



# **First LIGO Search for Binary Inspirals**

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# Executive Summary

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**We searched for inspiral signals from binary neutron star systems using matched filtering**

Each mass in the range  $M_{\odot}$  to  $3M_{\odot}$

**Used S1 data from the two 4-km interferometers**

**Analysis “pipeline” checked for coincidence when possible, but otherwise accepted single-interferometer events**

Total observation time after data selection cuts: 236 hours

**Used Monte Carlo to determine efficiency of pipeline**

For a model of sources in the Milky Way and Magellanic Clouds

**Set an upper limit:  $R < 1.8 \times 10^2$  per year per MWEG (90% conf.)**

**Complete draft of paper will be distributed to LSC next week**

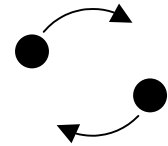


# Gravitational Waves from Binary Inspirals

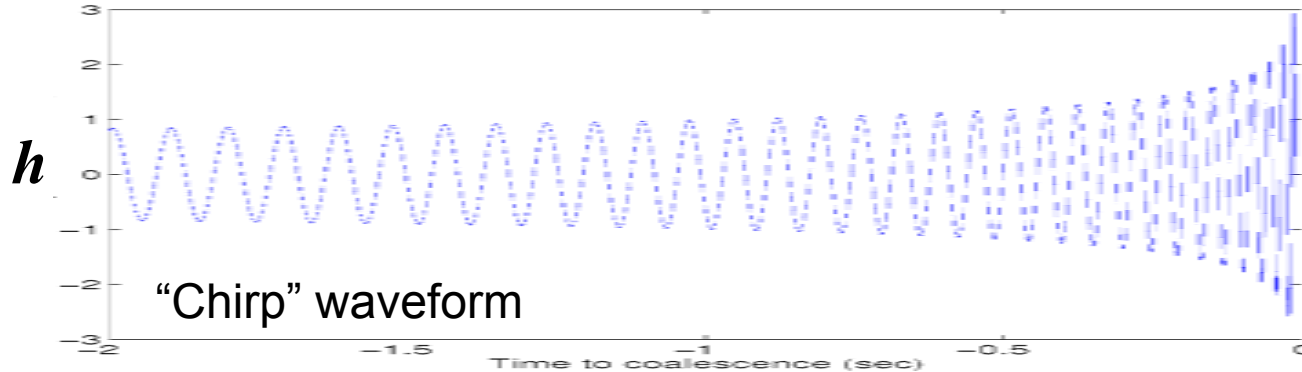
**Binary in tight orbit emits gravitational waves**

