

# Searching for continuous gravitational waves: data analysis strategies in LIGO/Virgo Collaboration

**Magdalena Sieniawska**

Nicolaus Copernicus Astronomical Center Polish Academy of Sciences, Warsaw,  
Poland

15.02.2019

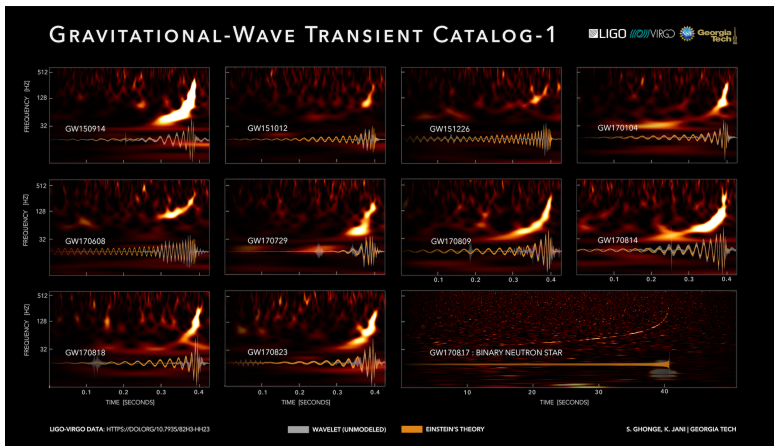


- ▶ Motivation
- ▶ Astrophysical sources of continuous gravitational waves (CGW)
- ▶ Search strategies in LIGO-Virgo Collaboration (LVC)
- ▶ Detector characterisation (DetChar) and CGW synergy
- ▶ CGW data analysis: future insights

# Motivation

New era: gravitational waves astronomy

10 BH-BH mergers, 1 NS-NS merger

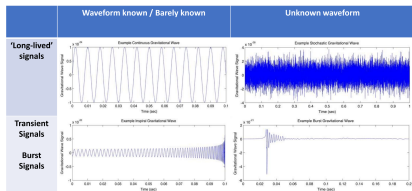


→ O1/O2 Catalog: <https://www.gw-openscience.org>

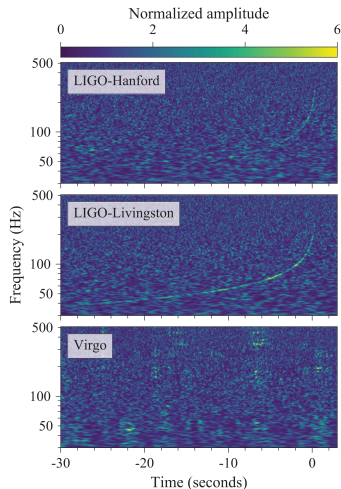
# Motivation

New era: gravitational waves astronomy

Upgrade of the existing detectors + new methods in data analysis  
+ new detectors = **detections of the more subtle signals**



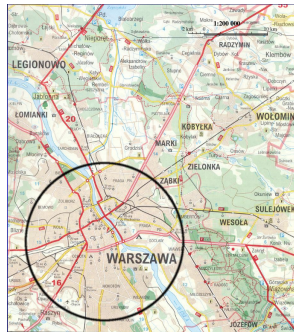
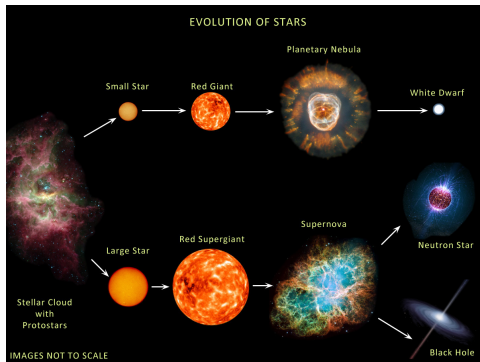
Reviews: K. Riles (2013), Andersson et al. (2009)



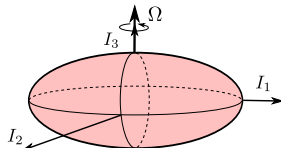


# Sources of CGW

## Neutron stars



According to  
Einstein's quadrupole formula  
time-varying (mass) quadrupole moment  
is needed to produce GW.



