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# Refining the Search for Sub-threshold Lensed Gravitational Waves

***LIGO SURF 2021***

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Technology**

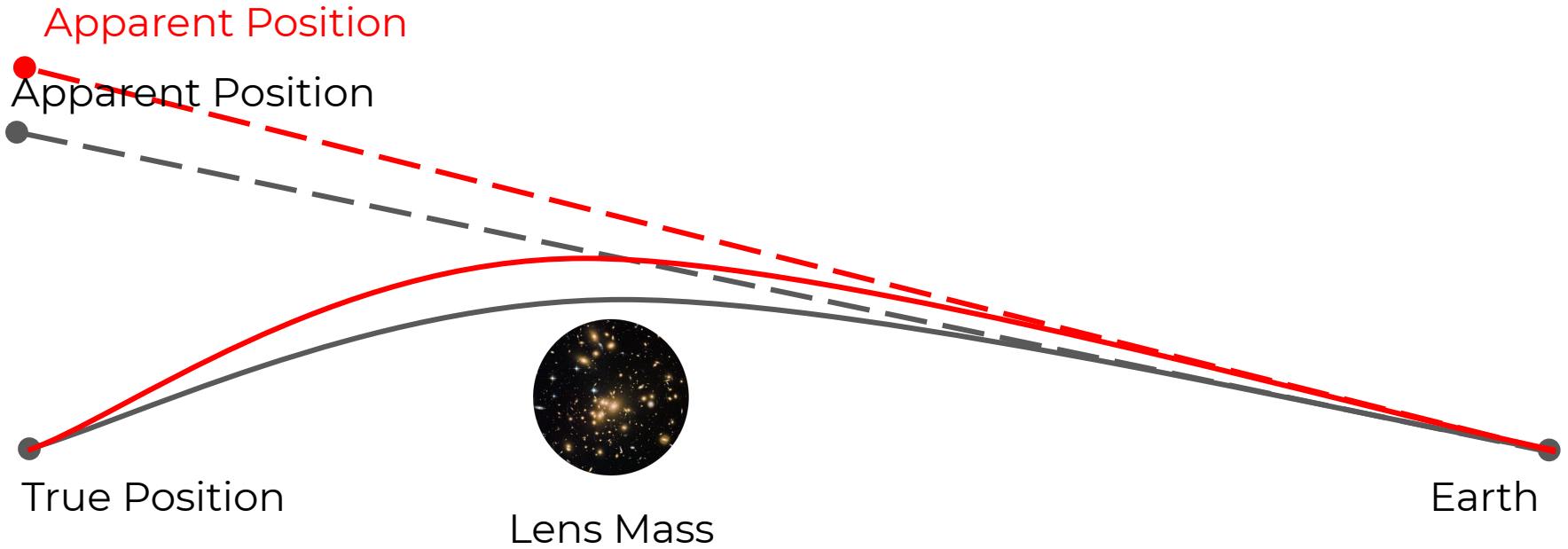
***LIGO SURF 2021***



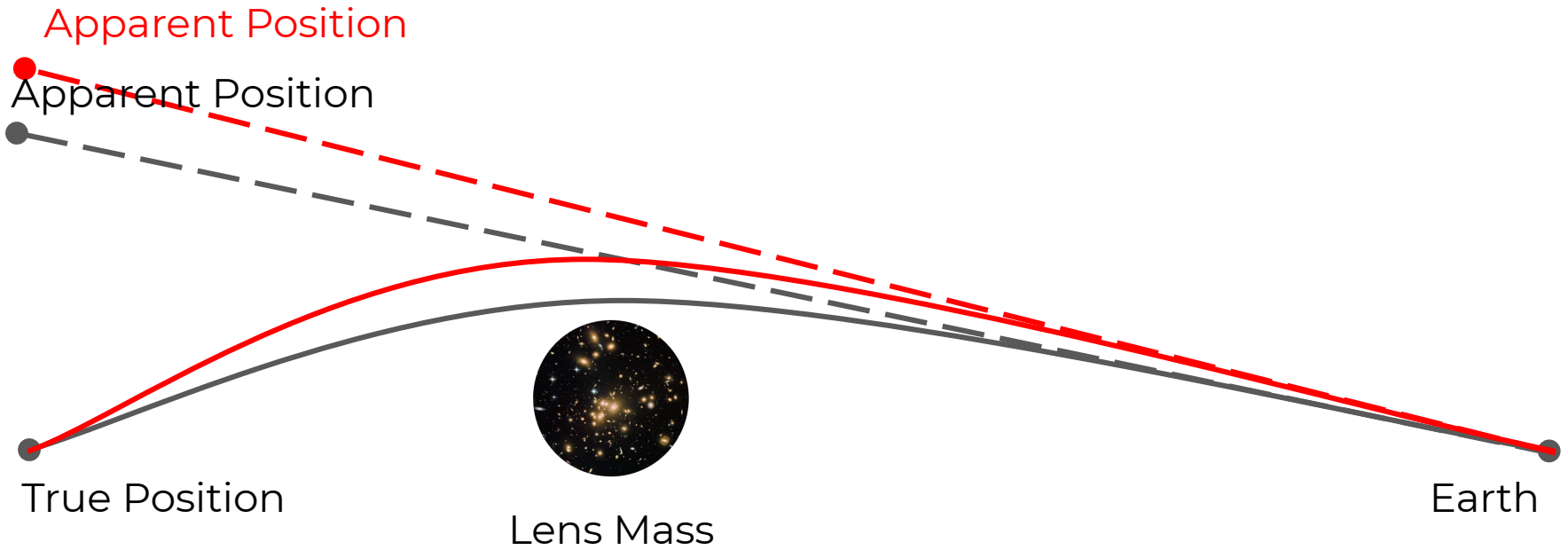
# Key Points

- Background: What's a sub-threshold lensed GW? How do we look for them?
- Refining 2 ways:
  - **by waveform** - Aims, Methods, Results
  - **by sky location** - Aims, Methods, Results
- Next steps and Summary

# Gravitational Lensing - Optical



# Gravitational Lensing - Optical



But GWs are **transient** signals.....

# Refining the Search for Sub-threshold Lensed Gravitational Waves

## MASTER EQUATION FOR STRONG LENSING

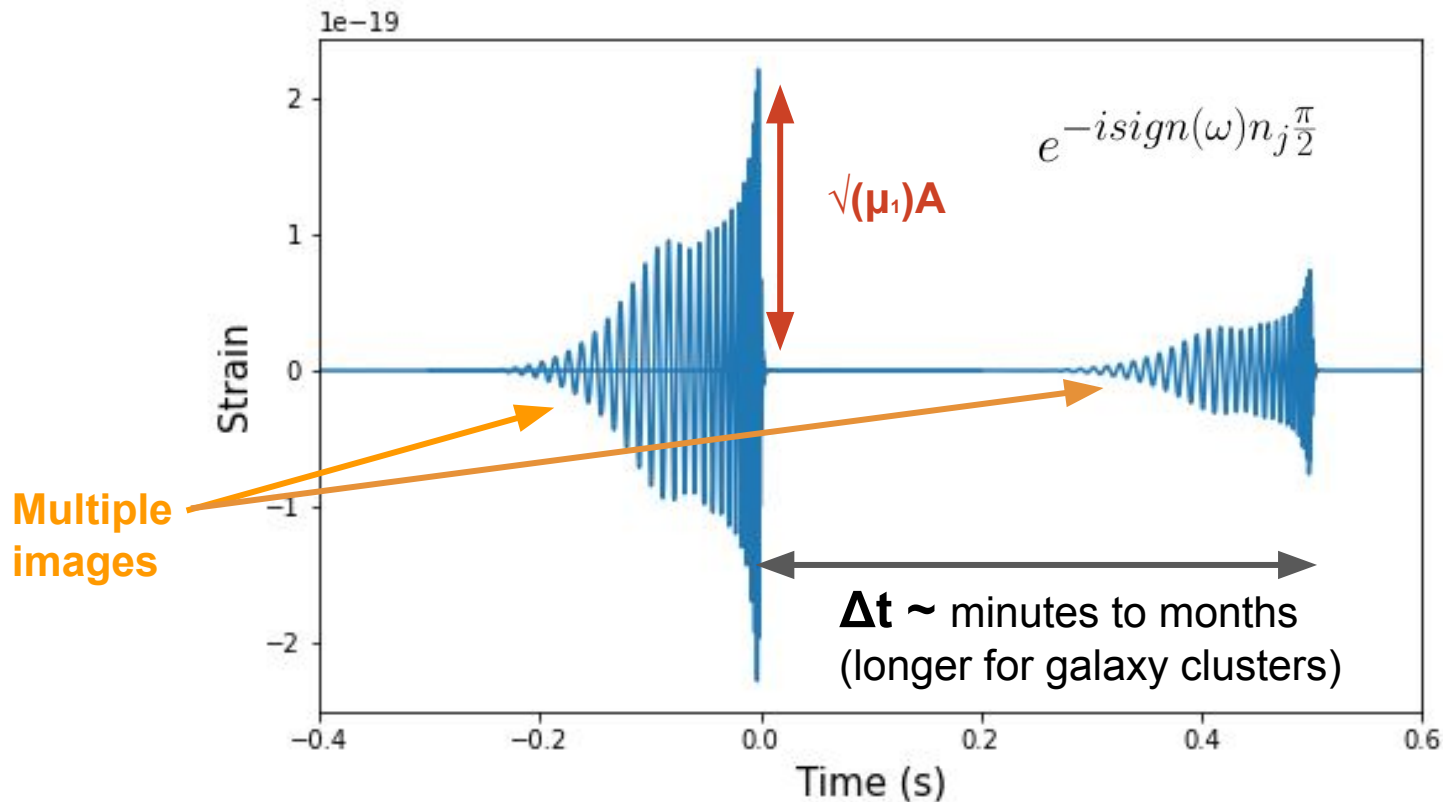
- **Lensed waveform** identical\* to original except from:

$$h_j^{lensed}(f, \bar{\Theta}, \mu_j, \Delta t_j, \Delta \phi_j) = \sqrt{|\mu_j|} \times h^{original}(f, \bar{\Theta}, \Delta t_j) \times \exp(i \text{sign}(f) \Delta \phi_j)$$

- **Magnification factor**
- **Time delay between a pair of lensed images**
- **Morse phase shift**

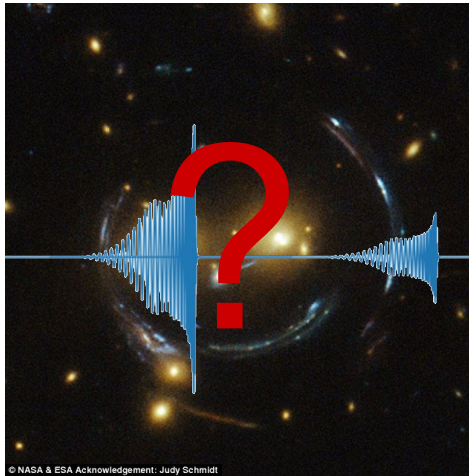
- \*under the geometric optics limit
- where  $f$  is frequency and  $\bar{\Theta}$  are the CBC parameters (mass, spin...)

