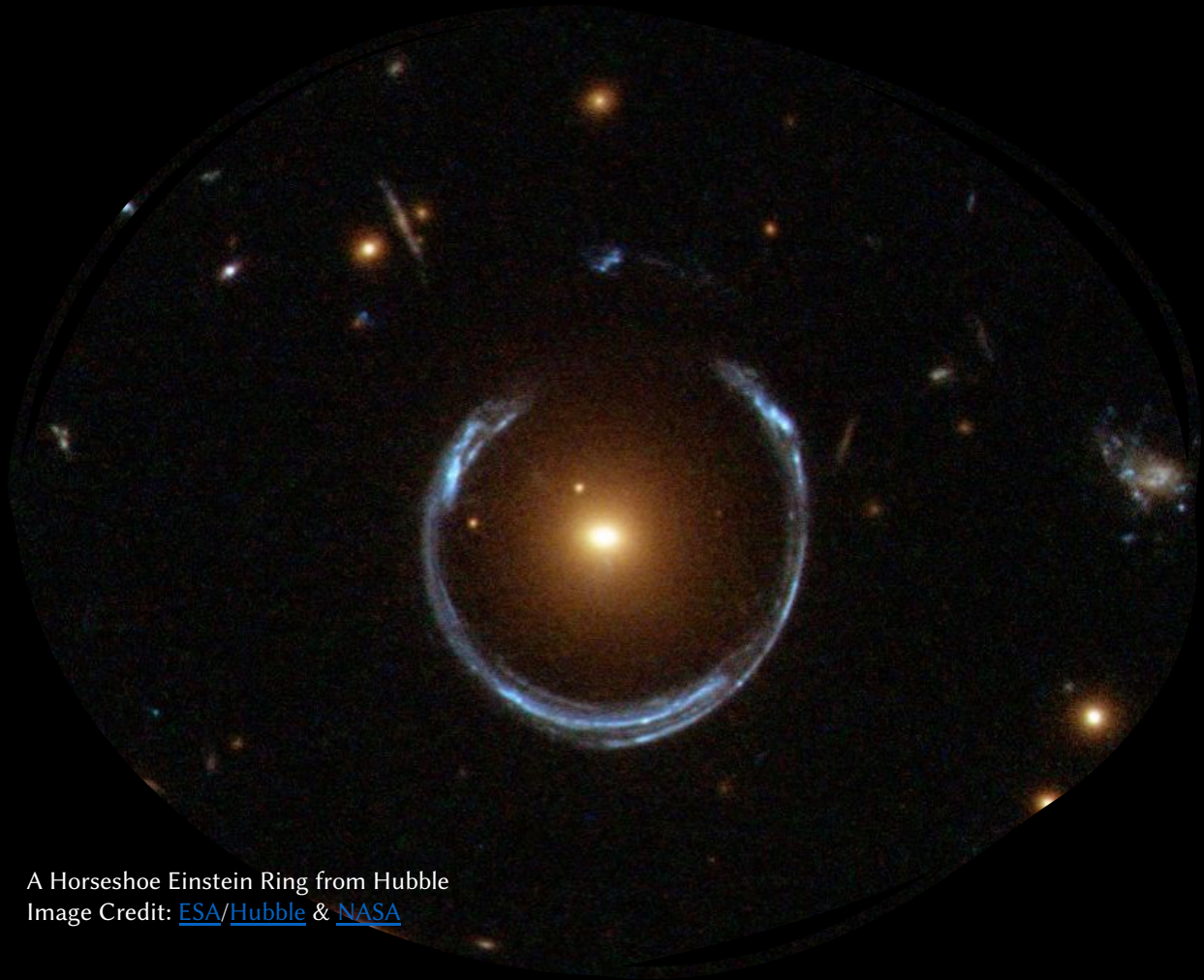


# What Can Gravitational Lenses Teach Us About Nature?

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Andi Gu

A Horseshoe Einstein Ring from Hubble  
Image Credit: [ESA/Hubble](#) & [NASA](#)