# CGW - emission mechanisms models in NS

- ▶ Mountains (elastic, magnetic, viscosity stresses)

$$f_{GW} = 2f_{rot}$$

- ▶ Oscillations (r-modes)

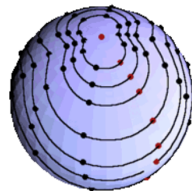
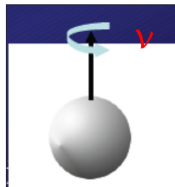
$$f_{GW} = 4/3 f_{rot}$$

- ▶ Free precession

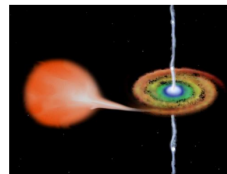
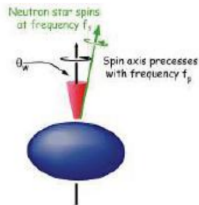
$$f_{GW} \propto f_{rot} + f_{prec}$$

- ▶ Accretion (thermal gradients)

$$f_{GW} \approx f_{rot}$$



Courtesy: B. J. Owen



Courtesy: McGill U.

## Reviews

Bejger (2018)

Lasky (2015)

Andersson et al. (2011)

# CGW radiation model

## Commonly used model

Non-axisymmetric rotating NS (described as a triaxial ellipsoid) radiating purely quadrupolar CGW.

## Strain amplitude

$$h_0 = 4 \times 10^{-25} \left( \frac{\epsilon}{10^{-6}} \right) \left( \frac{I_3}{10^{45} \text{ g cm}^2} \right) \left( \frac{f}{100 \text{ Hz}} \right)^2 \left( \frac{100 \text{ pc}}{d} \right)$$

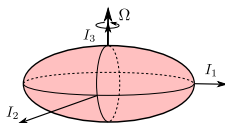
Compare GW 150914:  $h_0 \sim 10^{-21}$  (Abbott et al. 2016)

$$\epsilon = (I_1 - I_2)/I_3$$

$$I = I_3$$

$$f = \Omega/2\pi$$

d - distance

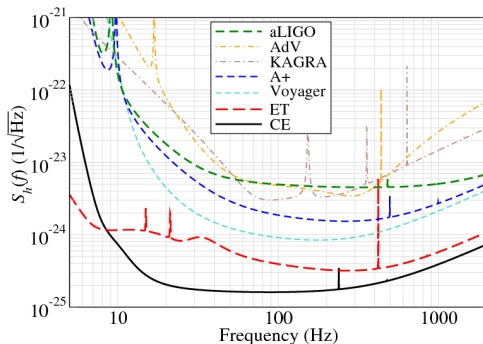


Target:

rapidly (or slowly for ET) spinning NS in our Galaxy

( $\sim 2600$  known, potentially  $10^8$  objects)

# Signal-to-noise ratio (SNR)



Regimbau et al. (2017)

## Signal-to-noise ratio

$$SNR \propto \frac{h_0}{\sqrt{S_n}} \sqrt{T}$$

$S_n$  - strain noise  
(aLIGO:  $\sqrt{S_n} \sim 10^{-23} \text{ Hz}^{-1/2}$ )

$T$  - observational time

## Network of the detectors

$$SNR \propto \sqrt{N}$$

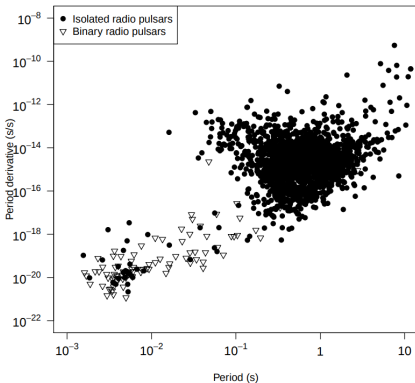
$N$  - number of detectors with comparable sensitivity

- ▶ GW150914:  $h_0 \sim 10^{-21}$ ,  $T \sim 0.2\text{s} \rightarrow SNR \sim 24$
- ▶ CGW:  $h_0 \lesssim 10^{-25}$ ,  $T \sim \text{days, months, years...}$

# Spin-down

NS is losing energy and spinning-down, due to the CGW emission, magnetic braking, neutrino emission, accretion (e.g. Greenstein & Cameron 1969, Illarionov & Kompaneets 1990, Dvornikov & Dib 2009, Staff et al. 2012).