**Loss of angular momentum causes orbit to decay**

Decay rate accelerates as orbital distance shrinks



**Waveform is well known if masses are small**



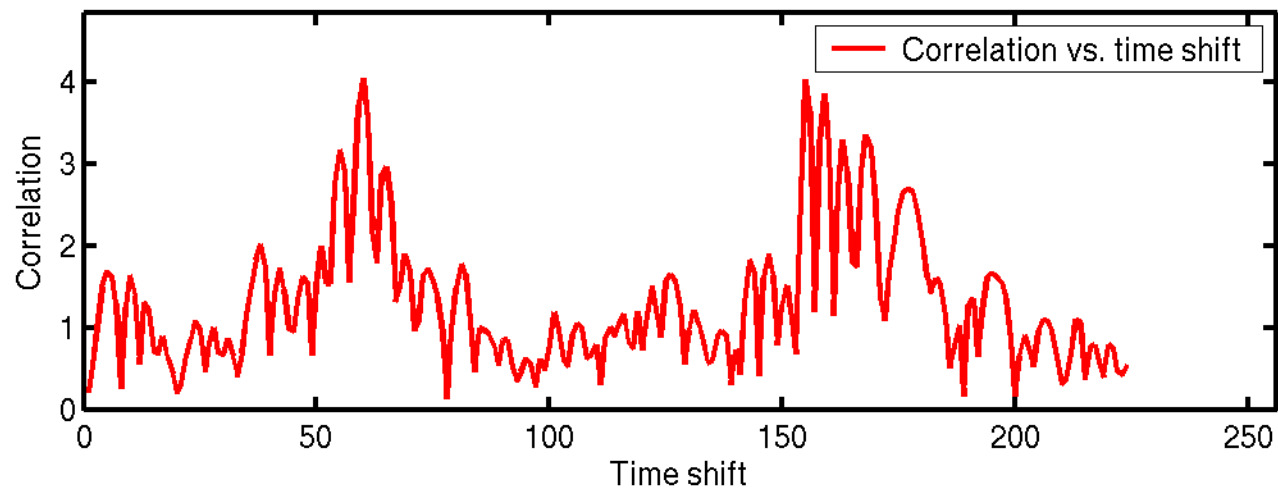
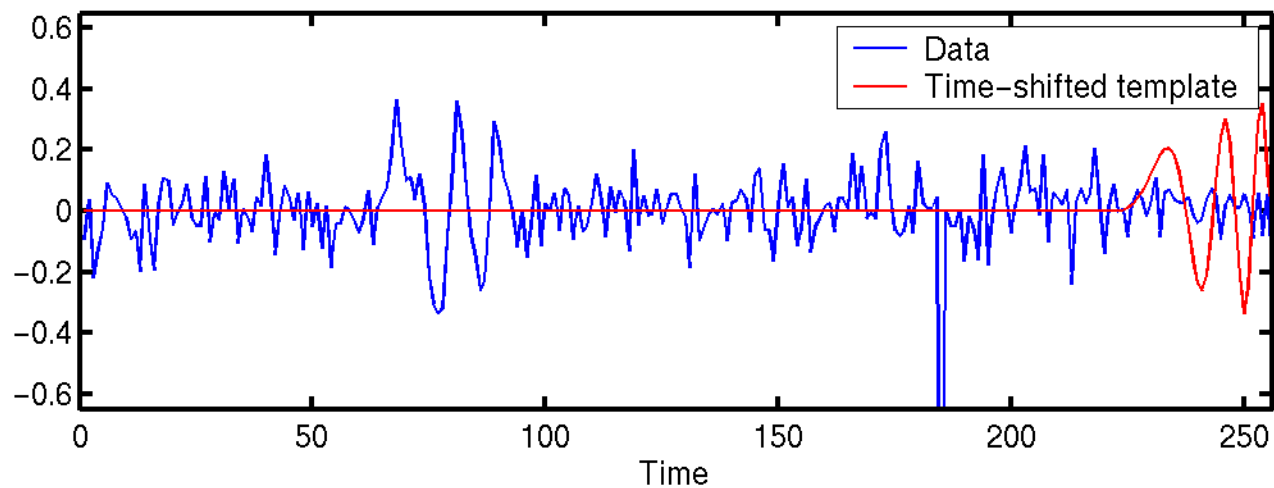
Enters LIGO sensitive band ~seconds before coalescence

**Binary neutron star systems are known to exist !**

e.g. PSR 1913+16



# Illustration of Matched Filtering





# Optimal Filtering in Frequency Domain

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Transform data to frequency domain :  $\tilde{h}(f)$

Generate template in frequency domain :  $\tilde{s}(f)$

Correlate, **weighting by power spectral density of noise:**

$$\frac{\tilde{s}(f) \tilde{h}^*(f)}{S_h(|f|)}$$

Then inverse Fourier transform gives you the filter output **at all times:**

$$z(t) = 4 \int_0^{\infty} \frac{\tilde{s}(f) \tilde{h}^*(f)}{S_h(|f|)} e^{2\pi i f t} df$$

