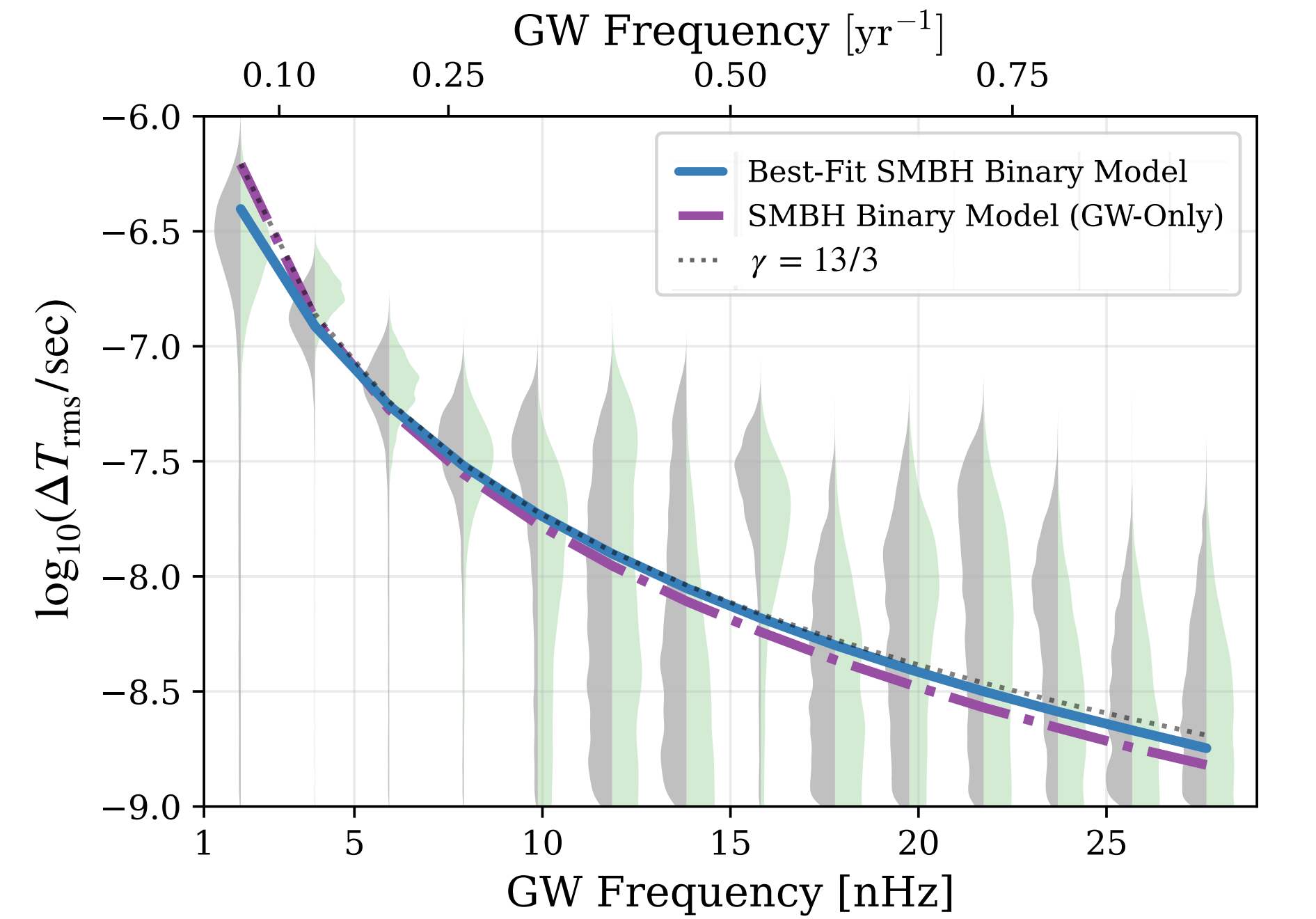
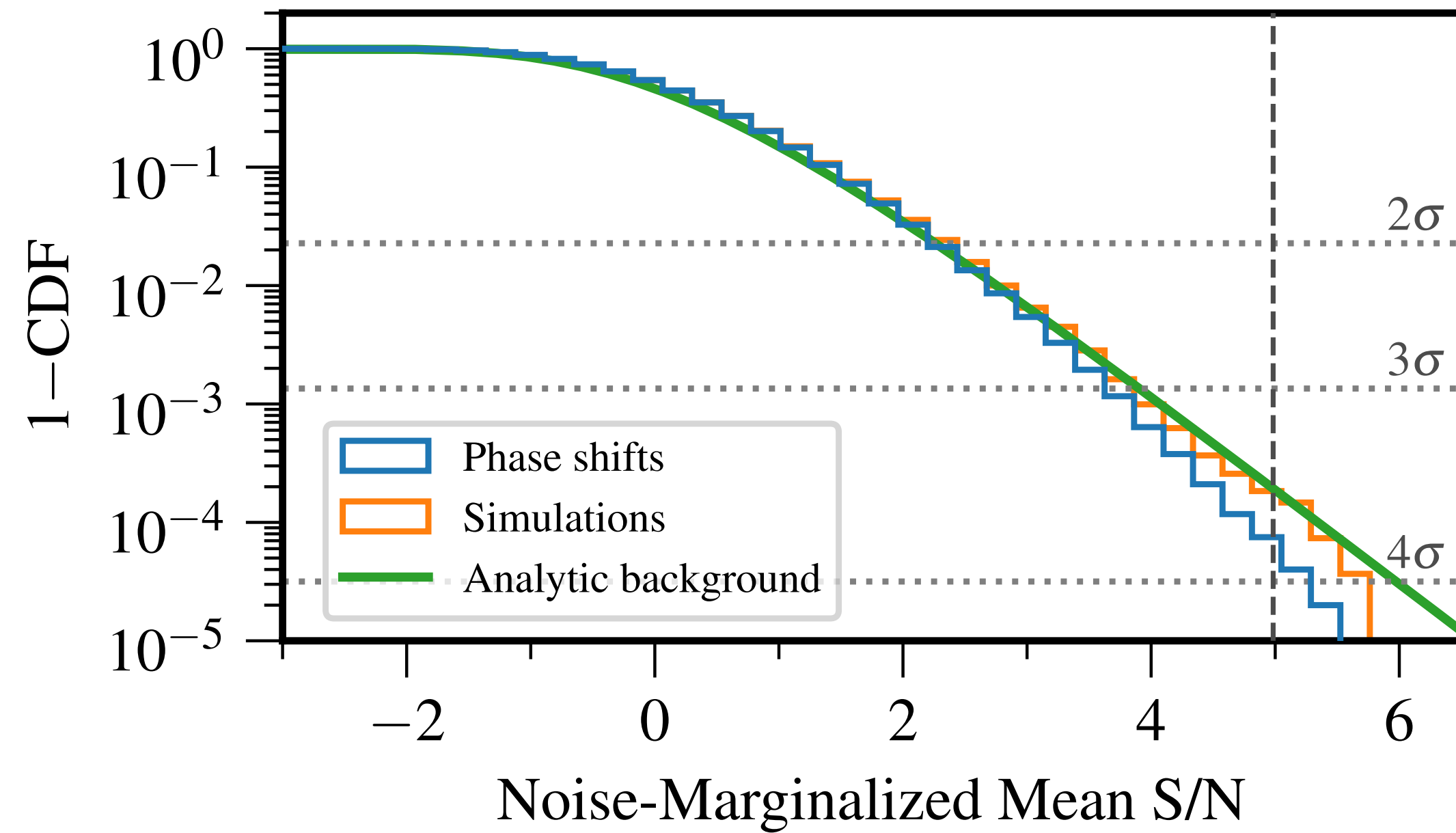
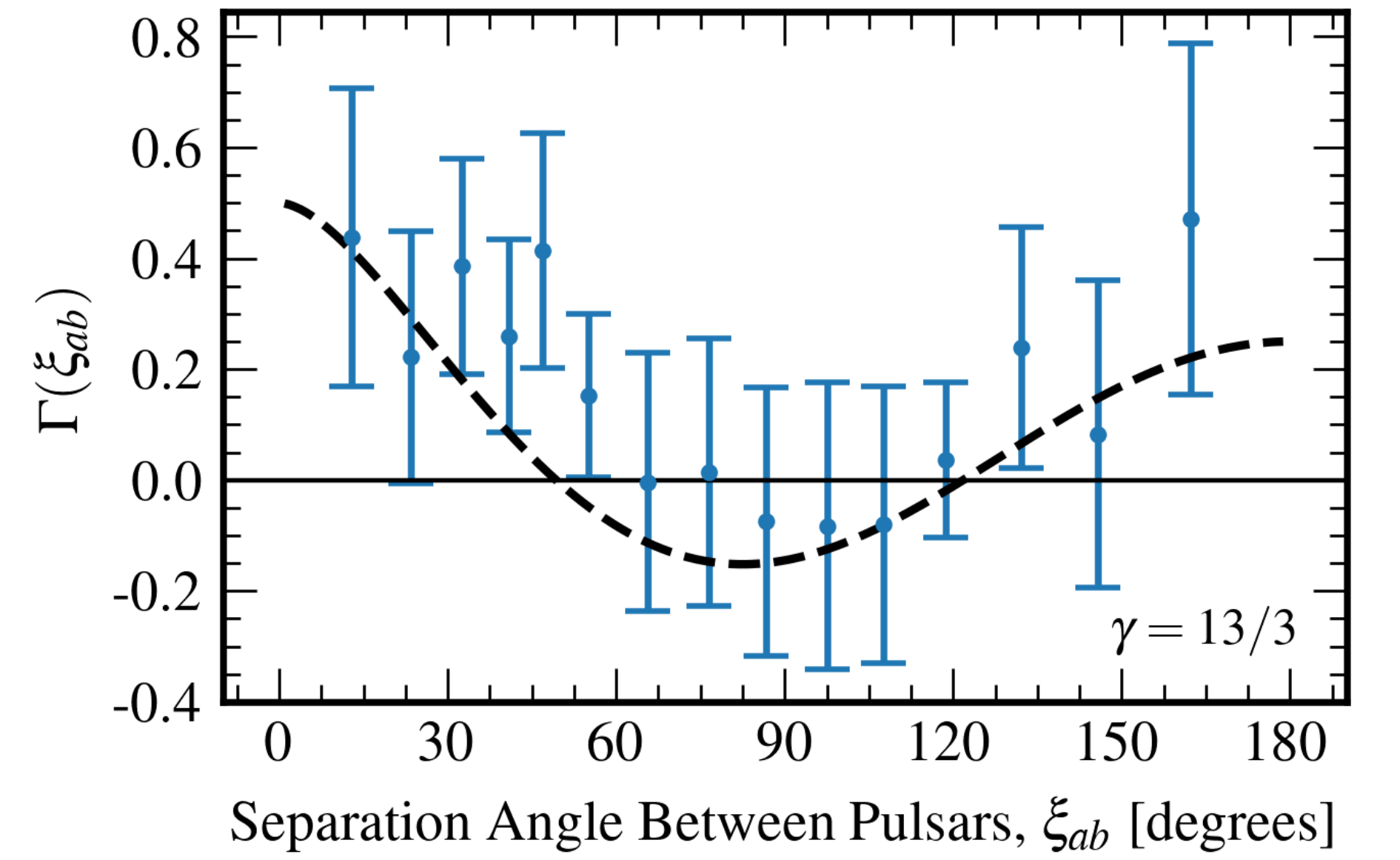
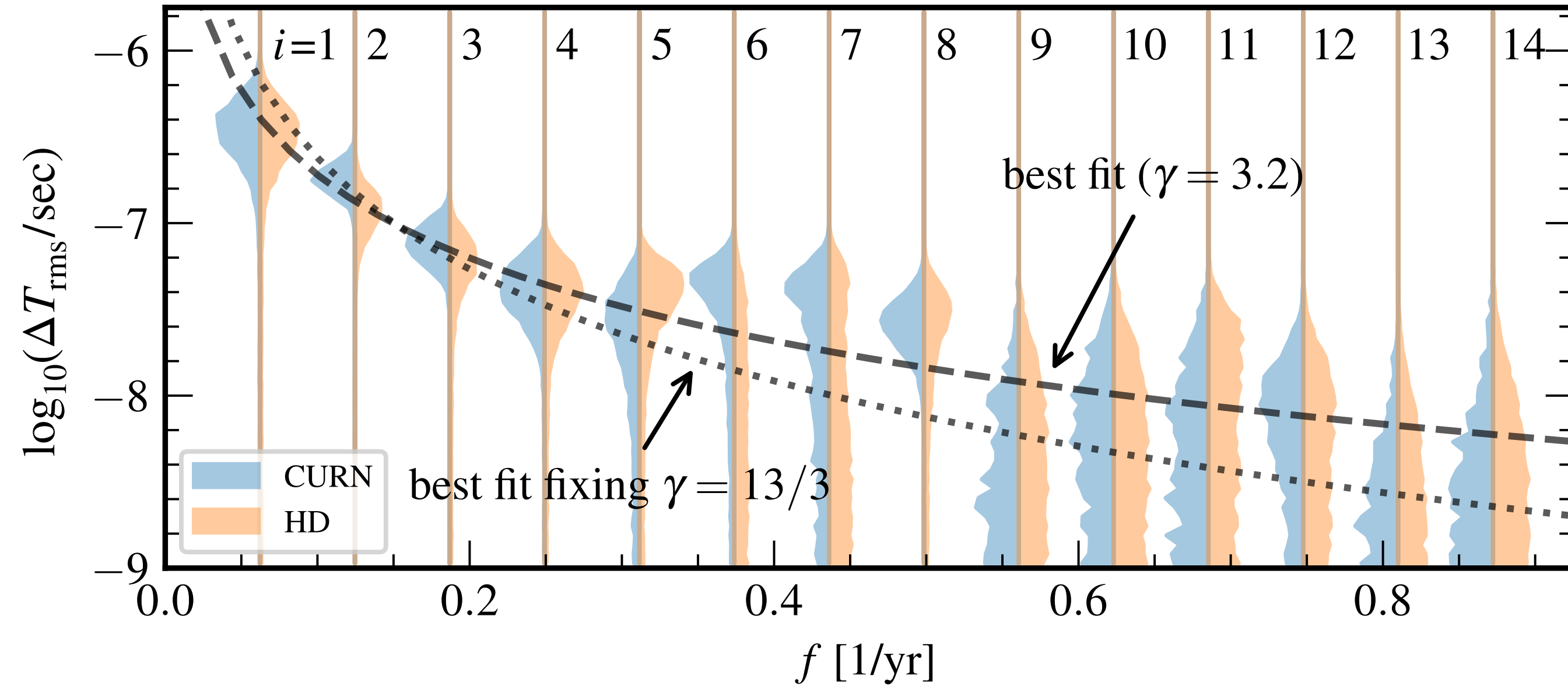


