



# Data Analysis Techniques for LIGO

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## Lesson Plan

### Yesterday:

1. Introducing the problem: GW and LIGO
2. Search for Continuous Waves
3. Search for Stochastic Background

### Today:

4. Search for Binary Inspirals
5. Search for Bursts
6. Network Analysis



# GW Detectors Worldwide





# Benefits of a global network

- **Improved sky coverage**
  - Less likely that event occurs in null of detector network
- **Improved duty cycle**
  - More likely that at least one detector observes an event
- **Improved search algorithms**
  - Three detector sites permit fully coherent search
- **Improved detection confidence**
  - Multi-detector coincidence greatly reduces false rate
  - Coherent consistency tests can differentiate between gravitational-wave signals and instrumental glitches
- **Improved source reconstruction**
  - Inverse problem requires three detector locations
  - Sky position reconstruction, waveform reconstruction, astrophysical parameter estimation, etc.
  - This is where the science is!
- **Shared best practices**
  - Learn from each other's approaches

# Coincidence Analysis

The “historical” approach: we demand a signal to show up in all detectors: **AND strategy**

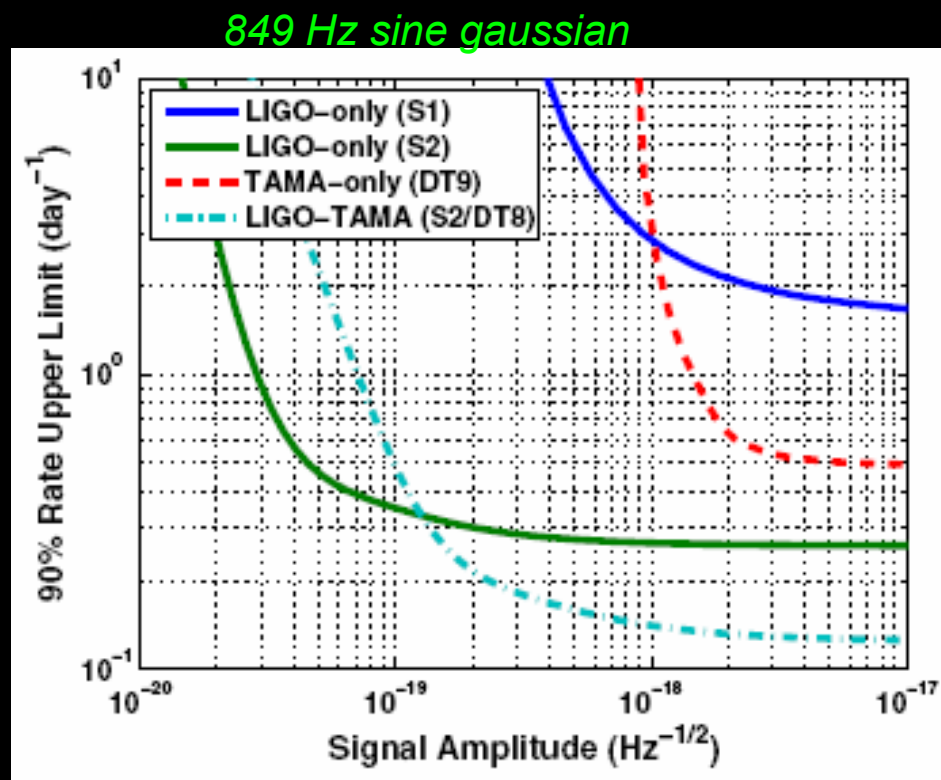
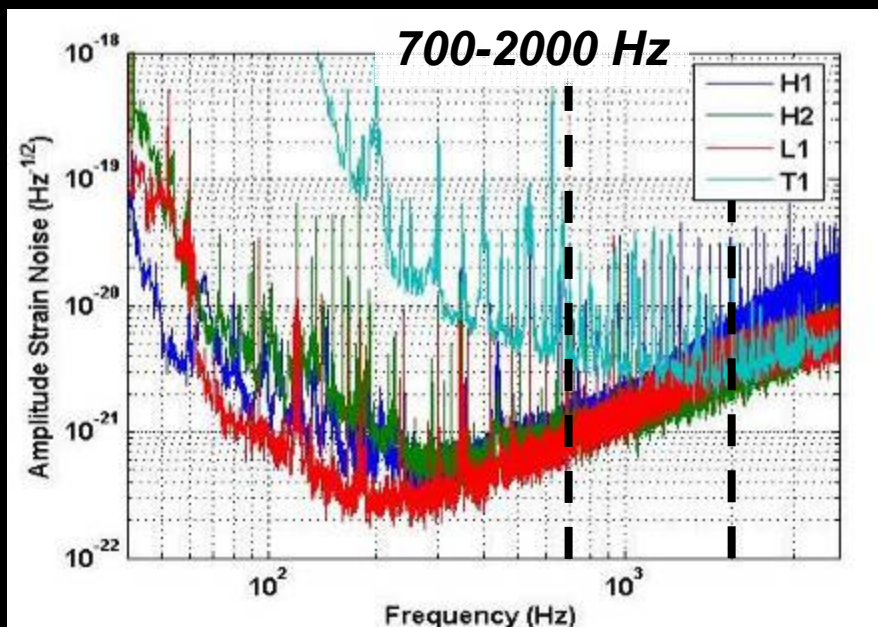
benefits and costs:

- Reduction of false alarm rate
- Increase in observation time
- Confidence in a coincident detection
- Sensitivity restricted to common band, limited by the least sensitive detector

Coherent analyses will help us avoid sensitivity loss when one detector has a poor noise spectrum.

# S2: LIGO-TAMA

TAMA300 Mitaka (Japan)

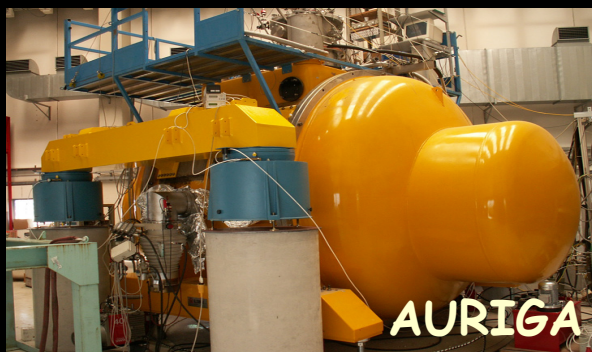


detector combination	observation time (hr)	fraction of total observation time
H1	1040	74%
H2	821	58%
L1	536	38%
T1	1158	82%
H1-H2-L1-T1	256	18%
H1-H2-nL1-T1	320	23%
H1-H2-L1-nT1	62	4%
network totals	638	45%

