



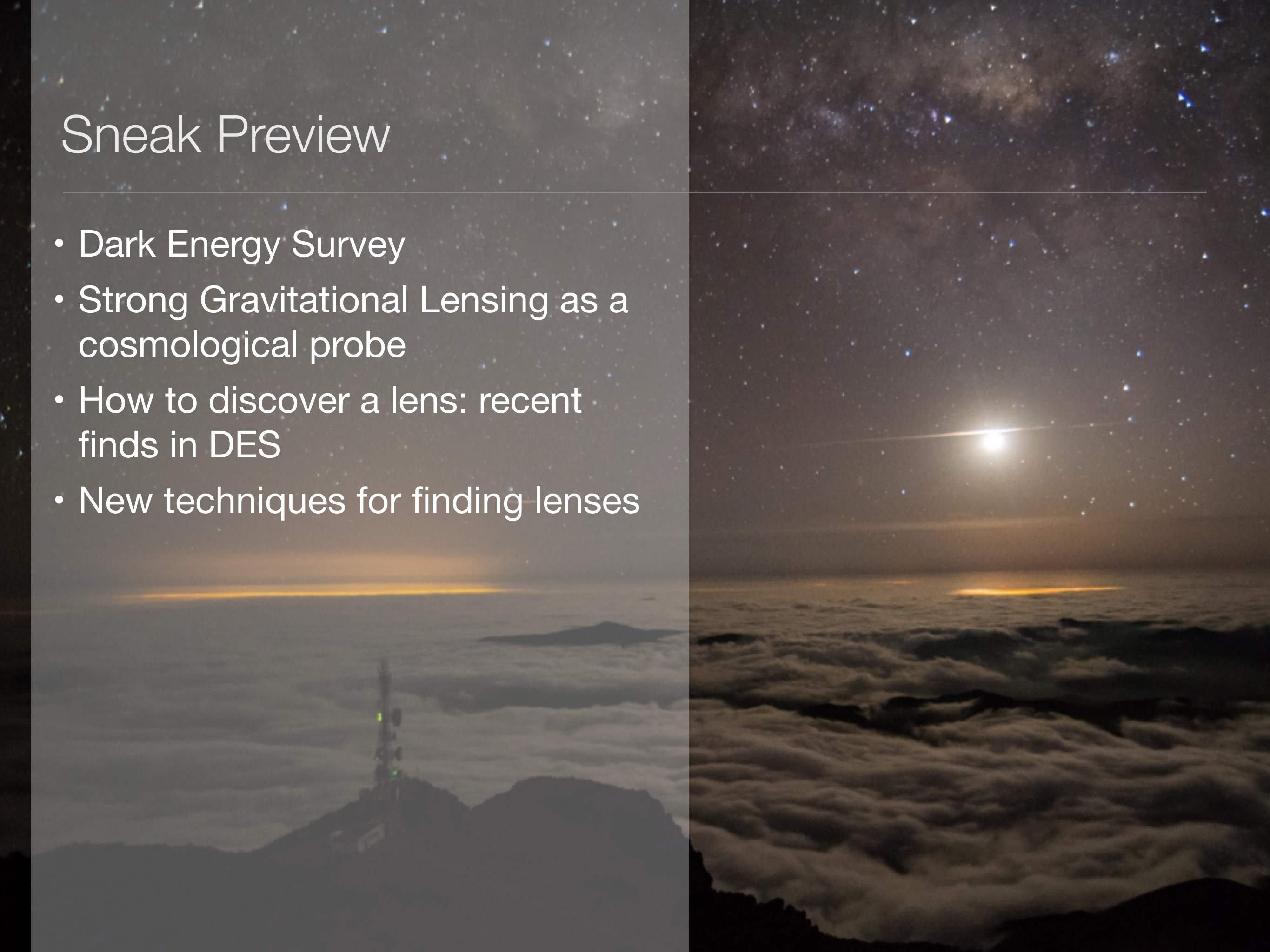
Strong Gravitational Lensing in the **D**ark **E**nergy **S**urvey

New Discoveries and Search Techniques

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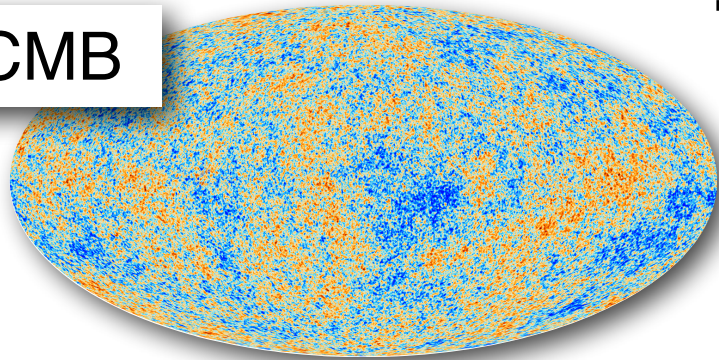
Sneak Preview

- Dark Energy Survey
- Strong Gravitational Lensing as a cosmological probe
- How to discover a lens: recent finds in DES
- New techniques for finding lenses

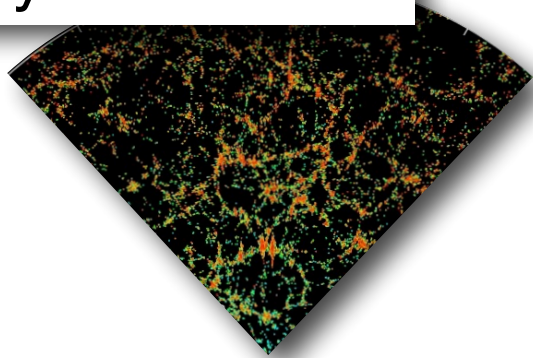


A Tug of War: Complementary Probes

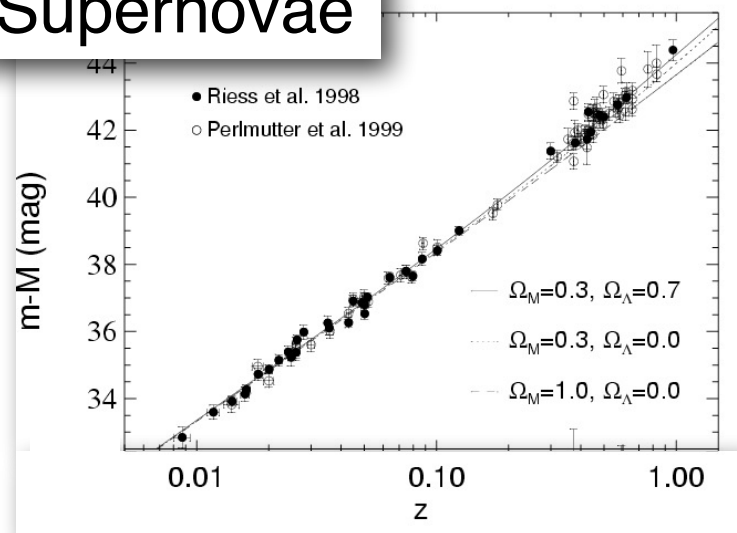
CMB



Galaxy Distribution



Supernovae



Geometry
+
Structure
Growth
+
Expansion

Dark Energy
70%

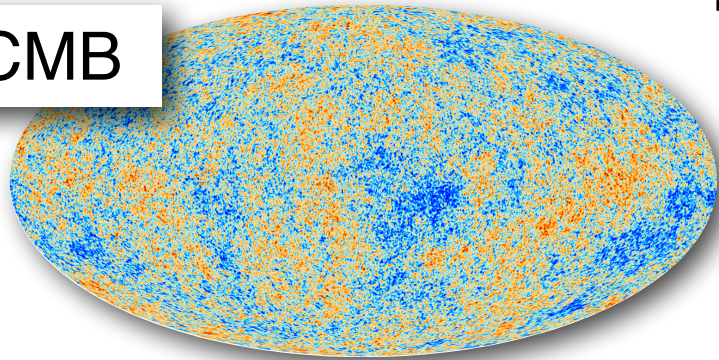


Baryons
5%

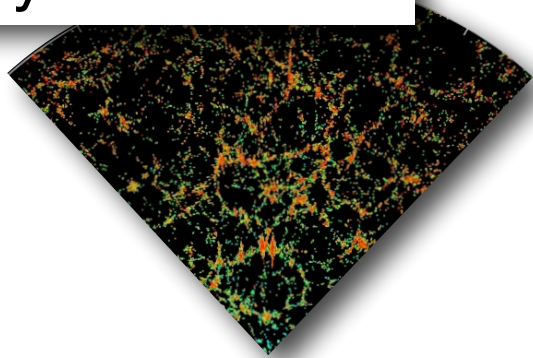
Dark Matter
25%

A Tug of War: Complementary Probes

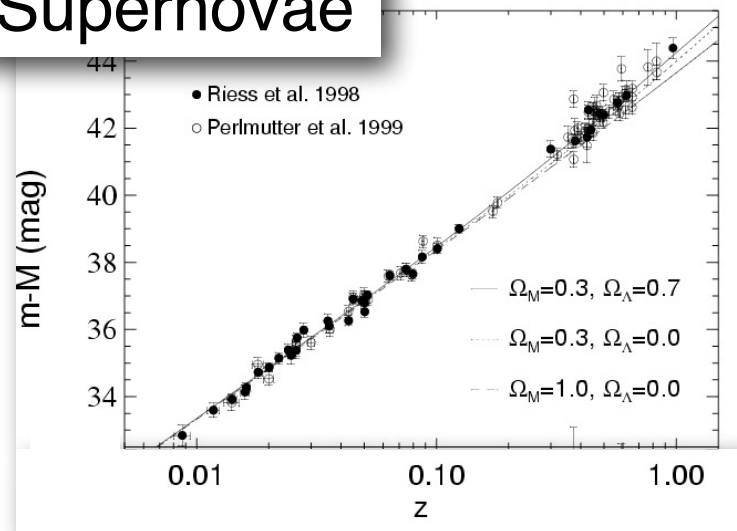
CMB



Galaxy Distribution



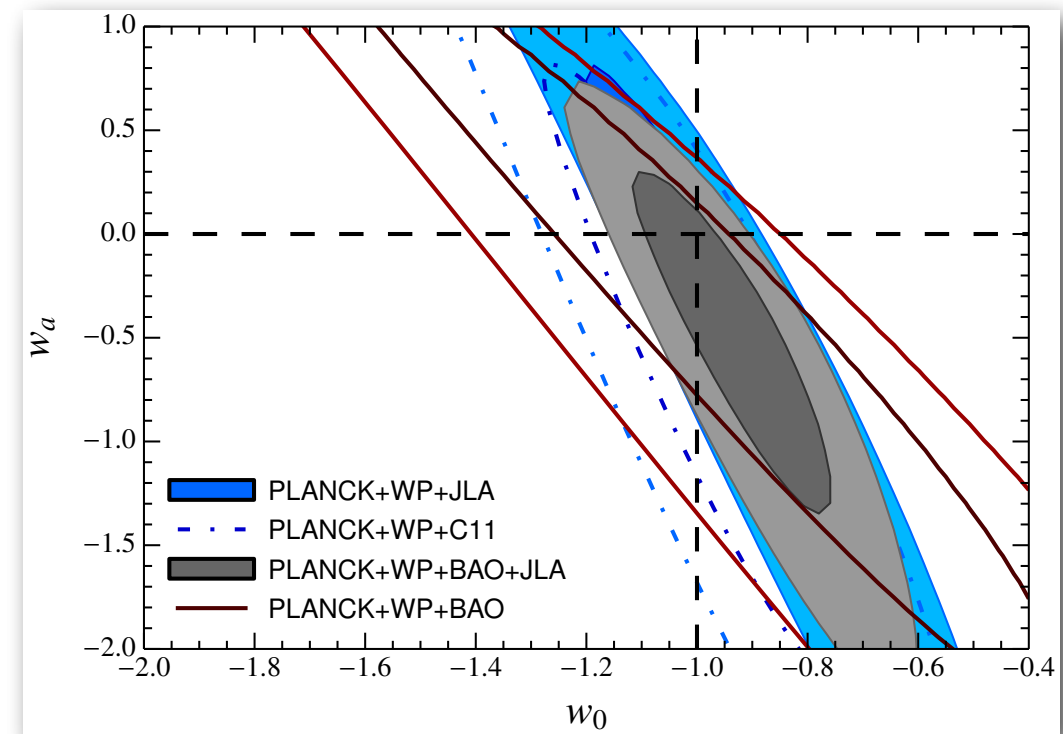
Supernovae



Geometry
+
Structure
Growth
+
Expansion

Evolving DE equation of state:

$$w(a) = w_0 + (1 - a)w_a$$



State of the art constraints:

$$w_0 = -0.957 \pm 0.124 \quad (\sim 13\%)$$

$$w_a = -0.336 \pm 0.552 \quad (\sim 164\%)$$

Betoule++2014

Expansion and Structure Growth

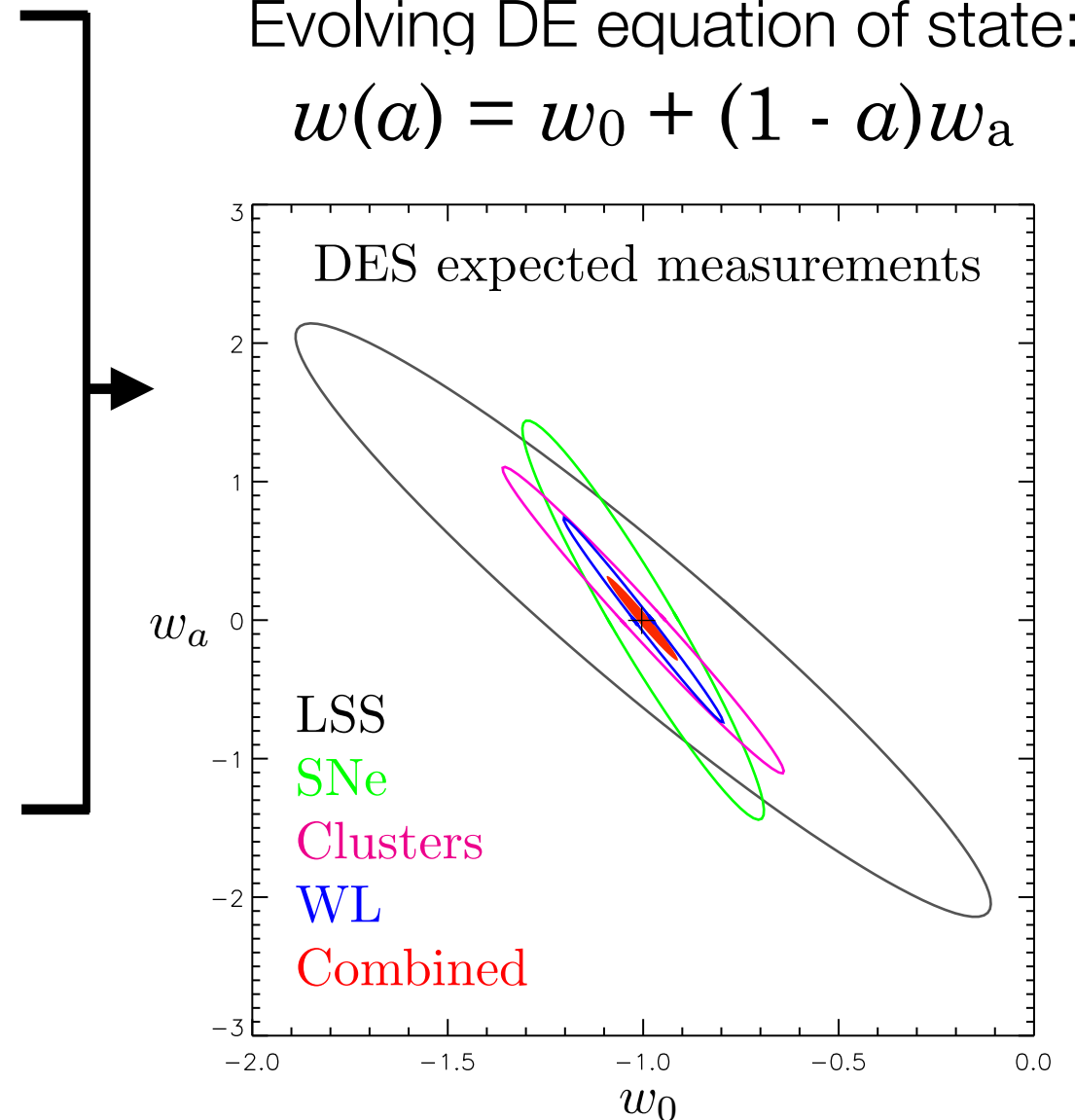
Multiple Probes, One Experiment



- **Weak Lensing:** (*structure*)
 - 200 million galaxy shapes
- **Supernovae:** (*expansion*)
 - ~3000 well-sampled SNe Ia to $z \sim 1$
- **Galaxy Clusters:** (*structure*)
 - ~10,000s clusters to $z > 1$
- **Large-scale galaxy distribution:** (*expansion*)
 - 300 million galaxies to $z > 1$
- **Strong Lensing:** (*structure and expansion*)
 - ~2,000 galaxy-/cluster-scale lenses
- *As the size lens populations increases and diversifies, strong lensing has the potential to provide important complementary cosmological constraints.*

Evolving DE equation of state:

$$w(a) = w_0 + (1 - a)w_a$$

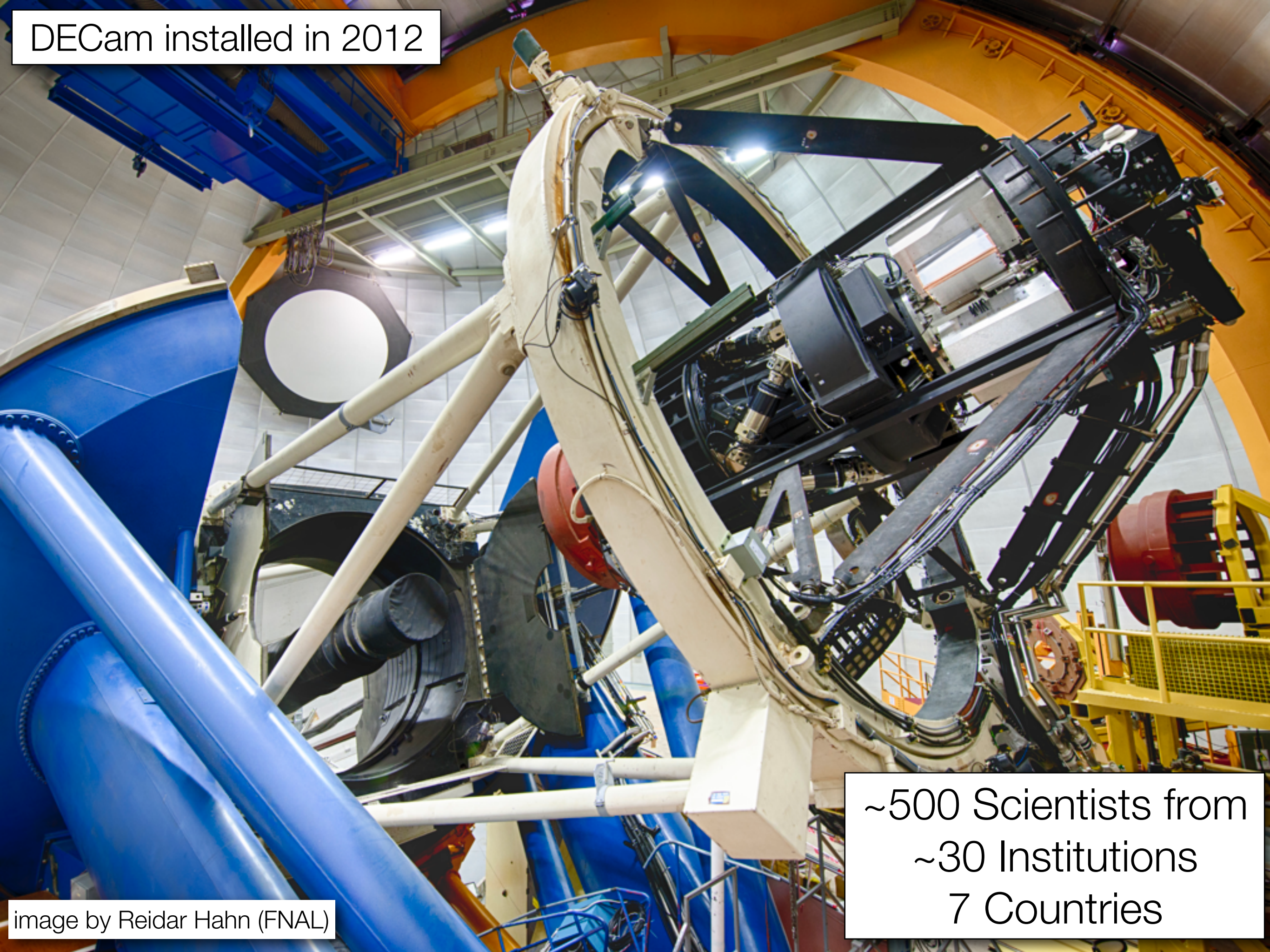


Predicted DES Constraints:

w_0 to ~5%

w_a to ~30%

DECam installed in 2012

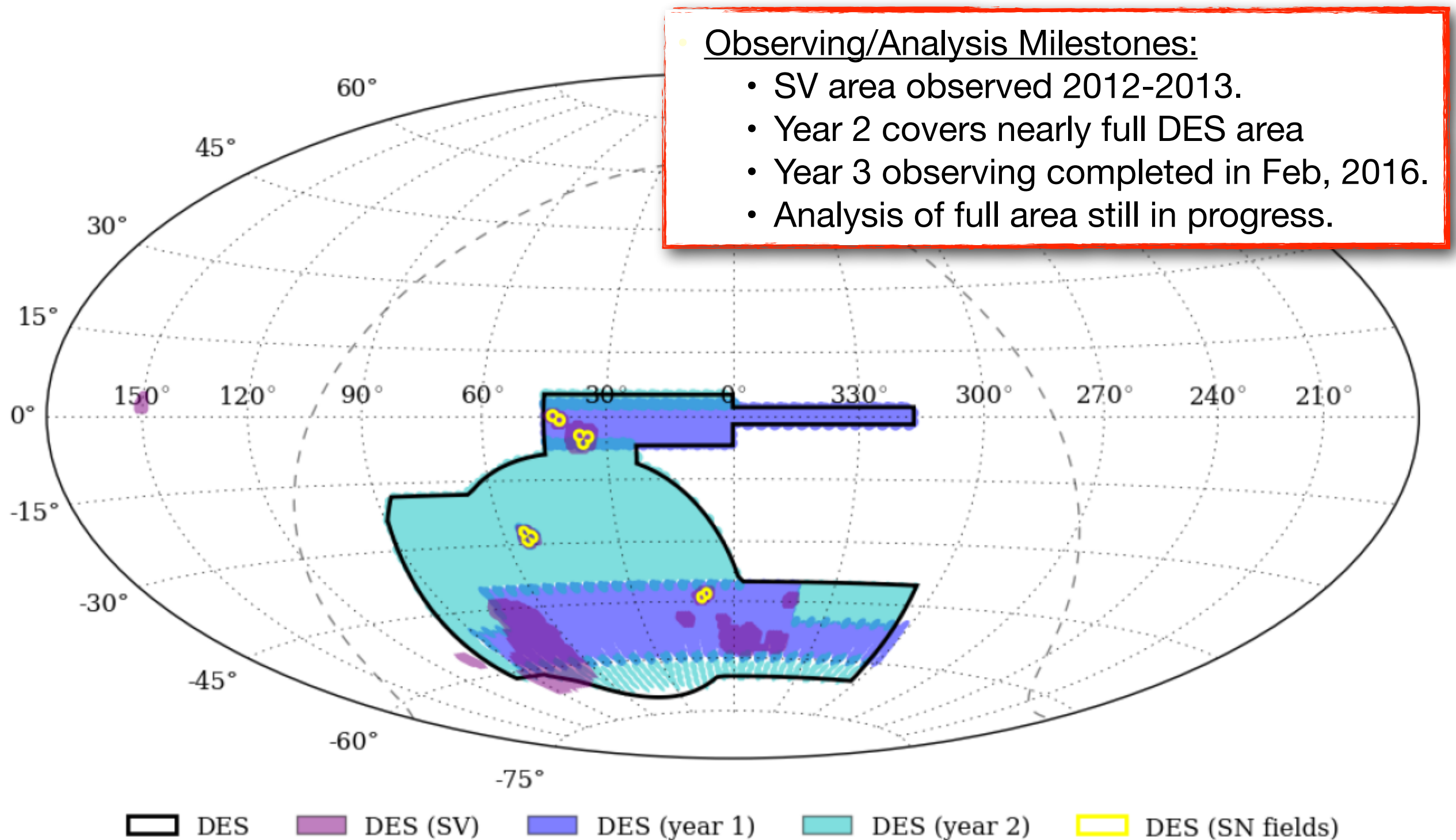


~500 Scientists from
~30 Institutions
7 Countries

image by Reidar Hahn (FNAL)

Survey Footprint

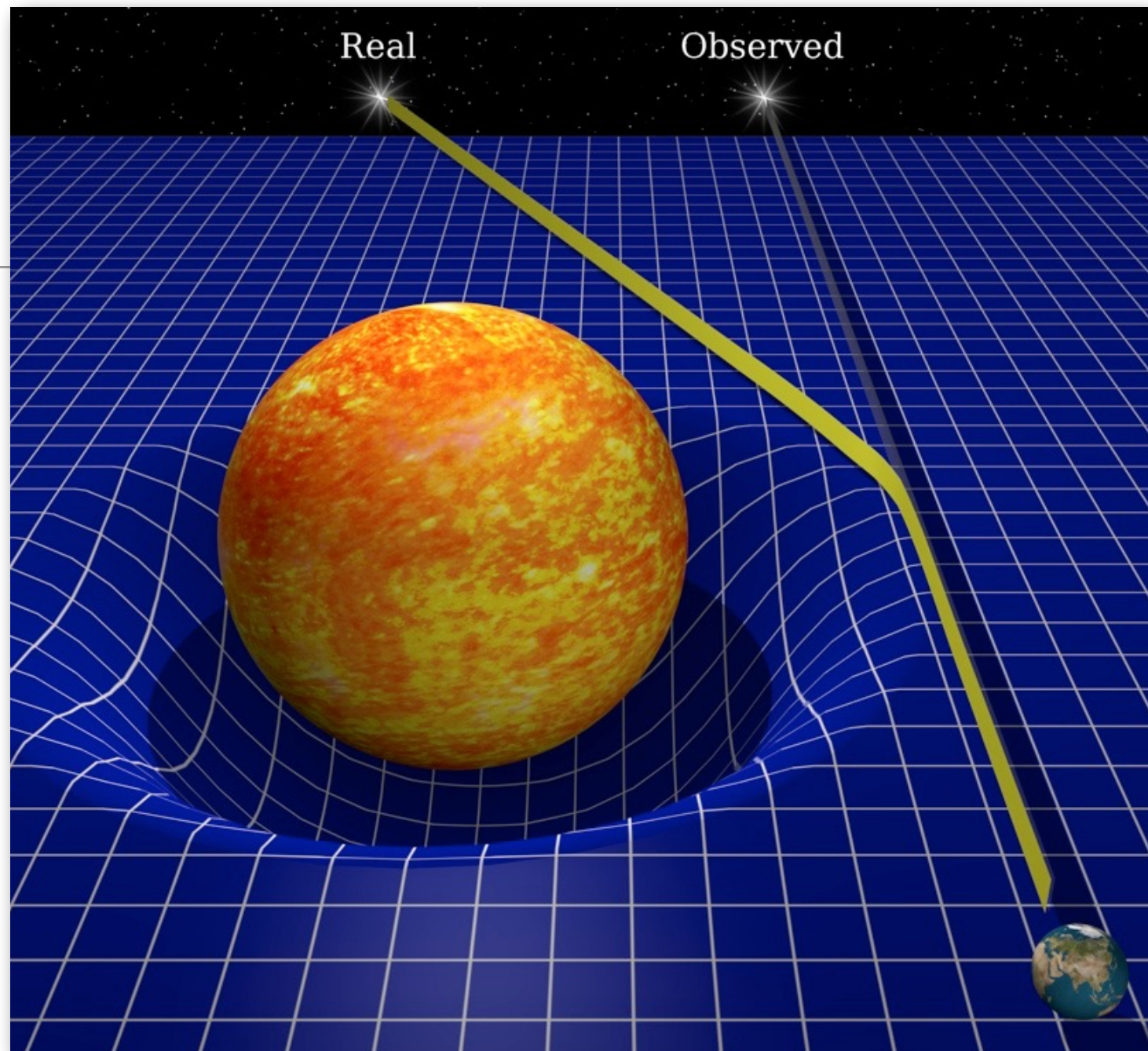
- 250 sq. deg.: Science Verification (SV)
- 5000 sq. deg.: Total area