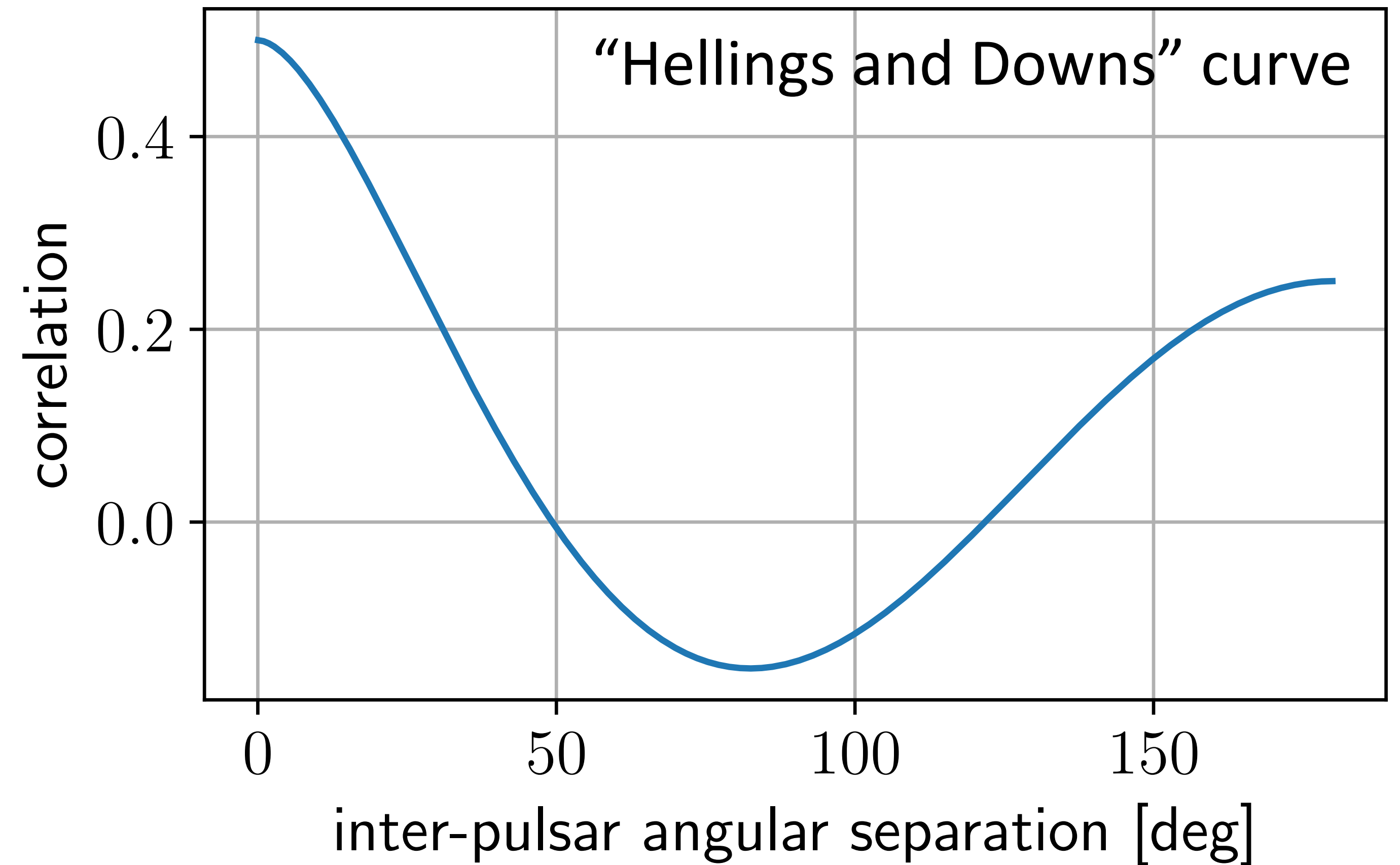
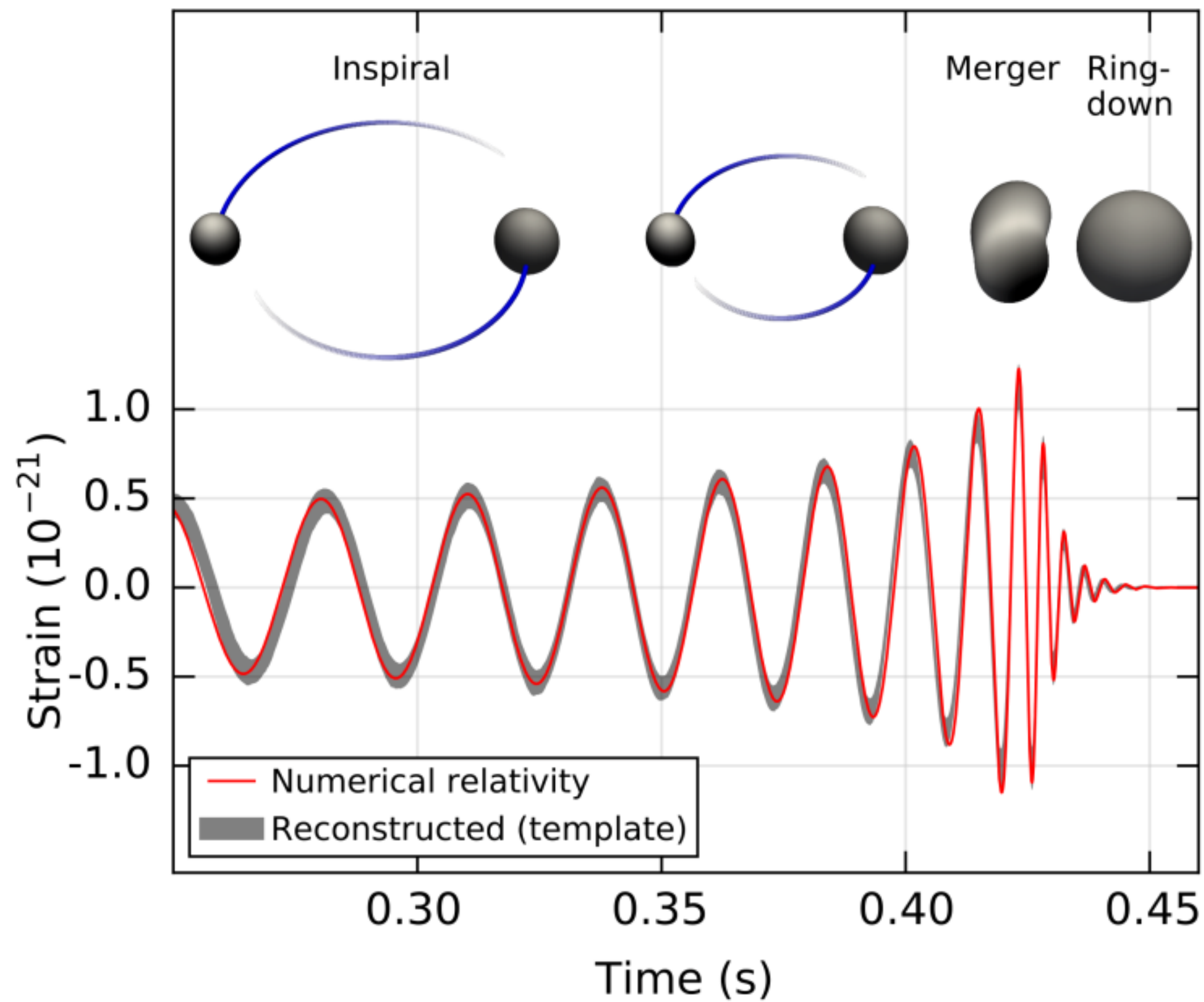
# **Part I. Theory and derivations**





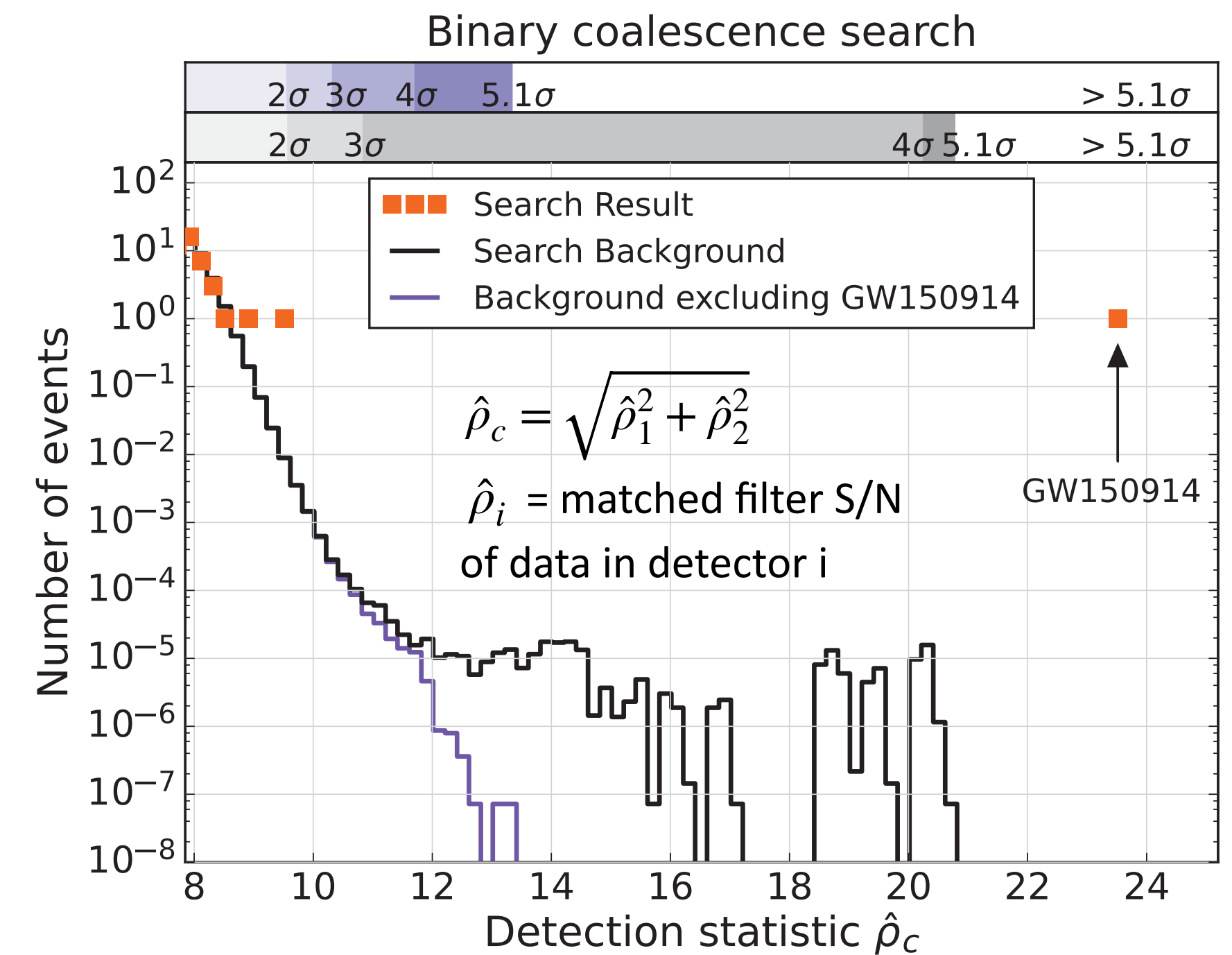
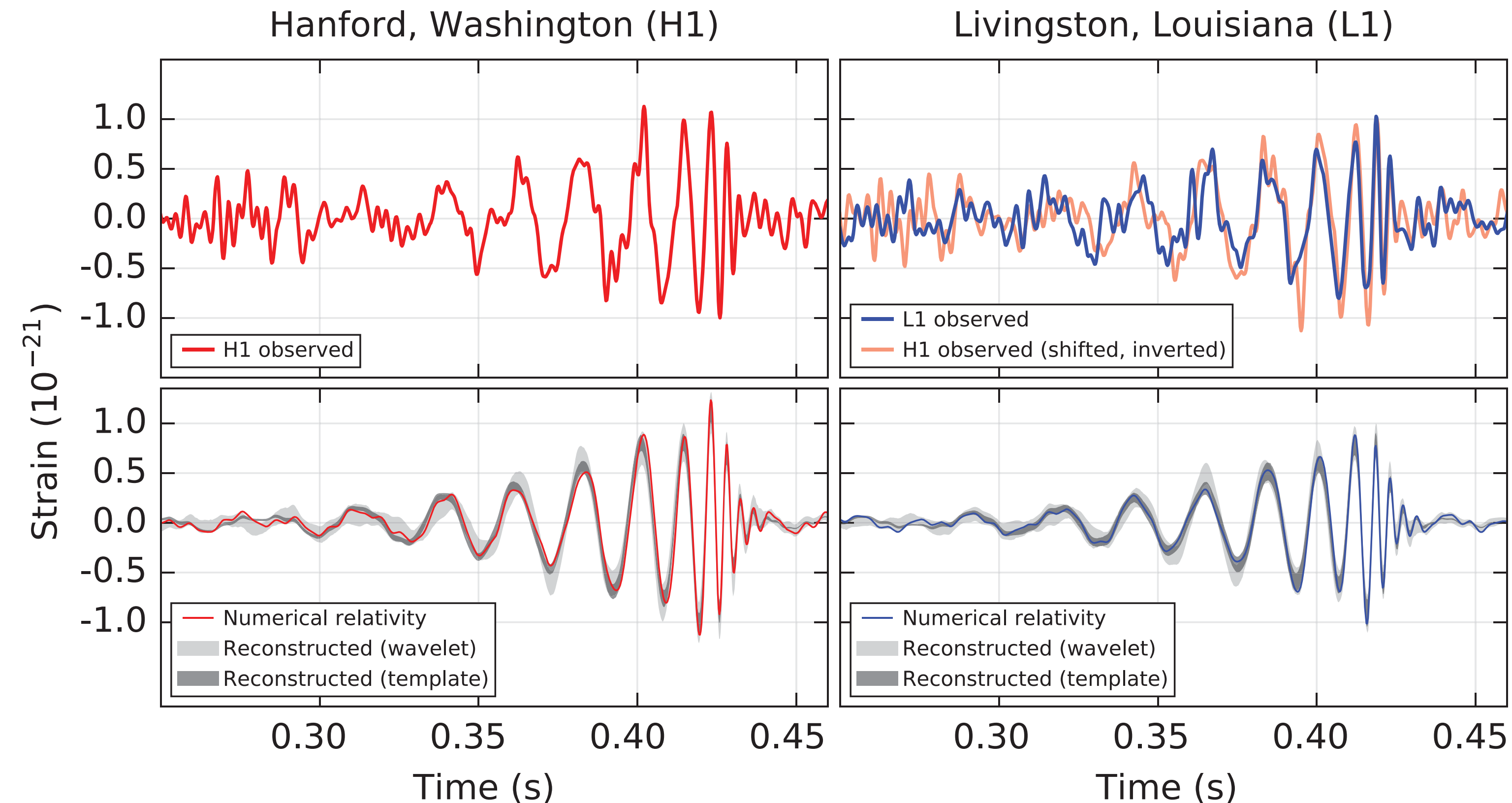
GW150914, etc	PTA observation
deterministic / transient signal	stochastic / persistent signal
waveforms & coincidence	power spectra & cross-correlations
single binary black hole merger	combined signal from a population of approx monochromatic inspiraling binaries
stellar mass black holes (1 - 100 solar masses)	supermassive black holes ( $10^9$ solar masses)
audio frequencies (10's - 1000 Hz)	nanohertz frequencies ( $10^{-9}$ - $10^{-7}$ Hz) [periods: decades -> months]
laser interferometers with km-scale arms	galactic-scale detector using msec pulsars, with “arm” lengths $\sim 100$ - few x 1000 light-years
GW wavelength $\gg$ arm length	GW wavelength $\ll$ arm length
“detection of ...” ( $>5$ sigma)	“evidence for ...” (3-4 sigma)