We can measure it e.g. from radio-observations.

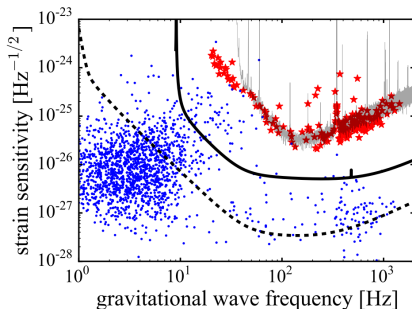


Spin-down limit (assumption: NS loses energy only due to the CGW)

$$h_{\text{spindown}} = 2.5 \times 10^{-25} \left( \frac{1 \text{ kpc}}{d} \right) \sqrt{\left( \frac{1 \text{ kHz}}{f_{\text{GW}}} \right) \left( \frac{-\dot{f}_{\text{GW}}}{10^{-10} \text{ Hz/s}} \right) \left( \frac{I_z}{10^{38} \text{ kg} \cdot \text{m}^2} \right)}$$

# No CGW signal? Set upper limits!

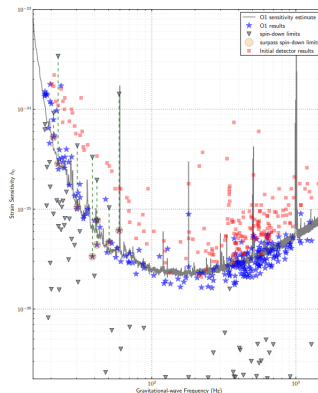
With the known sensitivity of the detectors we can put constraints on the  $f_{GW}$ ,  $\dot{f}_{GW}$  and  $\epsilon$ .



GW strain limit, spin-down limit, sensitivity:

S5, aLIGO, ET

(Lasky 2015; Aasi et al. 2014; Dupuis & Woan 2005)

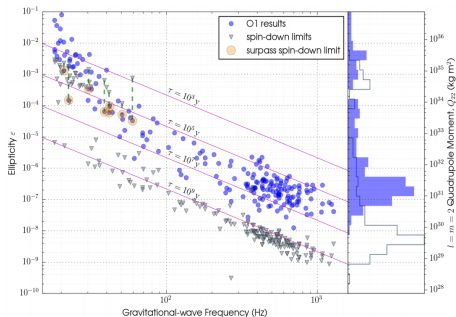


O1 run

Abbott et al. (2017)

# No CGW signal? Set upper limits!

- ▶ Most constraining ellipticity is  $1.3 \times 10^{-8}$  for J0636+5129
- ▶  $\epsilon$  can be converted to a maximal 'mountain' size:  
for Crab  $\sim 10$  cm  
for Vela  $\sim 50$  cm
- ▶  $\epsilon$  can tell us about NS matter:  
 $\sim 10^{-5} - 10^{-7}$  for 'normal' NS  
Ushomirsky et al. (2000)  
 $\sim 10^{-4} - 10^{-5}$  for 'strange' NS  
Owen (2005)



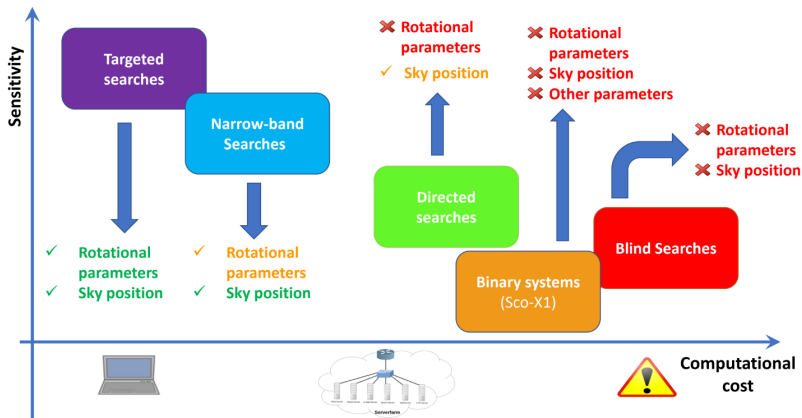
O1 run  
Abbott et al. (2017)

# Data analysis strategies

Is it isolated NS or binary system?

