

Gravitational-Wave Data Analysis: Lecture 5

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Gravitational Wave Astronomy Summer School
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Outline for Today

- ▶ **Burst search methods**
- ▶ **Coherent burst searches**
- ▶ **Searches for stochastic GW**
- ▶ **Summary of GW signals and search methods**



Burst Search Philosophy

We're listening to the whole sky – who knows what's out there?

Models are OK, but don't put *too* much faith in them!

Goal: be able to detect *any* signal

... if it has sufficient power within the sensitive frequency band

... and is “short”



Target Signals for GW Burst Searches

Modeled burst searches

Targets:

- ♦ Black hole ringdown
- ♦ Neutron star ringdown
- ♦ Cosmic string cusp
- ♦ Parabolic encounter

Use **matched filtering**

Issues generally similar to binary inspiral searches

Generic burst searches

Targets:

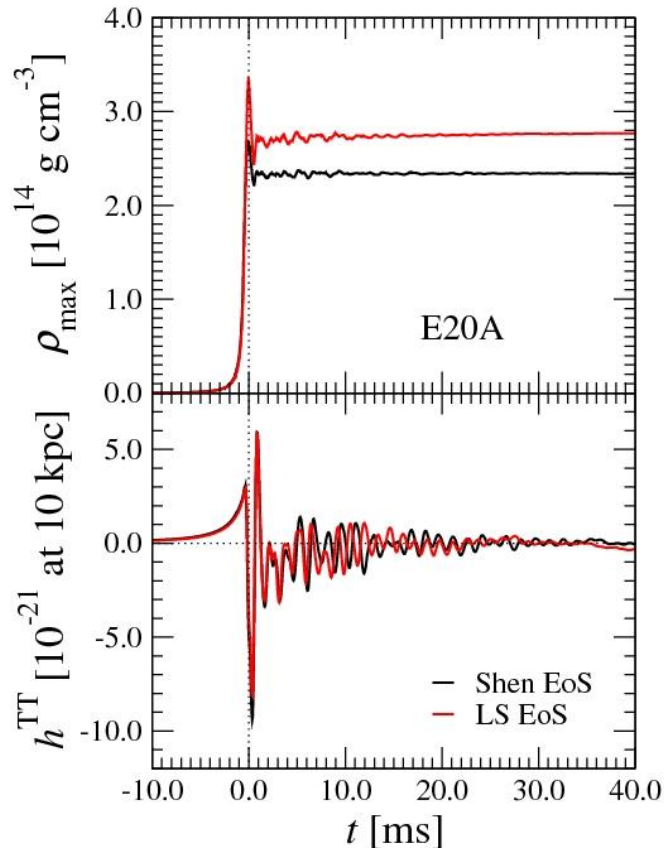
- ♦ Binary black hole merger
- ♦ Core collapse supernova
- ♦ Signals deviating from model expectations
- ♦ Other unexpected or unmodeled sources

Use **robust detection methods** that do not rely on having a model of the signal



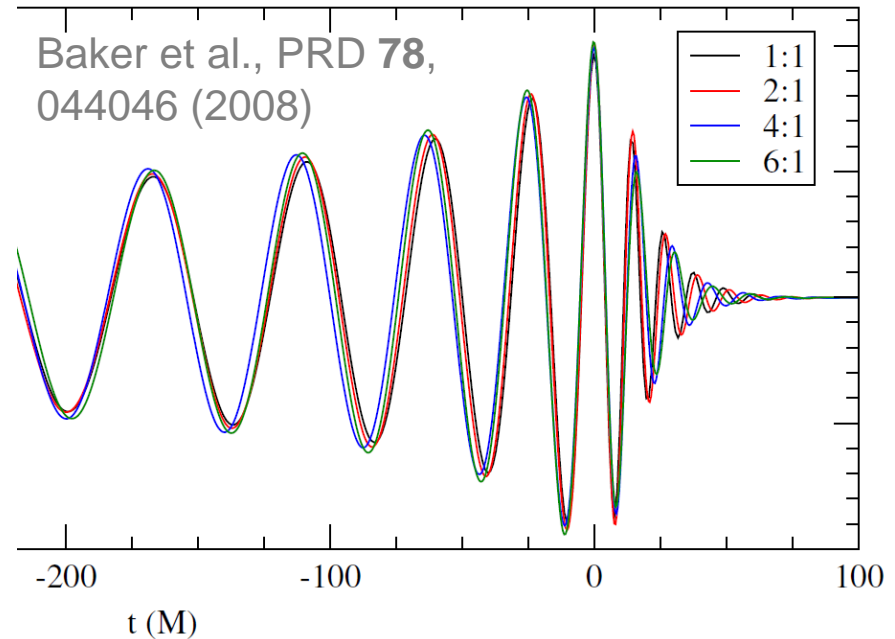
Some Specific Astrophysical Targets

Stellar core collapse



Dimmelmeier et al., PRD 78,
064056 (2008)
Also see www.stellarcollapse.org

Binary coalescence with in-band merger



Baker et al., PRD 78,
044046 (2008)

Back up the matched-filtering search for rapid inspirals, especially with high mass and/or spins

But also be open to detecting something else...



A Variety of Burst Search Methods

Multiple burst search methods are in active use by LIGO & Virgo

Mathematical arguments about optimality only go so far

Implementation details are critical

Data conditioning, robustness against non-stationary noise, ...

