# Searching for continuous gravitational wave signals

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Sources of Gravitational Waves Trieste, September 2003



## Outline

## Effort for detecting GW

- Gravitational waves from pulsars
- ≻ S1 analysis:
  - ➢ Frequency domain method
  - ➤ Time domain method
- > The problem of blind surveys:
  - ➤ The incoherent Hough search



## **Evidence for Gravitational Waves**





## An International Network of Interferometers





## Lock Summaries S1/S2

	<b>S1</b>		<b>S2</b>	
Dates	23/8-9/9/02		14/2-14/4/03	
	<u>Hou</u>	<u>rs</u>	Hours	5
Runtime	<mark>408</mark> (100%)		<mark>1415</mark> (100%)	
Single IFO statistics:				
GEO:	<b>400</b>	(98%)		
<u>H1</u> (4km):	<b>235</b>	(58%)	<b>1040</b>	(74%)
<u>H2</u> (2km):	<b>298</b>	(73%)	818	(58%)
<u>L1</u> (4km):	<b>170</b>	(42%)	<b>523</b>	(37%)
Double coincidence:				
<u>L1</u> && <u>H1</u> :	116	(28%)	431	(31%)
<u>L1</u> && <u>H2</u> :	131	(32%)	351	(25%)
<u>H1</u> && <u>H2</u> :	188	(46%)	<b>699</b>	(49%)
Triple coincidence:				
<u>L1, H1</u> , and <u>H2</u> :	<b>96</b>	(23%)	312	(22%)
Sensitivities:	GEC	) << H2 < H <sup>2</sup>	1 < L1	l







– Pulsars (spinning neutron stars) are known to exist!

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– Emit gravitational waves if they are non-axisymmetric:



**Bumpy Neutron Star** 



• The GW signal from a neutron star:

$$h(t) = h_0 ?(t)e^{F(t)}$$

*A*,*F* amplitude and phase functions

$$h_0 = \frac{8\mathbf{p}^2 G}{c^4} \frac{I_{zz} f_0^2}{R} \mathbf{e} \quad \text{intrinsic amplitude}$$

• (Signal-to-noise)<sup>2</sup>~ 
$$\int_{0}^{T} \frac{h^{2}(t)}{S_{h}(f_{gw})} dt$$



## Sensitivity to Pulsars





## Instrumental sensitivity during S1



- Detectable amplitudes with a 1% false alarm rate and 10% false dismissal rate by the interferometers during S1 (colored curves) and at design sensitivities (black curves).
- Limits of detectability for rotating NS with equatorial ellipticity  $e = 10^{-3}$ ,  $10^{-4}$ ,  $10^{-5}$  @ 8.5 kpc.
- Upper limits on <h\_o> from spindown measurements of known radio pulsars (filled circles).



$$h(t) = F_{+}(t) h_{+}(t) + F_{\times}(t) h_{\times}(t)$$
  
(**a**, **d**),  $f_{0}, f_{1}, h_{0}, \mathbf{i}, \mathbf{y}, \mathbf{f}_{0}$ 

 $F_{+}(t, ?) \\ F_{\times}(t, ?)$ 

beam-pattern functions and depend on the relative orientation of the detector w.r.t. the wave. They depend on **y** and on the amplitude modulation functions a(t) and b(t) that depend on the relative instantaneous position between source and detector.

$$h_{+}(t) = h_{0} \frac{1 + \cos^{2} ?}{2} \cos ? (t)$$

$$h_{\times}(t) = h_{0} \cos ? \sin ? (t)$$

the two independent wave polarizations.

?  $(t) = \mathbf{f}_0 + F(t)$ 

the phase of the received signal depends on the initial phase and on the frequency evolution of the signal. The latter depends on the spin-down parameters and on the Doppler modulation, thus on the frequency of the signal and on the instantaneous relative velocity between source and detector.