How well do we know the source?

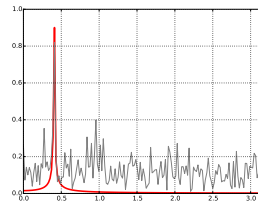
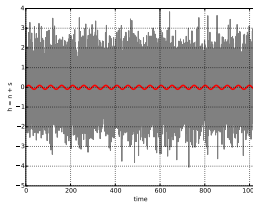
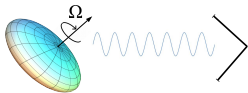
How much computational power do we have?





# Data analysis strategies

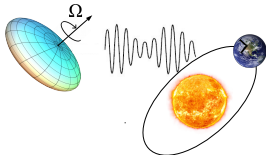
## Basic idea



Measured signal strain  $h(t; A, \lambda)$  depends on:

- ▶ Amplitude parameters  $A \equiv \{h_0, \cos\iota, \psi, \phi_0\}$
- ▶ Phase-evolution parameters  $\lambda \equiv \{\vec{n}, f, \dot{f}, \dots\}$

→ One has to include extra modulations



# $\mathcal{F}$ -statistics time-domain method

Developed by Jaranowski, Królak & Schutz (1998).

Search on 4-dimensional  $(f, \dot{f}, \alpha, \delta)$  optimal grid (Pisarski & Jaranowski 2015).

$$\mathcal{F} = \frac{2}{\sigma^2} \left( \frac{|F_a|^2}{\langle a^2 \rangle} + \frac{|F_b|^2}{\langle b^2 \rangle} \right)$$

$$F_a = \sum_{t=1}^N x(t) a(t) \exp[-i\phi(t)], \quad F_b = \sum_{t=1}^N x(t) b(t) \exp[-i\phi(t)],$$
$$\langle a^2 \rangle = \sum_{t=1}^N a(t)^2, \quad \langle b^2 \rangle = \sum_{t=1}^N b(t)^2,$$

$\sigma^2$  - variance of the data  $x(t)$ ,

$a(t), b(t)$  - amplitude modulation functions (depend on the location and orientation of the detectors on Earth and on the position of GW source on the sky  $(\alpha, \delta)$ ),

$\phi(t)$  - phase modulation function (like above + depends on frequency  $f$  and spindown  $\dot{f}$ ).

# Targeted searches

e.g. known radio, X-ray or  $\gamma$ -ray pulsars

## Heterodyne (Bayesian) method

Dupuis & Woan (2005)

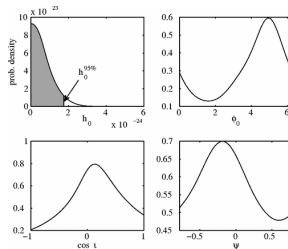
- ▶ Bayesian parameter-estimation for  $A \equiv \{h_0, \cos\iota, \psi, \phi_0\}$
- ▶ Known  $\lambda \equiv \{\vec{n}, f, \dot{f}, \dots\}$

## $\mathcal{F}$ -statistics method

Only small range in  $f$  and  $\dot{f}$  around known values is explored.

## 5-vector method Astone et al. (2010, 2012)

- ▶ Fourier-domain
- ▶ amplitude modulation from the Earth's sidereal rotation of each detector's antenna pattern



Name	distance[kpc]	$h_{\text{sd}} \cdot 10^{-25}$	$\epsilon_{\text{sd}} \cdot 10^{-4}$
J0205+6449 <sup>a</sup>	$2.0 \pm 0.3^b$	$6.9 \pm 1.1$	14
J0534+2200 (Crab)	$2.0 \pm 0.5^c$	$14 \pm 3.5$	7.6
J0835-4510 (Vela)	$0.28 \pm 0.02^c$	$34 \pm 2.4$	18
J1400-6326	$10 \pm 3^d$	$0.90 \pm 0.27$	2.1
J1813-1246	$> 2.5^e$	$< 1.8$	$< 2.4$
J1813-1749	$4.8 \pm 0.3^f$	$3.0 \pm 0.2$	7.0
J1833-1034	$4.8 \pm 0.4^g$	$3.1 \pm 0.3$	13
J1952+3252	$3.0 \pm 0.5^h$	$1.0 \pm 0.2$	1.1
J2022+3842	$10 \pm 2^i$	$1.0 \pm 0.3$	6.0
J2043+2740	$1.5 \pm 0.6^j$	$6.9 \pm 2.8$	23
J2229+6114	$3.0 \pm 2^c$	$3.4 \pm 2.2$	6.2