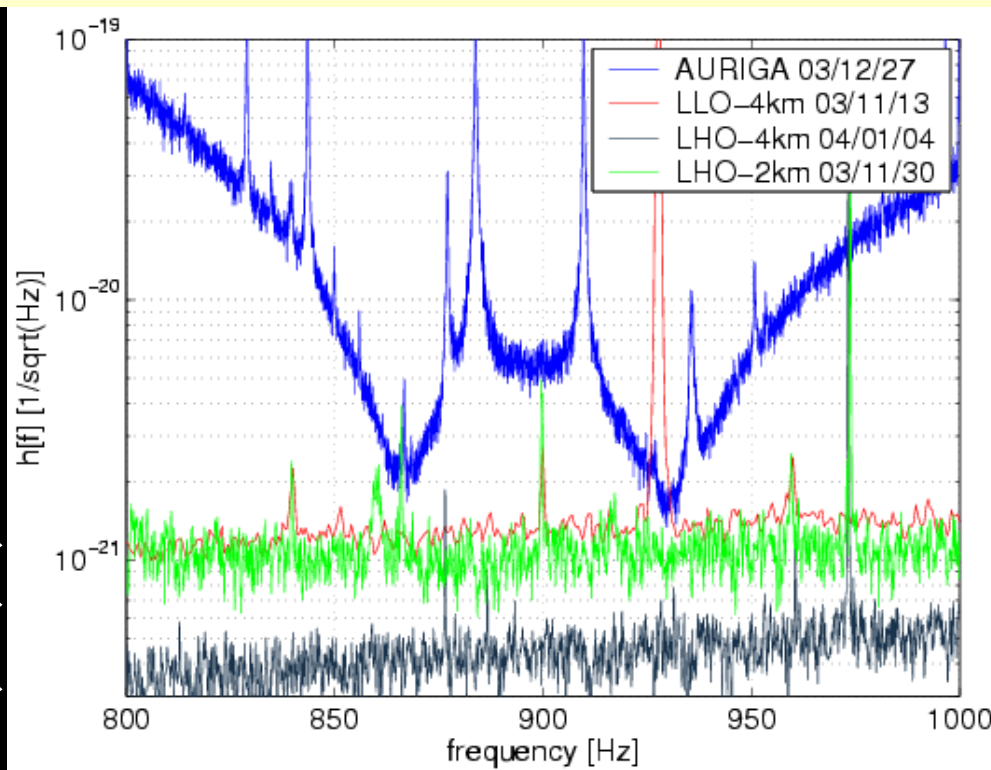
PHYSICAL REVIEW D 72, 122004 (2005)

# S3:LIGO-AURIGA

LIGO S3 run: Oct 31 2003 – Jan 9 2004  
 AURIGA run 331: Dec 24 2003 – Jan 14 2004



LIGO-6070051-00

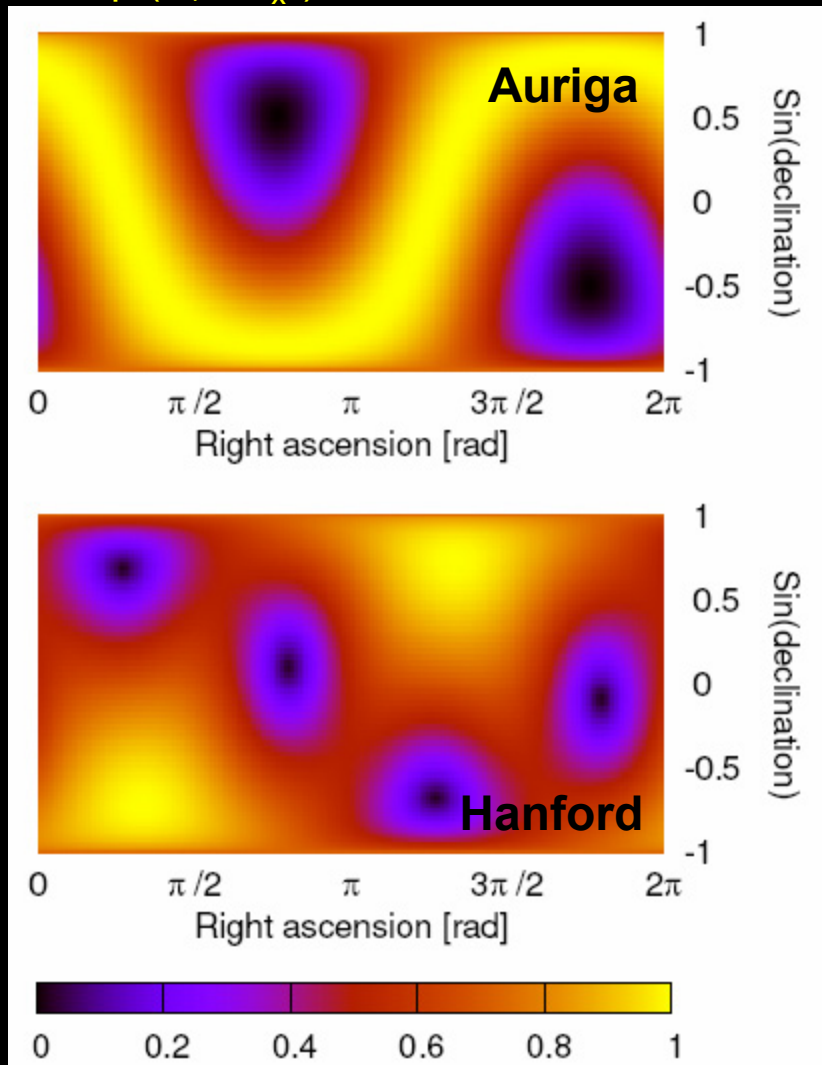


Best performance during the 331 and the S3 run

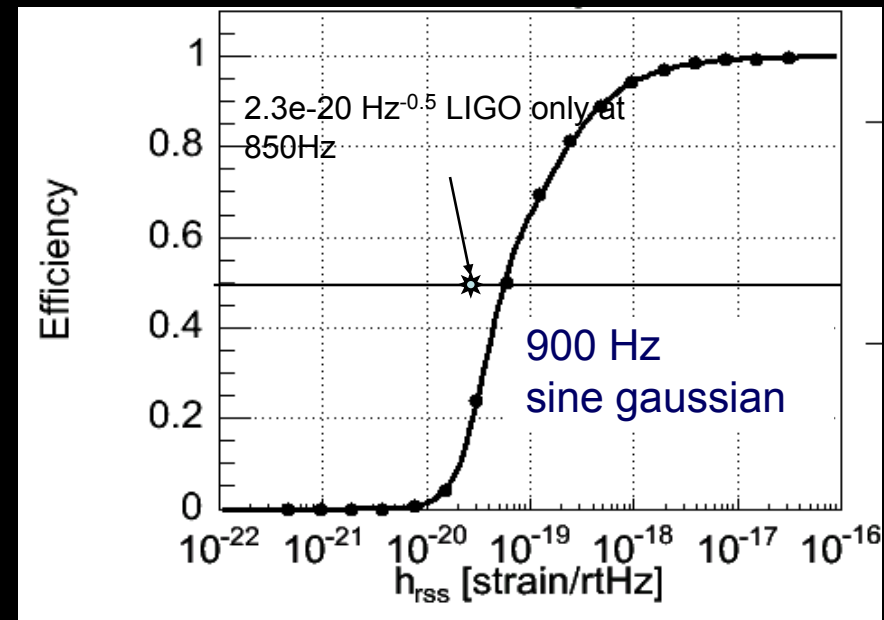
- LIGO S3: large rate of transients, noise variability
- AURIGA 331: poor data quality (un-modeled excess noise)

# S3:LIGO-AURIGA

$$\text{sqrt}(F_+^2 + F_x^2)$$



Method: r-statistic test (LIGO cross-correlation) around the time of the AURIGA triggers.