Search for Continuous Waves S1 Analysis

- **Source:** PSR J1939+2134 (fastest known rotating neutron star) located 3.6 kpc from us.
  - Frequency of source: known
  - Rate of change of frequency (spindown): known
  - Sky coordinates ( $\alpha$ ,  $\delta$ ) of source: known
  - Amplitude  $h_0$ : unknown (though spindown implies  $h_0 < 10^{-27}$ )
  - Orientation 1: unknown
  - Phase, polarization  $\varphi$ ,  $\psi$ : unknown
- S1 Analysis goals:
  - Search for emission at 1283.86 Hz (twice the pulsar rotation frequency). Set upper limits on strain amplitude  $h_0$ .
  - Develop and test an efficient analysis pipeline that can be used for blind searches (**frequency domain method**)
  - Develop and test an analysis pipeline optimized for efficient "known target parameter" searches (time domain method)



- Input data: Short Fourier Transforms (SFT) of time series
  - Time baseline: 60 sec.High-pass filtered at 100 Hz & Tukey windowed. Calibrated once per minute
  - Data are studied in a narrow frequency band (0.5 Hz) and  $S_h(f)$  is estimated for each SFT.
- Dirichlet Kernel used to combine data from different SFTs (efficiently implements matched filtering).
- Detection statistic used is described in [Jaranoski, Krolak, Schutz, Phys. Rev. D58(1998) 063001]
- The *F* detection statistic provides the maximum value of the likelihood ratio with respect to the unknown parameters, *h*<sub>0</sub>, cos *i*, *y* and *f*<sub>0</sub> given the data and the template parameters that are known



- The outcome of a target search is a number  $F^*$  that represents the optimal detection statistic for this search.
- 2F\* is a random variable: For Gaussian stationary noise, follows a c<sup>2</sup> distribution with 4 degrees of freedom with a non-centrality parameter lμ(h/h). Fixing i, y and f<sub>0</sub>, for every h<sub>0</sub>, we can obtain a pdf curve: p(2F/h<sub>0</sub>)
- The **frequentist** approach says the data will contain a signal with amplitude  $a_0$ , with confidence **C**, if in repeated experiments, some fraction of trials C would yield a value of the detection statistics  $F^*$

$$C(h_0) = \int_{2F^*}^{\infty} p(2F \mid h_0) d(2F)$$

• Use signal injection Monte Carlos to measure Probability Distribution Function (PDF) of *F* 



## The data: time behaviour (4 Hz band around 1283 Hz)





## Measured PDFs for the F statistic

with fake injected worst-case signals at nearby frequencies





- Method developed to handle NS with ~ known complex phase evolution. Computationally cheap.
- Two stages of heterodyning to reduce and filter data:
  - Coarse stage (fixed frequency)  $16384 \Rightarrow 4$  samples/sec
  - Fine stage (Doppler & spin-down correction) 240  $\Rightarrow$  1 samples/min  $\Rightarrow B_k$
- Noise variance estimated every minute to account for nonstationarity.  $\Rightarrow s_k$
- Standard Bayesian parameter fitting problem, using timedomain model for signal -- a function of the unknown source parameters h<sub>0</sub>, *i*, *y* and f<sub>0</sub>

 $y(t;\mathbf{a}) = \frac{1}{4}h_0F_+(t,y)(1+\cos^2 i)e^{2if_0} - \frac{1}{2}ih_0F_{\times}(t,y)\cos ie^{2if_0}$ 



• We take a Bayesian approach, and determine the joint posterior distribution of the probability of our unknown parameters, using uniform priors on  $h_0$ , cos *i*, *y* and  $f_0$  over their accessible values, i.e.