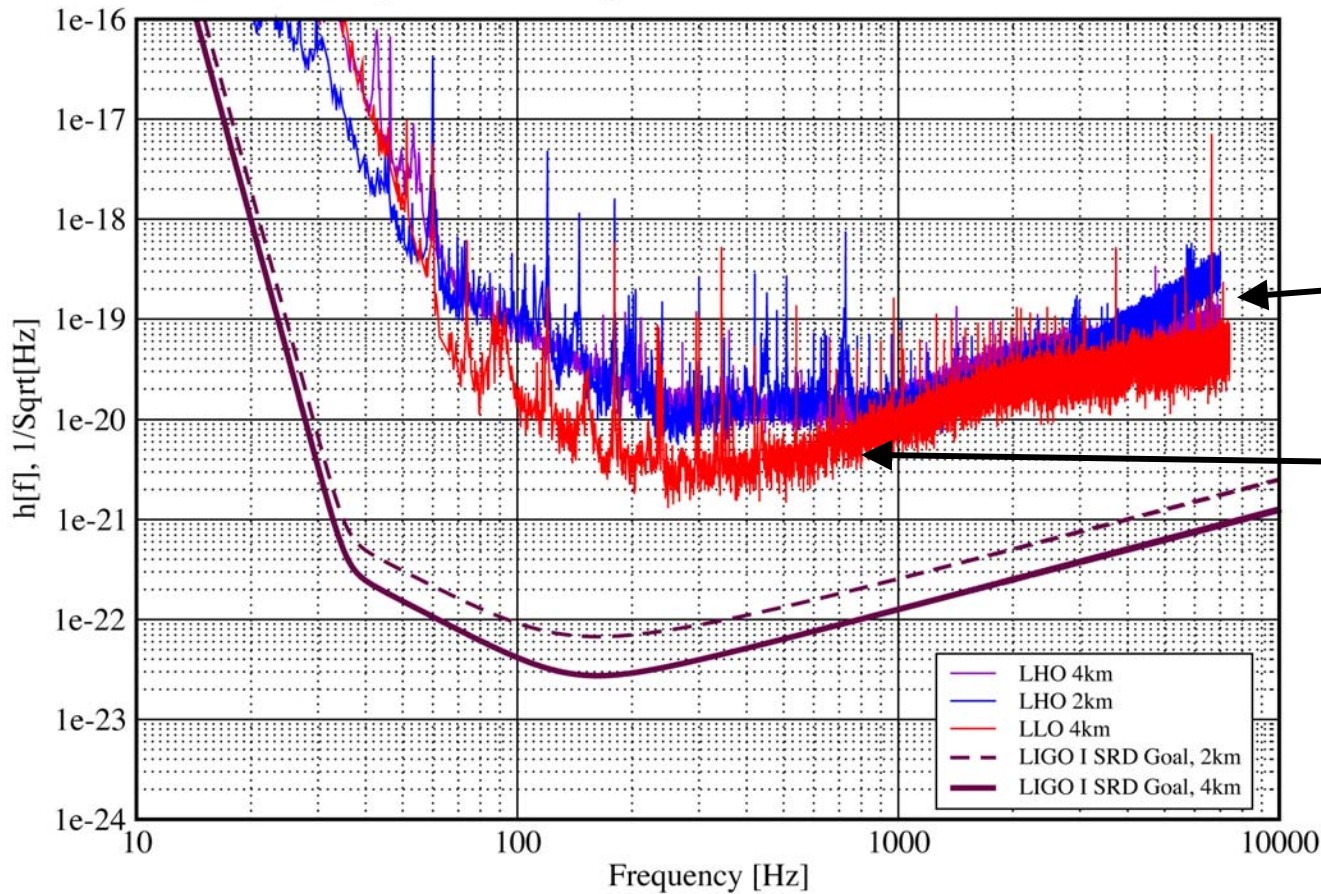
Find maxima of  $|z(t)|$  over arrival time and phase  
Characterize these by **signal-to-noise ratio (SNR)** and **effective distance**



# Strain Sensitivities During S1

Strain Sensitivities for the LIGO Interferometers for S1

23 August 2002 - 09 September 2002 LIGO-G020461-01-E



Distance at which an optimally oriented  $1.4+1.4 M_{\odot}$  inspiral would yield SNR=8:

**H1 & H2**  
~45 kpc

**L1**  
~175 kpc

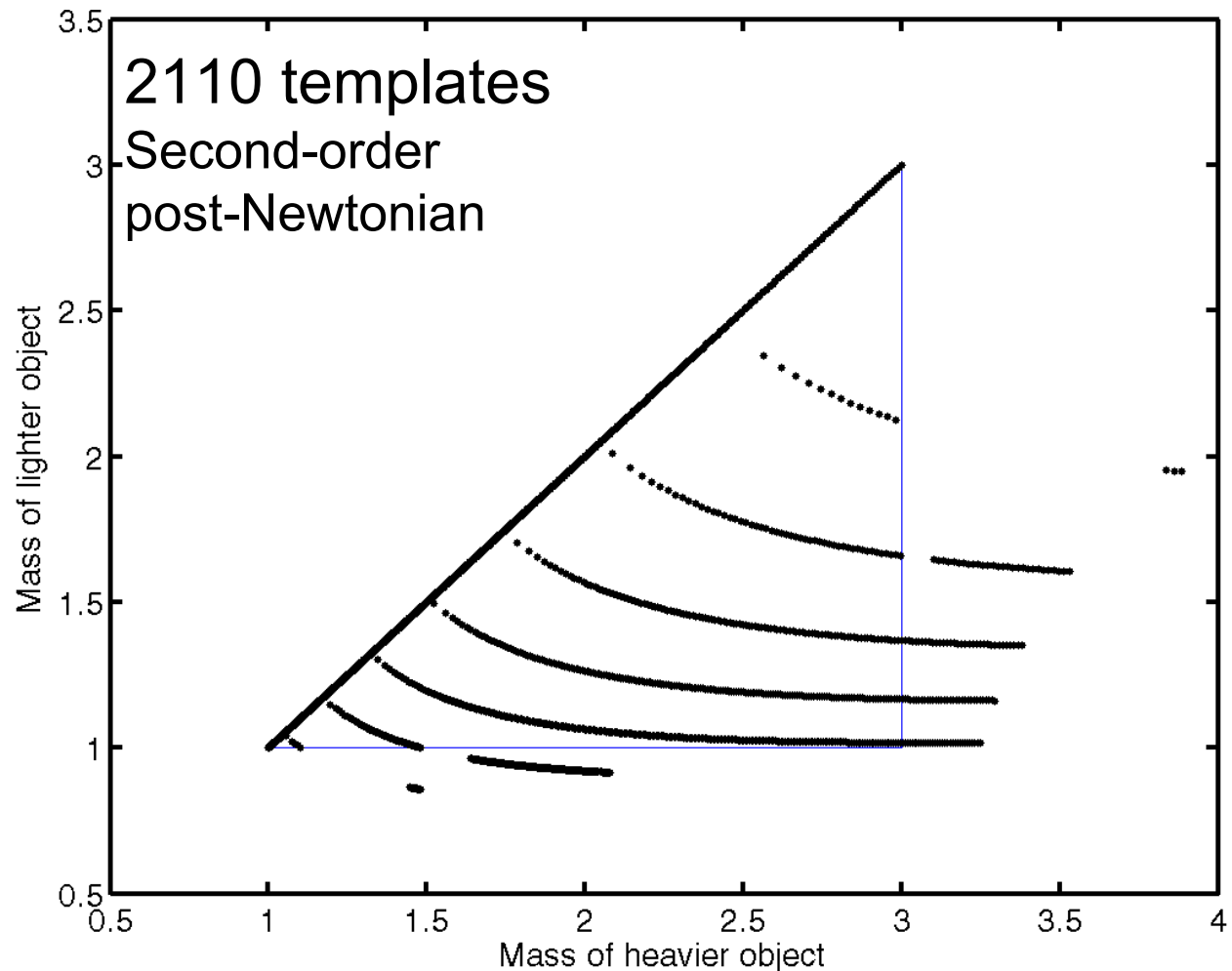


# Template Bank Used for S1

Covers desired region of mass param space

Calculated based on L1 noise curve

Templates placed for max mismatch of  $\delta = 0.03$





# Chi-Squared Test

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**Any large transient in the data can lead to a large filter output**

**A real inspiral has signal power distributed over frequencies in a particular way**

**Divide template into  $p$  parts, each expected (on average) to contribute equally to SNR, and calculate a  $\chi^2$  :**

$$\chi^2(t) = p \sum_{l=1}^p |z_l(t) - z(t)/p|^2 \quad (\text{We use } p = 8)$$

**“Veto” events with large  $\chi^2$**

Allow for large signals which may fall between points in the template bank

$$\chi^2(t) \leq 5 \left( p + \text{SNR}^2 \delta^2 \right)$$





# Data Processing

The search was performed using routines in the **LIGO Algorithm Library (LAL)**, running within the **LIGO Data Analysis System (LDAS)**

Template bank is divided up among many PCs working in parallel (“flat” search)

Most number crunching for this analysis was done on the UWM LDAS system →

**Each job processed 256 seconds of data**

Consecutive jobs overlapped by 32 seconds

Triggers which exceeded an SNR threshold of 6.5 and passed the chi-squared test were written to the LDAS database

**Statistical analysis was done with C programs, Tcl scripts, Matlab, ...**





# Can we really detect a signal?

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**We used LIGO's hardware signal injection system to do an end-to-end check**

Physically wiggle a mirror at the end of one arm

Measure the signal in the gravitational-wave channel

**Injected a few different waveforms at various amplitudes**

Example:  $1.4+1.4 M_{\odot}$  , effective distance = 7 kpc



**Signal was easily found by inspiral search code**

The  $1.4+1.4 M_{\odot}$  template had the highest SNR (= 92)

Reconstructed distance was reasonably close to expectation

Yielded a  $\chi^2$  value well below the cut



# Real Detectors...

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## ... are not on all the time

- ⇒ Only process the good data (requires bookkeeping)
- ⇒ Need to decide how to use the data from each detector

## ... have time-varying response

- ⇒ Need calibration as a function of time

## ... have time-varying noise

- ⇒ Discard data when detector was not very sensitive (“epoch veto”)
- ⇒ Estimate noise power spectral density,  $S_h(f)$ , from the data input to each 256-second-long LDAS job

## ... have “glitches”

- ⇒ Chi-squared veto
- ⇒ Veto on glitches in auxiliary interferometer channels



# Making Choices about the Analysis

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## **Wanted to avoid bias when deciding:**