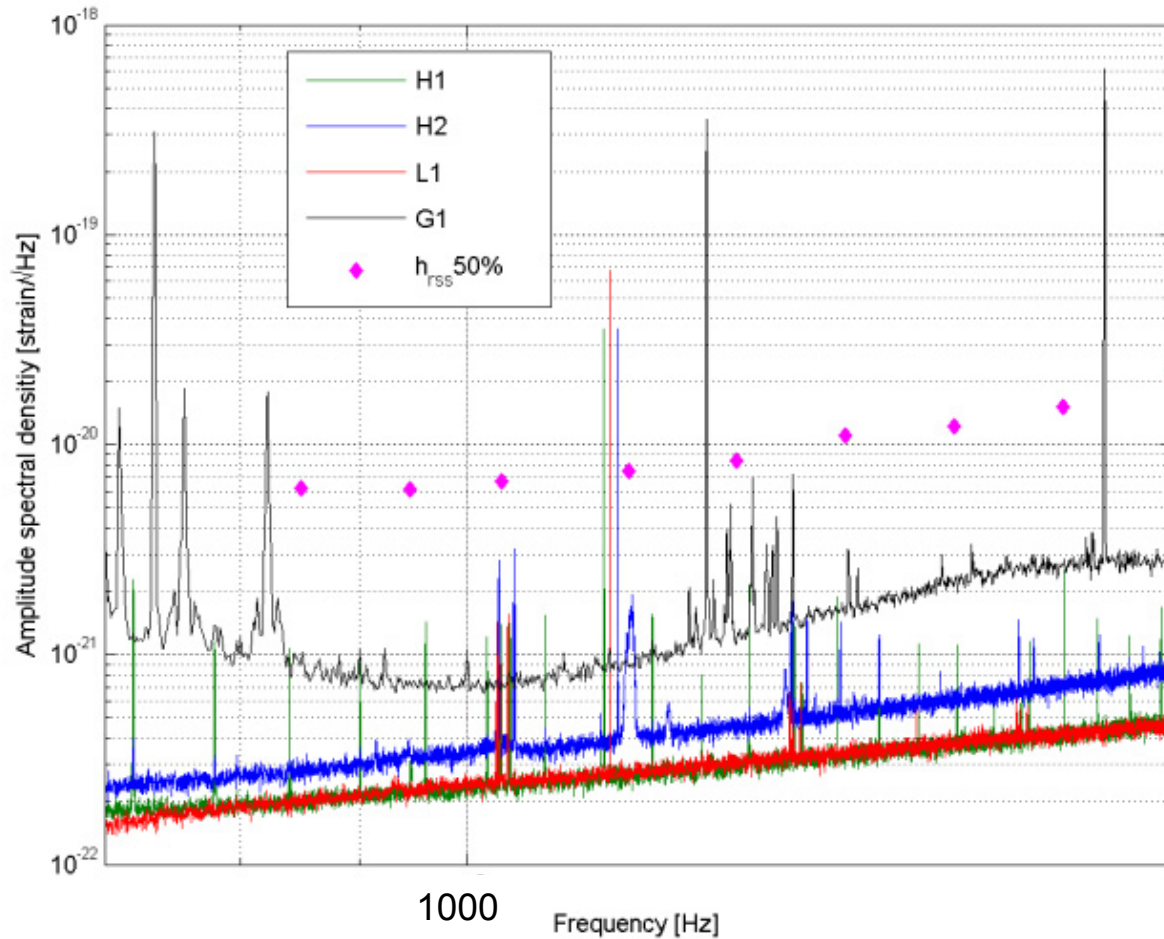


Ref: *J. Phys.: Conf. Ser.* 32 32 (2006) 198-205

Ref: *Class. Quant. Grav.* 22 (2005) S1337-S1347



# S4: LIGO-GEO



Method: 4-detector waveburst and r-statistic test. (direct extension of LIGO pipeline). Larger frequency.

GEO600 (British-German Hanover, Germany)

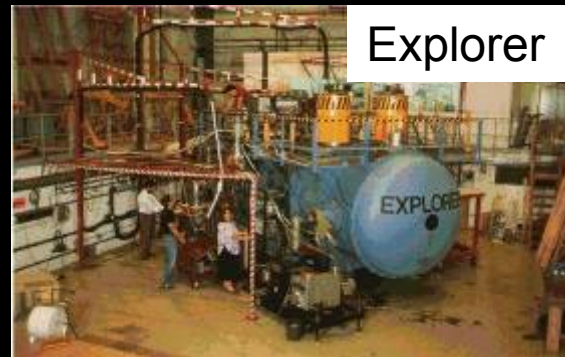


# S5+: LIGO-IGEC2

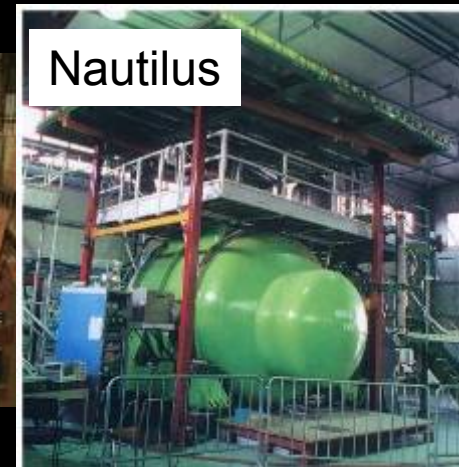
Exploring methods for

- detection validation (no joint upper limit);
- coverage for times when only one interferometer is functioning

communication protocols,  
early warning alert



Explorer



Nautilus



Auriga



Allegro

# LIGO-Virgo

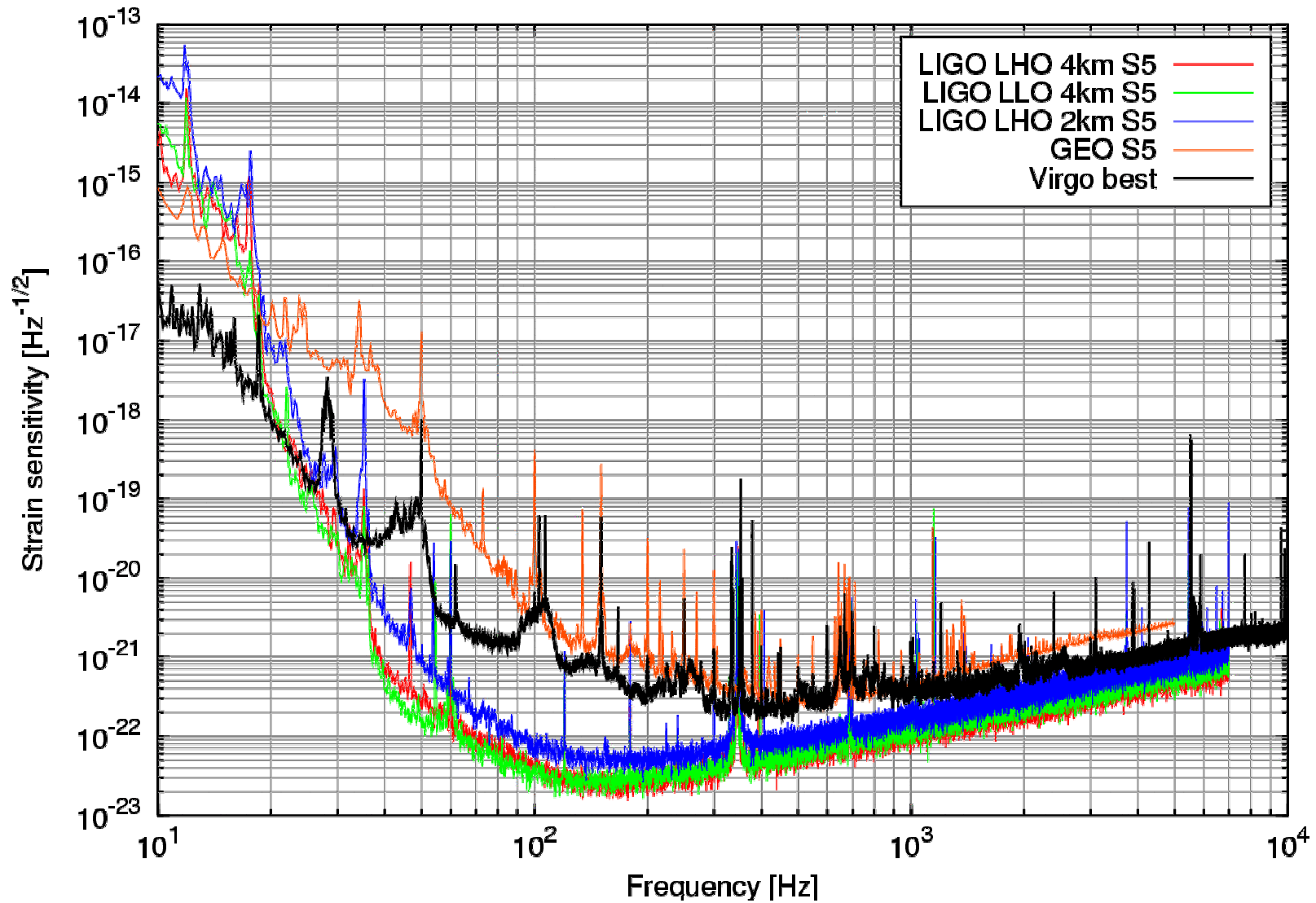
- The LIGO Scientific Collaboration (LSC) and the Virgo collaboration have entered into an agreement for joint analysis of data
- The Virgo detector is currently in commissioning and focusing on a high frequency sensitivity comparable to the LIGO detectors
- Joint data analysis will begin when Virgo reaches roughly comparable sensitivity over a scientifically interesting frequency region.
- Joint data analysis exercises with simulated data have already been performed for the inspiral, burst, and stochastic analysis
- A prototype burst analysis of ~48 hours of real data is in progress



