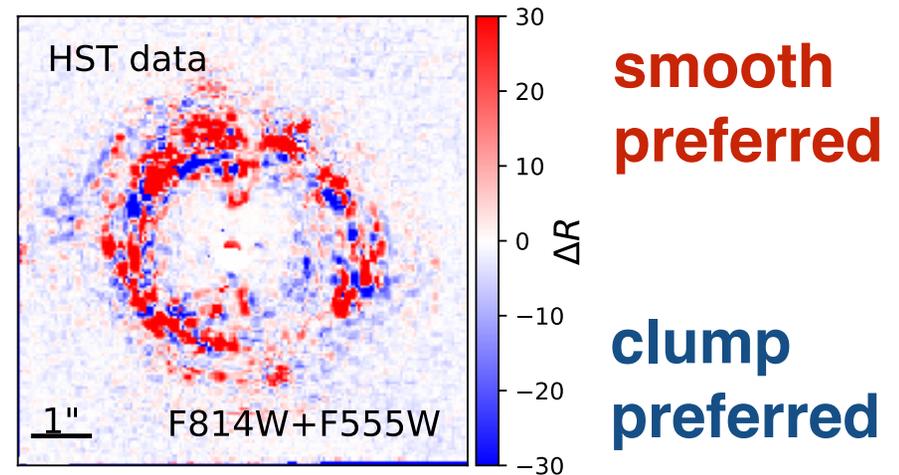
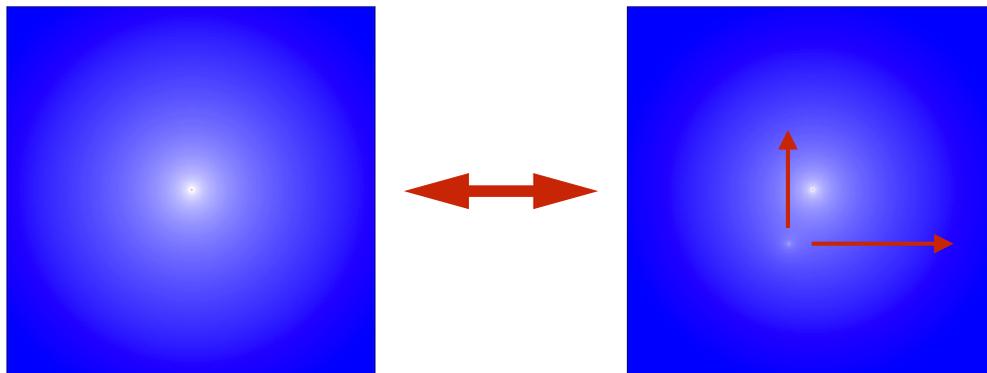
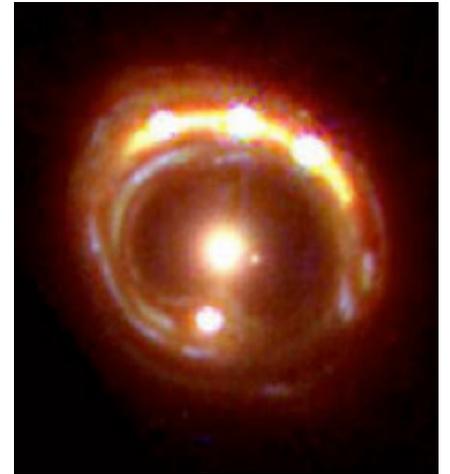


Interpretation of features relies on **simulations**

does **not rely** on assumption on **number** and **shape** of sub-clumps

statistical analysis of gravitational imaging

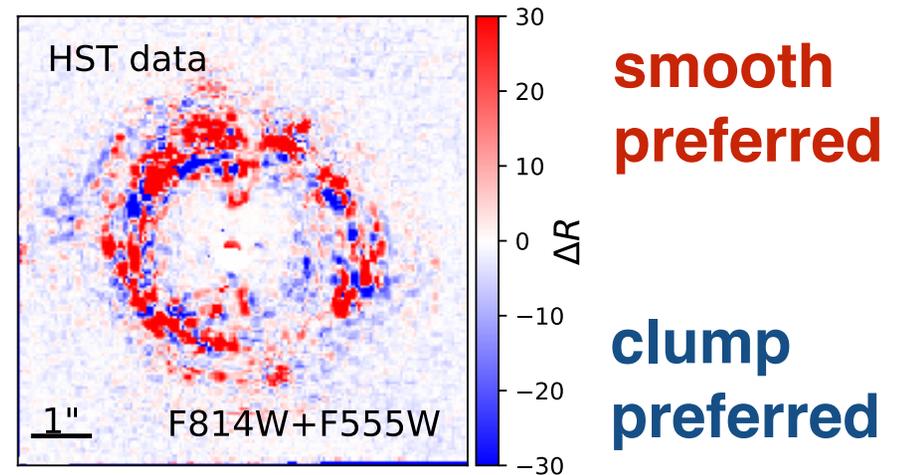
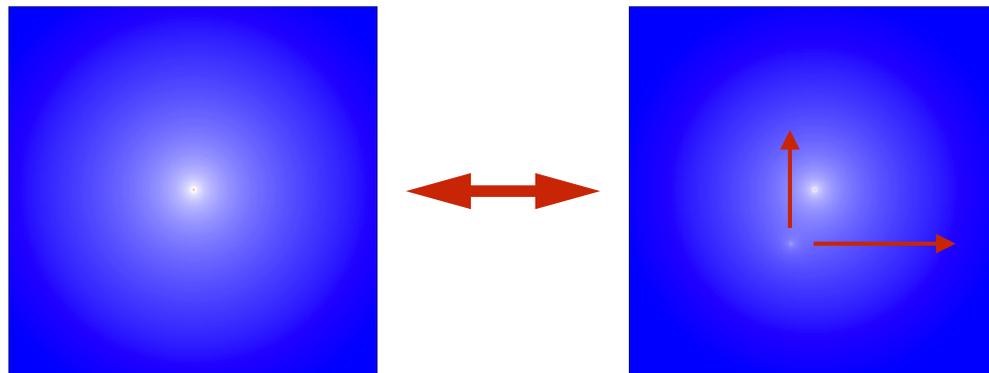
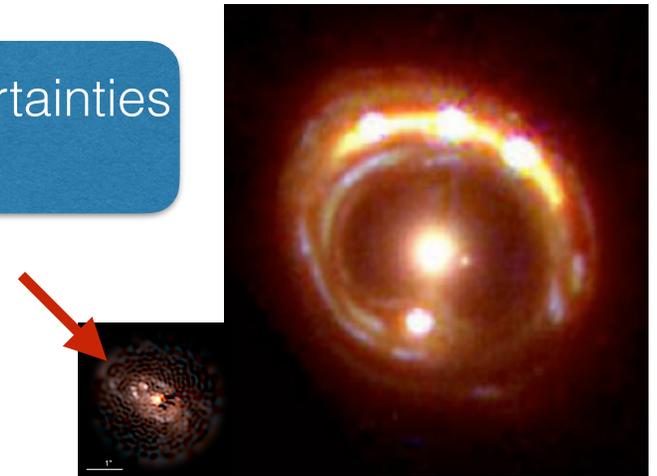
Extract local deflection anomalies by a substructure **scanning process**