Upper: S3+S4 runs, Abbott et al. (2008)

Bottom: O1 run, Abbott et al. (2017)

15/25

# Directed searches

e.g. non-pulsating X-ray source at the center of a supernova remnant

- ▶  $f, \dot{f}, \dots$  are unknown, but sky location is known
- ▶ higher  $f$  derivatives can be important for young (hot) and/or accreting NS
- ▶ hard to model
- ▶ strain depends on age  $a$  and distance  $d$  (Wette et al. 2008); additional factors like mass or equation of state increase  $h_0^{age}$  uncertainty by 50%

Strongest possible signal from supernova remnant

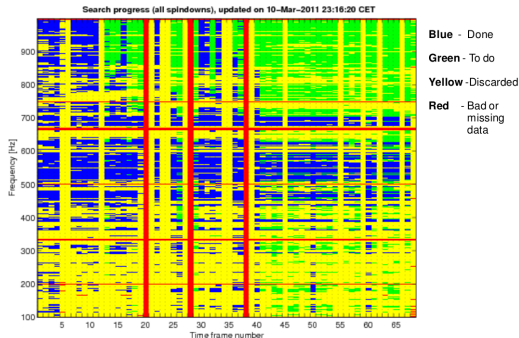
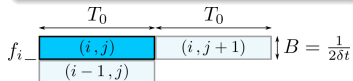
$$h_0^{age} = 1.26 \times 10^{-24} \left( \frac{3.30 \text{ kpc}}{d} \right) \left( \frac{300 \text{ yr}}{a} \right)^{1/2}$$

# Blind (all-sky) searches

Unknown sources

## Computational cost

Exploring huge parameter space requires huge computational power  
→ reduce number of parameter to the minimum

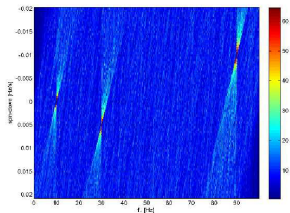
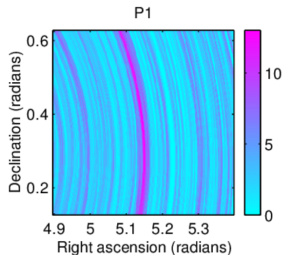


## $\mathcal{F}$ -statistic pipeline example

Computing power scales as  $\sim T^5 \log(T)$   
→ divide data into shorter segments (e.g. 6 days)

# Blind (all-sky) searches

Unknown sources



## Hough transform (Hough 1959, Hough 1962)

- ▶ detection statistic is compared to a threshold and given a weight
- ▶ weighting based on antenna pattern and detector noise
- ▶ antenna pattern depends on  $\{\alpha, \delta, f, \dot{f}, \dots\}$
- ▶ different parameter spaces chosen to accumulate weight sums:

Sky Hough (Krishnan et al. 2004, Aasi et al. 2014)

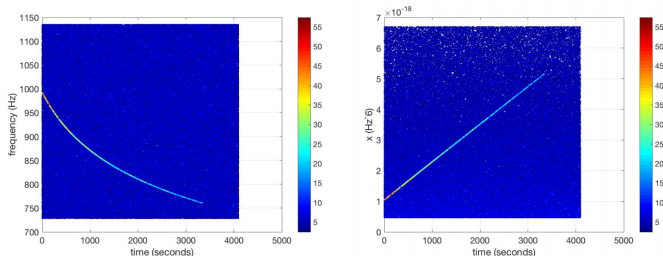
Frequency Hough (Antonucci et al. 2008, Astone et al. 2014, Aasi et al. 2016)

- ▶ sums of weights are accumulated in “maps”