# Lensed GWs in the time domain

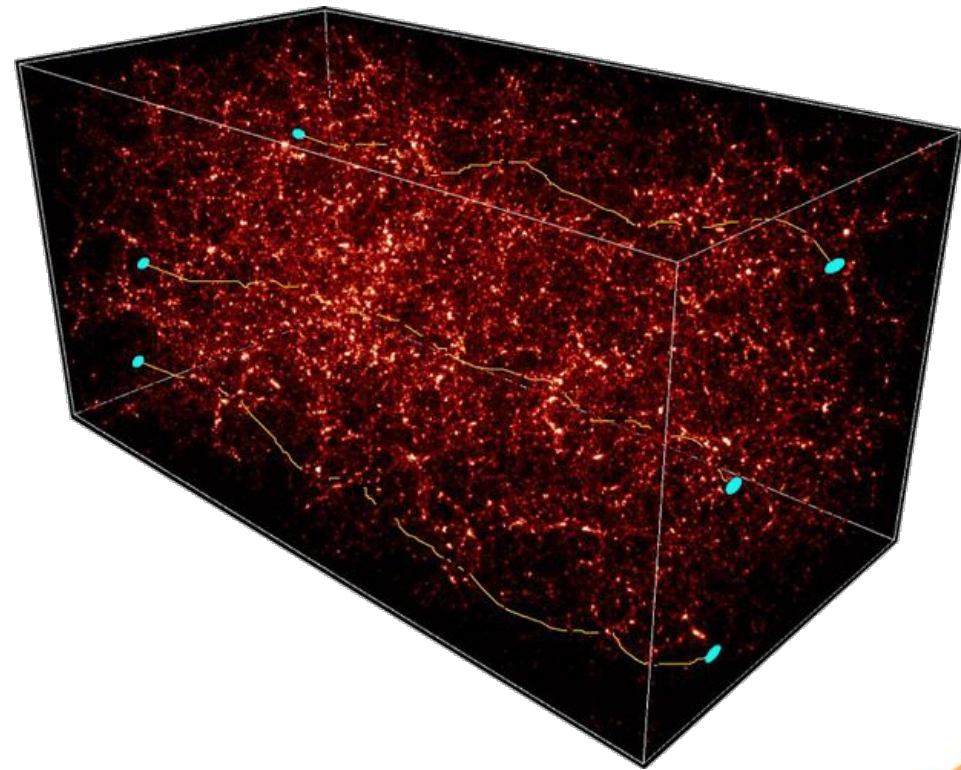


# Why do we want to observe Lensed GWs?

Lensed GWs have not yet been observed!



Would allow us to probe the structure of the universe and constrain CBC merger rates and cosmological values



# Are Lensed GWs even detectable?

Lensing rate :  
 $0.06 - 5\text{yr}^{-1}$  !

Ref: Ng et al.(2018); Oguri (2018); Li et al.(2018)].

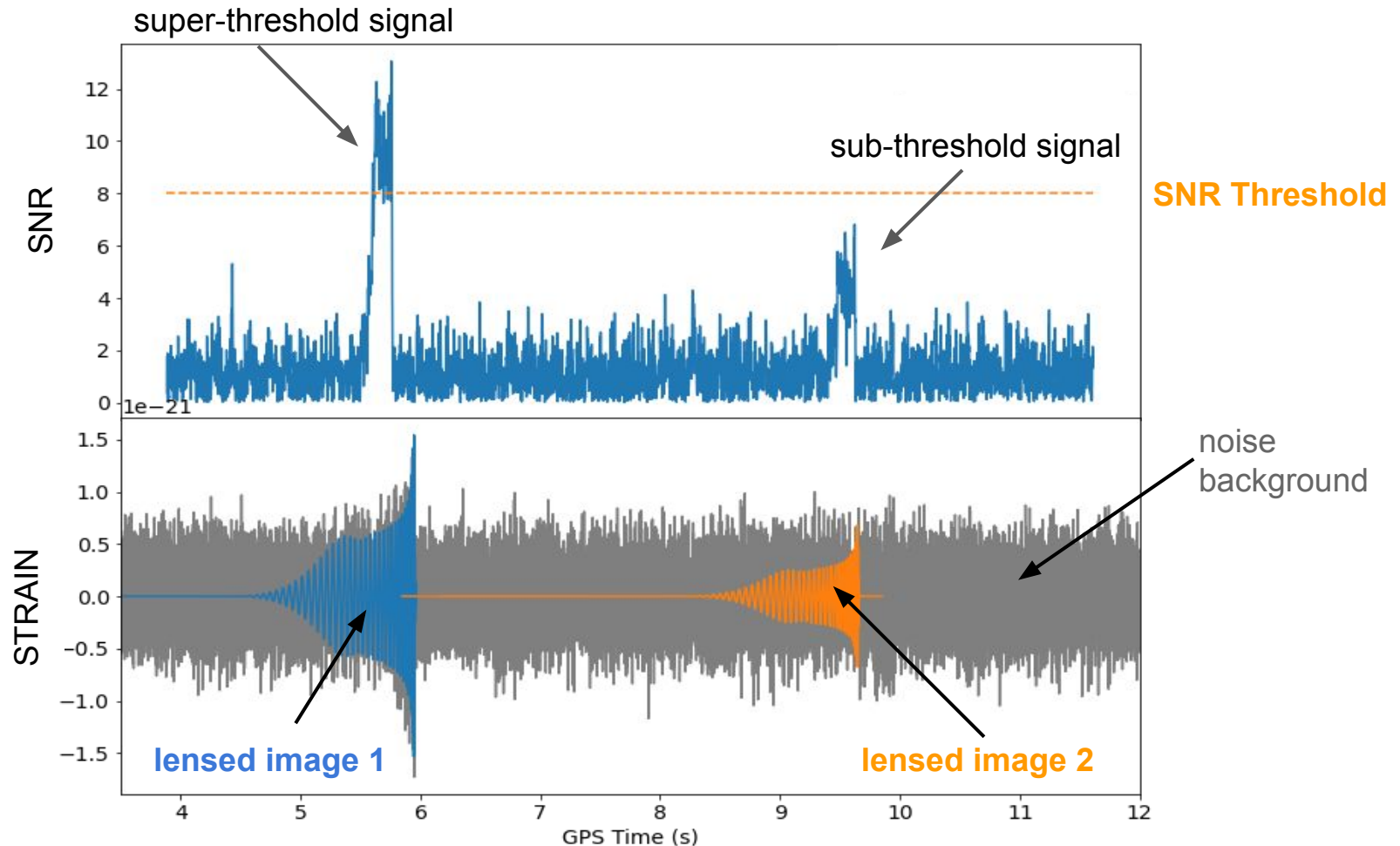
+ Increasing detector  
sensitivity =>

Lensed GWs would  
actually be  
detectable soon!!!!