$$p(\mathbf{a} | \{B_k\}) \propto p(\mathbf{a}) \cdot p(\{B_k\} | \mathbf{a})$$

$$\uparrow \qquad \uparrow \qquad \uparrow$$

posterior prior likelihood

- $\mathbf{c}^{2}(\mathbf{a}) = \sum_{k} \left| \frac{B_{k} \mathbf{y}(t;\mathbf{a})}{\mathbf{s}_{k}} \right|^{2}$
- The likelihood  $\propto \exp(-\chi^2/2)$ , where
- To get the posterior PDF for  $h_0$ , marginalizing with respect to the nuisance parameters  $\cos i$ , y and  $f_o$

$$p(h_0 | \{B_k\}) \propto \iiint e^{-c^2/2} \mathrm{d} f_0 \mathrm{d} y \mathrm{d} \cos i$$

The 95% upper credible limit is set by the value  $h_{95}$  satisfying

$$0.95 = \int_0^{h_{95}} p(h_0 | \{B_k\}) dh_0$$





## **No evidence** of continuous wave emission from PSR J1939+2134.

#### **Summary of 95% upper limits for h**<sub>o</sub>:

IFO	Frequentist FDS	<b>Bayesian TDS</b>
GEO	(1.9±0.1) x 10 <sup>-21</sup>	(2.2±0.1) x 10 <sup>-21</sup>
LLO	(2.7±0.3) x 10 <sup>-22</sup>	(1.4±0.1) x 10 <sup>-22</sup>
LHO-4K	(5.4±0.6) x 10 <sup>-22</sup>	(3.3±0.3) x 10 <sup>-22</sup>
LHO-2K	(4.0±0.5) x 10 <sup>-22</sup>	(2.4±0.2) x 10 <sup>-22</sup>

- $h_o < 1.4 \times 10^{-22}$  constrains ellipticity < 2.7 x 10<sup>-4</sup> (M=1.4 M<sub>sun</sub>, r=10 km, R=3.6 kpc)
- Previous results for this pulsar:  $h_o < 10^{-20}$  (Glasgow, Hough et al., 1983),  $h_o < 1.5 \times 10^{-17}$  (Caltech, Hereld, 1983).



<u>#</u>	PULSAR I	FREQUENCY (HZ)
1	B0021-72C	173.708218966053
2	B0021-72D	186.651669856838
3	B0021-72F	381.15866365655
4	B0021-72G	247.50152509652
5	B0021-72L	230.08774629150
6	B0021-72M	271.98722878893
7	B0021-72N	327.44431861755
8	J0024-7204V	207.90
9	J0030+0451	205.53069927493
10	B0531+21	30.2254370
11	J0537-6910	62.055096
12	J0711-6830	182.117237666390
13	J1024-0719	193.71568669103
14	B1516+02A	180.06362469727
15	J1629-6902	166.64990604074
16	B1639+36A	96.362234564
17	J1709+23	215.94
18	J1721-2457	285.9893480119
19	J1730-2304	123.110289179797
20	J1744-1134	245.4261237073059
21	J1748-2446C	118.5382530563
22	B1820-30A	183.82343541777
23	B1821-24	327.40566514989
24	J1910-5959B	119.6487328457
25	J1910-5959C	189.48987107019
26	J1910-5959D	110.6771919840
27	J1910-5959E	218.7338575893
28	B1937+21	641.9282611068082
29	J2124-3358	202.793897234988
30	B2127+11D	208.211688010
31	B2127+11E	214.987407906
32	B2127+11F	248.321180760
33	B2127+11H	148.293272565
34	J2322+2057	207.968166802197

#### Black dots show expected upper limit using H2 S2 data. **Red dots show limits on ellipticity based on spindown.**





## Crab pulsar

Young pulsar (~60 Hz) with large spin-down and timing noise

Frequency residuals will cause large deviations in phase if not taken into account.Use Jodrell Bank monthly crab ephemeris to recalculate spin down params every month.No glitches during S2 but in the event of a glitch we would need to add an extra parameter for jump in GW phase