statistical analysis of gravitational imaging

control for limitations and uncertainties in the **source reconstruction**

Extract local deflection anomalies by a substructure **scanning process**



Dark Matter thermal relic mass constraints from lensing substructure

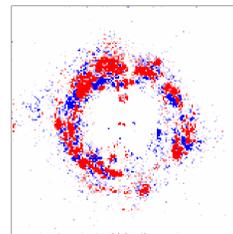
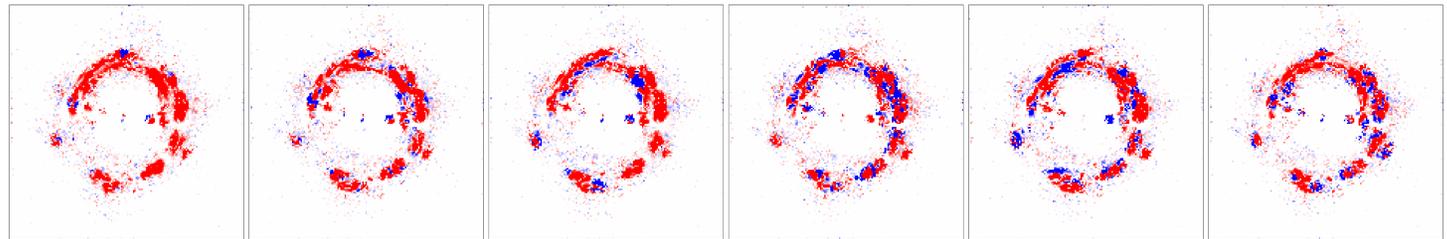
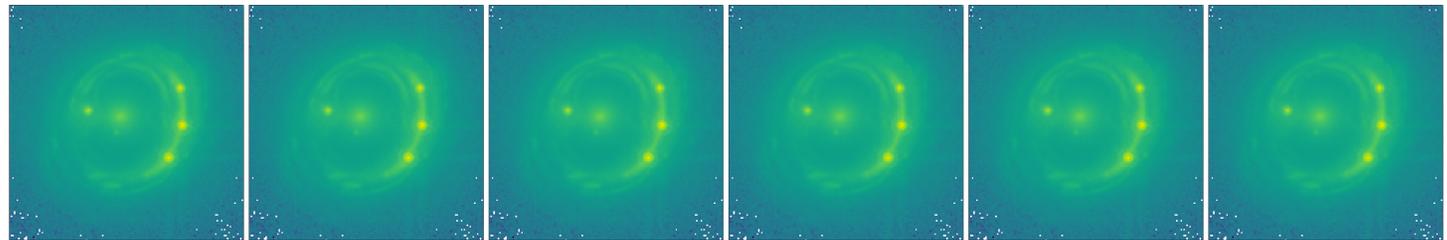
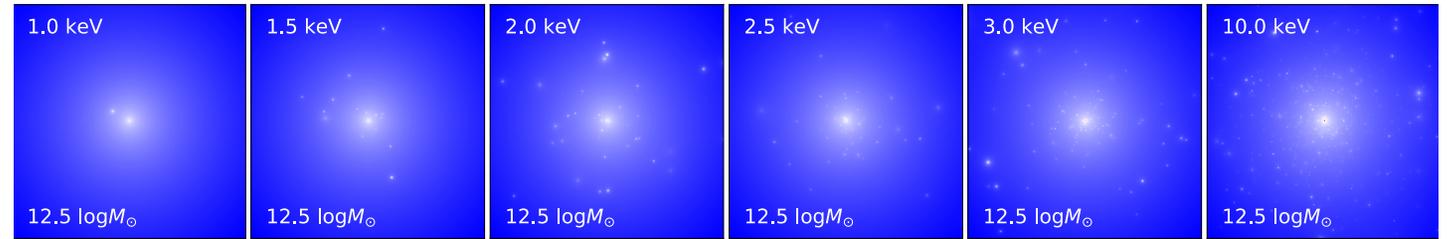
Turn a physical model stochastically into **simulated data**