VIRGO Cascina, Italy



# LIGO-Virgo



Source: Gabriele Vajente, December 2006

# OR Coincidence Strategies

- For coincident searches, union of double coincident detector networks provides improved performance
- Burst results for simulated supernovae in the direction of the galactic center at a 1  $\mu$ Hz false rate:

	HLV	HL	HV	LV	HL $\cup$ HV $\cup$ LV
max efficiency	19%	41%	22%	22%	60%
mean efficiency	12%	31%	13%	15%	41%

- Inspiral results for simulated signals from M87 and NGC 6744 at SNR threshold of 6:

	HLV	HL	HV	LV	HL $\cup$ HV $\cup$ LV
NGC 6744 efficiency	48%	65%	54%	49%	72%
M87 efficiency	24%	42%	32%	30%	56%

# Coherent Analysis: "the next big thing"

Merge data from multiple detectors while taking into account the different noise level and directional sensitivities of each detector

- improve efficiency of the network
- reduce false alarms

coherent methods can tell us:

- Where the signal came from (sky location of the source)
- What it actually looks like (waveform reconstruction)

based on work by Gursel and Tinto PRD 40, 3884 (1989)

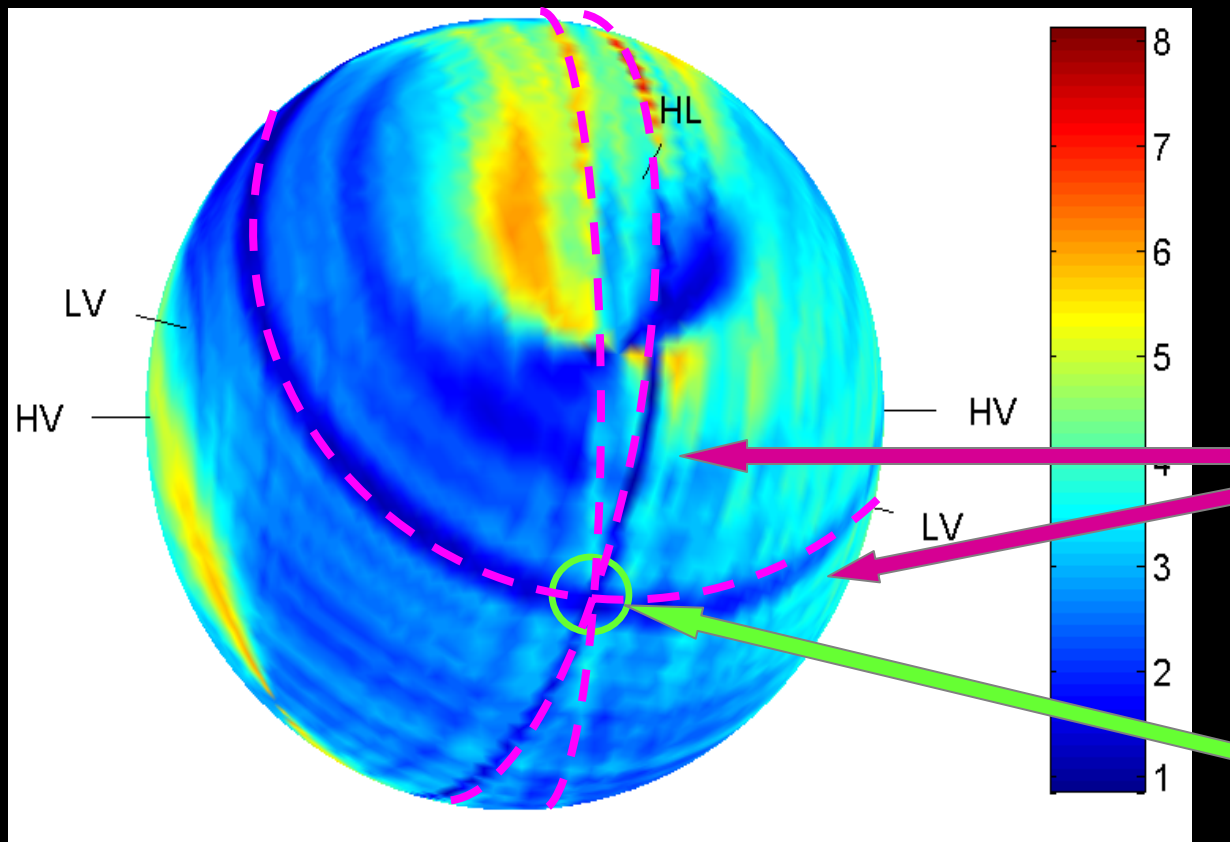
# The Basic Problem & Solution

- Output of D detectors:
  - Waveforms  $h_+(t)$ ,  $h_\times(t)$ , source direction  $\Omega$  all unknown.
  - How do we find them?

$$\begin{array}{c} \text{data} \end{array} \begin{bmatrix} d_1 \\ d_2 \\ \vdots \\ d_D \end{bmatrix} = \begin{array}{c} \text{detector antenna} \\ \text{responses} \end{array} \begin{bmatrix} F_1^+(\Omega) & F_1^\times(\Omega) \\ F_2^+(\Omega) & F_2^\times(\Omega) \\ \vdots & \vdots \\ F_D^+(\Omega) & F_D^\times(\Omega) \end{bmatrix} \begin{array}{c} \text{GWB} \\ \text{(unknown)} \end{array} \begin{bmatrix} h^+ \\ h^\times \end{bmatrix} + \begin{array}{c} \text{noise} \\ \text{(unknown)} \end{array} \begin{bmatrix} n_1 \\ n_2 \\ \vdots \\ n_D \end{bmatrix}$$

- Approach: Treat  $\Omega$ ,  $h_+$  &  $h_\times$  at each instant of time as independent parameters to be fit by the data.
  - Scan over the sky ( $\Omega$ ).
  - At each sky position construct the least-squares fit to  $h_+$ ,  $h_\times$  from the data (“noisy templates”).
  - Amplitude of the template and the quality of fit determine if a GWB is detected.

# Example: Supernova GWB



$\chi^2 / \text{DOF}$  consistency with a GWB as a function of direction for a simulated supernova ( $\sim 1$  kpc)

Interference fringes from combining signal in two detectors.

