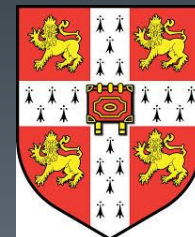
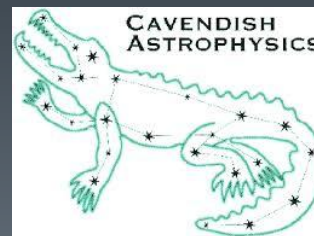


Detecting Gravitational Waves using a Pulsar Timing Array

Lindley Lentati
Cavendish Laboratory
Cambridge



...and why we haven't yet



Data problems:

- Noise models

Computational problems:

- High Dimensionality

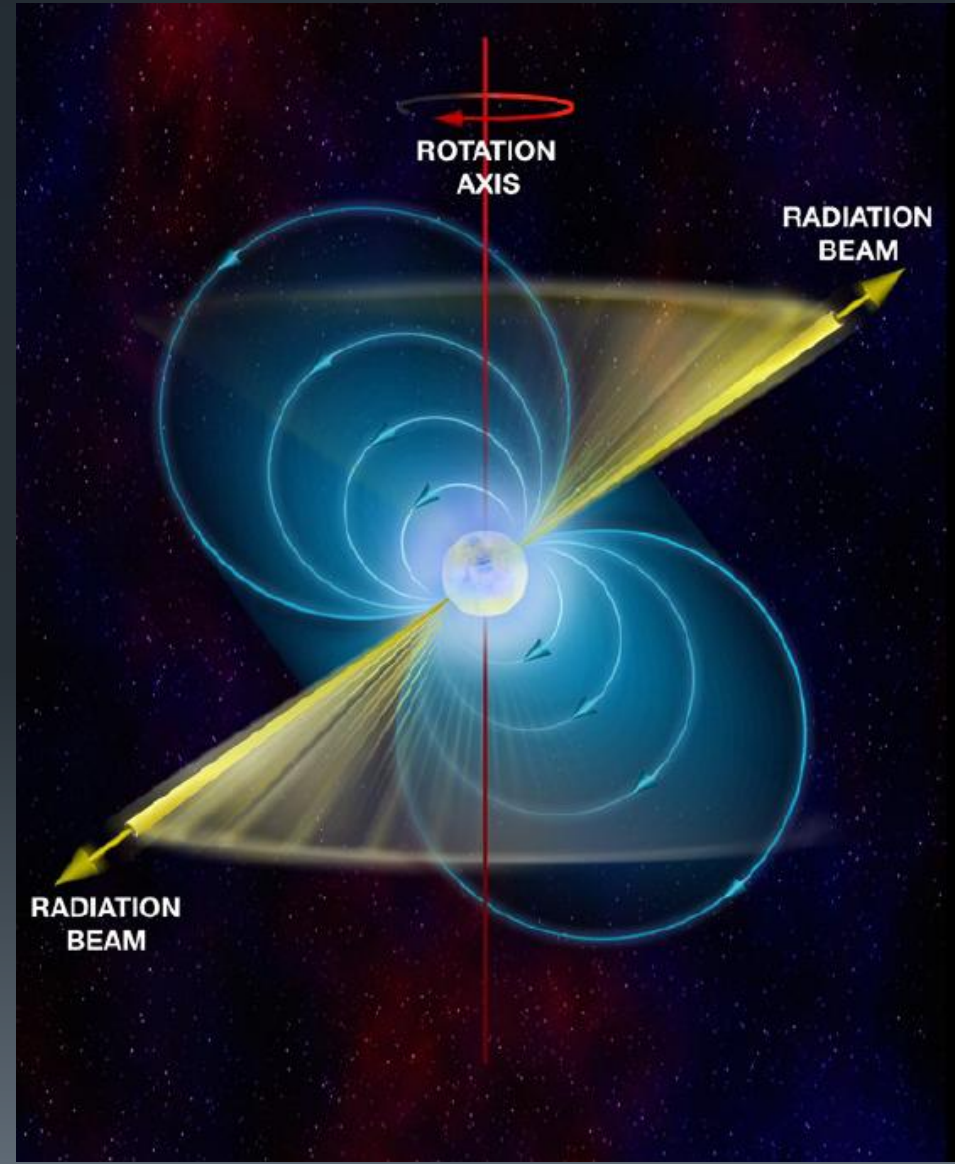
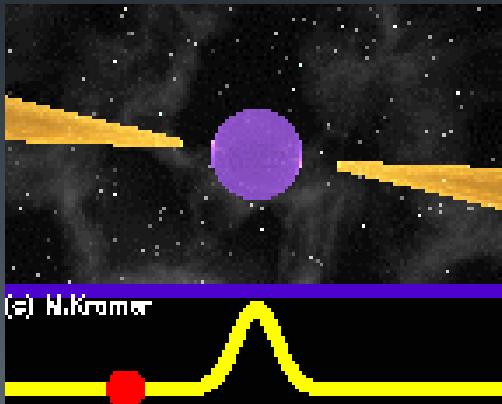
- Big datasets

Astrophysical problems:

- Current limits getting interesting/depressing

Pulsar Timing

- Mass > our Sun
- 20km across
- Hundreds rotations/sec
- 'lighthouse' effect



Pulsar Timing



- Extremely precise astronomical clocks.

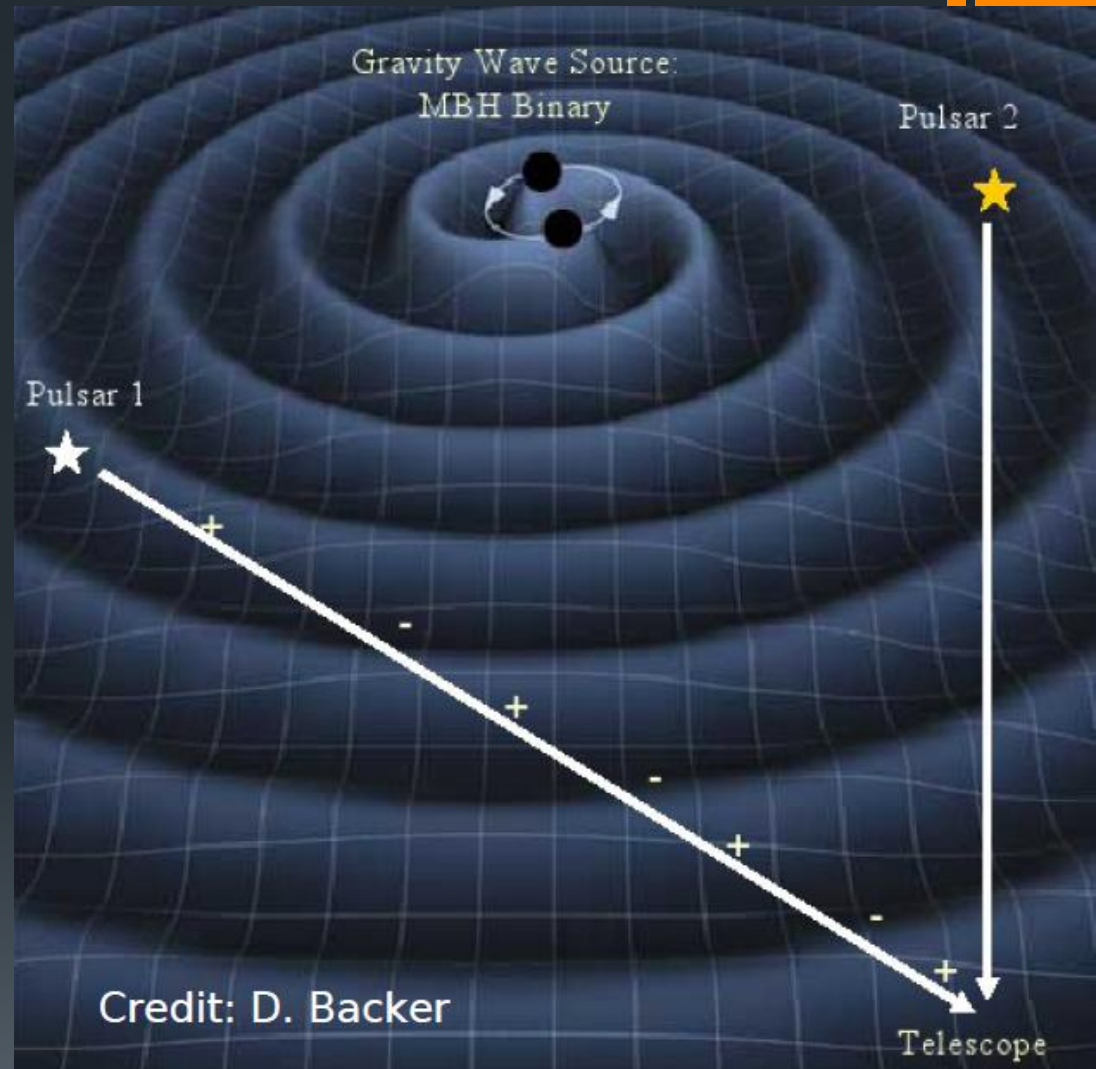
Spin period of PSR J0437-4715:

$P = 0.00575745193671259 \text{ s} \pm 0.0000000000000000002 \text{ s} !$

- Period of pulsar known to 1 part in 10^{15}

Pulsar Timing

- Sensitive to nHz GWs
- Earth-pulsar distance changed
- See deviation in arrival time of pulse

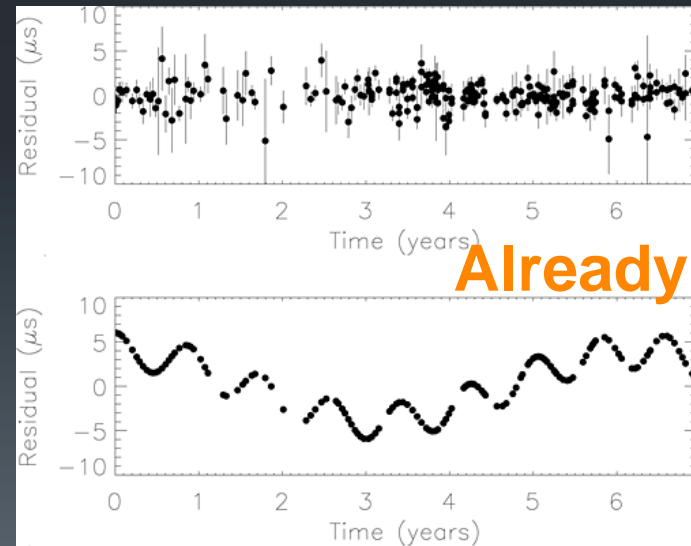
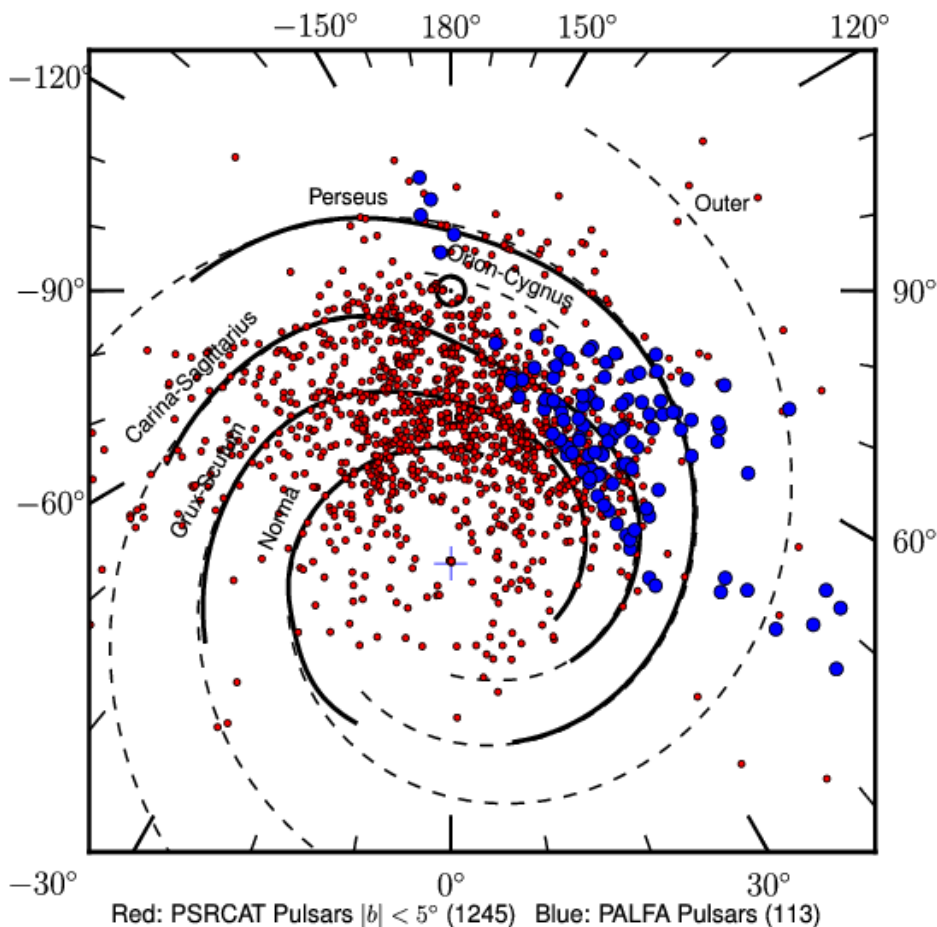


Pulsar Timing

Also far away $\sim 1 \text{ kpc} = 3 \times 10^{19}$ meters

Change in path length
from GWs:

\sim few hundred meters
 $= 0.1 - 1.0 \mu\text{s}$



Already There!

Pulsar Timing

Use a collection of pulsars: pulsar timing array

GW signal correlated
between pulsars

Signal in Residuals

Clock errors:

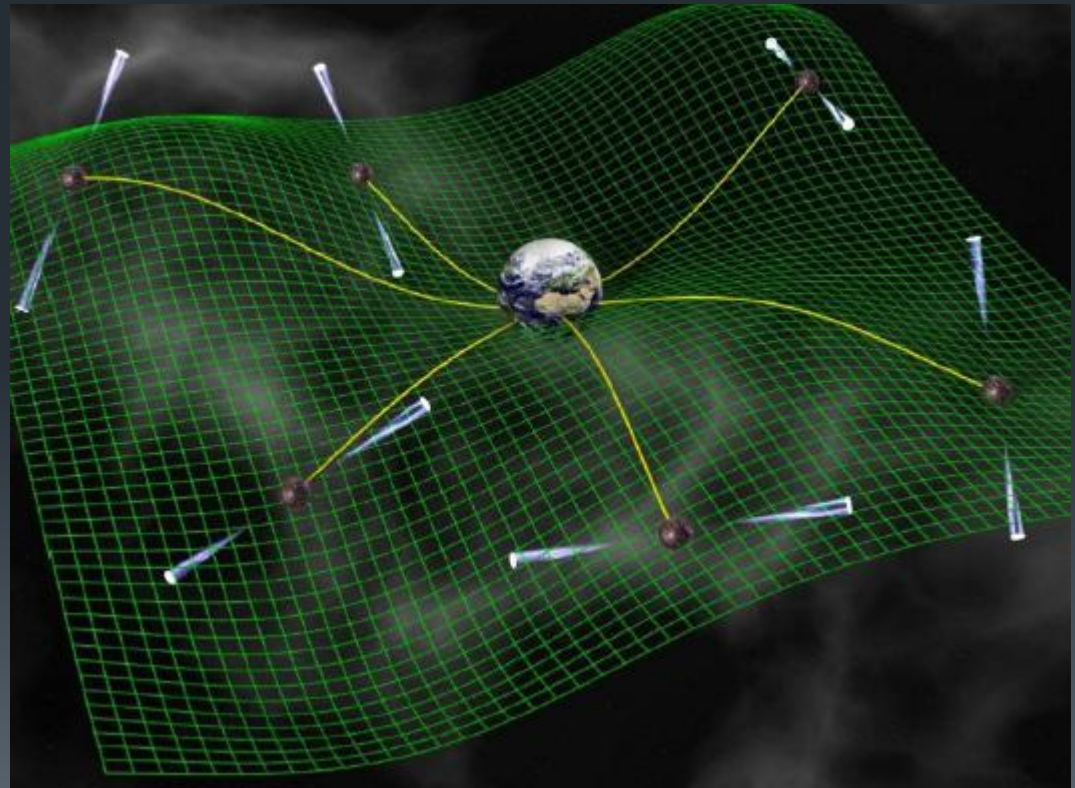
monopole

Ephemeris errors:

dipole

GW signal:

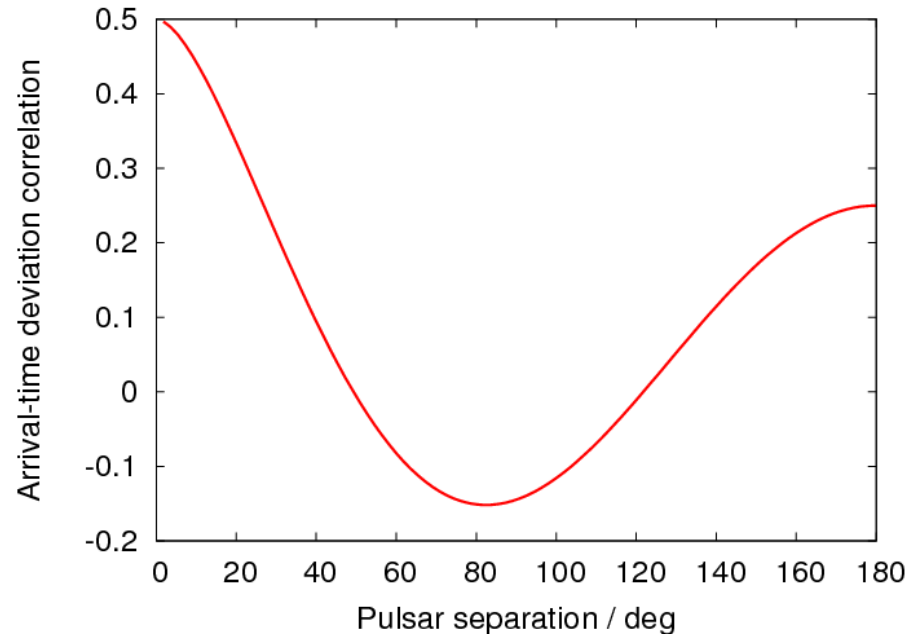
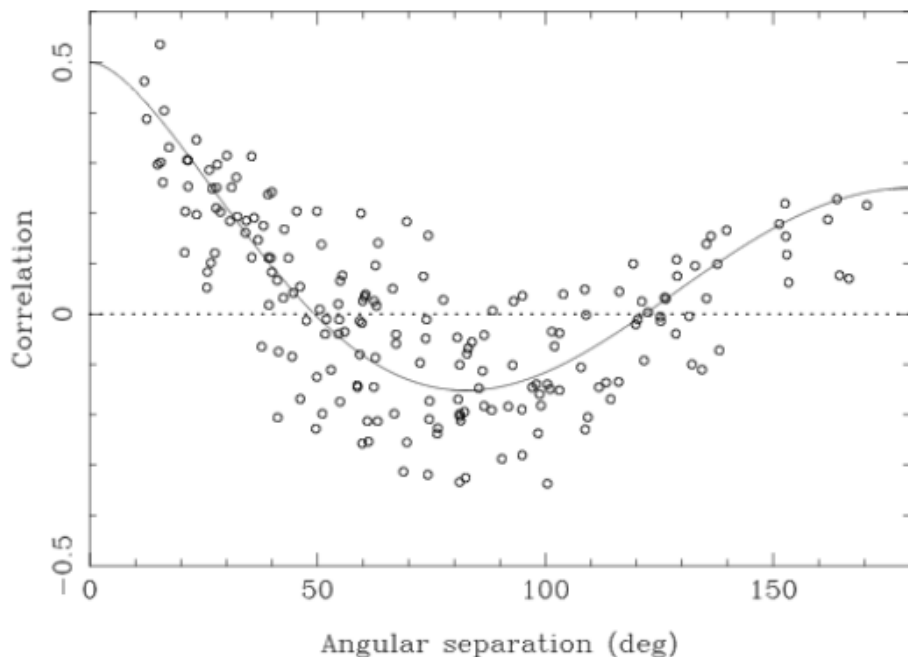
quadrupole



The Hellings-Downs Curve

For an isotropic background the angular correlation has an analytic solution

$${}^{ab}\Gamma(\epsilon) = 3 \left(\frac{1}{3} + \frac{1 - \cos\epsilon}{2} \left[\ln\left(\frac{1 - \cos\epsilon}{2}\right) - \frac{1}{6} \right] \right)$$



Smoking Gun of a real
GW detection.

e.g. Hellings & Downs, 1983, ApJL, 265, 39;
Jenet et al. 2005, ApJL, 625, 123



Green Bank, West Virginia



Westerbork, The Netherlands



Effelsberg, Germany



Pune, India



Arecibo, Puerto Rico



Goostrey, United Kingdom



Nancay, France



San Basilio, Italy

Under Construction



Parkes, Australia



IPTA



Some predictions..

20 pulsars

100ns white noise

Detection in: 5 years (e.g. Jenet et al 2004)

Current IPTA dataset:

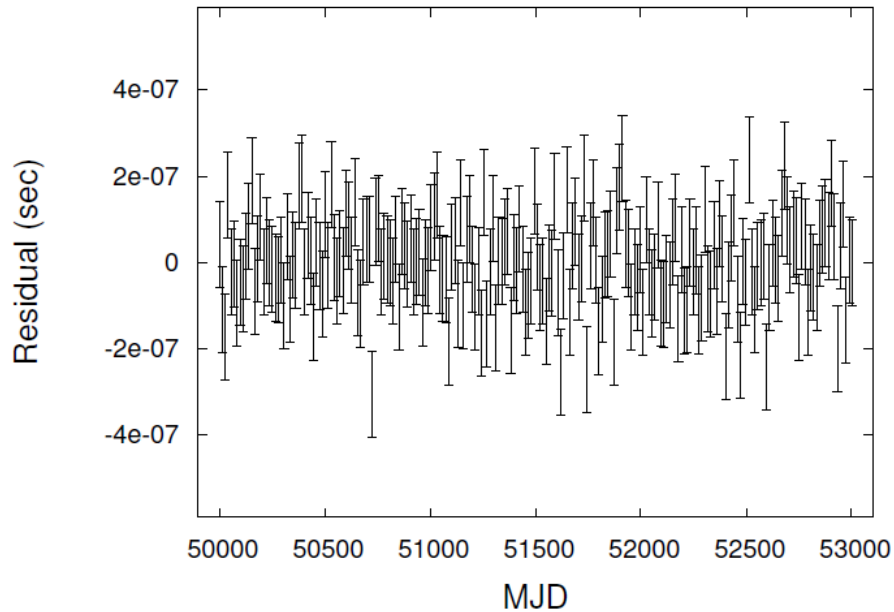
40 pulsars

20 years of data

Some < 100ns

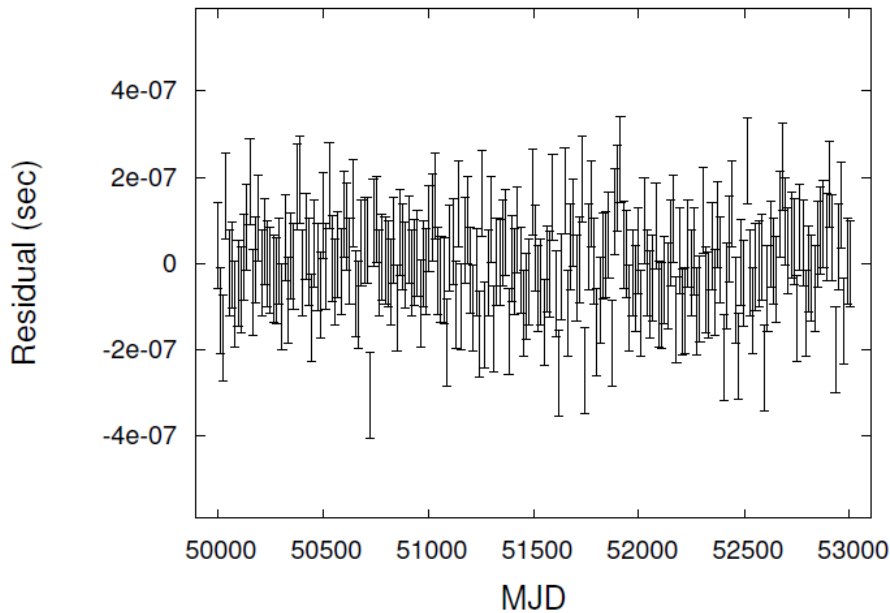
.. Where's the detection?

Data challenges



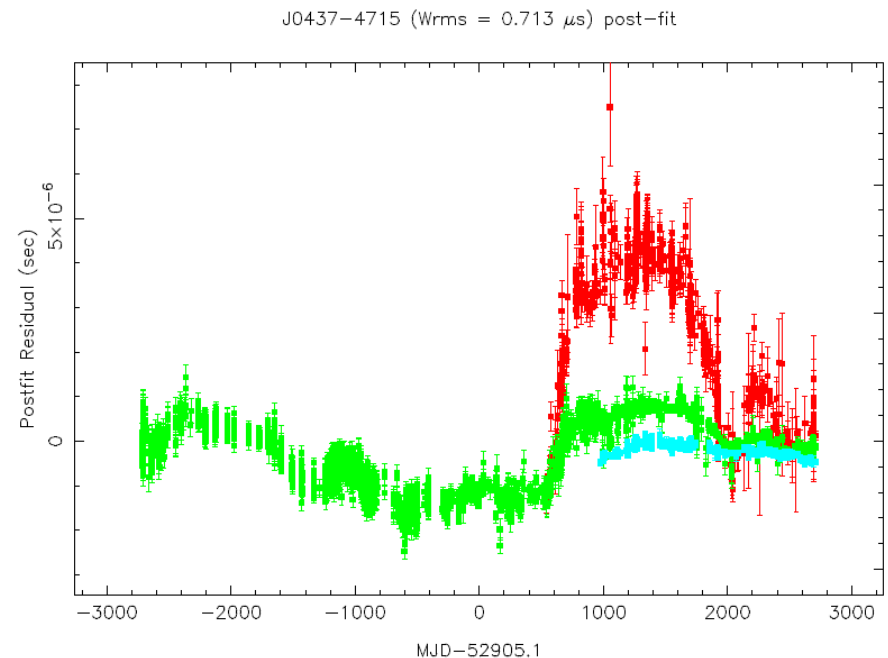
Residuals:
Subtract expected time of
arrival from actual time.
<- 100ns white noise