look for the **same features** in your simulated data

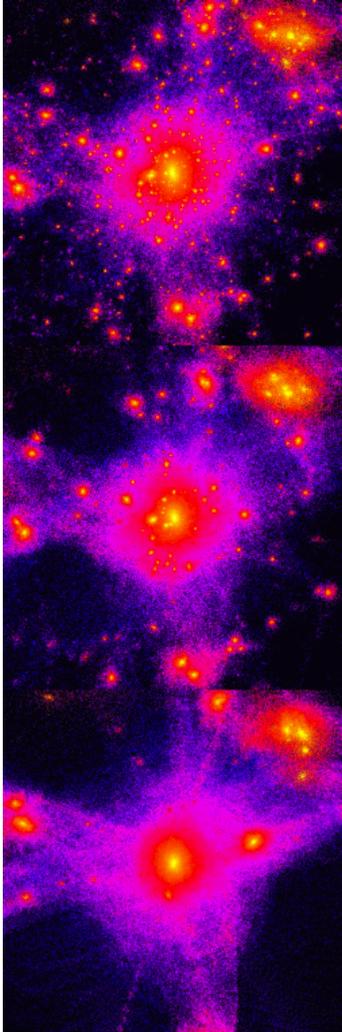


Accept/reject simulations based on **summary statistics**

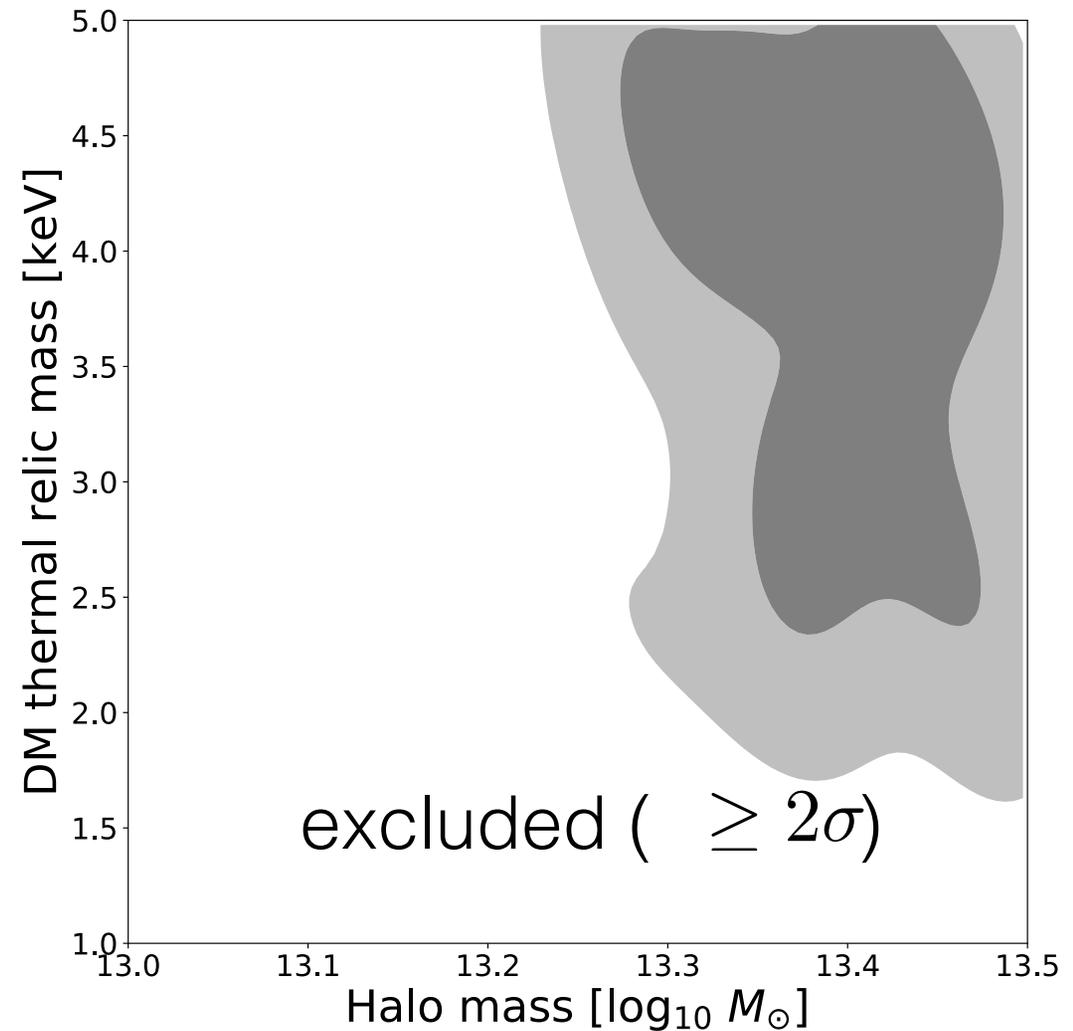
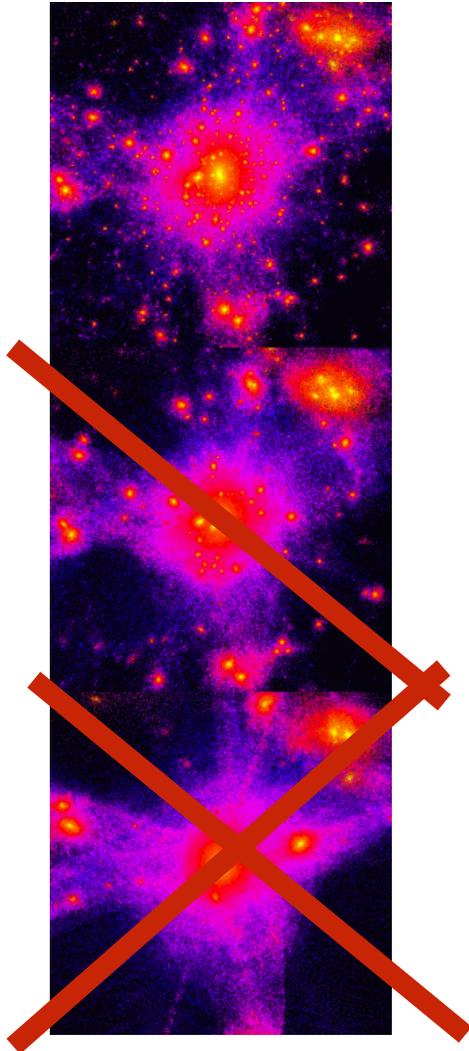


Approximate Bayesian Computing (ABC)

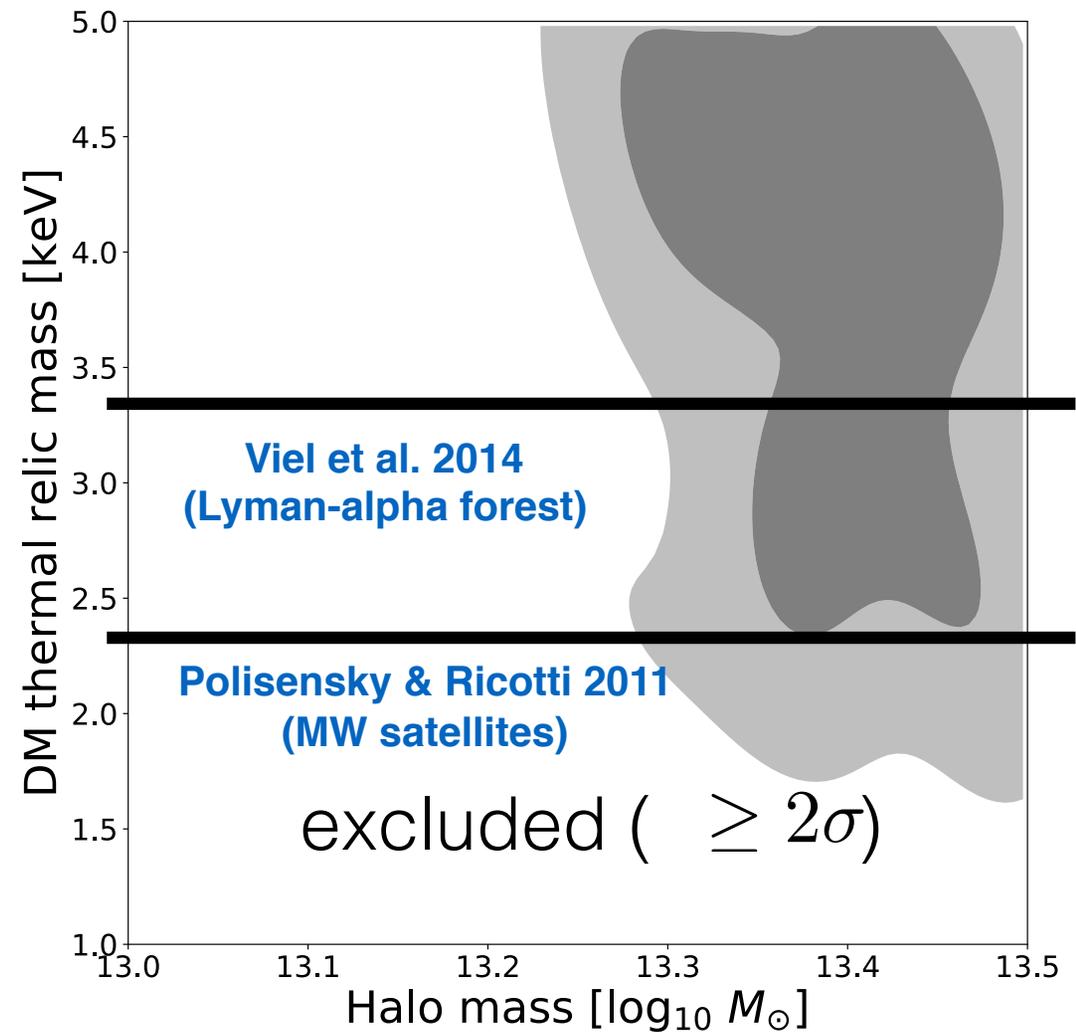
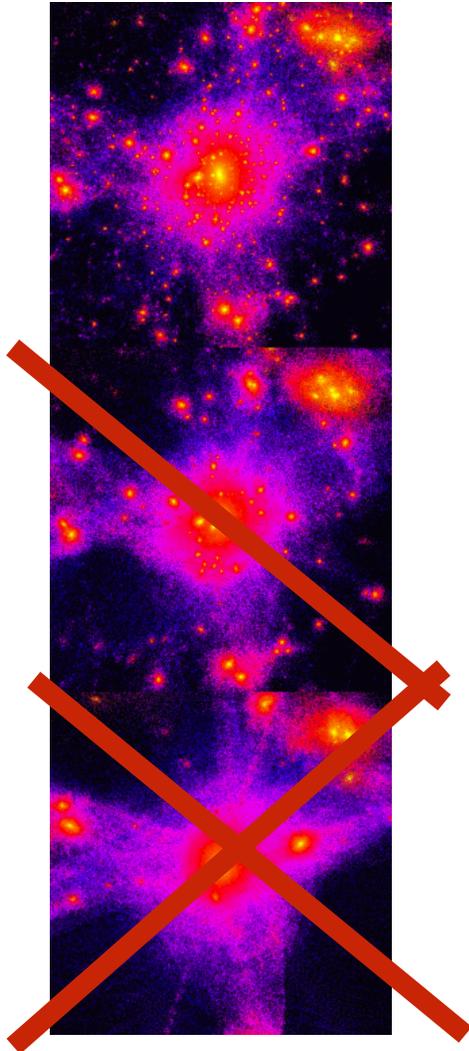
Dark Matter thermal relic mass constraints from lensing substructure



