



# First LIGO Search for Binary Inspirals

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For the Inspiral Upper Limits Working Group  
of the LIGO Scientific Collaboration

**CaJAGWR Seminar**  
**March 11, 2003**

*Thanks to Gaby González and Albert Lazzarini for sharing visual materials*



# Outline

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**The First Science Run**  
**Inspiral Search Fundamentals**  
**Practical Matters**  
**Rate Limit Calculation**  
**The Future**



# The First Science Run — S1

**August 23 – September 9, 2002 (17 days)**

GEO ran simultaneously with LIGO

**Collected data around the clock**

**Observatories manned by operators and scientific monitors**

Operators keep interferometers working properly

Scimons watch data quality, work on “investigations”

**Control-room tools:**

Fully computerized control system

Data visualization software

Electronic logbook

Many computer/video screens!





# State of LIGO Interferometers During S1

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**All three interferometers operated with power recycling**

Livingston 4 km — L1

Hanford 4 km — H1

Hanford 2 km — H2

**H2 was at full laser power, others at reduced power**

**All three used “common-mode servo”  
and Earth-tide compensation**

## **Limitations:**

Ground noise at Livingston generally made it impossible to lock the interferometer during workdays

Very little of auto-alignment system was operational  $\Rightarrow$  drifts

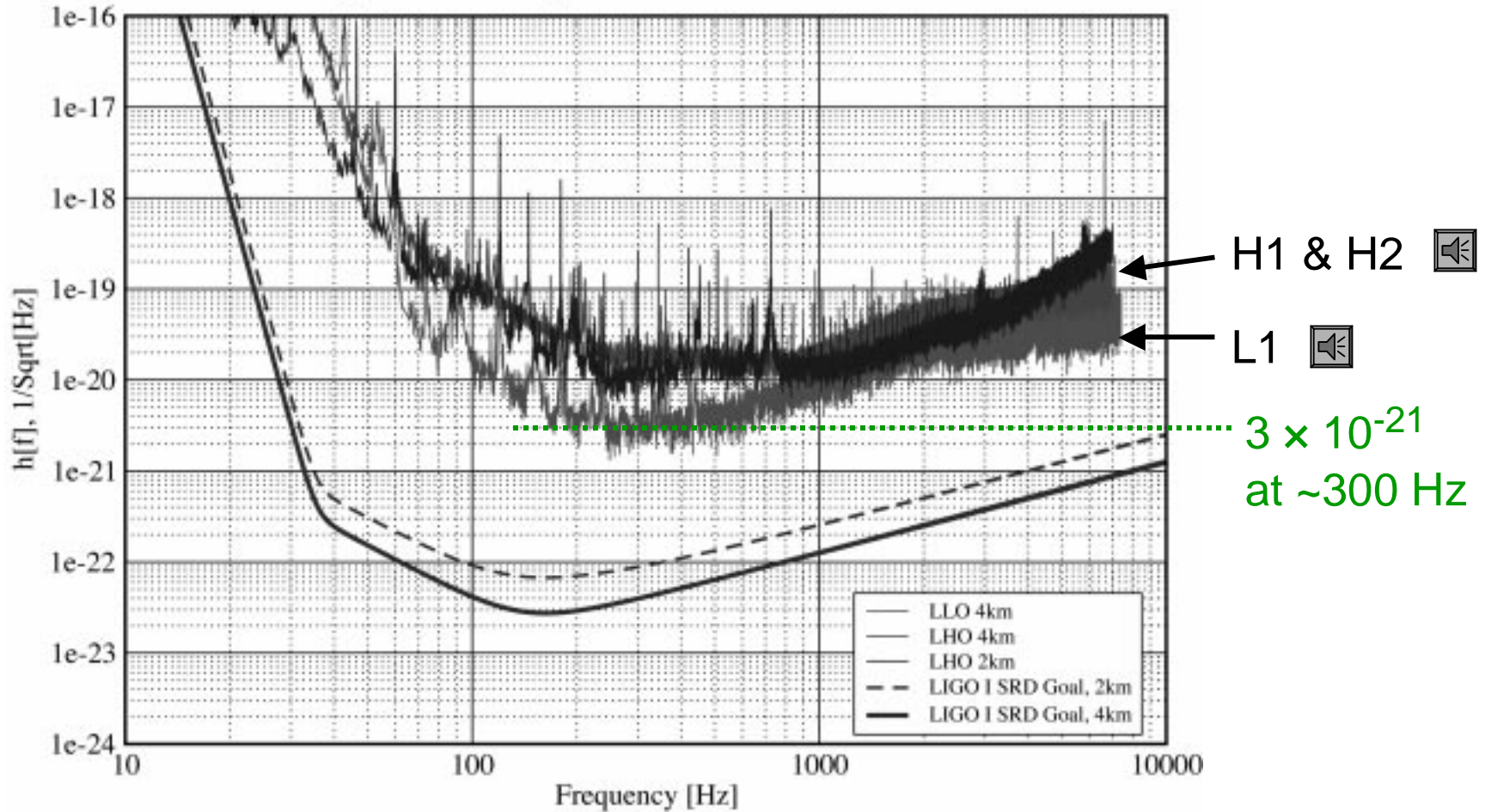
Occasional extended difficulties with locking – due to alignment sensitivity?



# Strain Sensitivities During S1

Strain Sensitivities for the LIGO Interferometers for S1

23 August 2002 - 09 September 2002 LIGO-G020461-00-E





# Ranges for Binary Neutron Stars

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**For an optimally oriented  $1.4+1.4 M_{\odot}$  system,  
to yield  $\text{SNR}=8$  :**

L1 : ~175 kpc

H1 : ~40 kpc

H2 : ~35 kpc

## **Notes**

Averaging over orientations reduces these by a factor of ~2.2

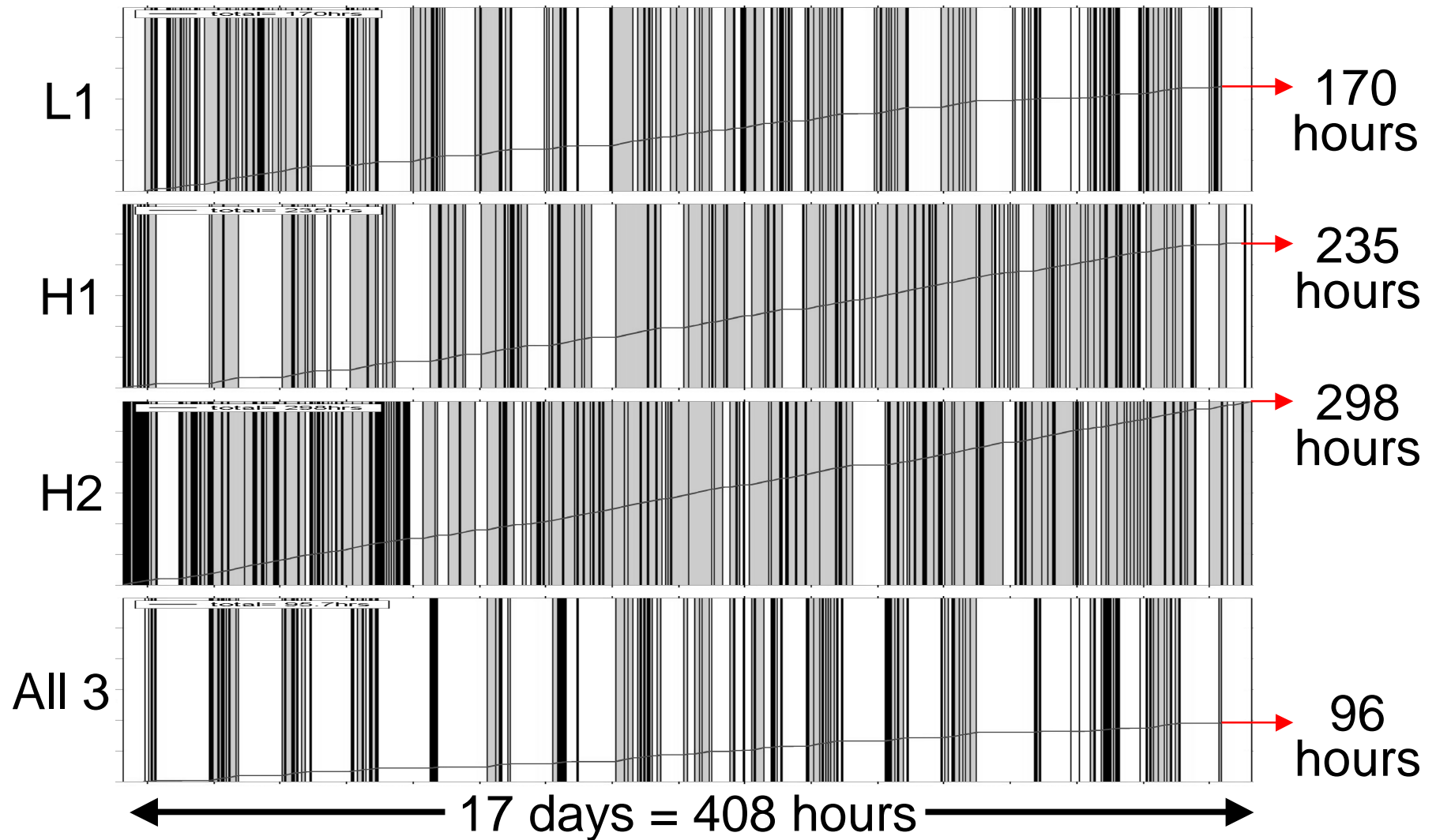
Range is nearly proportional to total mass of binary system