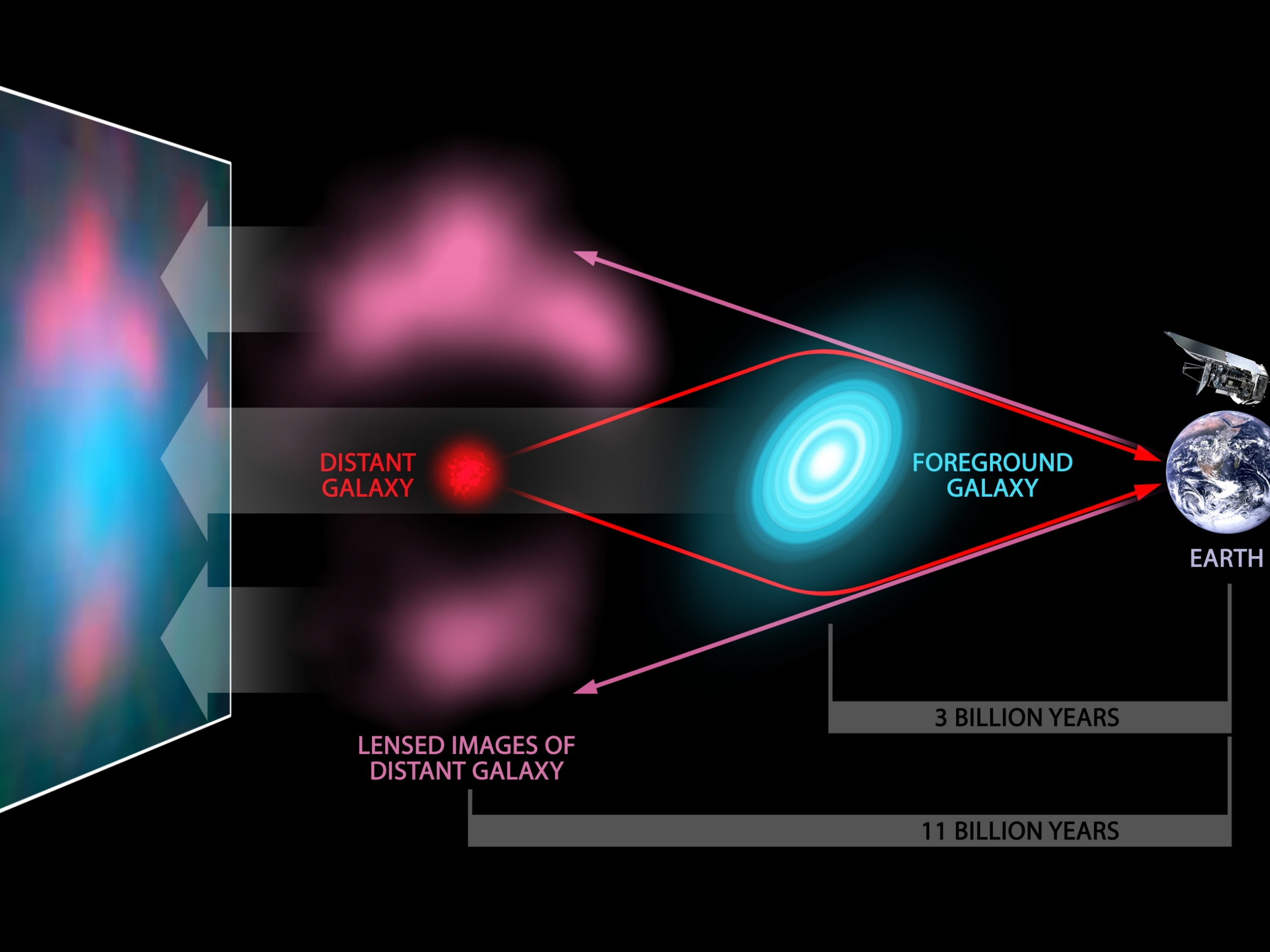




Warped Perspective

**Energy tells space how to curve,
and space tells energy how to
move.**



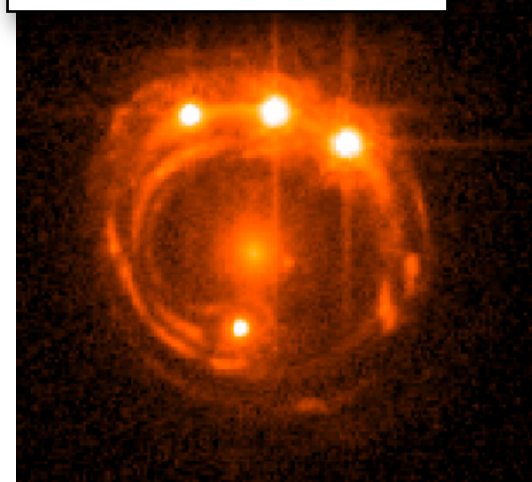


Strong Lens Forecasts for DES

- Census of literature
 - Variety of techniques and wavelengths, from radio to optical.
 - **~1000 strongly lensed systems** have been discovered to date.
- Current predictions for DES discovery:
 - **~2000 lenses** galaxy- to cluster-scale (Nord+2015, Collett+2015)
 - **~120 lensed quasars and < 10 lensed supernovae** (Oguri & Marshall, 2010)
- *Large populations in DES made possible by red-sensitive DECam CCDs, which allow depth of survey.*

Famous Lenses from Literature

Quasar (4 images)



RXJ1131-123

Galaxy-scale (ring)



Cosmic Horseshoe
(SDSS J114833.14+193003.2)

Cluster-Scale (multiple arcs)



Abell 2218

Chicago - Lensed

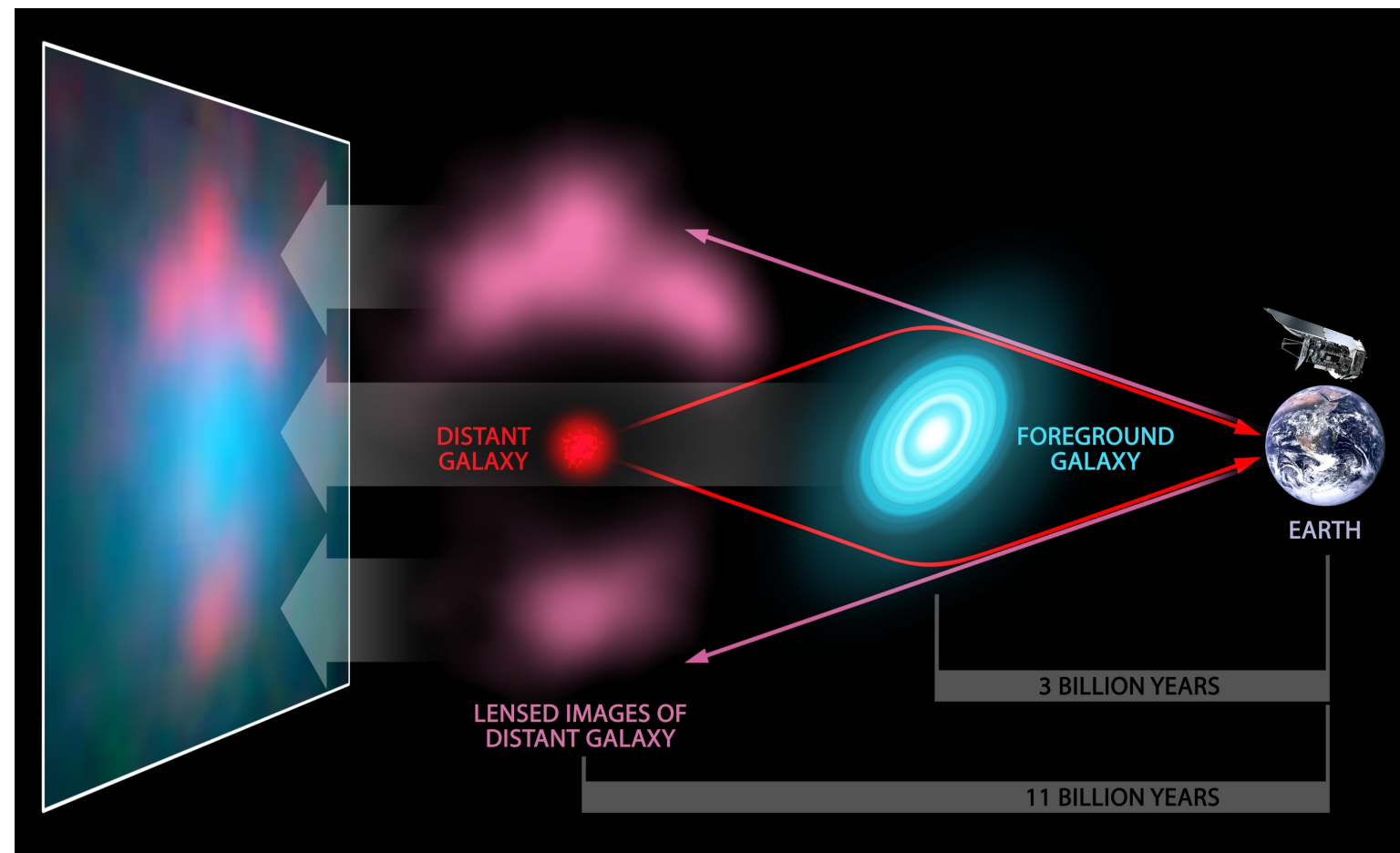


via GravLensHD by Eli Rykoff



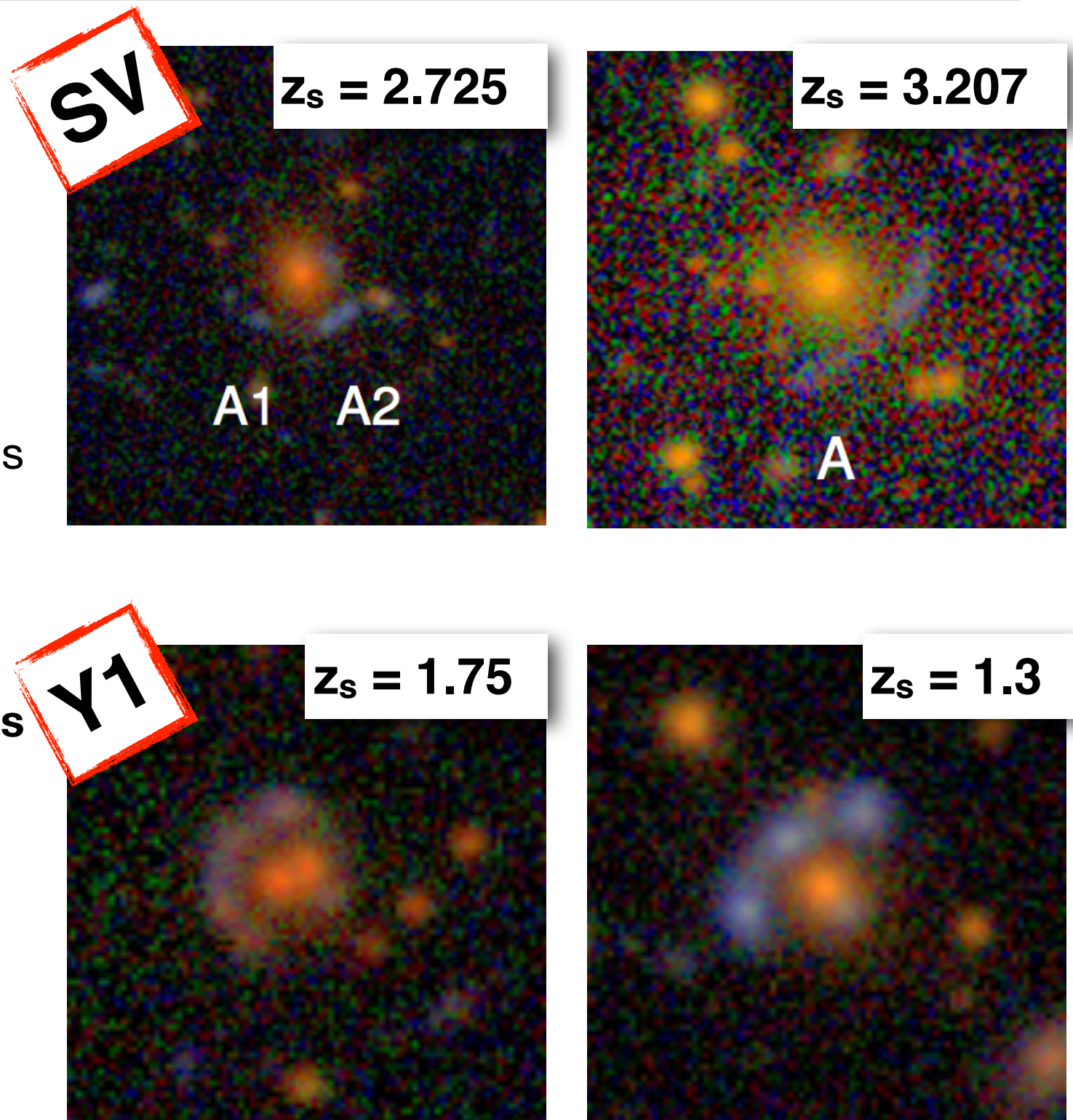
DES Strong Lensing: *Search, Discovery and Science*

1. Scan data:
Visual scan, arc-finding,
catalog search
2. Obtain precise distances
spectroscopic follow-up
3. Science!
 1. Model lensing mass
 2. Measure cosmological
parameters