How to use data from the different interferometers

Epoch veto thresholds

Auxiliary-channel vetoes

**There could be bias if these decisions were made based on the set of events from which the result is calculated**

**Solution: set aside a fraction of the data as a “playground”**

Selected ~10 hours of data from various times during S1

Made all decisions based on studying this sample

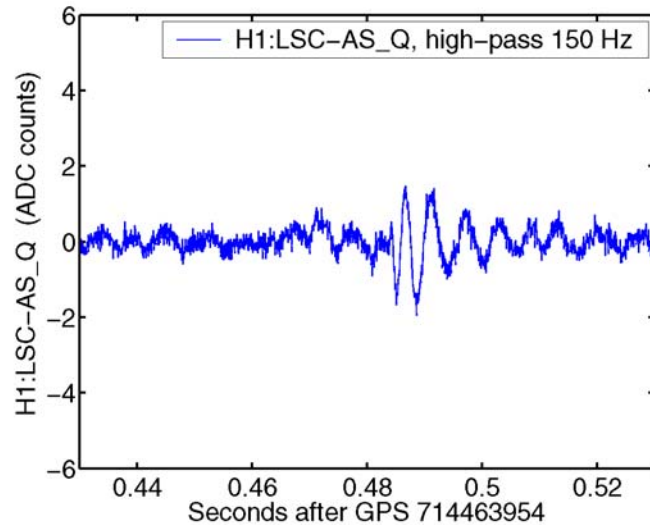
Hoped it would be representative of the full data set

Avoided looking at the remaining data until all choices have been made

**Final result was calculated from the remaining data**

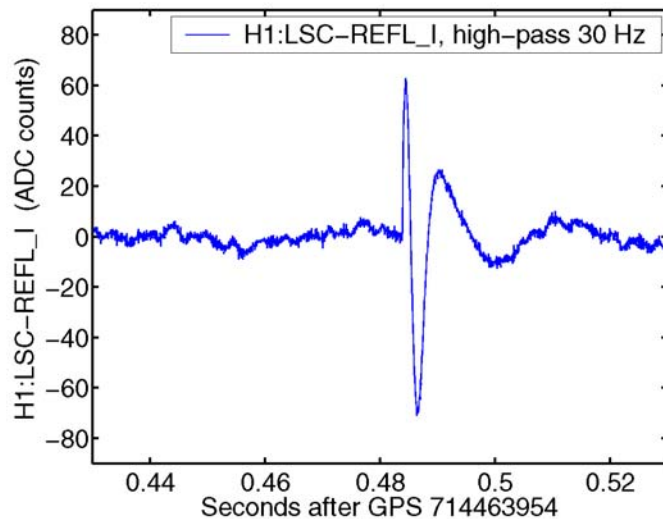


# Big Glitches in H1



← Found by inspiral search code with SNR=10.4

These occurred ~4 times per hour during S1



“REFL\_I” channel has a very clear transient for almost all such glitches in H1

Use “glitchMon” software to generate *veto triggers*

*(Thanks to burst group for help)*



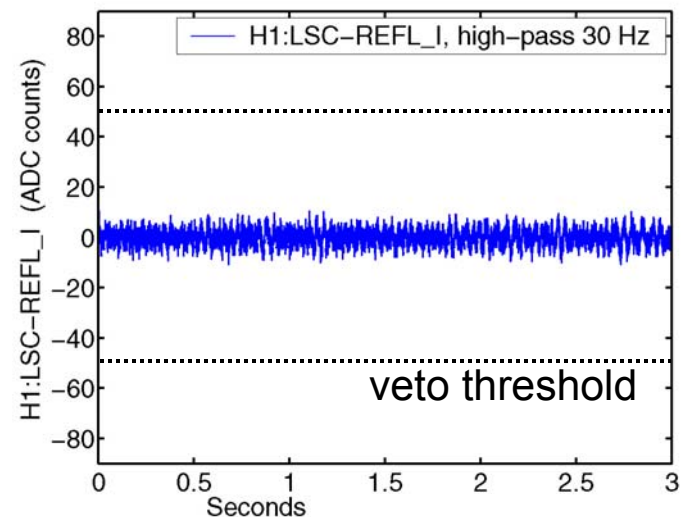
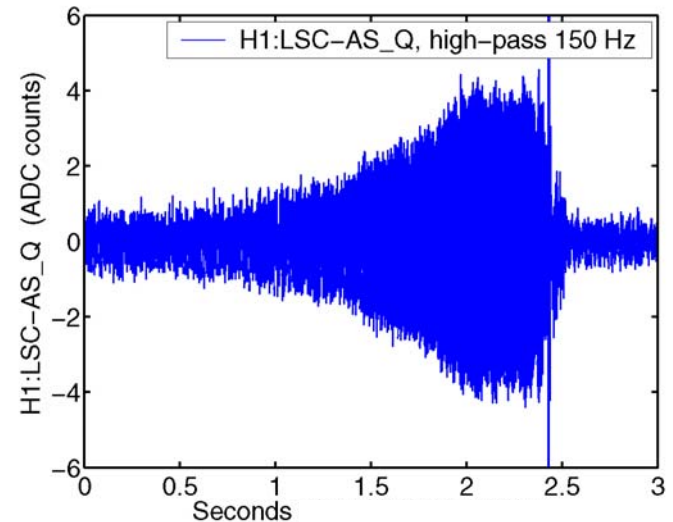
# Veto Safety

Have to be sure a real gravitational wave wouldn't couple into the auxiliary channel strongly enough to veto itself !