## GW pulsars in binary systems

Physical scenarios: Accretion induced temperature • asymmetry (Bildsten, 1998; Ushomirsky, Cutler, Bildsten, Gas escapio 10<sup>-22</sup> 2000; Wagoner, 1984) • R-modes (Andersson et al, 1999; Wagoner, 2002) LMXB frequencies are clustered (could be detected by advanced Sco X-1 10<sup>-23</sup> LIGO). We need to take into account the additional Doppler effect produced by the source motion: - 3 parameters for circular orbit Signal strengths for - 5 parameters for eccentric orbit<sub>10</sub>-24 20 days of integration - possible relativistic corrections 10 100 200 1000 20 50 500 - Frequency unknown a priori frequency, Hz

Trieste'03, A.M. Sintes



## All-Sky and targeted surveys for unknown pulsars

It is necessary to search for every signal template distinguishable in parameter space. Number of parameter points required for a coherent  $T=10^7$ s search

[Brady et al., Phys.Rev.D57 (1998)2101]:

Class	f (Hz)	t (Yrs)	N <sub>s</sub>	Directed	All-sky
Slow-old	<200	>10 <sup>3</sup>	1	3.7x10 <sup>6</sup>	1.1x10 <sup>10</sup>
Fast-old	<10 <sup>3</sup>	>10 <sup>3</sup>	1	1.2x10 <sup>8</sup>	1.3x10 <sup>16</sup>
Slow-young	<200	>40	3	8.5x10 <sup>12</sup>	1.7x10 <sup>18</sup>
Fast-young	<10 <sup>3</sup>	>40	3	1.4x10 <sup>15</sup>	8x10 <sup>21</sup>

Number of templates grows dramatically with the integration time. To search this many parameter space coherently, with the optimum sensitivity that can be achieved by matched filtering, is computationally prohibitive.

=>It is necessary to explore alternative search strategies

Universitat de les Illes Balears The concept of the Hough transform

- The idea is to perform a search over the total observation time using an incoherent (sub-optimal) method:
  - We propose to search for evidence of a signal whose frequency is changing over time in precisely the pattern expected for some one of the parameter sets
- The method used is the Hough transform





## Hierarchical Hough transform strategy





The time-frequency pattern

• SFT data

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

• Demodulated data

$$f(t) - F_0(t) = \mathbf{x}(t) \cdot (\hat{n} - \hat{N})$$

$$F_{0}(t) \equiv f_{0} + \sum_{k} \Delta f_{k} \left[ \Delta T_{\hat{N}}(t) \right]^{k} \qquad \Delta f_{k} \equiv f_{k} - F_{k}$$

$$T_{\hat{N}}(t) = t + \frac{\prod_{k} (t) \cdot \hat{N}}{c} + \textcircled{T} \text{ Time at the SSB for a given sky position}$$

$$\prod_{k} (t) = \left( F_{0}(t) + \sum_{k} F_{k} \left[ \Delta T_{\hat{N}}(t) \right]^{k} \right) \frac{\bigcup_{k} (t)}{c} + \left( \sum_{k} k F_{k} \left[ \Delta T_{\hat{N}}(t) \right]^{k-1} \right) \frac{\Delta x(t)}{c}$$



### Incoherent Hough search: Pipeline for S2





- Input data: Short Fourier Transforms (SFT) of time series (Time baseline: 1800 sec, calibrated)  $\widetilde{x}(f) = \widetilde{n}(f) + \widetilde{h}(f)$
- $\succ$  For every SFT, select frequency bins *i* such

$$\boldsymbol{r}_{i} = \frac{|\widetilde{x}(f_{i})|^{2}}{\left\langle |\widetilde{n}(f_{i})|^{2} \right\rangle} = \frac{|\widetilde{x}(f_{i})|^{2}}{S_{n}(f_{i})T_{SFT}}$$

exceeds some threshold  $r_0$ 

- → time-frequency plane of zeros and ones
- $\succ$  *p*(*r/<i>h*, *S<sub>n</sub>*) follows a χ<sup>2</sup> distribution with 2 degrees of freedom:

$$\langle \boldsymbol{r}_{i} \rangle = 1 + \frac{|\tilde{h}(f_{i})|^{2}}{S_{n}(f_{i})T_{SFT}} \qquad \boldsymbol{s}_{r}^{2} = 1 + \frac{2|\tilde{h}(f_{i})|^{2}}{S_{n}(f_{i})T_{SFT}}$$

