

# **GOLUM: A fast and precise methodology to search for strong gravitational wave lensing**

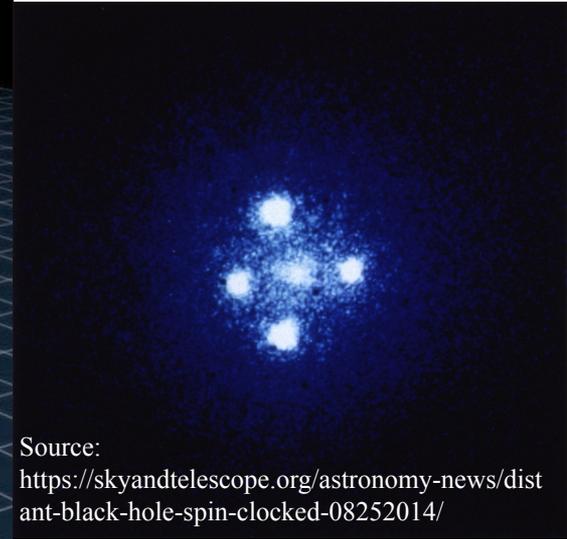
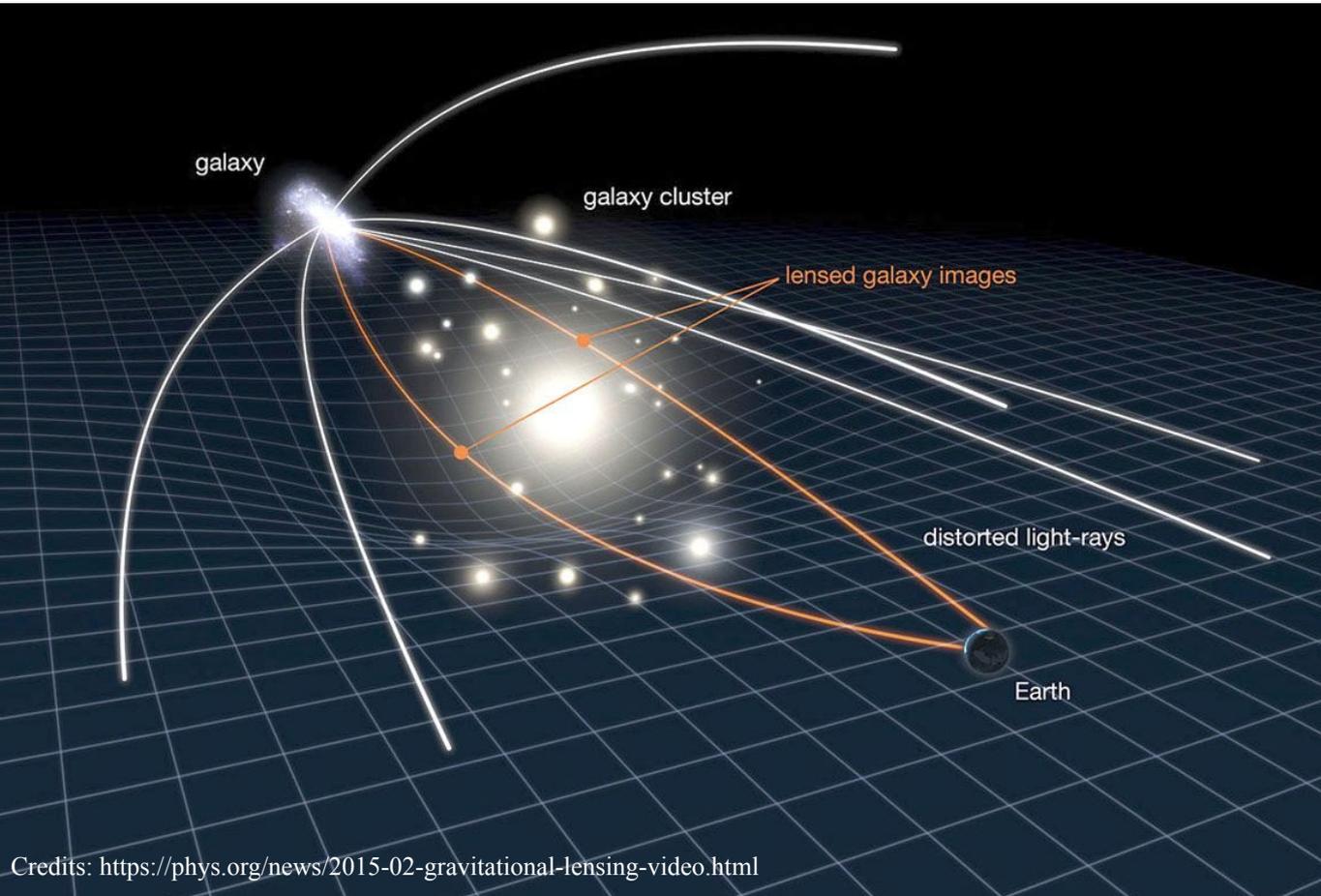
J. Janquart, O.A. Hannuksela, K. Haris, C. Van Den Broeck



Utrecht University

Nik|hef<sub>1</sub>

# What is lensing?

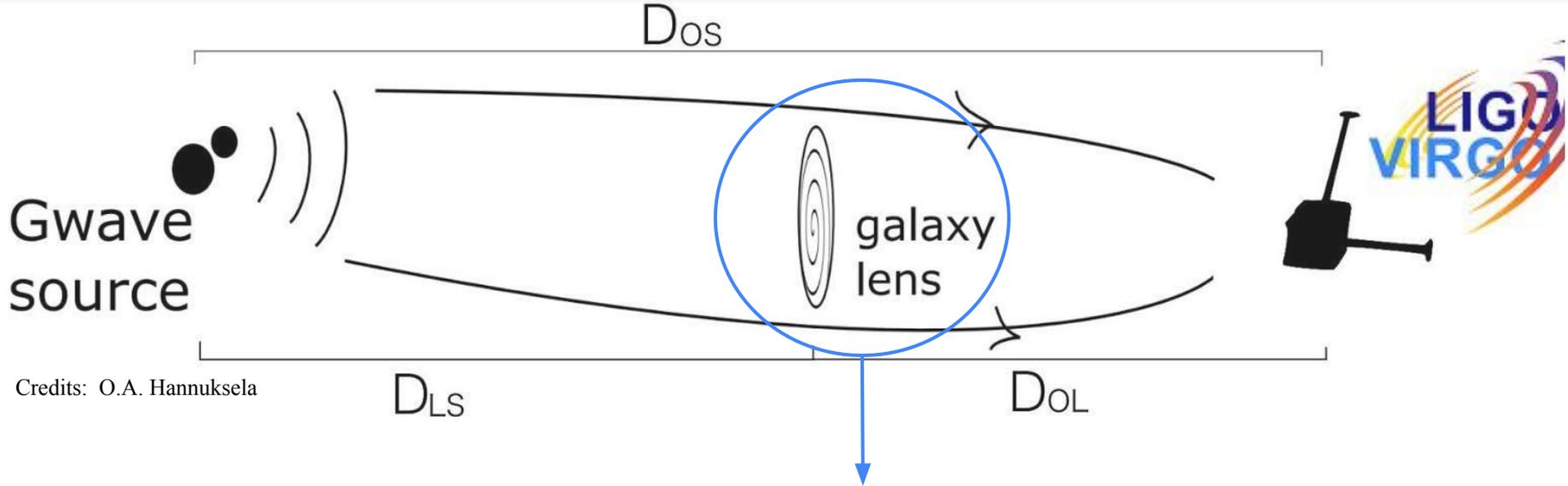


Source:  
<https://skyandtelescope.org/astronomy-news/dist-ant-black-hole-spin-clocked-08252014/>

Credits: <https://phys.org/news/2015-02-gravitational-lensing-video.html>

# What is lensing for GW?

→ Same principle as for light



Credits: O.A. Hannuksela

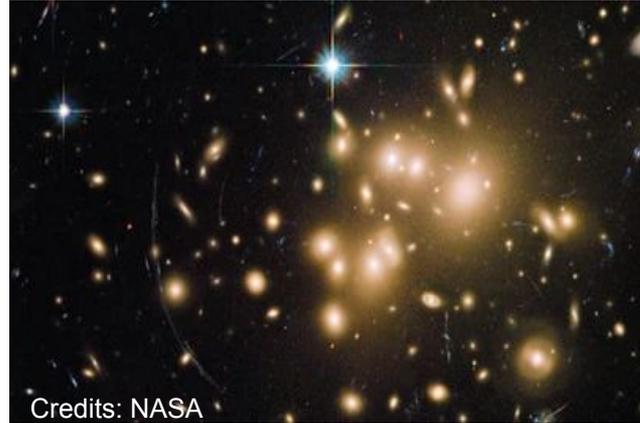
If lens properties change, effects on GW change

# What can lensing do?

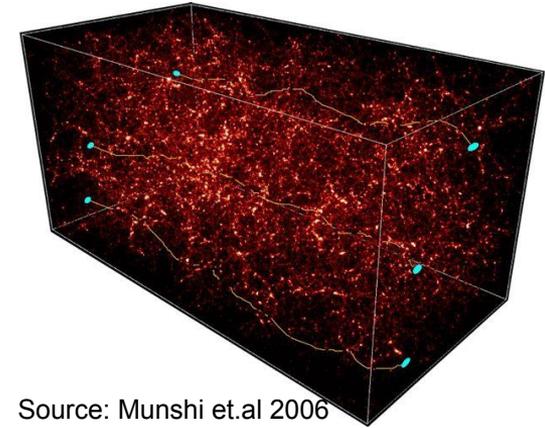
Strong lensing: Multiple “images”