# Blind (all-sky) searches

Unknown sources

## Generalized Frequency Hough Miller et al. (2018)



Braking index

$$n = \frac{f|\ddot{f}|}{\dot{f}^2}$$

particle wind  $n = 1$

dipole (EM) radiation  $n = 3$

quadrupole (GW) radiation  $n = 5$

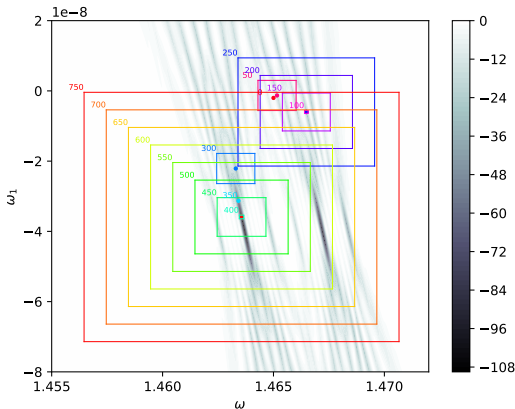
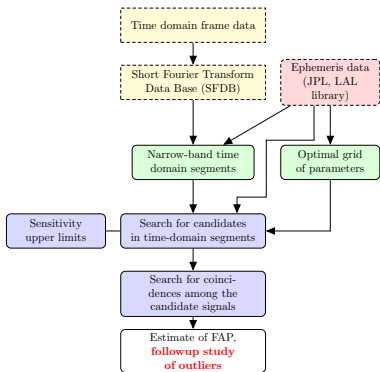
oscillations (r-modes)  $n = 7$

# Blind (all-sky) searches

Unknown sources

## $\mathcal{F}$ -statistic method

Main goal: to find  $\mathcal{F}$ -statistic maximum and  $f, \dot{f}, \alpha, \delta$  associated with it.



Hierarchical pipeline allows for computational cost reduction.



# Blind (all-sky) searches

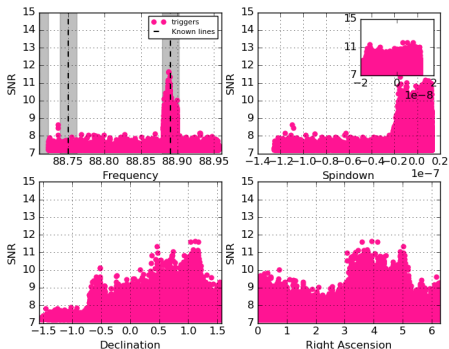
Unknown sources

## Lines and signals in $\mathcal{F}$ -statistics method

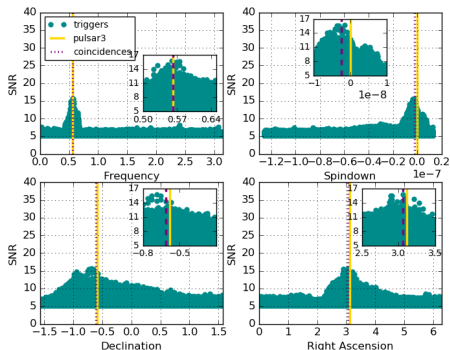
Main goal: find  $\mathcal{F}$ -statistic maximum and  $f, \dot{f}, \alpha, \delta$  associated with it.

$$SNR = \sqrt{2(\mathcal{F} - 2)}$$

Line:



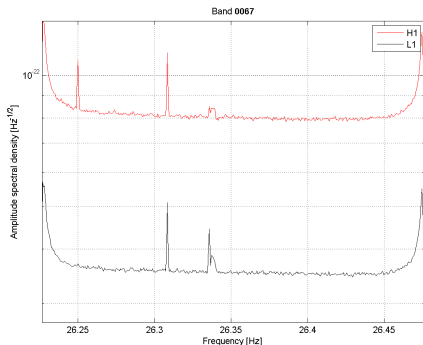
Signal:



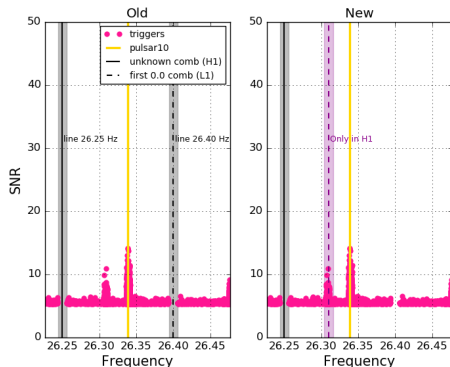
# DetChar and CGW synergy

Lines hunt - spectral density

DetChar team provides list of known, stationary lines  $\rightarrow$  vetoing.