**⇒ We could see most sources in the Milky Way !**

**L1 could see out to the Magellanic Clouds**



# S1 Data Statistics





# S1 Data

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## Data stream includes thousands of channels

The “gravitational-wave channel”, [LSC-AS\\_Q](#)

Auxiliary interferometer sensing & control channels

Environmental monitoring (seismometers, accelerometers, microphones, magnetometers, etc.)

Control settings

## AS\_Q and aux Interferometer channels sampled at 16384 Hz

Digital servo system

Use whitening / dewatering filters to avoid ADC / DAC digitization noise

Data volume: 5.8 MB/sec from Hanford, 2.9 MB/sec from Livingston

## Full data set written to disk at observatories

Full data set sent to Caltech and U. of Wisconsin–Milwaukee

Reduced data set generated and sent to MIT





# Data Analysis Organization

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**Data Analysis is the job of the LIGO Scientific Collaboration**

**Four LSC “upper limit” working groups were formed**

Organized around signal types: burst, inspiral, continuous-wave, stochastic

Most data analysis is done in the context of one of these groups

**Interact via weekly teleconferences, email lists, electronic notebooks, occasional face-to-face meetings**

**Inspiral Upper Limit Working Group**

Led by Patrick Brady (UWM) and Gabriela González (LSU)

Others who contributed to this analysis:

Bruce Allen (UWM), Duncan Brown (UWM), Jordan Camp (Goddard),

Vijay Chickarmane (LSU), Nelson Christensen (Carleton), Jolien Creighton

(UWM), Carl Ebeling (Carleton), Valera Frolov (LLO), Brian O’Reilly (LLO),

Ben Owen (Penn State), B. Sathyaprakash (Cardiff), Peter Shawhan (CIT)



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# Overview of the S1 Inspiral Search

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**Use optimal matched filtering to search for the known waveforms of binary inspirals**

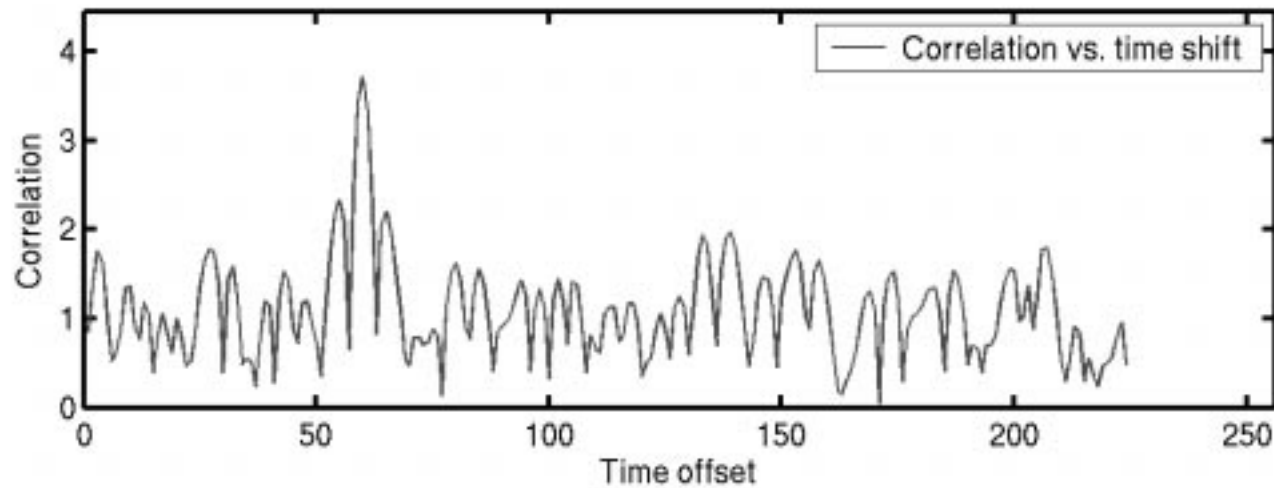
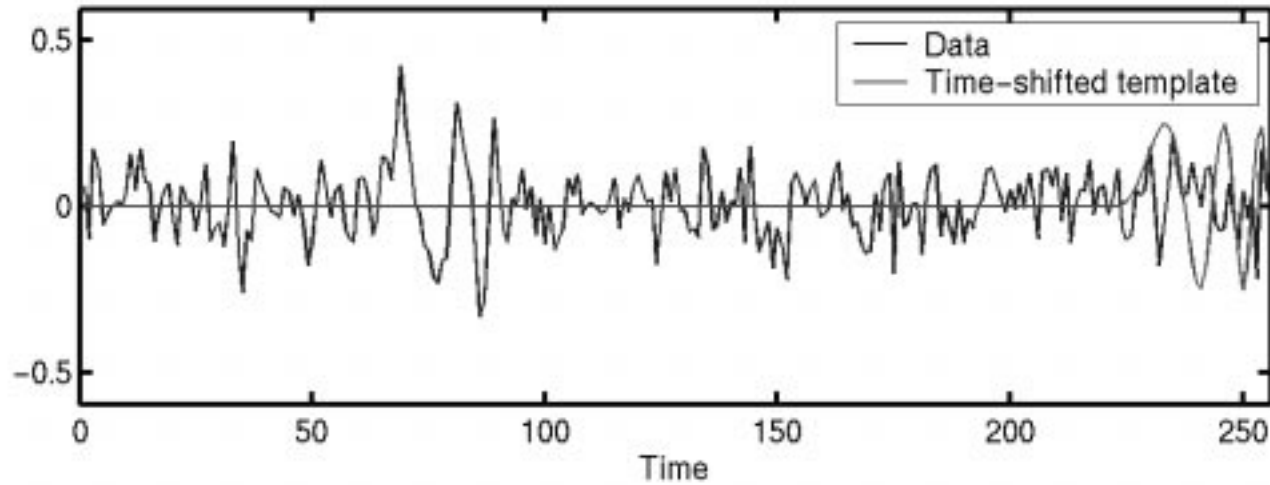
**Do filtering in frequency domain, weighting according to noise spectrum**

**Lay out a “bank” of templates to catch any signal for which each component in the binary system has a mass between  $M_{\odot}$  and  $3 M_{\odot}$**