Check using hardware signal injection data

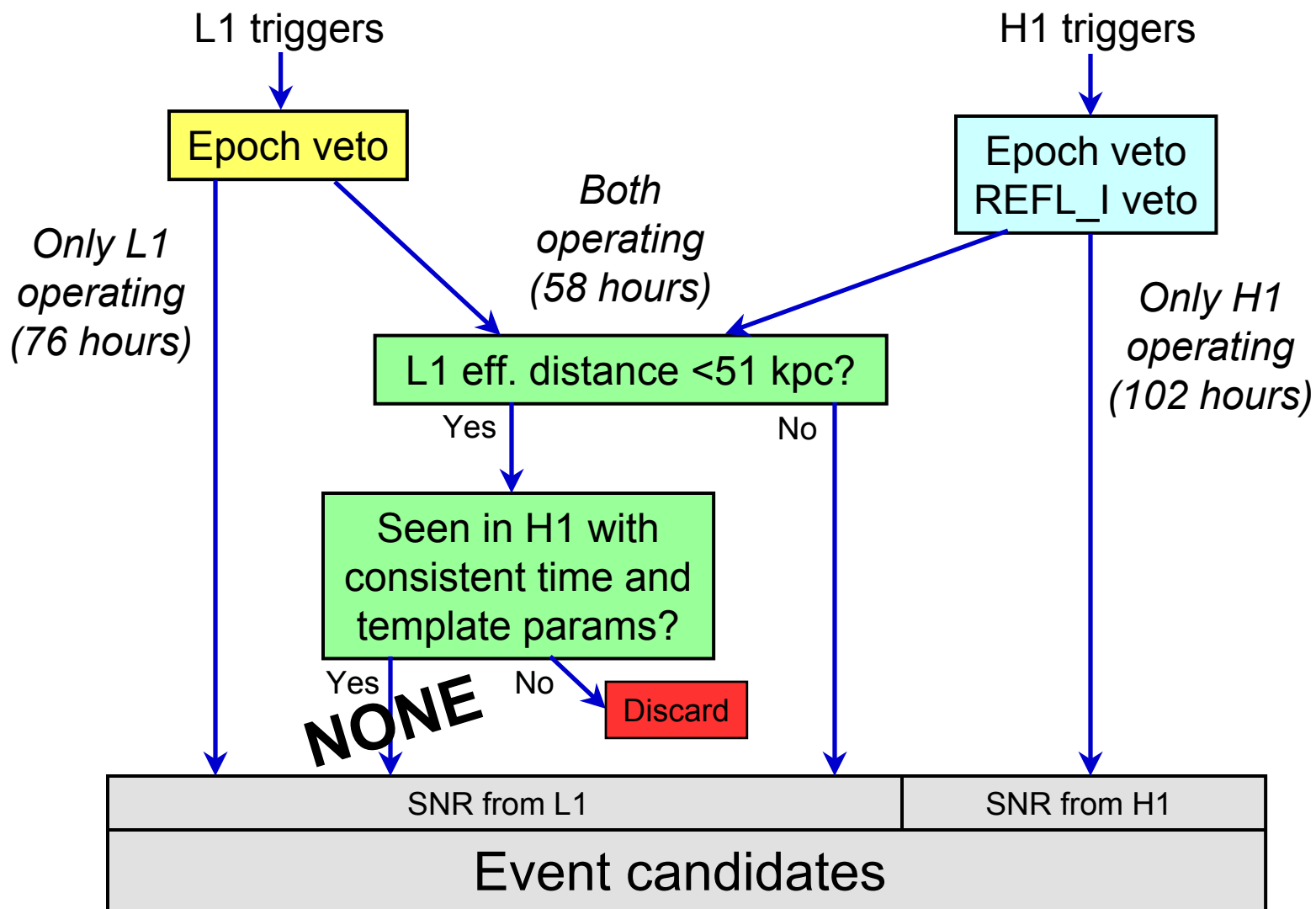
No sign of signal in REFL\_I

Best veto channel for L1 ("AS\_I") was disallowed because there was a small but measurable coupling





# Analysis Pipeline





# Upper Limit Calculation

Add together SNR distributions from all 4 categories

**No reliable way to estimate the background for single-interferometer events**

Would not claim a detection based on this summed-SNR sample

Hard to know *a priori* where one should set SNR threshold  
⇒ Use the “maximum-SNR statistic” to set upper limit

Makes a statistical statement about population above max observed SNR

Useful since background events are so sharply peaked at low SNR

Yields a frequentist upper limit

$$R < \frac{2.3}{N \epsilon T} \quad \text{at 90\% C.L.}$$

Size of target population

Efficiency of analysis pipeline,  
requiring SNR > max SNR in data

Observation time





# Determining the Efficiency of the Analysis Pipeline

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**Use a Monte Carlo simulation of sources in the Milky Way and Magellanic Clouds**

