



All-sky search for isolated pulsars using the Hough transform

Badri Krishnan Alicia Sintes & Maria Alessandra Papa For the LIGO scientific collaboration

badri.krishnan@aei.mpg.de

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Organization of the talk

- The Hough transform
- Expected sensitivity for S2
- Search parameters and the search pipeline
- Statistical properties
- Setting the thresholds
- Hardware injections
- The search results
- The Monte-Carlo strategy
- Future work





The Hough transform

- The Hough transform is an incoherent method based on looking for patterns in the time-frequency plane. Less sensitive but computationally inexpensive compared to full coherent search
- Start with coherent stretches of data and combine them incoherently present search combines 30 Min long SFTs
- Similar to power summing (Stack-slide) algorithm but instead of adding power, after sliding we add zeros and ones depending on whether power in SFT bin meets a certain criteria input to Hough algorithm is set of zeros and ones
- Advantage of Hough is computational speed can consider large region in parameter space at once without stepping through templates one-by-one.
- Final result of Hough search is a histogram in parameter space





The Hough transform

Time-frequency pattern follows Doppler shift equation

$$f(t) - f_0(t) = f_0(t) \frac{\mathbf{v}(t) \cdot \mathbf{n}}{c}$$

- $f(t) \rightarrow \text{observed frequency at time } t$
- $f_0(t) \rightarrow \text{intrinsic signal frequency at time } t$
- $\mathbf{v}(t) \rightarrow \text{detector velocity at time } t$
- $n \rightarrow \text{sky-position}$





The Hough transform

Smallest signal that can be detected with 1% false alarm and 10% false dismissal in ideal stationary Gaussian noise:

$$\langle h_0 \rangle = \frac{8.54}{N^{1/4}} \sqrt{\frac{S_n}{T_{\text{coh}}}}$$

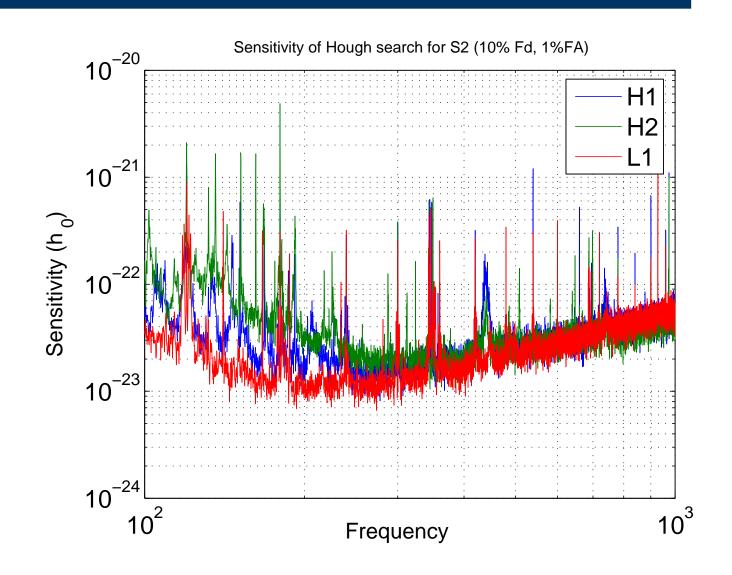
 $T_{\rm coh} = 30 {\rm Min}$ and N is number of SFTs

- Will be eventually combined with \mathcal{F} -statistic in a hierarchical scheme
- Reference with details of method, statistics etc.: PRD 70 082001 (2004)
- We analyze data from S2 run (14 Feb 14 Apr 2003) of the LIGO detectors using this method
- S2 data has 1761 SFTs from H1, 687 from L1 and 1384 from H2
- Less sensitive than full directed 2-month coherent search by factor of ~ 5