Some degree of competition and cross-pollination

LSC & Virgo have published (or will soon) many burst searches:

“All-sky” burst searches: S1, S2, S3, S4, S5/VSR1, S6/VSR2+3

GRB burst searches:

39 GRBs during S2/S3/S4, 137 during S5/VSR1, 150 during S6/VSR2+3

GRB 030329, GRB 070201, GRB 051103

Magnetar flare GW burst searches:

SGR 1806–20 giant flare QPO search, SGR 1900+14 storm “stack” search

GW bursts from flares emitted by six different magnetars

Cosmic string cusp search

Bursts associated with Vela pulsar glitch, or high-energy neutrinos



“Excess Power” Search Methods

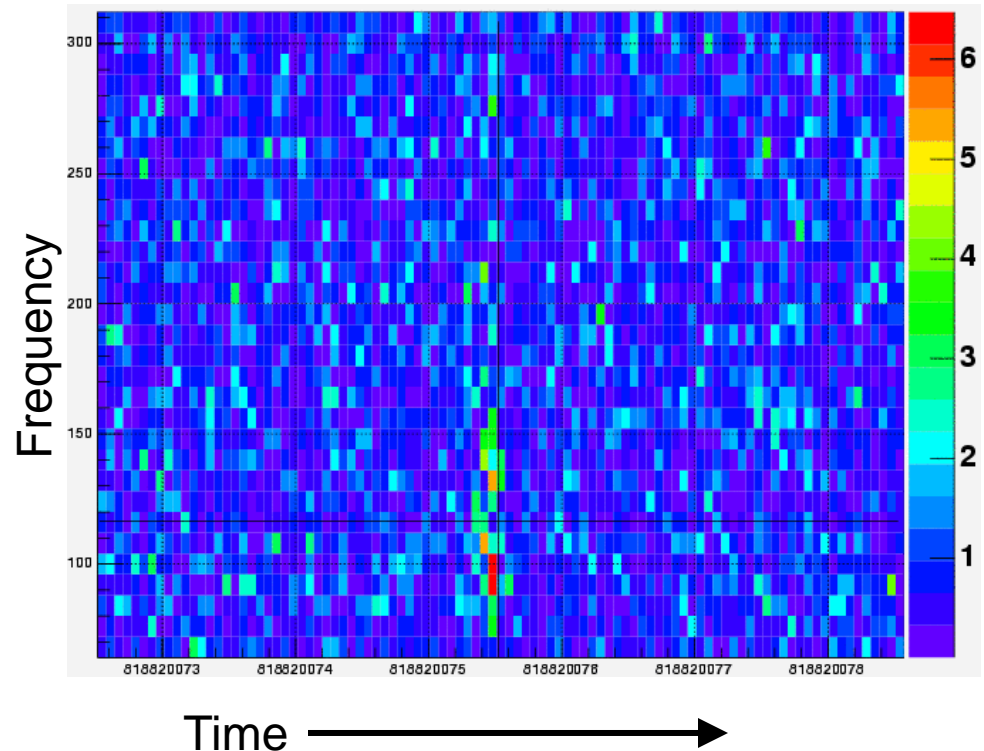
Decompose data stream into time-frequency pixels

Fourier components, wavelets, “Q transform”, etc.

Several implementations of this type of search

Normalize relative to noise as a function of frequency

Look for “hot” pixels or clusters of pixels





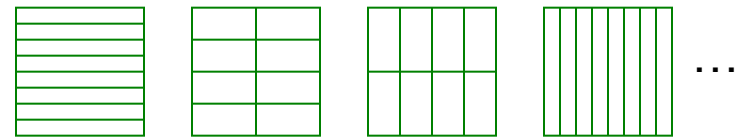
Example: “WaveBurst” Method As Used for S4 All-Sky Burst Search

WaveBurst processed all 3 GW data channels simultaneously

When all 3 interferometers in “science mode”

Wavelet decomposition from 64–2048 Hz
with 6 different resolutions from

$1/16 \text{ sec} \times 8 \text{ Hz}$ to $1/512 \text{ sec} \times 256 \text{ Hz}$



Pixel power thresholding → select “black pixels”

Cross-stream pixel coincidence

Clustering of coincident pixels to build up the event

Signal parameter estimation: time, duration, frequency, amplitude

Found coincident clusters for true time series **plus 98 time shifts**

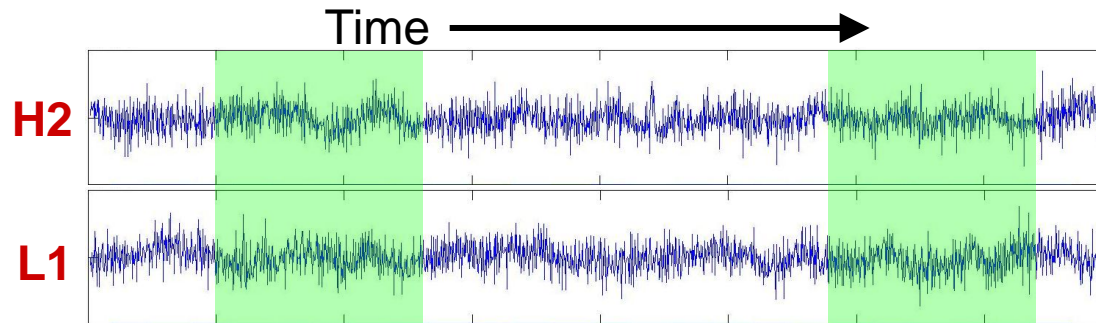
Hanford-Livingston relative times shifted by multiples of 3.125 sec