$N = 1.13 \pm 0.06$  Milky Way Equivalent Galaxies (MWEG)

Mass and spatial distributions taken from simulations by Belczynski, Kalogera, and Bulik, Ap J **572**, 407 (2002)

Orbital orientations chosen randomly

**Add simulated waveforms to the real S1 data**

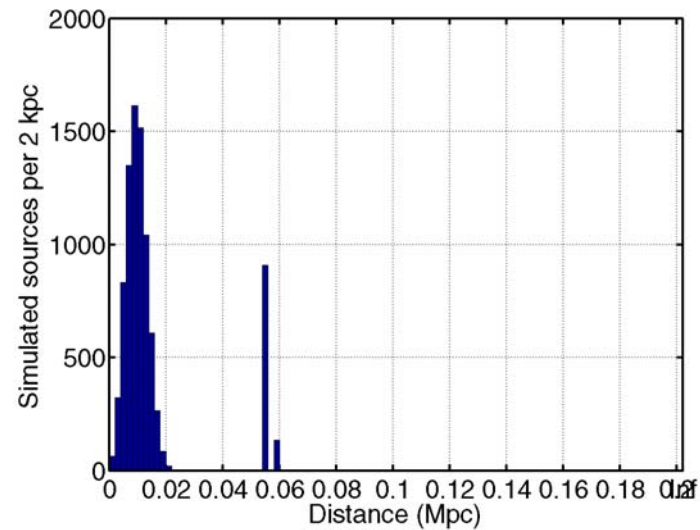
**Run the full analysis pipeline**

**See what fraction of simulated events are found**

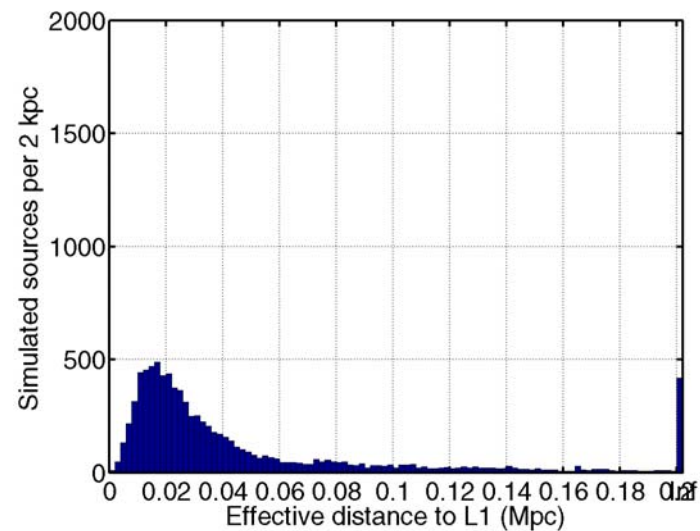


# Distributions from the Simulation

Actual  
Distance

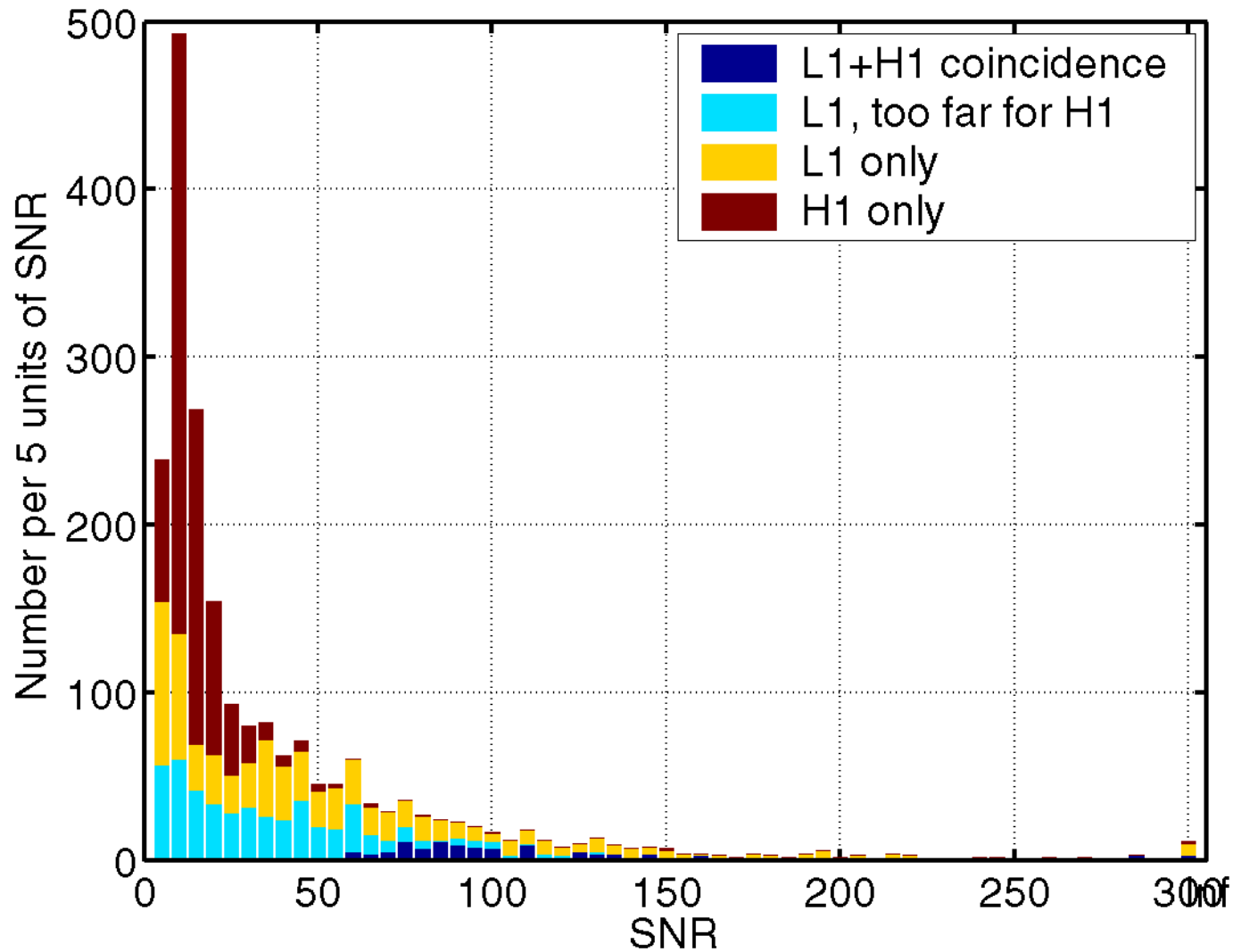


Effective  
Distance





# SNR Distribution from Simulation





# Upper Limit Result

**Analyzing full dataset yields a maximum SNR of 15.9** 

This event seen in L1 only, with effective distance = 95 kpc

Found to be associated with saturation of the photodiode electronics

Several others with  $\text{SNR} > 12$  (inconsistent with Gaussian stationary noise)

**Pipeline efficiency from Monte Carlo (requiring  $\text{SNR} \geq 15.9$ ) :**

$$\varepsilon = 0.51^{+0.07}_{-0.06}$$

Uncertainties from calibration and possible waveform inaccuracies

**Observation time = 236 hours**

**To be conservative, calculate upper limit assuming**

$$N = 1.13 - 0.06 = 1.07 \quad \text{and} \quad \varepsilon = 0.51 - 0.06 = 0.45$$

$$\Rightarrow R < 1.8 \times 10^2 \text{ per year per MWEG at 90\% C.L.}$$



# Sociology

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## **A small group of LSC members contributed to this analysis**

14 in all, by my count; number of FTEs was maybe ~4

Only a few more are showing signs of being active in S2 data analysis

## **Communication requires extra effort**

Weekly telecons; occasional face-to-face meetings; web-based notebook

## **Individuals generally play very distinct roles**

Analysis pipeline, vetoes, statistical method decided by one or two people