# A Little About Me

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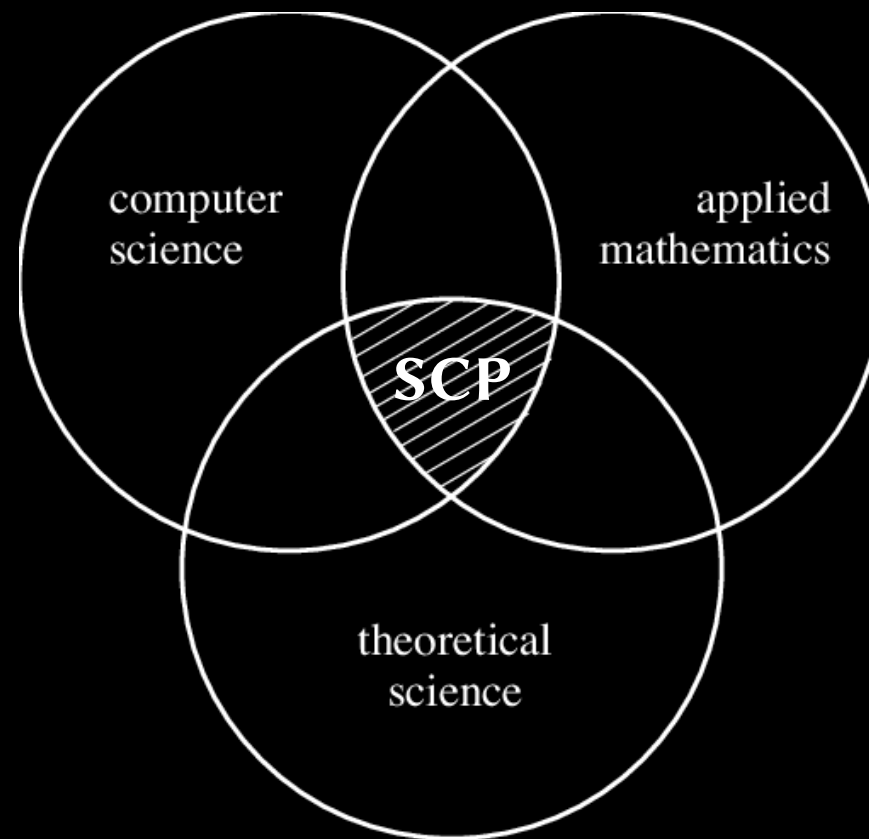
- My interests coming out of high school:
  - Applied math
  - Theoretical physics
  - CS
  - ML/AI
  - Statistics
  - ...
- Physics/CS major at Cal – just graduated 🎉
- Next step: graduate degree in physics



# Research at Berkeley

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- Joined the Supernova Cosmology Project at the beginning of sophomore year – they do it all!
  - Theoretical physics
  - CS + ML/AI