Data challenges



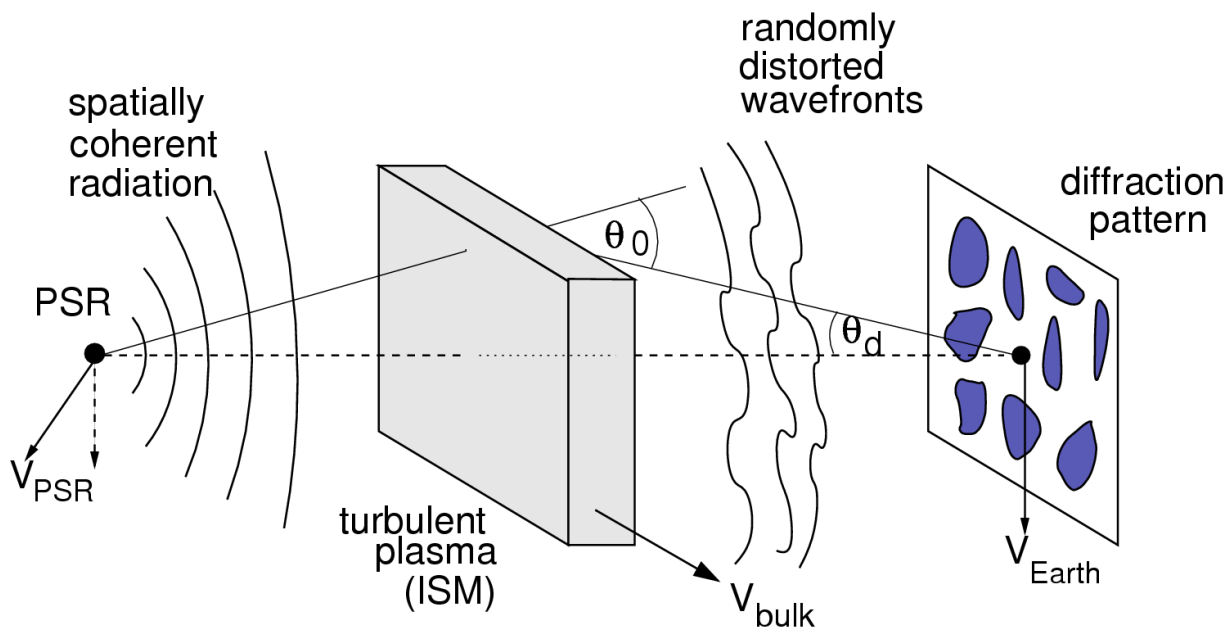
Residuals:
Subtract expected time of arrival from actual time.
← 100ns white noise

Actual data:
J0437-4715
(one of the better pulsars)



Data challenges

Noise mostly due to the interstellar medium
Frequency dependent (goes as $1/f^2$)



$$t_g(\nu) = K DM / (\nu^2)$$

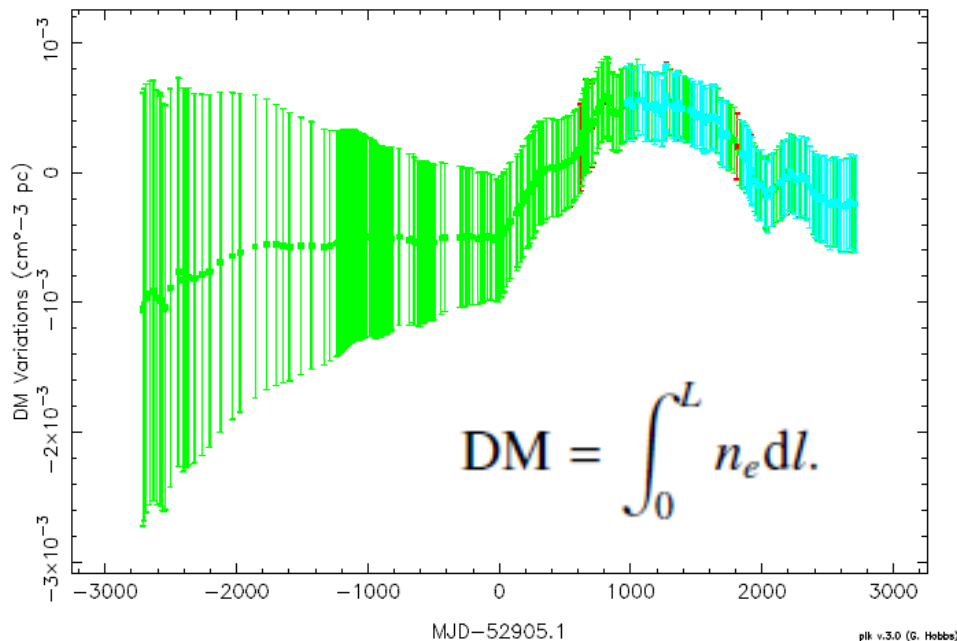
$$K \equiv 4.15 \times 10^{15} \text{ Hz}^2 \text{ cm}^3 \text{ pc}^{-1} \text{ s}$$

$$DM = \int_0^L n_e dl.$$

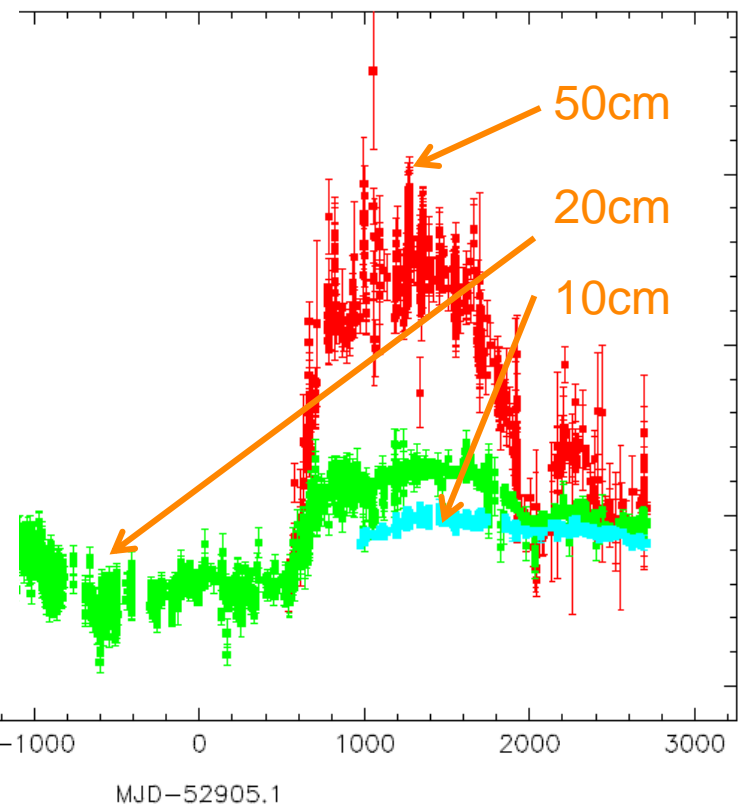
Data challenges

Noise mostly due to the interstellar medium
Frequency dependent (goes as $1/f^2$)