Expected sensitivity for S2







Expected sensitivity for S2

This implies following astrophysical reach of the search

$$d = \frac{16\pi^2 G N^{1/4} I_{zz} \epsilon f^2}{8.54c^4} \sqrt{\frac{T_{\text{coh}}}{S_n(f)}}$$

$$\begin{split} d^{L1} &= 30.4 \text{pc} \left(\frac{I_{zz}}{10^{38} \text{kg-m}^2} \right) \left(\frac{f}{300 \text{Hz}} \right)^2 \left(\frac{\epsilon}{10^{-6}} \right) \sqrt{\frac{10^{-43} \text{Hz}^{-1}}{S_n}} \,, \\ d^{H2} &= 18.3 \text{pc} \left(\frac{I_{zz}}{10^{38} \text{kg-m}^2} \right) \left(\frac{f}{300 \text{Hz}} \right)^2 \left(\frac{\epsilon}{10^{-6}} \right) \sqrt{\frac{4 \times 10^{-43} \text{Hz}^{-1}}{S_n}} \\ d^{H1} &= 22.2 \text{pc} \left(\frac{I_{zz}}{10^{38} \text{kg-m}^2} \right) \left(\frac{f}{300 \text{Hz}} \right)^2 \left(\frac{\epsilon}{10^{-6}} \right) \sqrt{\frac{3 \times 10^{-43} \text{Hz}^{-1}}{S_n}} \,. \end{split}$$





Search parameters

All sky search with $\sim 3 \times 10^5$ sky locations (frequency dependent)

$$\delta\theta = \frac{c}{2vfT_{\text{coh}}}$$

In practice, cannot analyze whole sky all at once – break up sky into 23 patches of roughly equal area (required because we set grid in stereographic plane)

- Frequency band: 200-400 Hz
- One spindown parameter

$$\delta f_{(1)} = \frac{1}{T_{\text{obs}} T_{\text{coh}}} \approx -1.1 \times 10^{-10} \text{Hz/s}$$

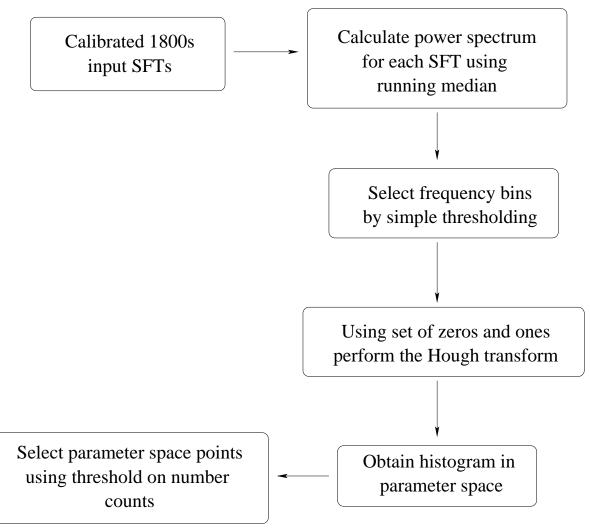
Largest spindown parameter: $-1.1 \times 10^{-9} \text{Hz/s} \implies 11 \text{ spindown values considered}$

Search takes \sim 0.3 days for each detector





The search pipeline







Statistical properties

Peak selection statistics

- We set threshold ρ_{th} on normalized SFT power ρ to select frequency bins
- Noise floor estimated by running median for each sft
- In absence of signal ρ follows exponential distribution
- False alarm rate for peak selection is $\alpha = e^{-\rho}$ th
- In presence of signal, distribution of 2ρ is the non-central χ^2 distribution

$$p(\rho|\lambda) = e^{-\rho - \lambda/2} I_0(\sqrt{2\rho\lambda})$$

where $\lambda = 4|\tilde{h}|^2/(T_{\rm coh}S_n)$ is the coherent SNR and non-centrality parameter