Weak lensing: one magnified image



Micro-lensing: one distorted image



Heavy lenses

Ex: galaxies, galaxy clusters

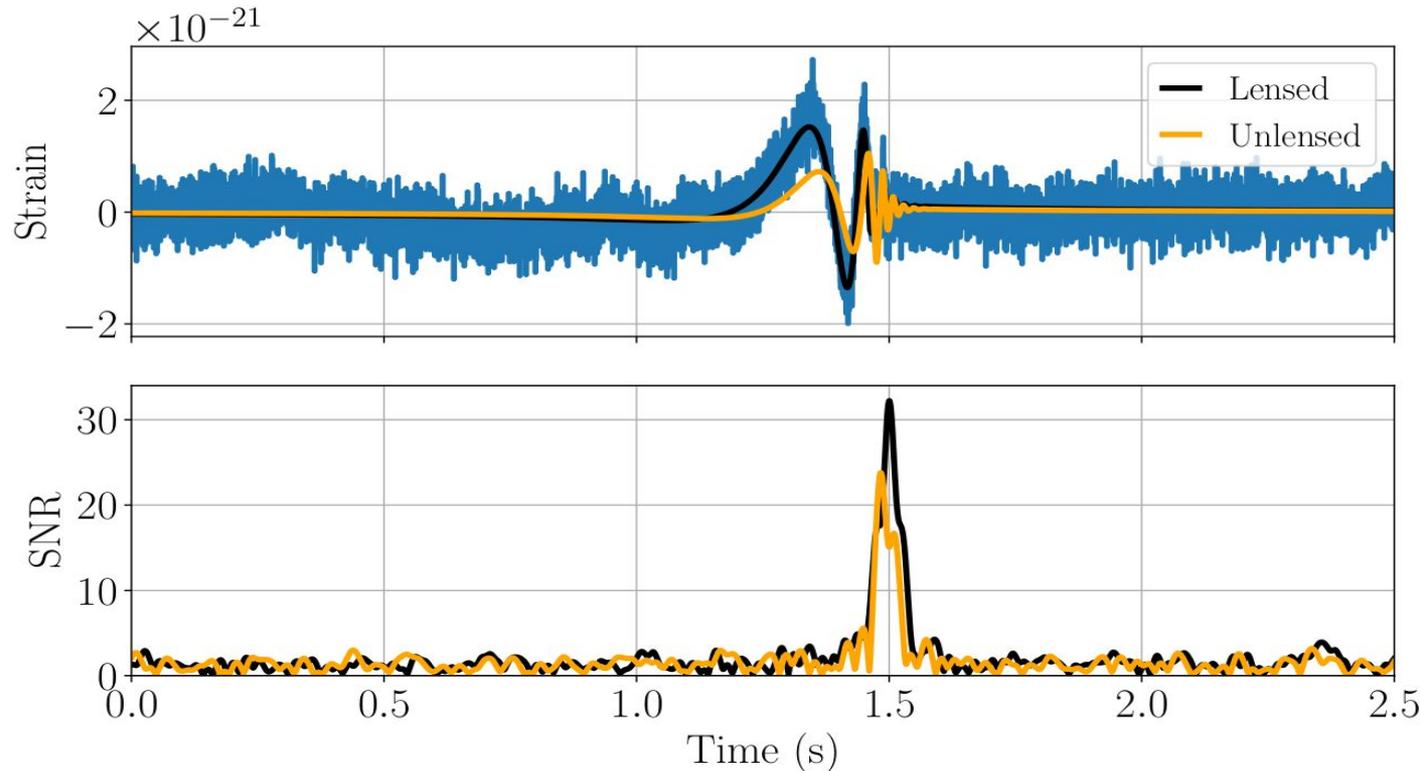
Median lenses

Ex: galaxies, black-holes

Any lenses

Ex: black-holes, neutron stars

# What happens when a GW passes by a small compact object?



→ Lens characteristics can be studied via the GW distortion

## Examples:

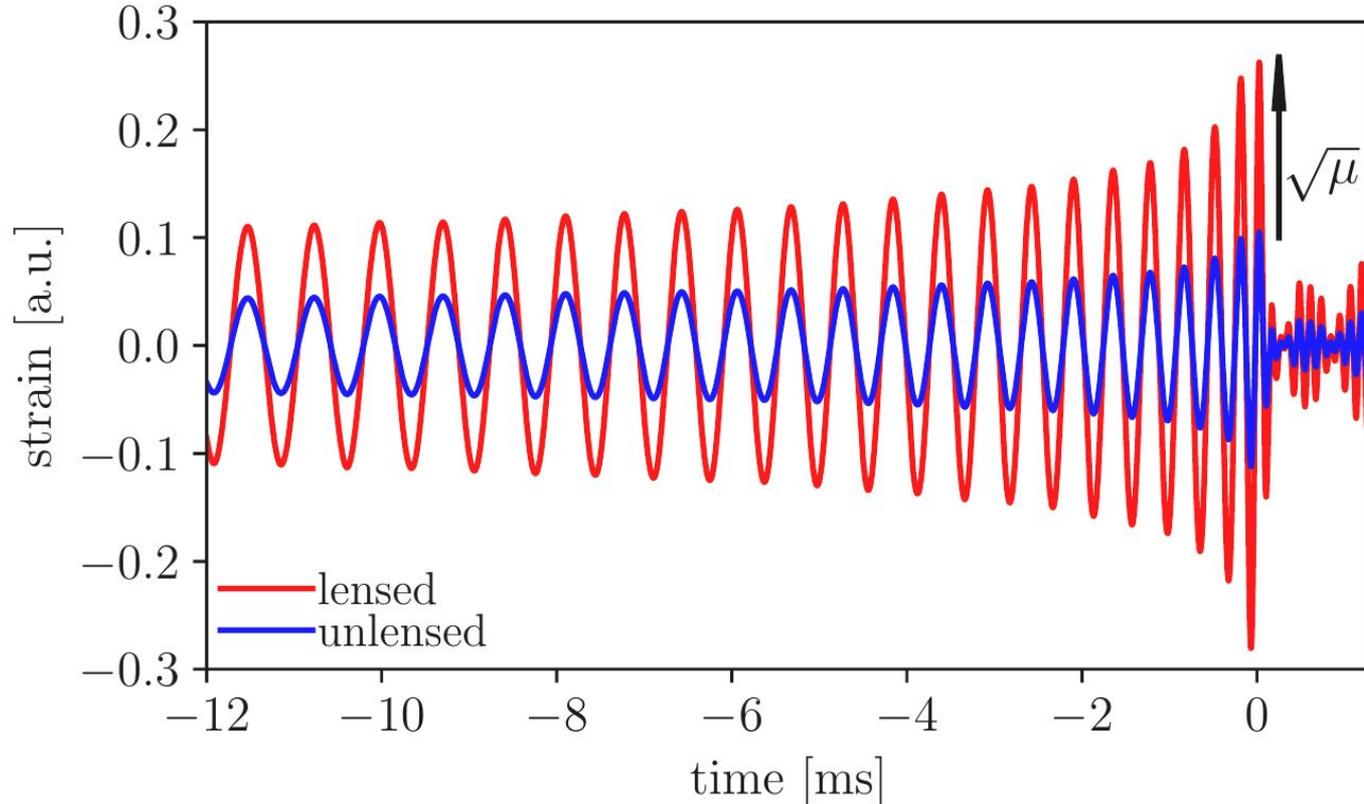
- Study of primordial black holes (Jung et al., 2019)
- Detection of intermediate mass black holes (Lai et al., 2017)

Source: “*LensingGW: a Python package for lensing of gravitational waves*”, Pagano et. al

# What happens when a GW is weakly lensed?

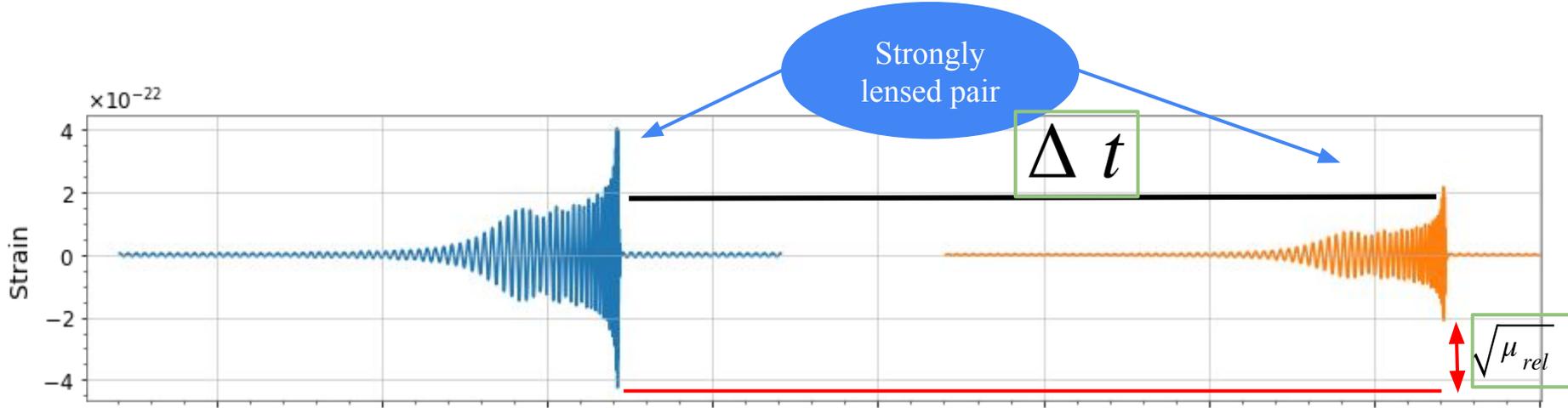
One magnified wave is observed (bias in detected luminosity distance)

Undetectable for BBH; can be used in BNS (luminosity distance and tidal deformability not matching) (Pang et al., 2020)



# What happens when a GW is strongly lensed?

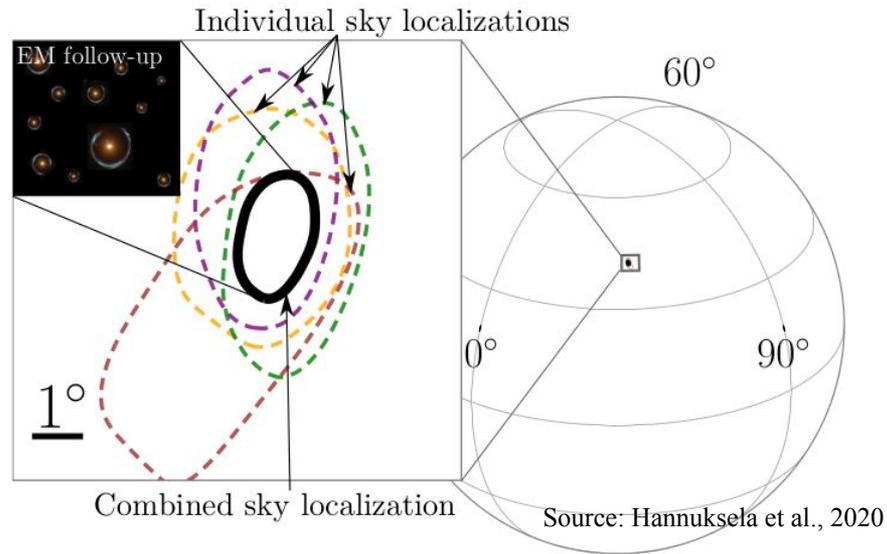
N (typically 2 or 4) repeated events, linked by 3 lensing parameters, with same frequency evolution