**Check that candidate signals have the expected distribution of signal power as a function of frequency**



# Illustration of Matched Filtering





# Optimal Filtering Using FFTs

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

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

Combine, 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

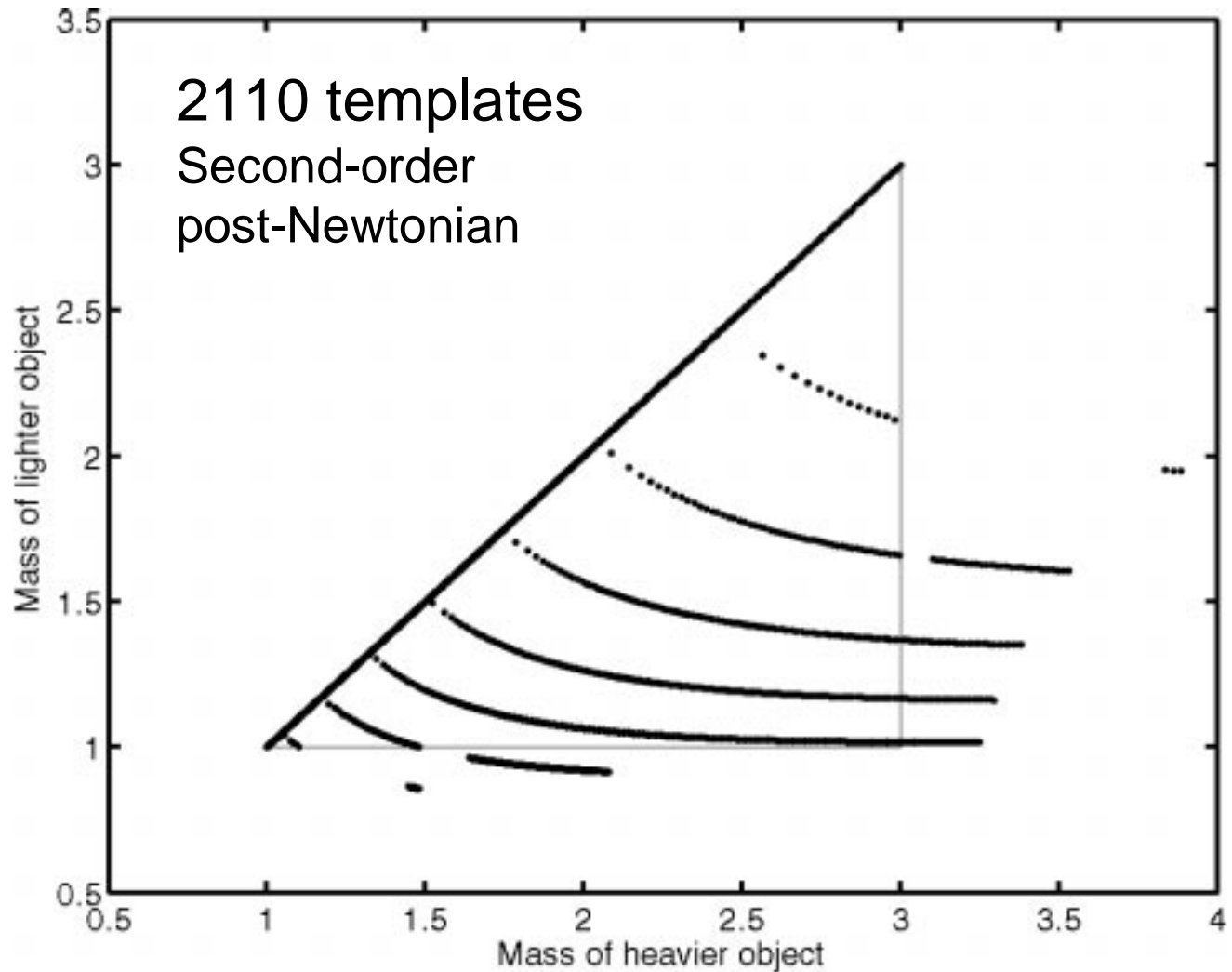
Characterize event by signal-to-noise ratio,  $\rho$



# Template Bank

Calculated  
based on L1  
noise curve

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





# “Chi-Squared Veto”

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

**The essence of a “chirp” is that the signal power is distributed over frequencies in a particular way**

**Divide template into sub-bands and calculate a  $\chi^2$ -like quantity:**

$$r^2(t) = \sum_{l=1}^p |z_l(t) - z(t)/p|^2$$

**Correct for large signals which fall between points in the template bank:**

$$\alpha^2(t) = r^2(t) / (1 + \rho^2 \delta^2 / p)$$

**We use  $p = 8$  and make the cut  $\alpha^2 \leq 5$**



# Data Processing

**The search is performed using routines from 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 of the processing for this analysis was done on the UWM LDAS system, which has 296 PCs



**Each LDAS job processes 256 seconds of data**

Consecutive jobs overlap by 32 seconds

Events which exceed an SNR threshold of 6.5 and pass the chi-squared veto are written to the LDAS database







# 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 an  $\alpha^2$  value well below the cut



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# Real Detectors...

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## **... are not on all the time**

- ⇒ Need to do bookkeeping when running jobs
- ⇒ Need to decide how to combine data from multiple detectors

## **... have time-varying noise**

- ⇒ Discard data when detector was not very sensitive
- ⇒ Estimate noise from the data

## **... have a time-varying response**

- ⇒ Calibration

## **... have “glitches”**

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



# Making Choices about the Analysis Pipeline

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**Need to avoid the possibility of human bias when deciding:**

Which interferometers to use

What data to discard

Chi-squared veto cut

Auxiliary-channel vetoes

**Can't make these decisions based on looking at the data from which the result is calculated !**

**Set aside 10% of triple-coincidence data as a “playground”**

Make all decisions based on studying this sample

Hope it is representative of the full data set

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

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



# Data Set Selection

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## **We chose to use L1 and H1 only**

H2 was the least sensitive, and glitchier than the others

## **Even when locked, interferometer may not be stable**

Settling down at the beginning of a lock

Periodic tuning of alignment to maximize arm powers

## **Operators mark “science mode” data while running**

Guarantees that no control settings are being changed

## **We choose to discard science-mode data when noise is larger than normal — “Epoch veto”**

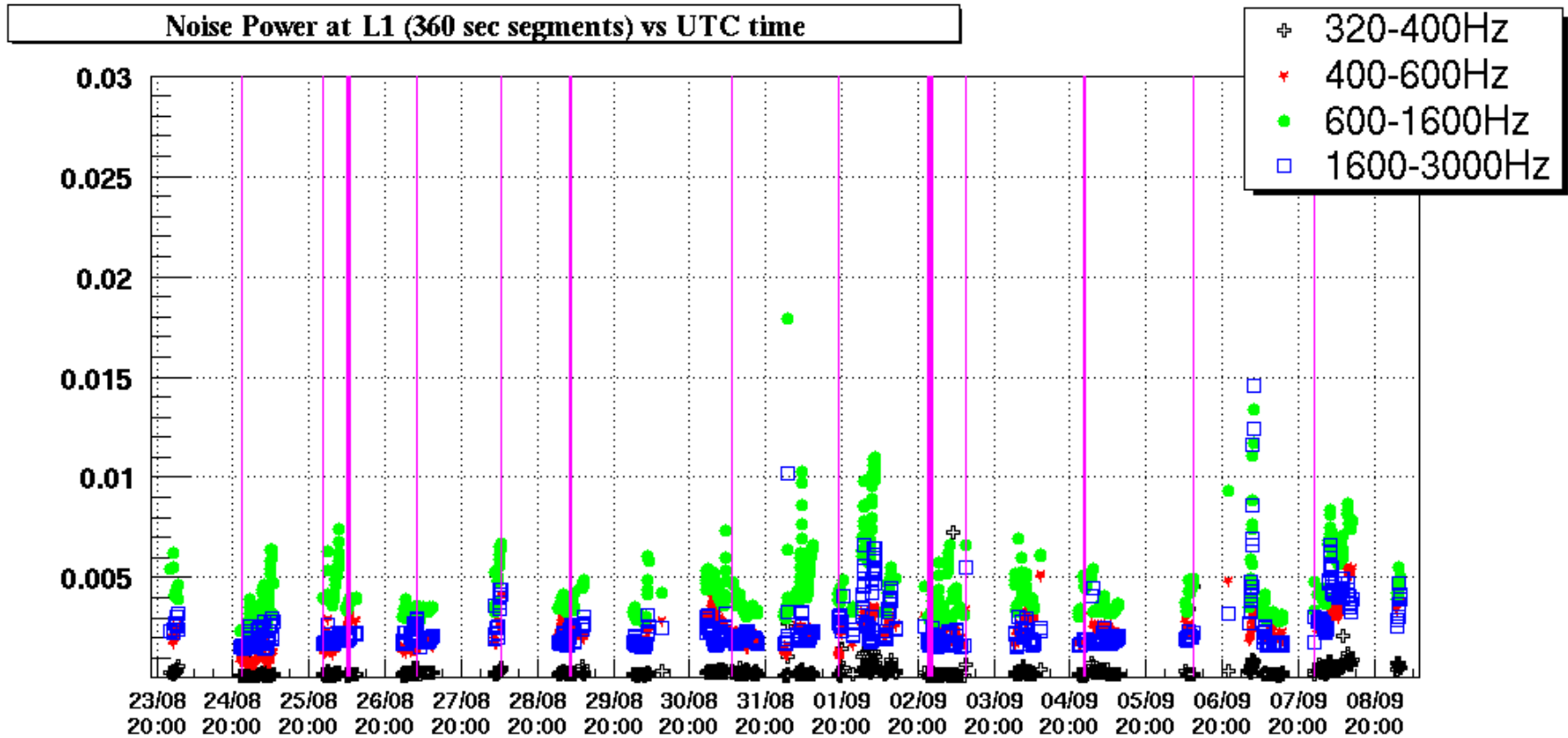
Power calculated in four frequency bands