Used to study / estimate background



Cross-Correlation Method: “CorrPower”

Look for same signal buried in two data streams
by calculating the correlation between them



Checks for consistent shape, regardless of relative amplitude

Integrate over a time interval comparable to the target signal (try a few)

Allow for a time offset between the data streams

Technical note: notch out sharp spectral features such as violin modes, which can give spurious cross-correlation



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Coherent Burst Analysis

Each detector measures a linear combination of $h_+(t)$ & $h_\times(t)$ *
with antenna response factors and relative time delay depending on
direction of arrival

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

data = response × signal + noise

⇒ Data from 2 sites can uniquely determine $h_+(t)$ and $h_\times(t)$
for an **arbitrary signal**, *in the absence of noise and if the
arrival direction is known*

⇒ Data from 3 or more sites *over-determines* $h_+(t)$ and $h_\times(t)$
if the arrival direction is known

** Assuming that GR is correct !*



Geometric View of Coherent Analysis

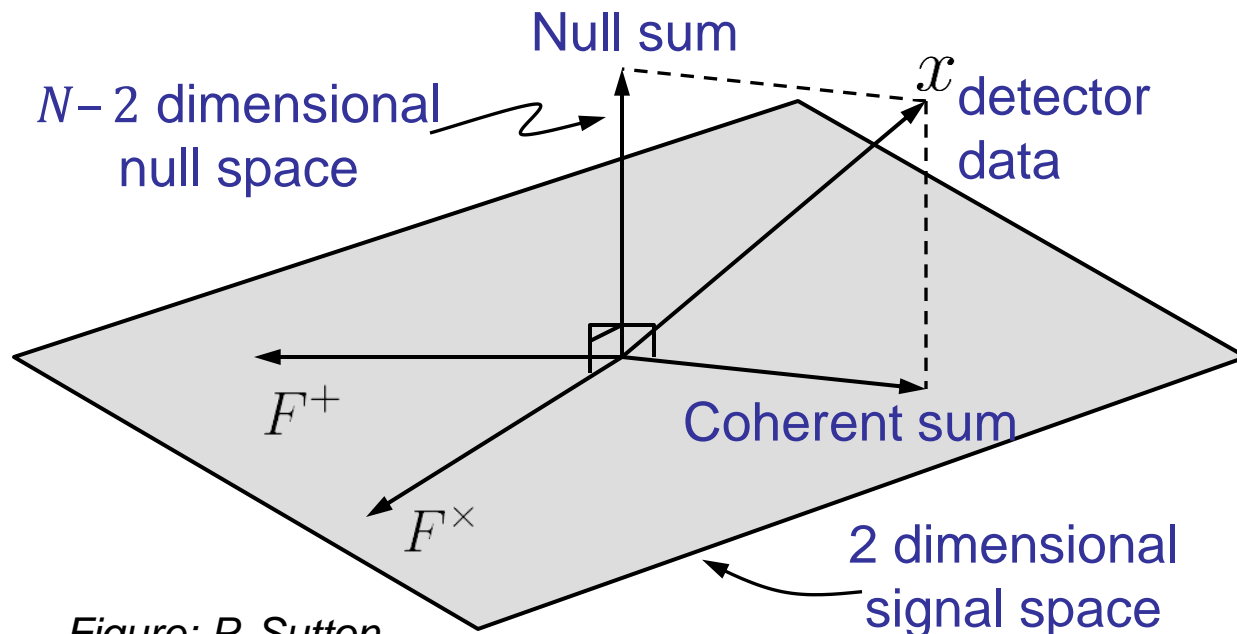


Figure: P. Sutton

Coherent sum:

Find linear combination of detector data that maximizes signal to noise ratio

Null sum:

Linear combination of detector data that has no GW signal—provides consistency test

Treat this as a **maximum likelihood** problem

Consider all possible sky positions (arrival directions)

Find the sky position, $h_+(t)$ & $h_\times(t)$ with the greatest likelihood for producing the data that was recorded



Pitfall of Searching the Whole Sky

Issue: For some sky positions, network effectively sees only one polarization component

The other polarization component is unconstrained or poorly constrained
Usually where one of the detectors has null response

Solution: use a regularization scheme

Effectively penalizes “un-physical” solutions

“Hard constraint”: only look at the well-determined polarization component

“Soft constraint”: de-weight the poorly-determined polarization component
etc.

Best choice depends in part on the nature of the instrumental glitches



All-Sky Generic GW Burst Search

Analyzed all LIGO and Virgo collected since 2005 when at least two detectors were running