# Refining the Search for **Sub-threshold** Lensed Gravitational Waves

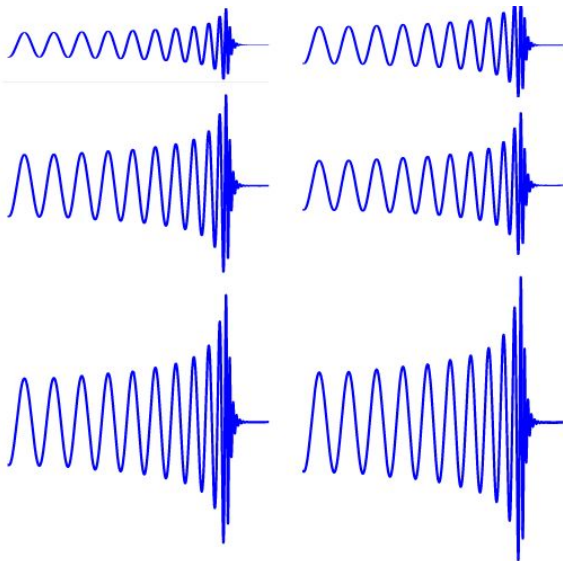


# TargetEd Sub-threshold Lensing seArch Pipeline (TESLA)

Original Template bank finds  
target event

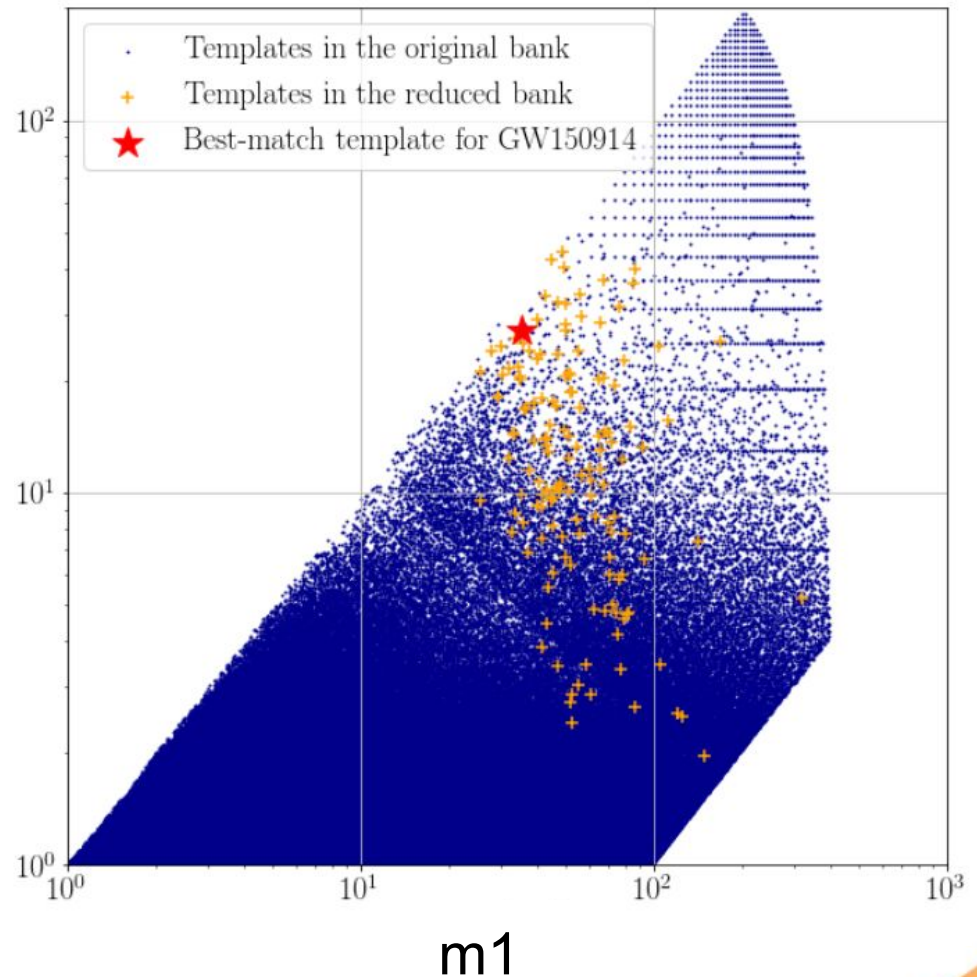


New injection run with original  
bank and scaled injections

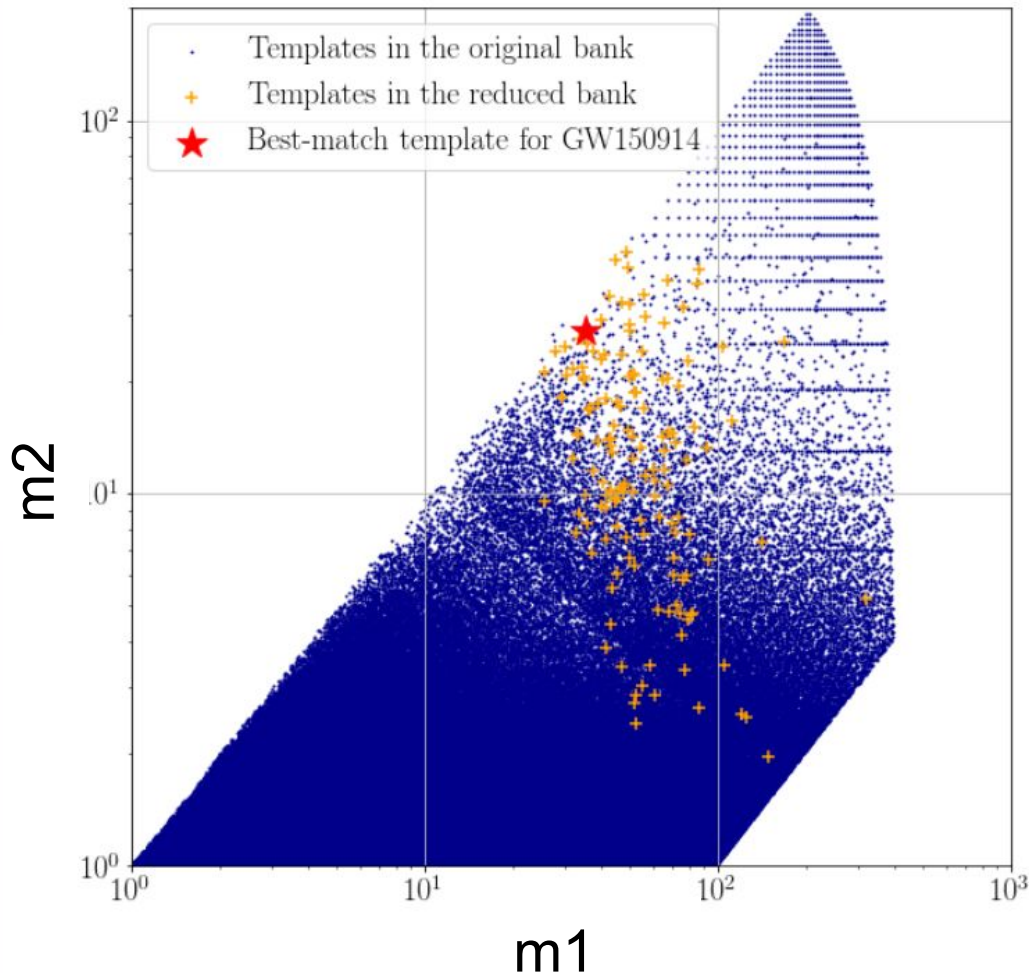


**= Targeted Template  
Bank**

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# TargetEd Sub-threshold Lensing seArch Pipeline (TESLA)



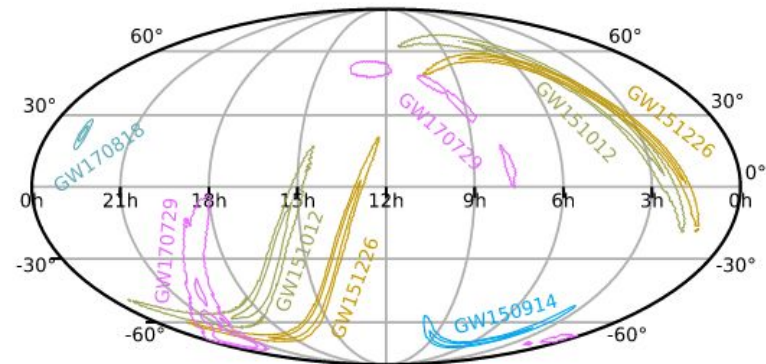
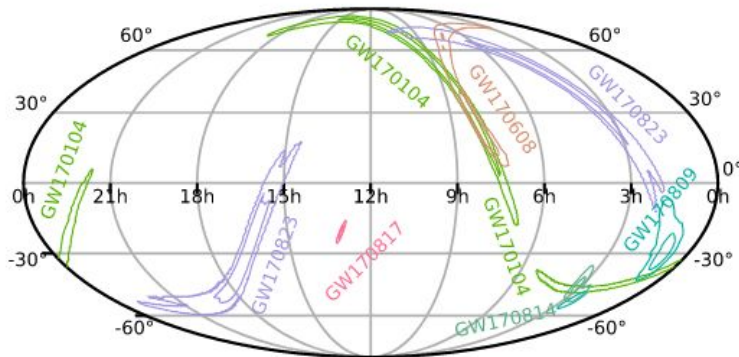
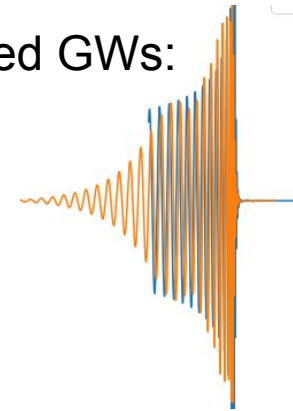
**targeted search  
with reduced  
noise background  
using reduced  
template bank**

