



Searches for a stochastic gravitational wave
background with pulsar timing arrays:
a data analysis pipeline

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Xavier Siemens



Outline

- * Search efforts for gravitational waves (GWs)
- * Detecting GWs with pulsar timing arrays (PTAs)
- * Constructing the optimal detection statistic
- * Building a stochastic GW detection pipeline
- * (very) preliminary results with upper limits, mock data challenge

Current GW detection efforts

- * Ground-based laser interferometers (**L**aser **I**nterferometer **G**ravitational wave **O**bservatory)

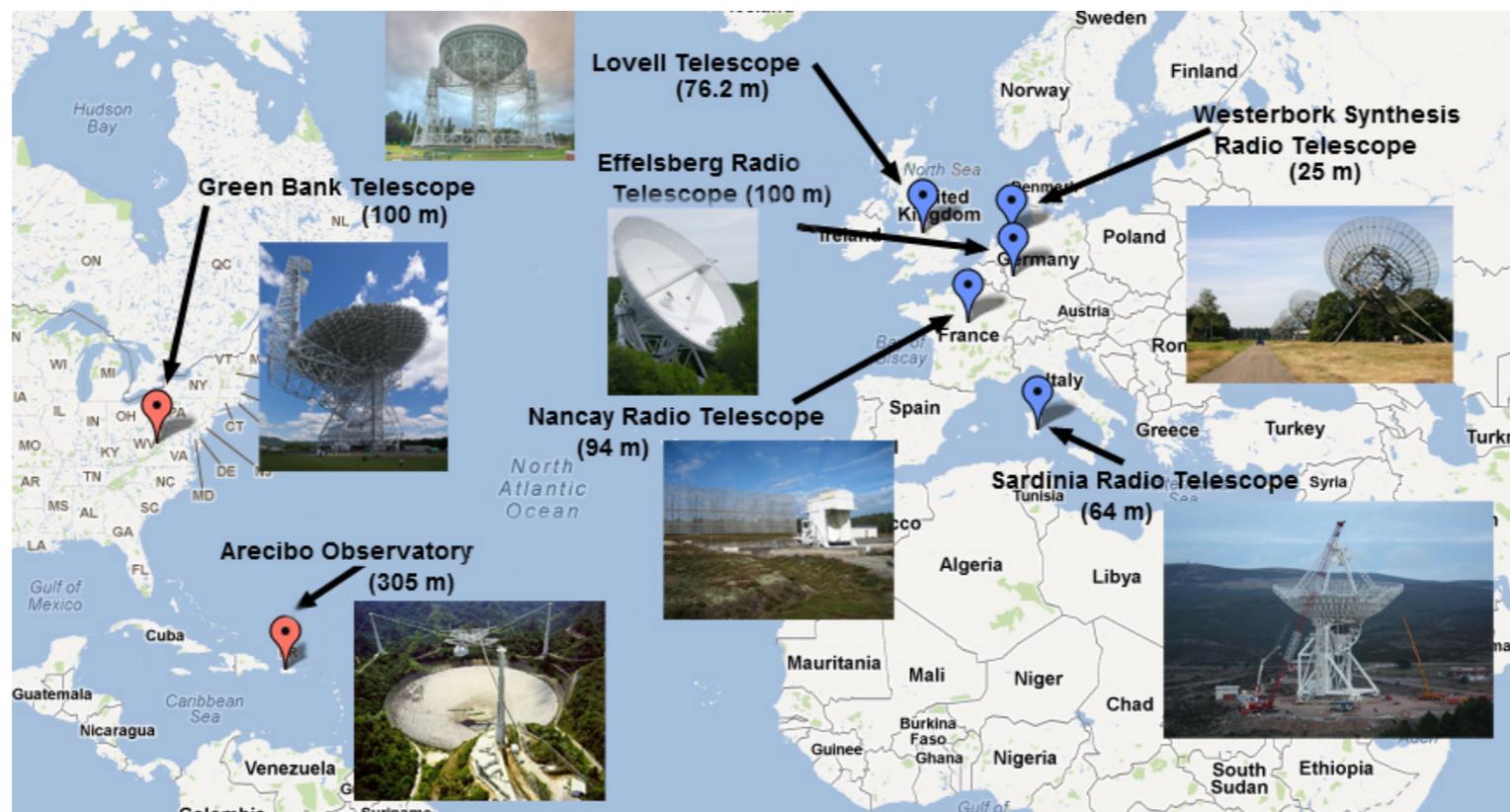


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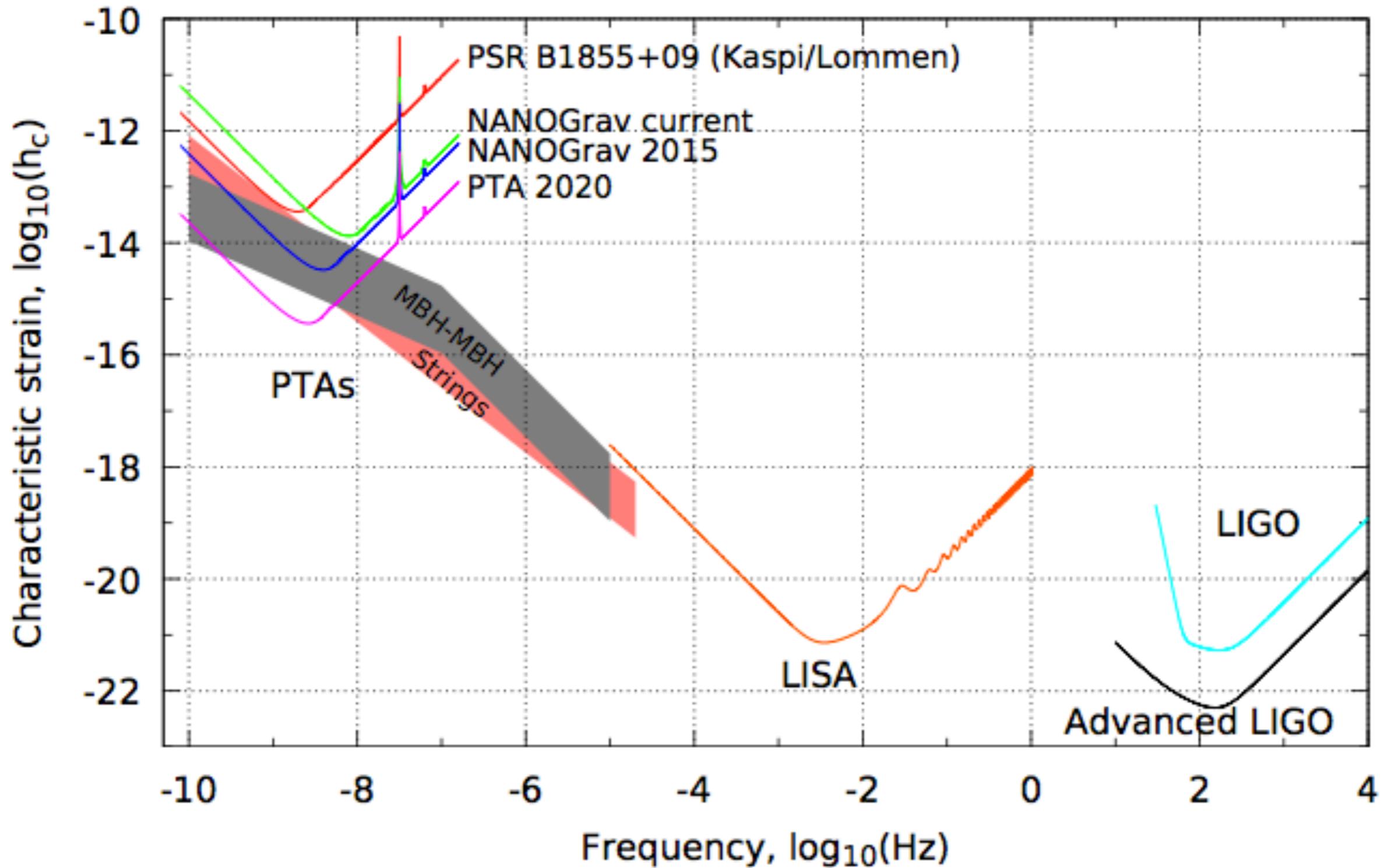
- * PTAs (**N**orth **A**merican **N**anohertz **O**bservatory for **G**ravitational Waves, **E**uropean **P**ulsar **T**iming **A**rray, **P**arkes **P**ulsar **T**iming **A**rray)