# What plays the role of a binary “chirp” waveform for PTAs?



# Why was GW150914 so convincing?

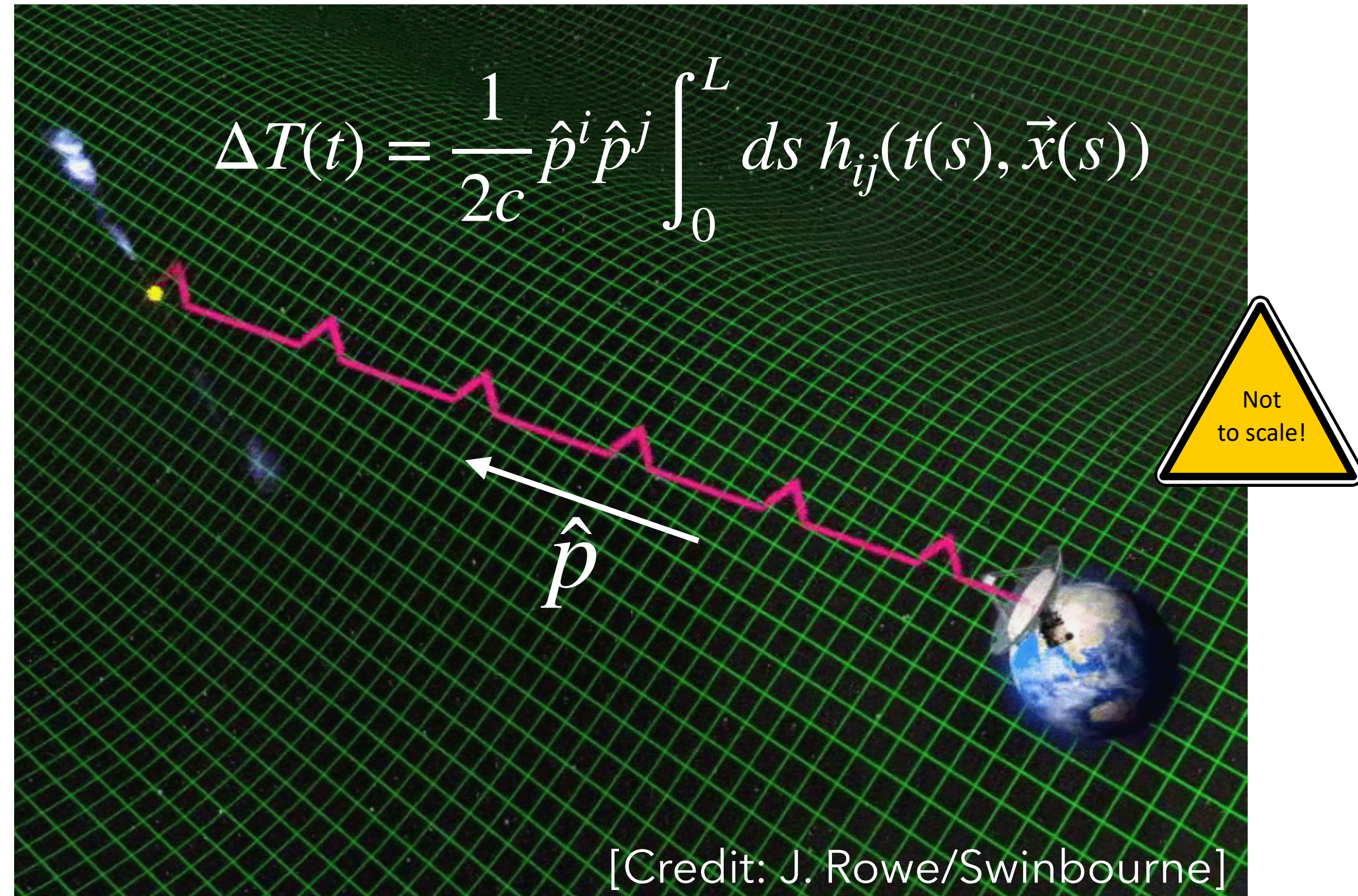
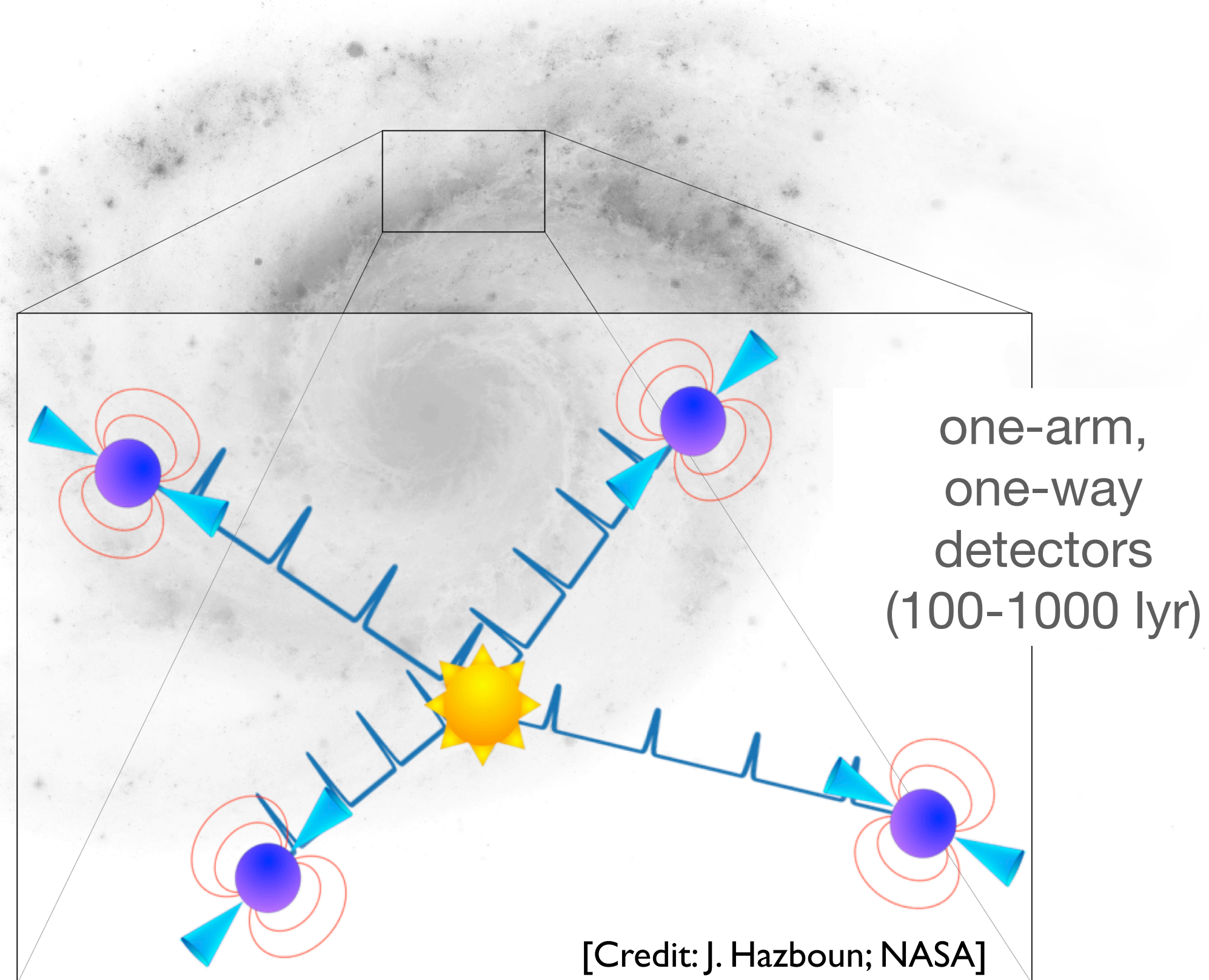
1. observed signal is consistent across detectors
2. observed signal agrees with predictions
3. observed signal is unlikely due to noise alone (< 1/5 million)





# What is a pulsar timing array (PTA)?

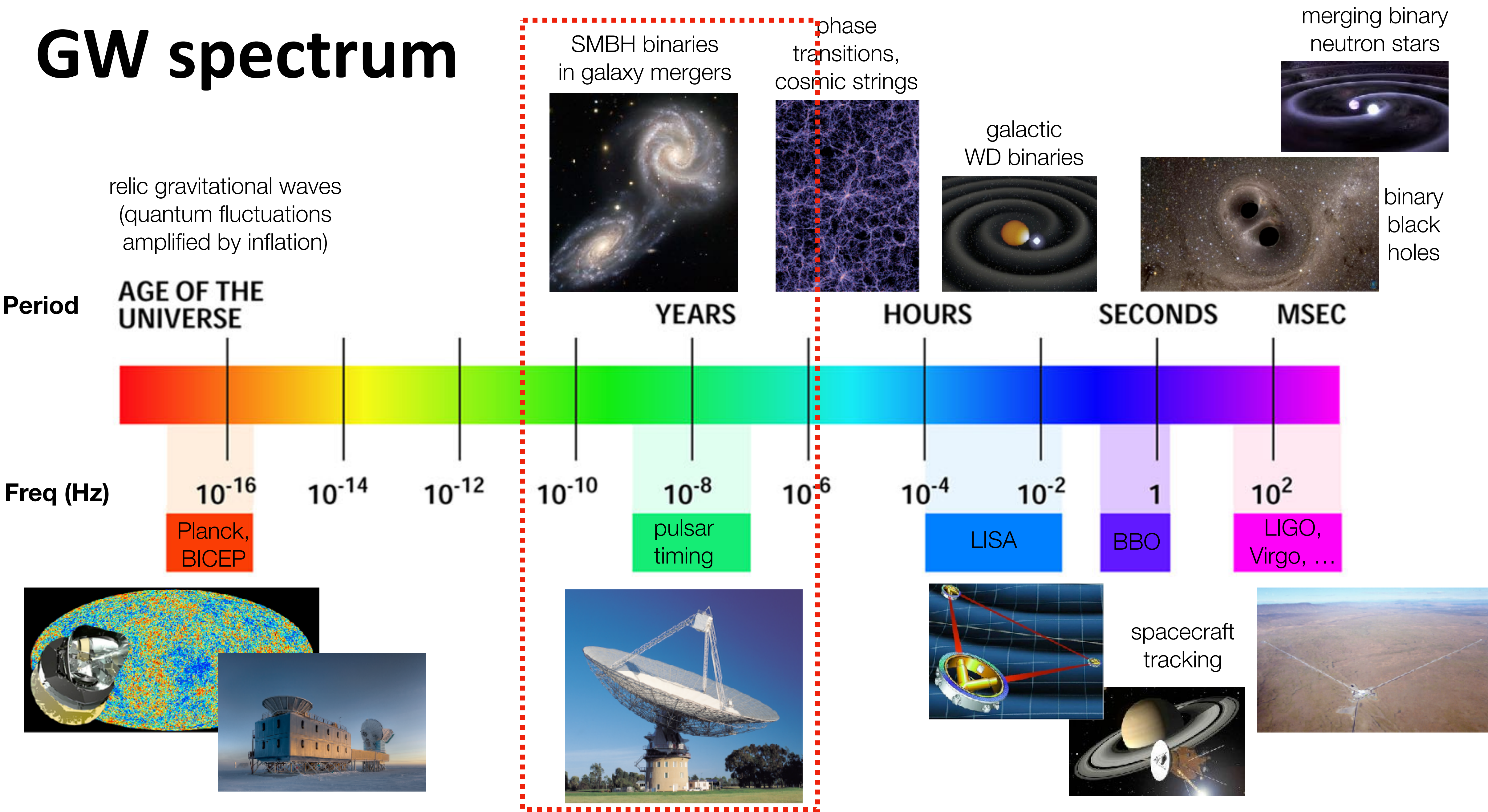
Galactic-scale GW detector



- GWs **perturb pulse arrival times** -> look for evidence of GWs in the **timing residuals**
- GW perturbations will be **correlated across pulsars** -> use this to **differentiate GWB from noise**



# GW spectrum

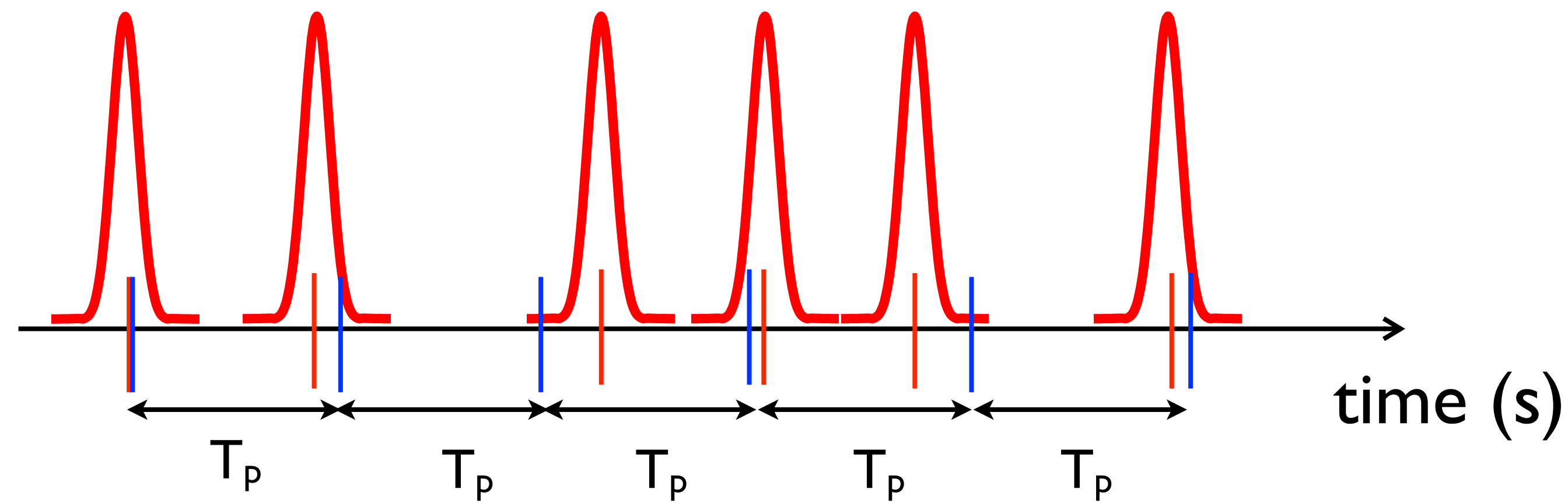




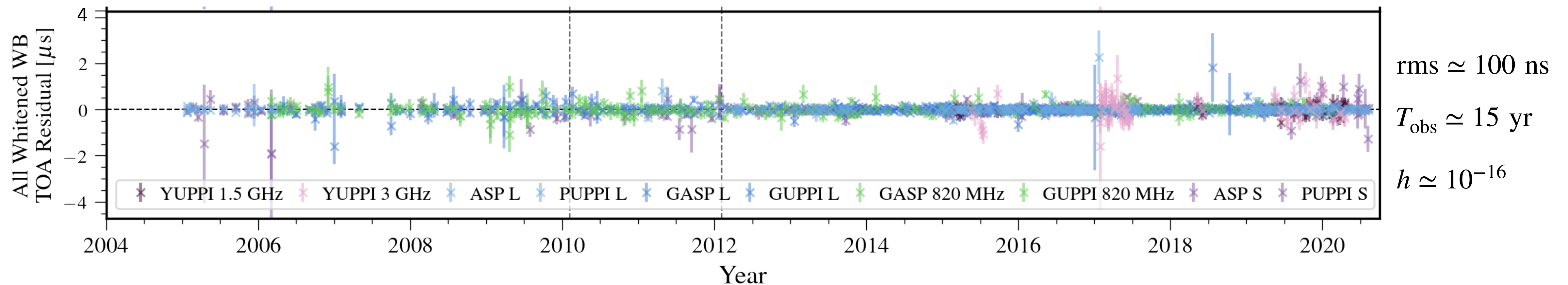
# What are the data for PTA analyses?

timing residual = observed arrival – predicted arrival ← **timing model:** pulsar's spin period, period derivative, sky location, proper motion, ...

= unmodeled deterministic processes + noise sources + GW signals



PSR J1713+0747



# How do GWs affect timing residuals?

- Perturbations to pulse arrival times:

$$\Delta T(t) = \frac{1}{2c} \hat{p}^i \hat{p}^j \int_0^L ds h_{ij}(t(s), \vec{x}(s))$$

$$t(s) = t - (L - s)/c, \quad \vec{x}(s) = (L - s)\hat{p}$$

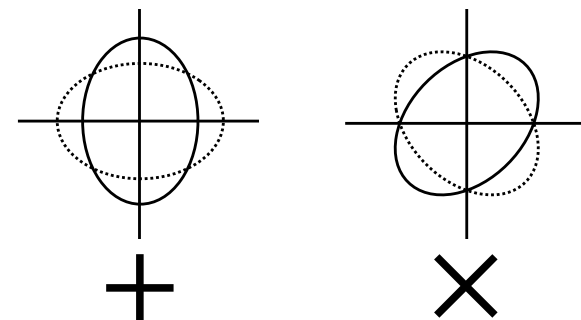
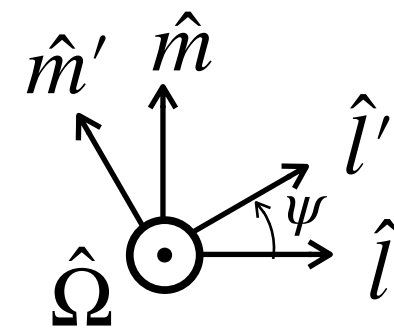
- Doppler shift (“redshift/blueshift”) of pulse frequency :

$$Z(t) \equiv \frac{d\Delta T(t)}{dt} = \frac{1}{2} \frac{\hat{p}^i \hat{p}^j}{1 + \hat{\Omega} \cdot \hat{p}} \left[ h_{ij}(t, \vec{0}) - h_{ij}(t - L/c, L\hat{p}) \right]$$

- In terms of polarizations  $A = +, \times$  :

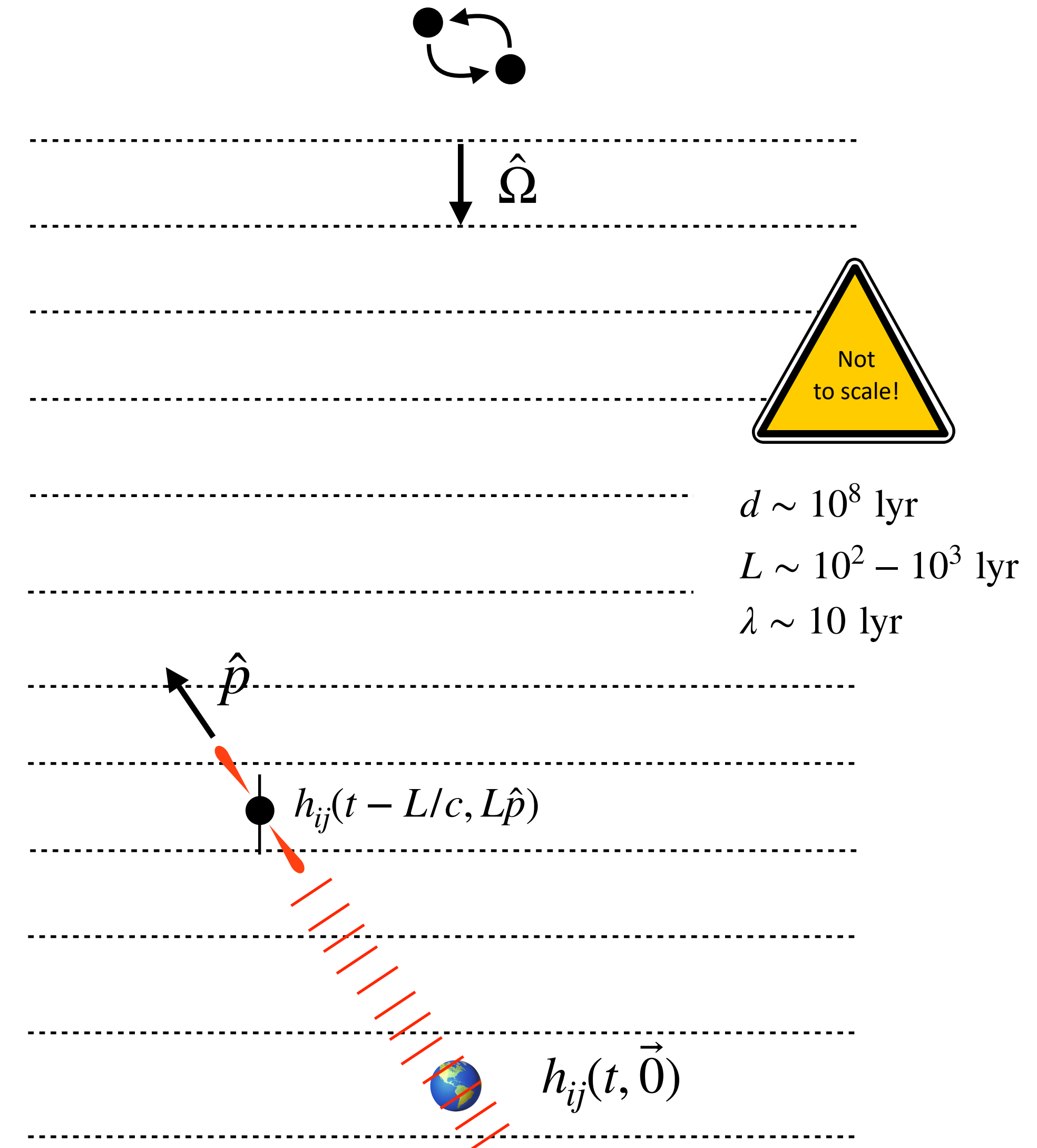
$$e_{ij}^+(\hat{\Omega}) = \hat{l}_i \hat{l}_j - \hat{m}_i \hat{m}_j$$

$$e_{ij}^\times(\hat{\Omega}) = \hat{l}_i \hat{m}_j + \hat{m}_i \hat{l}_j$$



$$Z(t) = \sum_{A=+, \times} \left[ h^A(t) - h^A(t - L(1 + \hat{\Omega} \cdot \hat{p})/c) \right] F^A(\hat{\Omega})$$

$$F^A(\hat{\Omega}) = \frac{1}{2} \frac{\hat{p}^i \hat{p}^j}{1 + \hat{\Omega} \cdot \hat{p}} e_{ij}^A(\hat{\Omega}) \quad (\text{antenna pattern})$$