# Refining the Search for Sub-threshold Lensed Gravitational Waves

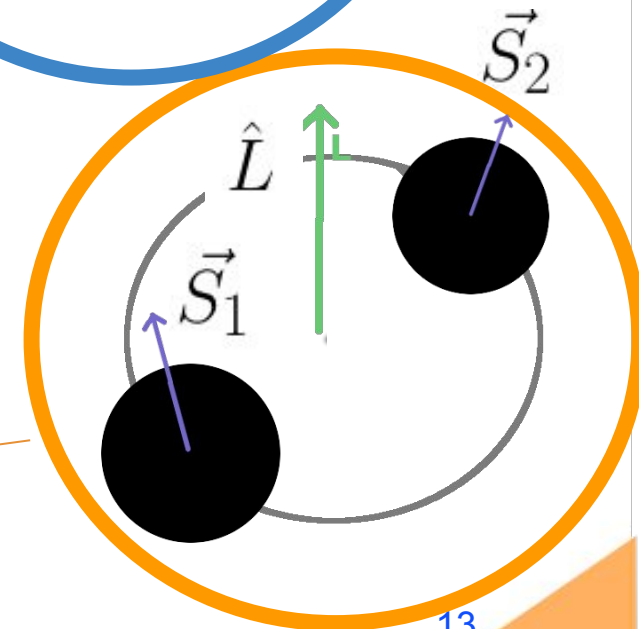
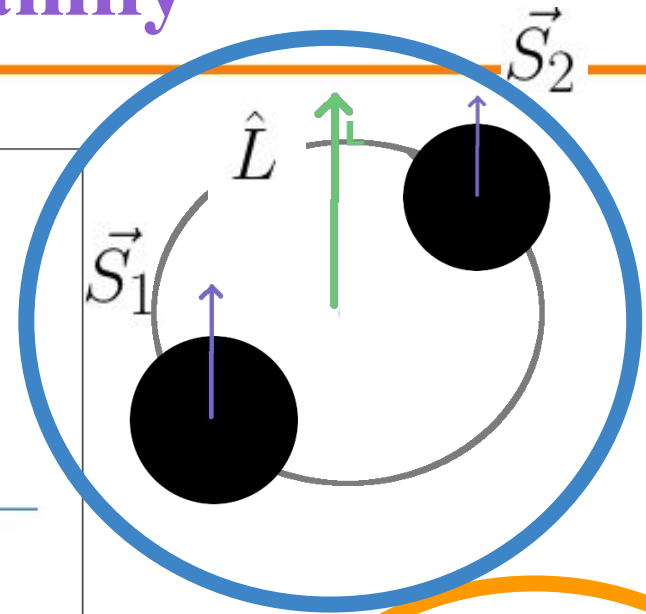
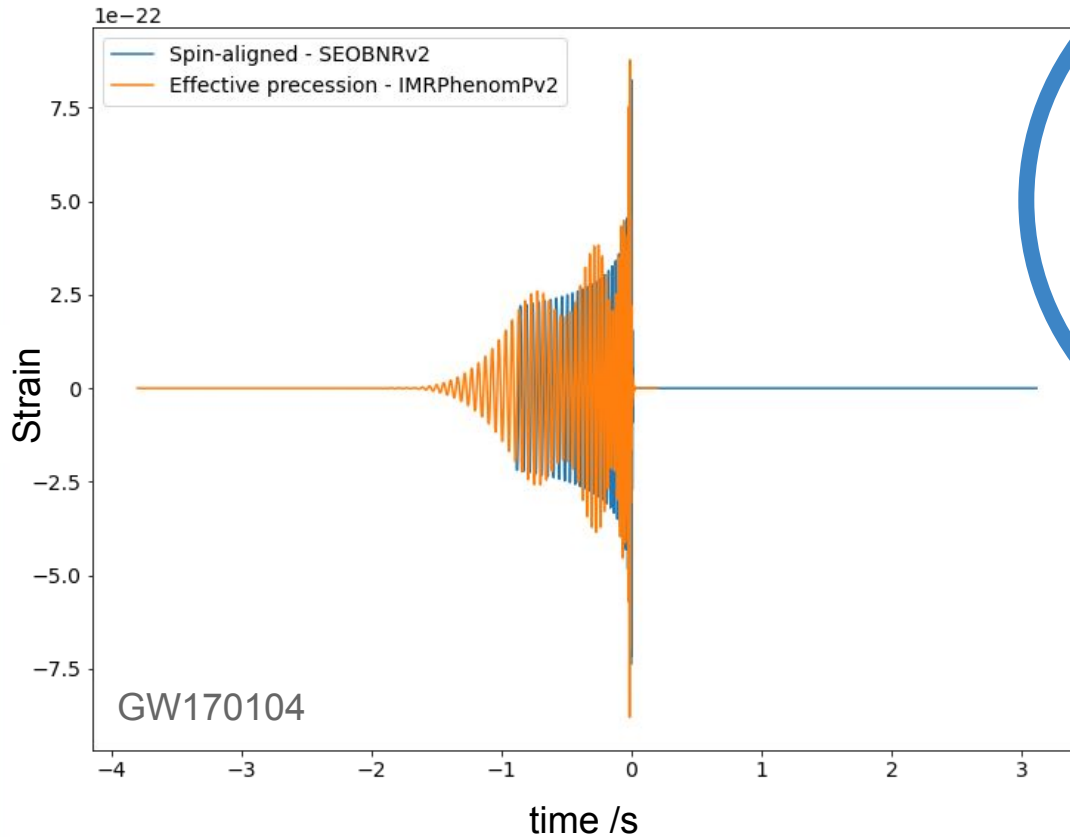
How are we trying to refine the search for lensed GWs:

(1) by waveform family

(2) by sky location



# Refining the Search by waveform family



amplitude and frequency modulation

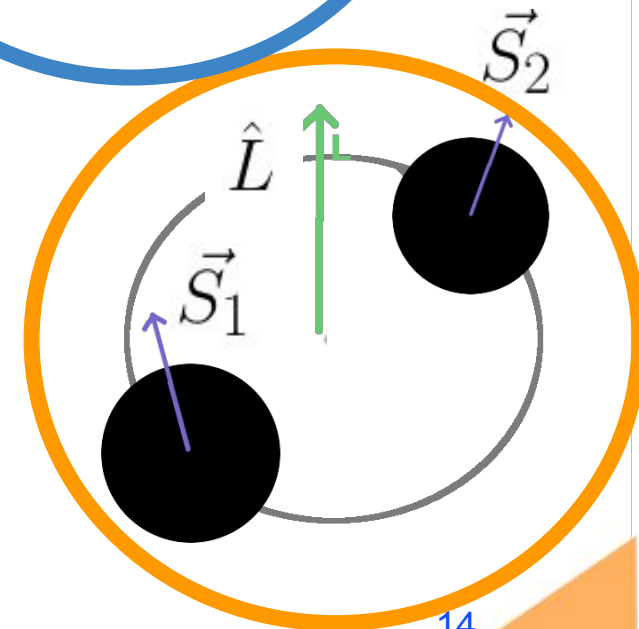
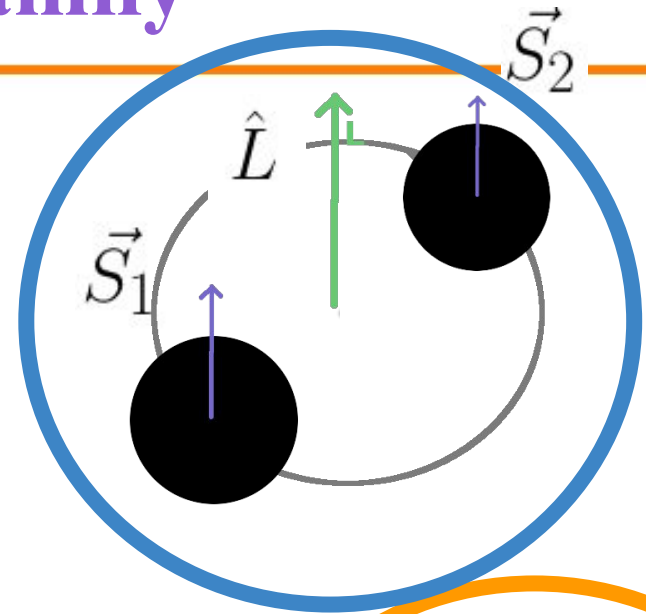


# Refining the Search by waveform family

□ Different waveform families used in different sub-threshold lensing pipelines

GstLAL pipeline: **spin-aligned waveforms**

PyCBC pipeline: **considers precession**



Will precession change the detectability of sub-threshold lensed signals?





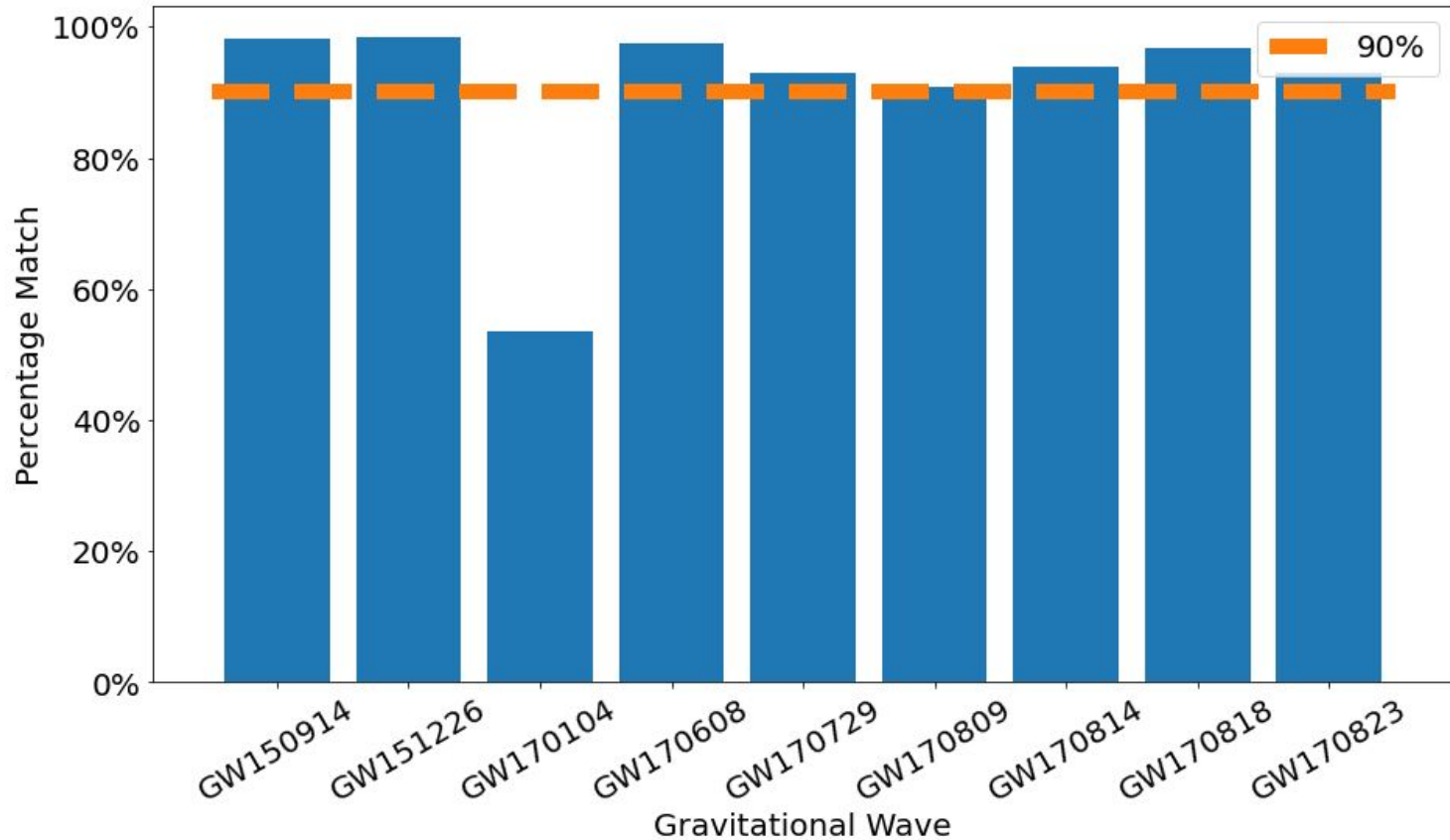
# Refining the Search by waveform family - Methods

Found the **match between** O1 and O2 events plotted with **spin-aligned** and **precession-included** waveform families:

1. used posterior samples to generate waveforms
2. considered detector response function
3. calculated match



# Refining the Search by waveform family - Results



All above **90% match!** Well, apart from GW170104..... is it precessing?