Segment of data is discarded if any band exceeds a threshold

Cuts 23% of L1 data, 31% of H1 data

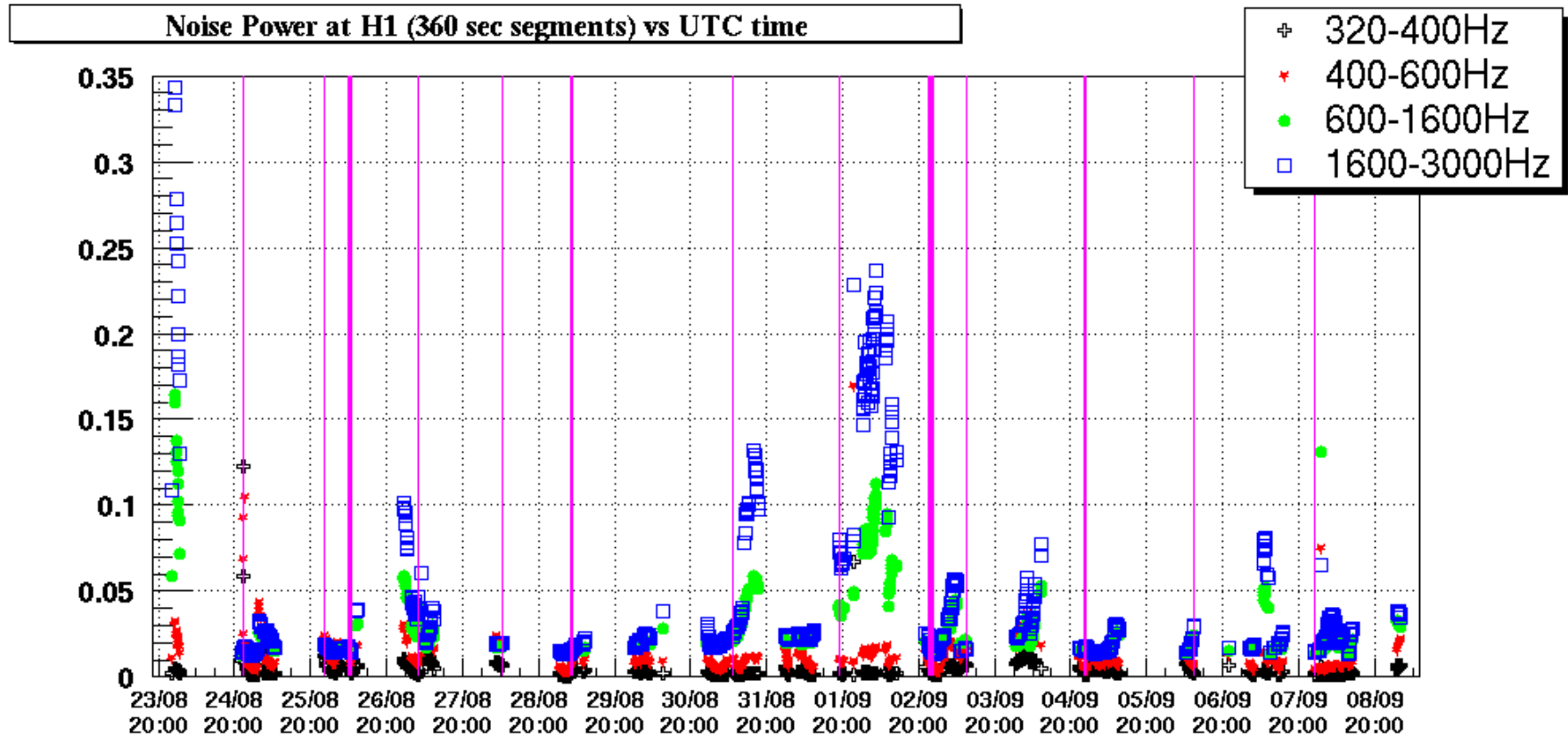


# Epoch Veto Bands for L1





# Epoch Veto Bands for H1





# Noise Estimation

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**Crucial, since it enters into the calculation of SNR**

**Power spectral density of noise is calculated from the data which is input to each LDAS job**

Calculated by averaging PSDs from 7 overlapping 64-sec time intervals

Note that this includes any signal which may be in the data

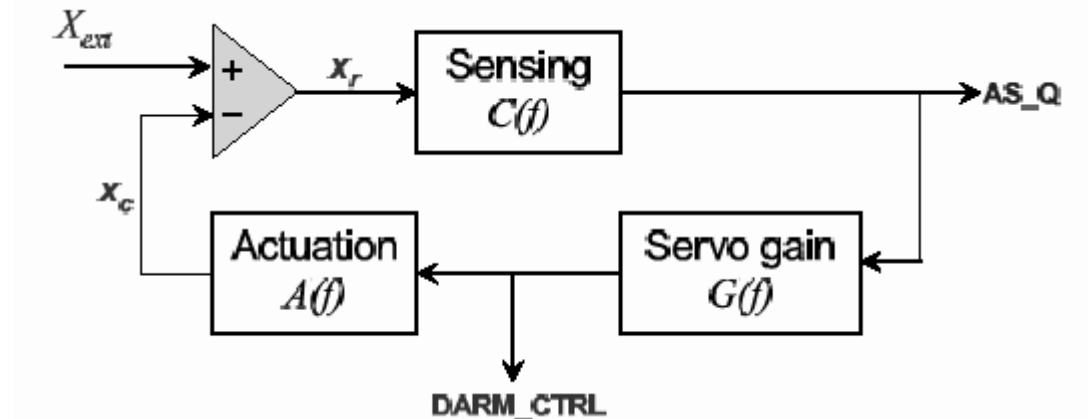
**Optimal filtering in frequency domain requires us to assume that the PSD is constant for the whole job**