> The false alarm and detection probabilities for a threshold  $r_0$  are

$$\boldsymbol{a}(\boldsymbol{r}_0 \mid \boldsymbol{S}_n) = \int_{\boldsymbol{r}_0}^{\infty} p(\boldsymbol{r} \mid \boldsymbol{0}, \boldsymbol{S}_n) \, \mathrm{d}\boldsymbol{r} = e^{-\boldsymbol{r}_0}, \quad \boldsymbol{h}(\boldsymbol{r}_0 \mid \boldsymbol{h}, \boldsymbol{S}_n) = \int_{\boldsymbol{r}_0}^{\infty} p(\boldsymbol{r} \mid \boldsymbol{h}, \boldsymbol{S}_n) \, \mathrm{d}\boldsymbol{r}$$



• After performing the HT using N SFTs, the probability that the pixel  $\{\alpha, \delta, f_0, f_i\}$  has a number count n is given by a binomial distribution:

$$P(n \mid p, N) = \binom{N}{n} p^n (1-p)^{N-n}$$

$$p = \begin{cases} \mathbf{a} & \text{signal absent} \\ \mathbf{h} & \text{signal present} \end{cases}$$

$$p = \begin{cases} \mathbf{a} & \text{signal present} \\ \mathbf{h} & \text{signal present} \end{cases}$$

• The Hough false alarm and false dismissal probabilities for a threshold  $n_0$ 

$$\mathbf{a}_{H}(n_{0}, \mathbf{a}, N) = \sum_{n=n_{0}}^{N} {\binom{N}{n}} \mathbf{a}^{n} (1-\mathbf{a})^{N-n} \rightarrow \text{Candidates selection}$$
$$\mathbf{b}_{H}(n_{0}, \mathbf{h}, N) = \sum_{n=0}^{n_{0}-1} {\binom{N}{n}} \mathbf{h}^{n} (1-\mathbf{h})^{N-n}$$



• Perform the Hough transform for a set of points in parameter space  $\mathbf{l} = \{\alpha, \delta, f_0, f_i\} \in \mathbf{S}$ , given the data:

 $\begin{array}{ccc} \text{HT: } \mathbf{S} \ \overrightarrow{} \ \mathbf{N} \\ \lambda \ \overrightarrow{} \ n(\mathbf{I}) \end{array}$ 

• Determine the maximum number count n\*

 $n^* = \max(n(\mathbf{I})): \lambda \in \mathbf{S}$ 

• Determine the probability distribution  $p(n/h_0)$  for a range of  $h_0$ 





• Perform the Hough transform for a set of points in parameter space  $\mathbf{l} = \{\alpha, \delta, f_0, f_i\} \in \mathbf{S}$ , given the data:

 $\begin{array}{c} \text{HT: } \mathbf{S} \ \rightarrow \ \mathbf{N} \\ \lambda \ \rightarrow \ n(\mathbf{I}) \end{array}$ 

• Determine the maximum number count n\*

 $n^* = \max(n(\mathbf{I})): \lambda \in \mathbf{S}$ 

- Determine the probability distribution  $p(n/h_0)$  for a range of  $h_0$
- The 95% frequentist upper limit  $h_0^{95\%}$  is the value such that for repeated trials with a signal  $h_0^3 h_0^{95\%}$ , we would obtain  $n^3 n^*$  more than 95% of the time

$$0.95 = \sum_{n=n^*}^{N} p(n/h_0^{95\%})$$

•Compute  $p(n/h_0)$  via Monte Carlo signal injection, using  $\lambda \in \mathbf{S}$ , and  $\phi_0 \in [0, 2\pi], \psi \in [-\pi/4, \pi/4], \cos \iota \in [-1, 1].$ 