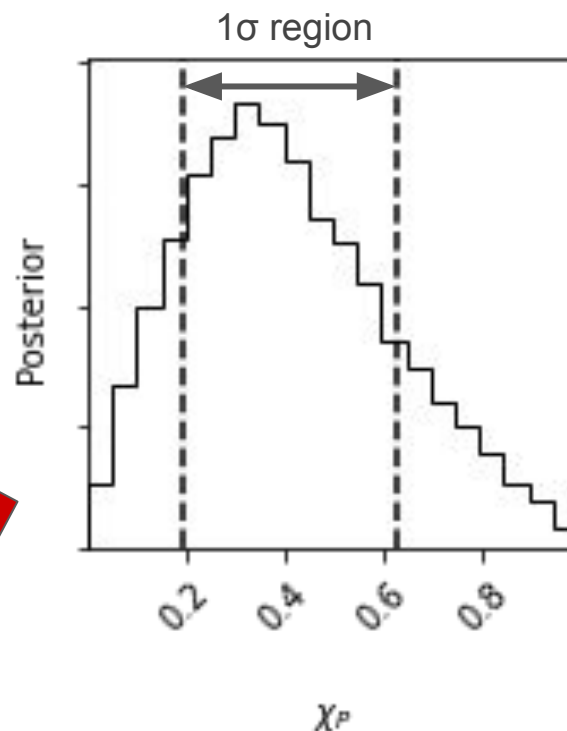
# Refining the Search by waveform family - Conclusions 2

- If GW170104 is really precessing > SNR loss for aligned spin waveform



**Might lose sub-threshold signals**

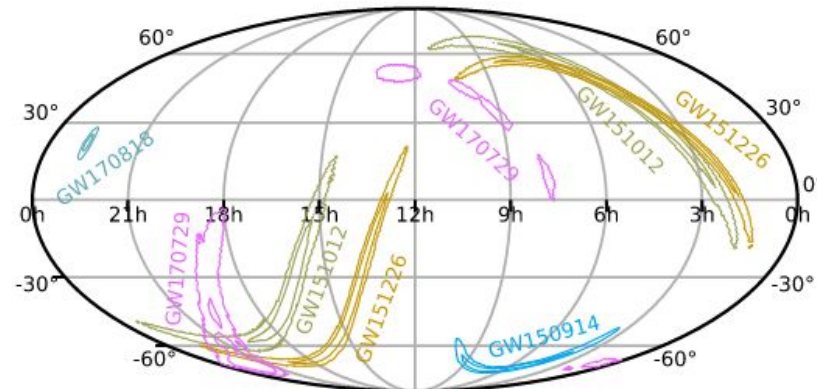
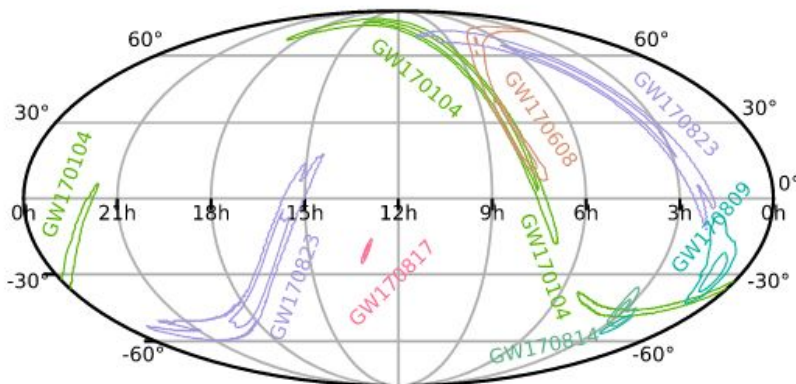
- If there is large uncertainty in precession (very likely) then either waveform should be suitable, not necessarily SNR loss



Effective precession spin parameter Posterior Distribution of GW170104

# Refining the Search by Sky Location

**Key Point:** Lensed images will come from approximately the same sky location!



Lensed image separation  $\sim 1$  arcsec verses Sky Localisation of 100s of degrees squared

# Refining the Search by Sky Location

## Ranking by Likelihood



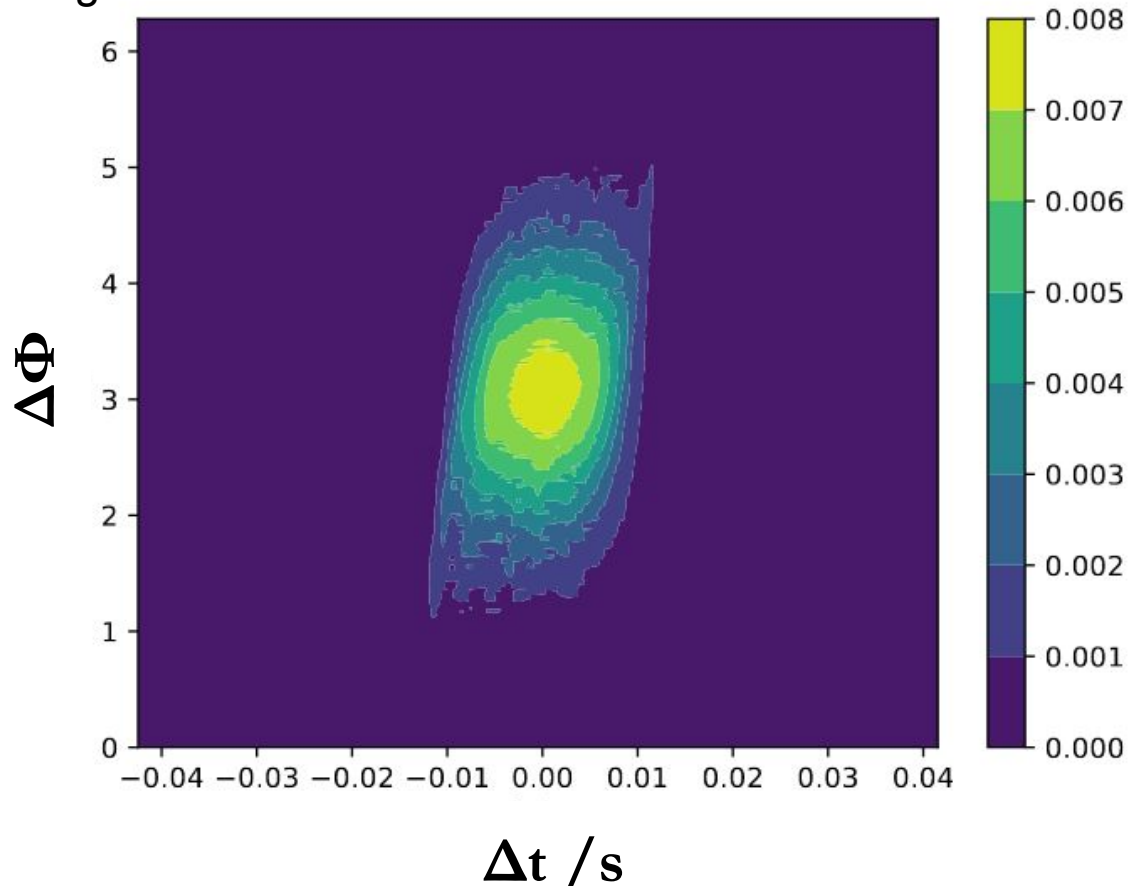
$$\mathcal{L} = \frac{P(\{D_1, D_2\} \{d_1, d_2\}, \rho_1, \rho_2, \xi_1^2, \xi_2^2, \Delta\phi, \Delta t | \text{signal})}{P(\{D_1, D_2\} \{d_1, d_2\}, \rho_1, \rho_2, \xi_1^2, \xi_2^2, \Delta\phi, \Delta t | \text{noise})}$$