J0437-4715 (Wrms = 0.651 μ s) post-fit



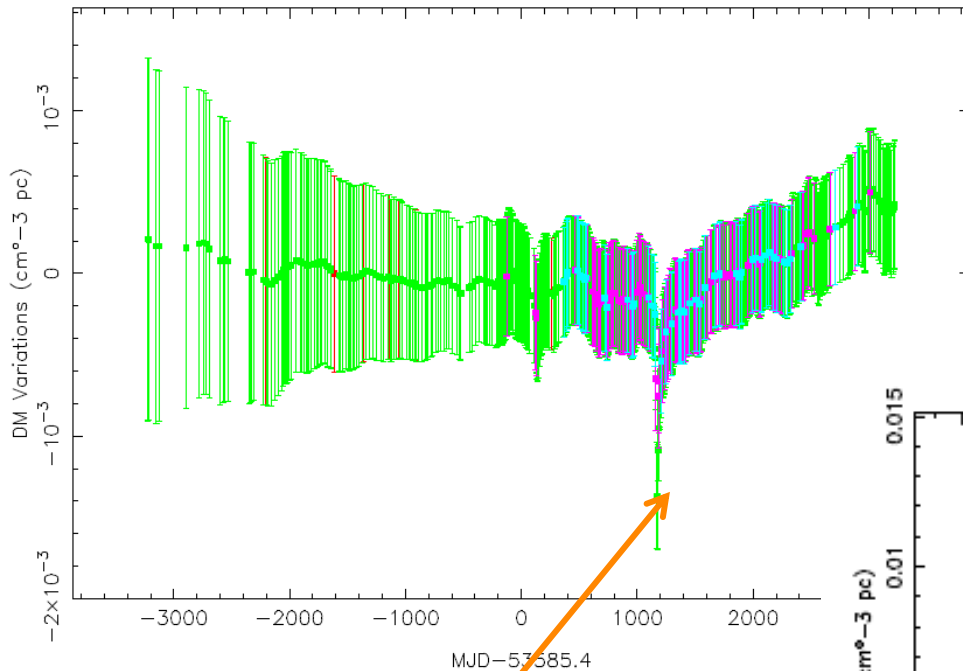
-4715 (Wrms = 0.713 μ s) post-fit



Data challenges



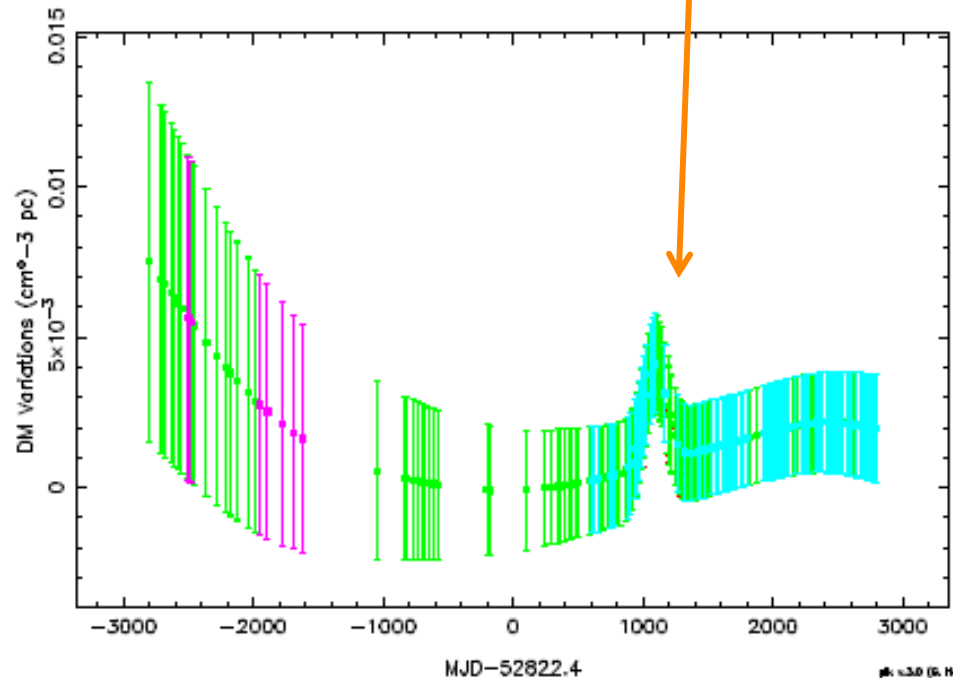
J1713+0747 (Wrms = 0.318 μ s) pre-fit



Not Time stationary

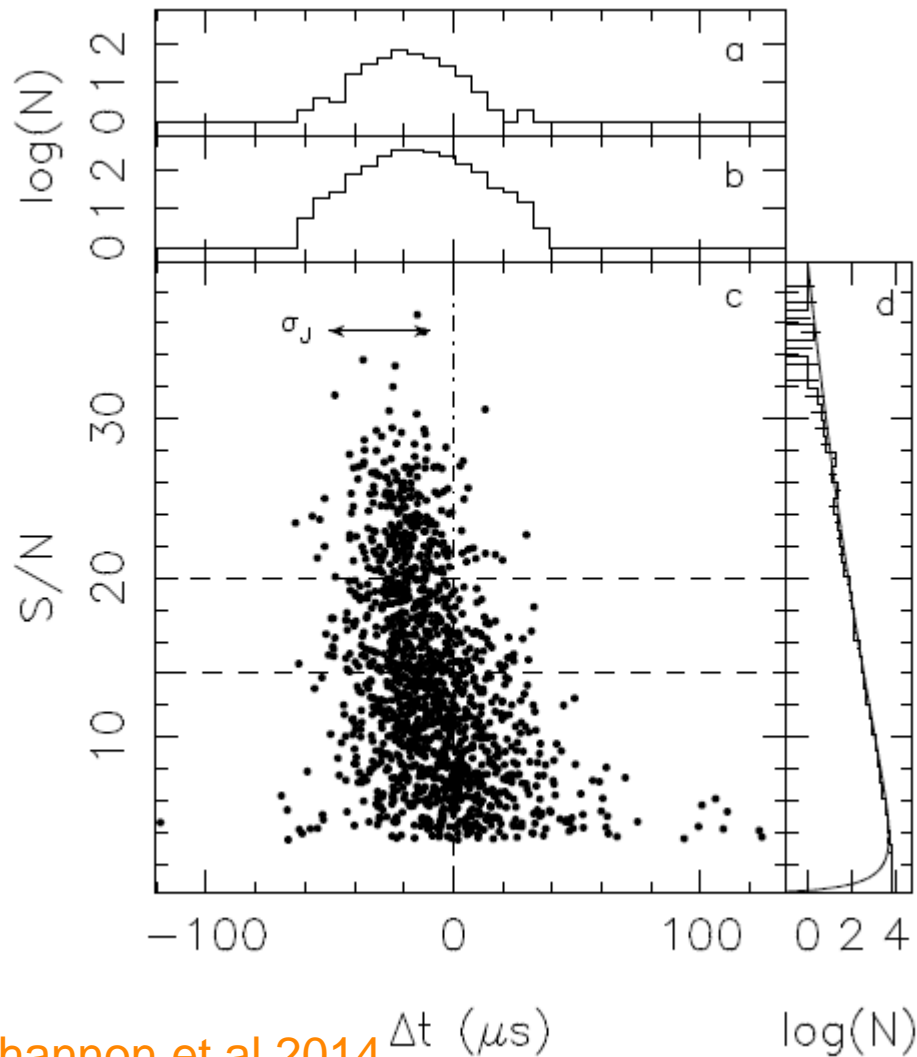
Over density in the ISM

J1603-7202 (Wrms = 4.641 μ s) post-fit



Void in the ISM

Data challenges



Shannon et al 2014 Δt (μs) $\log(N)$

Intrinsic High Frequency
in arrival times

Known as 'Jitter'

Better telescopes wont help

Some pulsars already at limit

Data challenges



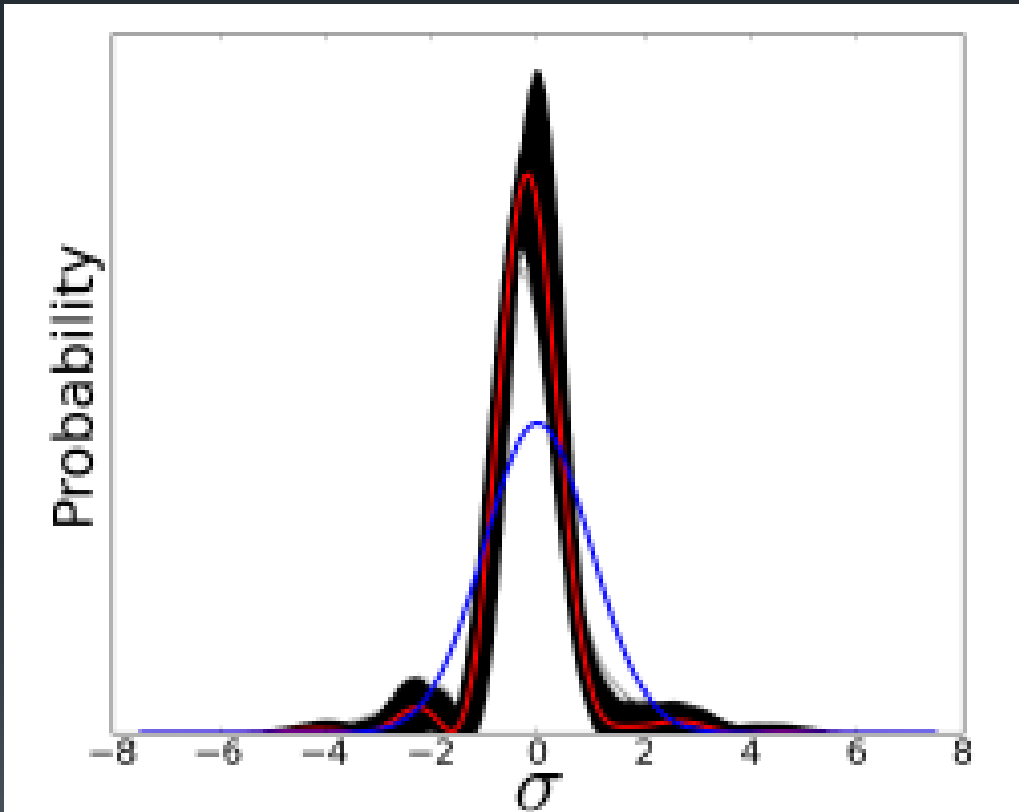
Intrinsic High Frequency variation in arrival times