**Can we detect GWs using data from a single pulsar?**



# Need to correlate data from multiple pulsars

- For expected correlations, can restrict to Earth-term contributions:

$$h_{ij}(t, \vec{0}) = h^+(t) e_{ij}^+(\hat{\Omega}) + h^\times(t) e_{ij}^\times(\hat{\Omega})$$

$$Z_a(t) = h^+(t) F_a^+(\hat{\Omega}) + h^\times(t) F_a^\times(\hat{\Omega}) \quad Z_b(t) = h^+(t) F_b^+(\hat{\Omega}) + h^\times(t) F_b^\times(\hat{\Omega})$$

$$F_a^A(\hat{\Omega}) = \frac{1}{2} \frac{\hat{p}_a^i \hat{p}_a^j}{1 + \hat{\Omega} \cdot \hat{p}_a} e_{ij}^A(\hat{\Omega}) \quad F_b^A(\hat{\Omega}) = \frac{1}{2} \frac{\hat{p}_b^i \hat{p}_b^j}{1 + \hat{\Omega} \cdot \hat{p}_b} e_{ij}^A(\hat{\Omega})$$

- Correlation is time-averaged product:

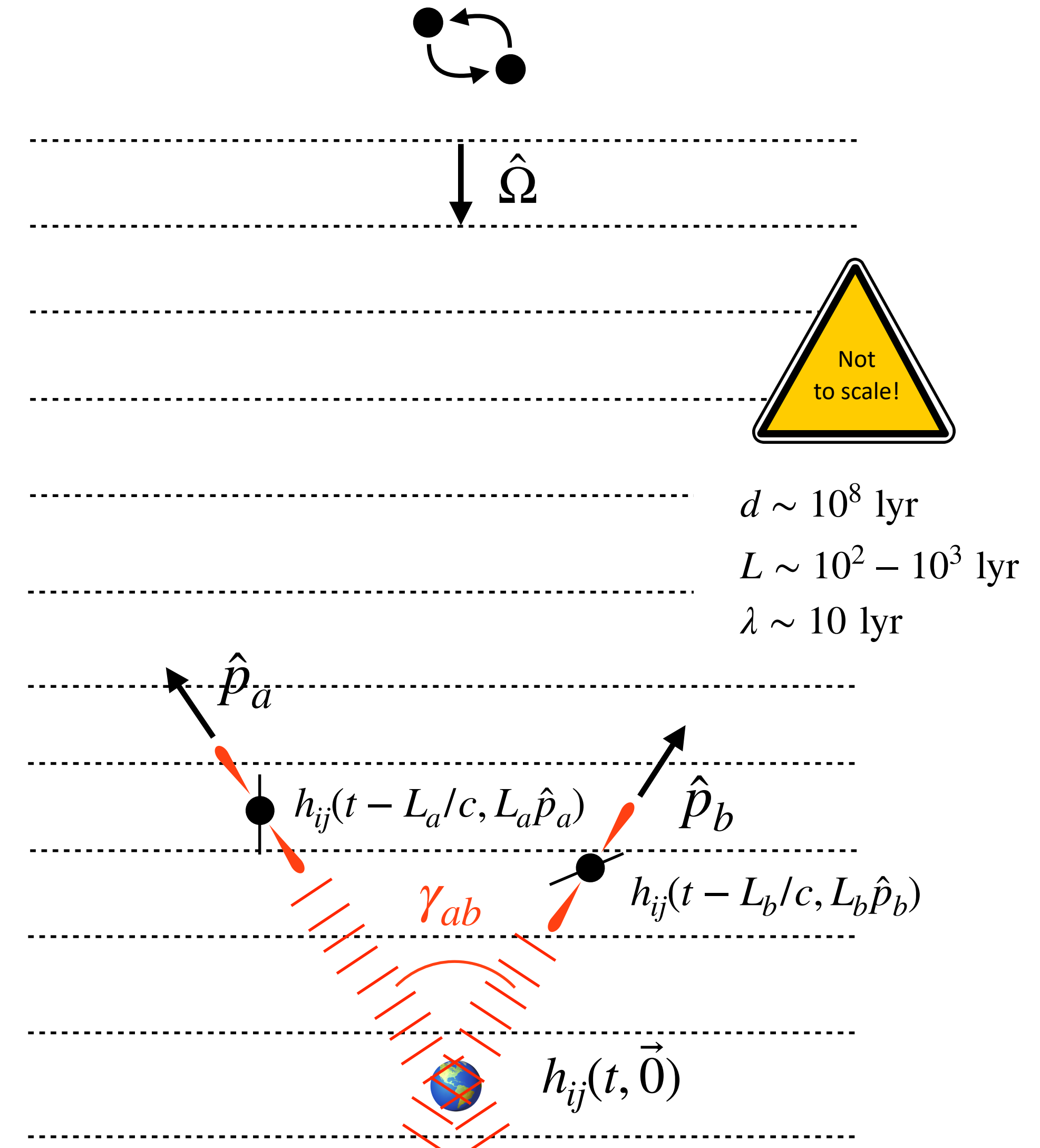
$$\begin{aligned} \rho_{ab} &\equiv \overline{Z_a(t) Z_b(t)} \equiv \frac{1}{T} \int_0^T dt Z_a(t) Z_b(t) \\ &= \overline{(h^+)^2} F_a^+(\hat{\Omega}) F_b^+(\hat{\Omega}) + \overline{(h^\times)^2} F_a^\times(\hat{\Omega}) F_b^\times(\hat{\Omega}) + \overline{h^+ h^\times} \left( F_a^+(\hat{\Omega}) F_b^\times(\hat{\Omega}) + F_a^\times(\hat{\Omega}) F_b^+(\hat{\Omega}) \right) \\ &= F_a^+(\hat{\Omega}) F_b^+(\hat{\Omega}) + F_a^\times(\hat{\Omega}) F_b^\times(\hat{\Omega}) \quad (\text{unpolarized, unit amplitude}) \end{aligned}$$

- Hellings & Downs 1983:** fix pulsars; average over the GW source direction and polarization angle

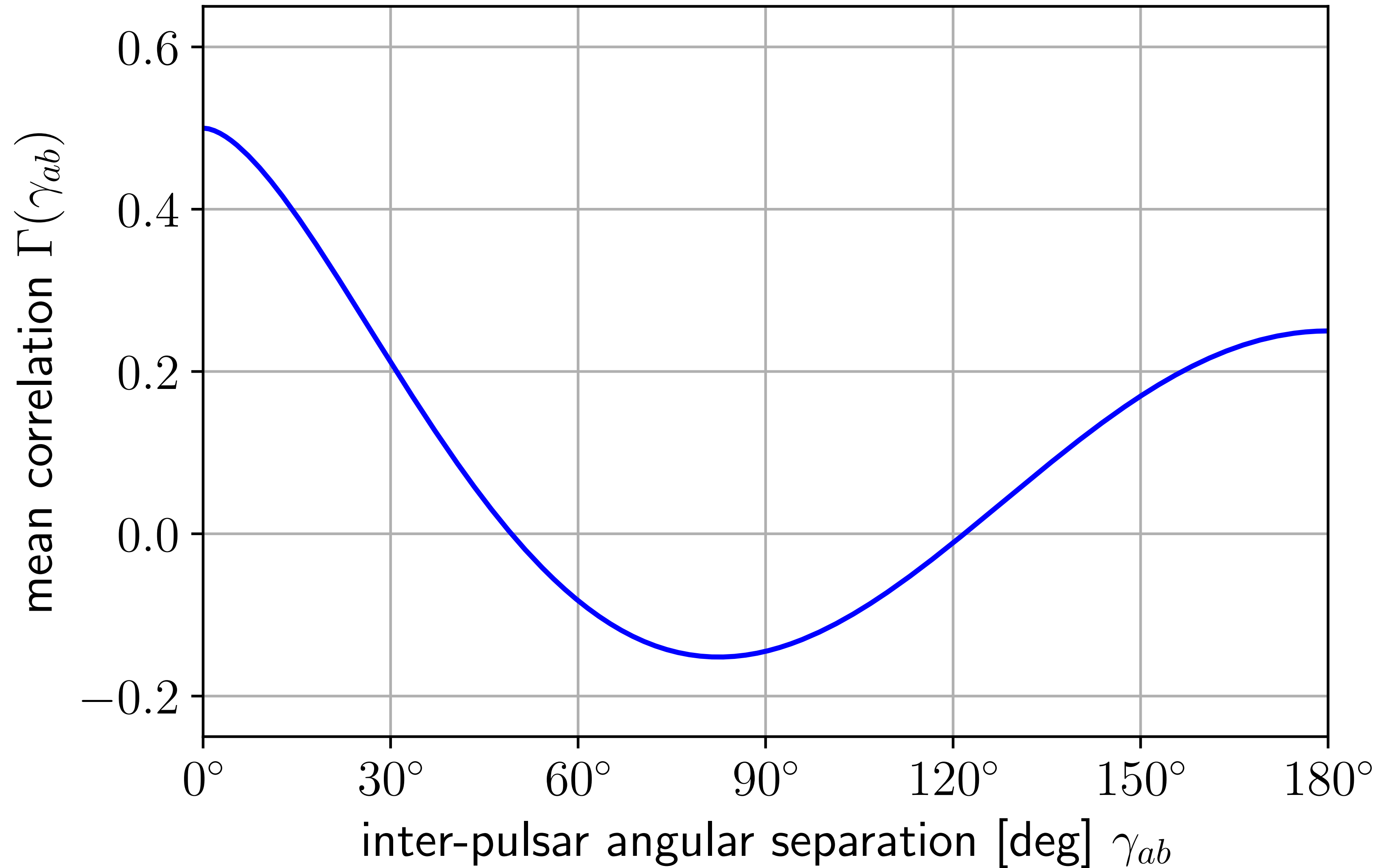
$\equiv$

**Cornish & Sesana 2013:** fix GW point source; average over all pulsar pairs separated by angle  $\gamma_{ab}$

$$\langle \rho_{ab} \rangle_p = \langle \rho_{ab} \rangle_s = \frac{1}{2} - \frac{1}{4} \left( \frac{1 - \cos \gamma_{ab}}{2} \right) + \frac{3}{2} \left( \frac{1 - \cos \gamma_{ab}}{2} \right) \ln \left( \frac{1 - \cos \gamma_{ab}}{2} \right) \equiv \Gamma(\gamma_{ab})$$

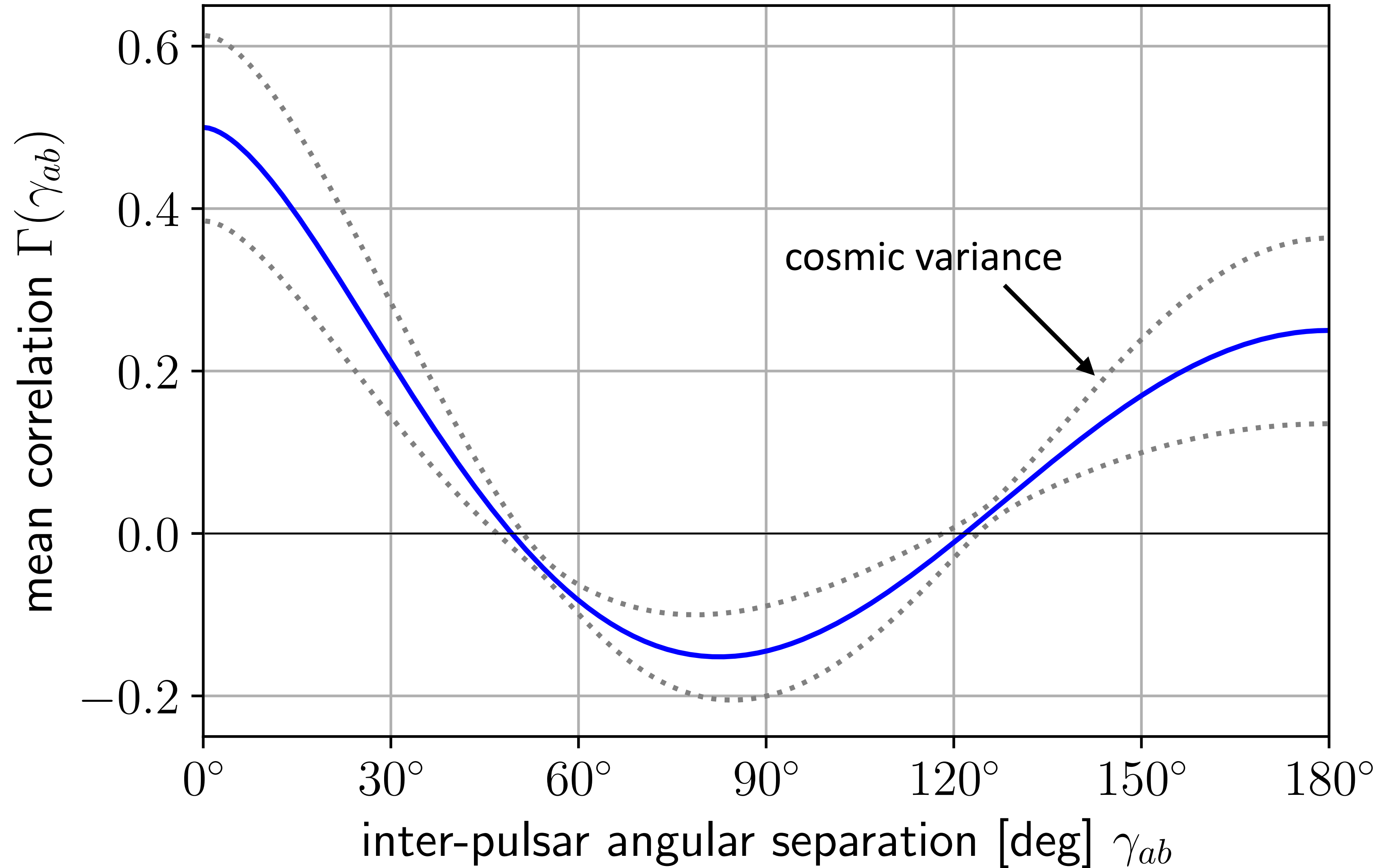


# Hellings and Downs curve



**Should we expect to recover the HD curve exactly?**

# Cosmic variance for interfering sources



# Correlation calculation for interfering sources

- Two sources, **same frequency** (ignore polarization):

$$h_1(t) = A_1 \cos(2\pi f t + \phi_1), \quad h_2(t) = A_2 \cos(2\pi f t + \phi_2)$$

$$Z_a(t) = h_1(t)F_a(\hat{\Omega}_1) + h_2(t)F_a(\hat{\Omega}_2)$$

$$Z_b(t) = h_1(t)F_b(\hat{\Omega}_1) + h_2(t)F_b(\hat{\Omega}_2)$$

- Correlation:

$$\rho_{ab} = \overline{Z_a(t)Z_b(t)}$$

$$= \overline{h_1^2} F_a(\hat{\Omega}_1)F_b(\hat{\Omega}_1) + \overline{h_2^2} F_a(\hat{\Omega}_2)F_b(\hat{\Omega}_2) + \overline{h_1 h_2} \left( F_a(\hat{\Omega}_1)F_b(\hat{\Omega}_2) + F_a(\hat{\Omega}_2)F_b(\hat{\Omega}_1) \right)$$

$$= \frac{1}{2} A_1^2 F_a(\hat{\Omega}_1)F_b(\hat{\Omega}_1) + \frac{1}{2} A_2^2 F_a(\hat{\Omega}_2)F_b(\hat{\Omega}_2) + \frac{1}{2} A_1 A_2 \cos(\phi_1 - \phi_2) \left( F_a(\hat{\Omega}_1)F_b(\hat{\Omega}_2) + F_a(\hat{\Omega}_2)F_b(\hat{\Omega}_1) \right)$$

$$\langle \rho_{ab} \rangle_p = \frac{1}{2} \sum_j A_j^2 \Gamma(\gamma_{ab}) + \frac{1}{2} \sum_{j \neq k} A_j A_k \cos(\phi_j - \phi_k) \mu(\gamma_{ab}, \beta_{jk})$$