# Refining the Search by Sky Location

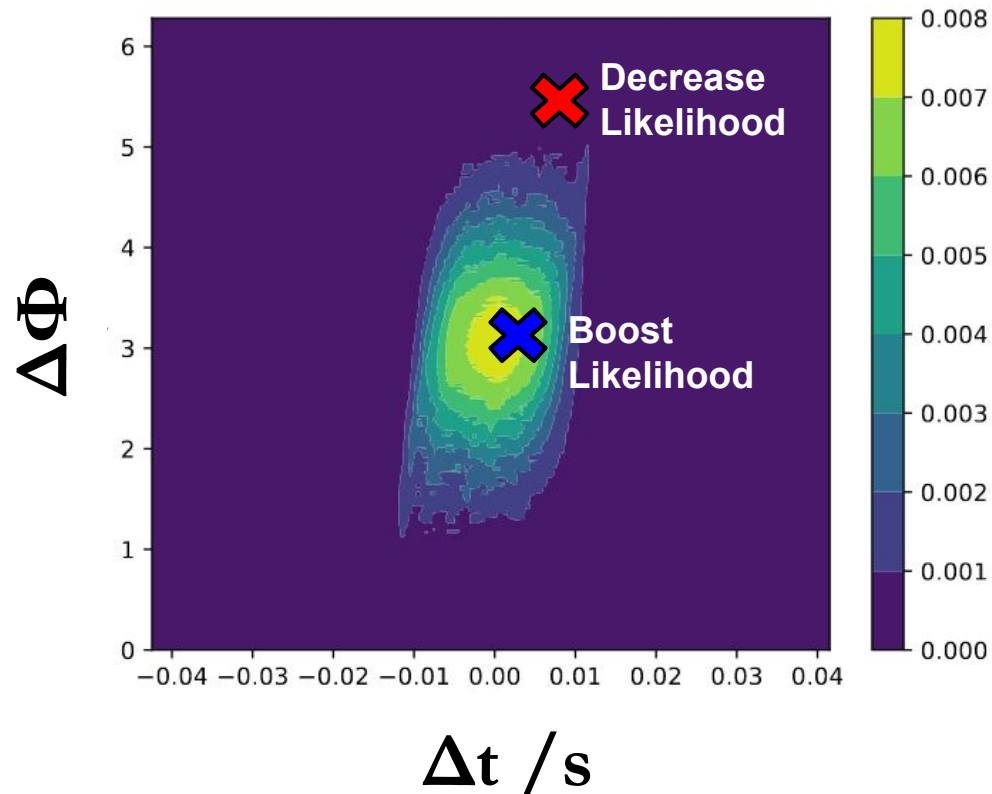
## $\Delta\Phi$ and $\Delta t$ PDF

2D Probability distribution for  $\Delta\Phi$  and  $\Delta t$  considering signals **across the whole sky** for Hanford and Livingston:



# Refining the Search by Sky Location Aims

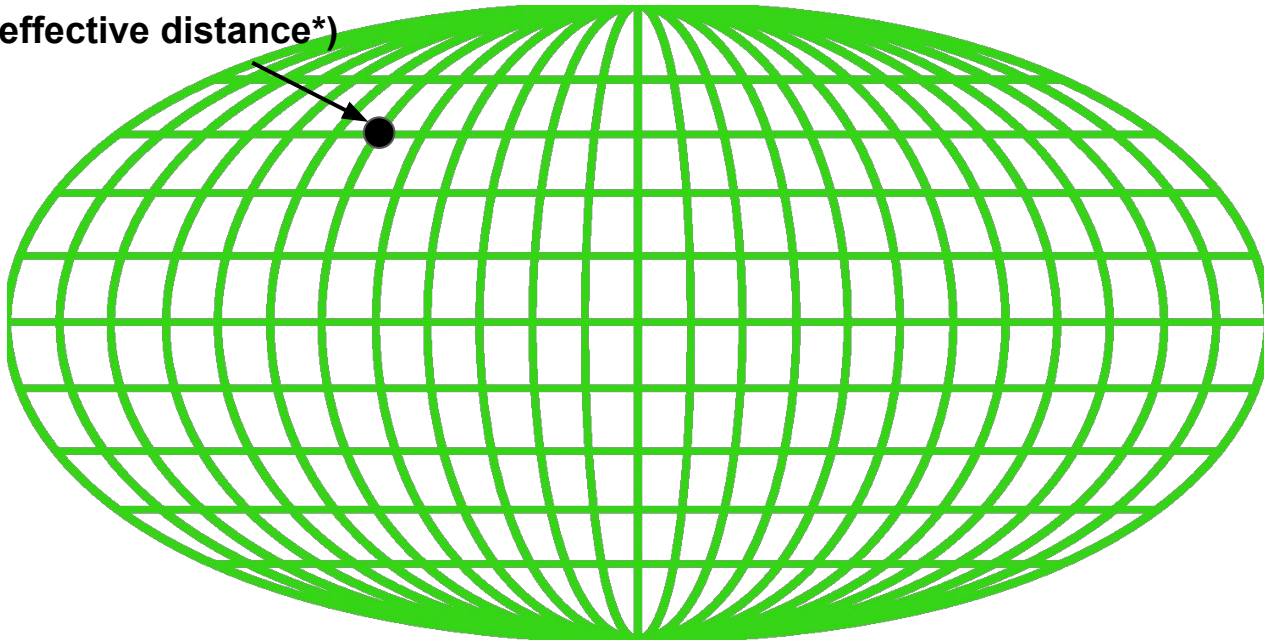
Aiming to **boost rankings of lensed images with similar sky localisations** by finding this PDF with a **targeted sky localisation**



# Inside the $\Delta\Phi\Delta t$ PDF Calculation:

- GstLAL finds the PDF of  $\Delta\Phi$  and  $\Delta t$  with a tiling function: tiles **the whole sky** with even probability of event from each direction

Calculates for each detector:  
(time, phase, effective distance\*)



\*equivalent to SNR



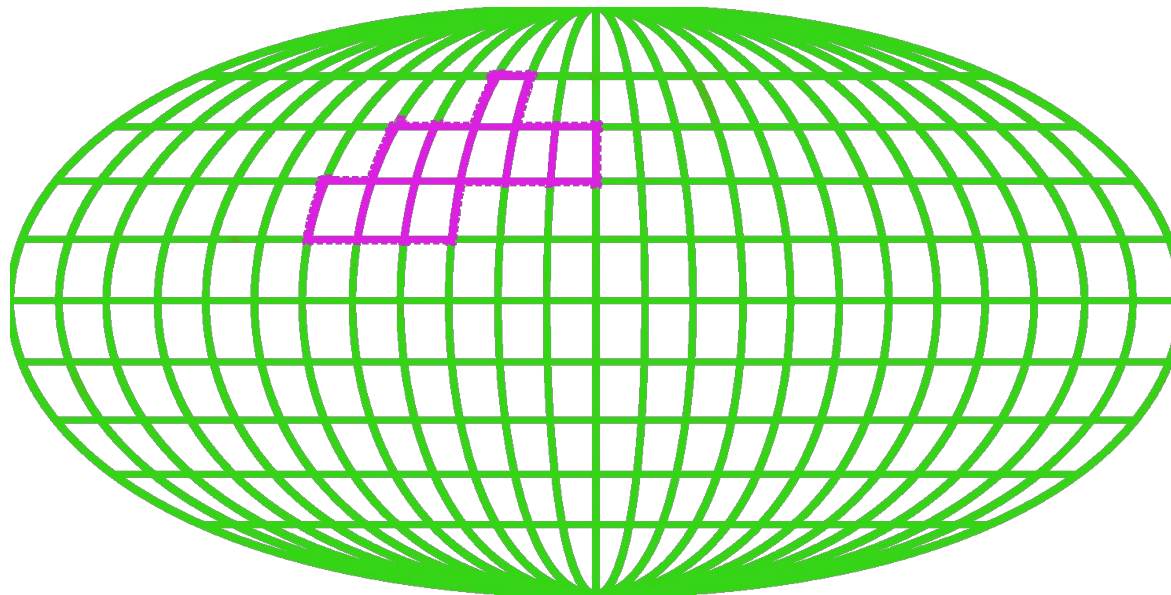
# Inside the $\Delta\Phi\Delta t$ PDF Calculation:

- Obtain  $\Delta t$ ,  $\Delta\Phi$ ,  $\Delta D_{\text{eff}}$  between **each of the detectors** for **each point**
- **Use this to calculate the PDF** using the covariance matrix, with lots more maths [Hanna et al., 2019]



# Inside the New Improved $\Delta\Phi\Delta t$ PDF Calculation:

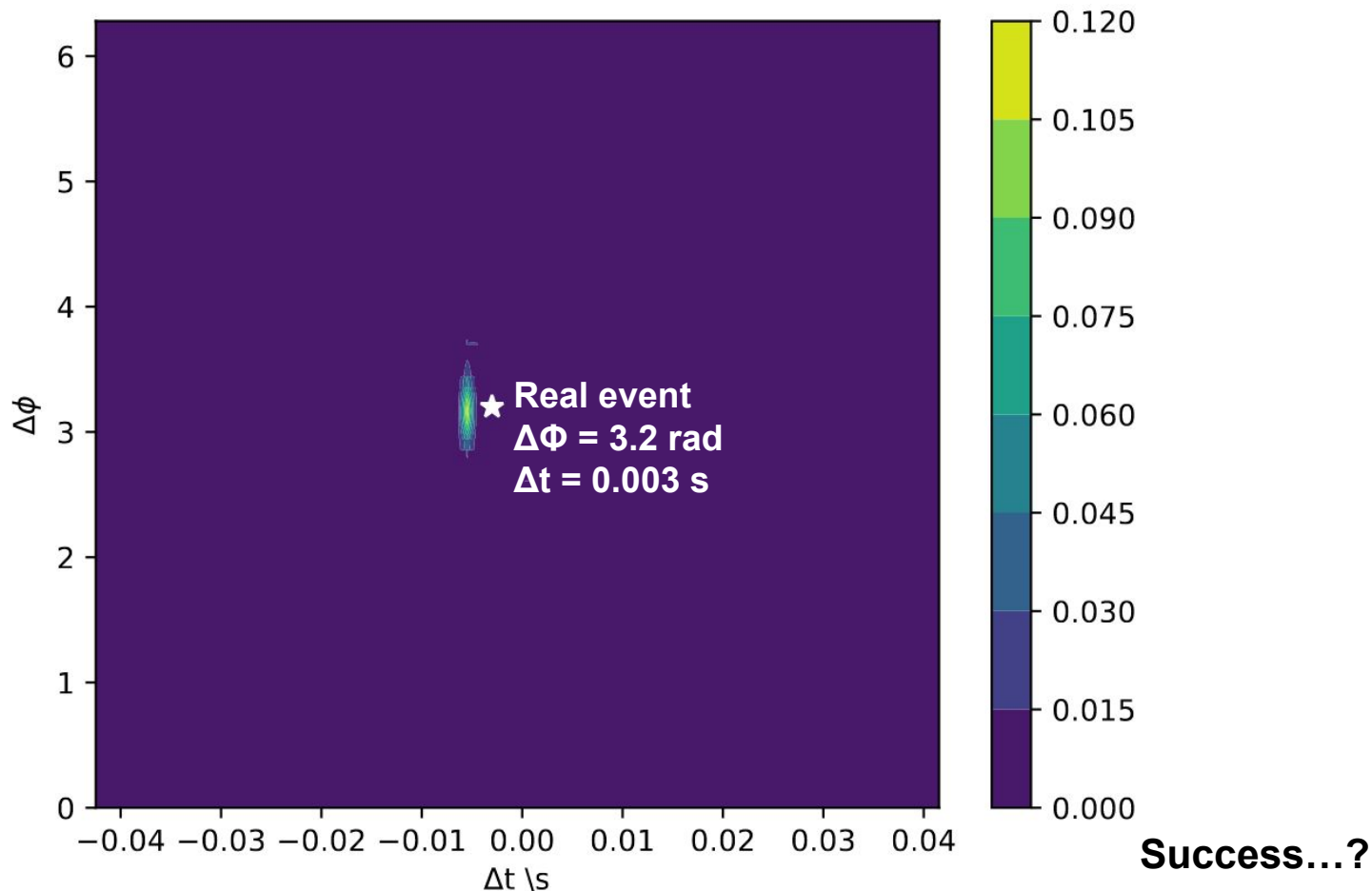
- We modify GstLAL to find the PDF of  $\Delta\Phi$  and  $\Delta t$  with a tiling function: tiles the **90% credible region** of a real target event with even probability
- PDF then found as before.....