Total live observation time: 636 days

LIGO+Virgo coherent analysis

GEO data often available for investigating possible event candidates

Sensitive to arbitrary GW signals in the range 64–5000 Hz

Background measured by analyzing data with artificial time shifts

Event selection thresholds tuned for low false alarm probability

No event survived all selection cuts

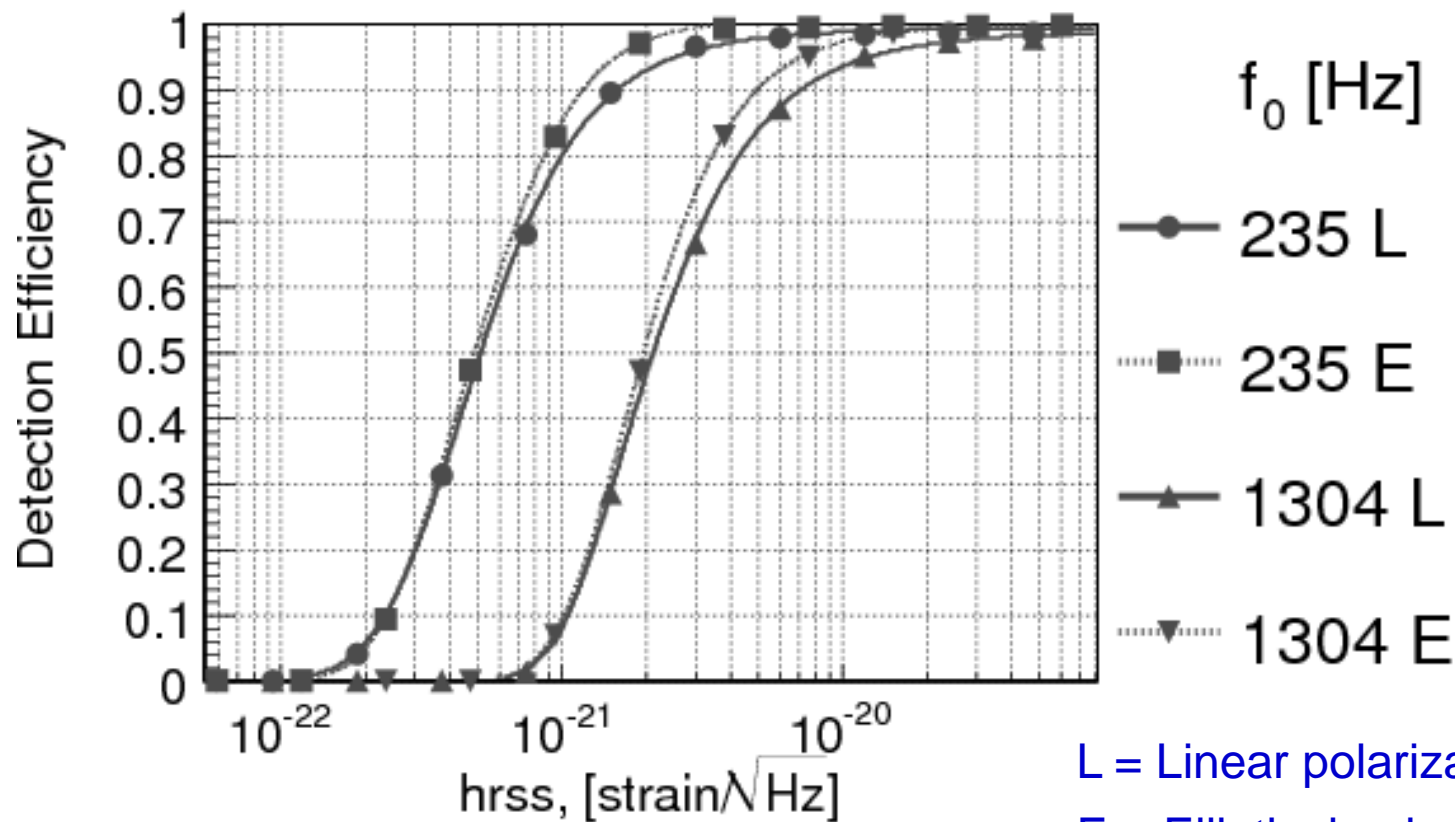
We set upper limits on burst rate vs. amplitude for representative waveforms using Monte Carlo

Abadie et al., Phys. Rev. D in press, arXiv:1202.2788



Sample Detection Efficiency Curves

For simulated signals with random times and sky positions added to real detector noise