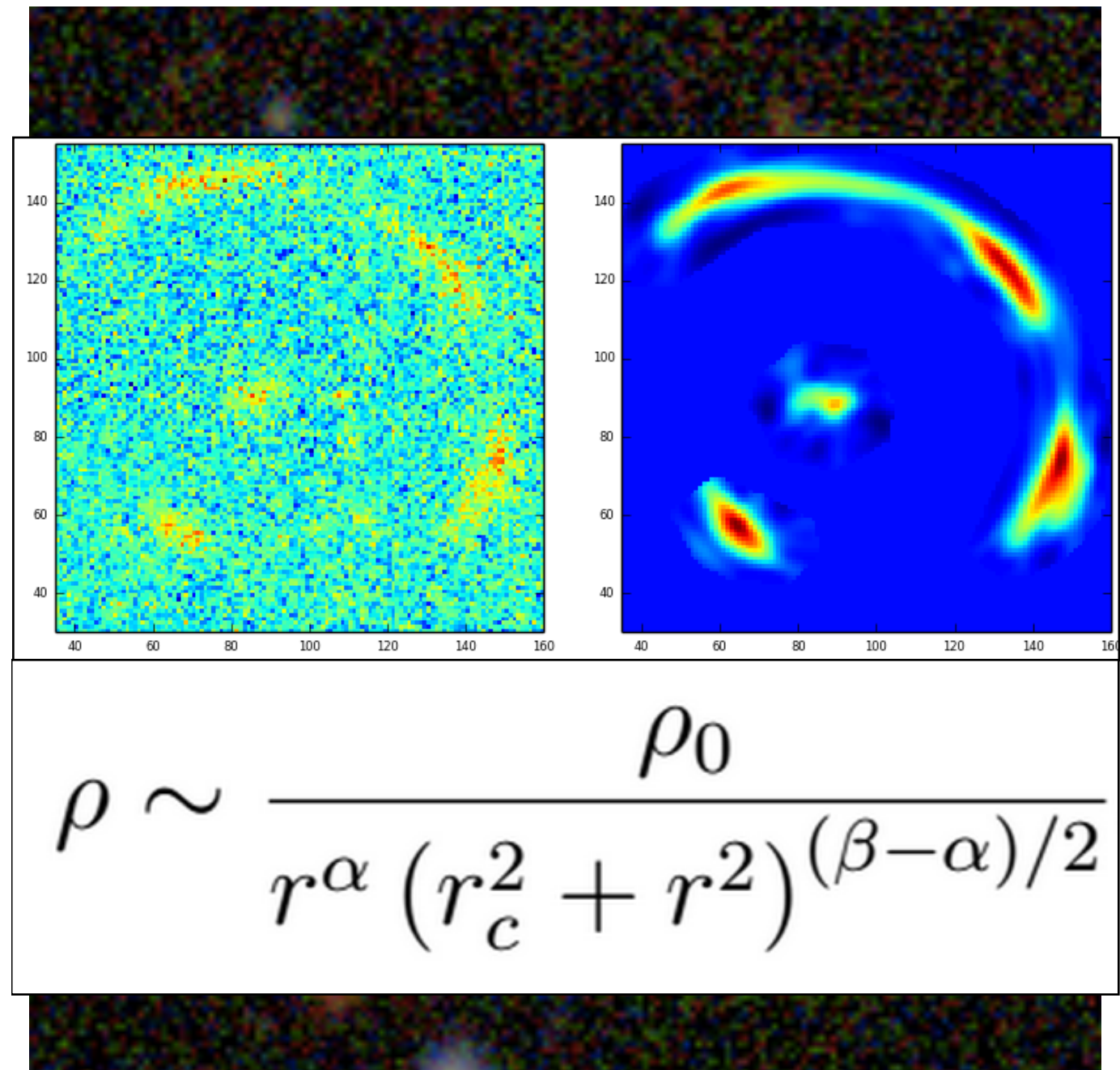
Candidate and Confirmed Lensing Systems

- SV Search Program (250 deg²)
 - Visual scan by 20 people
 - **6 spec confirmed systems**
(Nord+2015, arXiv:[1512.03062](https://arxiv.org/abs/1512.03062))
- Y1 Search Program (1000 deg²)
 - Catalog search: photometry, positions
 - Visual scan by 10 people
 - **7 spec confirmed systems**
(Nord+2016, in prep.)
 - **100's med.-/high-quality candidates**
(Diehl+2016, in prep.)
- Spectroscopic Follow-up
 - Magellan/IMACS:
<10 hours in 2014/2015
 - Gemini South - GMOS:
~250 hrs over three years



Dark Matter Halo Profile Studies

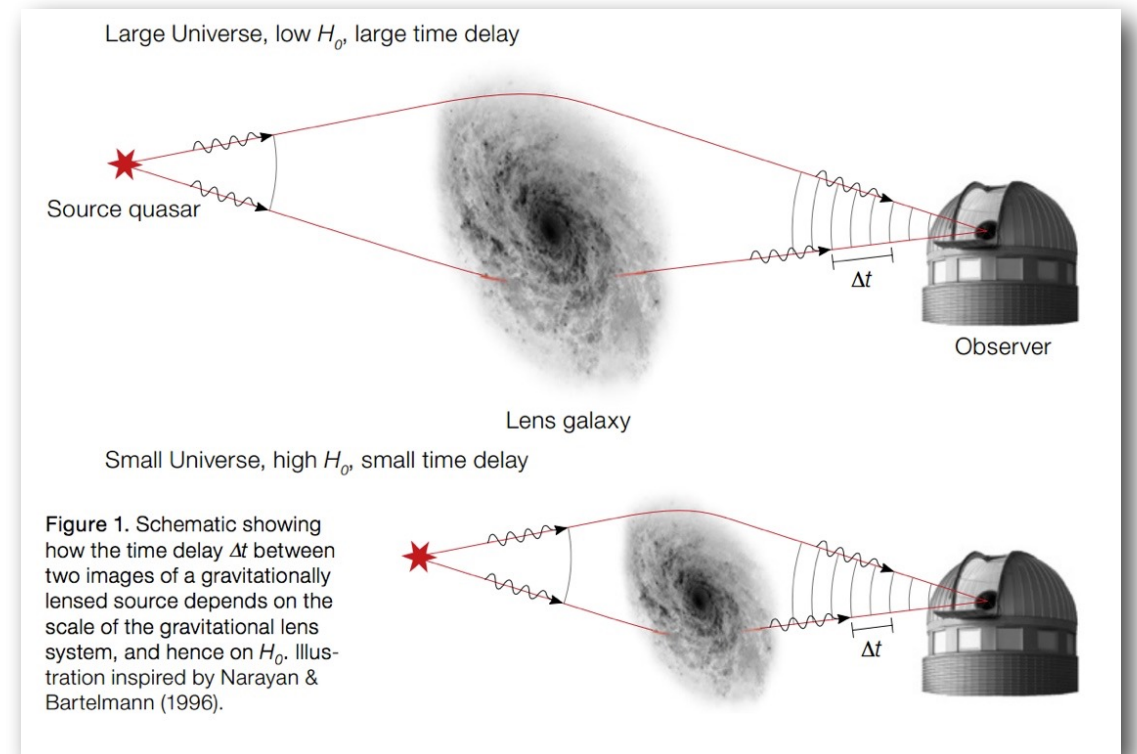
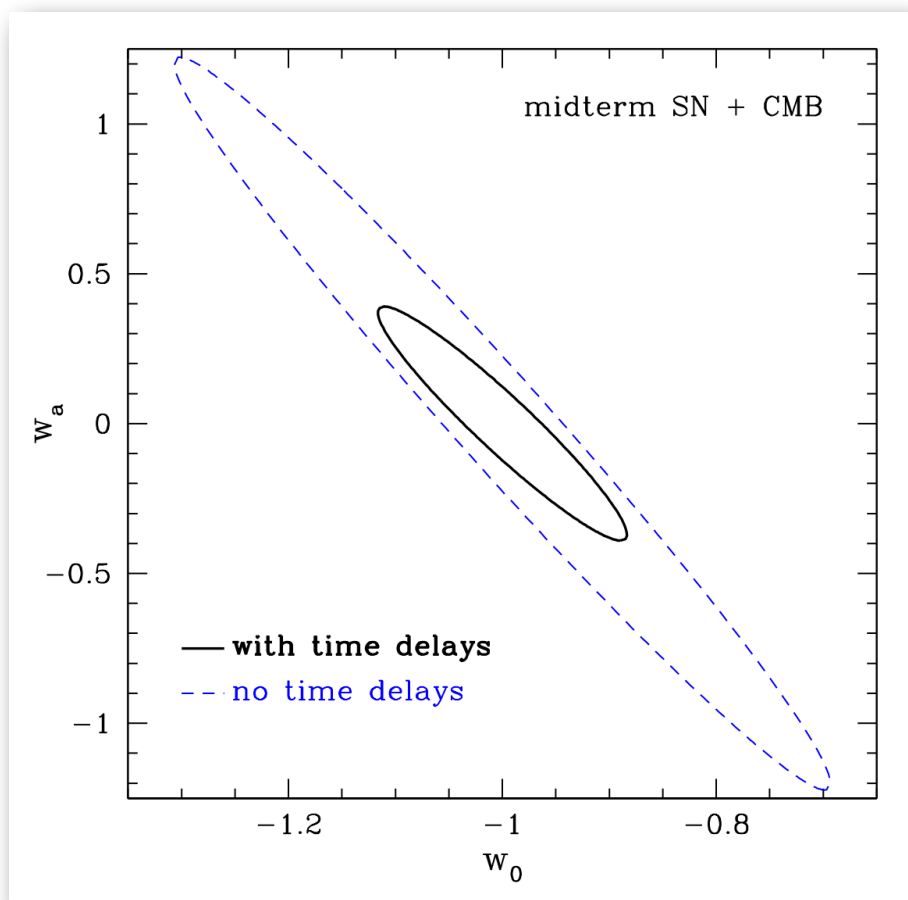
- Dark Matter halo profiles still have some mysteries due to baryonic effects, unknown nature of dark matter and more.
- A rare, interesting system
 - Found in Y1 Data
 - Profile *much* shallower than NFW with a huge core, >35 kpc
 - We can measure core because the lens' galaxies don't obscure a central image
 - HST imaging will allow more precise modeling.
(Collet+2016, in prep.)



Lenses for Cosmology

Time delays

- **The time delay** between different light paths is proportional to the H_0 (Refsdal, 1964)
- **The systematics** are small quasar samples and mass modeling
- **Complementary with CMB and SNe** improves dark energy constraints by over 50% (Linder+2016)



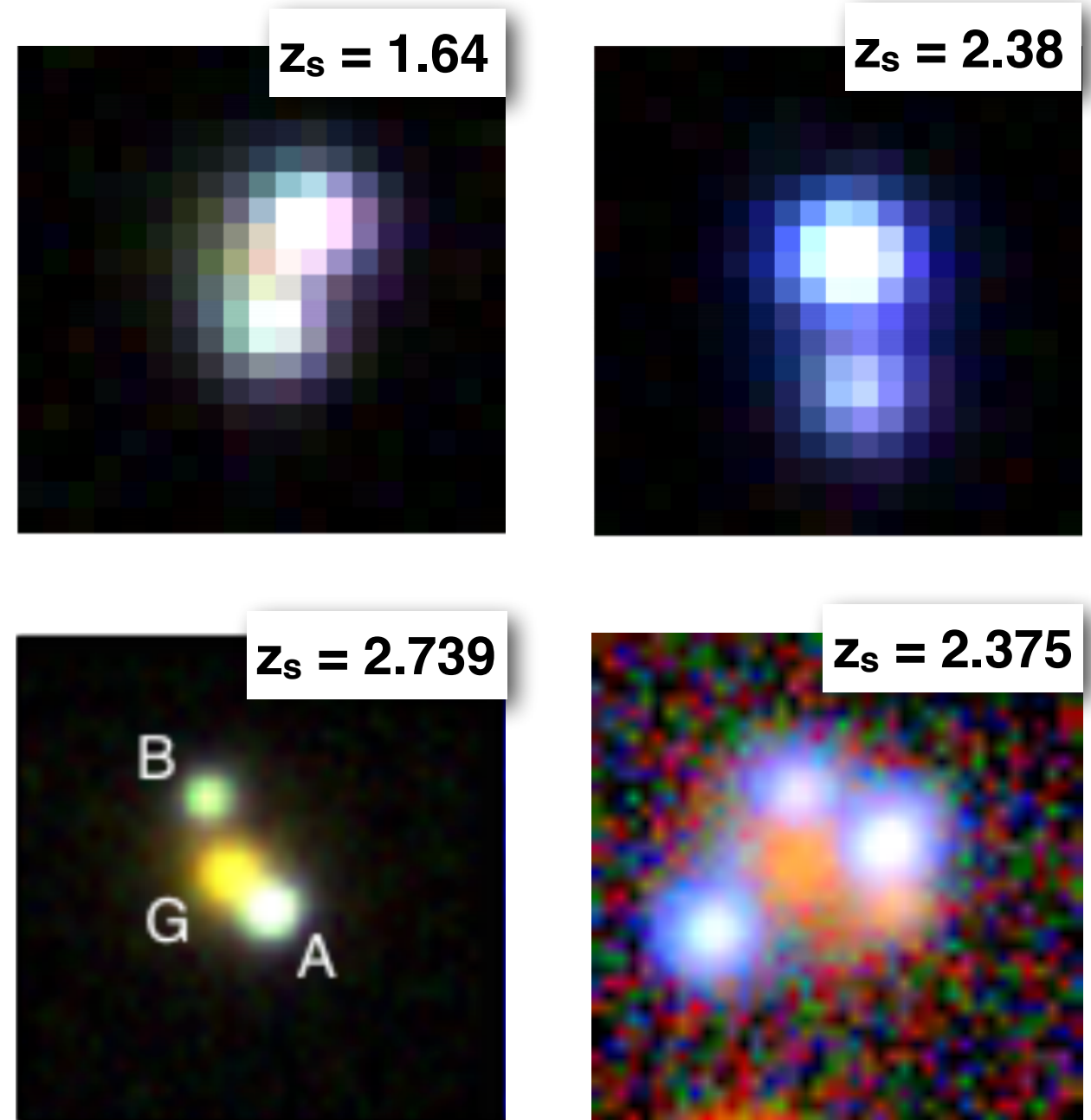
Recent Developments

- **Cepheids & supernovae: $73.24 \pm 1.74 \text{ km s}^{-1} \text{ Mpc}^{-1}$** (Riess+2016)
- **Time delays: $73 (+5.7 -6.0) \text{ km s}^{-1} \text{ Mpc}^{-1}$** (Wong+2016 and the H0LiCOW consortium)
- **2-3 σ tension with CMB/Planck measurements**