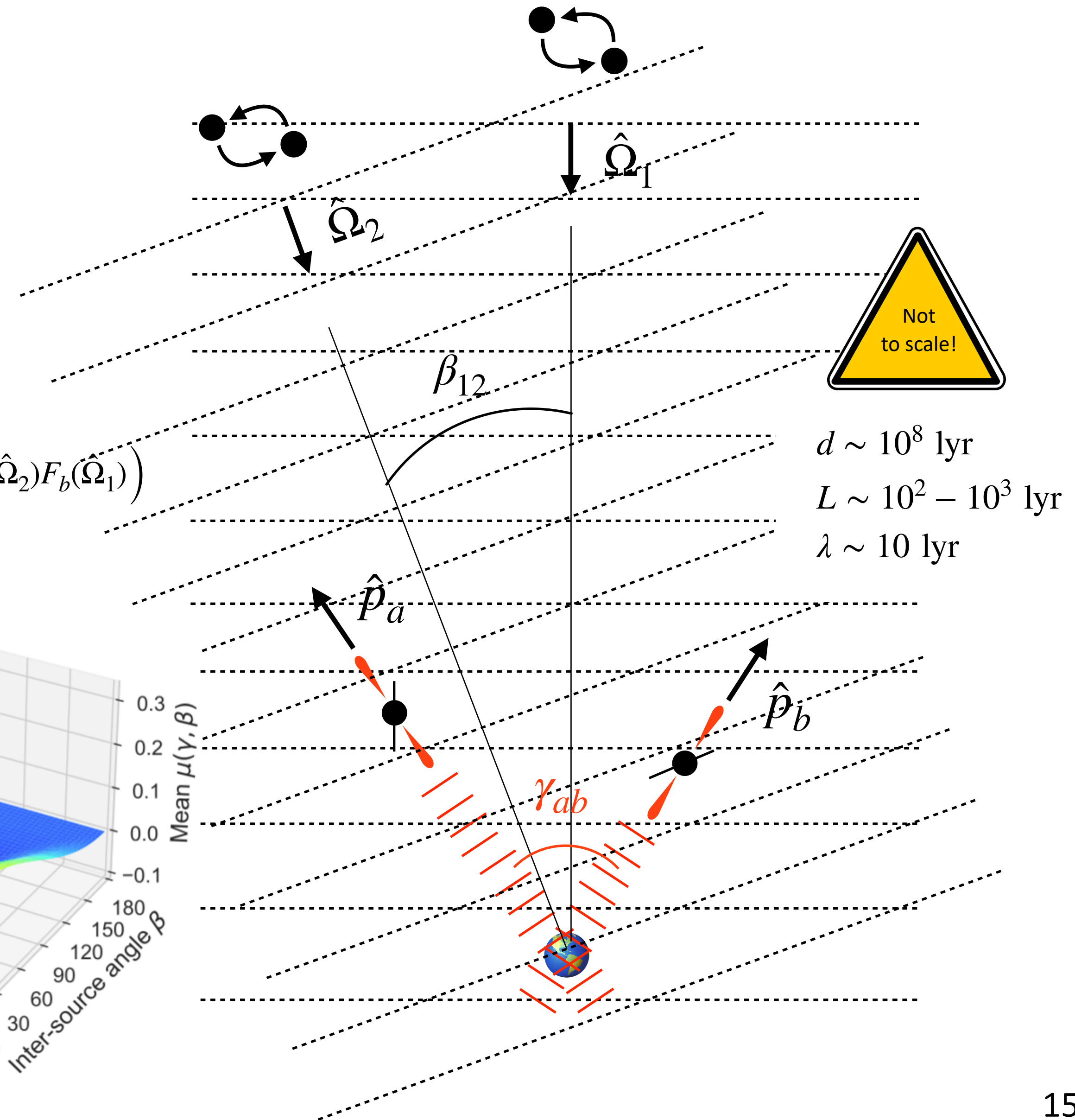
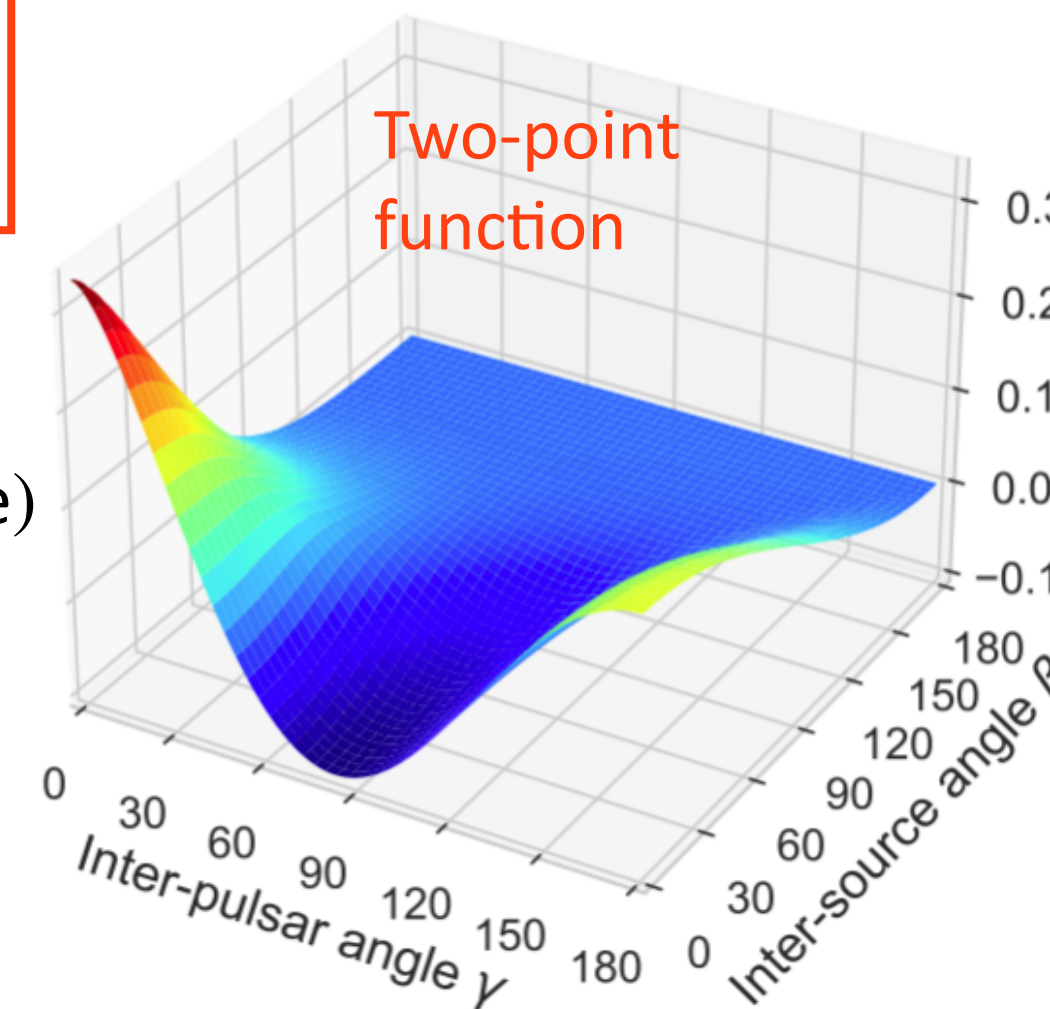
$$\mu(\gamma_{ab}, \beta_{jk}) \equiv \langle F_a^+(\hat{\Omega}_j)F_b^+(\hat{\Omega}_k) + F_a^\times(\hat{\Omega}_j)F_b^\times(\hat{\Omega}_k) \rangle_p$$

- Cosmic variance:

$$\mu_{ab} \equiv \Gamma(\gamma_{ab}) + \frac{1}{N} \sum_{j \neq k} \cos(\phi_j - \phi_k) \mu(\gamma_{ab}, \beta_{jk}) \quad (\text{unit amplitude})$$

$$\langle \mu_{ab} \rangle_s = \Gamma(\gamma_{ab}), \quad \sigma_{\text{cosmic}}^2(\gamma_{ab}) = \langle \mu_{ab}^2 \rangle_s - \langle \mu_{ab} \rangle_s^2$$

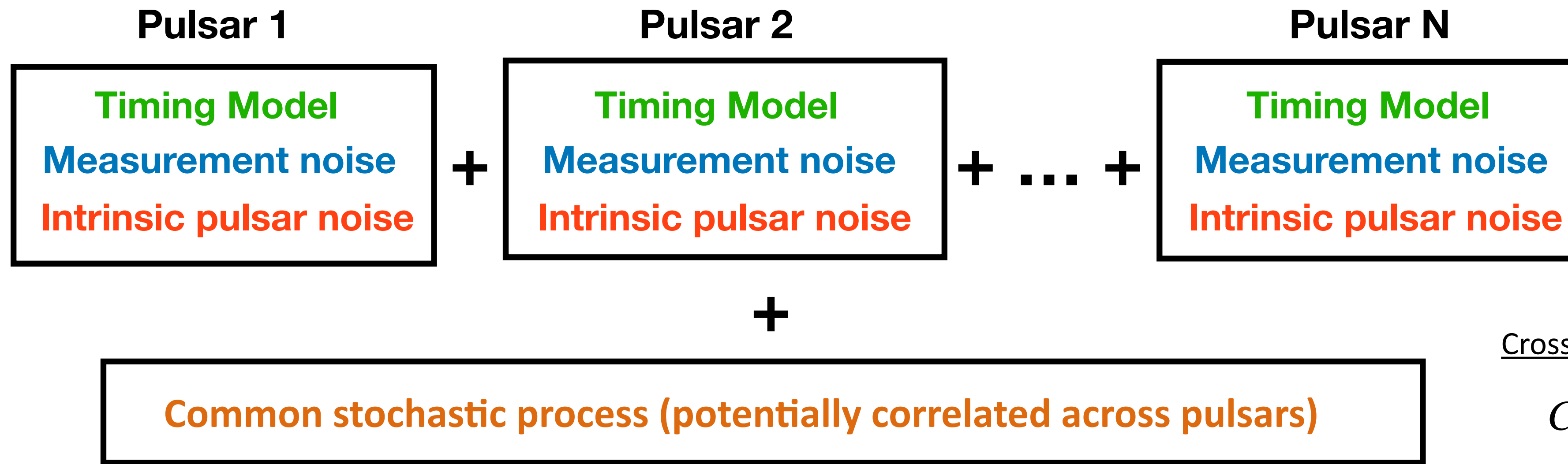
$$\sigma_{\text{cosmic}}^2(\gamma) = \frac{1}{4} \int_0^\pi d\beta \sin \beta \mu^2(\gamma, \beta)$$



**How does one analyze PTA data to search for GWs?**



# Bayesian model comparison

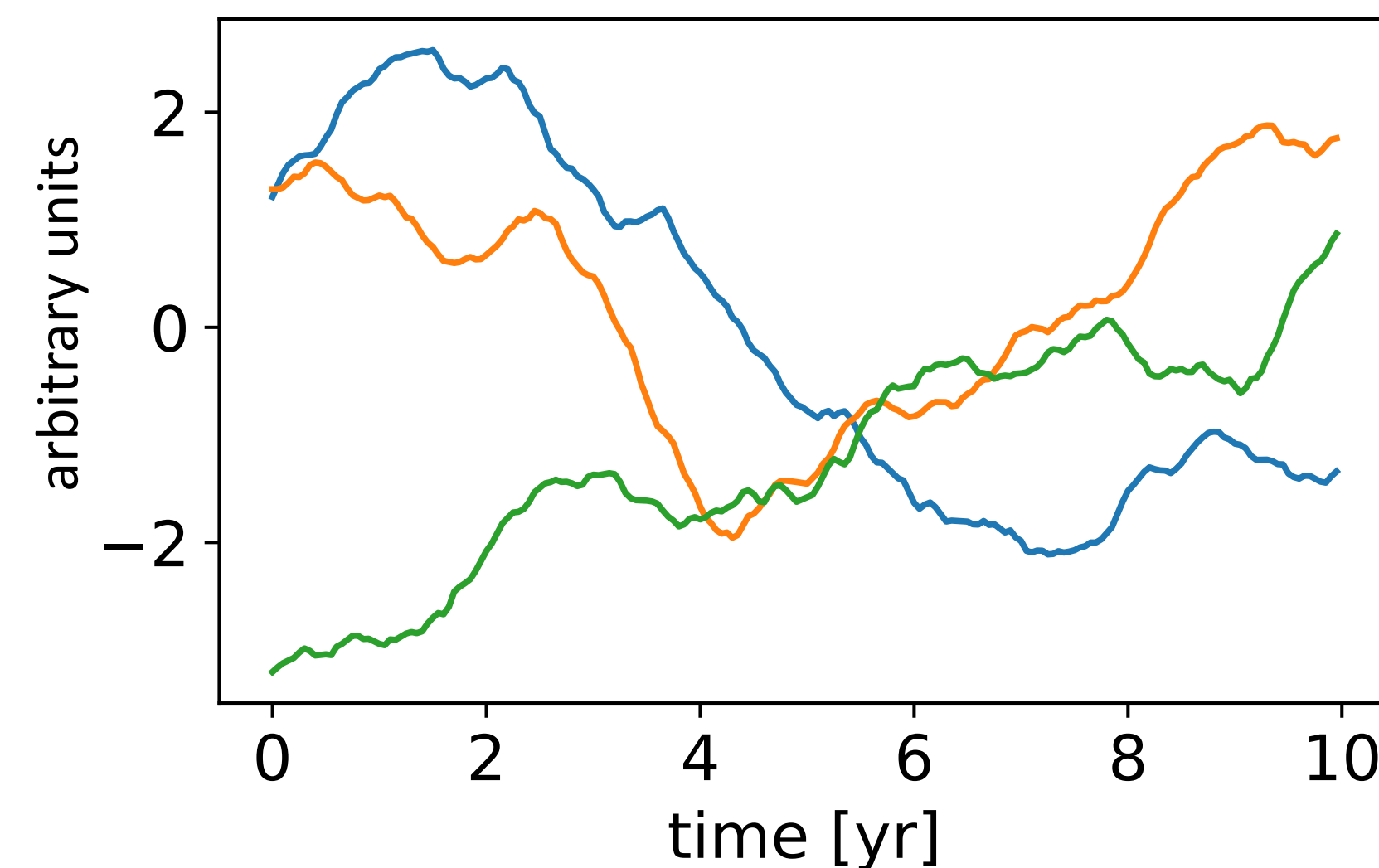


Individual power spectra:

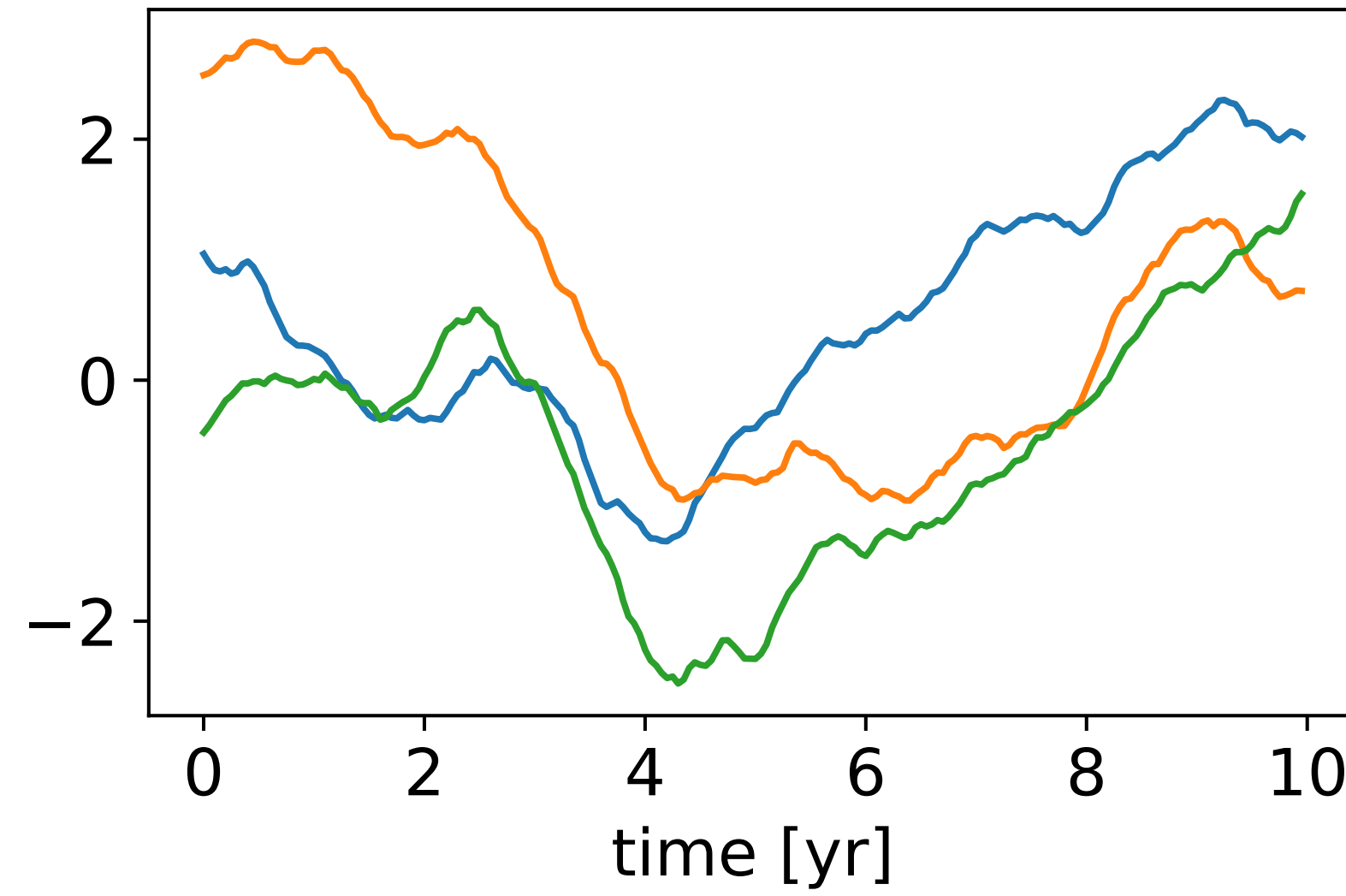
$$\varphi_a(f) = \frac{A_a^2}{12\pi^2} \frac{1}{T_{\text{obs}}} \left( \frac{f}{f_{\text{ref}}} \right)^{-\gamma_a} f_{\text{ref}}^{-3}$$