Presence of signal increases peak selection rate

$$\eta \approx \alpha + \frac{1}{2}\alpha \rho_{\text{th}}\lambda$$





Statistical properties

Hough map statistics

In absence of signal distribution of number counts is binomial

$$p(n|N) = \binom{N}{n} \alpha^{n} (1-\alpha)^{N-n}$$

- Select candidates using threshold n_{th} on number counts
- False alarm rate is

$$\alpha_H(n_{\text{th}}, \rho_{\text{th}}, N) = \sum_{n=n_{\text{th}}}^{N} p(n|\rho_{\text{th}})$$

Mean and standard deviation are

$$\bar{n} = N\alpha$$
 $\sigma^2 = N\alpha(1-\alpha)$



Statistical properties

Hough map statistics

In presence of signal distribution of number counts is binomial only if amplitude modulation and non-stationarity is neglected

$$p(n|\lambda) = \begin{pmatrix} N \\ n \end{pmatrix} \eta^n (1-\eta)^{N-n}$$

False dismissal rate is

$$\beta_H(n_{\text{th}}, \rho_{\text{th}}, \lambda, N) = \sum_{n=0}^{n_{\text{th}}-1} p(n|\rho_{\text{th}}, \lambda)$$

One possible way to choose thresholds (ρ_{th} , n_{th}) is to minimize β_H for a given choice of α_H . For weak signals this leads to $\rho_{th} = 1.6$ ($\alpha = 0.20$) and

$$n_{\text{th}} = N\alpha + \sqrt{2N\alpha(1-\alpha)} \text{ erfc}^{-1}(2\alpha_H^{\star}).$$



Hardware Injections

Two artificial pulsar signals were injected into all LIGO IFOs during S2 for a 12h period with

$$h_0 = 2 \times 10^{-21}$$
, $\psi = 0$, $\cos \iota = 0$, $\phi_0 = 0$

Pulsar P1 with constant intrinsic frequency:

$$f = 1279.123$$
Hz

$$\alpha = 5.147162$$
rad, $\delta = 0.376696$ rad

Pulsar P2 with spindown:

$$f = 1288.901$$
Hz

$$\alpha = 2.34567 \text{rad}, \delta = 1.23456 \text{rad}$$

$$\dot{f} = -10^{-8} \text{rad/s}$$

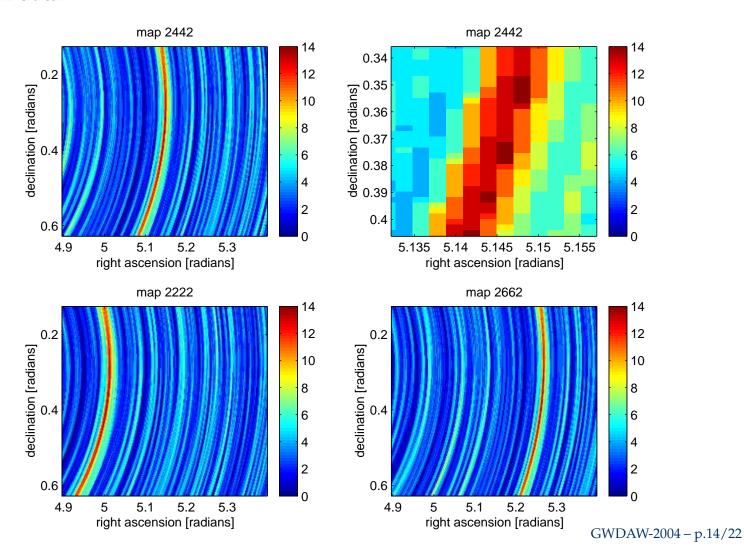
Both signals are clearly detected but observation time of 12h too small to pin-down pulsar parameters exactly