Known as '**Jitter**'

Better telescopes wont help

Some pulsars already at limit

Not necessarily Gaussian



Lentati et al 2014

Data challenges

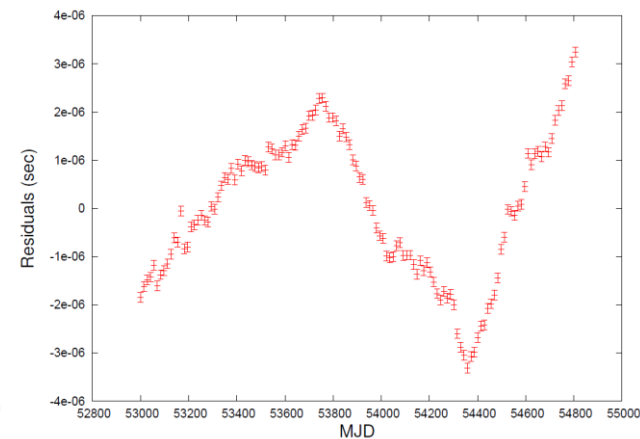
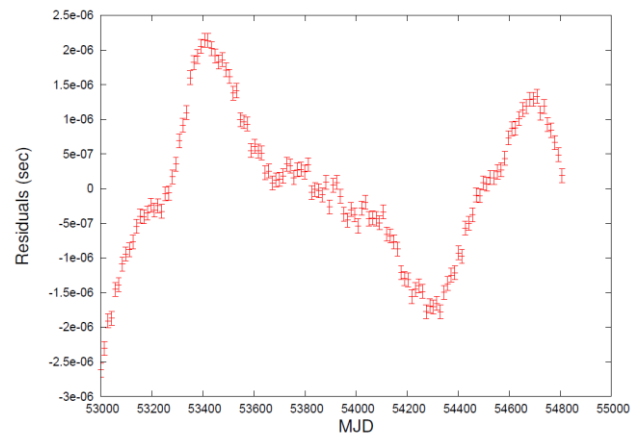
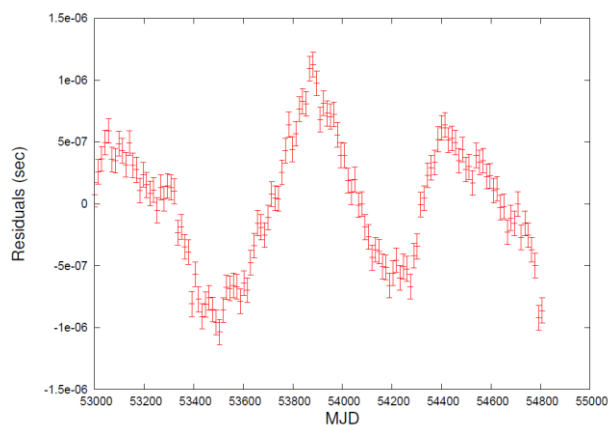
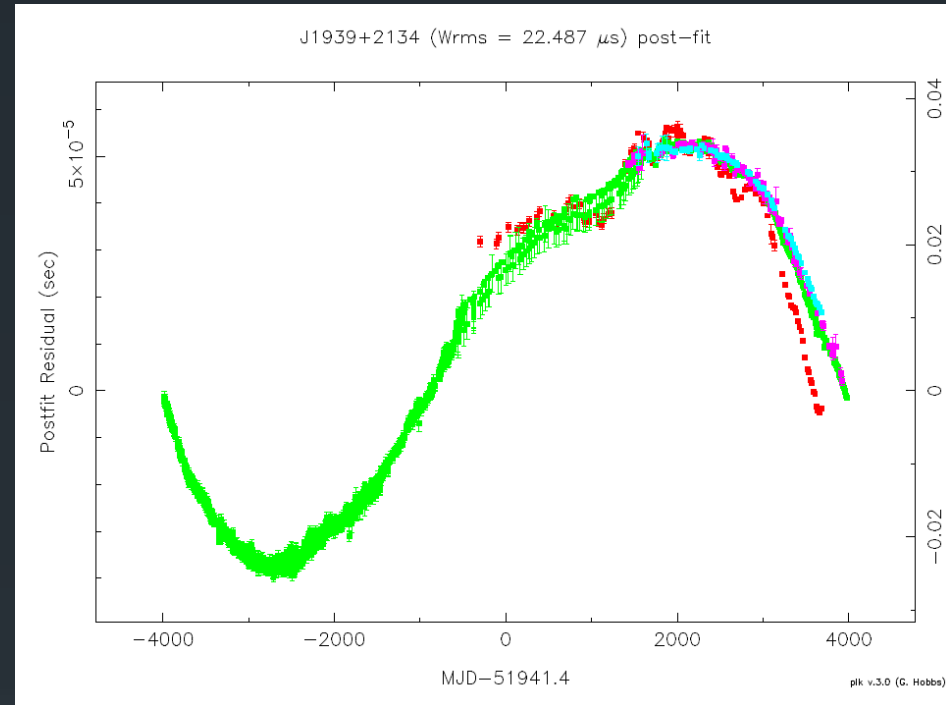
Finally, Intrinsic Low Frequency variation in arrival times

Known as 'Timing Noise'

Either from magnetosphere, or core.. Origins mostly unknown

Stochastic Process as with DM

Individually can look just like Gravitational Waves



Computational challenges



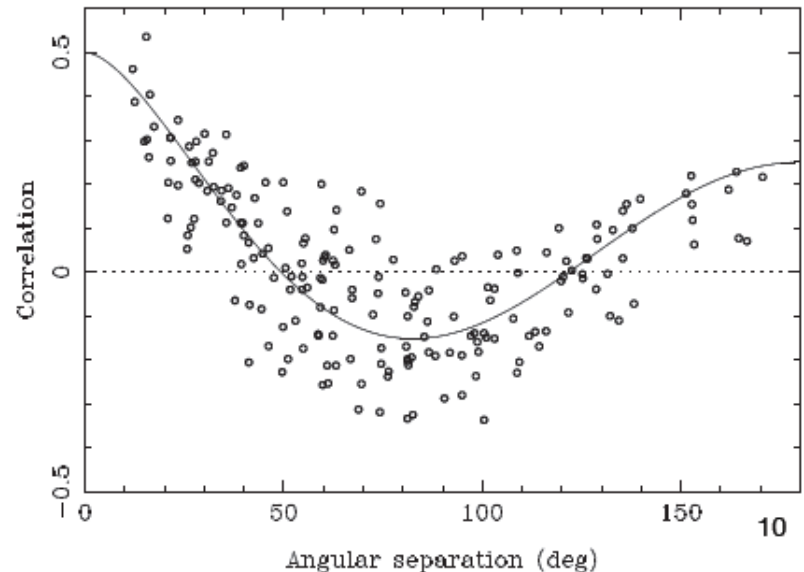
$$p(\mathbf{r}|\vec{\theta}) = \frac{1}{\sqrt{\det 2\pi \Sigma(\vec{\theta})}} \exp\left(-\frac{1}{2}\mathbf{r}^T \Sigma^{-1}(\vec{\theta})\mathbf{r}\right)$$

Residuals $\mathbf{r} = \begin{bmatrix} \mathbf{r}_1 \\ \mathbf{r}_2 \\ \vdots \\ \mathbf{r}_l \end{bmatrix}$

The signal in this case is in the covariance matrix!