# Calibration

Optical sensing is inherently frequency-dependent

Servo system introduces additional frequency dependence

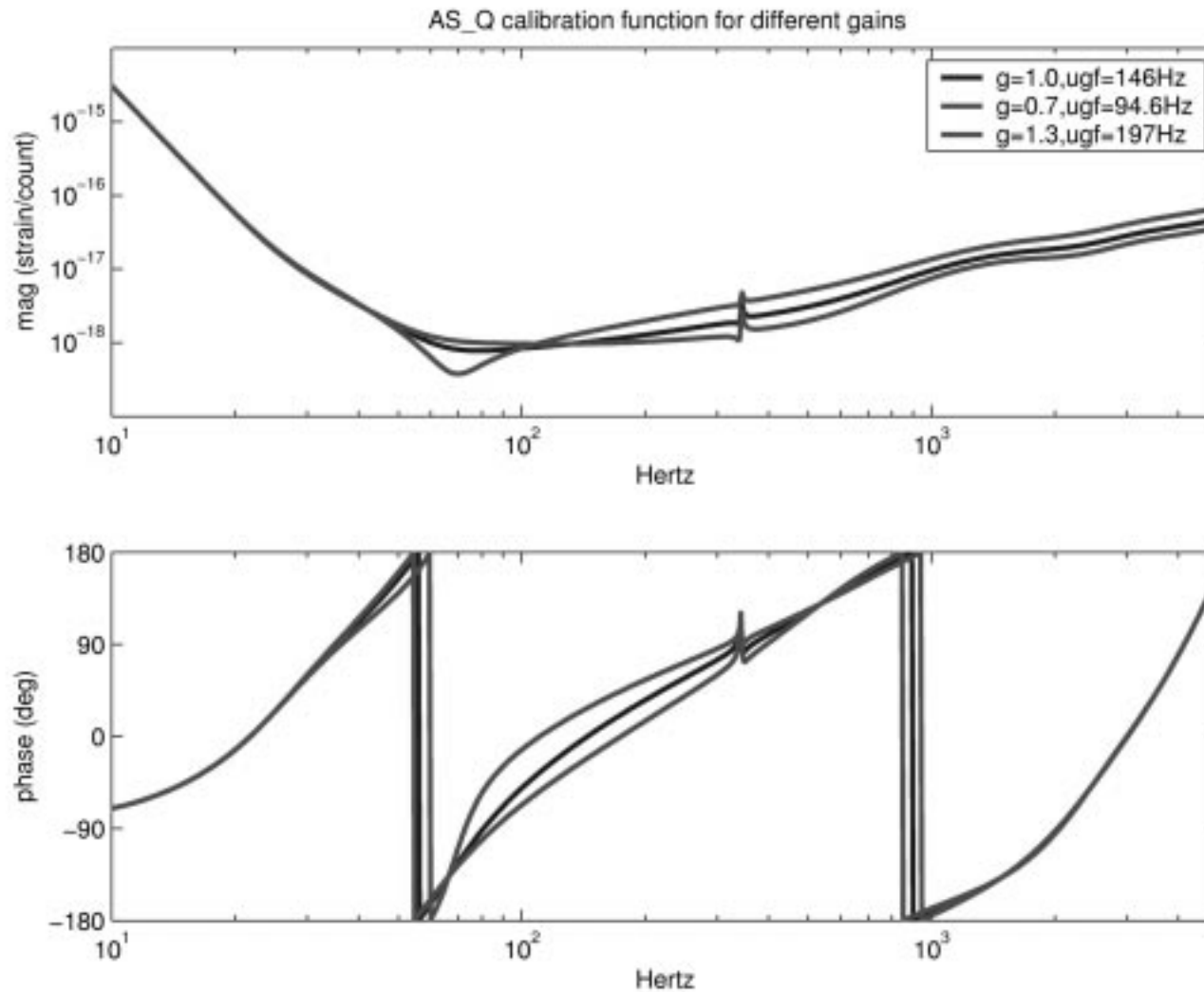


Periodically measure complete transfer function

Also, continuously inject “calibration lines” (sinusoidal wiggles on an end mirror) at a few frequencies to track variations in the optical response over time



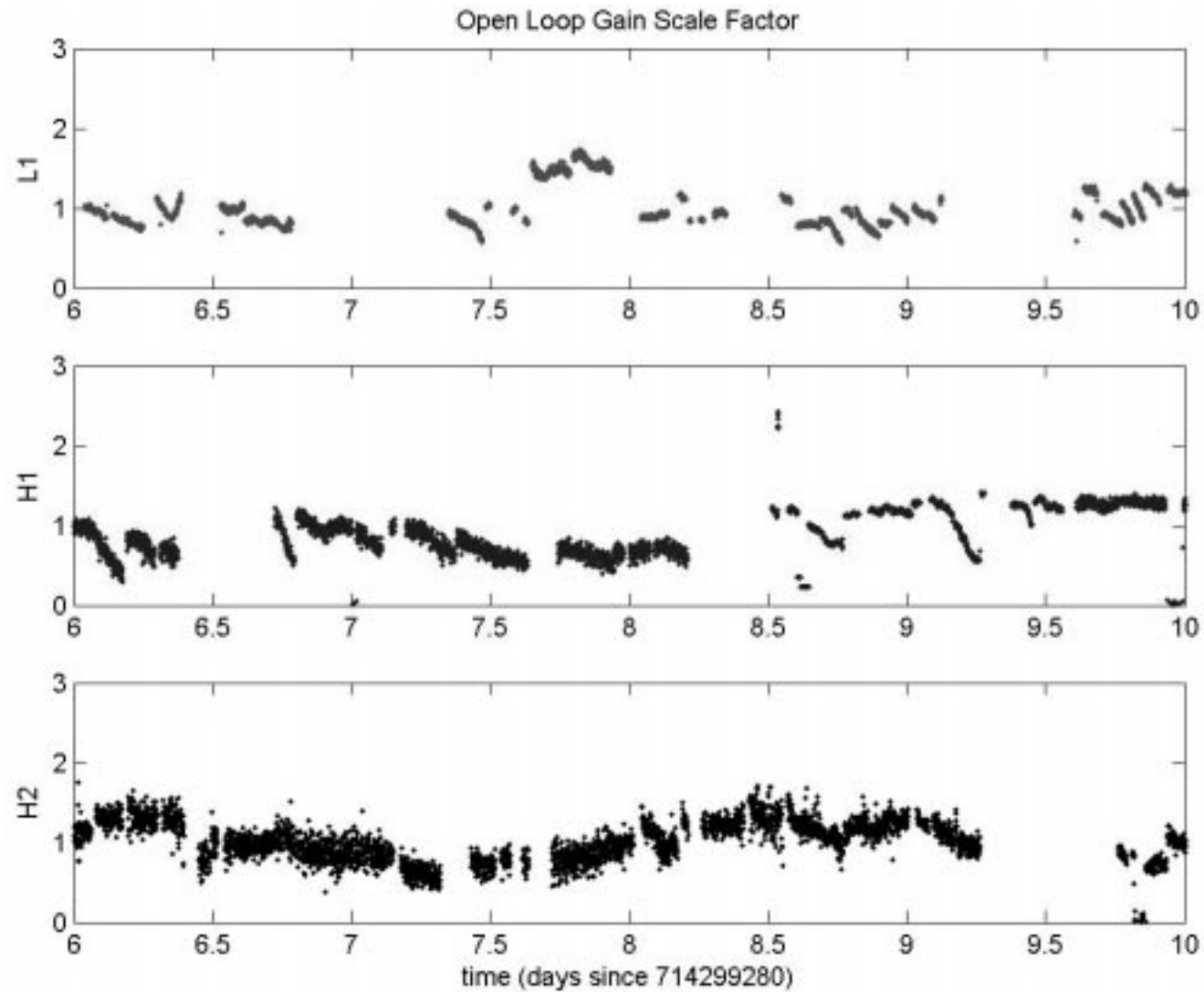
# Effect of Changing Optical Gain



Affects phase as well as amplitude—important for matched filtering



# Calibration Stability





# Auxiliary-Channel Vetoes

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## **“Glitches” in the gravitational-wave channel**

Seen, at some level, in all three interferometers

Chi-squared veto eliminates many, but not all

## **We checked for corresponding signatures in other channels**

Environmental channels (accelerometers, etc.)

Auxiliary interferometer channels

## **Tried a few glitch-finding algorithms**

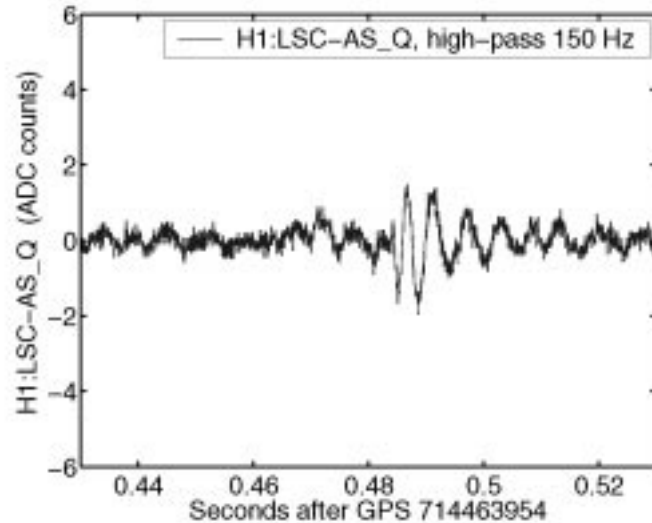
absGlitch

glitchMon

Inspiral search code (!)