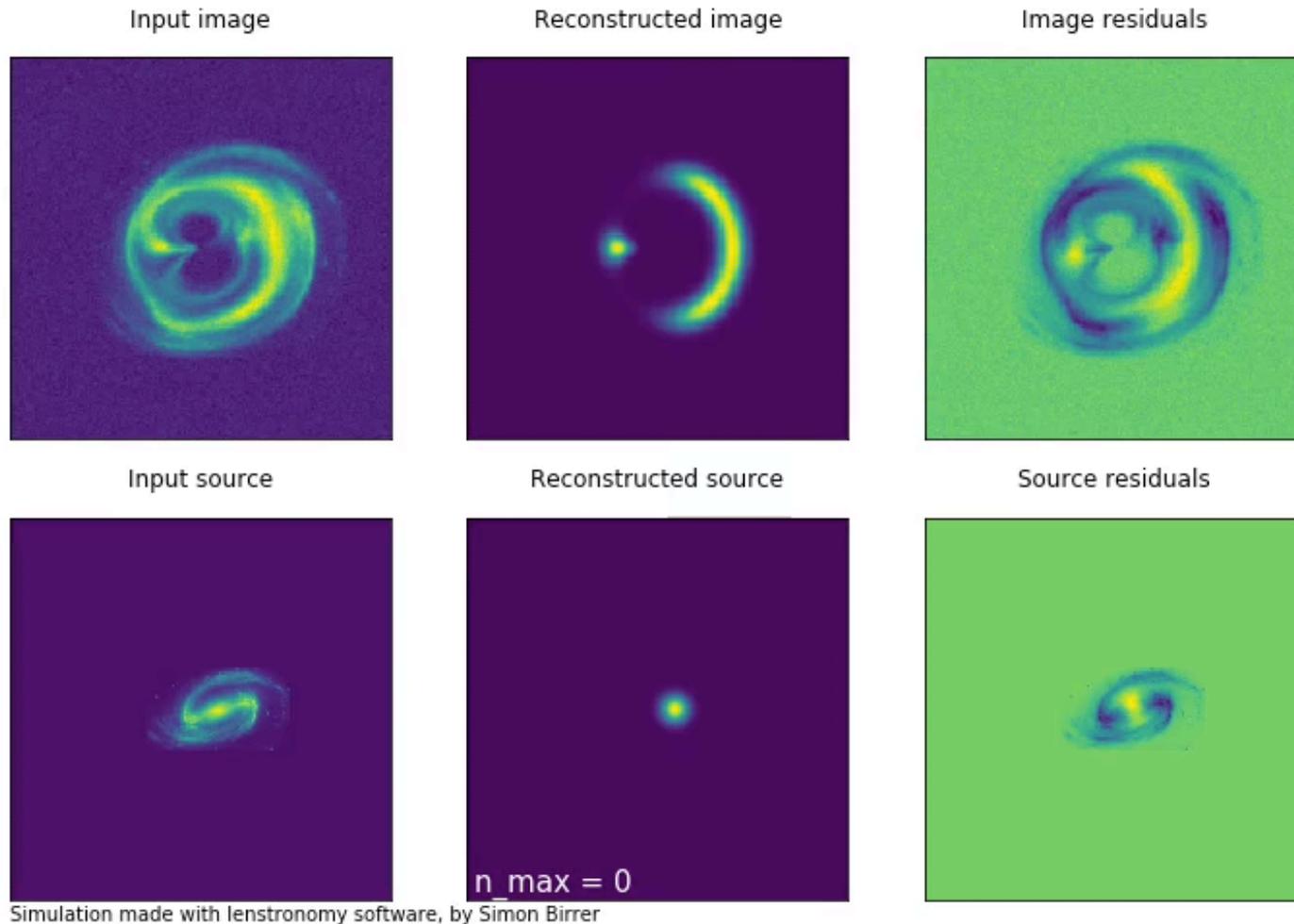
Dark Matter thermal relic mass constraints from lensing substructure