Lensed Quasars

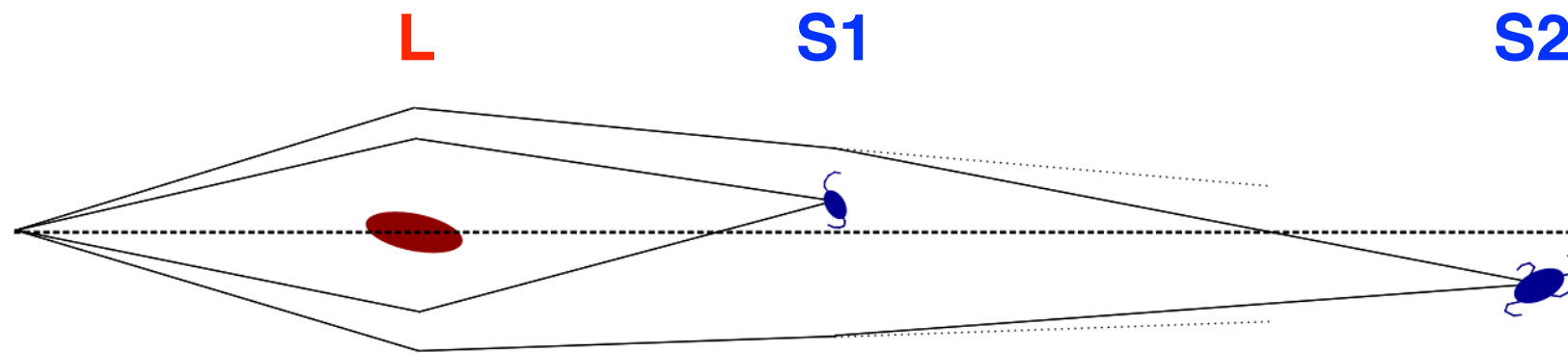
STRong lensing **I**nsights into **D**ark **E**nergy **S**urvey

- **STRIDES**:
Collaboration with external partners, led by T. Treu
- DES Lensed Quasars Discoveries
 - Agnello+2015, arxiv:[1508.01203](#)
 - Ostrovski+2016, arxiv:[1607.01391](#)
 - Lin+2016, in prep.
- Follow-up Campaigns
 - Spectroscopy:
6 nights on NTT
 - Photometric monitoring:
La Silla 2.2m: 1.5 hr/night, Oct-Apr.
 - AO imaging:
SOAR, Keck
- *Continued lens-finding and growing the monitoring campaigns will make possible new and competitive cosmological constraints.*



Lenses for Cosmology

Double-source systems



- Distance is a function Hubble parameter and matter and dark energy densities:

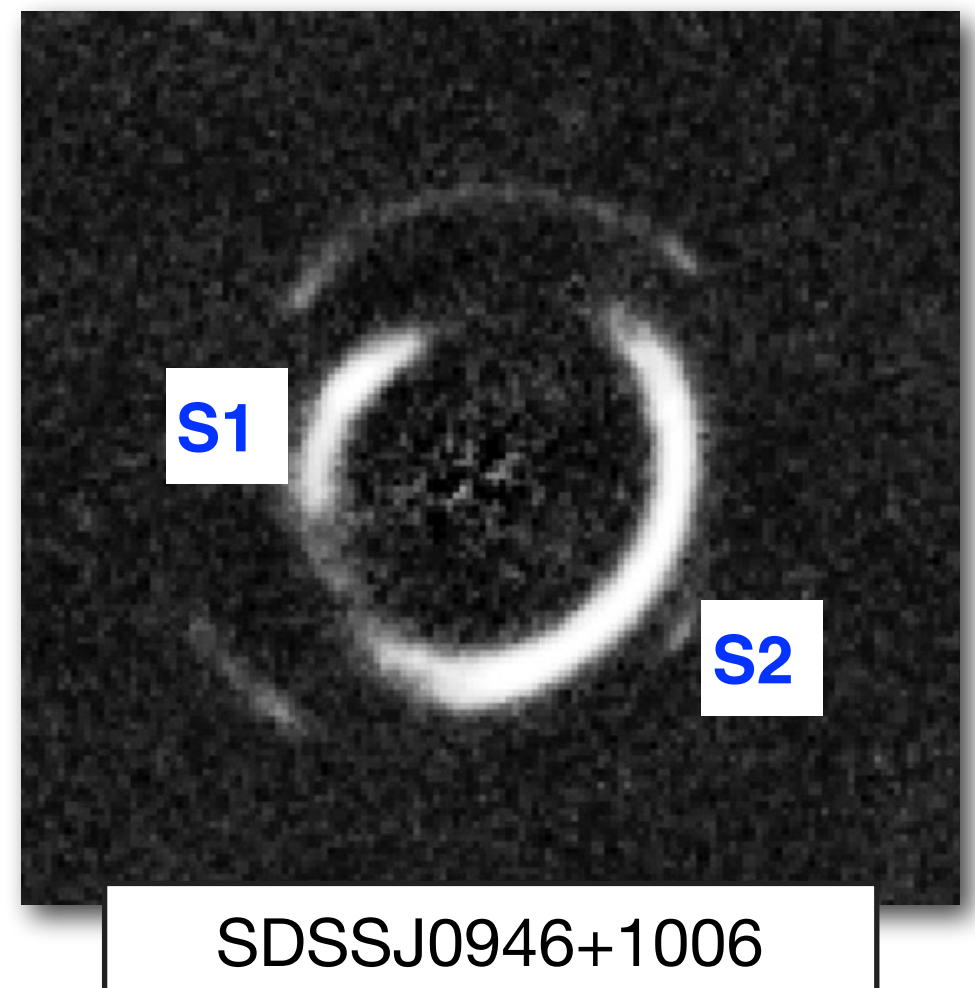
$$D_{ij}(z_L, z_s; H_0, \Omega_M, \Omega_\Lambda, w)$$

- The ratio of distances, ***D***, provides constraints Ω_M , Ω_Λ , w independent of H_0

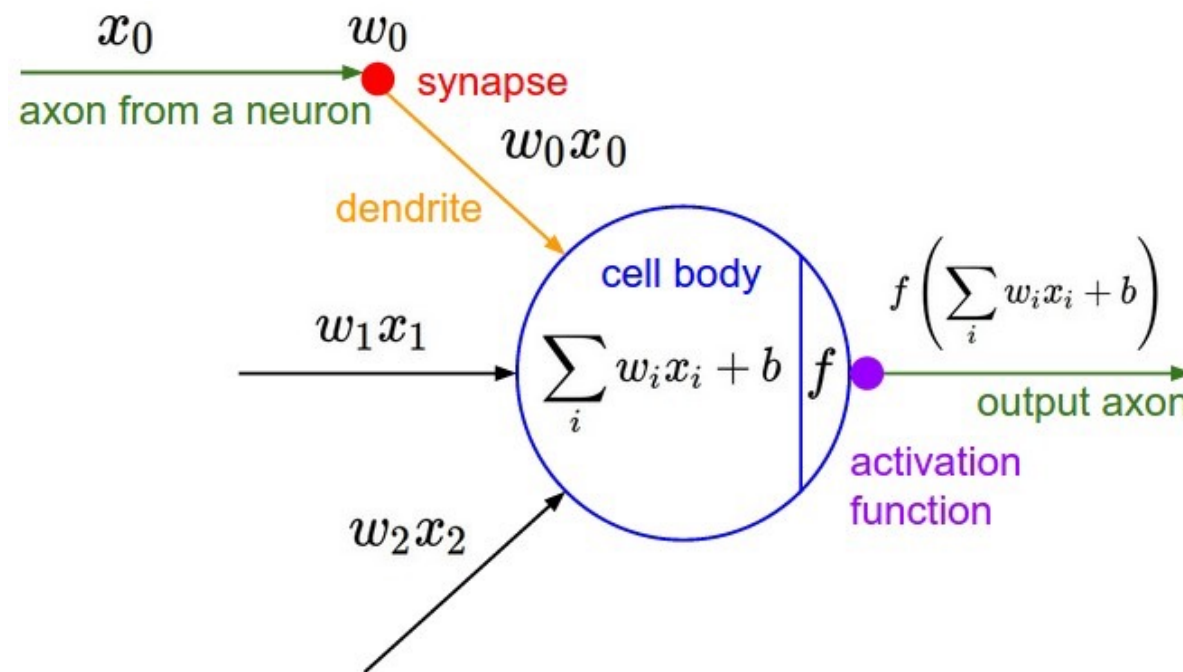
$$\Xi(z_{\text{lens}}, z_1, z_2; \Omega_M, \Omega_\Lambda, w) = \frac{D_{\text{LS}}(z_1)}{D_{\text{S}}(z_1)} \frac{D_{\text{S}}(z_2)}{D_{\text{LS}}(z_2)}$$

- To date, only **1** has been found.

- We expect ~10 in DES (Gavazzi+2008)*



Deep Learning and Neural Nets

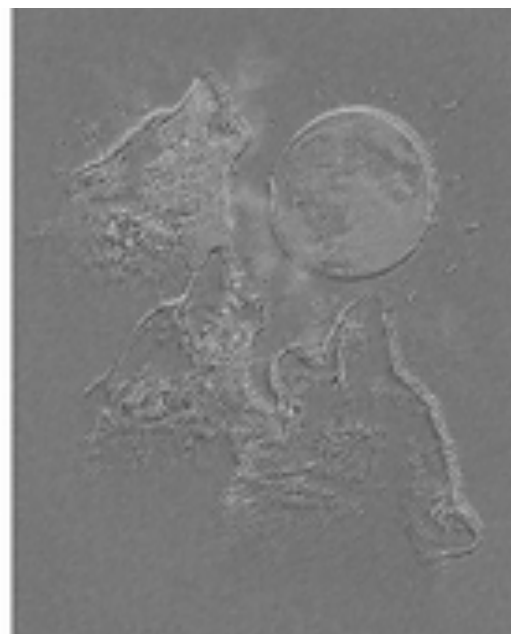


- Neural Nets are made of neurons (filters) that process input image data.
- Filters (with parameters, **w_i**) activate features in the data, **x_i**
- Important features are learned:
multiple layers (deep) of neurons are tested and filter parameters, **w** , are adjusted

Image



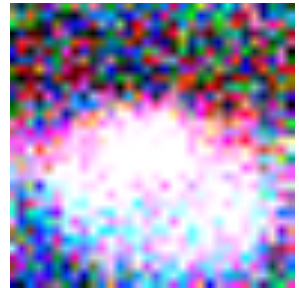
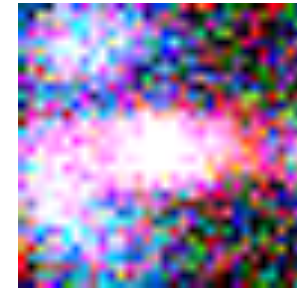
Example Features



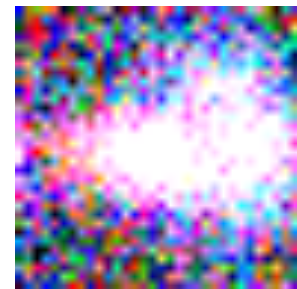
Deep Lensing

- Simulated images
 - LensPop (Collett+2015)
 - reproduces DES characteristics
 - noise levels, exposure time, psf, filters/colors, pixel scale
- Training sets:
 - 10k lenses, 10k non-lenses
 - 32 x 32 pix
- Software:
 - Theano on a laptop
 - 3-layer neural net
- Key goals/questions:
 - Can we remove humans from the search process?
 - Can we pinpoint specific kinds of lenses good for cosmology?