+ Overall phase shift  $\rightarrow$  Morse factor  $n_{12}$

# Once we detect strong lensing, then what?

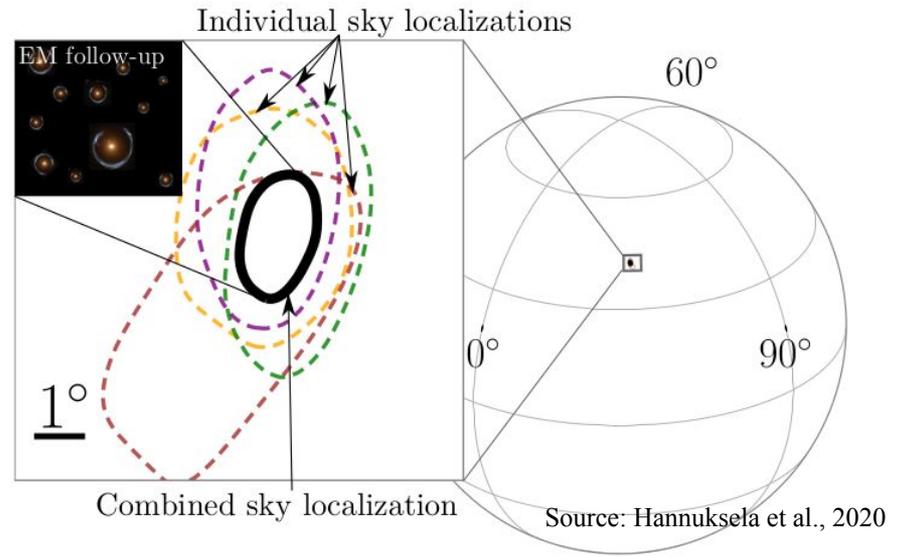
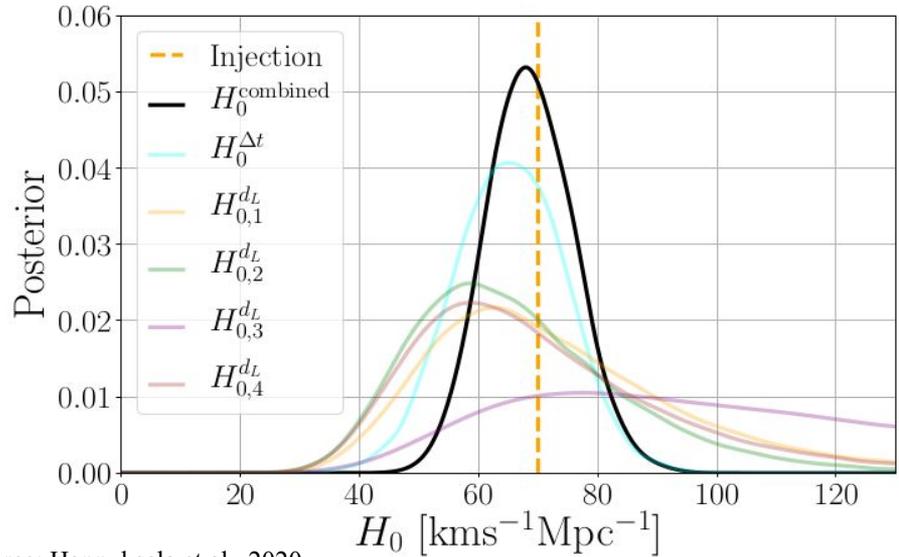
- Study the origin of merging black holes (Hannuksela et al., 2020)



Combining sky locations and electromagnetic data  
→ 1 possible host galaxy

# Once we detect strong lensing, then what?

- Study the origin of merging black holes (Hannuksela et al., 2020)
- Study the expansion of the Universe (Hannuksela et. al, 2020; Liao et. al, 2017)
- Probe fundamental physics (Collett & Bacon, 2017 ; Fan et al. 2017)



Combining sky locations and electromagnetic data  
 → 1 possible host galaxy

→ 5 Hubble constant measure from 1 lensed event

Source: Hannuksela et al., 2020

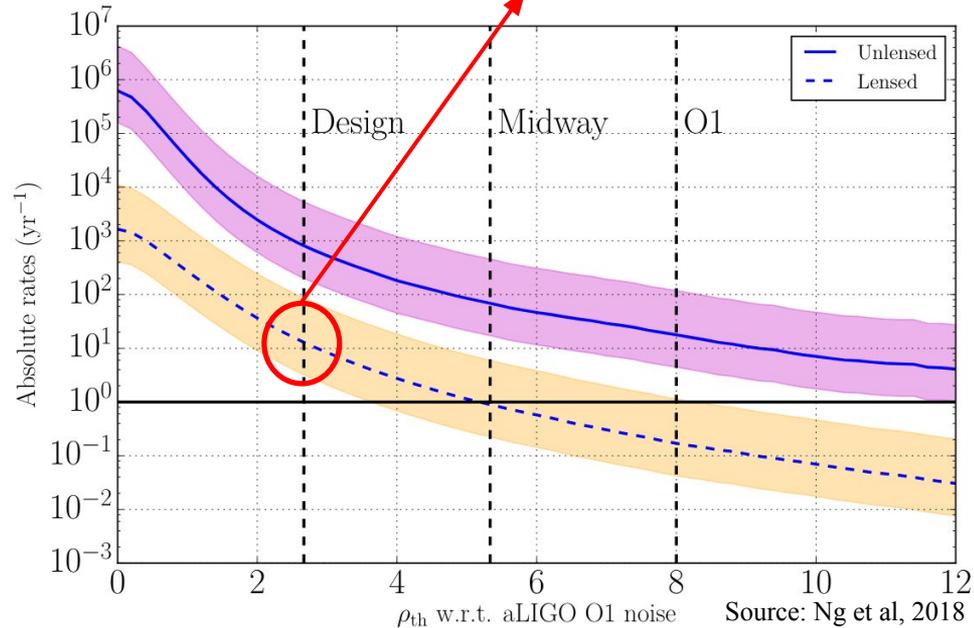
# How do we search for strong lensing?

Non-negligible rate at design sensitivity

Already started as predicted in the coming years:

- For O2: <https://arxiv.org/pdf/1901.02674.pdf>
- For O3a: <https://arxiv.org/pdf/2105.06384.pdf>

→ So far, no evidence for lensing



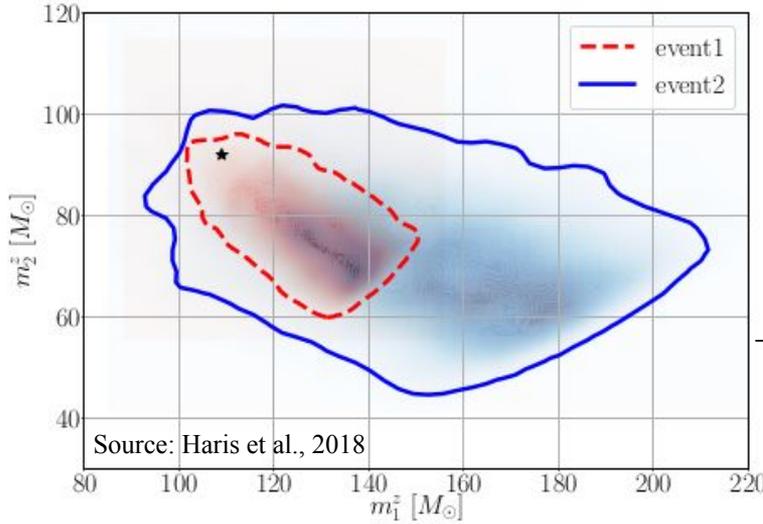
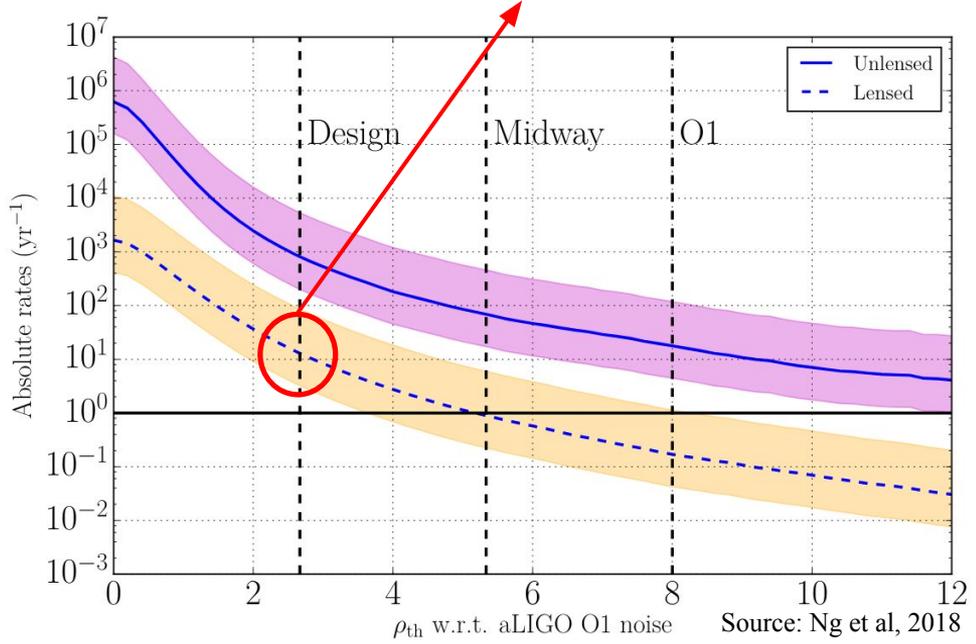
# How do we search for strong lensing?