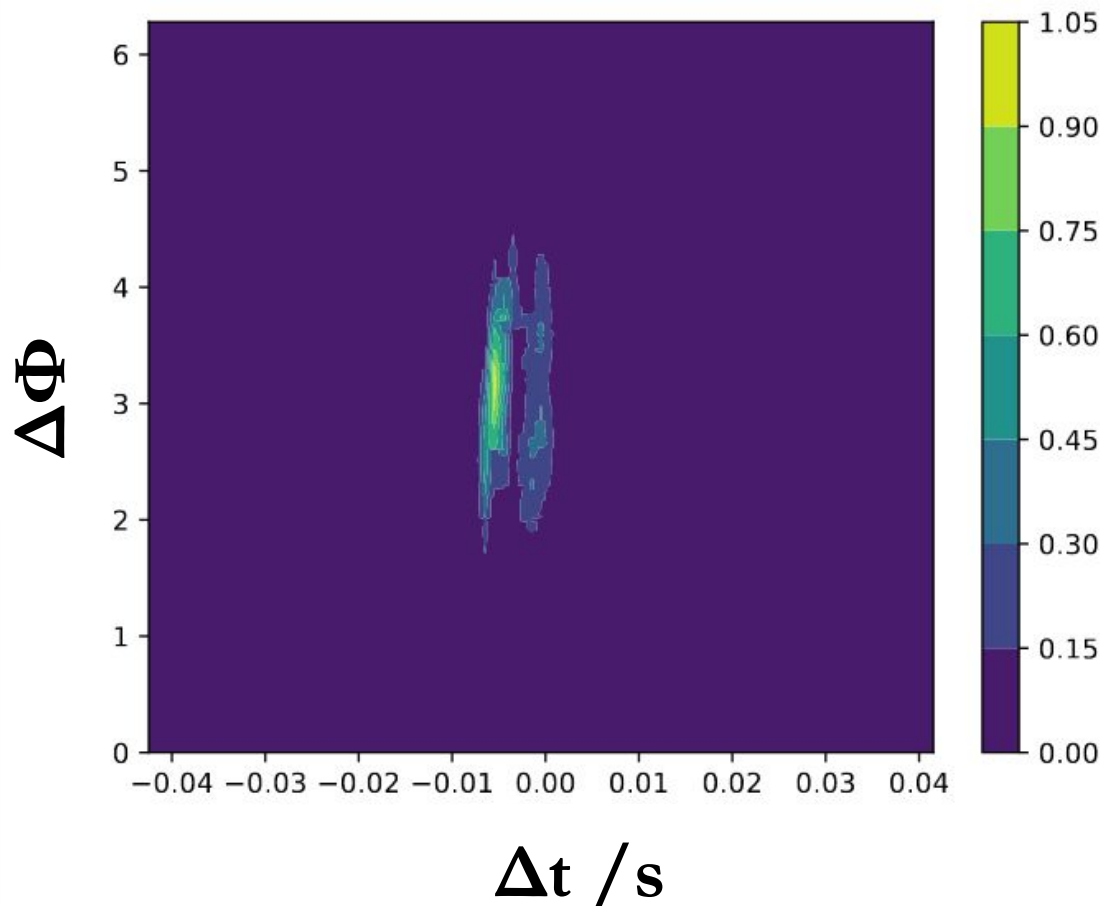


# Results... With Real SNRs!

$\Delta\Phi$   $\Delta t$  PDF for S190408an for H1L1 with detector SNRs equal to event values

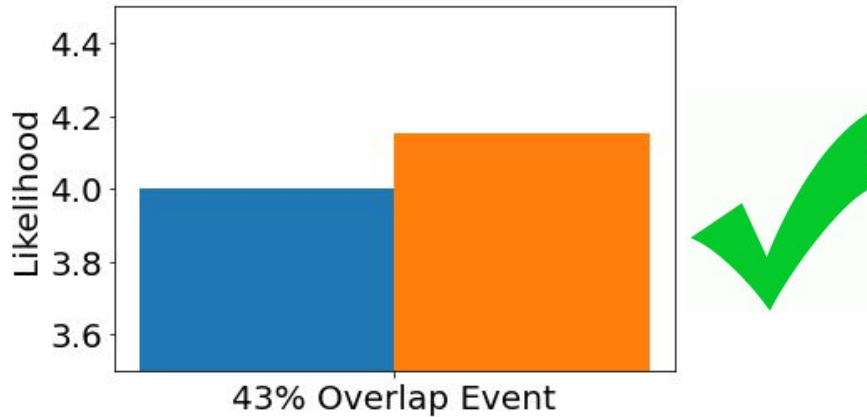


# Implementing this into the Search Pipeline

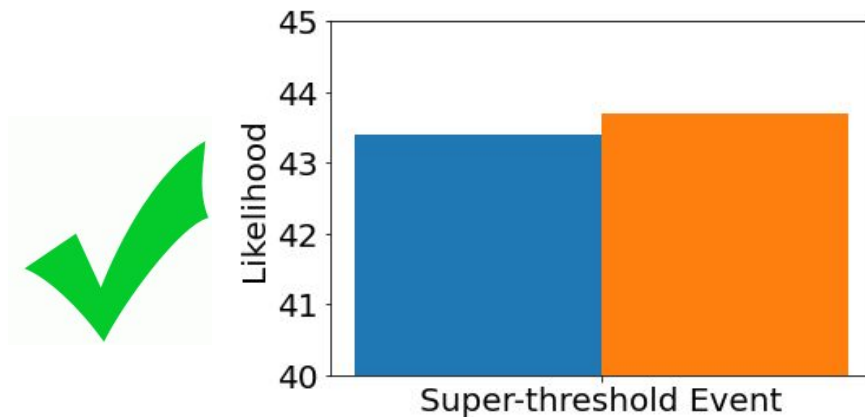
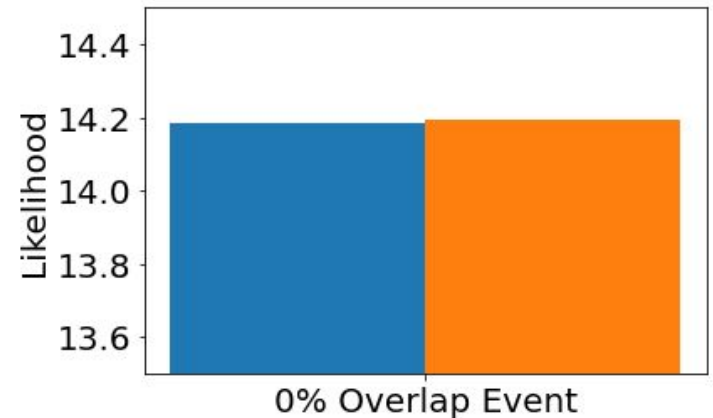


- Generate  $\Delta\Phi\Delta t$  PDF with SNRs = 4, as looking for low SNR triggers
- Use this PDF in GstLAL pipeline to search and rank candidates for section of O3a data

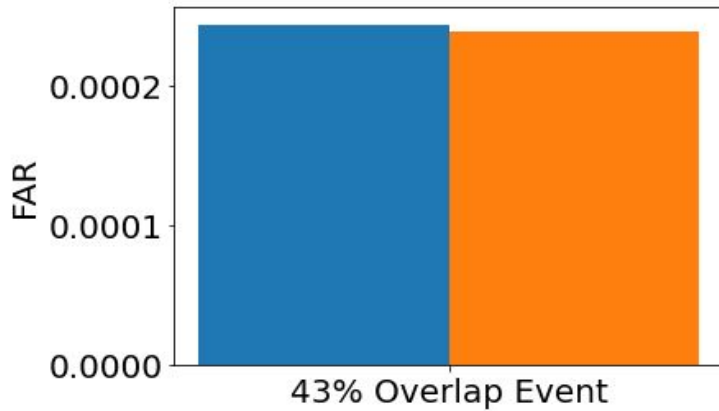
# Implementing this into the Search Pipeline - Likelihood results