Lens



Non



Correctly
identified
Nons

Confusion Matrix

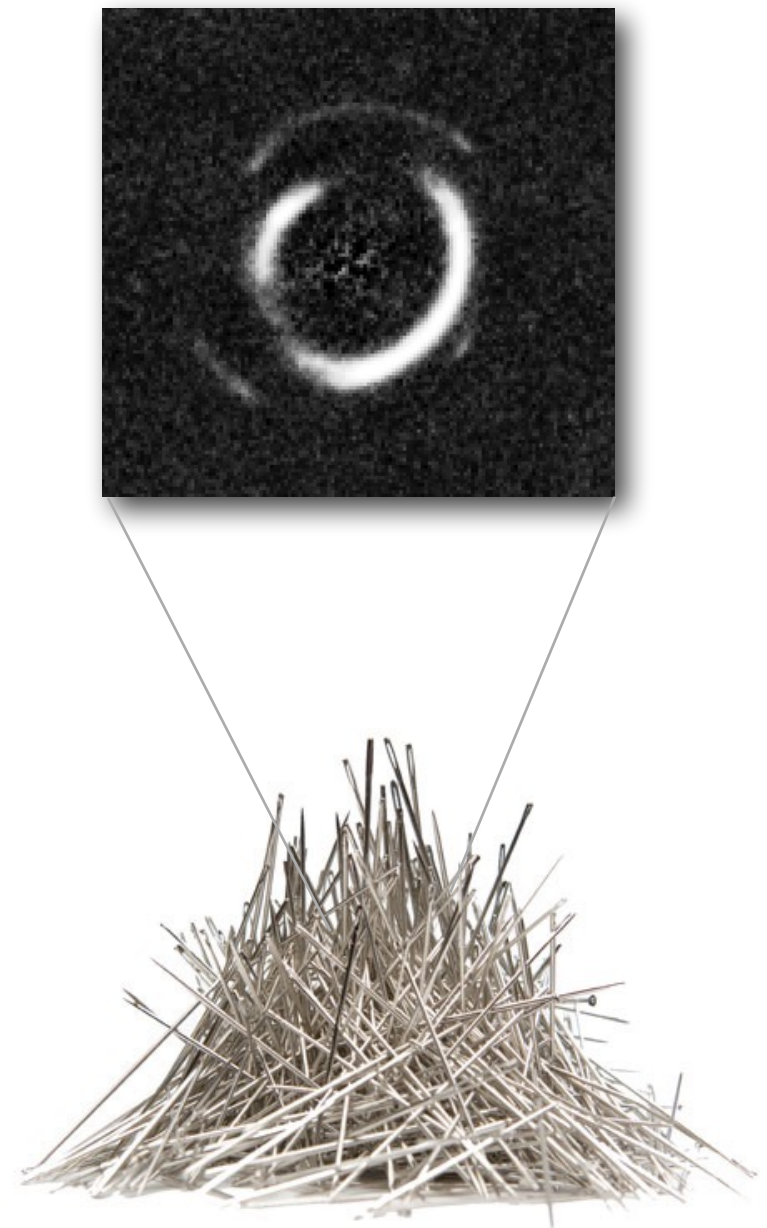
0.996	0.004
0.102	0.898

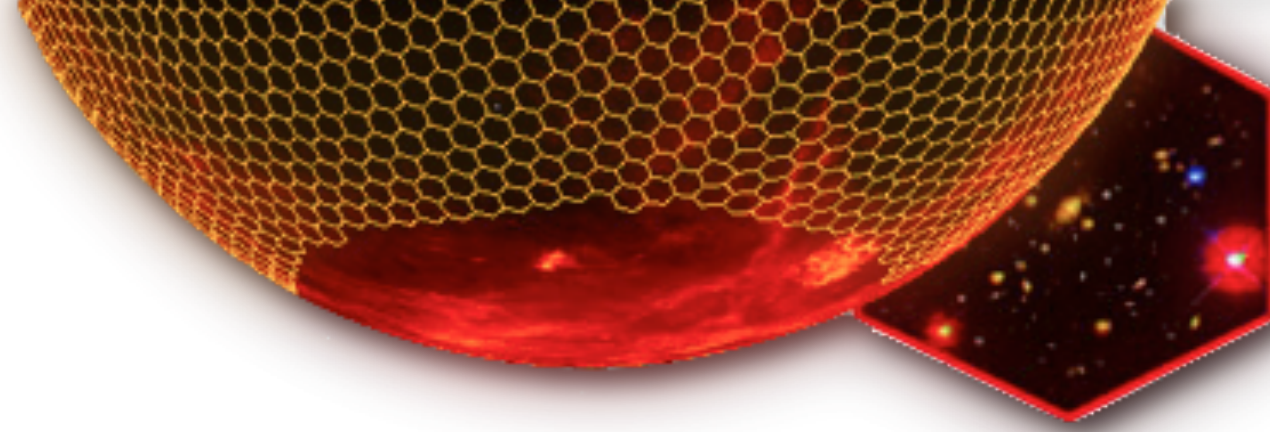
Correctly
identified
Lenses



DES Strong Lensing

- **DES** could find ~2000 lenses — 2x as all previously discovered.
- Some of them will be optimal for cosmological measurements:
 - lensed quasars, supernovae
 - multiple-source lensing systems
- **Spectroscopic Follow-up and photometric monitoring** programs are well-underway.
- **Multiple papers and projects** are underway with both candidate and confirmed lenses.
- The process of finding objects is challenging. Techniques like **neural nets** may be critical for surveys like DES and LSST.

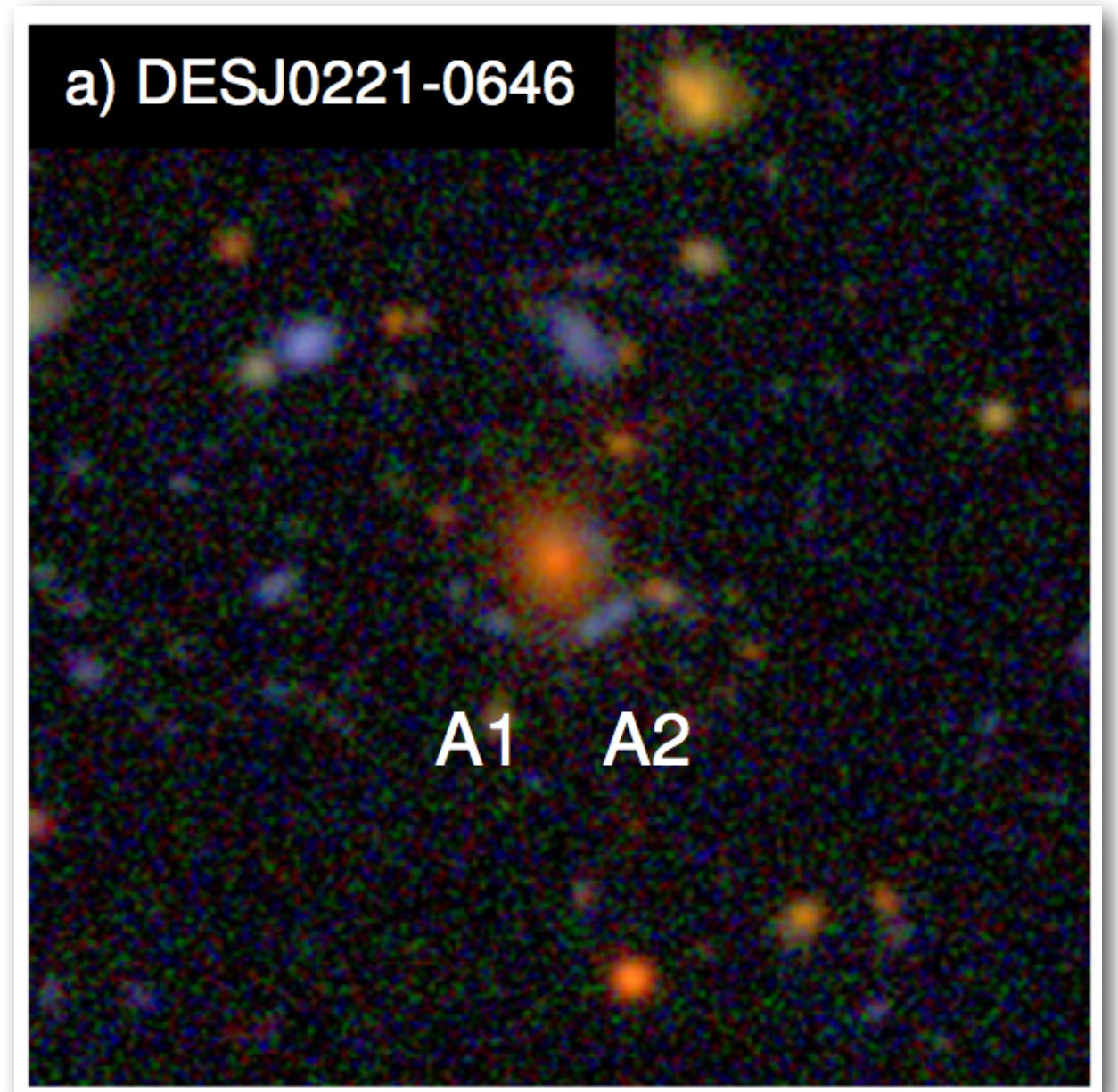




Extras

Image Searches

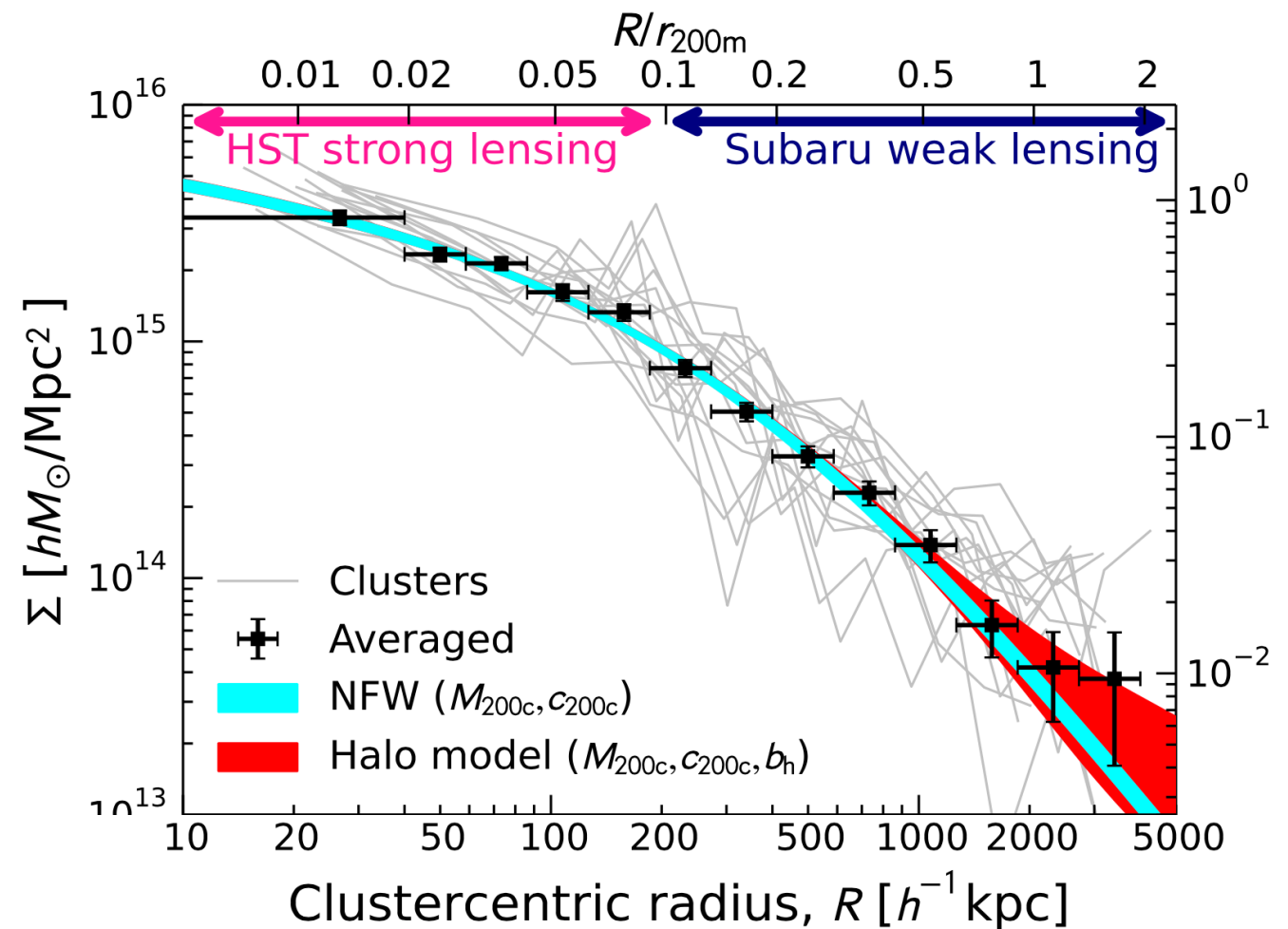
- Search Program
 - Visual scan (SV data, 250 sq. deg.)
- Follow-up
 - Gemini South LLP
 - Magellan



Lenses for Cosmology

Dark matter halo profiles

- Combining weak and strong lensing allows measurements of cluster density profiles over a large dynamic range.
- Strong and weak lensing probe inner and outer radii, respectively
- 16 stacked clusters
 - profiles are well fit by canonical NFW model, *not* by power laws
 - concentration-mass relation shows agreement with LCDM
 - strong lensing is key for these studies.



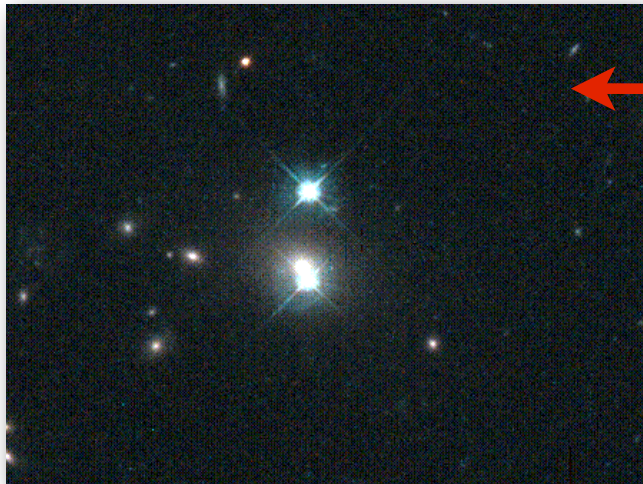
Umetsu++2015

Spectroscopic Follow-up: Gemini South Telescope

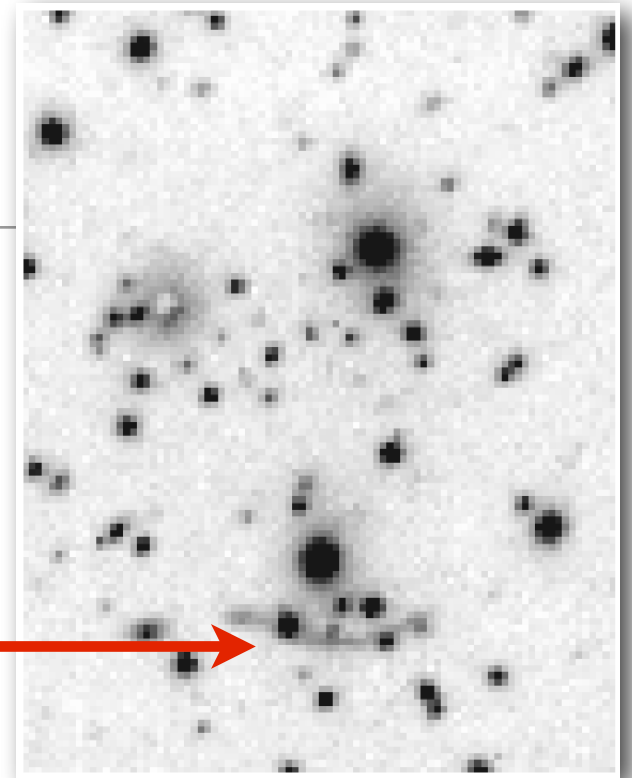
- **Large and Long Program**
 - 90 hours of telescope time per year for three years
 - 1-4 hours per candidate
 - Many important nuances to Gemini observing