Covariance matrix for residuals:

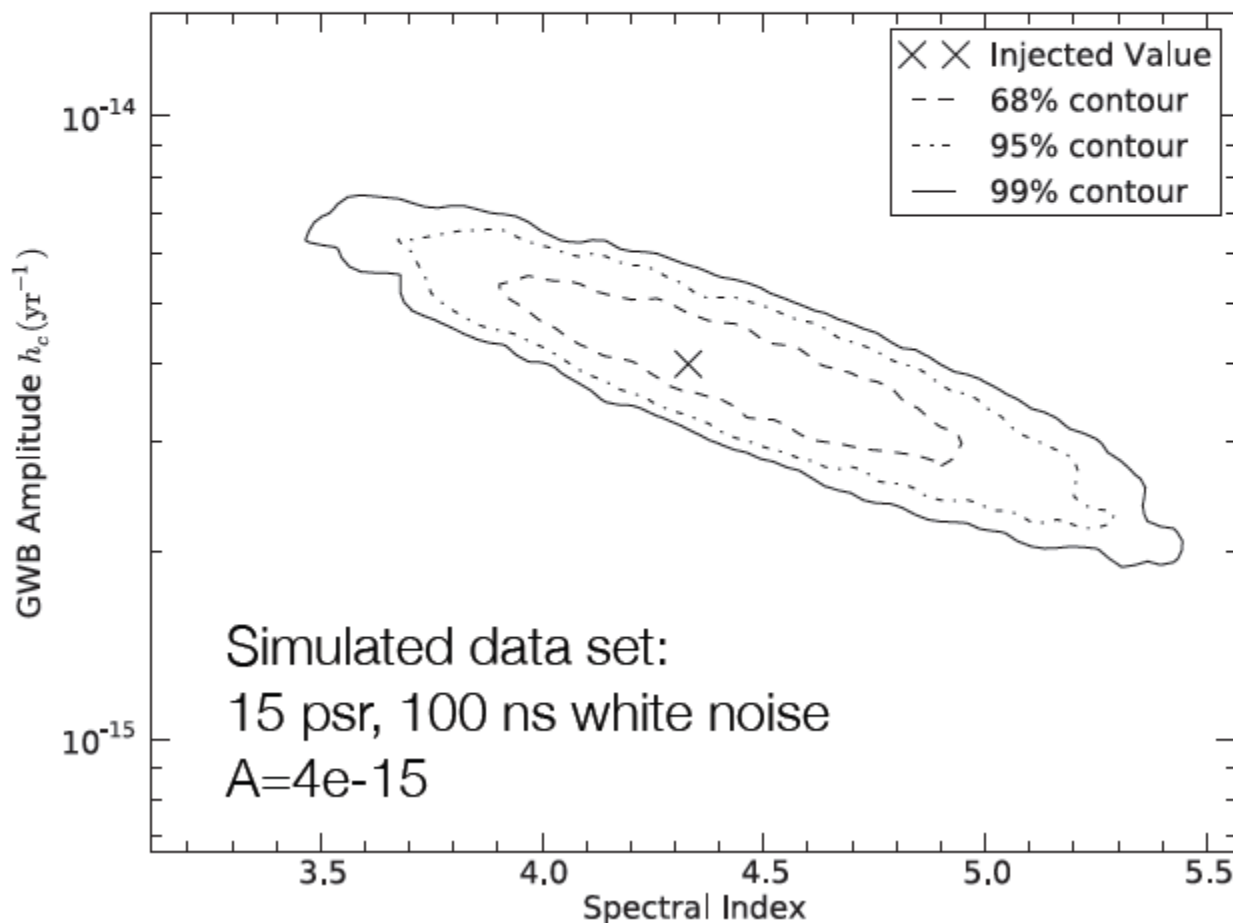
$$\Sigma_r = \langle \mathbf{r}\mathbf{r}^T \rangle = \begin{bmatrix} \mathbf{P}_1 & \mathbf{S}_{12} & \cdots & \mathbf{S}_{1l} \\ \mathbf{S}_{21} & \mathbf{P}_2 & \cdots & \mathbf{S}_{2l} \\ \vdots & \vdots & \ddots & \vdots \\ \mathbf{S}_{l1} & \mathbf{S}_{l2} & \cdots & \mathbf{P}_l \end{bmatrix}$$



Computational challenges

$$p(\mathbf{r}|\vec{\theta}) = \frac{1}{\sqrt{\det 2\pi\Sigma(\vec{\theta})}} \exp\left(-\frac{1}{2}\mathbf{r}^T \Sigma^{-1}(\vec{\theta})\mathbf{r}\right)$$

$\vec{\theta} = (\text{GWB Amplitude, Spectral Index})$



First Bayesian analysis
In time domain.
(van Haasteren 2011)

Big Matrices
(30k x 30k inversions)

Current Bayesian
analysis
In Fourier domain.
(Lentati 2013)

Much smaller matrices
Much faster

Computational challenges



Dimensionality becoming an issue:

- Up to 100 parameters for a single pulsar

- Total can reach many hundreds or thousands

Most parameters are white noise related (scaling and quadrature terms):

- Not very covariant with low frequency noise

- Fix based on single pulsar analysis

- Can reduce parameter space to 50-100

- Use standard MCMC/MultiNest

- But not ideal

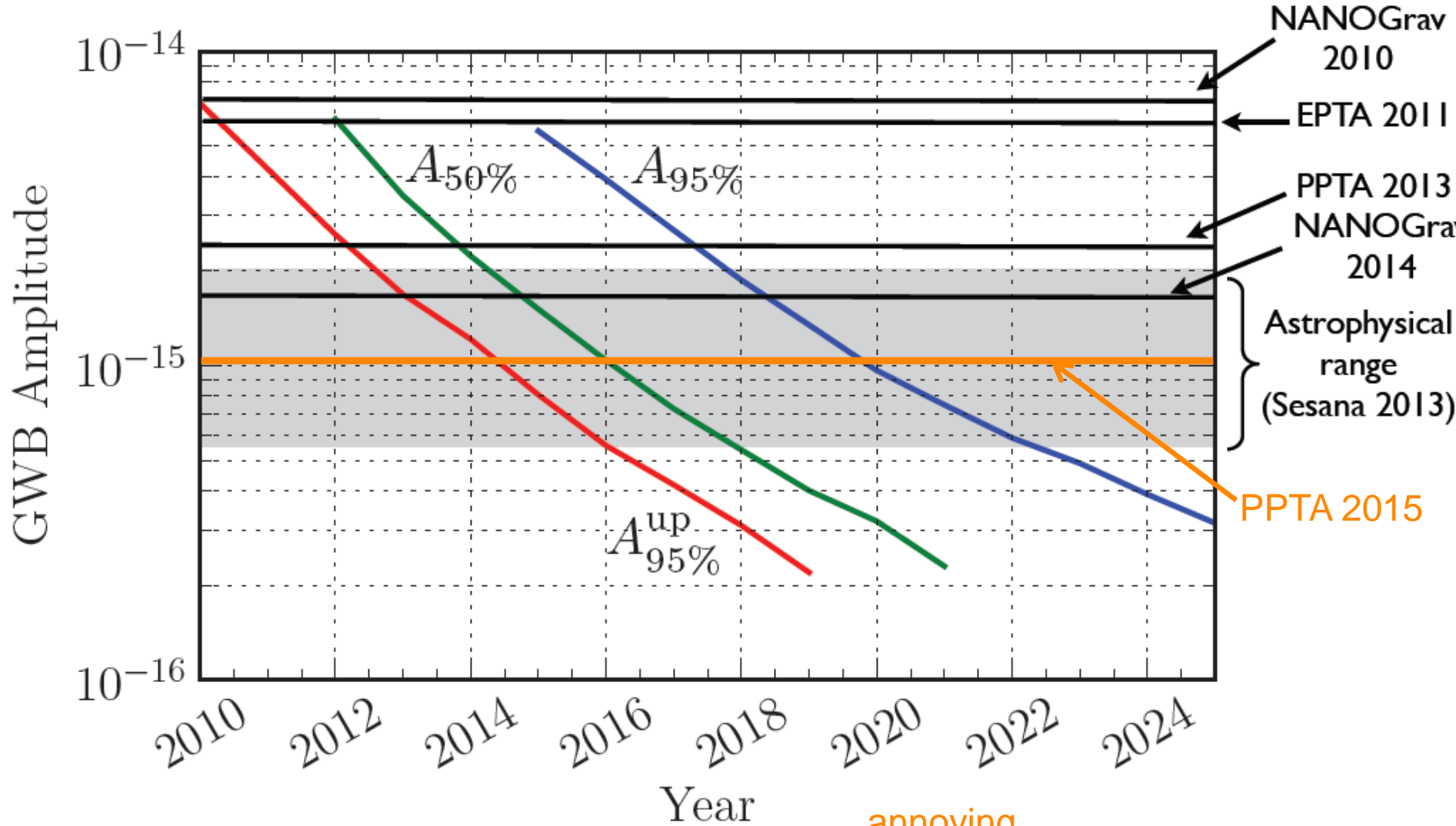
Options – Different Samplers for large dimensional problems

- Gibbs Sampling (van Haasteren et al 2014)

- Hamiltonian Sampling (Lentati et al 2013)

Still in general a problem

Astrophysical problems



We are already in astrophysically ~~interesting~~ **annoying** territory!!