Hardware Injections

Pulsar P1: L1 data

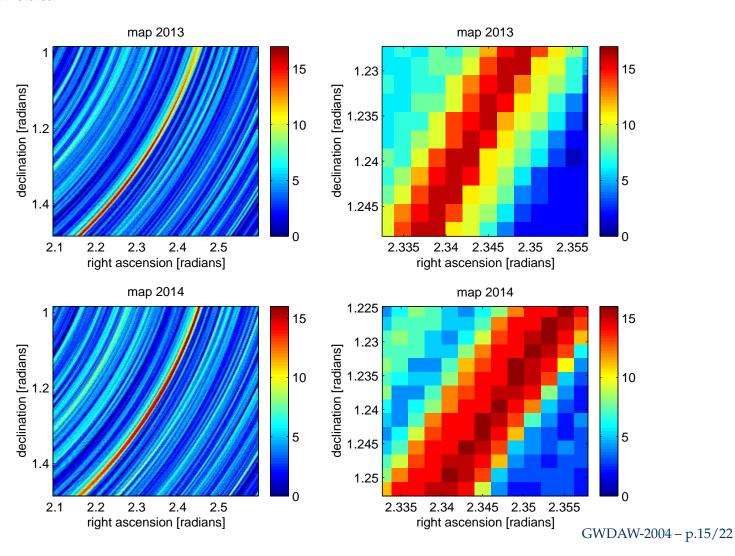






Hardware Injections

Pulsar P2: H1 data

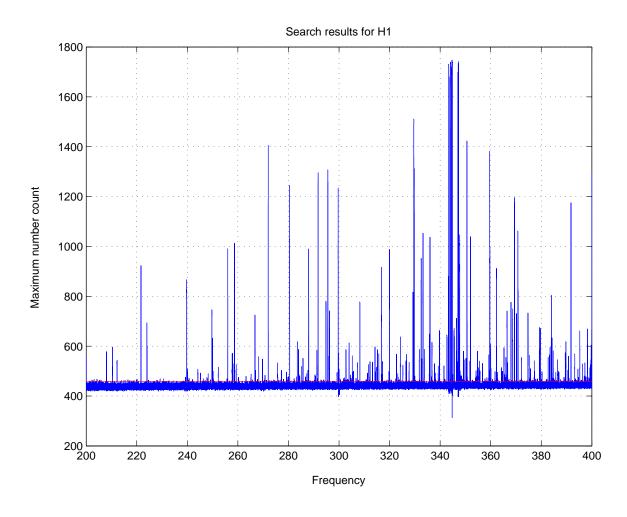






Search results

Hough number count maximized over whole sky and spindowns – H1 data

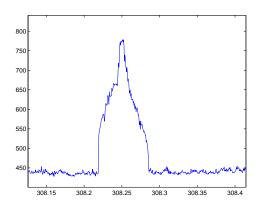


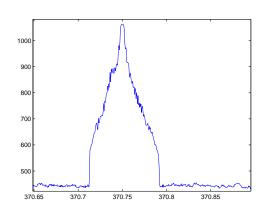


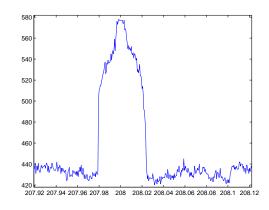


Search Results

- Expected threshold on number counts for $\alpha_H=10^{-10}$ should ideally be 459 should lead to \sim a few candidates every 1Hz band
- Agrees with results in "good" frequency bands
- There are many sharp lines which have been smeared out due to Doppler effect
- Apart from violin modes, 60 Hz lines, 16Hz data acquisition lines, there are many 0.25 Hz harmonics