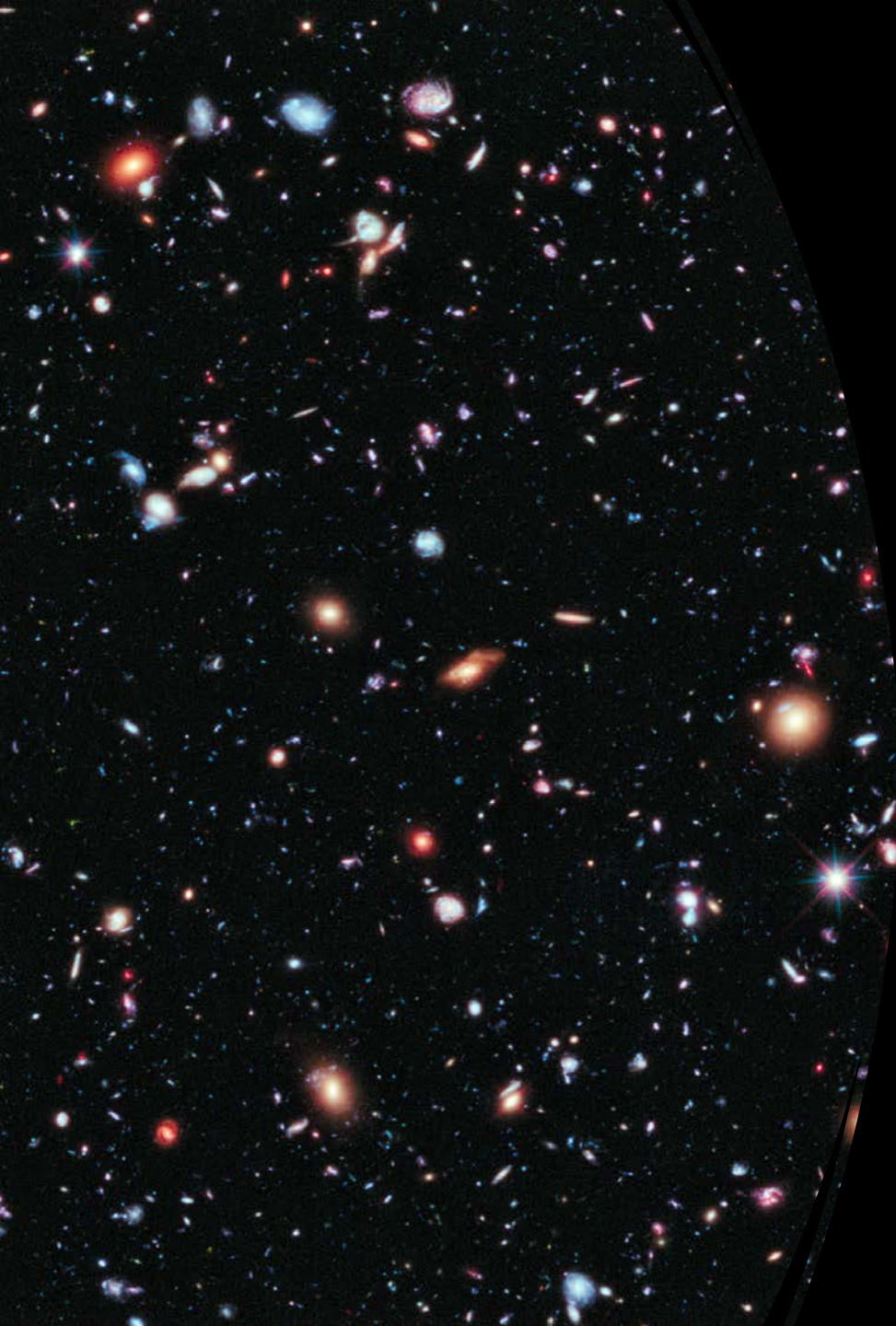
# Supernovae

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- Supernova: powerful explosion of a massive star/white dwarf
- Played a key role in Prof. Perlmutter's 2011 Nobel Prize-winning research







# Cosmology: studying the universe on the *largest* scales

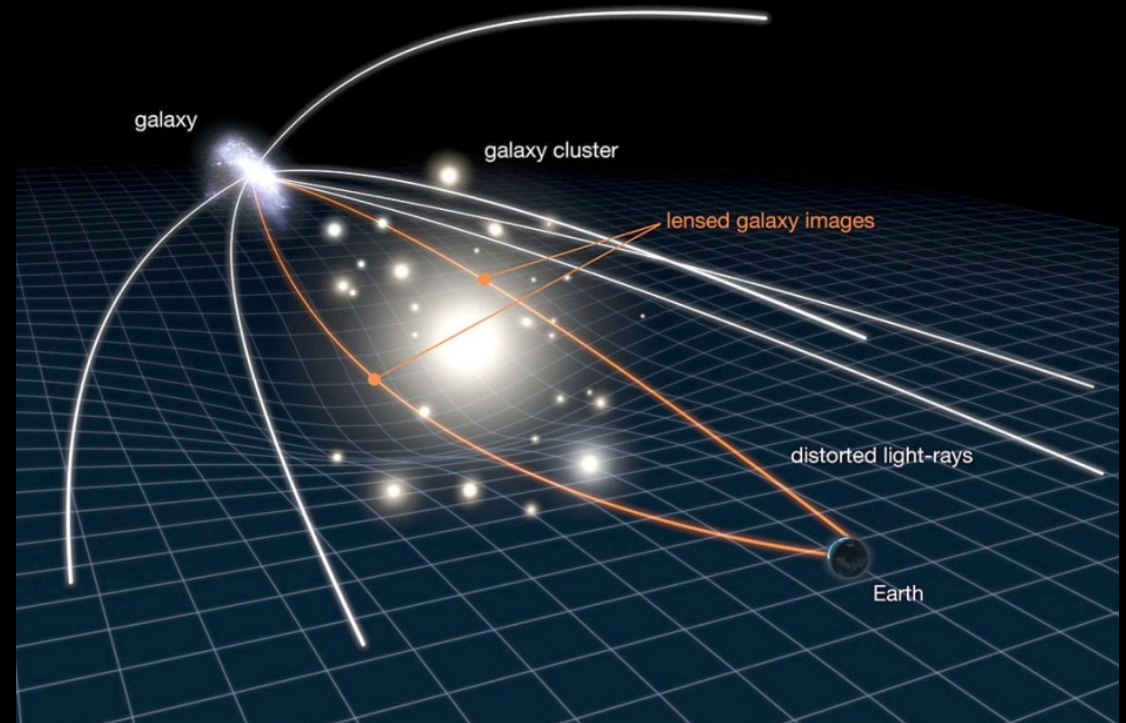
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1. How fast is the universe expanding? ( $H_0$ )
2. What is the nature of dark matter?
3. What is the distribution of matter in the universe?
4. ... and many more