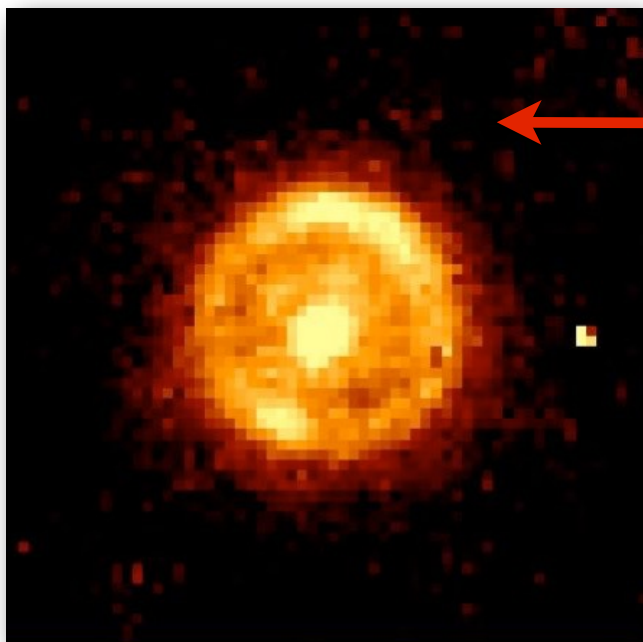
Historical Milestones



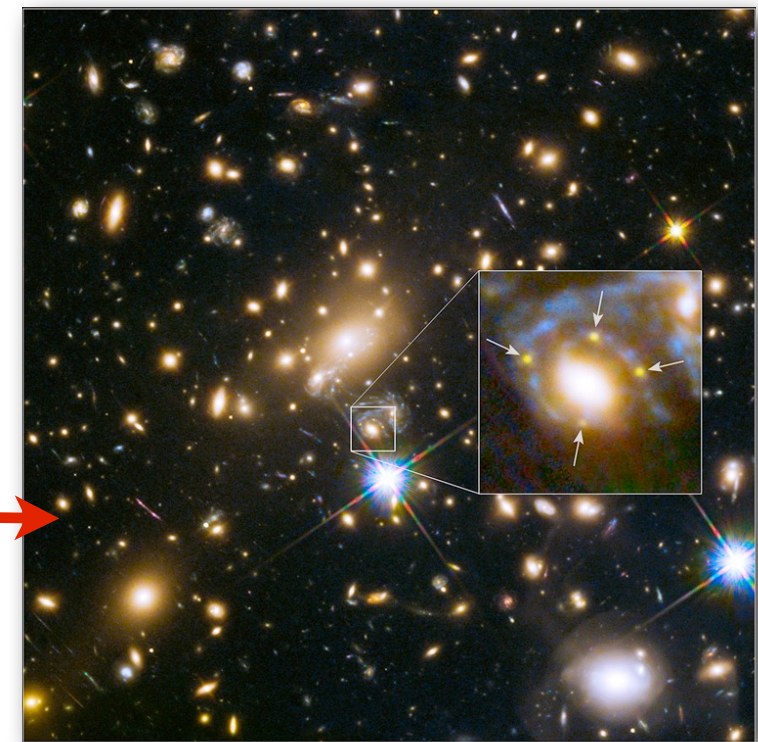
- 1979: First lensed system
 - Twin Quasar SBS 0957+561
(Walsh, Carswell, Weyman)



- 1986: First lensed galaxy (arcs)
 - Galaxy Cluster Abell 370
(Lynds & Petrosian 1986; Soucail et al. 1987)



- 1998: First Einstein Ring
 - Galaxy JVAS B1938+666
(King et al.)

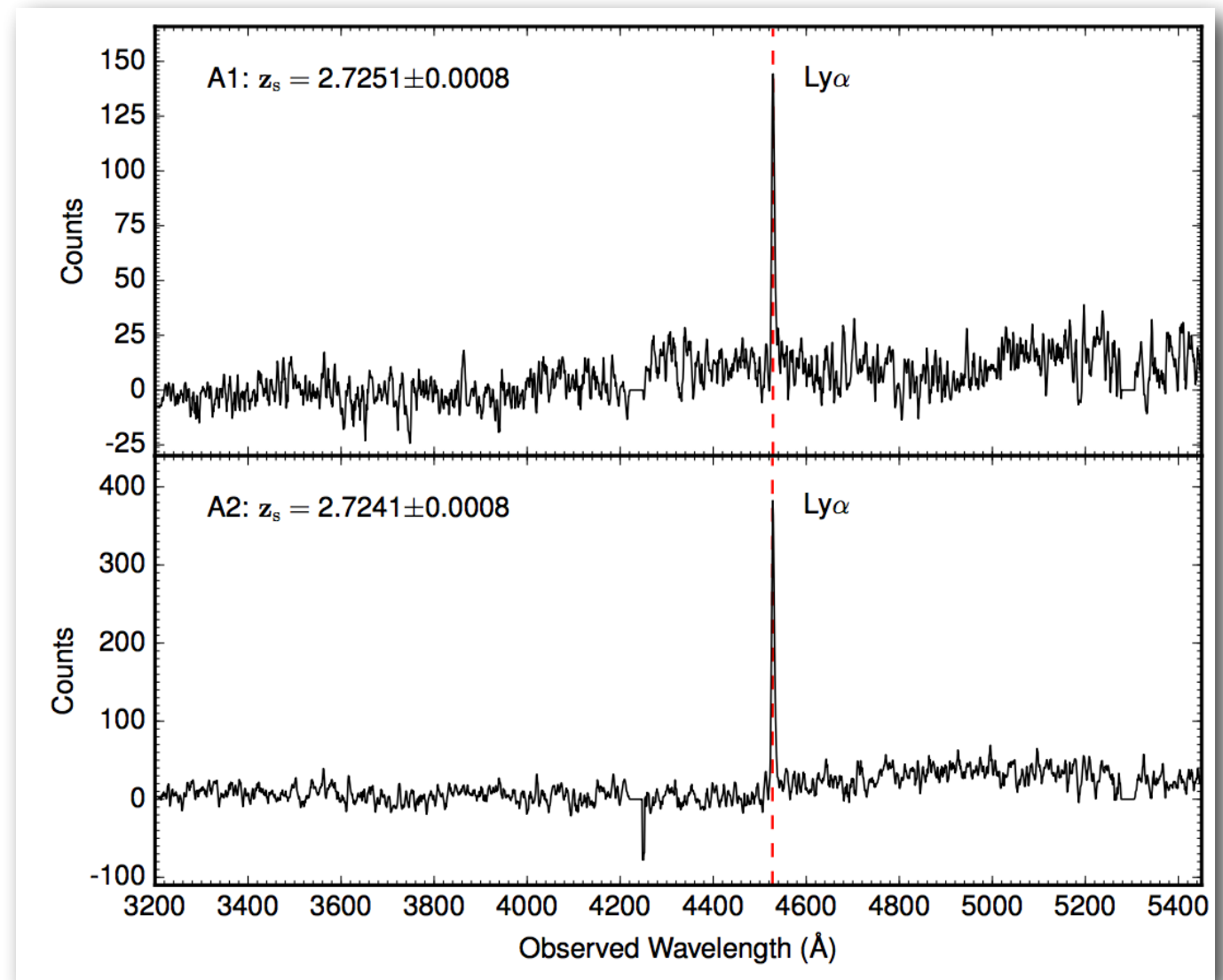
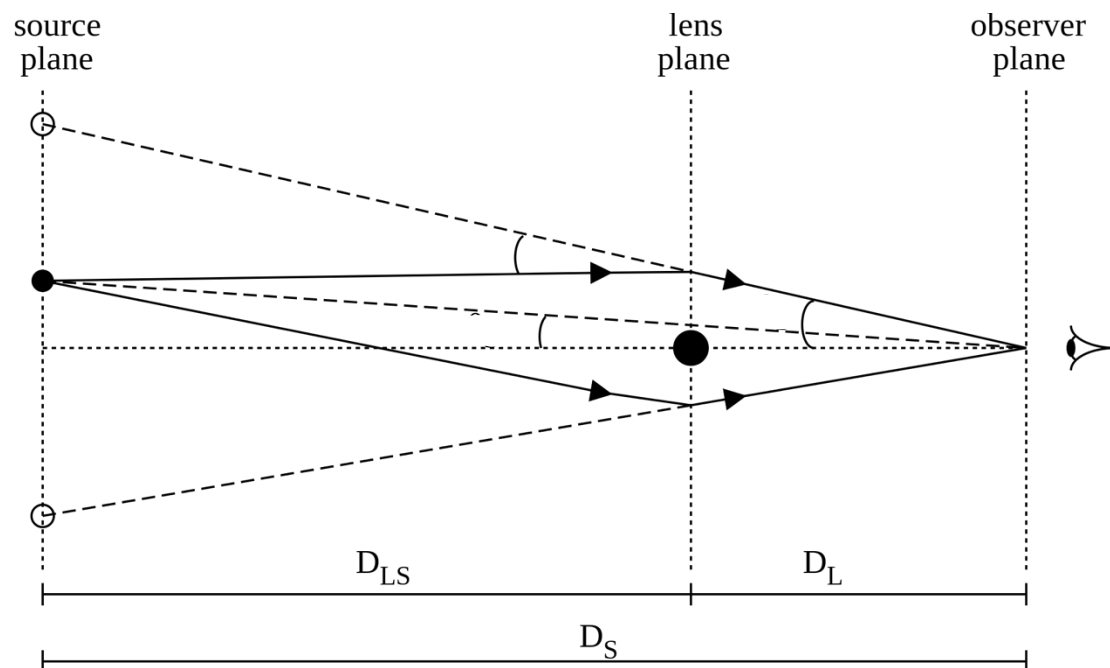


- 2014: First multiply imaged supernovae
 - MACS J1149.6+2223
(Kelly et al., 2014)

How to find and confirm lenses in three easy steps

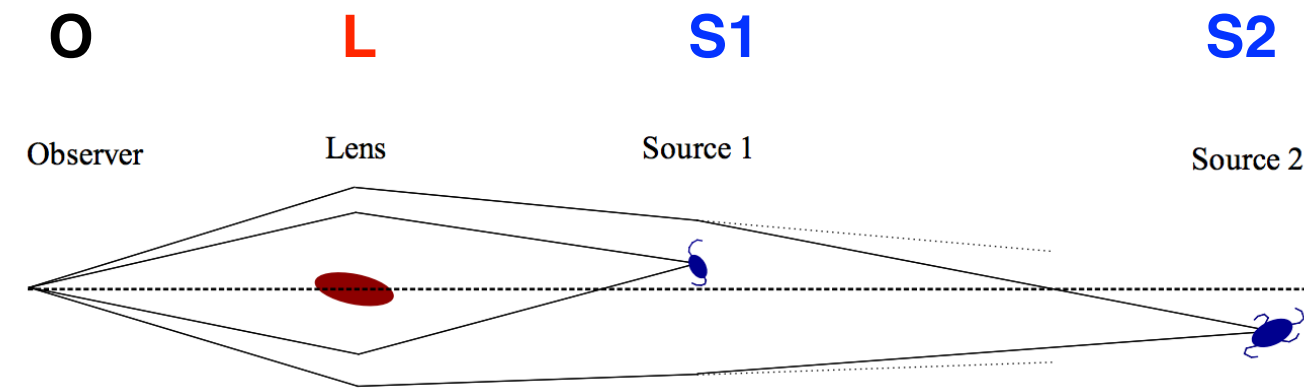
2. Find relative positions

- Obtain spectra to measure redshifts and angular diameter distances
 - Patterns in spectral features determine spectroscopic redshift (similar to photo-z)
 - Determine whether the source is farther away than the lens.
 - errors: $<1\%$



Confirming 6 systems took > 10 hours on Gemini 8m telescope. There isn't yet enough telescope time in the world to follow-up and confirm 1000's of lenses.

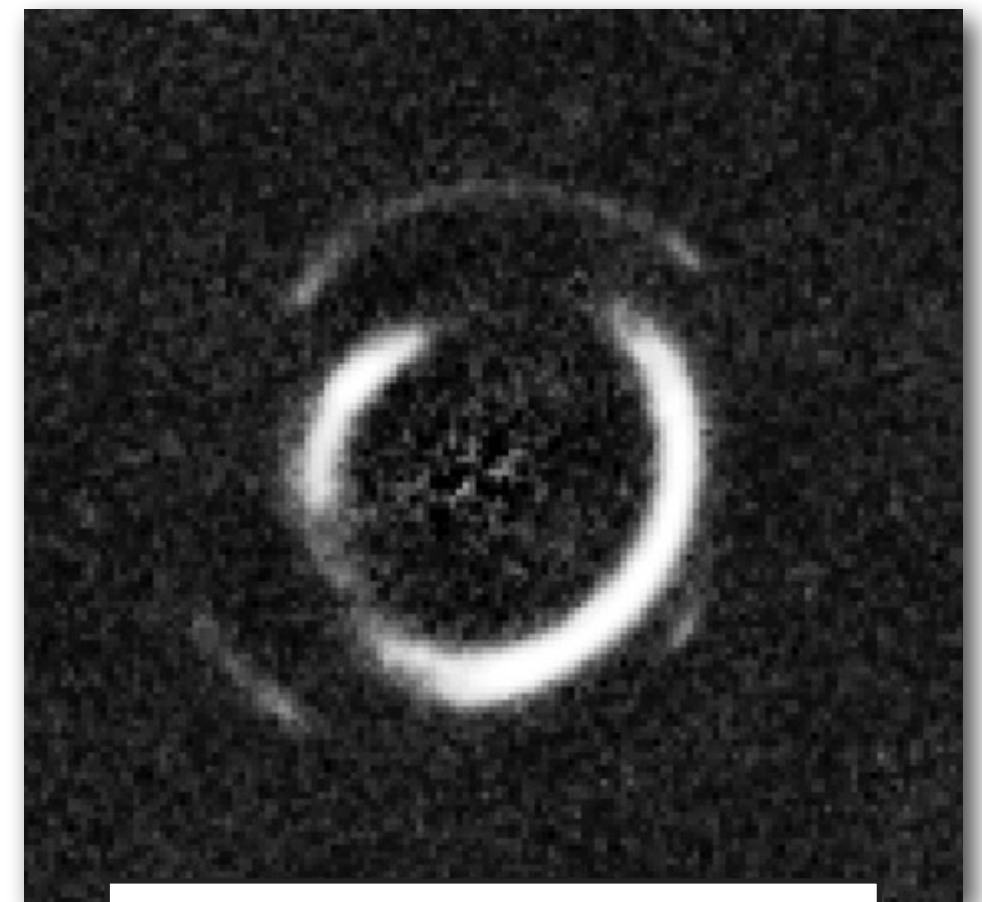
Cosmological Constraint F



- Double-source system
 - distance is a function Hubble parameter and matter and dark energy densities
 - $D_{ij}(H_0, \Omega_m, \Omega_{de})$
 - The ratio of angular diameter distances provides constraints Ω_m, Ω_{de} independent of Hubble parameter

$$\Xi(z_{\text{lens}}, z_1, z_2; \Omega_M, \Omega_\Lambda, w) = \frac{D_{LS}(z_1)}{D_S(z_1)} \frac{D_S(z_2)}{D_{LS}(z_2)}$$