Cross power: ↙ common process

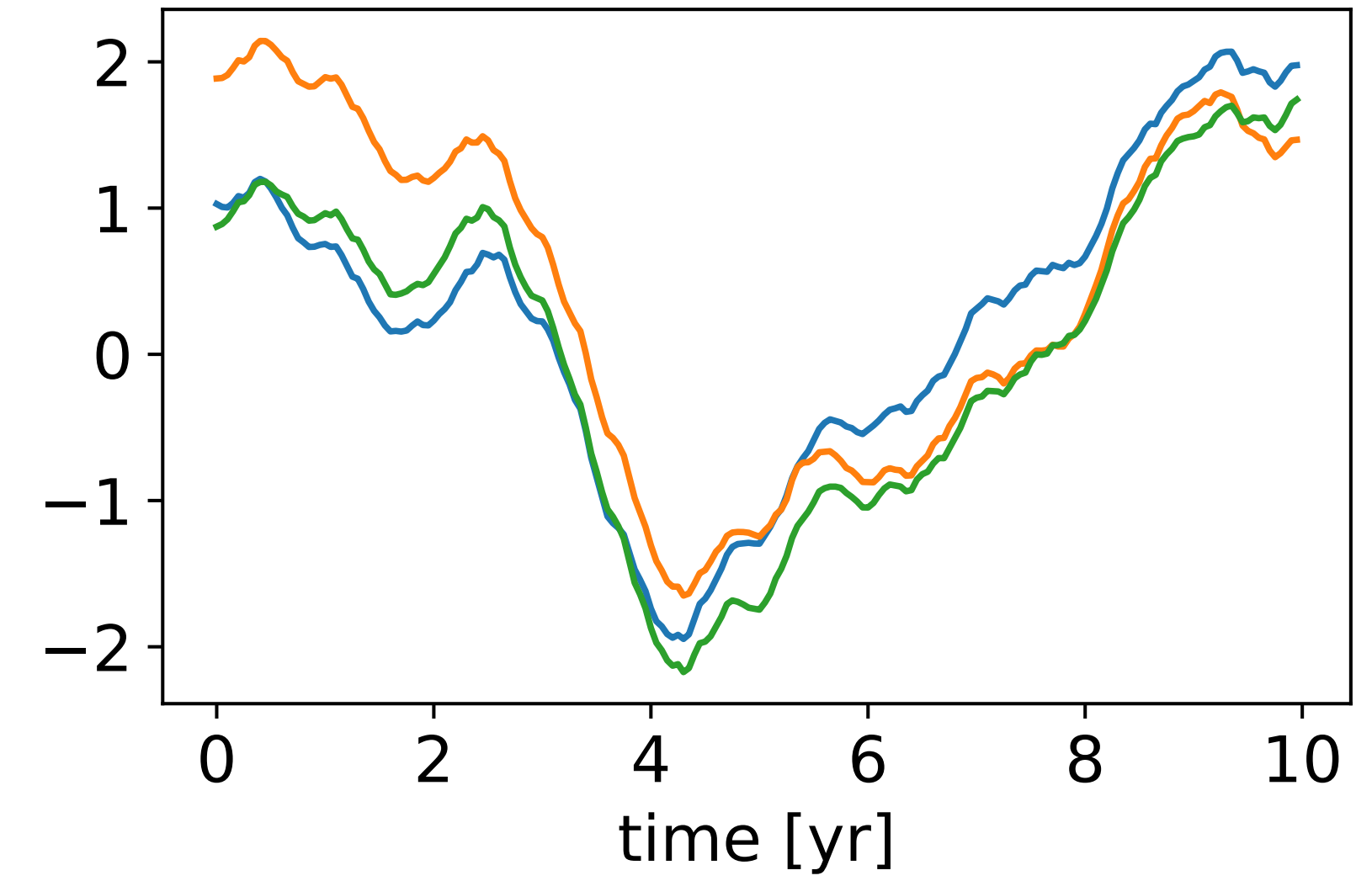
$$C_{ab}(f) = \chi_{ab} \Phi(f) + \delta_{ab} \varphi_b(f)$$



uncorrelated



moderate correlations (50%)



strong correlations (95%)

# Frequentist detection statistic

- Form general linear combination of inter-pulsar correlations:

$$S \equiv \sum_{a < b} \rho_{ab} w_{ab} \quad \text{where} \quad \rho_{ab} = \overline{Z_a(t) Z_b(t)} \quad \text{with} \quad \langle \rho_{ab} \rangle = A_{\text{gw}}^2 \Gamma_{ab}, \quad \langle \rho_{ab} \rangle_0 = 0$$

- Determine weights so they maximize  $\langle S \rangle / N$ , where

$$N^2 \equiv \langle S^2 \rangle_0 - \langle S \rangle_0^2 \quad (\text{variance of } S \text{ in absence of spatial correlations})$$

- This leads to:

$$w_{ab} = \frac{\Gamma_{ab} / \sigma_{ab,0}^2}{\sqrt{\sum_{c < d} \Gamma_{cd}^2 / \sigma_{cd,0}^2}} \quad \text{where} \quad \sigma_{ab,0}^2 = \langle \rho_{ab}^2 \rangle_0 \quad \text{with } w_{ab} \text{ normalized so } N^2 = 1$$

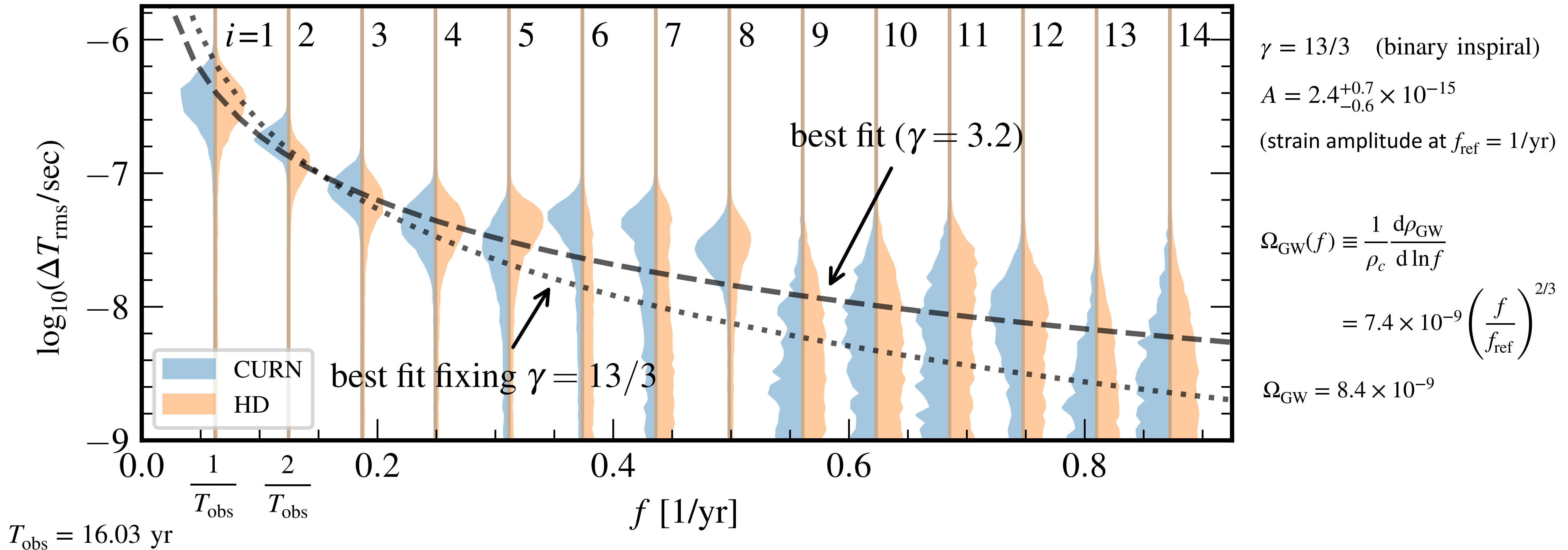
- The detections statistic  $S$  has the interpretation of a signal-to-noise ratio:

$$S = \frac{\sum_{a < b} \rho_{ab} \Gamma_{ab} / \sigma_{ab,0}^2}{\sqrt{\sum_{c < d} \Gamma_{cd}^2 / \sigma_{cd,0}^2}} \equiv S/N$$



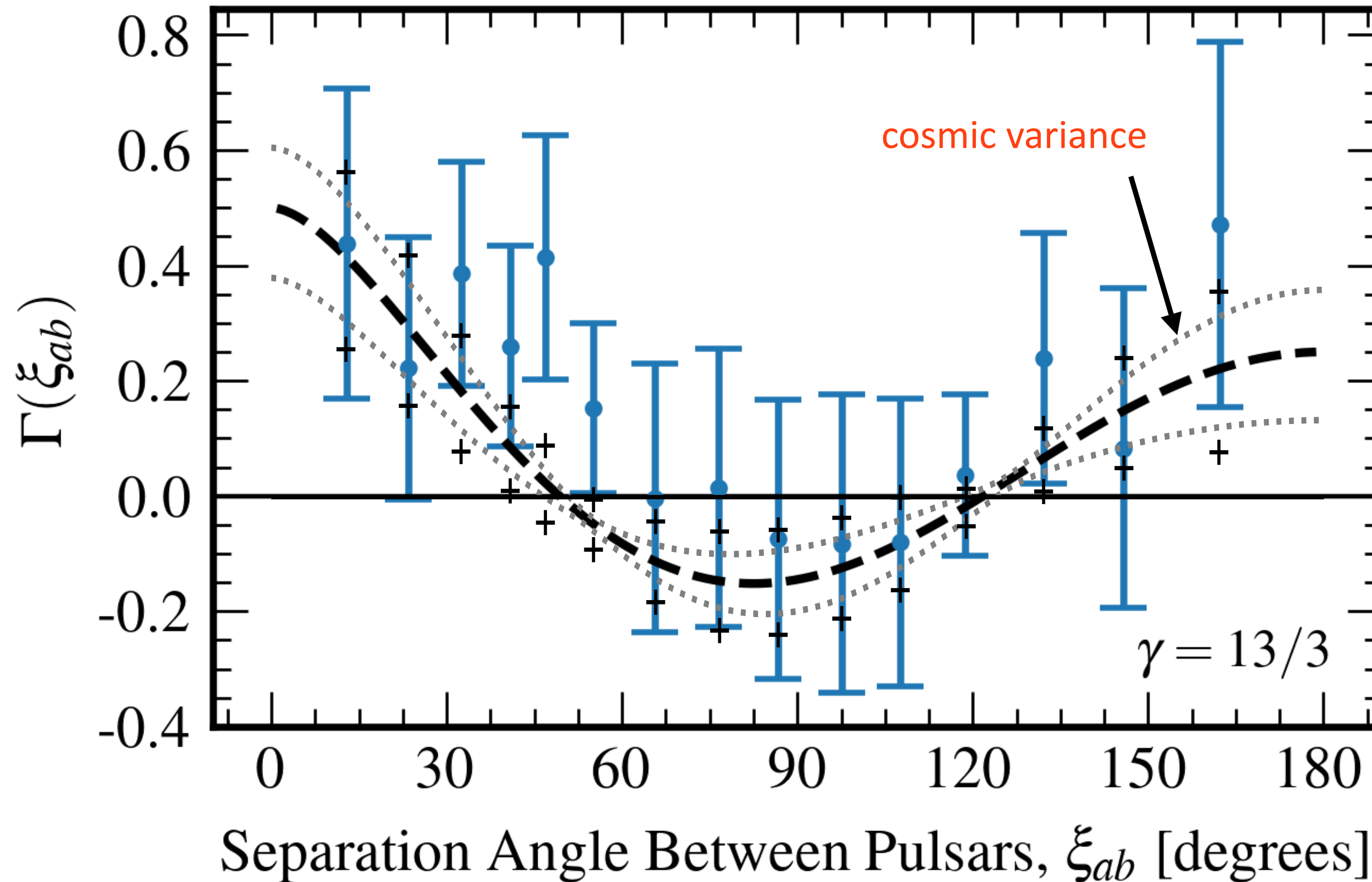
# **Part II. Plots from NANOGrav 15-yr papers**

# NANOGrav's observed common power spectrum



**-consistent with predictions from SMBH binaries (and many other source models)**

# NANOGrav's observed correlations



$$\frac{67(67 - 1)}{2} = 2211 \text{ distinct pairs}$$

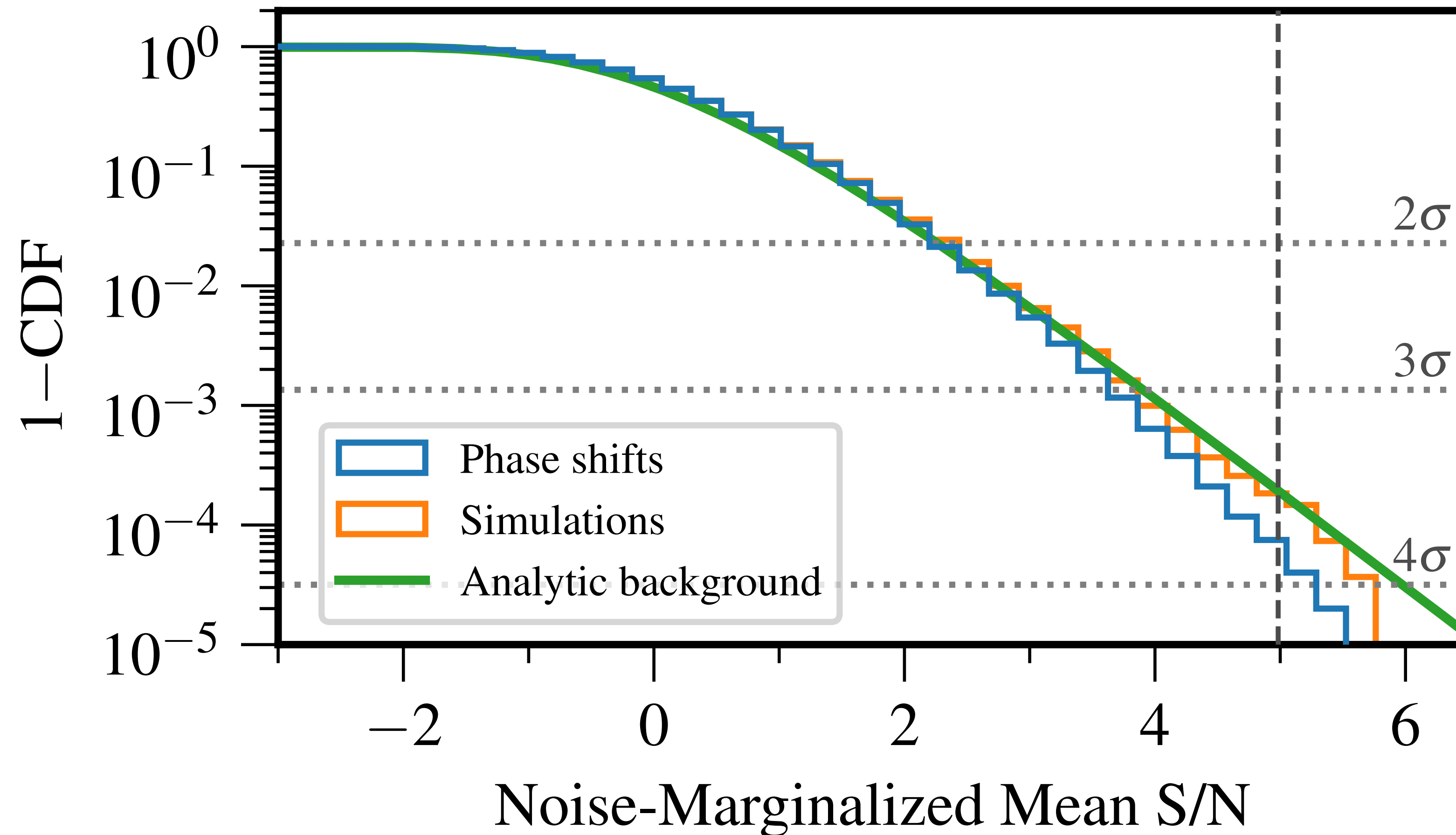
$$\frac{2211}{15} \approx 150 \text{ pairs per bin}$$