# Does Light Bend?

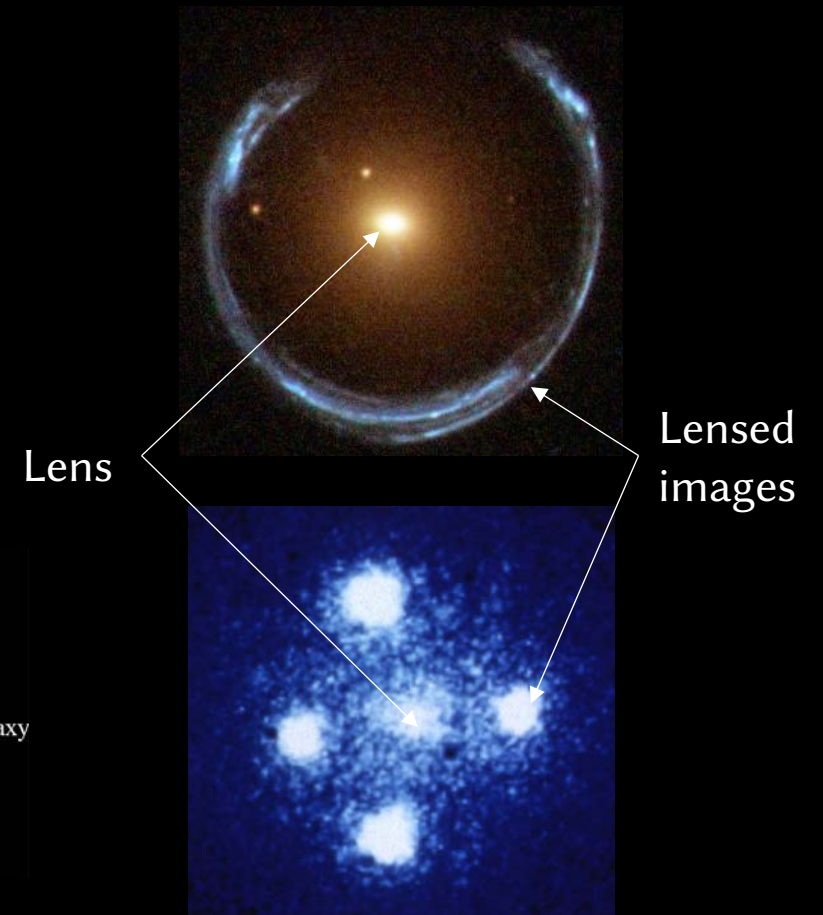
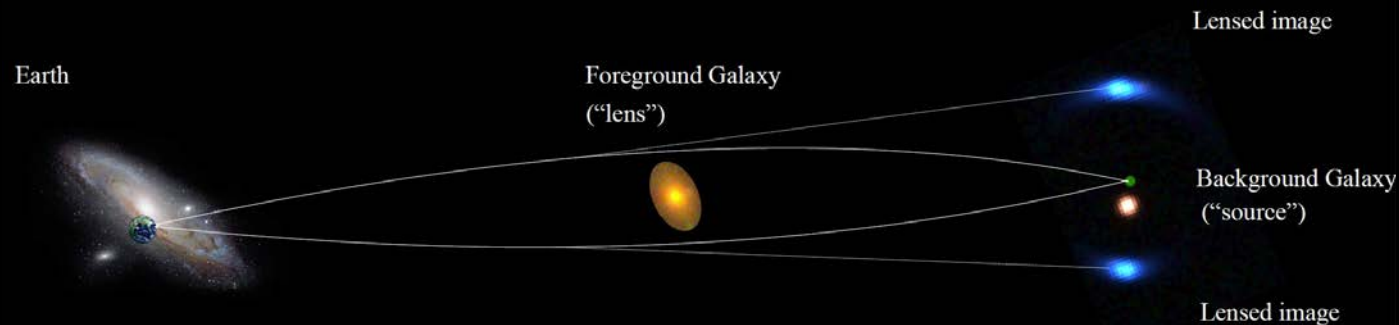
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- Einstein proposes general relativity in 1915
  - Light is affected by gravity, too!