True source location:  
 – intersection of fringes  
 –  $\chi^2 / \text{DOF} \sim 1$

GWB: Dimmelmeier et al. A1B3G3 waveform,  
 Astron. Astrophys. 393 523 (2002) , SNR = 20  
 Network: H1-L1-Virgo, design sensitivity

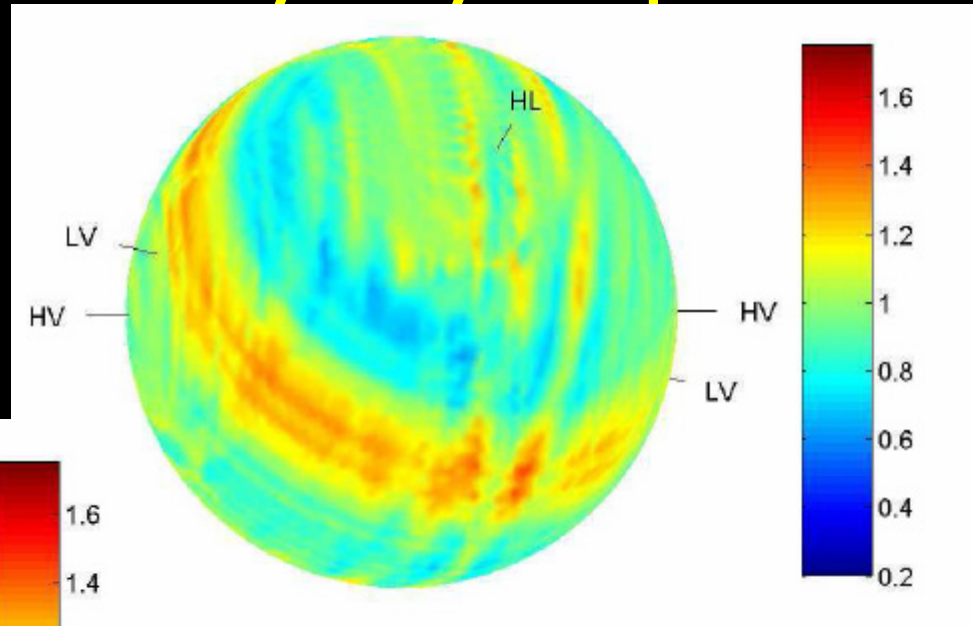
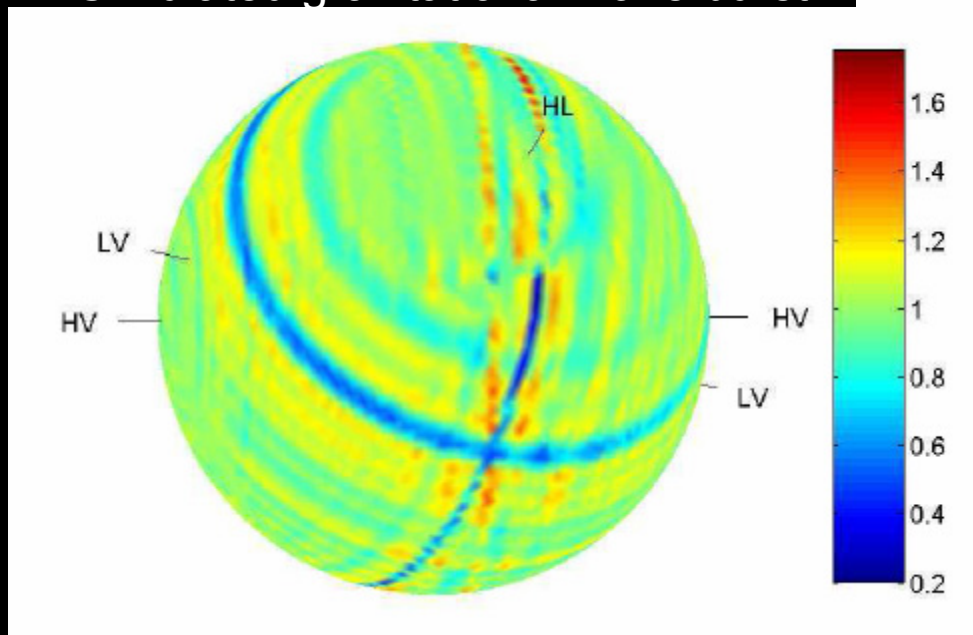
LIGO-G070051-00

Ref: LIGO-G060228-00



# Example consistency sky maps

Simulated gravitational-wave burst



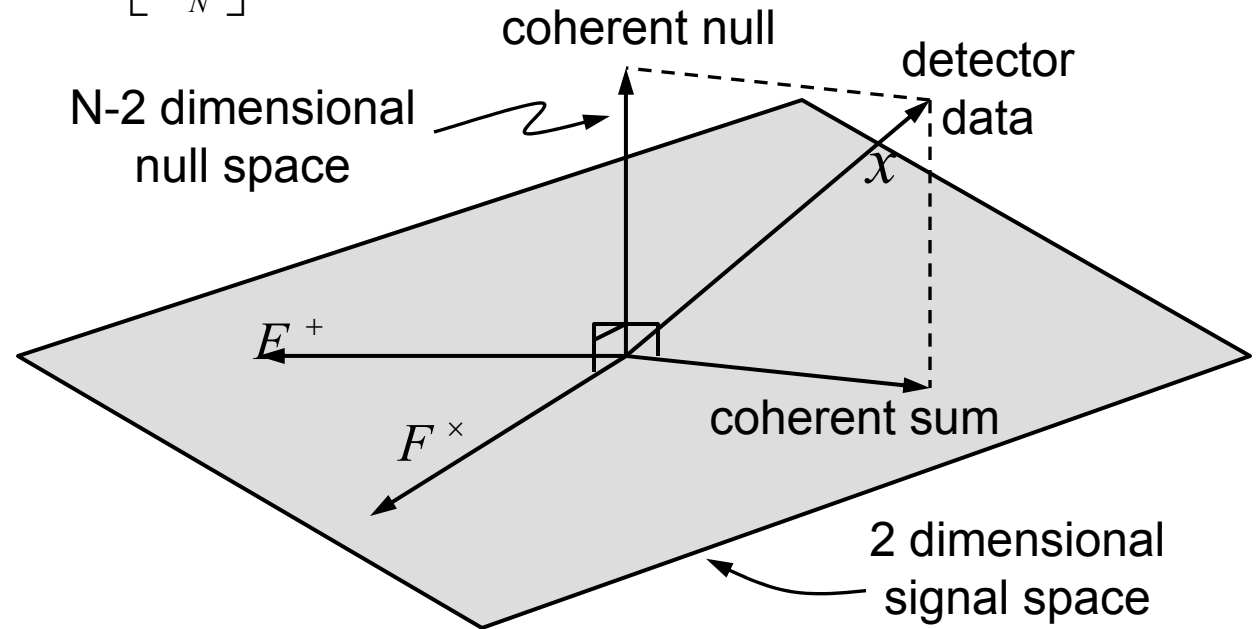
Simulated coincident glitch

# LIGO Fully coherent search methods

$$\begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ x_N \end{bmatrix} = \begin{bmatrix} F_1^+ & F_1^\times \\ F_2^+ & F_2^\times \\ \vdots & \vdots \\ F_N^+ & F_N^\times \end{bmatrix} \begin{bmatrix} h_+ \\ h_\times \end{bmatrix} + \begin{bmatrix} n_1 \\ n_2 \\ \vdots \\ n_N \end{bmatrix}$$

Coherent sum:  
Find linear combinations of detector data that maximize signal to noise ratio

Null sum:  
Linear combinations of detector data that cancel the signal provide useful consistency tests.