- weighted averages of measured correlations  $\rho_{ab}$  in each bin
- includes contributions from GW-induced covariances

$$C_{ab,cd} \equiv \langle \rho_{ab} \rho_{cd} \rangle - \langle \rho_{ab} \rangle \langle \rho_{cd} \rangle$$

**-correlations follow the pattern expected for a GW background**

# NANOGrav's detection confidence



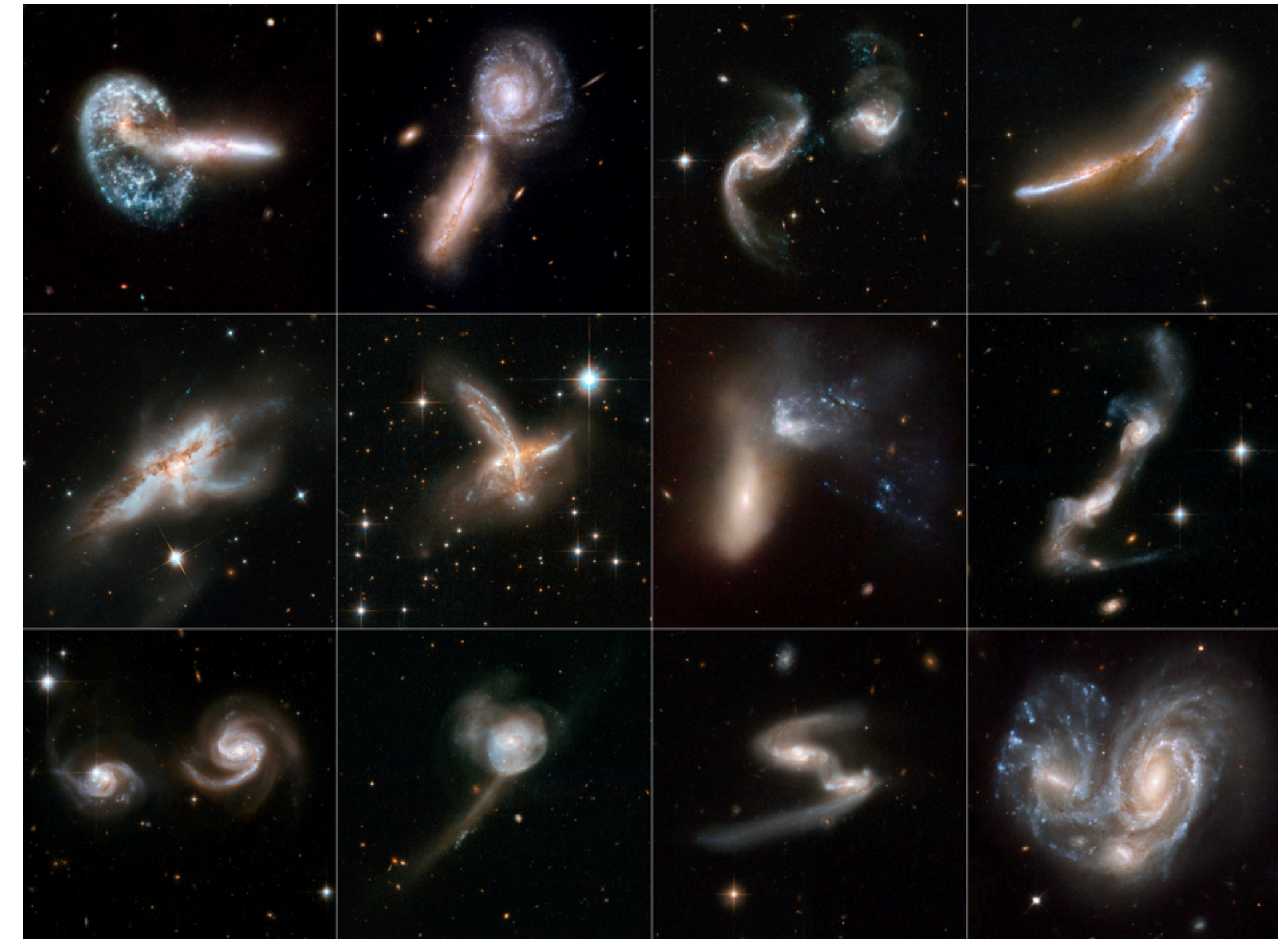
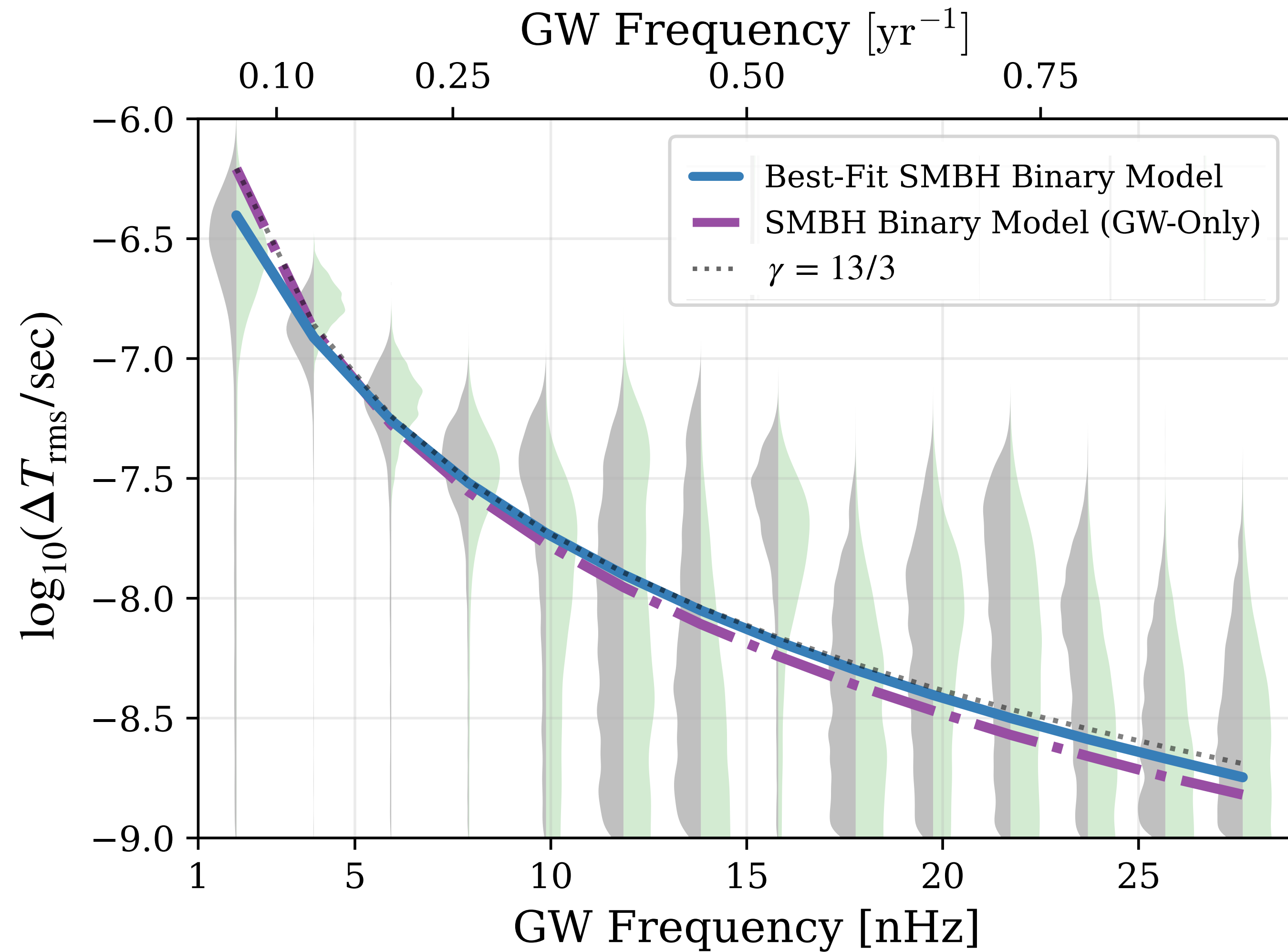
$$S/N = \frac{\sum_{a < b} \rho_{ab} \Gamma_{ab} / \sigma_{ab,0}^2}{\sqrt{\sum_{c < d} \Gamma_{cd}^2 / \sigma_{cd,0}^2}}$$

- inner product of measured and expected correlations (“**matched filter**” statistic)
- null distribution has zero mean, unit variance; but is not Gaussian

**-unlikely due to noise alone (prob  $\approx 1/10,000$ )  $\rightarrow$  “evidence for”**



# Possible astrophysical interpretation



pairs of inspiraling supermassive black holes  
(masses  $\sim 10^9 M_{\odot}$ ; millions of such binaries)

**- environmental interactions remove GW power at low freqs, better fitting data**



# Summary

## The NANOGrav 15-year Data Set: Evidence for a Gravitational-Wave Background

THE NANOGrav COLLABORATION

### ABSTRACT

We report multiple lines of evidence for a stochastic signal that is correlated among 67 pulsars from the 15-year pulsar-timing data set collected by the North American Nanohertz Observatory for Gravitational Waves. The correlations follow the Hellings–Downs pattern expected for a stochastic gravitational-wave background. The presence of such a gravitational-wave background with a power-law–spectrum is favored over a model with only independent pulsar noises with a Bayes factor in excess of  $10^{14}$ , and this same model is favored over an uncorrelated common power-law–spectrum model with Bayes factors of 200–1000, depending on spectral modeling choices. We have built a statistical background distribution for these latter Bayes factors using a method that removes inter-pulsar correlations from our data set, finding  $p = 10^{-3}$  (approx.  $3\sigma$ ) for the observed Bayes factors in the null no-correlation scenario. A frequentist test statistic built directly as a weighted sum of inter-pulsar correlations yields  $p = 5 \times 10^{-5} - 1.9 \times 10^{-4}$  (approx.  $3.5 - 4\sigma$ ). Assuming a fiducial  $f^{-2/3}$  characteristic-strain spectrum, as appropriate for an ensemble of binary supermassive black-hole inspirals, the strain amplitude is  $2.4_{-0.6}^{+0.7} \times 10^{-15}$  (median + 90% credible interval) at a reference frequency of  $1 \text{ yr}^{-1}$ . The inferred gravitational-wave background amplitude and spectrum are consistent with astrophysical expectations for a signal from a population of supermassive black-hole binaries, although more exotic cosmological and astrophysical sources cannot be excluded. The observation of Hellings–Downs correlations points to the gravitational-wave origin of this signal.

stochastic signal, correlated among 67 pulsars

follows Hellings and Downs pattern expected for a stochastic gravitational-wave background

approx  $3.5 - 4 \sigma$

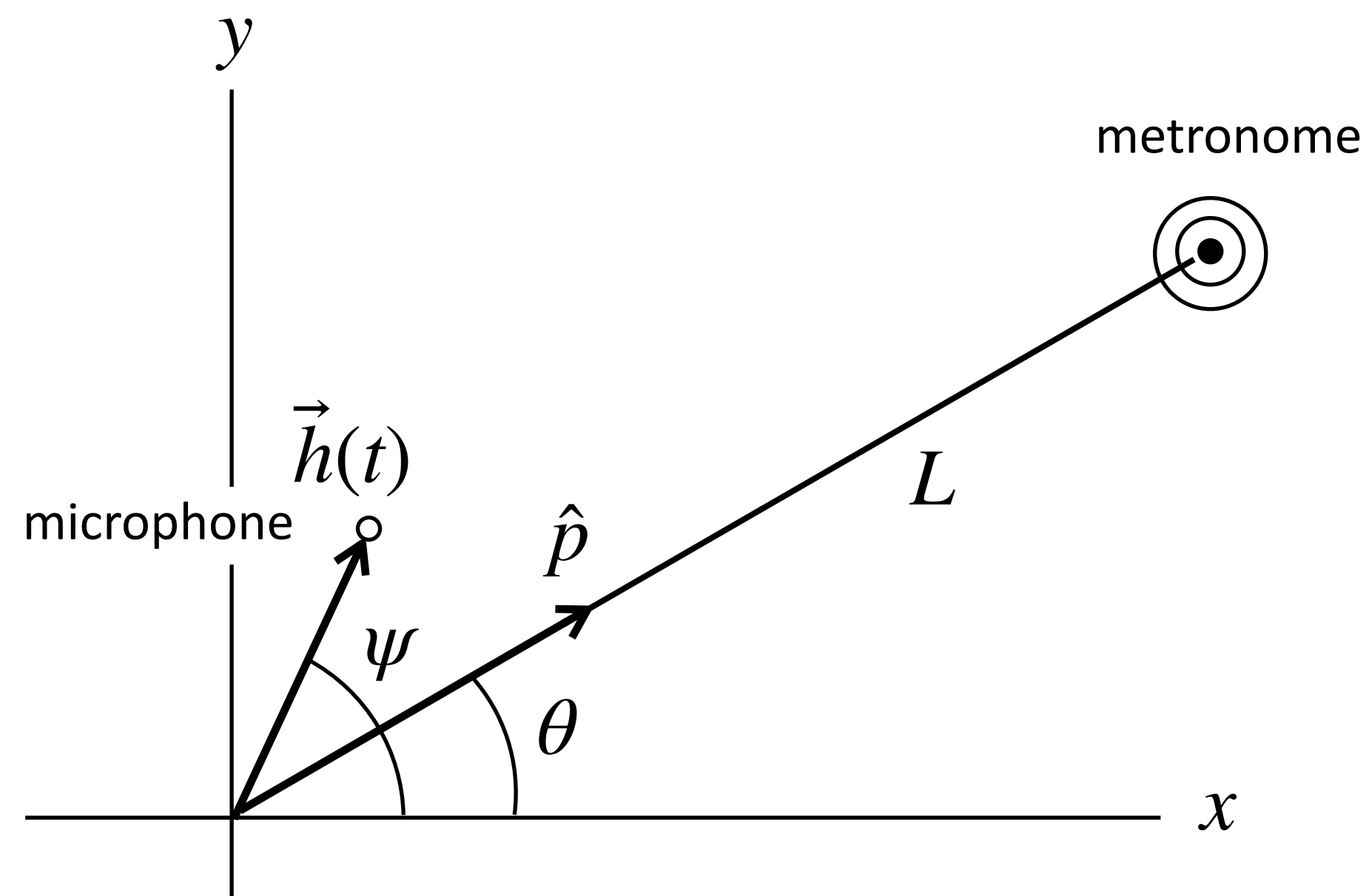
$f^{-2/3}$  characteristic-strain spectrum,  
strain amplitude  $2.4 \times 10^{-15}$  at  $f_{\text{ref}} = 1/\text{yr}$

population of supermassive black-hole binaries, ...  
more exotic cosmological cannot be excluded