# Strong Gravitational Lensing

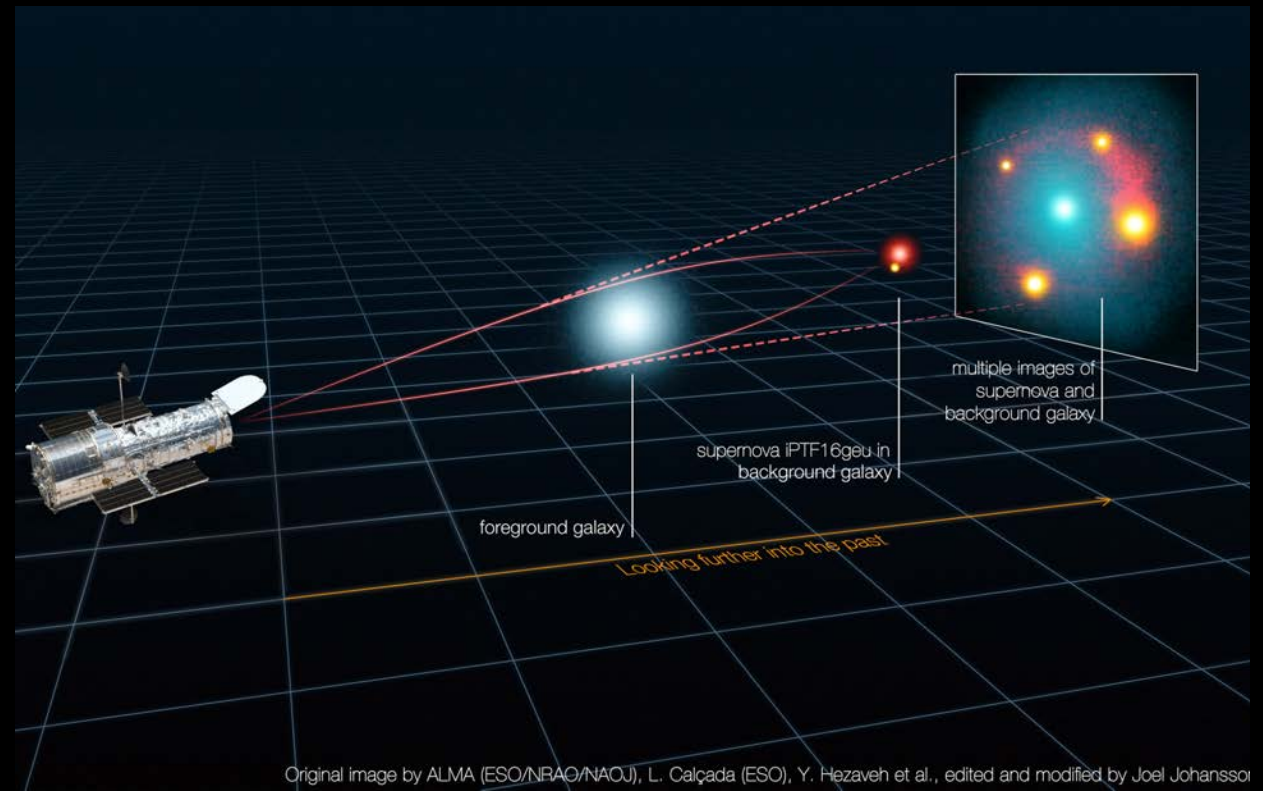
- Warping of space-time by the mass of the foreground galaxy
- Large arcs & multiple images
- Chance alignment (1 in 10000)





# Applications of Lenses

- Probe for dark matter/energy
- Infer mass distribution of lensing galaxy
- Sensitive measurement of  $H_0$