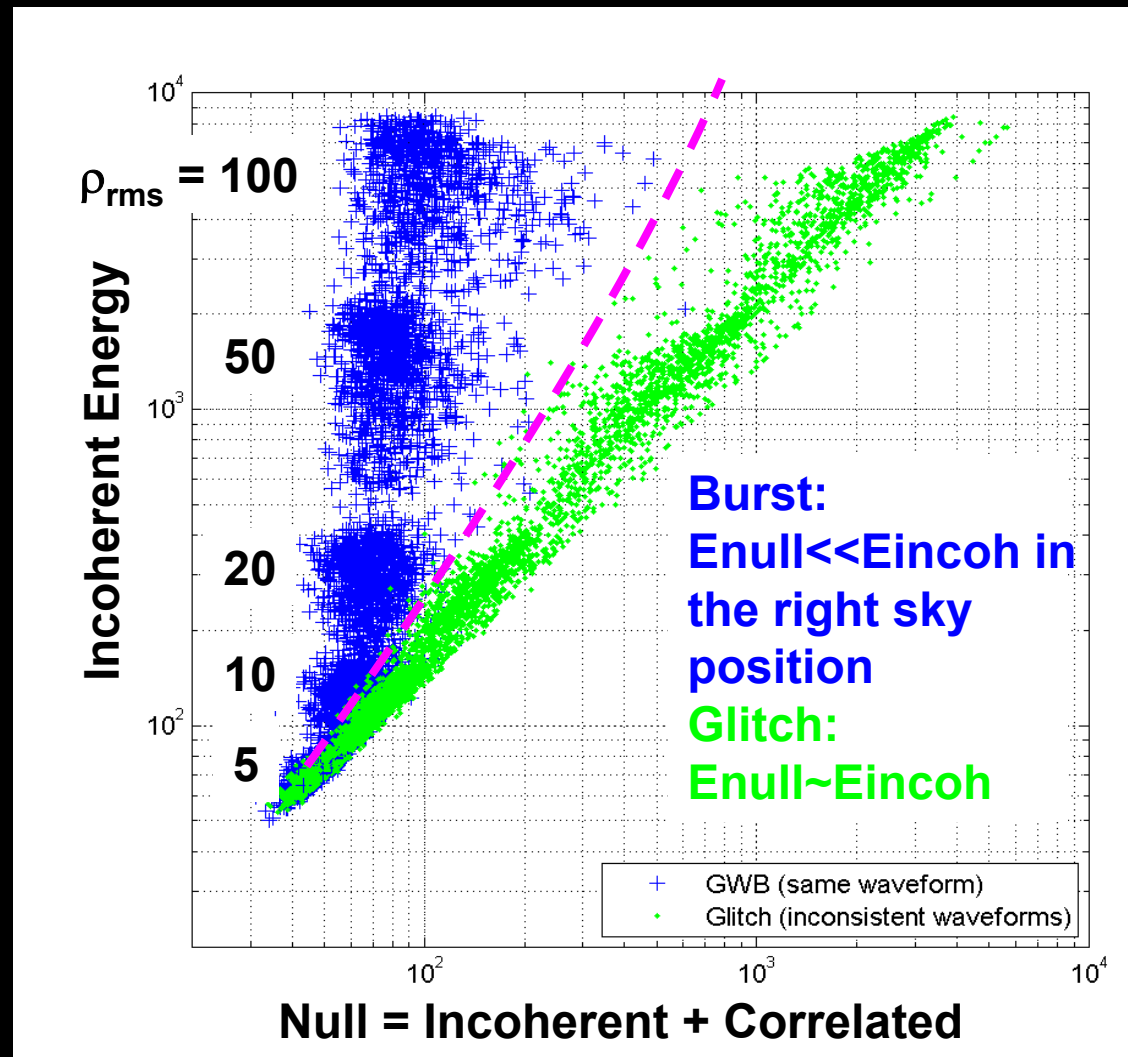
*Phys.Rev. D74 (2006) 082005*

$$\text{cancellation measure} \equiv \frac{\text{null energy } \mathbf{E}_{\text{null}}}{\text{incoherent energy } \mathbf{E}_{\text{inc}}} = \begin{cases} \ll 1 & \text{GWB} \\ \sim 1 & \text{glitch} \end{cases}$$

# Example: 5000 bursts vs. 5000 glitches

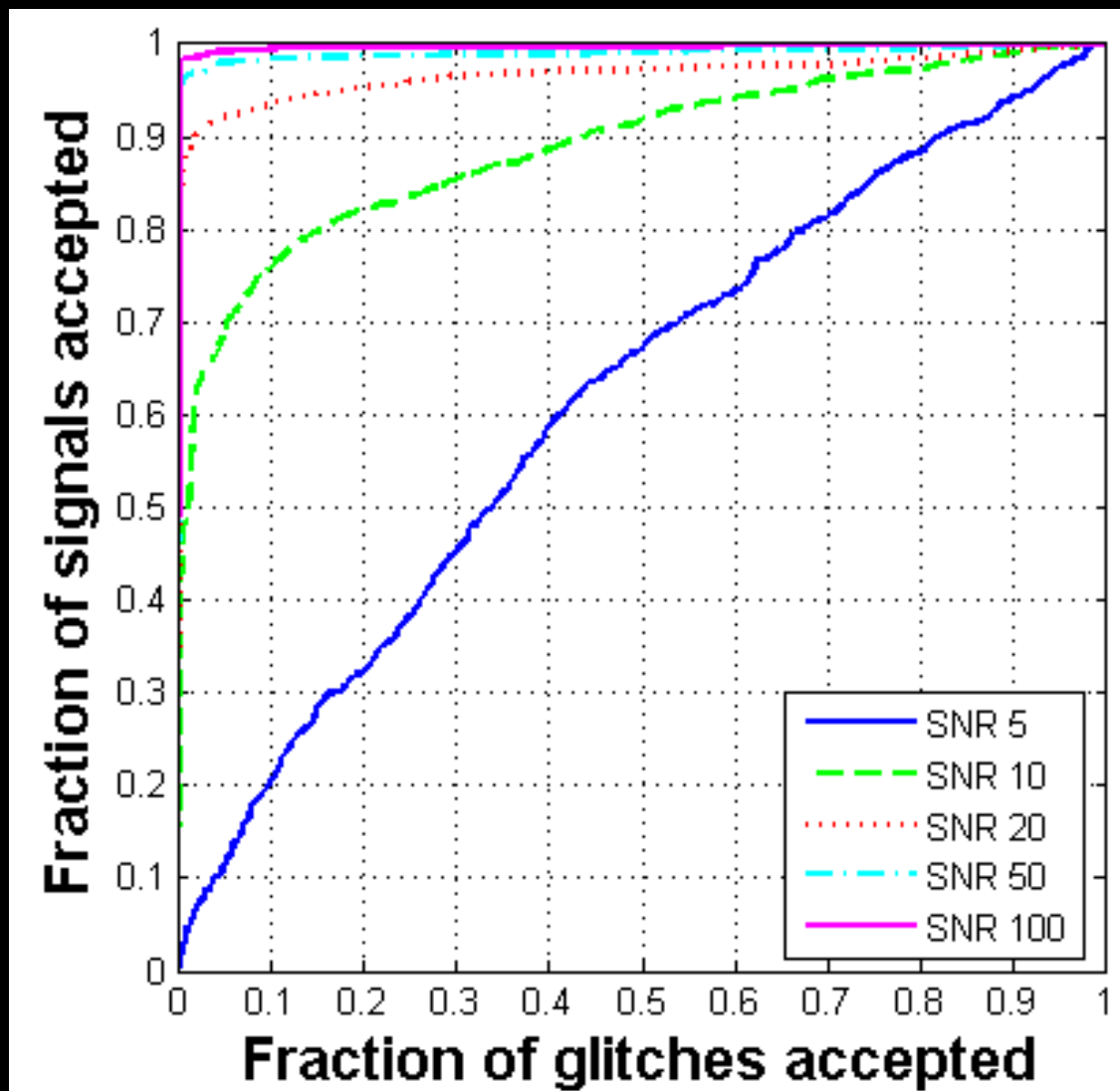
- One point from each simulation.
  - The sky position giving strongest cancellation, i.e. the lowest  $E_{\text{null}}/E_{\text{incoh}}$
- GWB and glitch populations clearly distinguished for SNR > 10-20.
- Similar to detection threshold in LIGO.