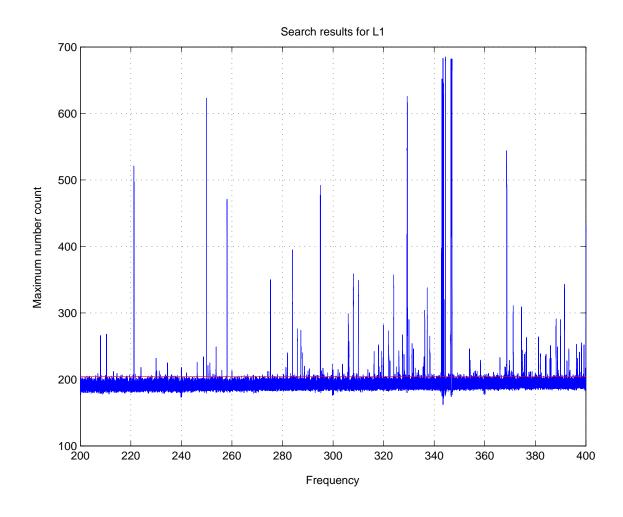






Search results

Hough number count maximized over whole sky and spindowns – L1 data

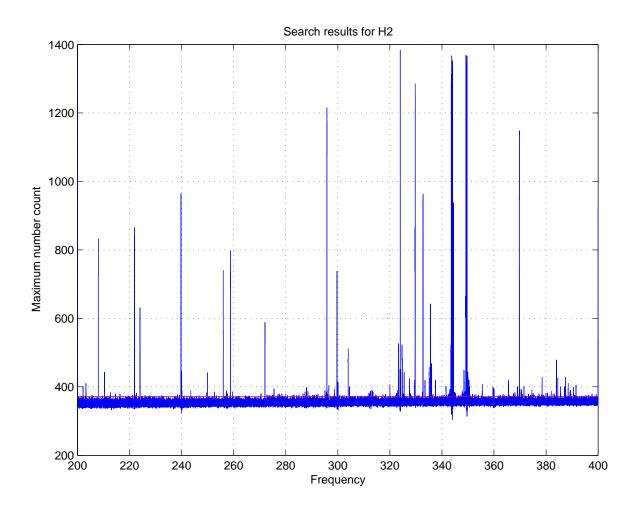






Search results

Hough number count maximized over whole sky and spindowns – H2 data

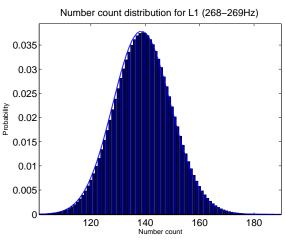


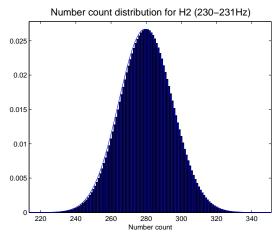


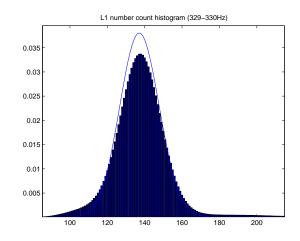


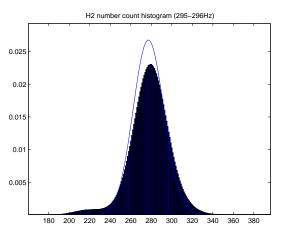
Search Results

Distributions in clean bands agree very well with expected binomial distribution but not in bands with strong disturbances













Setting Upper limits

- We set all-sky upper limits over frequency bands of $\sim 1 \text{Hz}$ in progress
- To avoid setting unnecessarily bad limits, we should exclude a priori the known broad freatures violin modes, 60Hz lines etc.
- Upper limits will be set by Monte-Carlo injections
- Aim is to set 95% upper limits based on the loudest event in each band, i.e. find the smallest h_0^{95} such that

$$\sum_{n=n_{max}}^{N} p(n|h_0^{95}) = 0.95$$

where n_{max} is largest number count in that band

- We will inject signals with random parameters and random mismatch from search templates and find h_0^{95} satisfying above equation.
- Monte-Carlo results being validated within LSC





To-do list

- Validating the S2 upper limits
- Analyze S3 data
- Compare results with other incoherent methods
- Medium term plan Combine \mathcal{F} -stat with Hough algorithm to get longer coherent integration times and thus better sensitivity
- Longer term plan Use Hough as part of a multi-stage hierarchical search