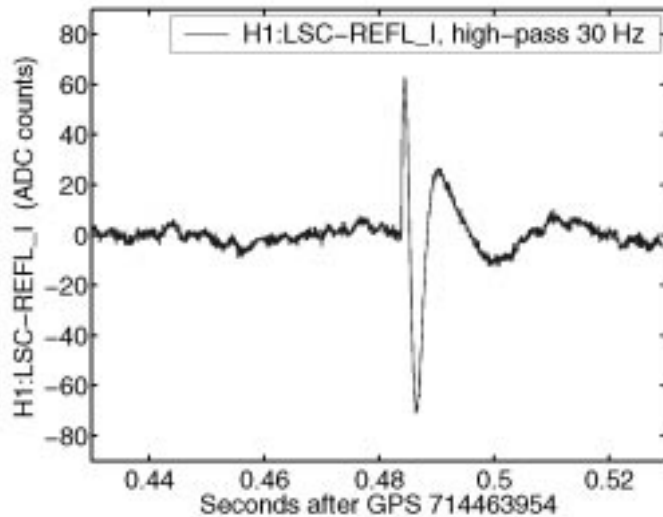


# Big Glitches in H1



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

Use glitchMon to generate veto triggers



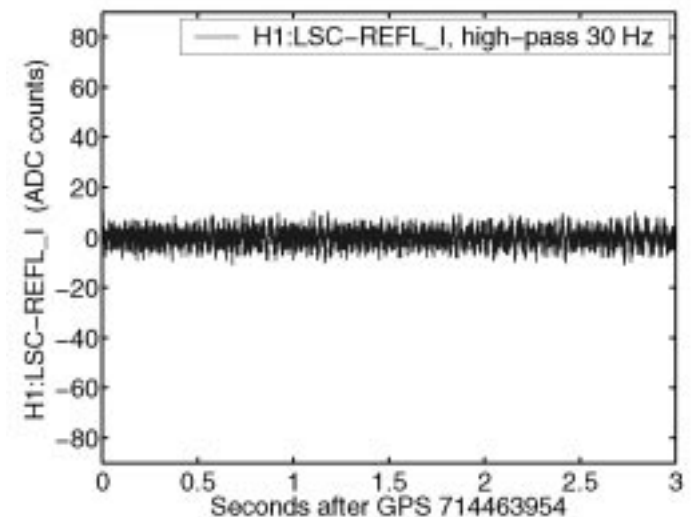
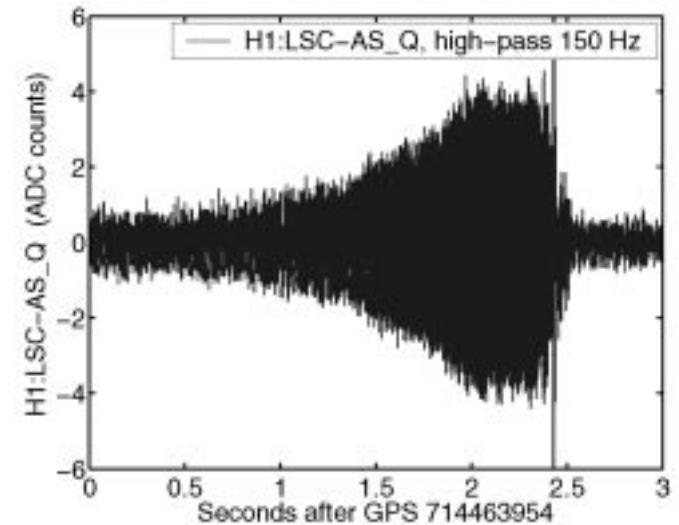
# Veto Safety

Have to be sure there aren't couplings between channels which would cause a real gravitational wave to veto itself !

Look at large injections

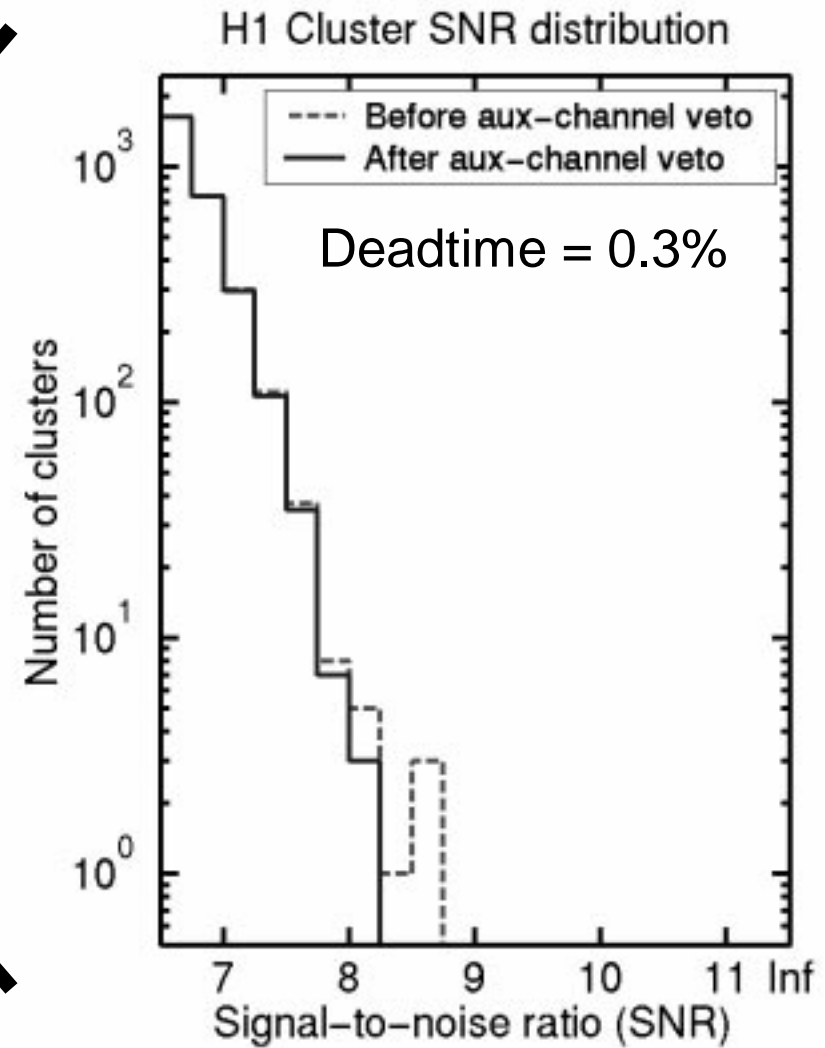
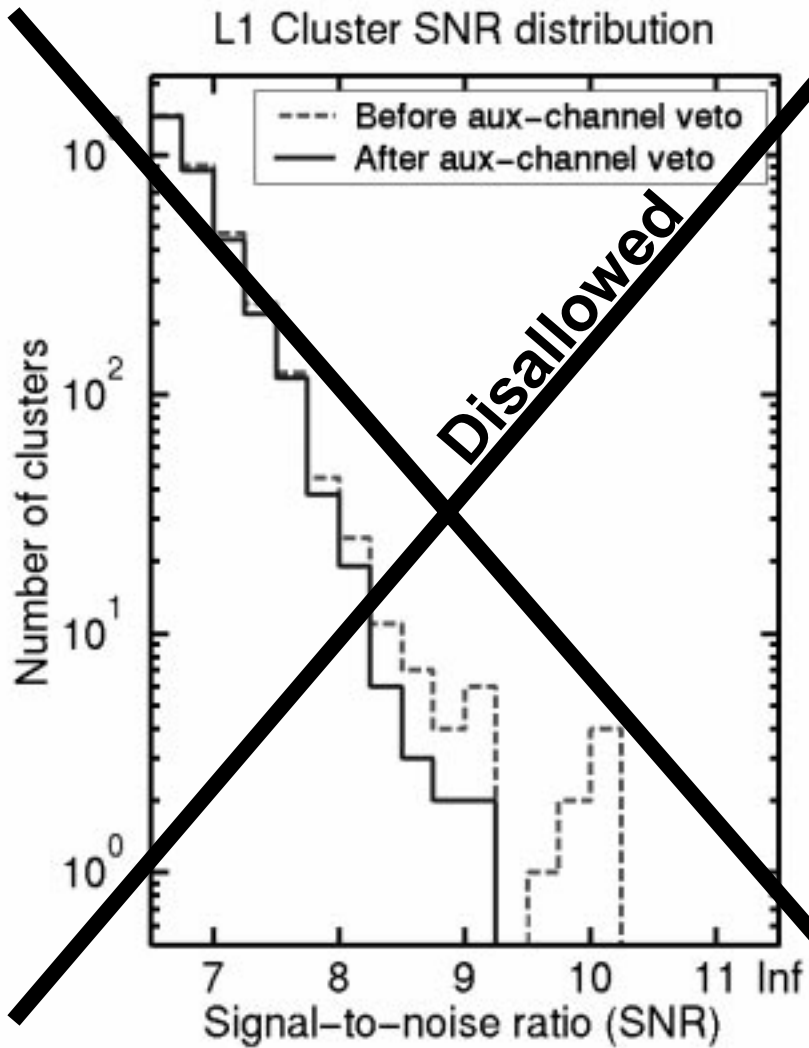
No sign of signal in H1:LSC-REFL\_I