LIGO-G070051-00



Ref: LIGO-G060228-00

# Distinguishing signals from artifacts



# Simple example: collocated detectors

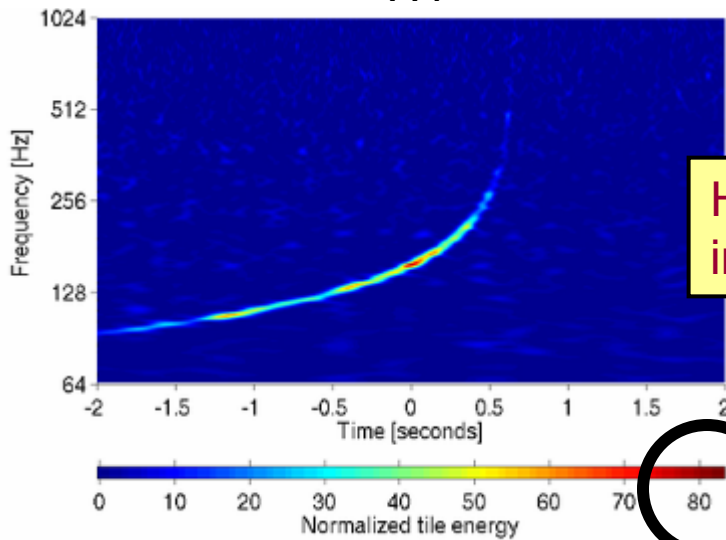
- The two LIGO Hanford detectors (H1H2) can be combined to form two new detector data streams
  - H+ The optimal linear combination that maximizes the signal to noise ratio of potential signals.

$$H_+ = \left( \frac{1}{S_1} + \frac{1}{S_2} \right)^{-1} \left( \frac{H_1}{S_1} + \frac{H_2}{S_2} \right)$$

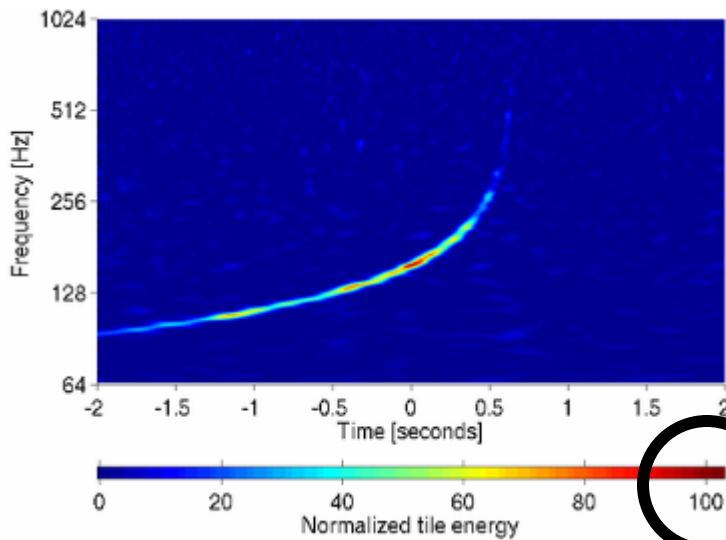
- Weighting is inversely proportional to detector noise  $S$
- Resulting SNR is the quadrature sum of SNRs
- H- The null stream, which should be consistent with noise in the case of a true gravitational-wave