## Code Status

- $\checkmark$  Stand-alone search code in final phase
- ✓ Test and validation codes (under CVS at AEI)
- ✓ Hough routines are part of the LAL library:

🛛 🦋 Bookmarks 🞄 Location: [[http://www.lsc-group.phys.uwm.edu/cgi-bin/cvs/viewcvs.cgi/lal/packages/houghpulsar/src/?cvsroot=lal				
🖌 🗶 Members 🥒 WebMail 🥠 Co	🖌 🖉 Members 🥒 WebMail 🥒 Connections 🥠 BizJournal 🥠 SmartUpdate 🥠 Mktplace			
lal/packages/houghpulsar/src         View         Current directory: [lal] / lal / packages / houghpulsar / src				
Files shown: 9	Rev.	Age	Author	Last log entry
ConstructPLUT.c	1.8	4 weeks	sintes	bug fixed at bin zero
DriveHough.c	<u>1.3</u>	4 months	sintes	new functionality
li <u>HoughMap.c</u>	<u>1.2</u>	4 months	sintes	new functionality
≣ <u>Makefile.am</u>	<u>1.4</u>	4 months	sintes	new functionality
🖹 <u>NDParamPLUT.c</u>	<u>1.2</u>	2 months	sintes	changed
<u> ■ ParamPLUT.c</u>	<u>1.4</u>	2 months	sintes	changed
🖹 <u>PatchGrid.c</u>	<u>1.4</u>	4 weeks	sintes	improved bin counting for non-demod. case
■ <u>Peak2PHMD.c</u>	<u>1.4</u>	4 months	sintes	new functionality
Stereographic.c	<u>1.2</u>	4 months	sintes	new functionality



## Code Status II

#### ✓ Auxiliary functions C-LAL compliant (under CVS at AEI to be incorporated into LAL or LALApps):

- Read SFT data
- Peak Selection (in white & color noise)
- Statistical analysis of the Hough maps
- Compute  $\langle v(t) \rangle$

## Under development:

- Implementation of an automatic handling of noise features. Robust PSD estimator.
- Monte Carlo signal injection analysis code.
- Condor submission job.
- Input search parameter files



## Validation code

-Signal only case-  $(f_0=500 \text{ Hz})$ 





## Validation code

#### -Signal only case- $(f_0=500 \text{ Hz})$





## Results on simulated data





### Noise only case





#### Number count probability distribution





## Comparison with a binomial distribution





#### Set of upper limit. *Frequentist approach*.





## **Computational Engine**





#### Searchs offline at:

- Medusa cluster (UWM)
  - 296 single-CPU nodes (1GHz PIII + 512 Mb memory)
  - 58 TB disk space
- Merlin cluster (AEI)
  - 180 dual-CPU nodes
     (1.6 GHz Athlons + 1 GB memory)
  - 36 TB disk space
- CPUs needed for extensive Monte-Carlo work







## H1 Analysis – the SFTs



1887 Calibrated SFT's H1  $T_{SFT} = 1800s$ , Band : 263-268 Hz 26 SFT, σ≤0.95 or σ≥1.05 8 – 10<sup>-35</sup> sum of |sft|<sup>2</sup> 263 264 264.5 265 263.5 265.5 266 1.5 × 10<sup>-36</sup> frequency Hz Mean of |sft|<sup>2</sup> 50 n 200 400 600 800 1000 1200 1400 1600 1800 2000 0 SFT # 1.5 std of |sft|<sup>2</sup>/<|sft|<sup>2</sup>> 0.5 200 400 600 800 1000 1200 1400 1600 1800 2000 n SFT #





H1 Results 264-265 Hz

"upper limit estimate"