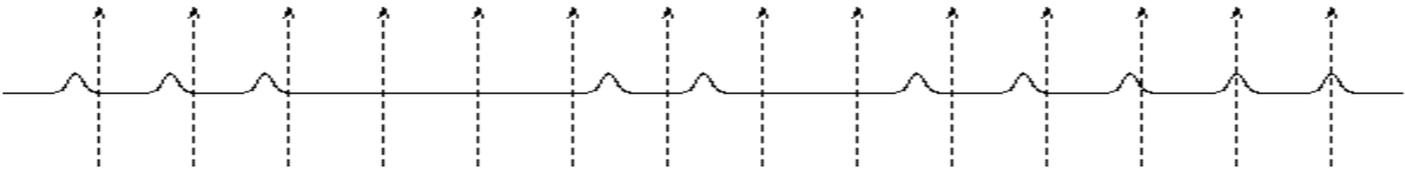
Together, form **I**nternational **P**ulsar **T**iming **A**rray

Current GW detection efforts

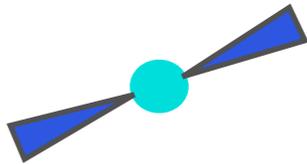
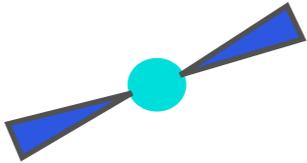
Demorest et al. (2009)



GW searches with PTAs

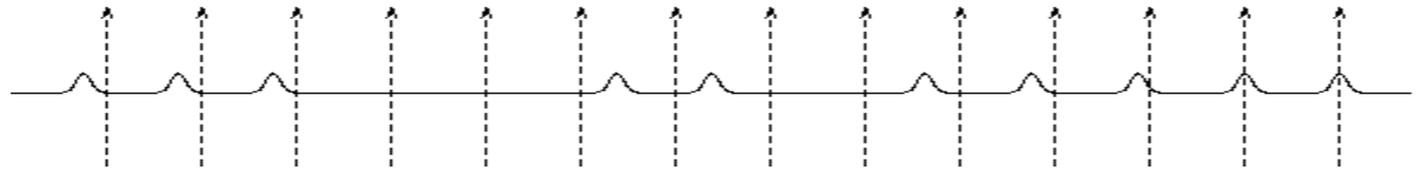
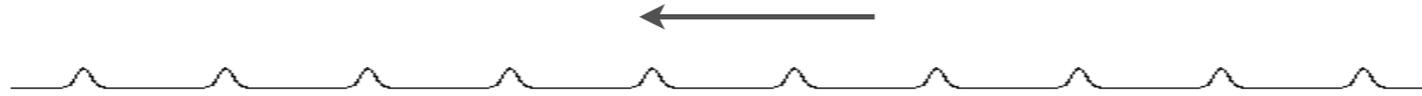


gravitational waves induce redshift $z(t)$

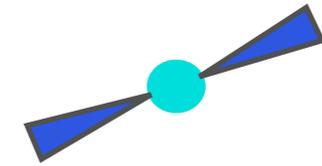
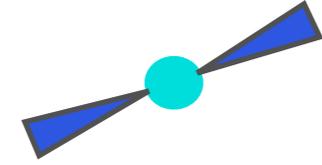