It's *very* hard to check what others have done in sufficient detail

## **Mistakes were made and not discovered for a long time**

Software errors in Monte Carlo simulation

Missing events from some LDAS jobs which failed to insert into database

As a group, we're still learning how to scrutinize sufficiently...



# Plans for Future Inspirational Searches

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**Avoid repeating past mistakes!**

**Include more interferometers, as appropriate**

**Better knowledge of data quality and inter-channel coupling**

**Study additional signal consistency checks**

The chi-squared veto does not use “off-chirp” information

**Search for higher-mass binaries**

Challenge to get accurate waveforms

**Search for low-mass MACHO binaries**

Primordial black holes in halo of our galaxy ?

**Do coherent analysis of data from multiple detectors**

Restructure analysis pipeline

**Implement hierarchical search algorithm(s)**



# Summary

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## **The S1 run provided good data**

We had good efficiency for sources throughout our galaxy

## **We've learned a lot about the details of doing data analysis**

Software, mechanics of data processing

Calibration, vetoes, multi-detector strategy, statistical methods, ...

## **We managed to do a fairly sophisticated, scientifically valid analysis for one particular class of sources**

## **There are plans to do more with S2 and future data**

There are lots of ideas waiting to be made reality

It takes a lot of time and effort to develop and fully implement data analysis techniques, and to manage the bookkeeping, studies and cross-checks that are necessary to validate an analysis