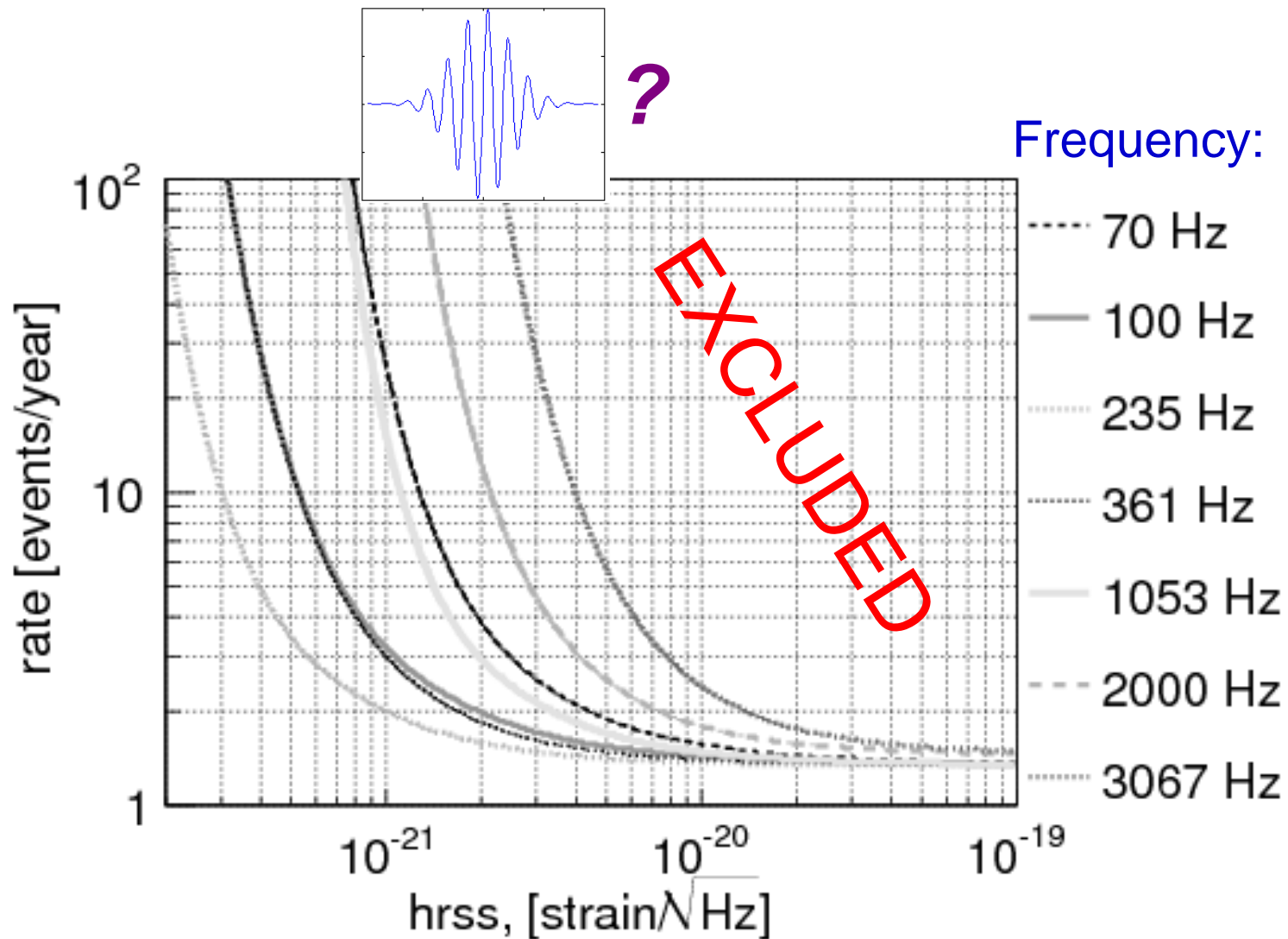


(GW burst amplitude measure)

L = Linear polarization at Earth
 E = Elliptical polarization from random inclination of axis of presumed rotating source



Rate Limit vs. Amplitude





How Sensitive are Burst Searches?

Not as sensitive as matched filtering for a known waveform

But not *too* much worse, when the signal duration is short

Typically about a factor of 2

Can relate signal amplitude to energy emission in a general way:

$$E_{\text{GW}} = \frac{r^2 c^3}{4G} (2\pi f_0)^2 h_{\text{rss}}^2$$

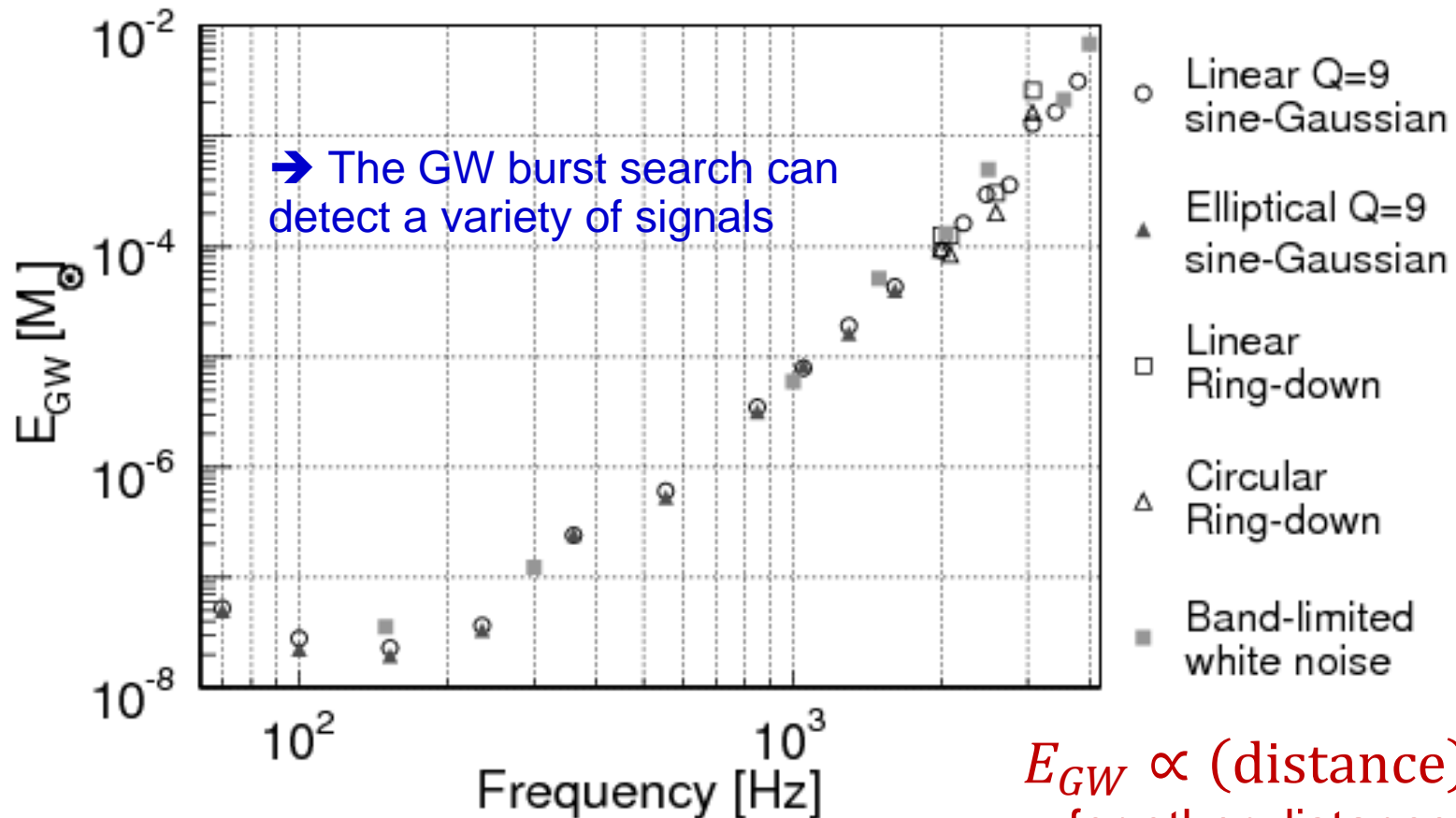
This assumes isotropic emission – unphysical, but fine for a rough estimate