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





# Effect of Vetoes on Playground Data





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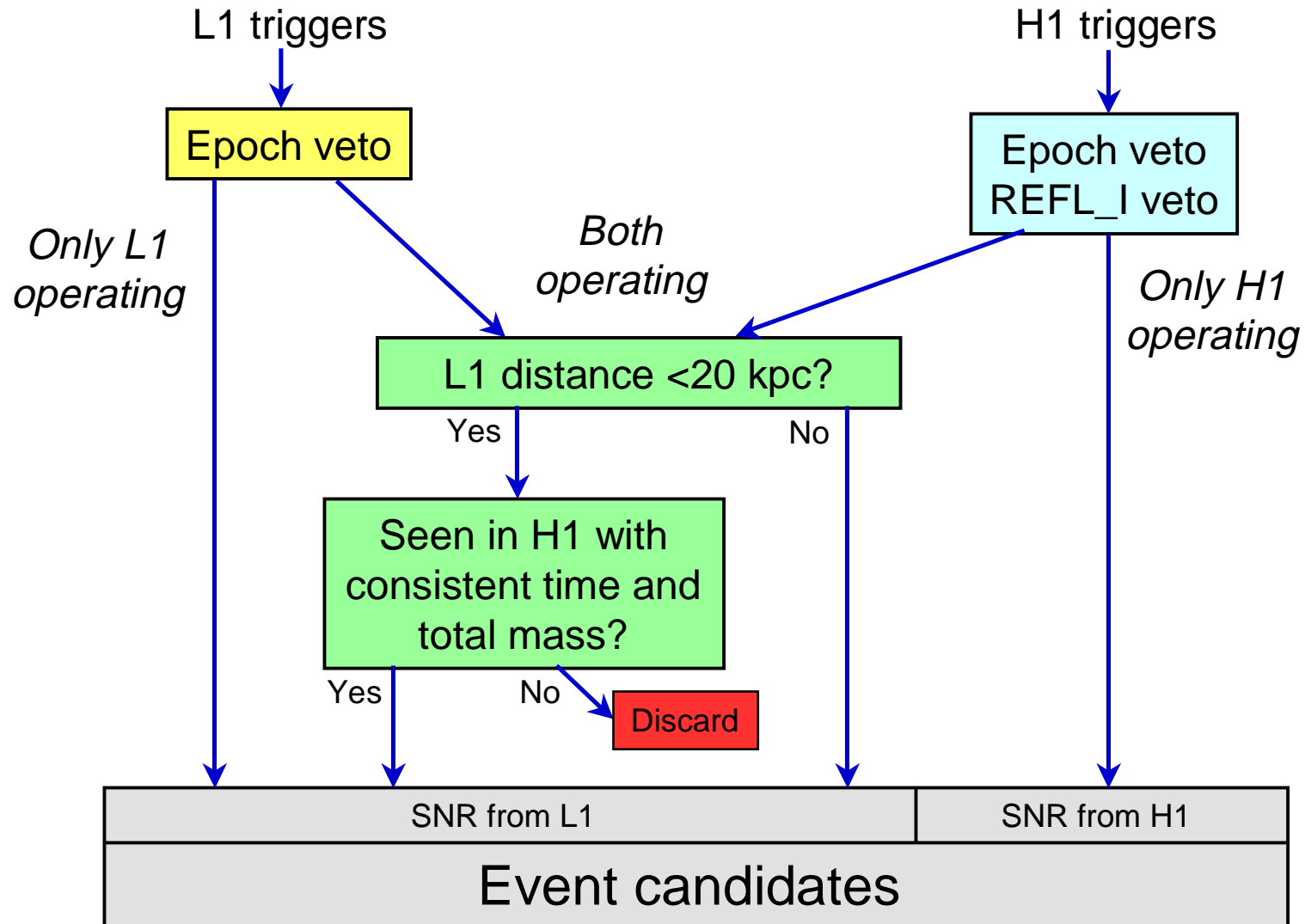
**Rate Limit Calculation**

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# Analysis Pipeline





# Statistical Method

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***Expected rate in Milky Way is very low !***

**Philosophy: concentrate on getting best upper limit**

**⇒ Use all four categories of event candidates**

Yields 289 hours of observation time,  
vs. 116 hours of simultaneous L1+H1 operation