Plot courtesy of A. Królak



CW team during data analysis finds new lines, distinguishes lines and astrophysical signals and gives feedback to DetChar.

# DetChar and CGW synergy

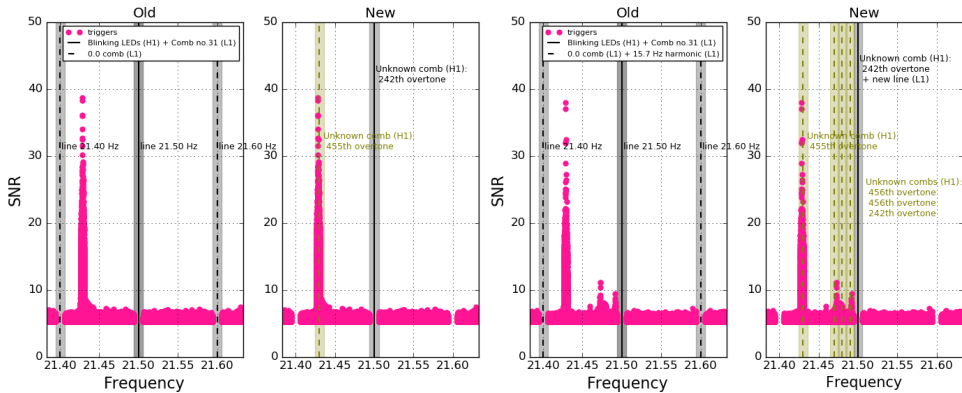
## Lines hunt - time evolution

Some lines are problematic - they evolve or disappear in time.

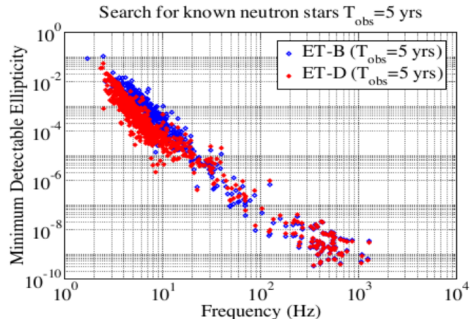
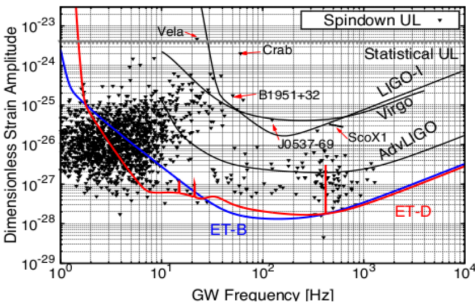
Band 0047, 24-days

Frame 003

Frame 009

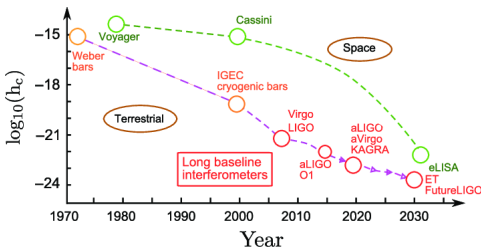


# Future insights

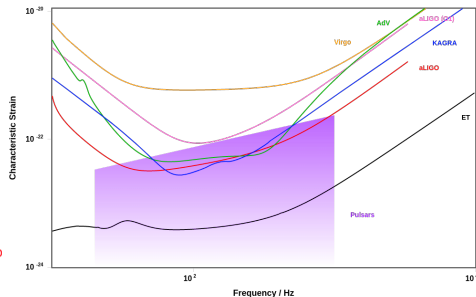


- ▶ detections and/or better upper limits
- ▶ mountains as small as 10 cm can be detected (ET)
- ▶ exploring lower frequencies
- ▶ joint EM and GW observations will deliver unique information about NS (equation of state, environment, physical phenomena)

# Future insights



Blair et al. (2016)



Plot generated on <http://gwplotter.com/>

Not only sensitivity improvement matters.  
The higher number of the detectors in the  
network, the bigger chance to detect CGW!