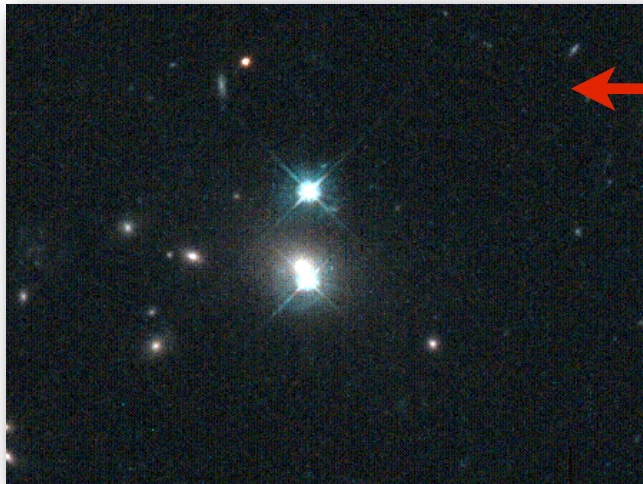
- Dependent on mass reconstruction (geometric simplicity of system)
- Expect $O(10)$ in DES (Gavazzi++, 2008)



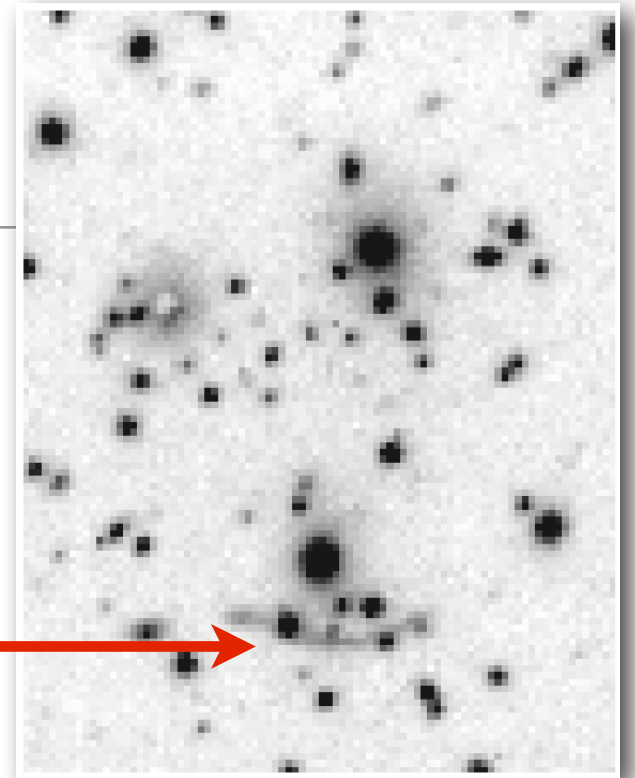
SDSSJ0946+1006

50 billion years
in the future

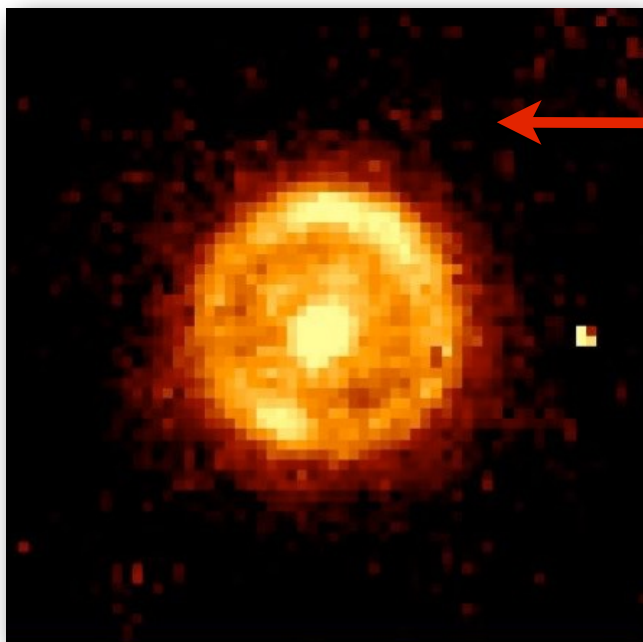
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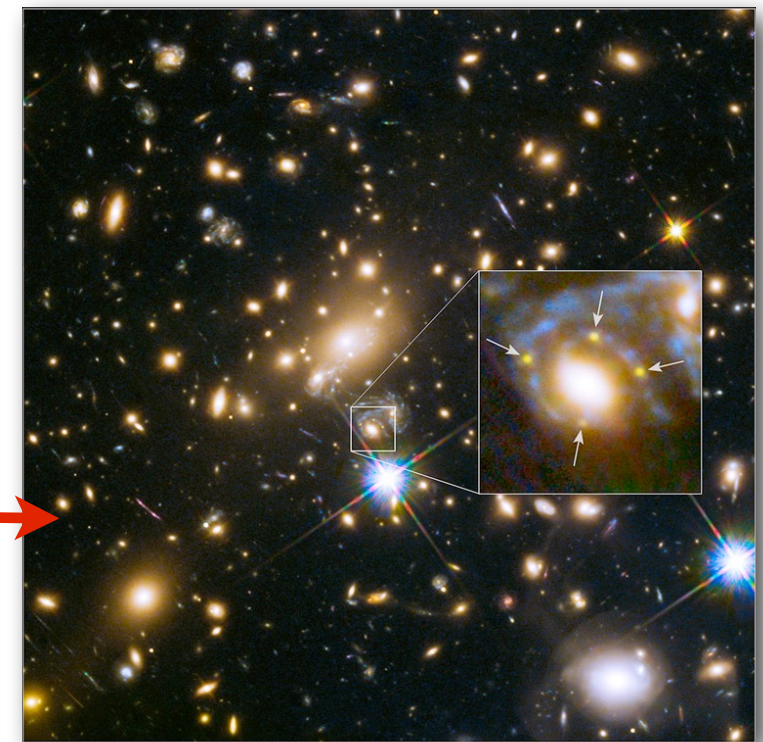
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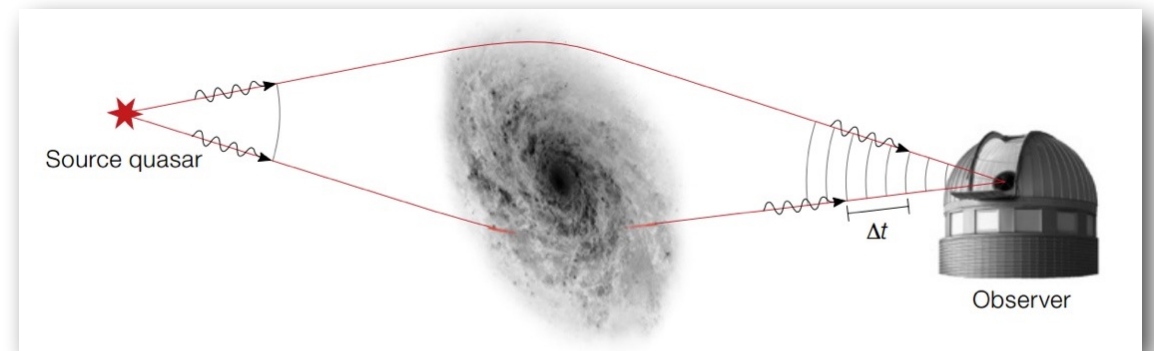


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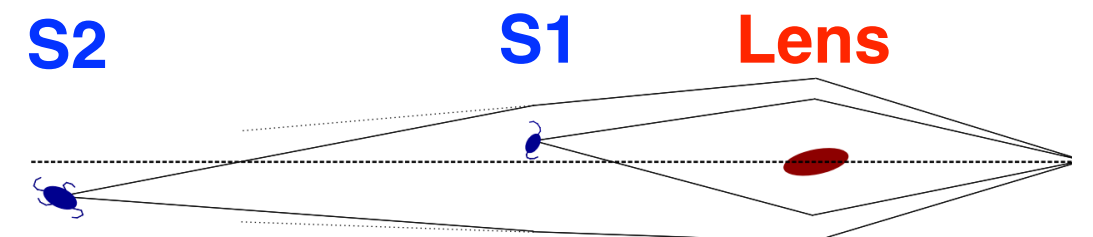


Lenses for Cosmology

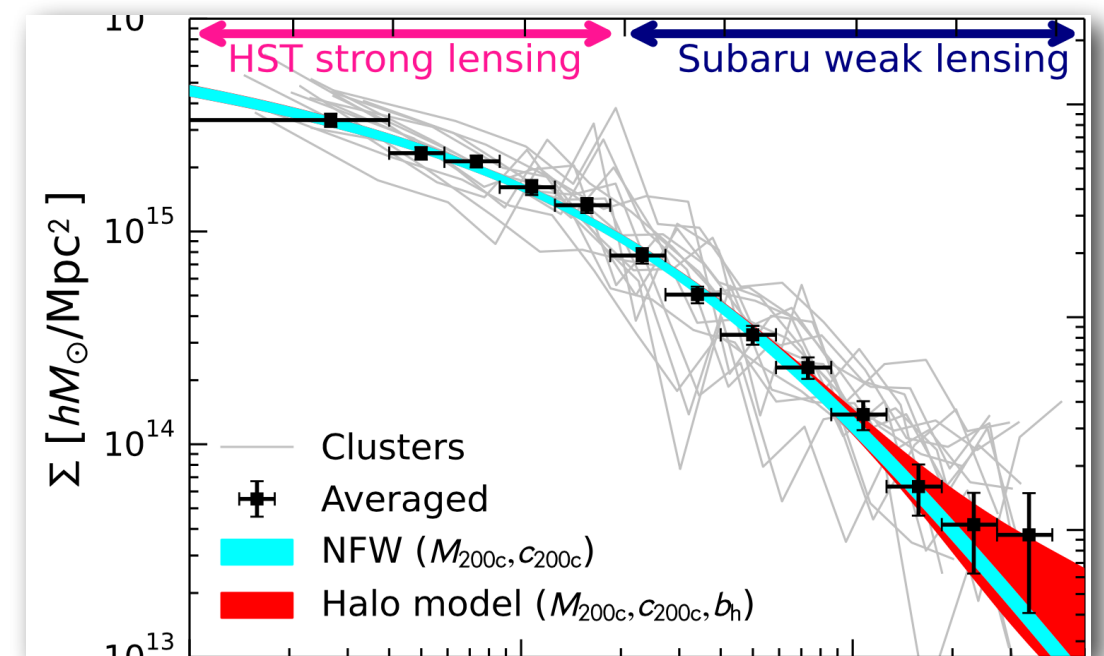
Hubble constant, H_0 : proportional to the time delay between different light paths (Refsdal, 1964, Tewes++2012).



Dark energy density, Ω_Λ : constrained by ratio of distances in rare multi-source systems (Collett++2015, Linder, 2016).



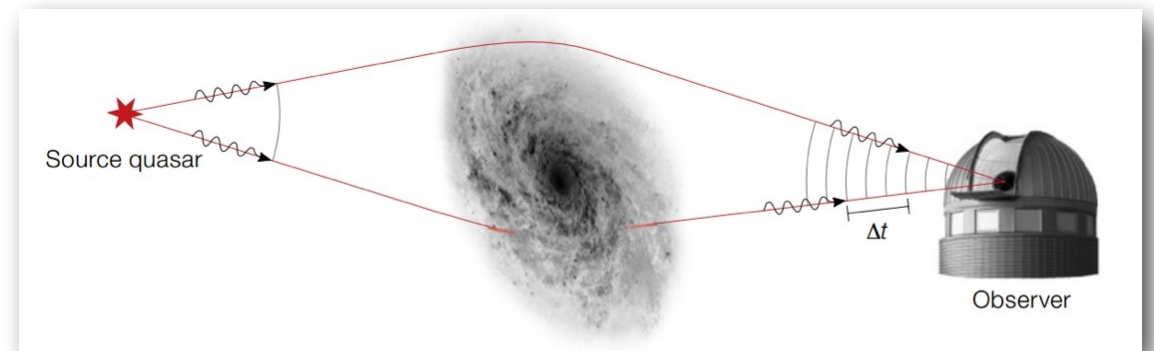
Dark matter halo profiles reveal the growth of structure and constrain cosmological models (Jullo++2015).



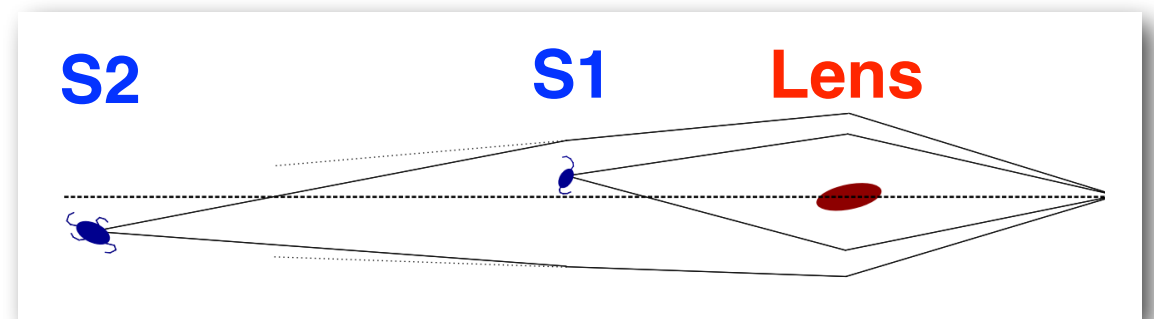


Lenses for Cosmology

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