Non-negligible rate at design sensitivity

- Already started as predicted in the coming years:
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  - For O3b: <https://arxiv.org/pdf/2105.06384.pdf>

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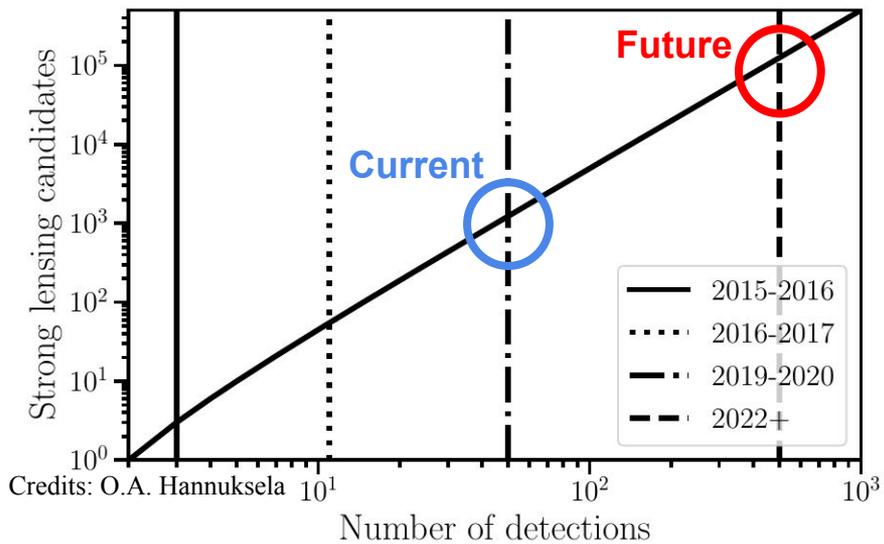
**Basic idea:**  
Look for events with consistent posterior distributions and linked via the lensing parameters



→ Masses of the events are consistent

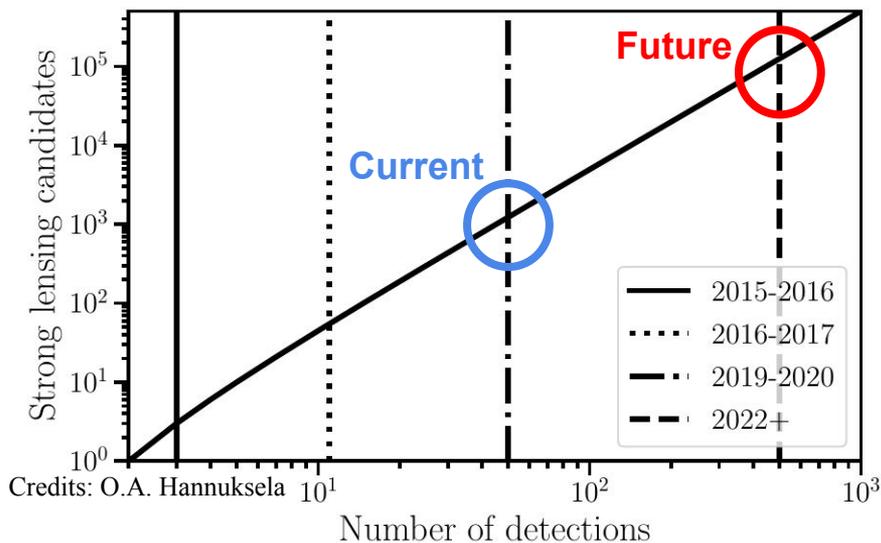
# Why develop a new method?

Increasing number of pairs



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Increasing number of pairs



Current methods:

- Posterior overlap<sup>1</sup>: Fast (CPU time ~ minutes), not very precise
- Full joint parameter estimation<sup>2, 3</sup>: computationally expensive (CPU time ~ month(s)), very precise

**Goal:** Evaluate the coherence ratio:  $C_U^L = \frac{p(d_1, d_2 | H_L)}{p(d_1, d_2 | H_U)}$

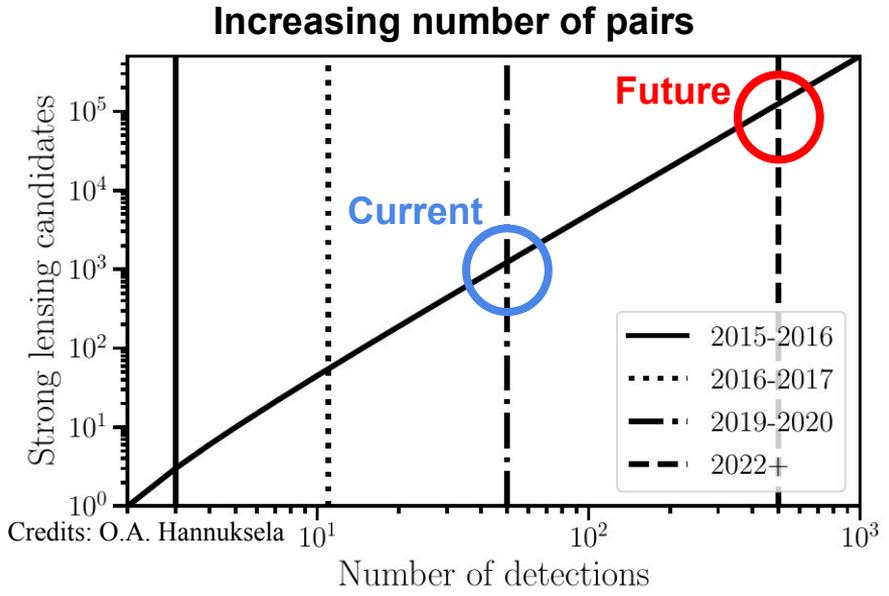
~ evaluate the probability to have lensing against no lensing

1. "Identifying strongly lensed gravitational wave signals from binary black hole mergers", Haris et. al 2018

2. "Identifying strong gravitational-wave lensing during the second observing run of Advanced LIGO and Advanced Virgo", Liu et. al, 2020

3. "A Bayesian statistical framework for identifying strongly-lensed gravitational-wave signals", Lok Lo & Magaña Hernandez, 2021

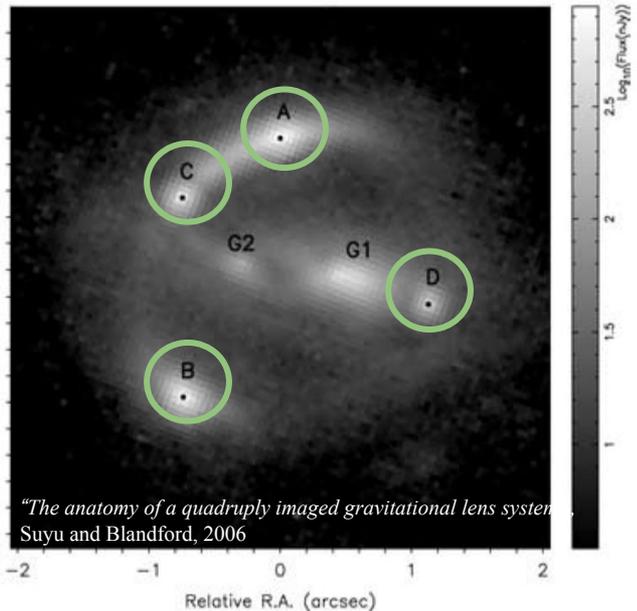
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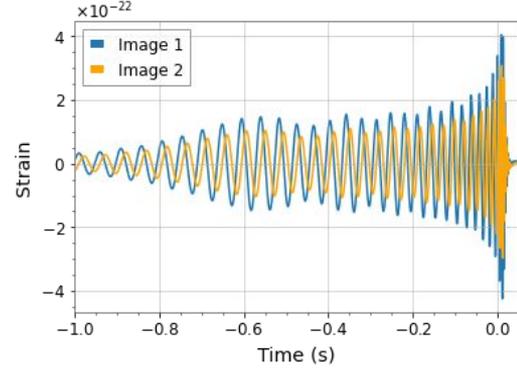
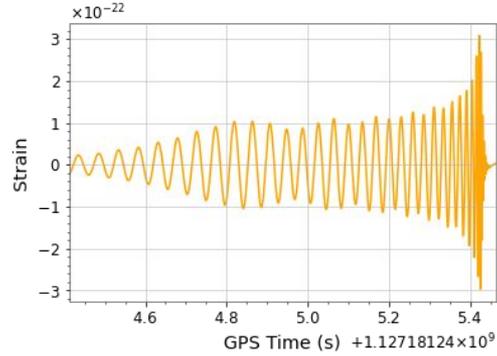
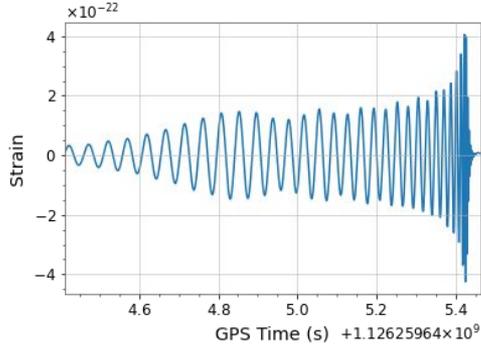
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Joint analysis of multiple images

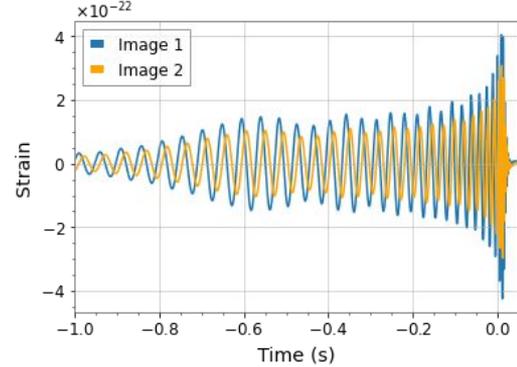
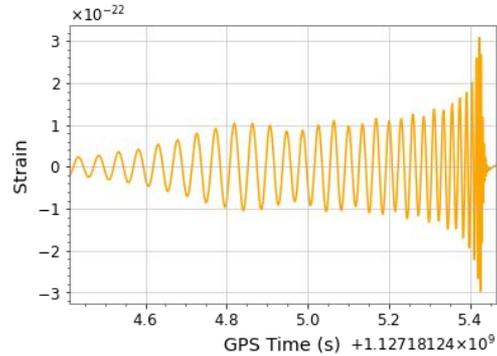
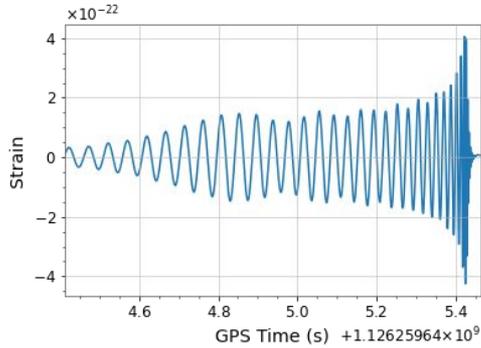


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# How do we analyze analyze strong lensing in practice?