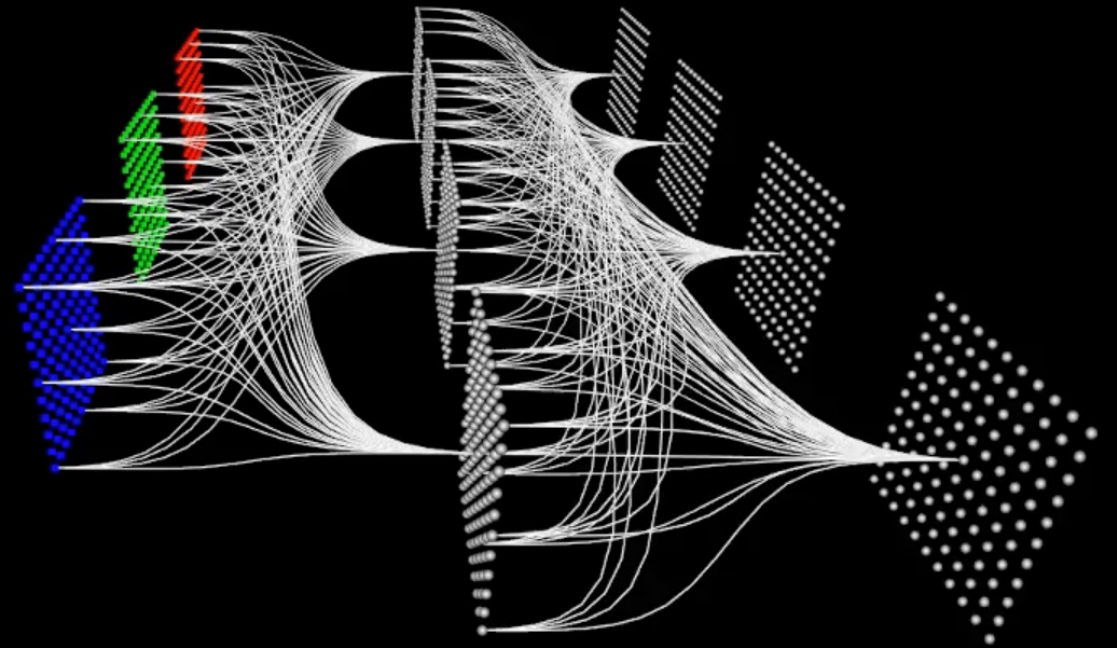




# Step 1: Finding Lenses

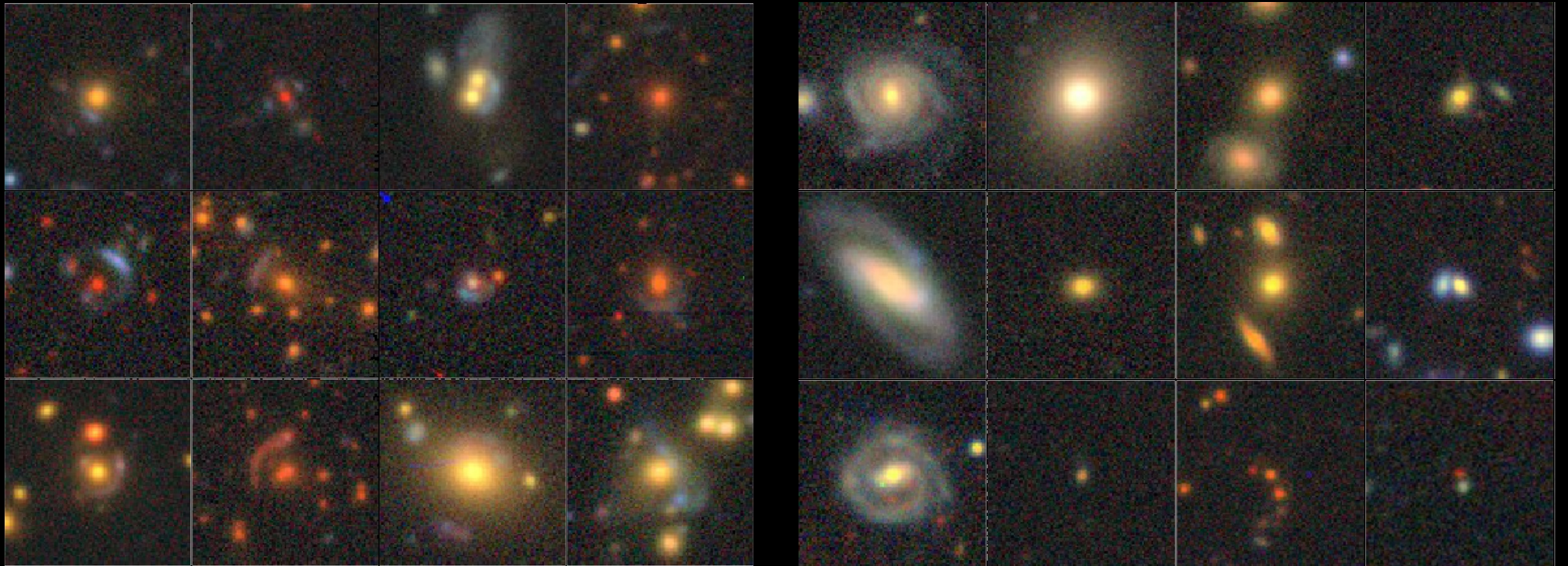
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- Problem: lenses are a  $\sim 1/10000$  occurrence
- Solution: use artificial intelligence (convolutional neural networks)