Detweiler (1979)

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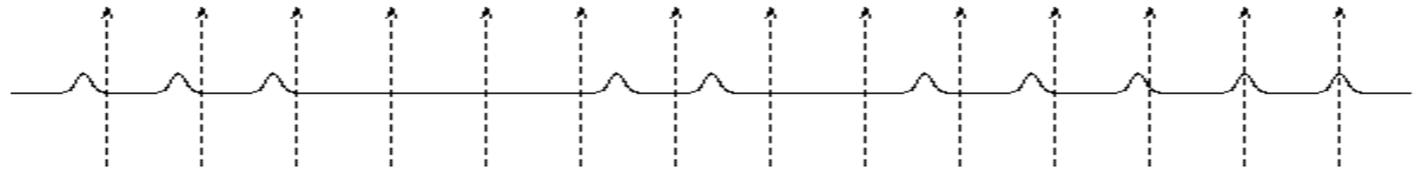
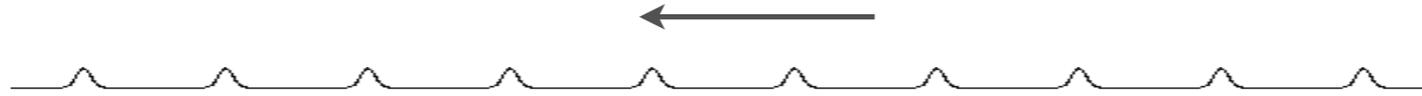
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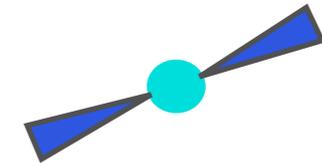
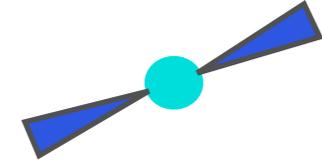
Detweiler (1979)

- * Millisecond pulsars are extremely precise astronomical clocks:

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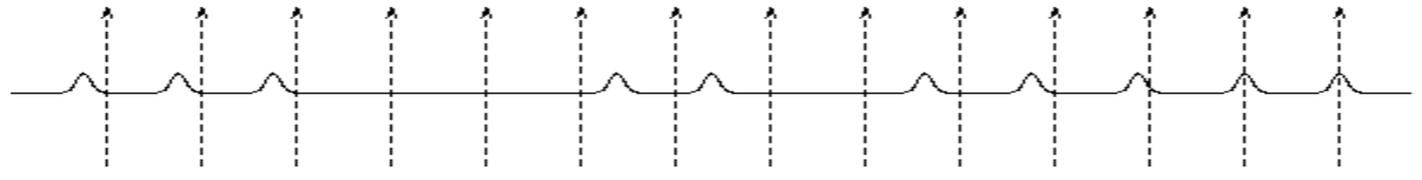
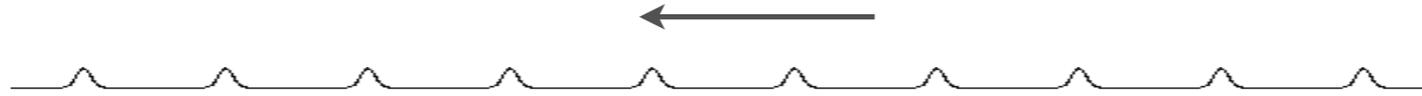
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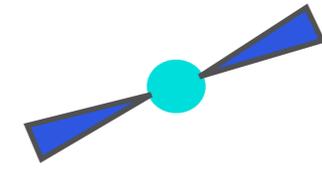
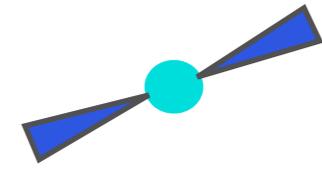
Spin period of PSR B1937+21 at Midnight, December 5, 1998:

$P = 1.5578064688197945 \text{ ms} \pm 0.000000000000000004 \text{ ms} !$

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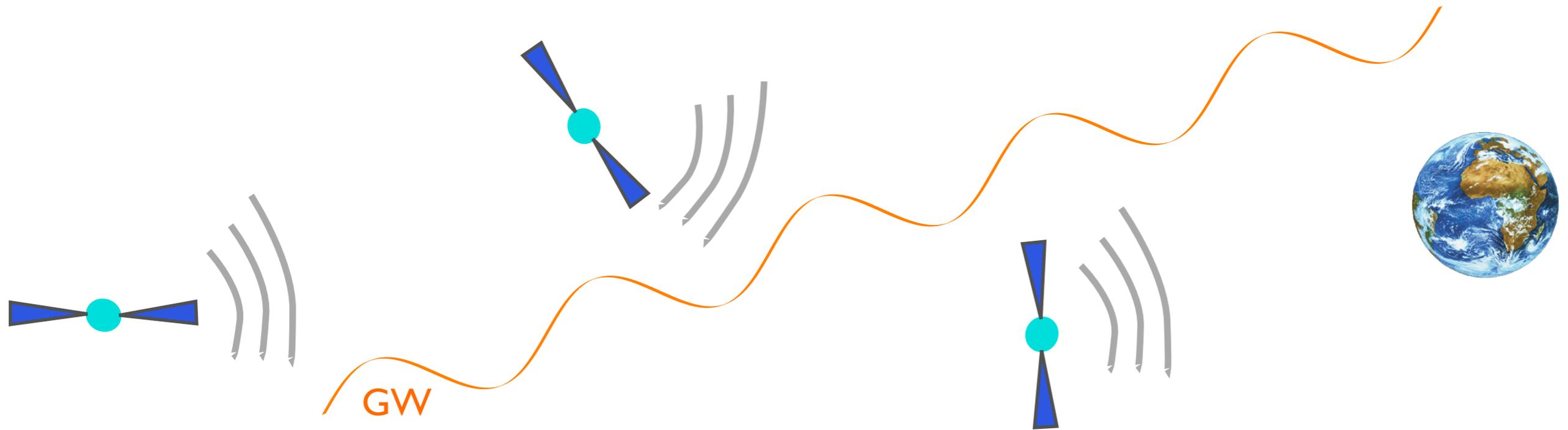
$$P = 1.5578064688197945 \text{ ms } \pm 0.000000000000000004 \text{ ms !}$$

- * This gives us an observable quantity, the *timing residual*:

$$r(t) = TOA_{\text{actual}} - TOA_{\text{expected}}$$

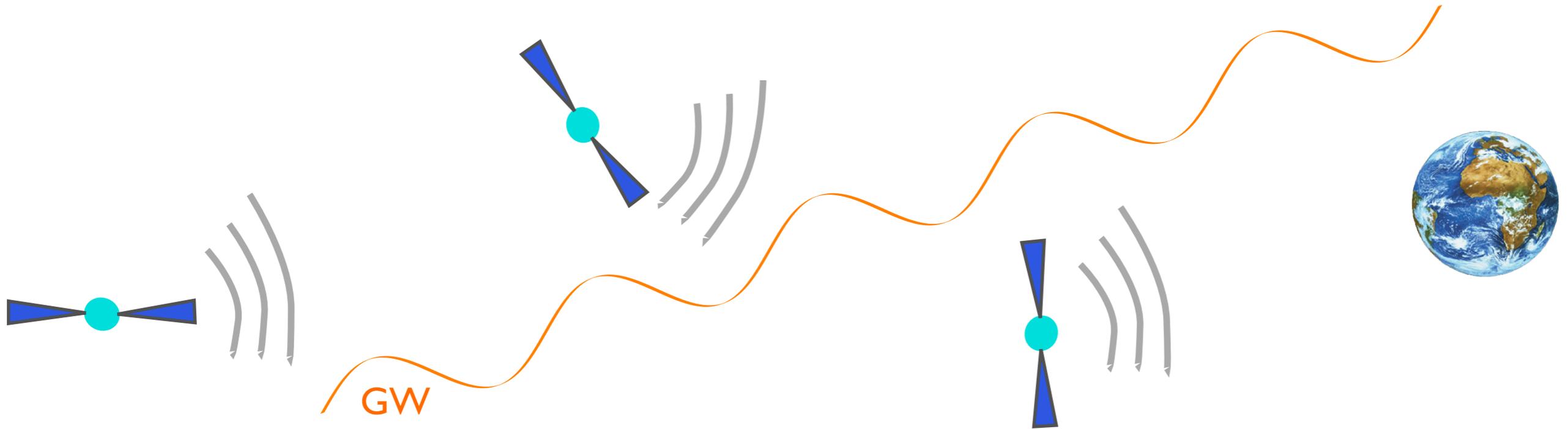
$$r(t) = \int_0^t z(t') dt'$$

GW searches with PTAs



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- * To find optimal detection statistic, start with timing residuals:

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

GW searches with PTAs

- * Construct the *covariance matrix* for the residuals:

$$\Sigma_r = \langle \mathbf{r} \mathbf{r}^T \rangle$$

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$\hat{\Omega}$

optimal statistic

$\hat{\rho}$

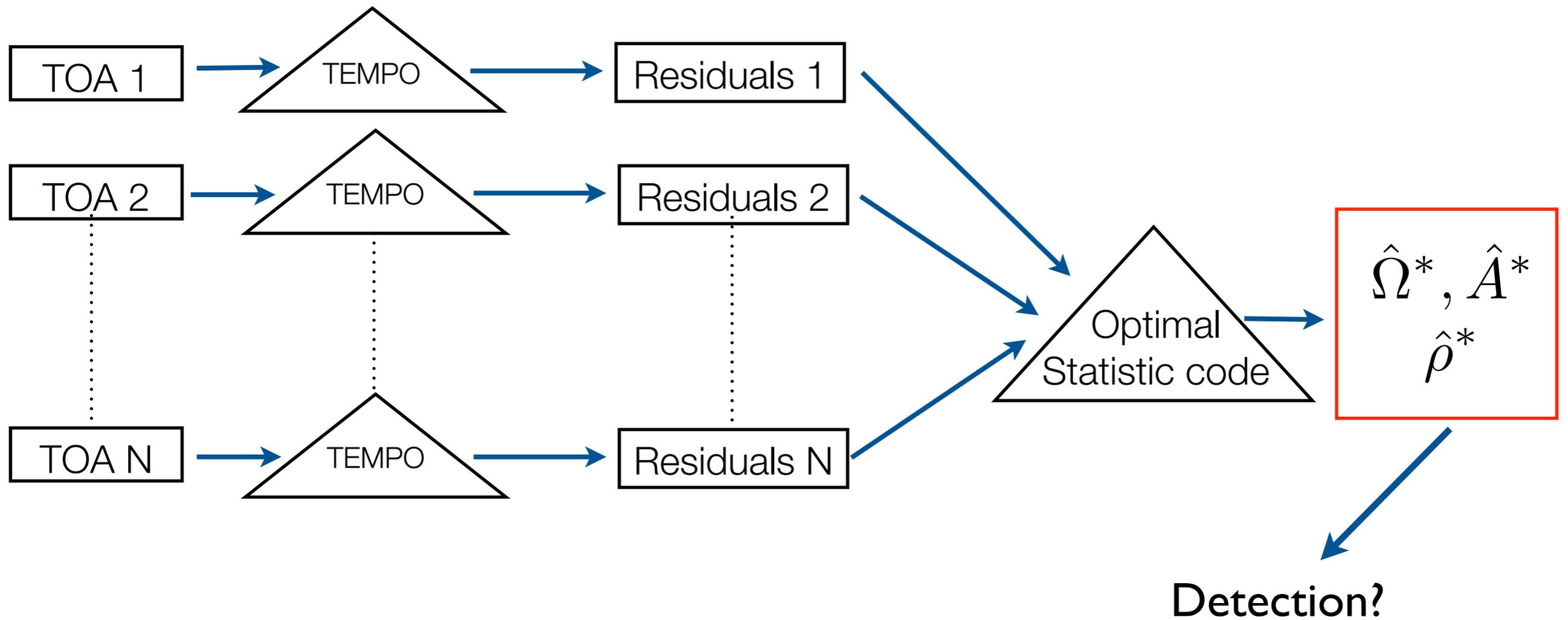
SNR

A

dimensionless amplitude
of the power spectrum

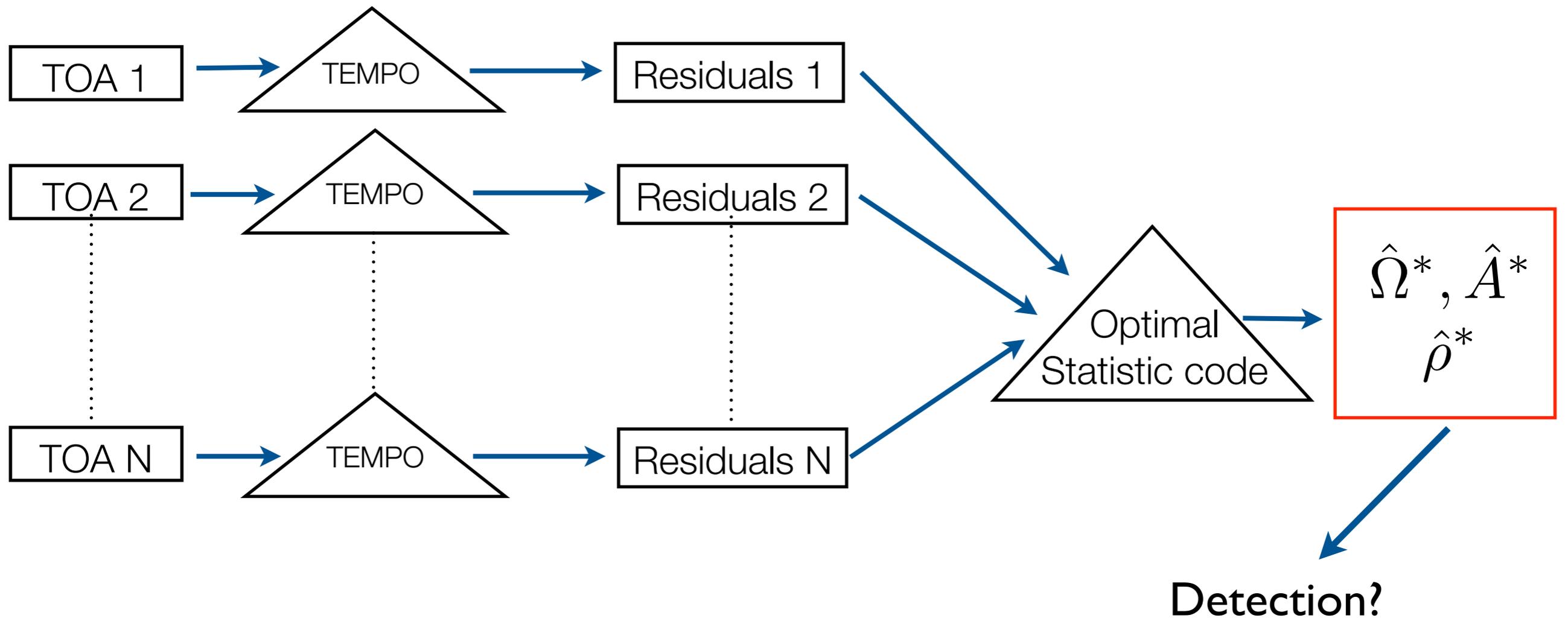
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Stochastic GW detection pipeline