Search Sensitivity in Energy Units

GW energy emission assuming a Galactic source (10 kpc)
that could have been detected with 50% efficiency

3-detector LIGO+Virgo network data, S6/VSR2+3 run



$$E_{GW} \propto (\text{distance})^2$$

for other distance



Order-of-Magnitude S5 Range Estimates for Supernovae and BH Mergers

Model dependent!

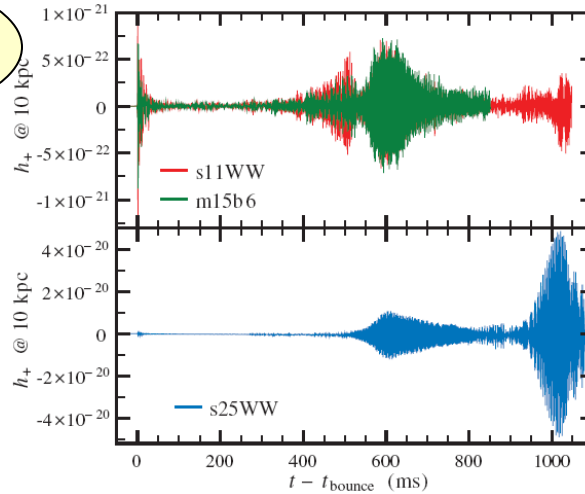


TABLE I. MODEL SUMMARY.

Model	Δt^a (ms)	$ h_{+,max} ^b$ (10^{-21})	$h_{char,max}^{b,c}$ (10^{-21})	$f(h_{char,max})$ (Hz)	E_{GW}^d ($10^{-7} M_{\odot} c^2$)
s11WW	1045	1.3	22.8	654	0.16
s25WW	1110	50.0	2514.3	937	824.28
m15b6	927.2	1.2	19.3	660	0.14

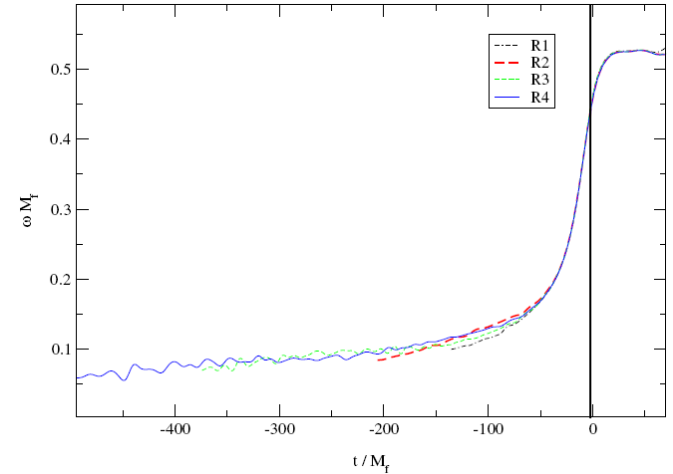
11 M_{\odot} progenitor (s11WW model)

\Rightarrow reach ≈ 0.8 kpc

25 M_{\odot} progenitor (s25WW model)

\Rightarrow reach ≈ 30 kpc

Frequency



$$f_{\text{peak}} \approx \frac{0.46}{2\pi M_f} \approx \frac{15 \text{ kHz}}{(M_f/M_{\odot})}$$

Assuming $\sim 3.5\%$ mass radiates in the merger:

10+10 M_{\odot} binary \Rightarrow reach ≈ 6 Mpc

50+50 M_{\odot} binary \Rightarrow reach ≈ 200 Mpc



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Properties of a Stochastic GW Signal

Random signal from sum of unresolved sources

From the early universe, or from astrophysical sources since then

Usual assumptions about the signal:

Stationary

Gaussian

Unpolarized

Power-law frequency dependence, probably (e.g. f^{-3})

May be isotropic, or not

Looks basically like extra noise in each detector !