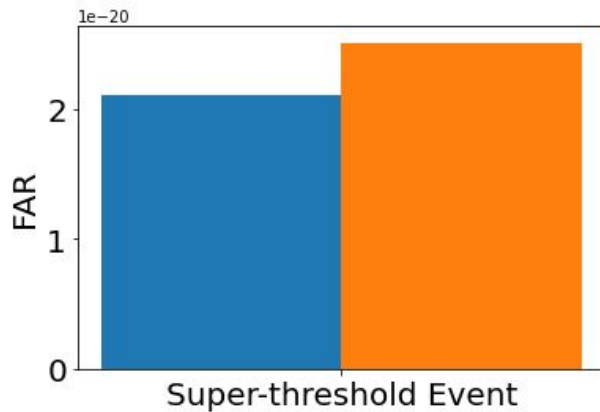
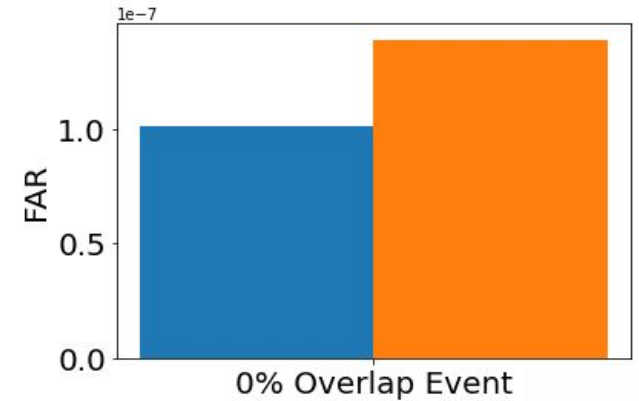
Before Targeted Skymap  
Using Targeted Skymap



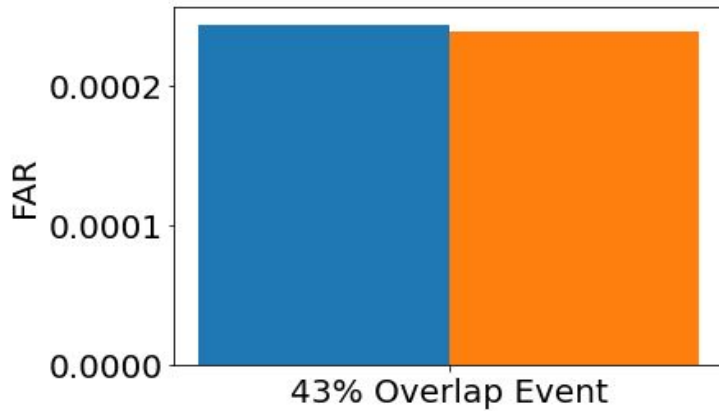
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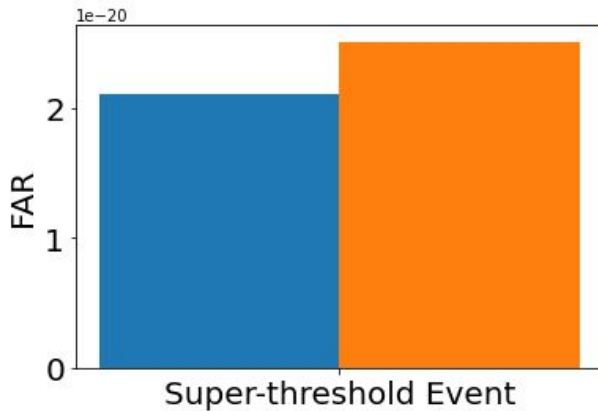
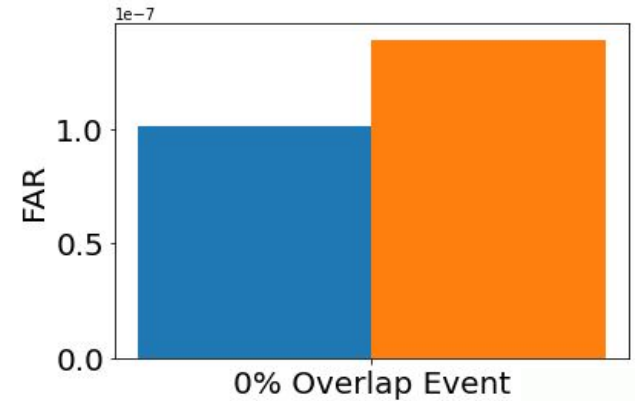
Before Targeted Skymap  
Using Targeted Skymap



# Implementing this into the Search Pipeline



Before Targeted Skymap  
Using Targeted Skymap



noise model  
estimation  
assumes  
isotropic sky  
location







One Small step for  
Likelihoods, one big  
step for LIGOkind





# Next Steps

- Target the noise model in the pipeline
- Compare boosted rankings to whole data for O3a
- Investigate  $\Delta\Phi$   $\Delta t$  PDF discrepancies
- Possibly implement it quasi-real time to search for sub-threshold signals as data is being observed



# Summary

- Trying to find **sub-threshold gravitationally lensed GWs** through a **targeted search pipeline**
- **Refining this pipeline** considering:
  1. Spin-aligned versus precession-included waveforms
    - determined if waveform would result in lost SNR of sub-threshold events
    - if spin was better known maybe this would be a problem
  2. Targeted Skymap rankings
    - Introduced targeted  $\Delta\Phi\Delta t$  PDF using super-threshold skymap
    - partially successful boosting implemented to search pipeline!!! now we need to perfect it

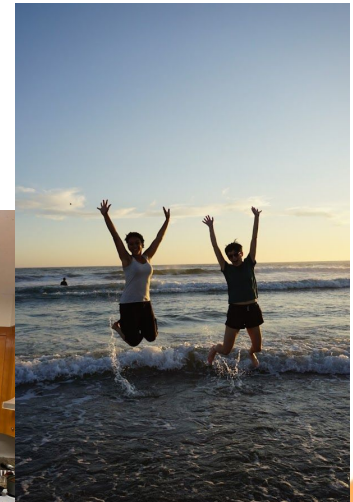


# Acknowledgements

Thank you to my mentors Alvin Li and Alan Weinstein for helping me learn so much this summer! Shoutout to Ryan Magee for being a GstLAL expert to turn to in scary times...

Thank you to the LIGO Lab, Caltech and the NSF.

And super thanks to all of the LIGO SURFs, grad students and postdocs who made this summer such a fun experience!! :-)

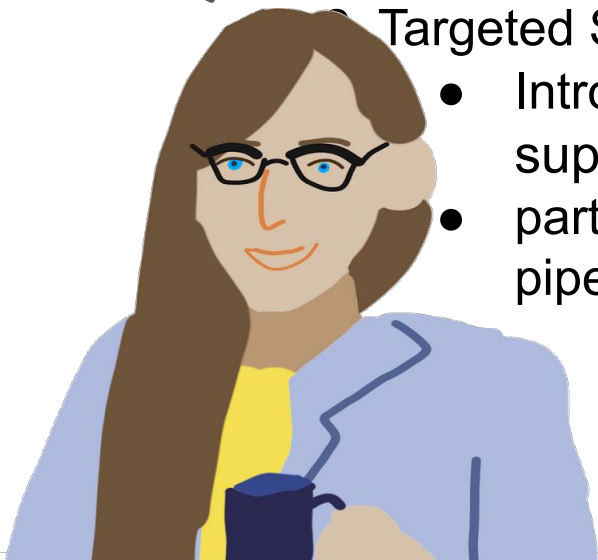


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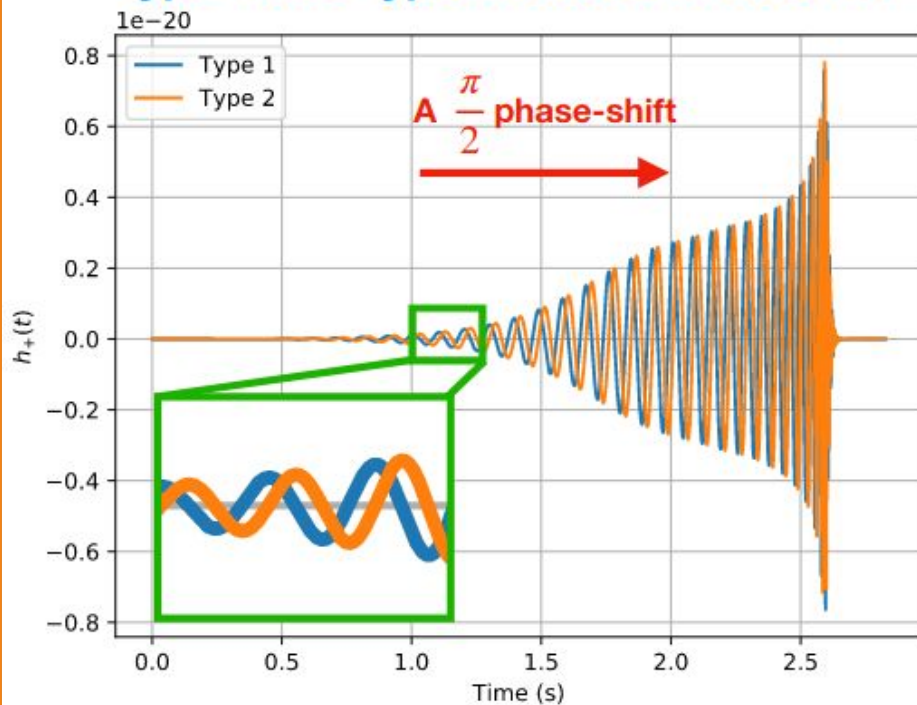
A speech bubble containing the text "Any Questions?".

Any Questions?



# Extra Slide - Morse Phase Shift

## Type 1 and Type 2 lensed waveforms



## Type 1 and Type 3 lensed waveforms