$$H_- = H_1 - H_2$$

# H1H2 example: Inspiral at 5 Mpc

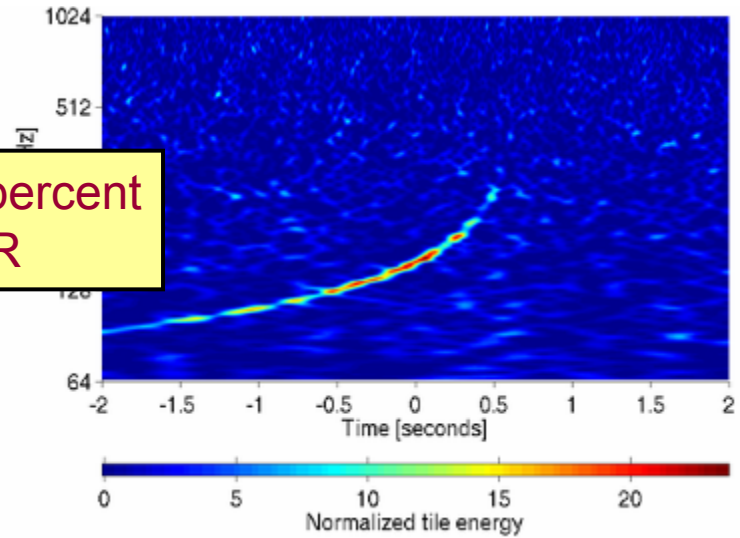


H+

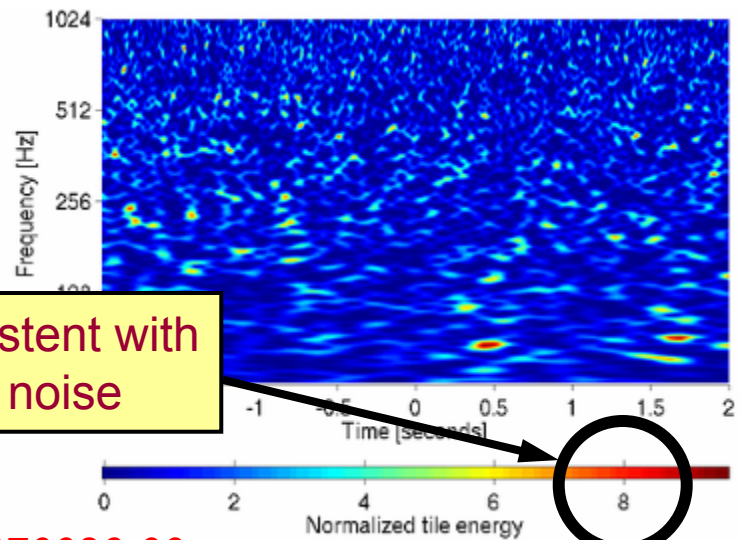


H+ yields ~10 percent increase in SNR

H- consistent with detector noise

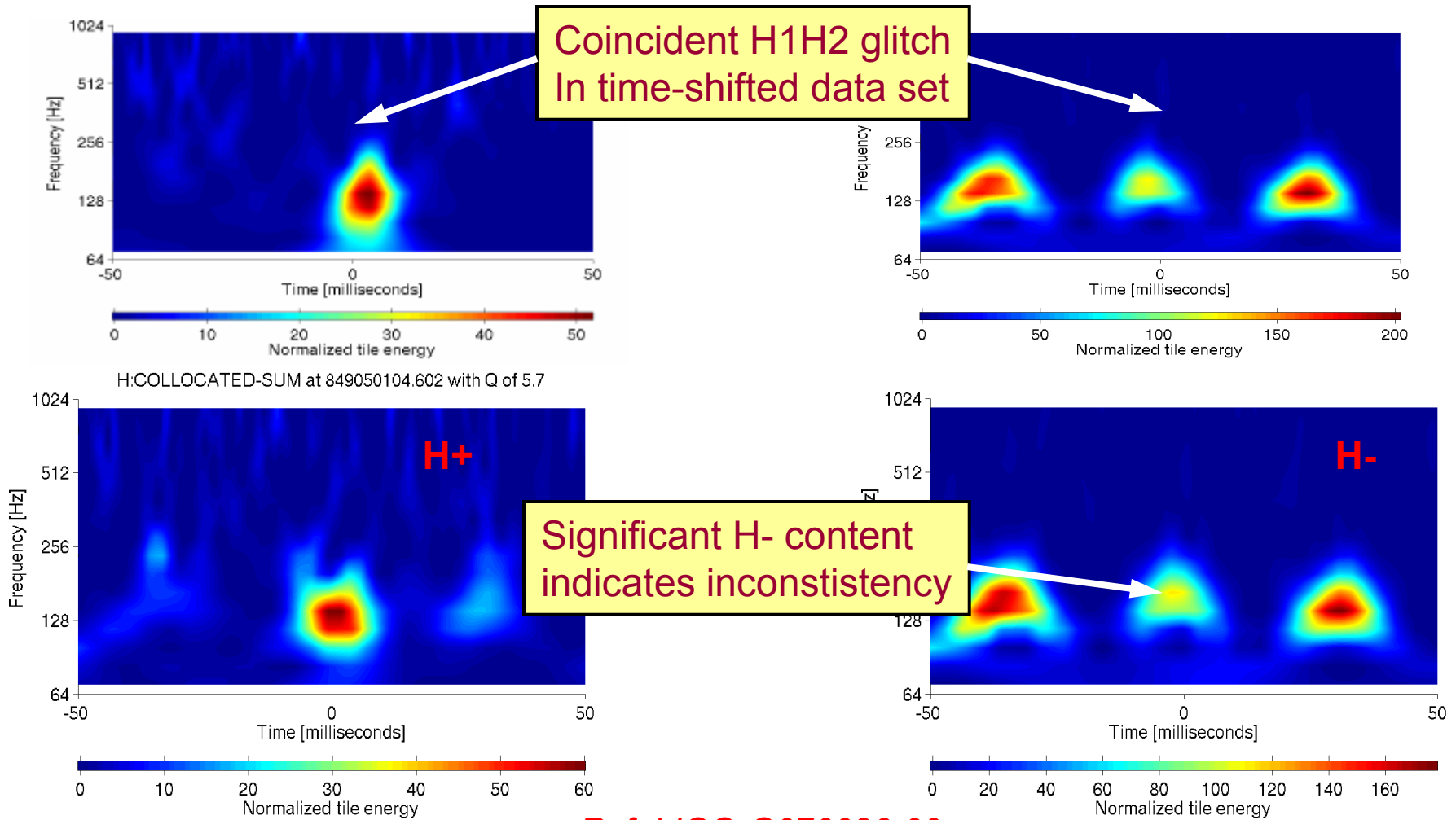


H-



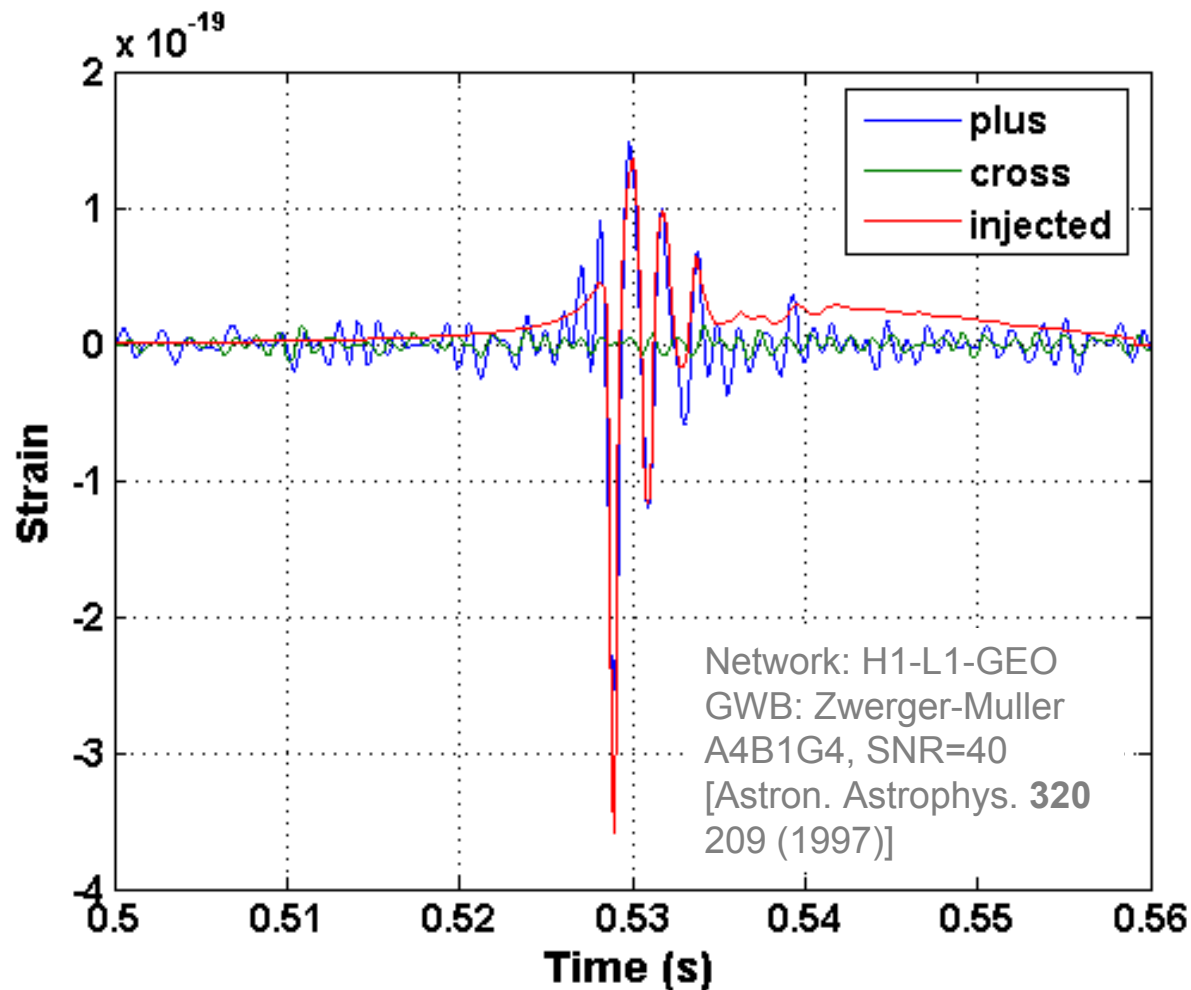
Ref: LIGO-G070026-00

# H1H2 example: time shifted glitch



Ref: LIGO-G070026-00

# Waveform Recovery



Recovered signal (blue) is a noisy, band-passed version of injected GWB signal (red)

Injected GWB signal has  $h_x = 0$ .

Recovered  $h_x$  (green) is just noise.



Remaining slides:  
a talk by Patrick Sutton with an overview  
of coherent methods for *GW*B detection  
LIGO-G060276-00