How to Search for a Stochastic Signal

Use **cross-correlation** between GW data streams

No time delay for all-sky isotropic search – will affect correlation

For anisotropic (“radiometer”) search, fix time delay between streams

Include a **filter function** in the cross-correlation

$$Y := \int_{-T/2}^{T/2} dt_1 \int_{-T/2}^{T/2} dt_2 x_1(t_1) x_2(t_2) K(t_1 - t_2)$$



$$Y = \int_{-\infty}^{\infty} df \int_{-\infty}^{\infty} df' \delta_T(f - f') \tilde{x}_1^*(f) \tilde{x}_2(f') \tilde{K}(f')$$

Filter function optimizes the detection statistic, accounting for two effects:

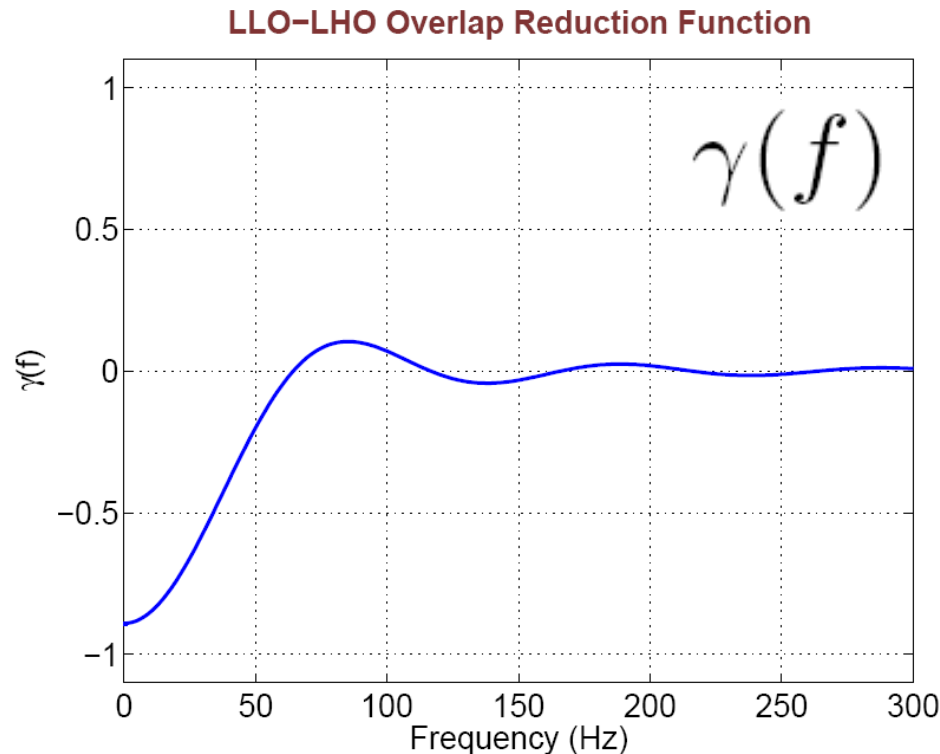
Power spectrum of the signal being searched for

Expected correlation between detectors, which depends on frequency due to their separation



Overlap Reduction Function for isotropic search

Calculate expected correlation as a function of frequency
e.g. for the two LIGO observatories:



Note: H1 and H2 should have perfect correlation and thus make the most sensitive measurement, but have to worry about instrumental noise correlations



Optimal Filter for Stochastic Search

Choose:

$$\widetilde{K}(f) = \frac{\gamma(f) P_{\text{gw}}(f)}{P_{n_1}(f) P_{n_2}(f)}$$

Power spectrum of the GW signal

Noise power spectra

Then signal-to-noise ratio is:

$$\left(\frac{S}{N} \right)_{\text{opt}} = \sqrt{T} \left[\int_{-\infty}^{\infty} df \frac{\gamma^2(f) P_{\text{gw}}(f)}{P_{n_1}(f) P_{n_2}(f)} \right]^{1/2}$$

Interpret isotropic search in terms of the energy density of gravitational waves, relative to the critical energy density needed to close the universe:

$$\Omega_{\text{GW}}(f) = \frac{f}{\rho_c} \frac{d\rho_{\text{GW}}}{df} \quad \Rightarrow \quad P_{\text{gw}}(f) = \frac{3H_0^2}{20\pi^2} \frac{\Omega_{\text{gw}}(f)}{f^3}$$