Dark Matter thermal relic mass constraints from lensing substructure



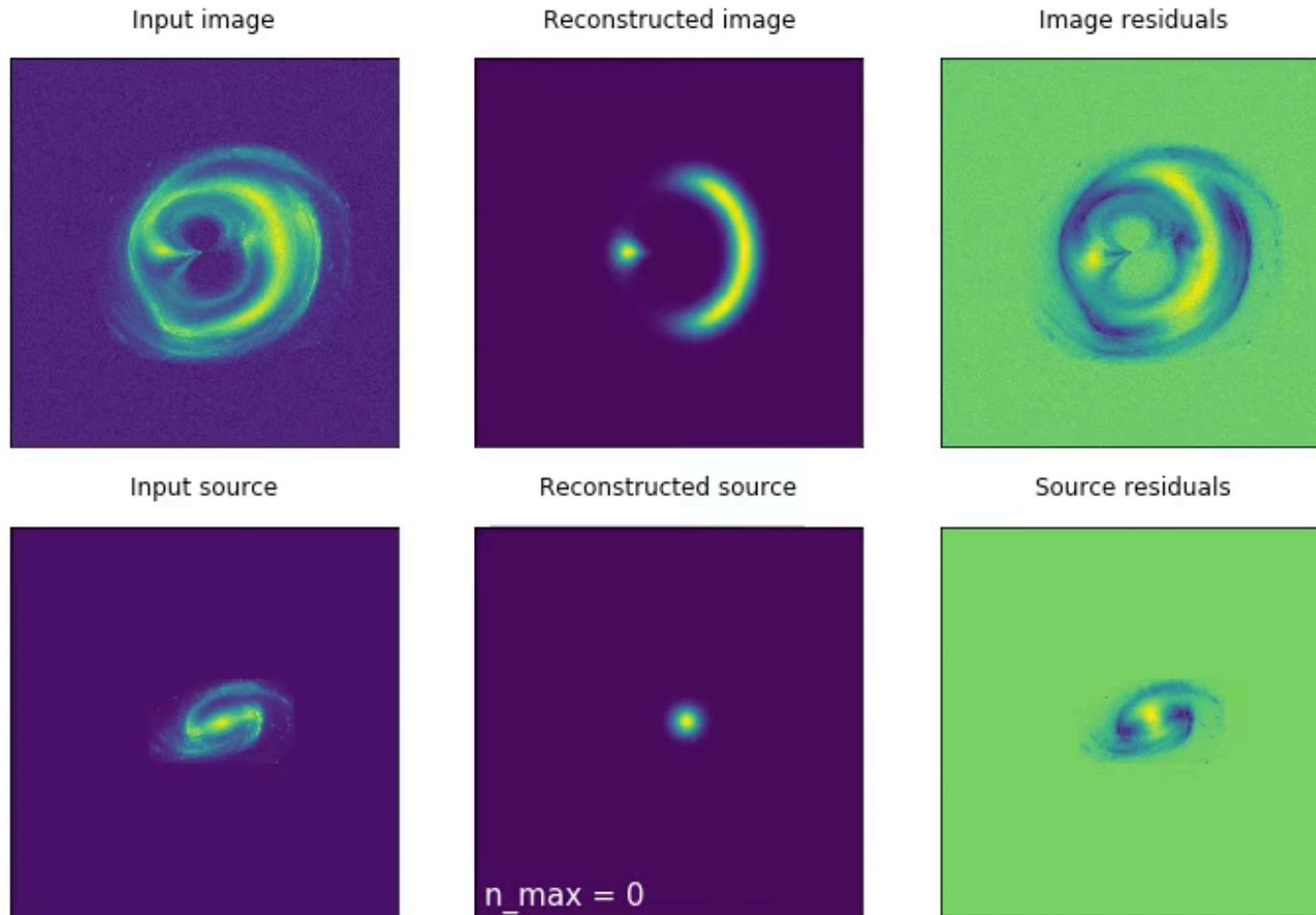
gravitational imaging in the ELT era



software available: `$pip install lenstronomy`
<https://github.com/sibirrer/lenstronomy>

FWHM 0.05"

gravitational imaging in the ELT era



Simulation made with lenstronomy software, by Simon Birrer

software available: `$pip install lenstronomy`
<https://github.com/sibirrer/lenstronomy>

FWHM 0.02"

The challenges

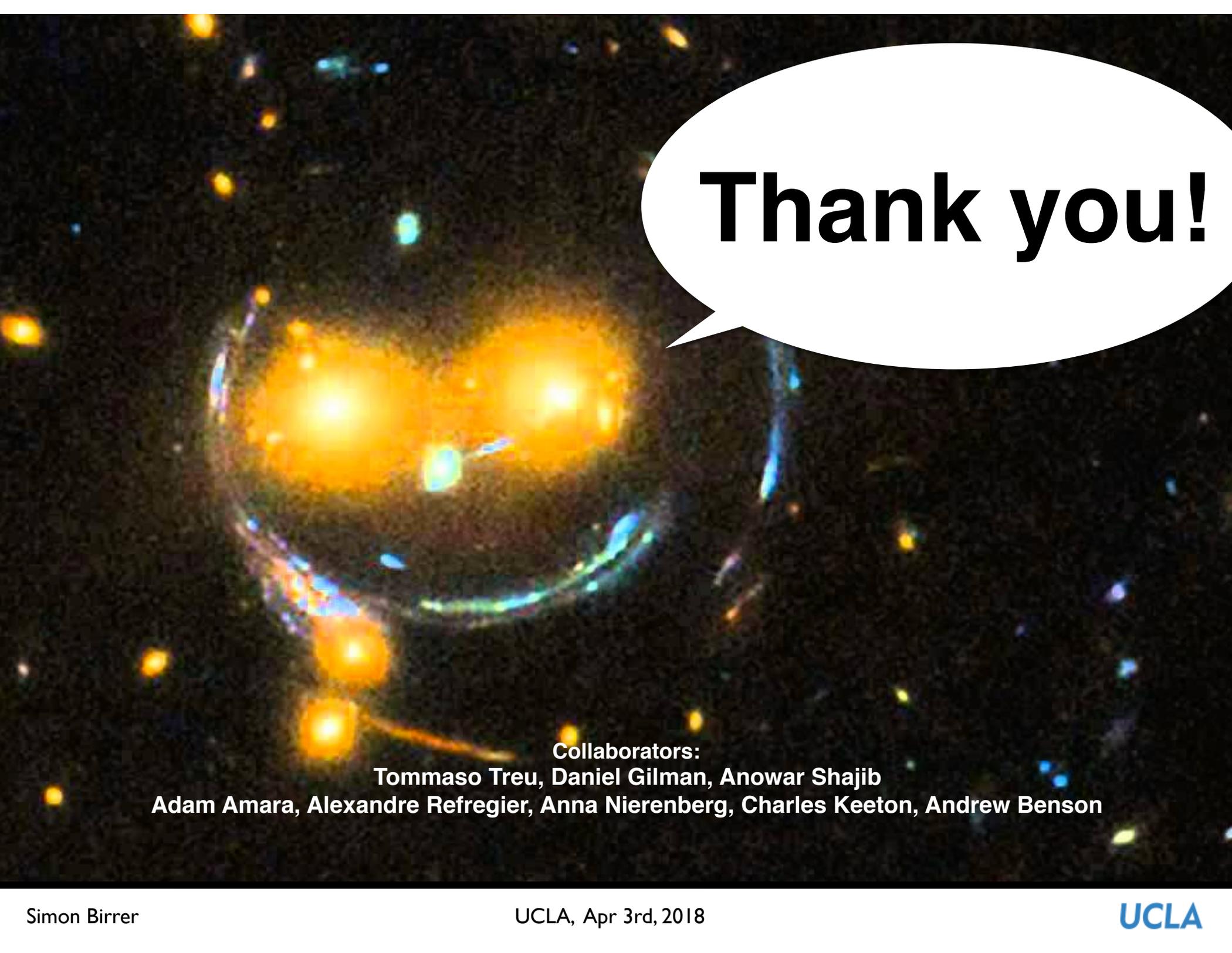
- line-of-sight contributions: *field halos in projection, non-linear lensing effects* e.g. [Despali+ 2017, ...](#), [Gilman, Birrer + in prep](#)
- luminous (sub) structure: *globular clusters, stellar discs, ..* e.g. [Gilman+ 2017](#), [Huesh+ 2016](#), ...
- precise predictions of (sub) halo properties: *dynamical friction, tidal stripping, resolution limit, computational cost, baryonic physics, ...* e.g. [talk of James Bullock, ...](#)

Data requirements

- imagine resolution optical/NIR imaging capabilities: *e.g. extreme AO on 30 meter class ground based telescope*
- **stability**: *we need to understand (and model) the data on the pixel level (incl. PSF and noise properties)*

Summary

- **Statistical constraints excludes a thermal relic mass < 2 keV to 2 sigma confidence level, based on one single lens of HST data**
- **Modelling and inference methods are in place. Software is publicly available**
- **Sample of high quality HST data is vastly increasing**
- **Enables joint constraints with flux ratio statistics**
- **ELT's with good and stable AO performance opens exciting discovery space**