# Metronome timing array

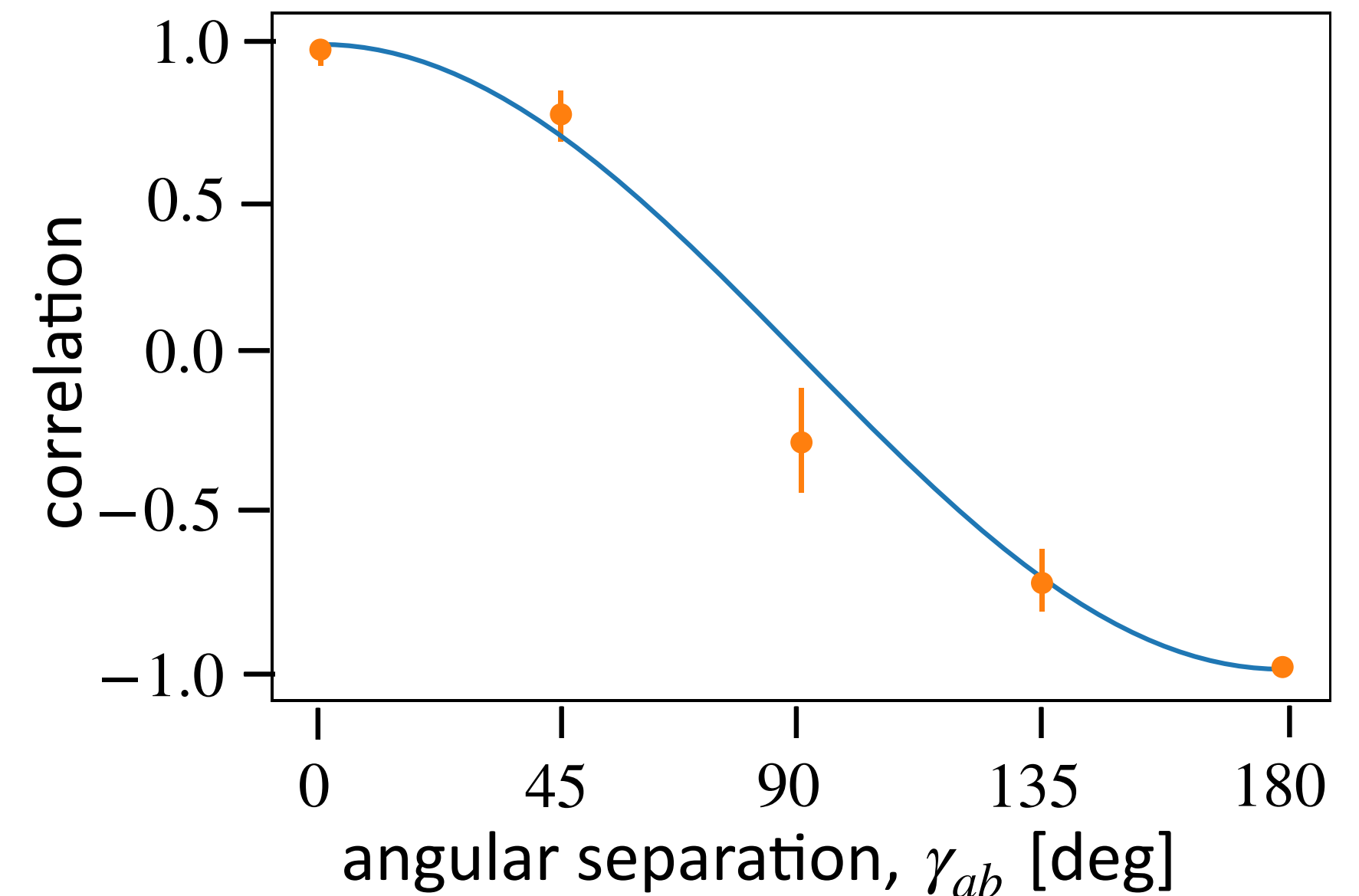
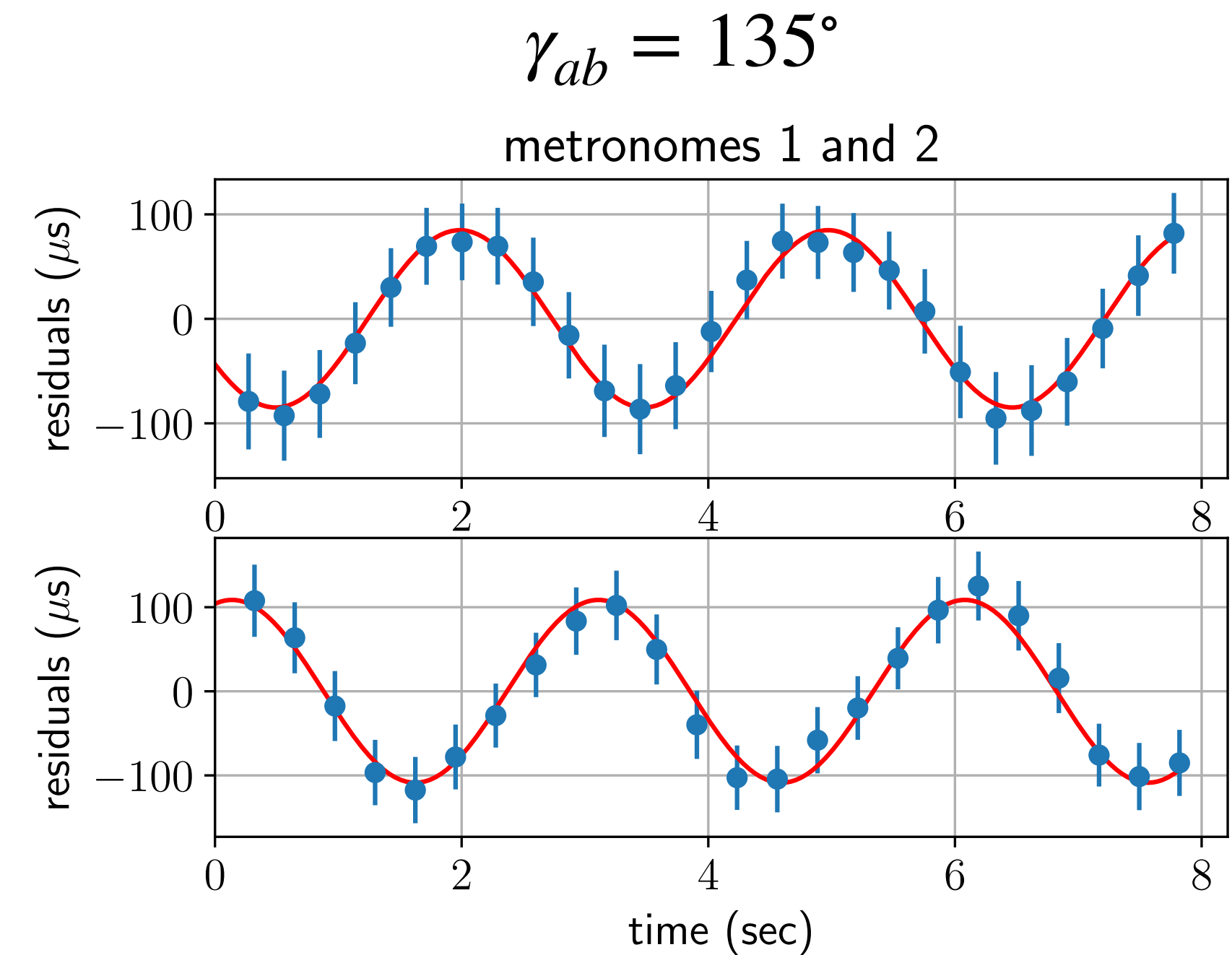
[AJP: Lam et al, 2018]

<https://github.com/josephromano/pta-demo>



$$\Delta T(t) = \frac{\Delta L(t)}{c_s} \simeq -\frac{\hat{p} \cdot \vec{h}(t)}{c_s}$$

Unif circular motion: 
$$\Delta T_{a,b}(t) = -\frac{A}{c_s} \cos(2\pi f_0 t + \phi_0 - \theta_{a,b})$$



**extra slides**









+



+



+

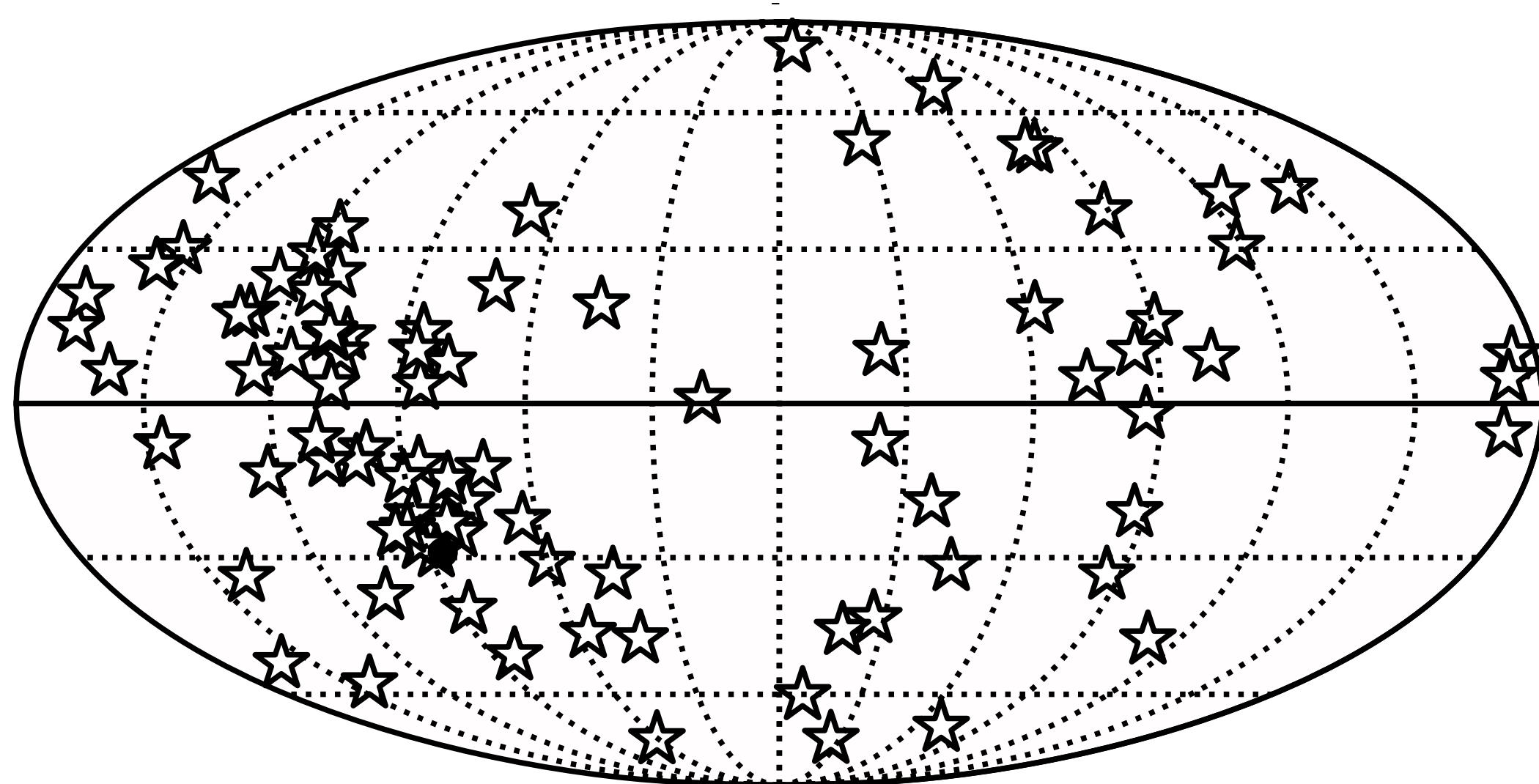


**InPTA**  
Indian Pulsar Timing Array

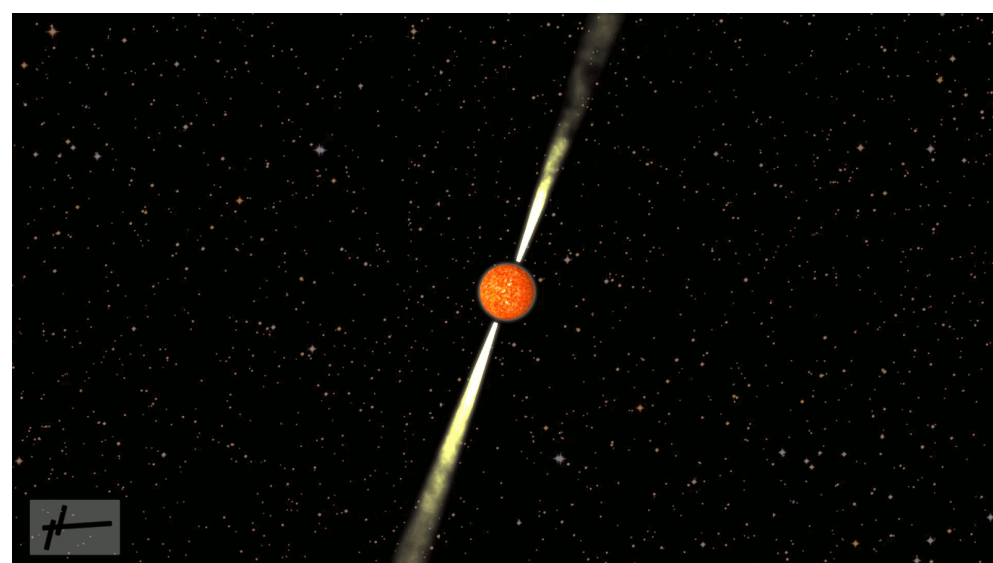
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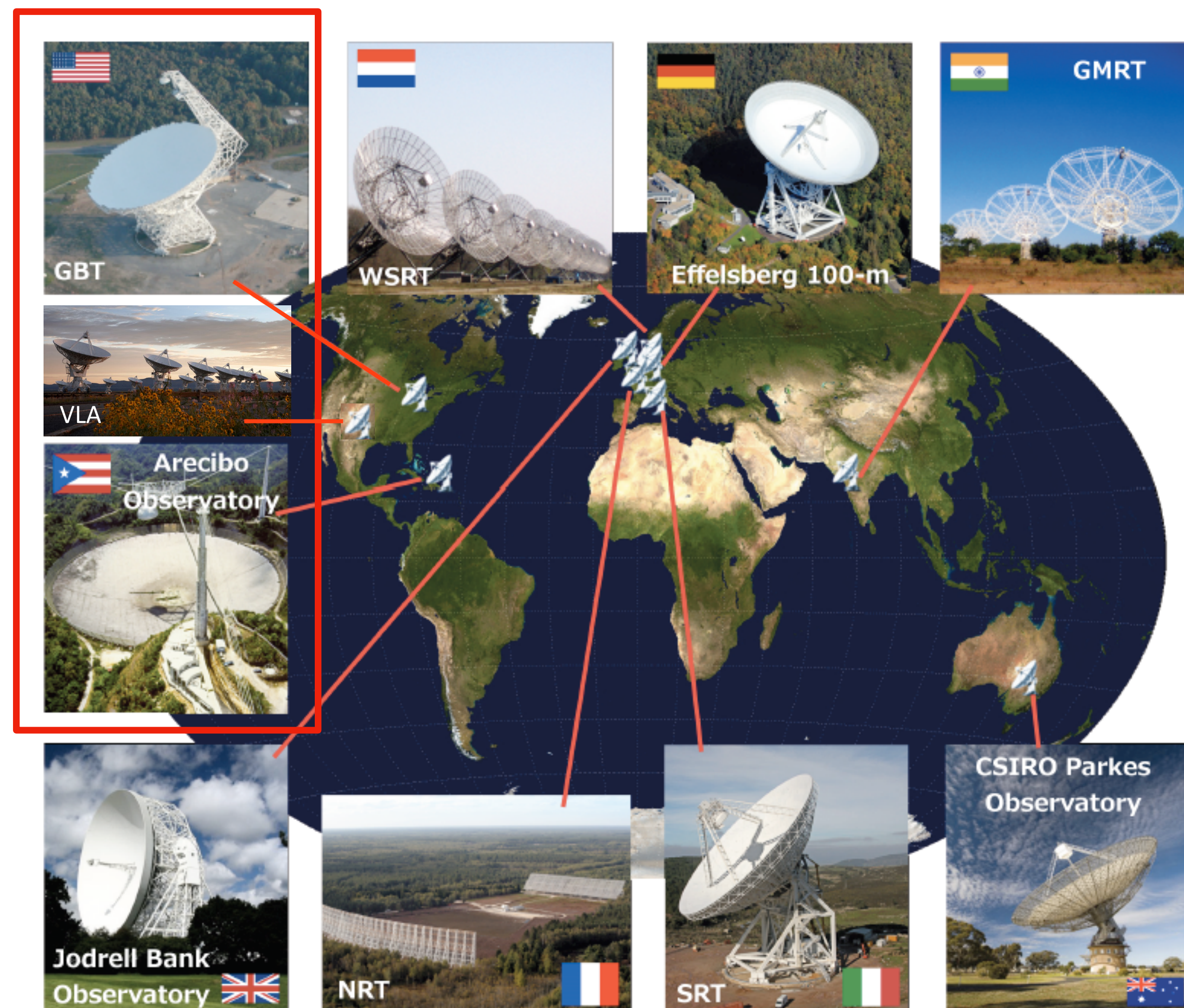
sky map of 88 IPTA millisecond pulsars



Rapidly rotating  
neutron star; strong  
magnetic field;  
narrow beam of  
radiation



**Nature's most  
precise clocks!**  
 $(\Delta T_p / T_p < 10^{-14})$





# Optimal binned HD estimator

- Form general linear combination of pulsar pairs within each angular bin (labeled by  $j$ ) with  $\gamma_j = \text{avg}(\gamma_{ab})$  in the bin:

$$\hat{\Gamma}_j \equiv \sum_{ab \in j} \rho_{ab} w_{ab} \quad \text{where} \quad \rho_{ab} = \overline{Z_a(t) Z_b(t)} \quad \text{with} \quad \langle \rho_{ab} \rangle = A_{\text{gw}}^2 \Gamma_{ab}$$

- Determine weights such that:

- $\langle \hat{\Gamma}_j \rangle = \Gamma(\gamma_j)$  (unbiased)
- $\sigma_j^2 \equiv \langle \hat{\Gamma}_j^2 \rangle - \langle \hat{\Gamma}_j \rangle^2$  is minimized

- These lead to

$$w_{ab} = \frac{\Gamma(\gamma_j)}{A_{\text{gw}}^2} \frac{\sum_{cd \in j} C_{ab,cd}^{-1} \Gamma_{cd}}{\sum_{ef \in j} \sum_{gh \in j} \Gamma_{ef} C_{ef,gh}^{-1} \Gamma_{gh}} \quad \text{where} \quad C_{ab,cd} \equiv \langle \rho_{ab} \rho_{cd} \rangle - \langle \rho_{ab} \rangle \langle \rho_{cd} \rangle$$

- Optimal binned estimator to the binned HD correlation:

$$\hat{\Gamma}_j = \frac{\Gamma(\gamma_j)}{A_{\text{gw}}^2} \frac{\sum_{ab \in j} \sum_{cd \in j} \rho_{ab} C_{ab,cd}^{-1} \Gamma_{cd}}{\sum_{ef \in j} \sum_{gh \in j} \Gamma_{ef} C_{ef,gh}^{-1} \Gamma_{gh}} \quad \text{with} \quad \sigma_j^2 = \frac{\Gamma^2(\gamma_j)}{A_{\text{gw}}^4} \frac{1}{\sum_{ef \in j} \sum_{gh \in j} \Gamma_{ef} C_{ef,gh}^{-1} \Gamma_{gh}}$$

- Optimal binned estimator is used to test for consistency with GWB model and includes GW-induced covariances between pulsar pairs; it is not a detection statistic