# Lenses and Non-lenses

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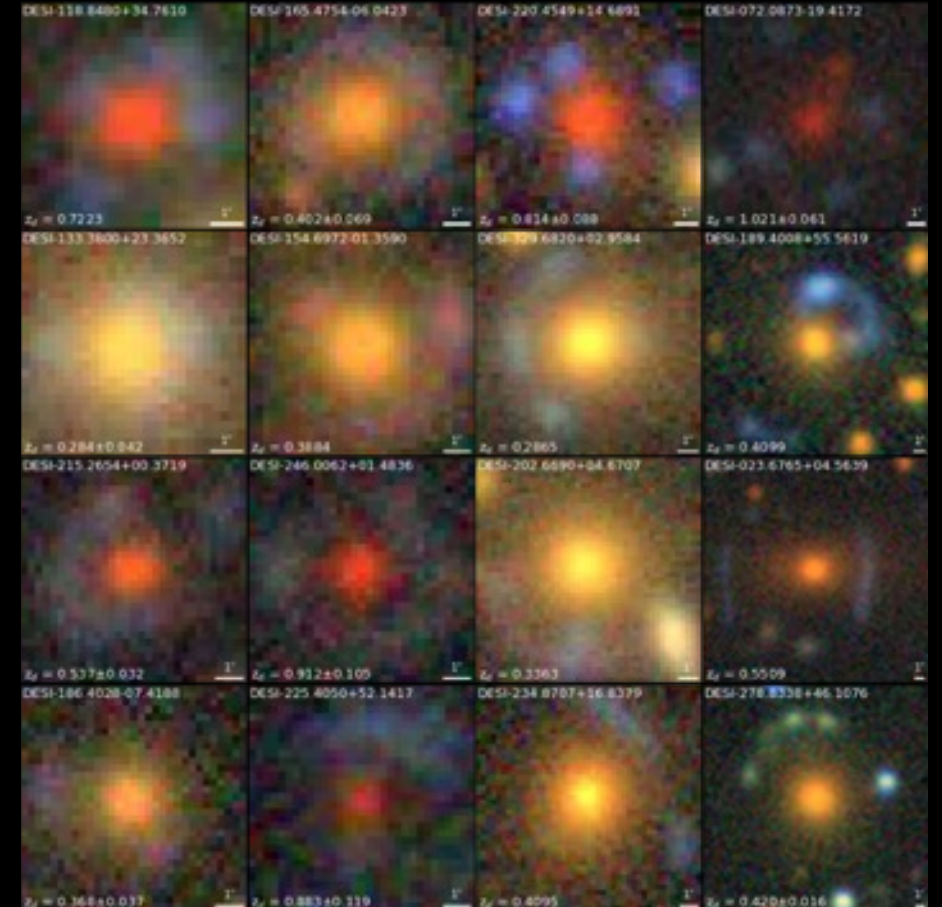




# Step 1: Finding Lenses

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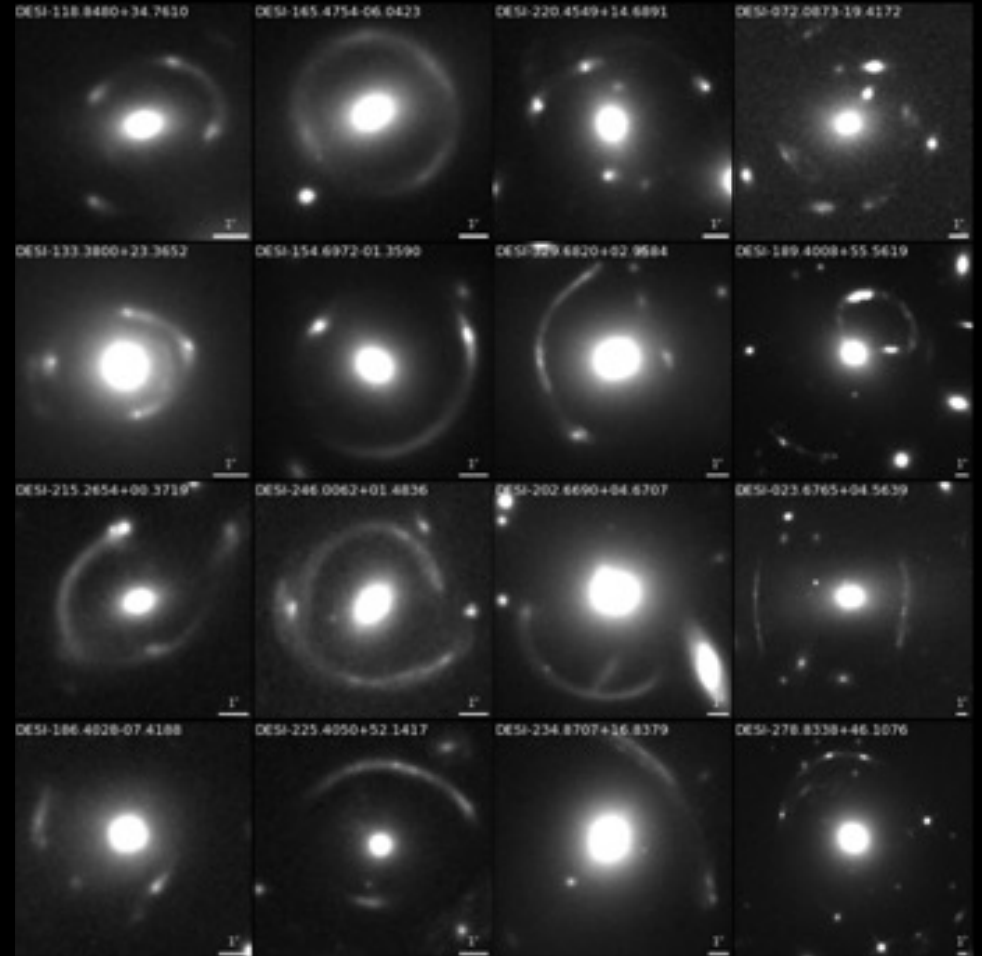
- Our success rate: 1/30 recommendations is a lens
- Discovered over 3000 new lenses
- Open questions: can we get the AI to **explain** why it makes its recommendations?