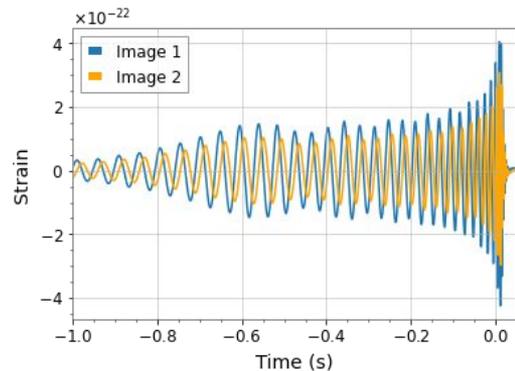
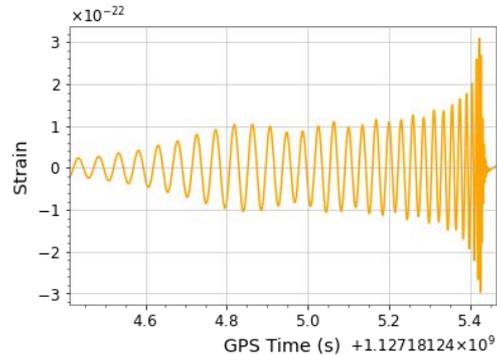
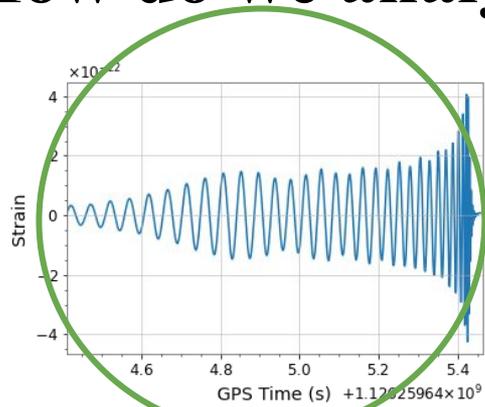
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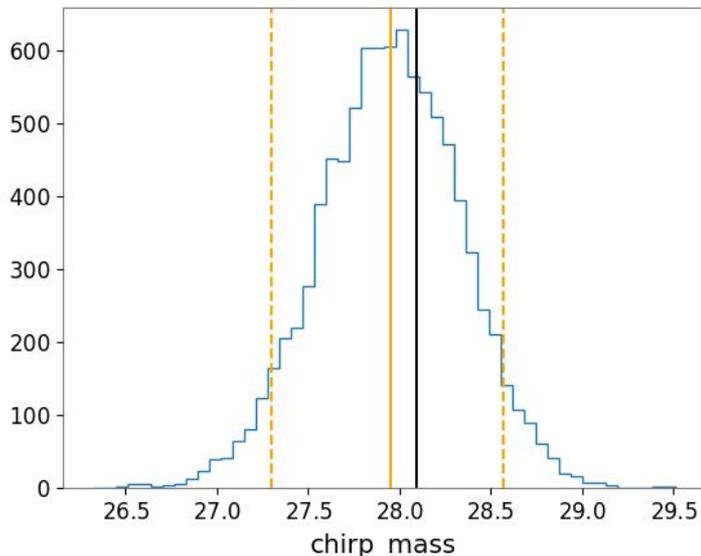
**GOLUM: Gravitational-wave analysis Of Lensed and Unlensed waveform Models**

**Idea:** Use the posteriors of the first image analysis as priors for the second image

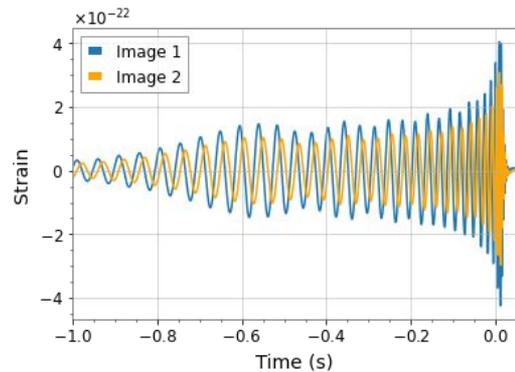
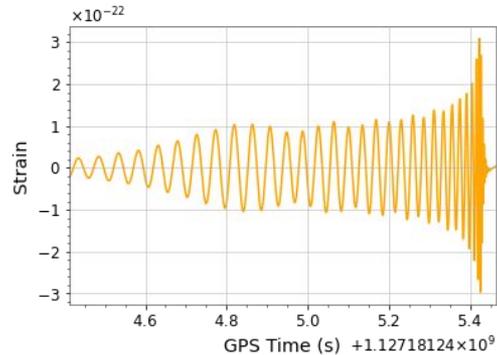
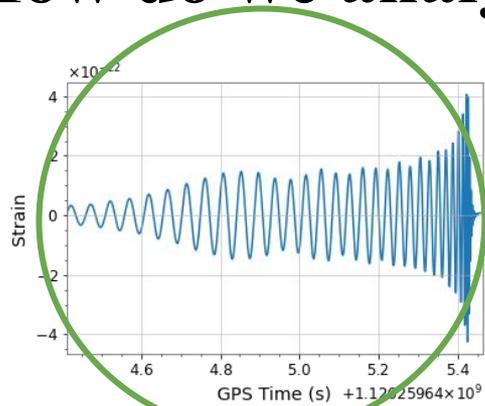
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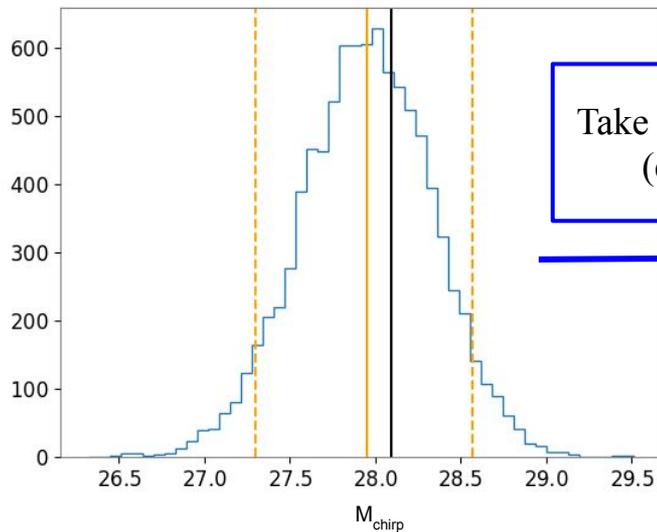
Analyze the first image



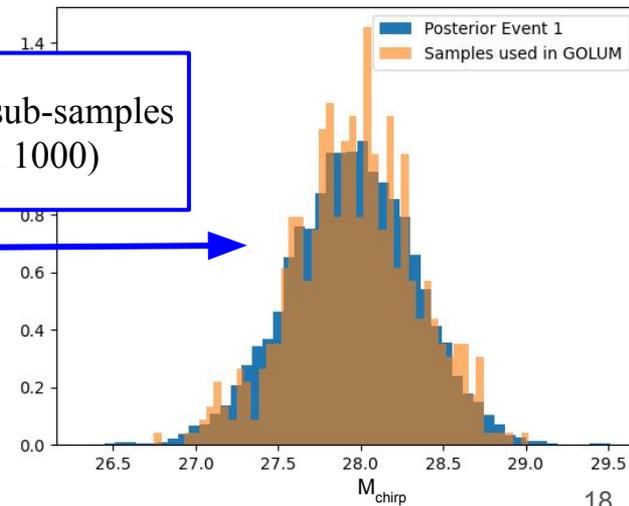
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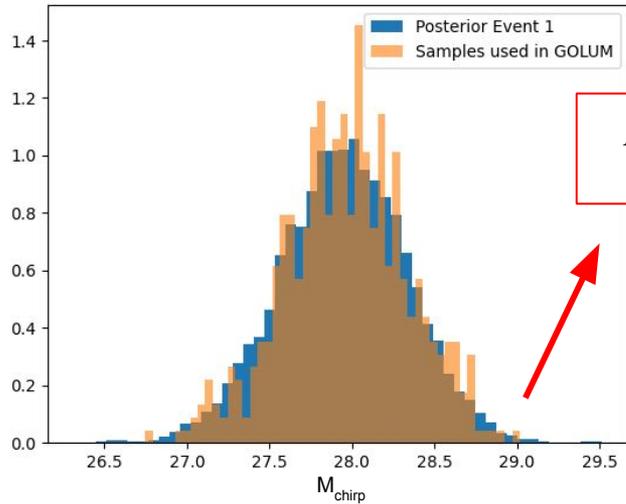
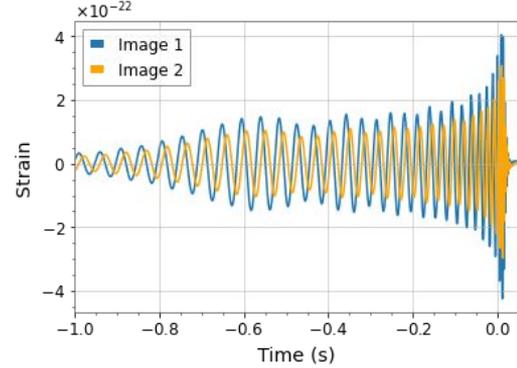
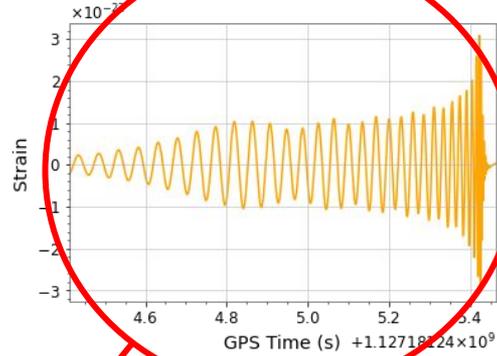
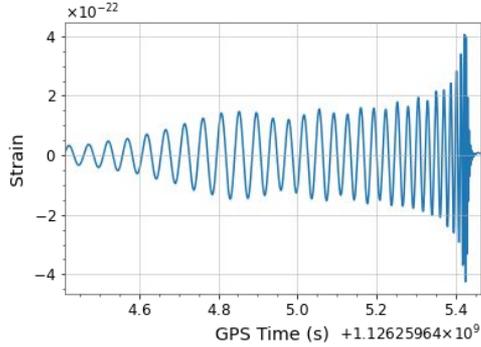
Analyze the first image