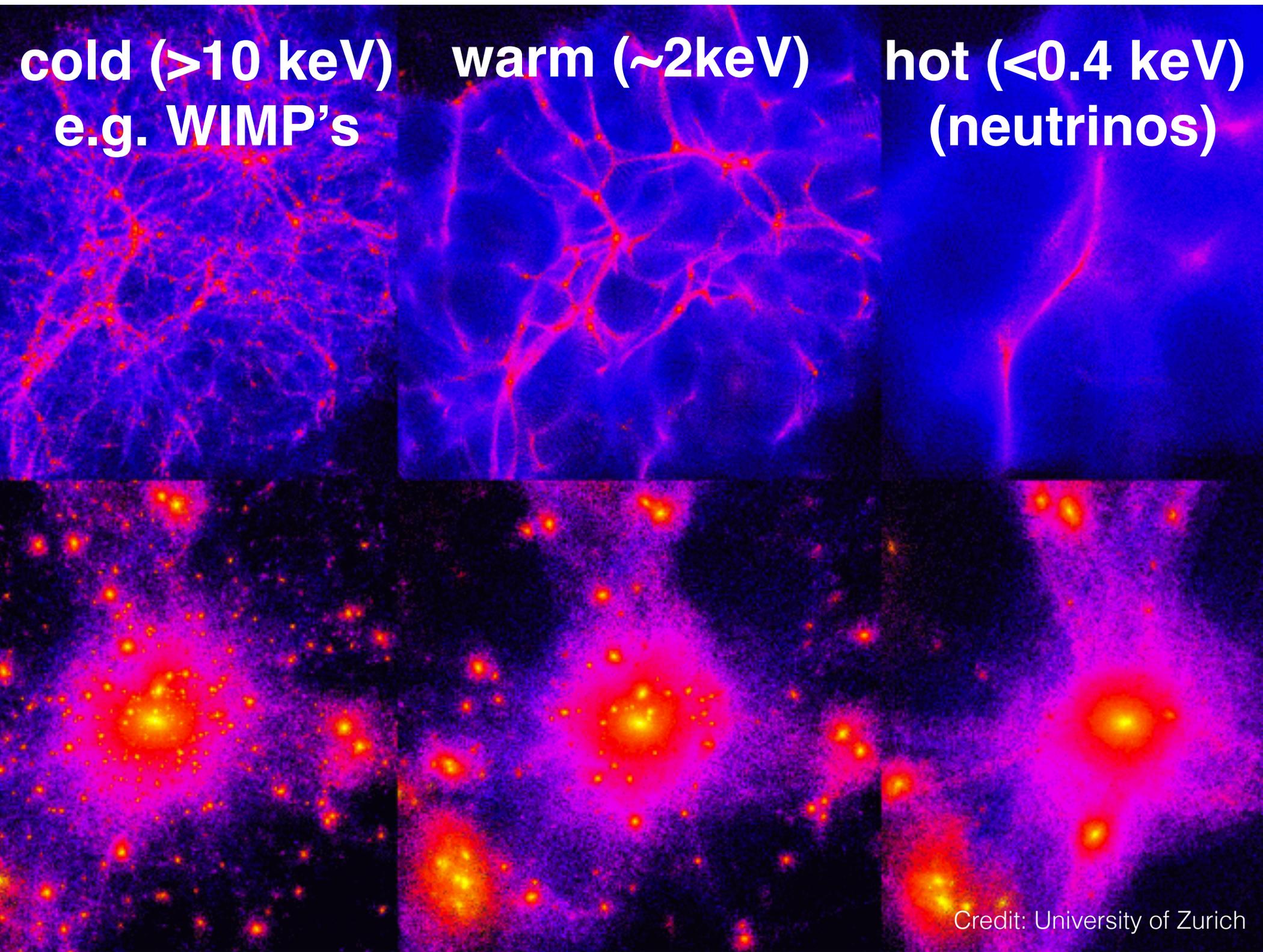
Thank you!

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**cold (>10 keV)
e.g. WIMP's**

warm (~ 2 keV)