# Step 2: Modelling Lenses

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1. Acquire high quality images of lenses
2. Infer properties about the lensing system ('modelling')
3. Apply inferences to scientific questions



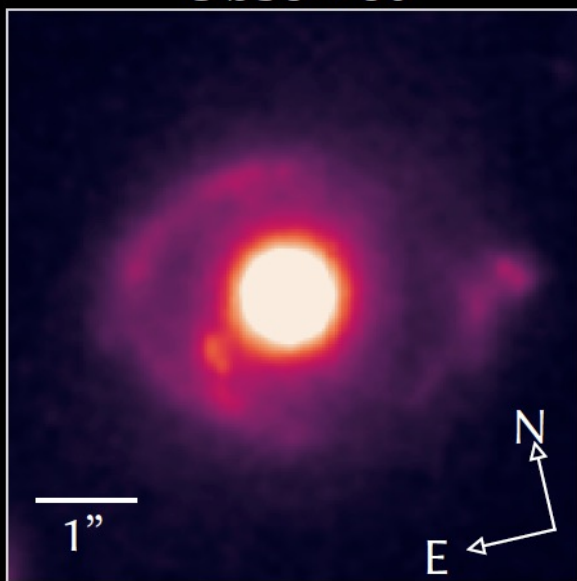


# How to Model a Lens

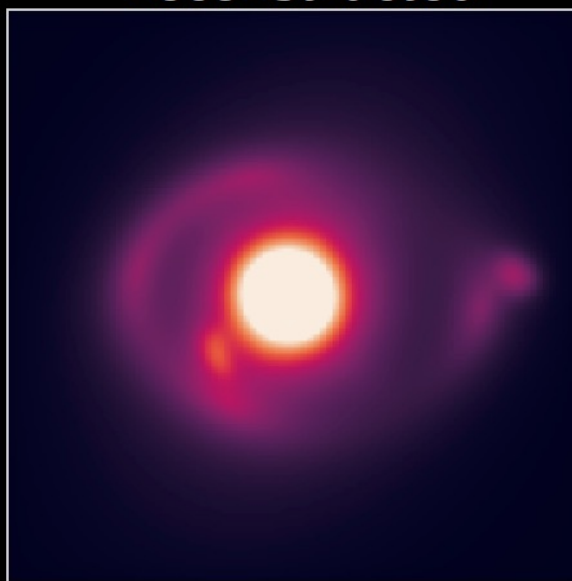
Adjust

1. Parameterize the system
2. Guess parameters
3. Calculate the consequences of the guess (simulate)
4. Compare simulation with observation

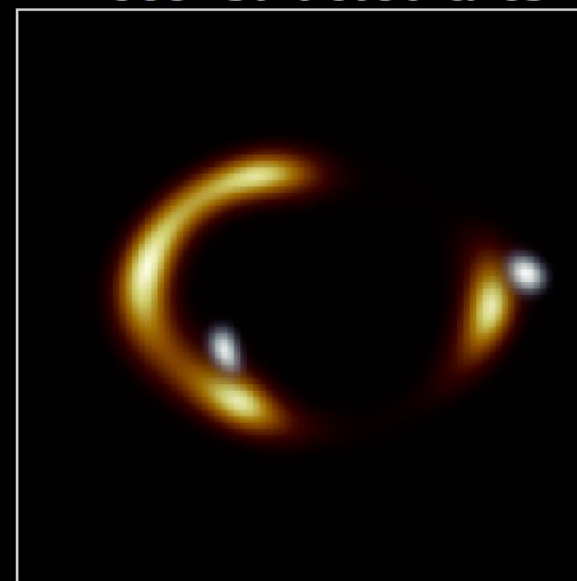
Observed



Reconstructed



Reconstructed arcs



# Conclusion

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- Only advice: explore broadly
- If you do explore... cosmology is a great option!
  - Ask hefty and interesting physics questions
  - Apply cutting edge techniques from other fields
  - Work closely with data