Take N sub-samples  
(e.g. 1000)

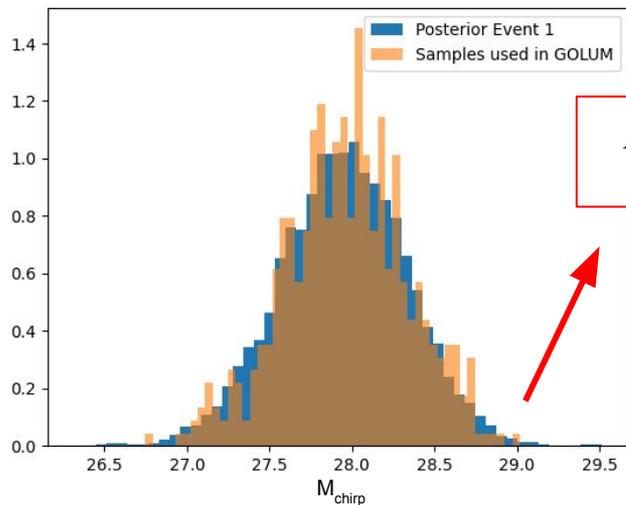
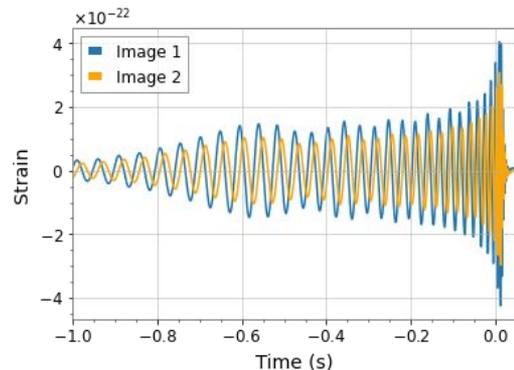
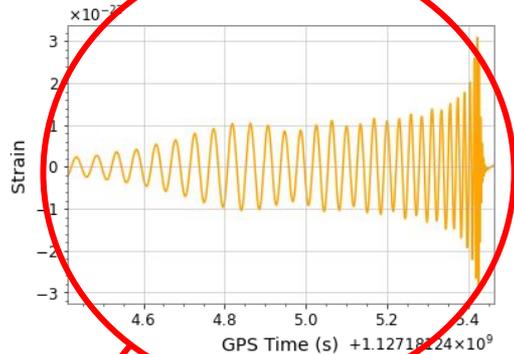
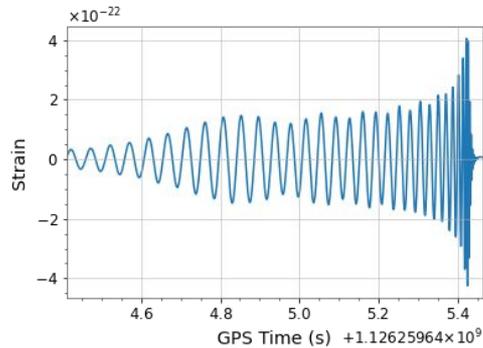


# How do we analyze analyze strong lensing in practice?

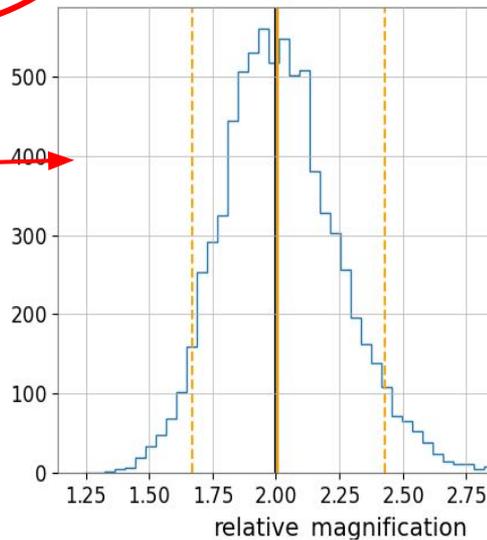


Analyze the second image

# How do we analyze analyze strong lensing in practice?



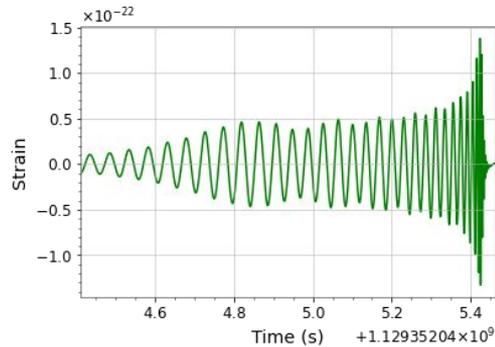
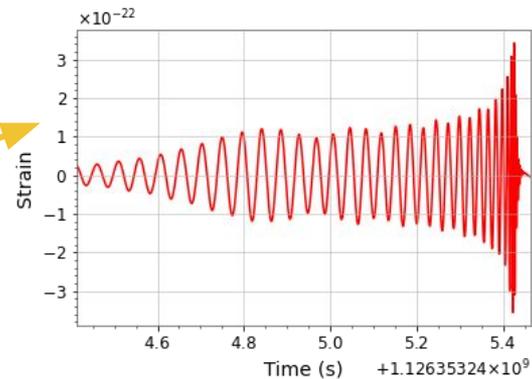
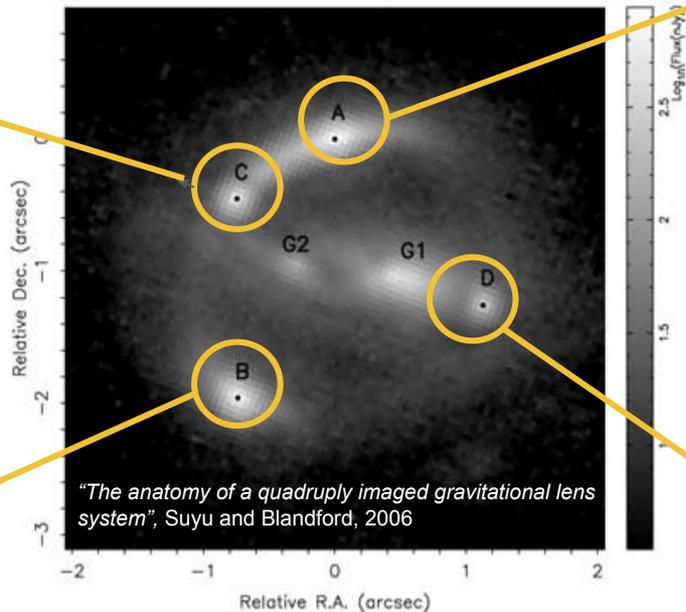
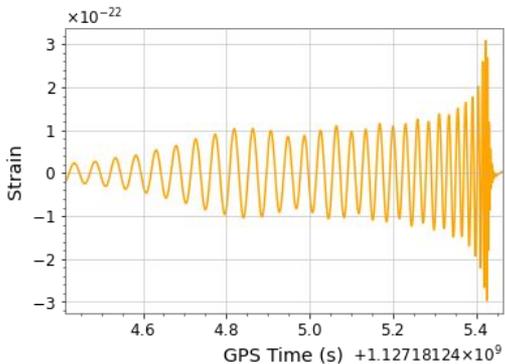
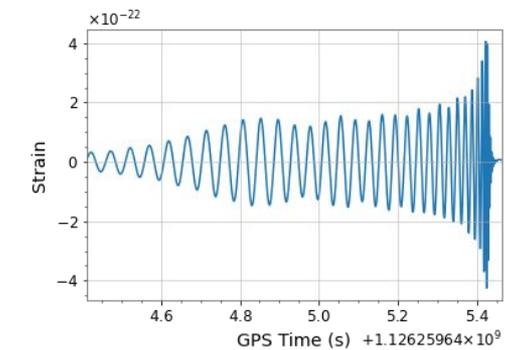
Analyze the second image



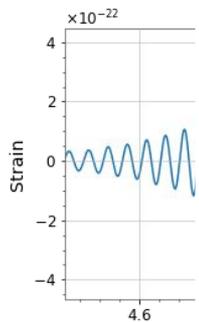
$\log(C_U^L) = 23.6$   
 Time:  $\theta(1 \text{ hr})$   
 If unlensed pair  
 $\log(C_U^L) = -14$   
 Follow-up analysis for  
 sub-threshold pairs  
 possible (and faster)

# And if quadruplet?

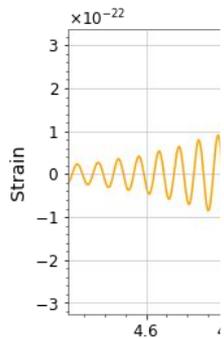
Are these linked?  
Location host galaxy of the BBH?  
Lens?