**Add together SNR distributions from each category**

**Use the “maximum-SNR statistic”**

Because it's hard to know *a priori* where one should set a threshold

Useful since candidate events are so sharply peaked at low SNR

Yields a frequentist upper limit,  $R(90\%) < 2.3 / (\epsilon T)$

Efficiency of analysis pipeline  
above observed max SNR

Observation time



# Calculating the Efficiency of the Analysis Pipeline

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

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

Inspiral orientation chosen randomly

Distribution of Earth orientation is same as for S1 data

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

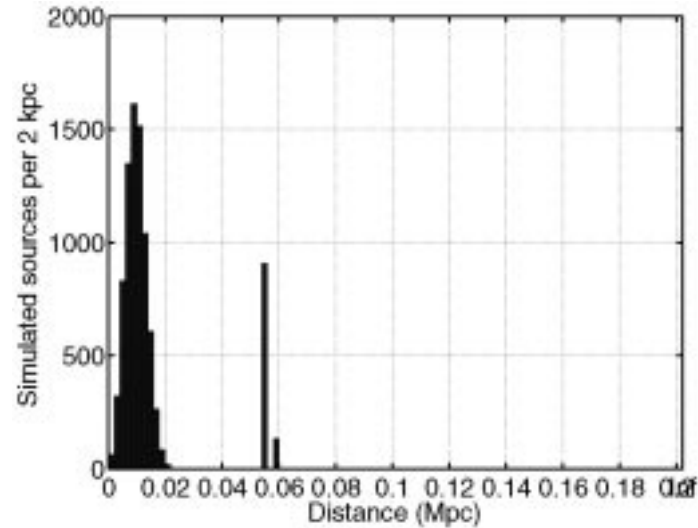
## **Run the full analysis pipeline**

## **Look at what simulated events are found**

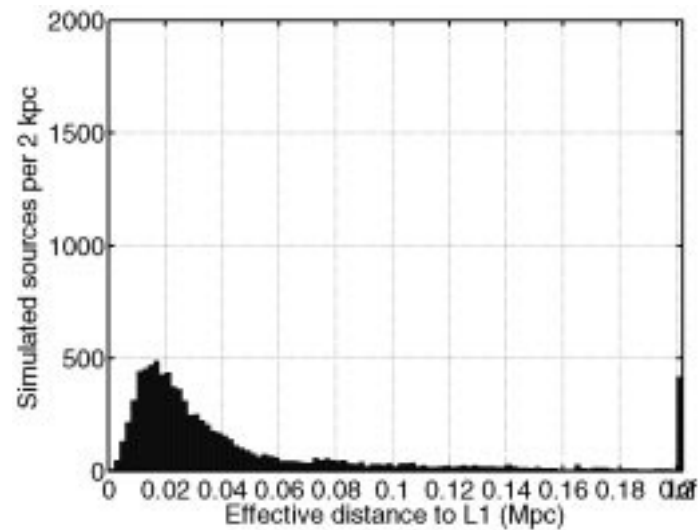


# Distributions from the Simulation

Actual  
Distance

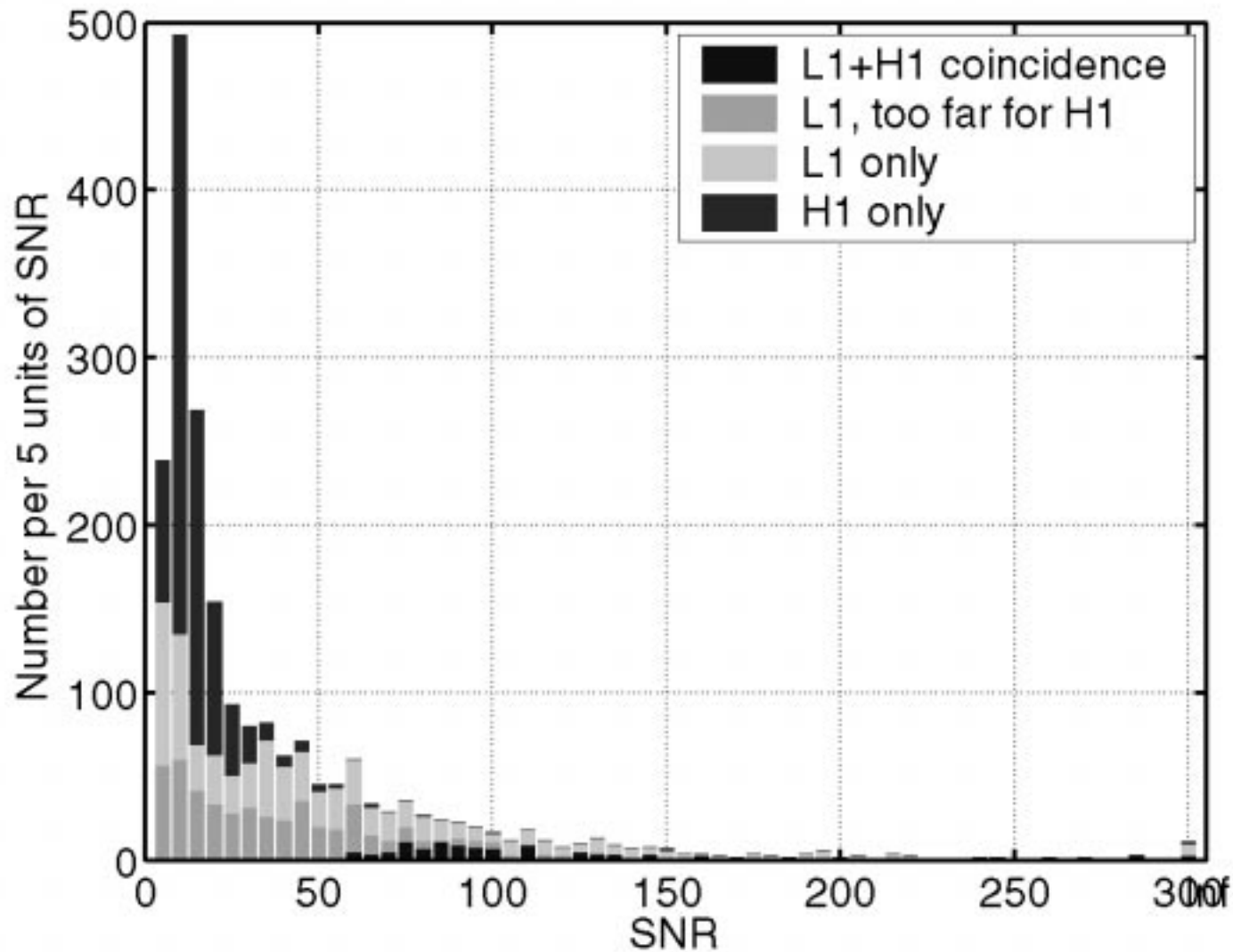


Effective  
Distance





# SNR Distribution from Simulation





# Preliminary Result

(as presented at AAAS Meeting)

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

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

There are no event candidates in the coincidence category

⇒ **Pipeline efficiency for Monte Carlo = 0.35**

**Observation time = 295.3 hours**

⇒ **R(90%) = 170 per year**

**Note: This is not the final result**

It was calculated without using the epoch veto

Final result will not be too different



# Plans to Finish This Analysis

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## **Systematics have not really been evaluated**

Calibration uncertainty

Uncertainties in power spectrum estimation

Modeling of sources in galaxy

## **A paper has been drafted**

Focuses on method as well as giving the result

Has been reviewed by LSC internal review committee

Now available to all members of the LSC

Will be presented at the LSC Meeting next week

Hope to submit it in the next few weeks

***We must finish this soon and move on to later data***



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# The S2 Run

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## Now in progress !

Began February 14, runs through April 14

**Detector sensitivities are much better than for S1**

**Duty factors are about the same, so far**

## **Improvements since S1:**

Better alignment control, especially for H1

Better monitoring in the control rooms

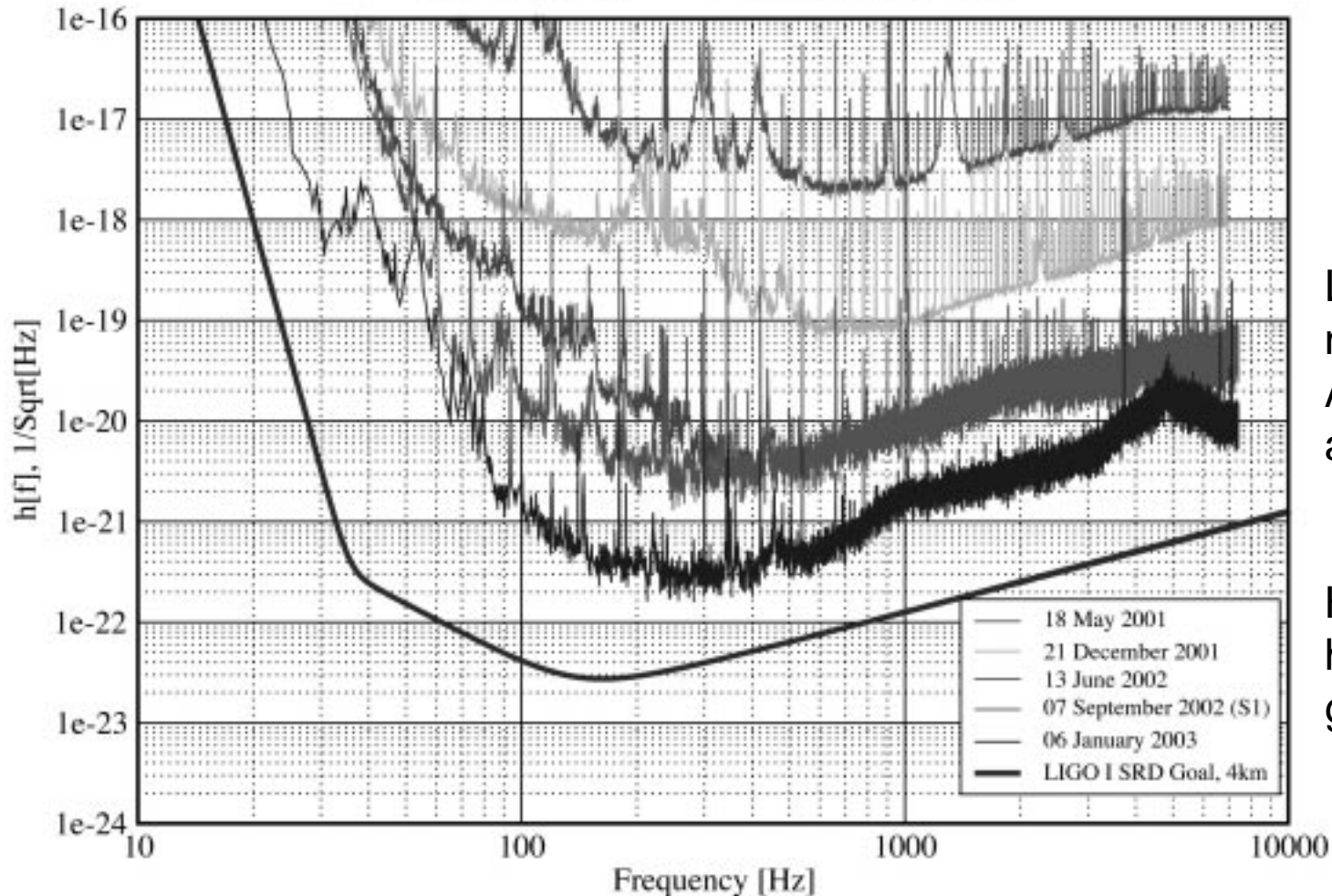
Inspiral search code is being run in near-real-time for monitoring purposes



# Sensitivity Continues to Improve

Strain Sensitivity for the LLO 4km Interferometer

31 January 2003 LIGO-G030014-00-E



L1 should now reach Andromeda and M33 !

H1 and H2 have improved greatly too



# Future Directions for Inspirational Searches

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## **Re-think analysis pipeline**

May be better to keep categories separate rather than folding them all together

## **Study additional veto criteria**

Some obvious glitches survive the chi-squared veto

## **Search for higher-mass binaries**

Hard to get accurate waveforms

## **Search for low-mass MACHO binaries**

## **Implement hierarchical search algorithms**



# Summary

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

We see our whole galaxy

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

Mechanics of data processing

Calibration, vetoes, statistical methods, ...

## **Much better data is being collected now**

But only yields a modest increase in number of inspiral sources

The real payoff will come when we reach the Virgo Cluster

**⇒ This is only the first of many inspiral searches !**