**hot (<0.4 keV)
(neutrinos)**



Strong gravitational lensing

Observables:
image positions + time delays

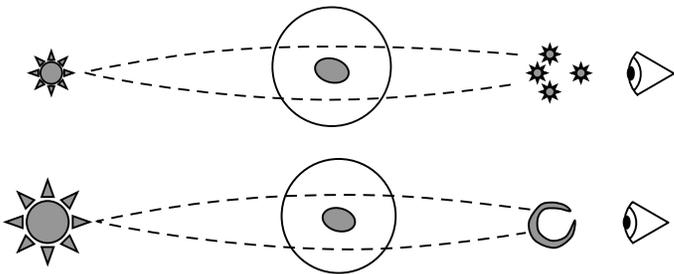
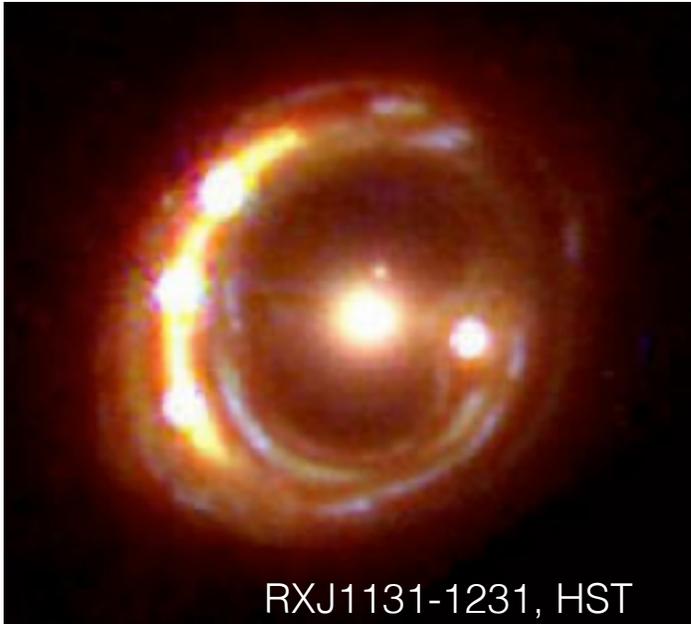
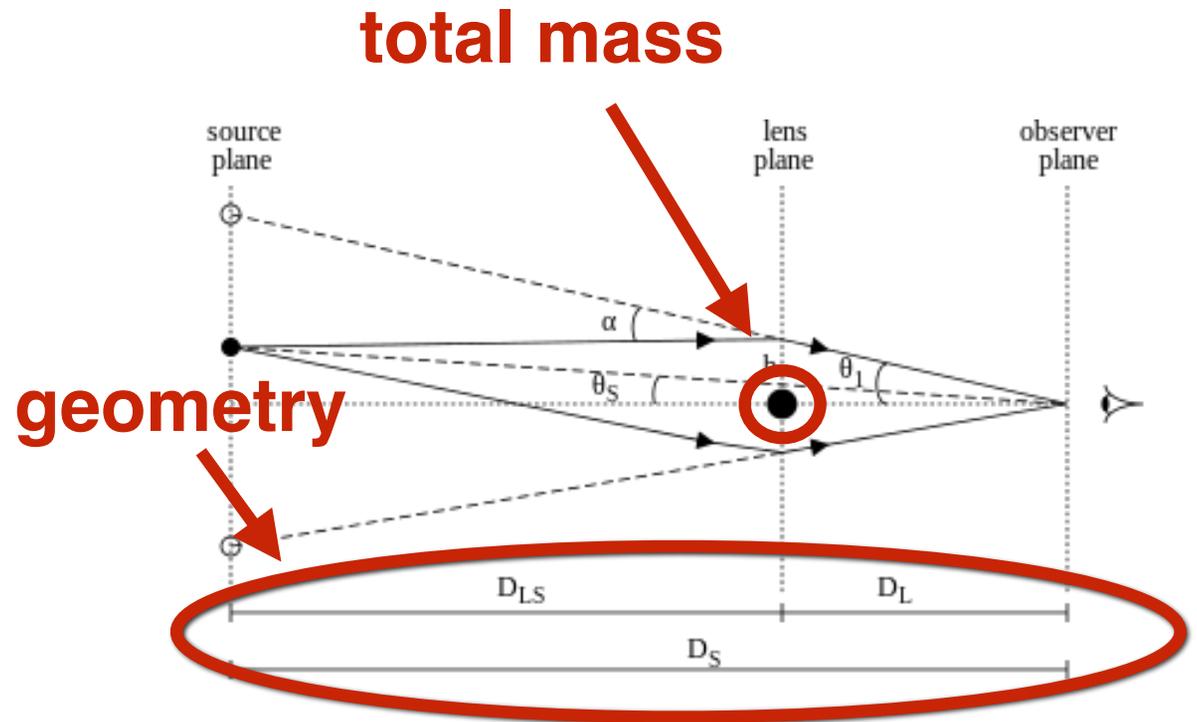
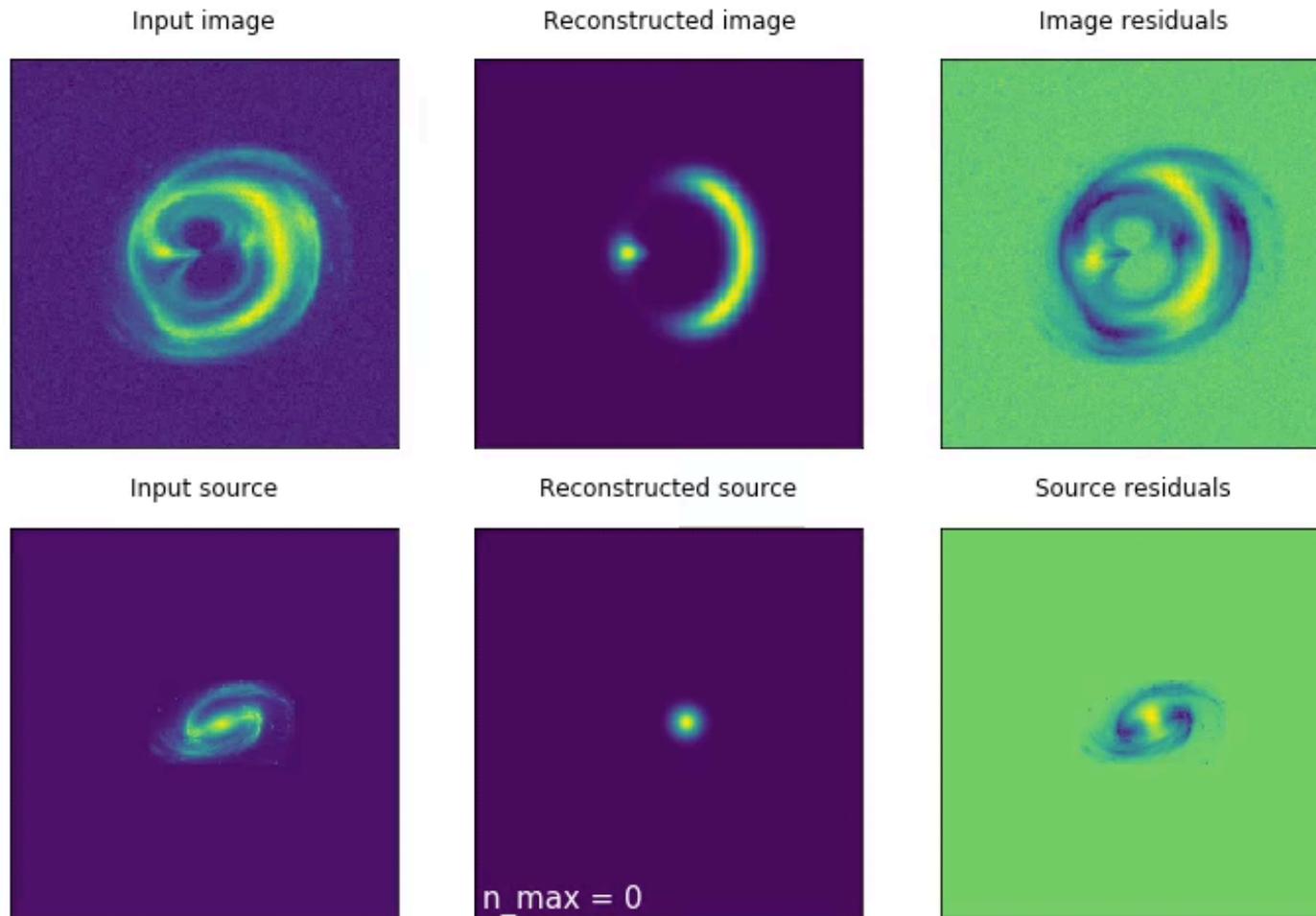