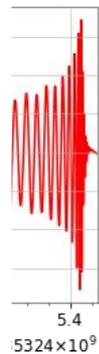
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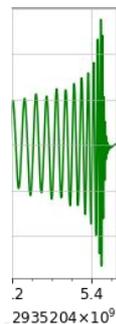
**× 3**



GPS Time (s)  $+1.12718124 \times 10^9$

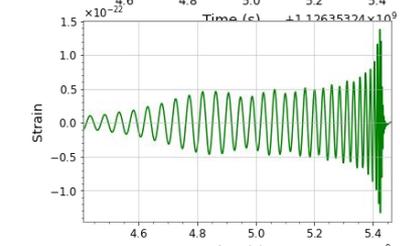
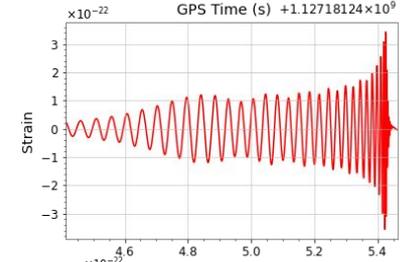
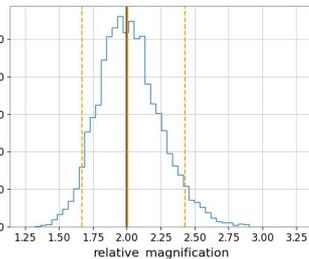
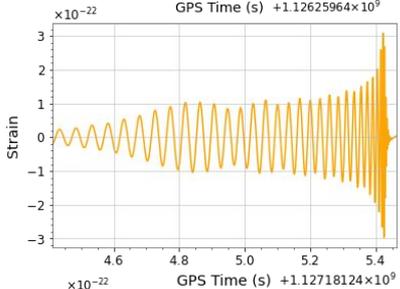
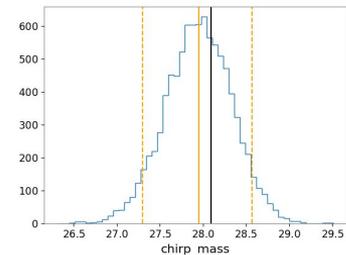
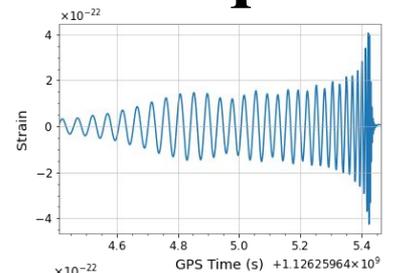


$5324 \times 10^9$

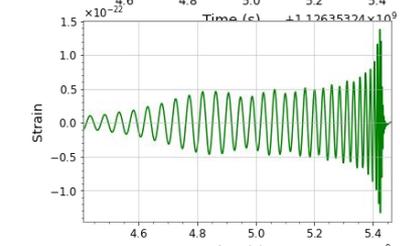
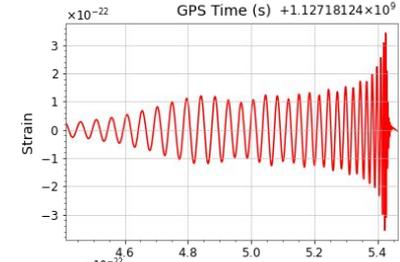
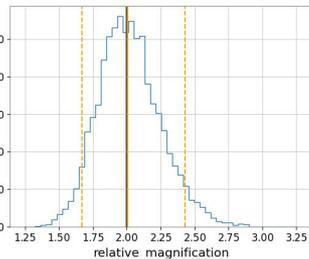
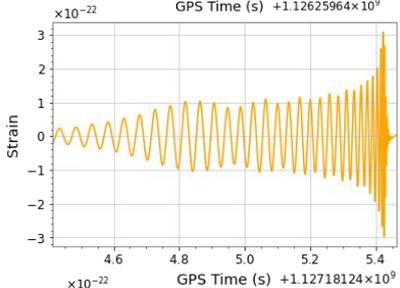
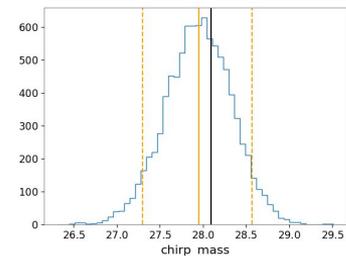
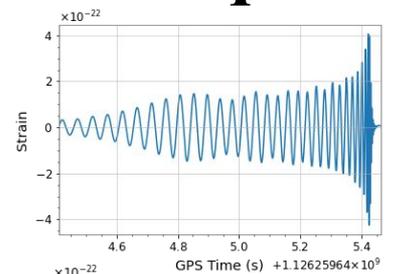


$2935204 \times 10^9$

# And if quadruplet?



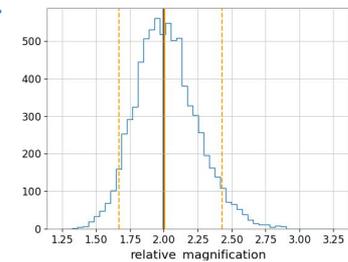
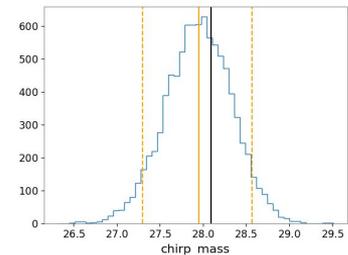
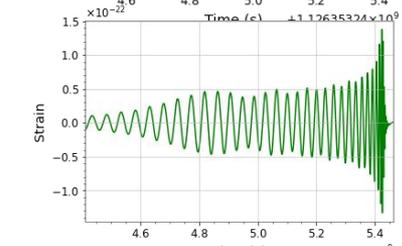
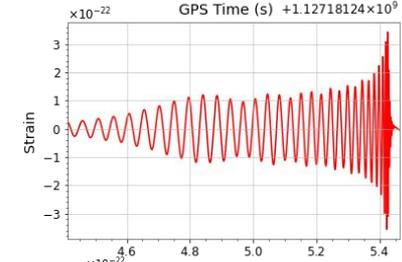
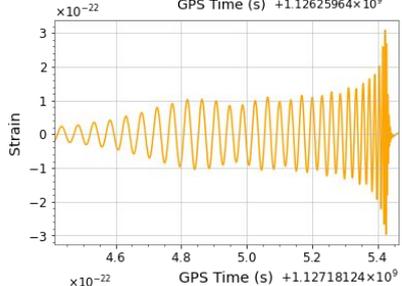
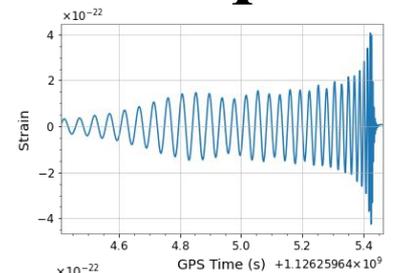
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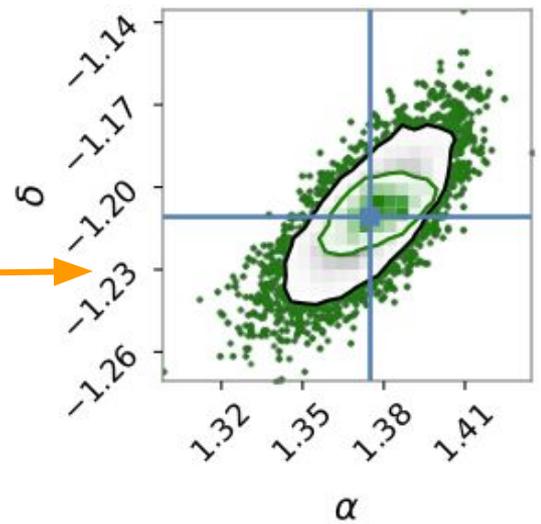
Reweighing



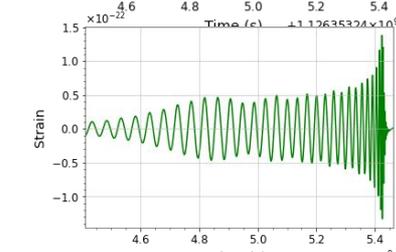
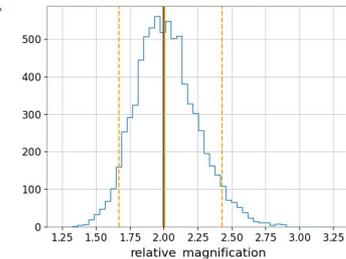
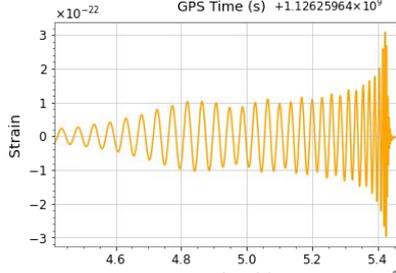
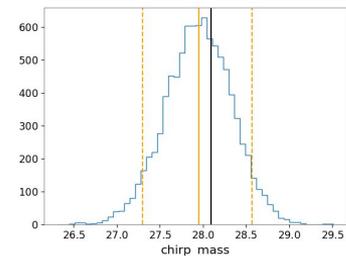
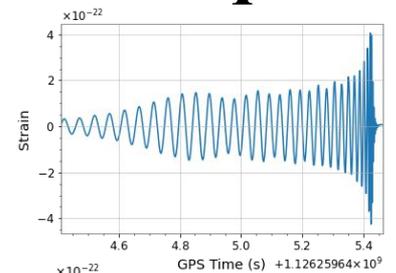
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Reweighting

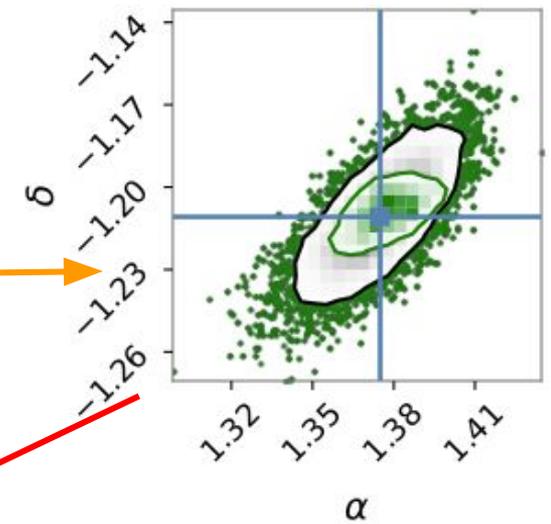


# And if quadruplet?

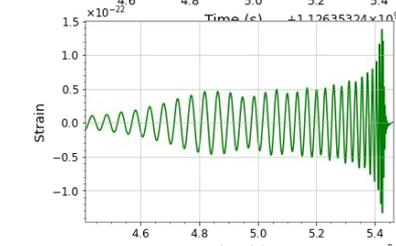
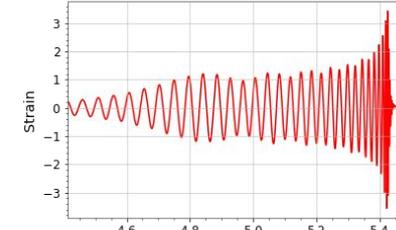
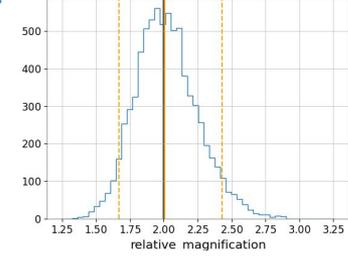
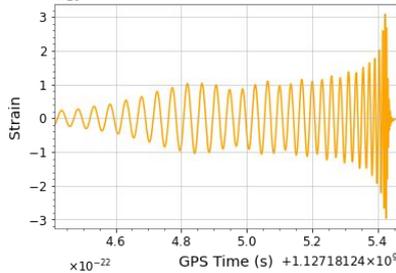
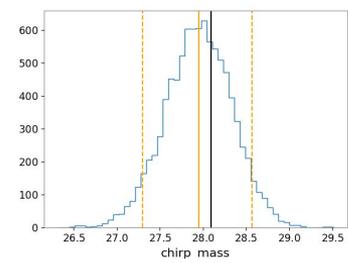
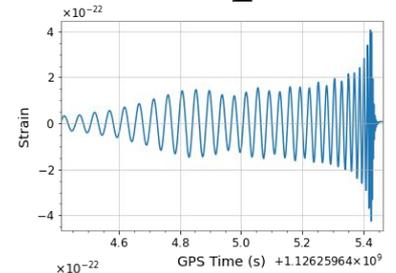