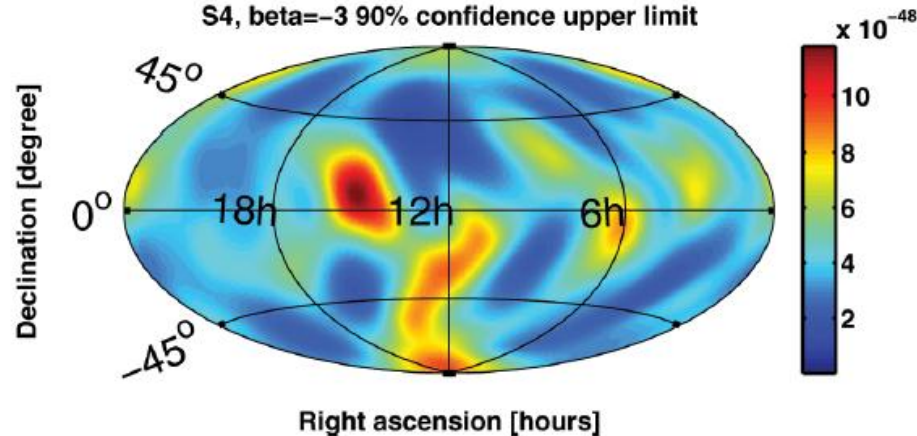


Directional Stochastic Searches

Cross-correlation with different filtering

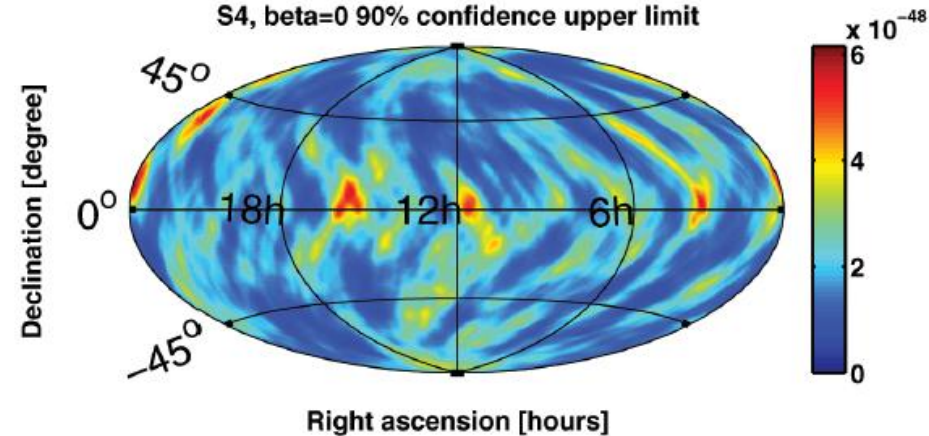
“Radiometer” search, optimized for finding point sources:

S4, $\beta = -3$ 90% confidence upper limit



Assuming constant GW
energy spectrum

S4, $\beta = 0$ 90% confidence upper limit

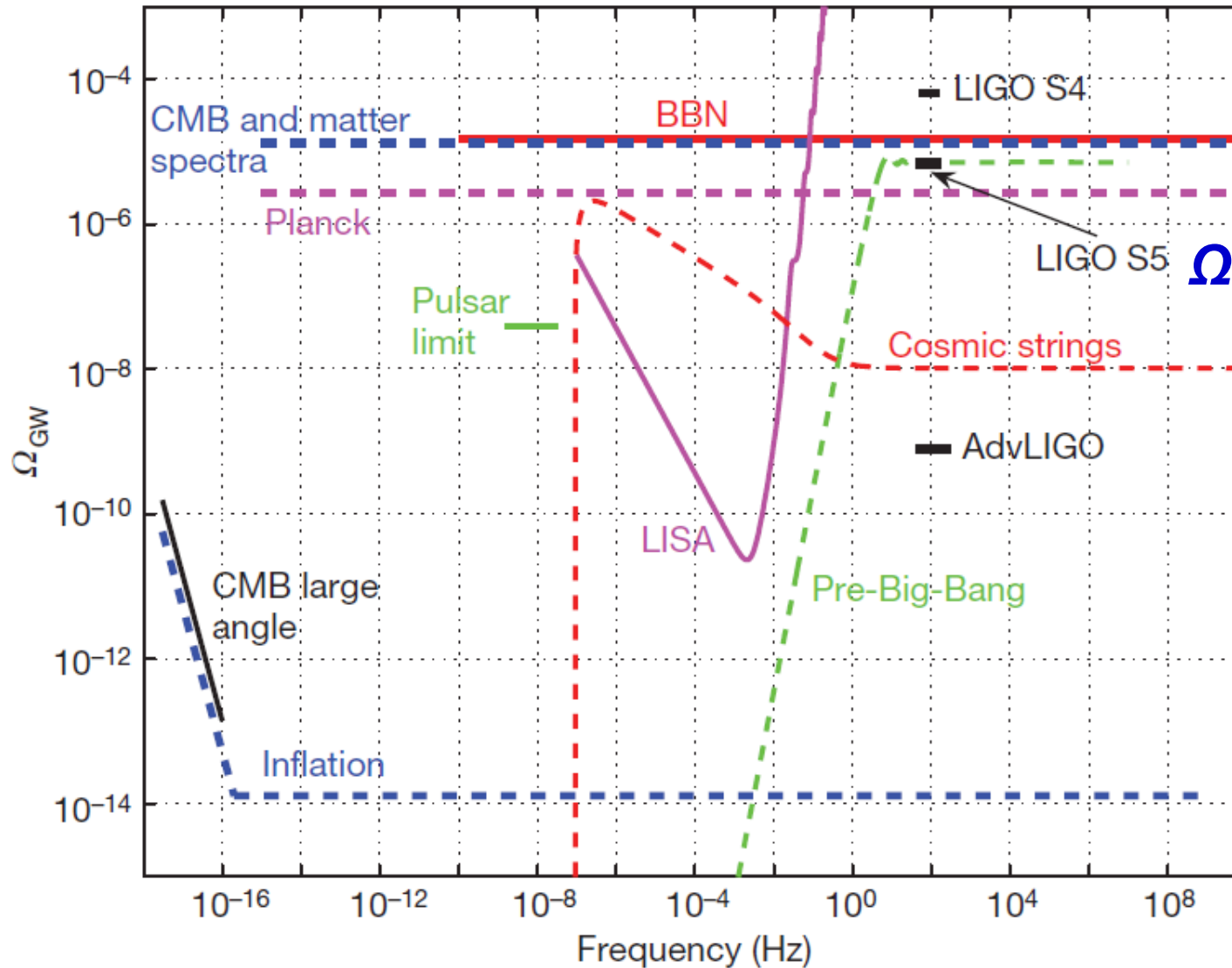


Assuming constant GW
strain spectrum

Another kind of directional search:
spherical harmonic decomposition of the sky



Isotropic Stochastic Search Results



LSC+Virgo,
Nature **460**,
990 (2009)

$\Omega_0 < 6.9 \times 10^{-6}$
 assuming flat
 GW energy
 spectrum



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Summary of Data Analysis Methods