Illustration: Zachrisson & Riehe 2009



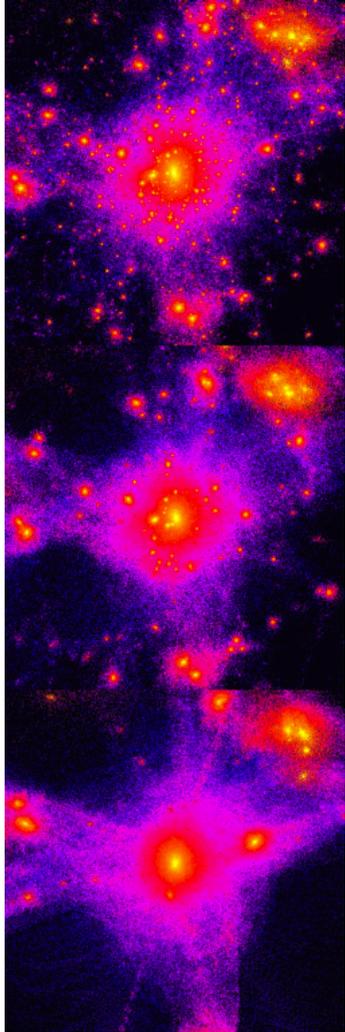
gravitational imaging in the ELT era



Simulation made with lenstronomy software, by Simon Birrer

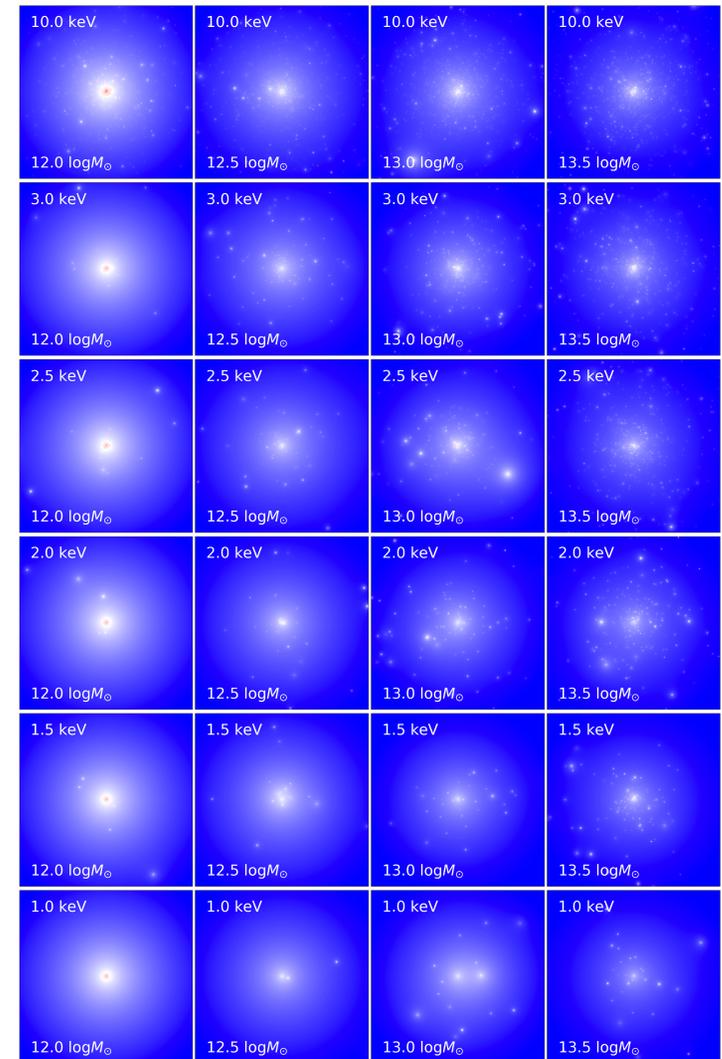
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statistical analysis of gravitational imaging



compare with **simulations**
of different DM models

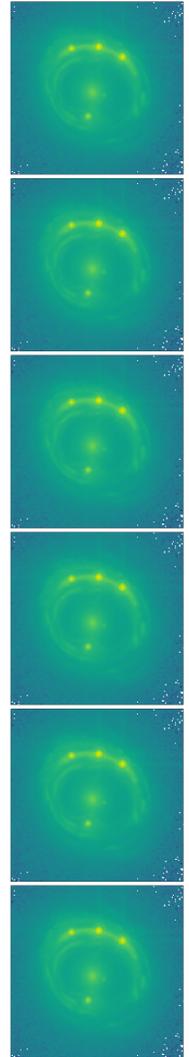
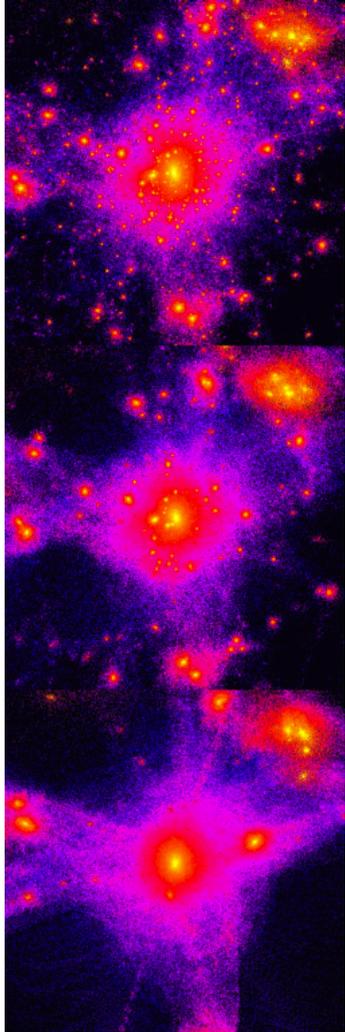
- power-spectra based
- merger tree tuned to simulations
- disruption description tuned to simulations
- radial distribution based on infall trajectories tuned to simulations



Dark Matter thermal relic mass constraints from lensing substructure

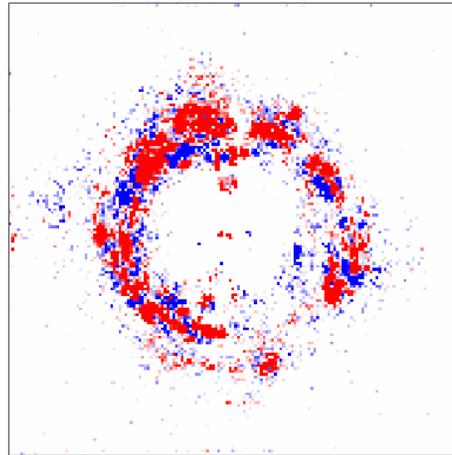
Turn simulations into images

- **same** macro-model
- **same** source surface brightness
- **same** noise and PSF as data
- **different** small scale lens model



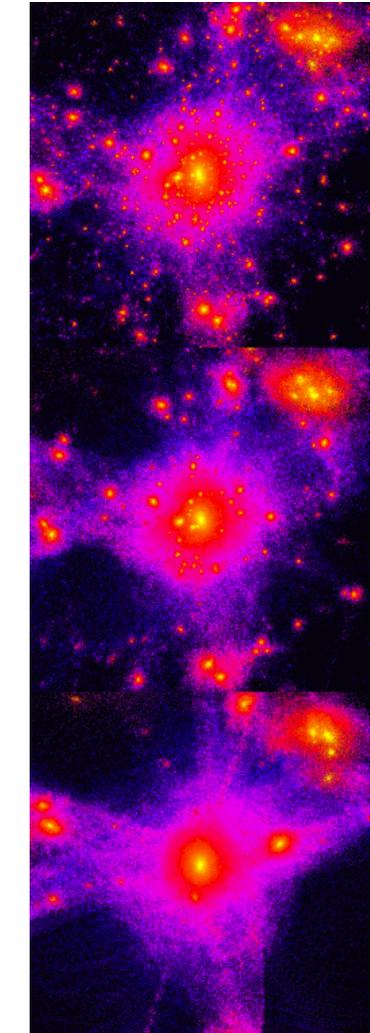
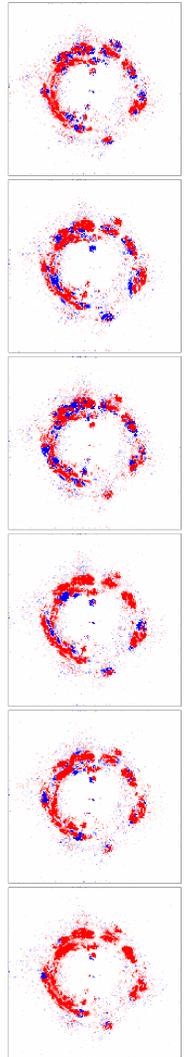
Dark Matter thermal relic mass constraints from lensing substructure

Perform a sub-clump scanning procedure



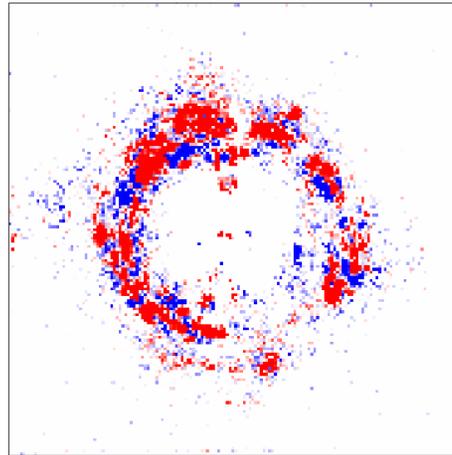
smooth preferred

clump preferred



Dark Matter thermal relic mass constraints from lensing substructure

Accept/reject simulations based on summary statistics



smooth preferred

clump preferred