Reweighting

Golum + Reweighting



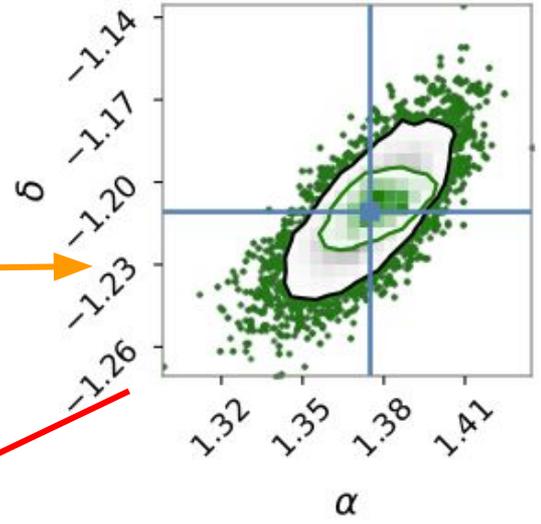
# And if quadruplet?



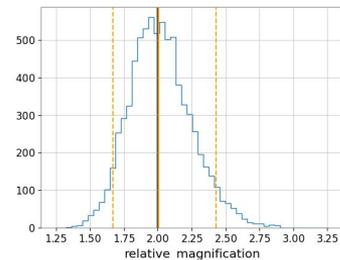
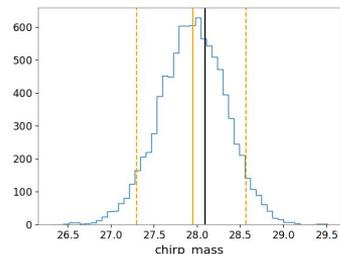
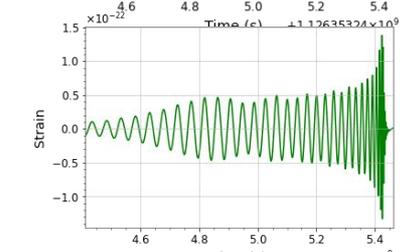
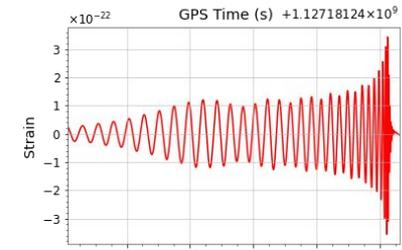
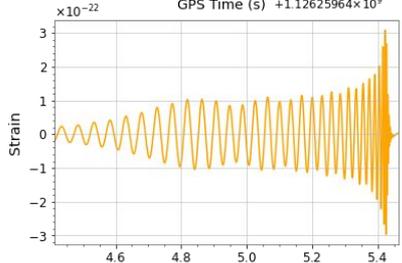
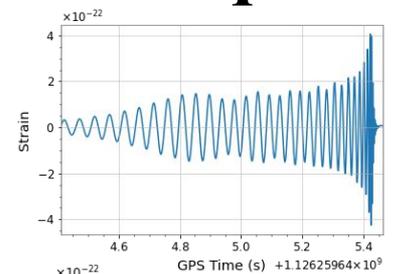
Reweighting

Golum + Reweighting

Reweighed samples for 3 images



# And if quadruplet?

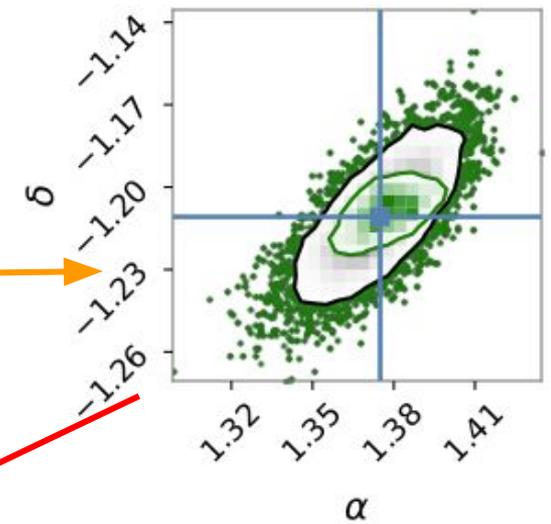


Reweighting

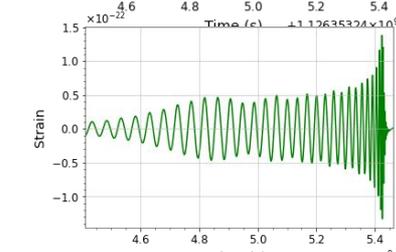
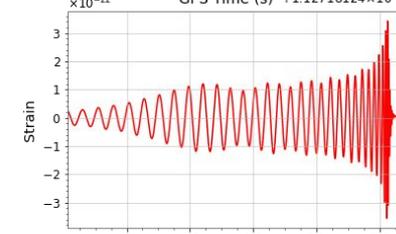
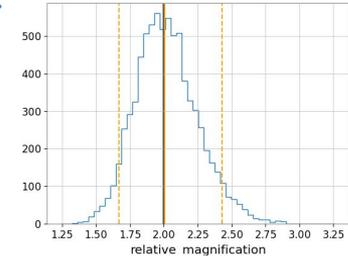
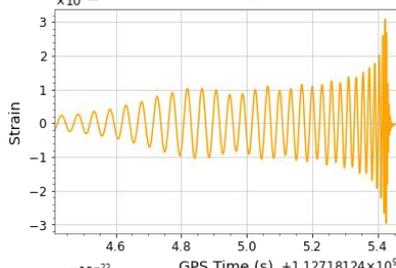
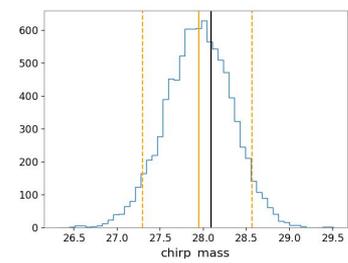
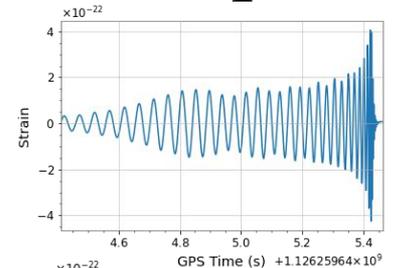
Golum + Reweighting

Reweighted samples for 3 images

Golum + Reweighting



# And if quadruplet?

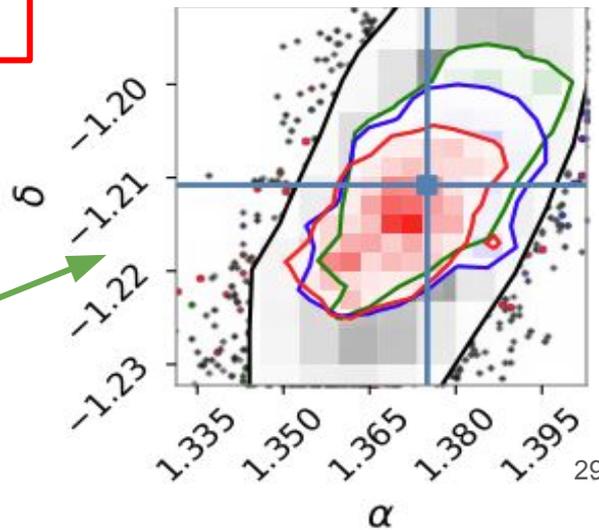
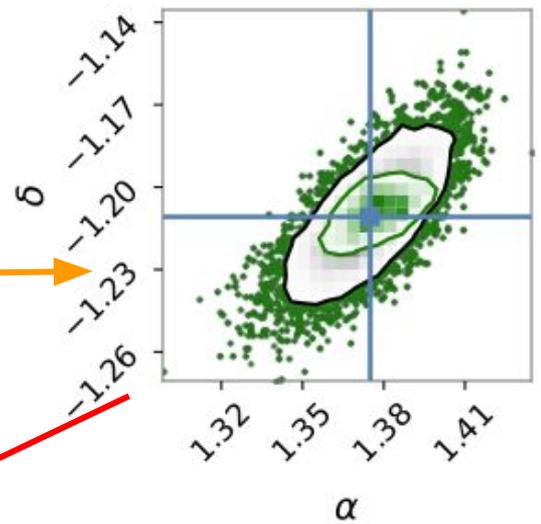


Reweighting

Golum + Reweighting

Reweighted samples for 3 images

Golum + Reweighting



# Conclusions:

	<u>Posterior overlap</u>	<u>GOLUM</u>	<u>Full joint PE</u>
<u>Speed</u>	O(CPU minute)	O(CPU hour)	O(CPU month(s))
<u>Precision</u>	low	high	very high
<u>Discriminatory power</u>	weak	good	very good
<u>Extended injection studies</u>	computationally tractable	computationally tractable	computationally expensive

GOLUM is **fast** while remaining sufficiently **precise**.

Expected to **enable future strong lensing studies**, when **massive amount** of data to analyze

Enables us to perform fast **injection studies** and easy **multiple-image analyses**.

For more details, see the corresponding paper: <https://arxiv.org/abs/2105.04536>