Astrophysical problems



Ruling out large fractions of published models:

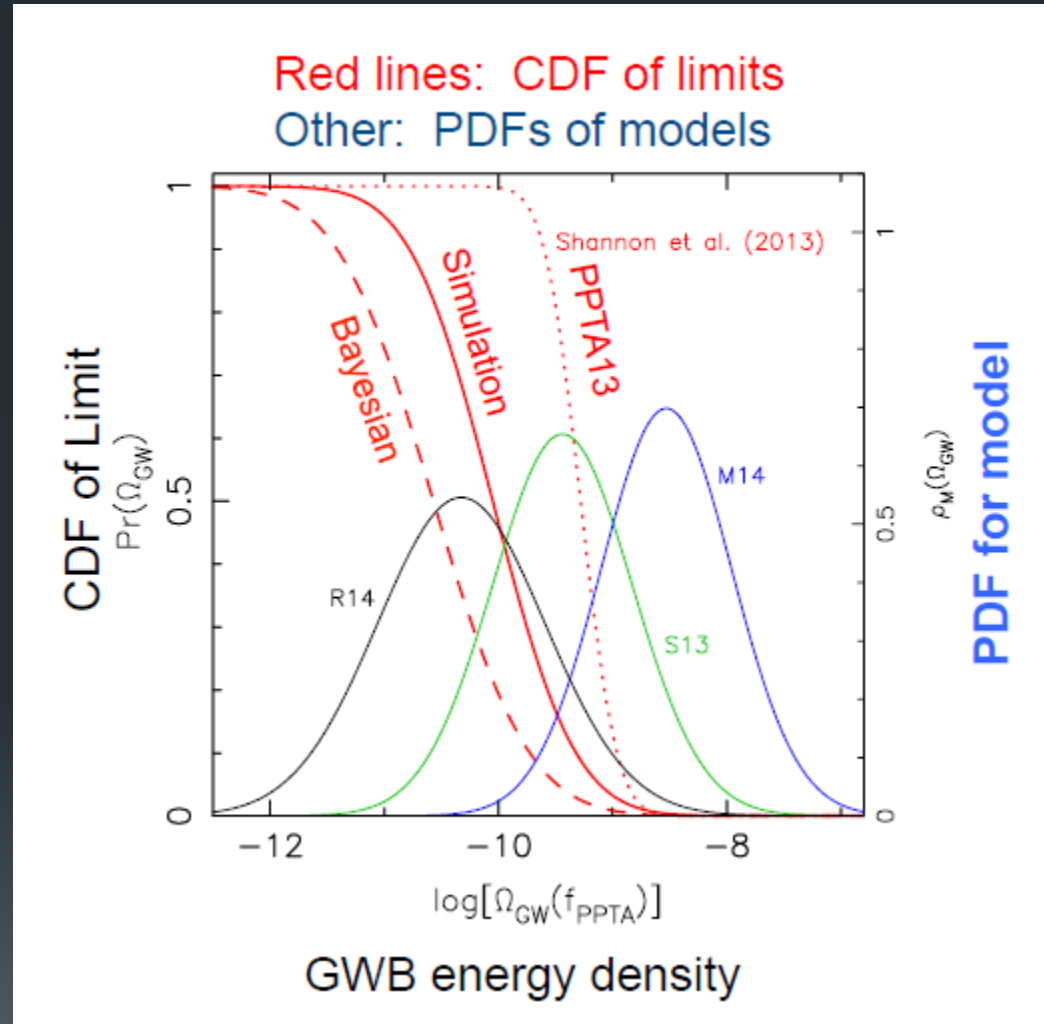
- (M14) McWilliams 2014
- (S13) Sesana 2013
- (R14) Ravi 2014

Significant implications for Cosmology:

Mergers less frequent?

Energy lost through environment?

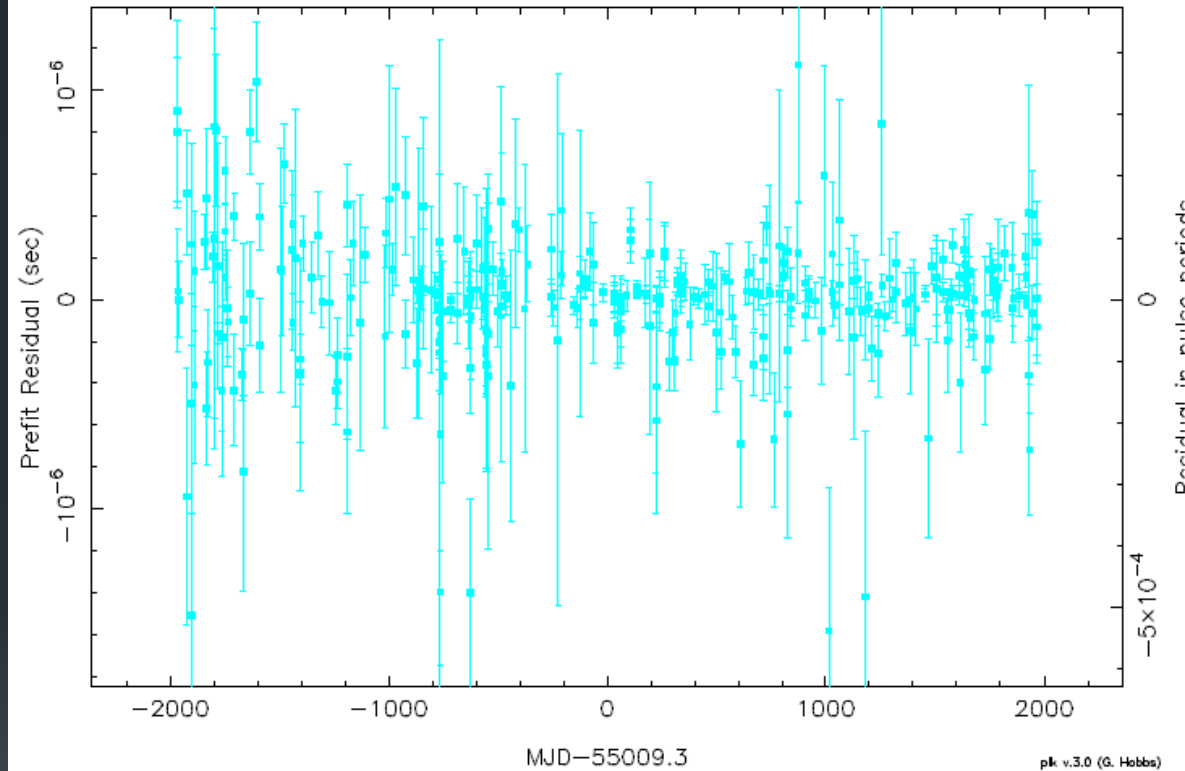
Decreases predicted amplitude compared to GW only evolution.



Astrophysical problems

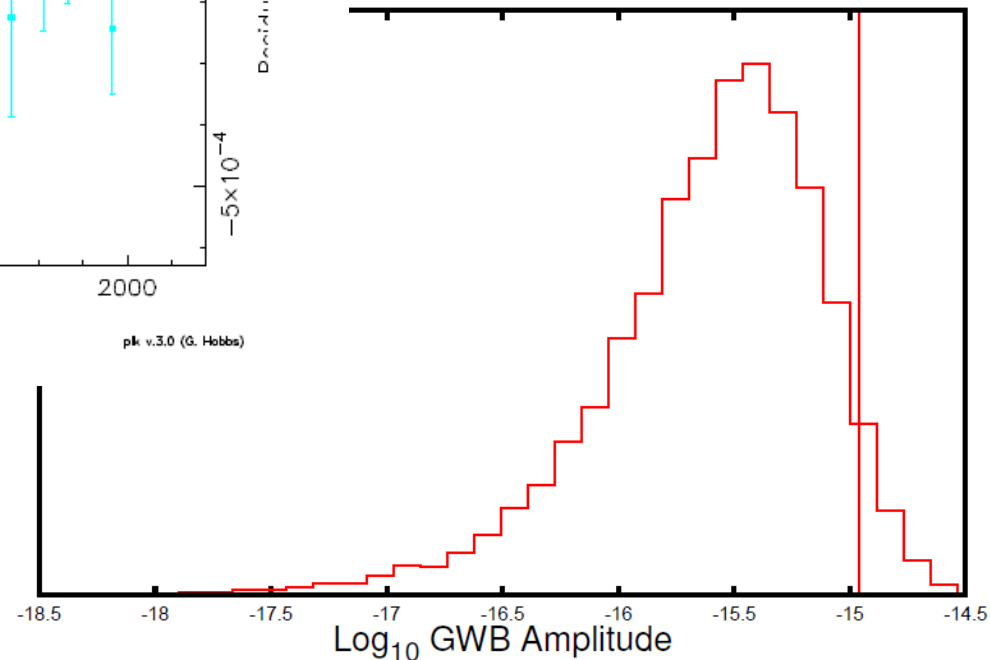


J1909-3744 (Wrms = 0.110 μ s) pre-fit



11 years of data
Very stable pulsar
High frequency (avoids ISM)
100ns rms

No evidence for low frequency noise of any kind!



Summary



Current challenges:

Modelling the pulsars themselves, and the ISM in a reasonable way

Large dimensionality of total problem (hundreds/thousands)

Still fairly large matrices to deal with (few thousand x few thousand)

- Can do algebra on GPUs

Even so:

At the point where we *might* expect to see something..

..but still nothing!

Cheers