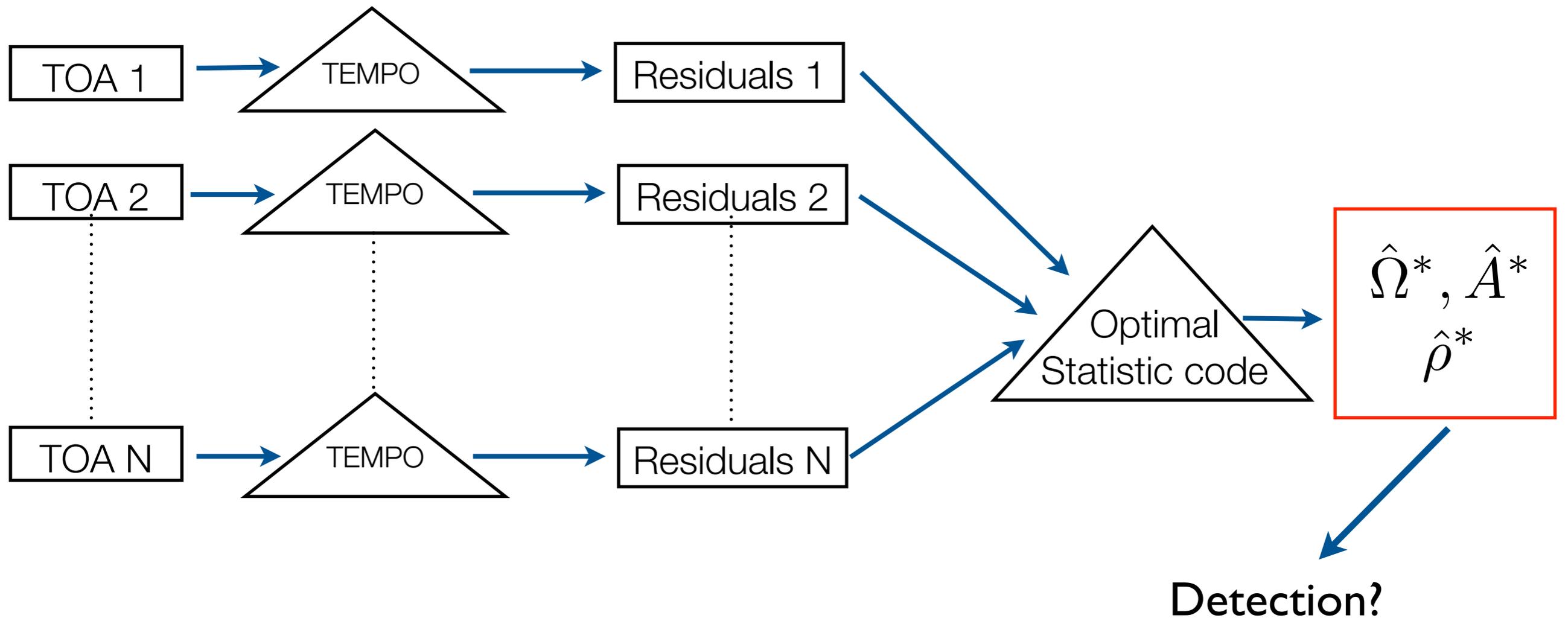
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Stochastic GW detection pipeline



Pipelines for other GW sources also being developed
- stay tuned for Justin Ellis's talk (next)!

Upper limit work

* Upper limits in the literature:

van Haasteren et al. 2011 (EPTA): $A = 6 \times 10^{-15}$

Demorest et al. 2012 (NANOGrav): $A = 7.2 \times 10^{-15}$

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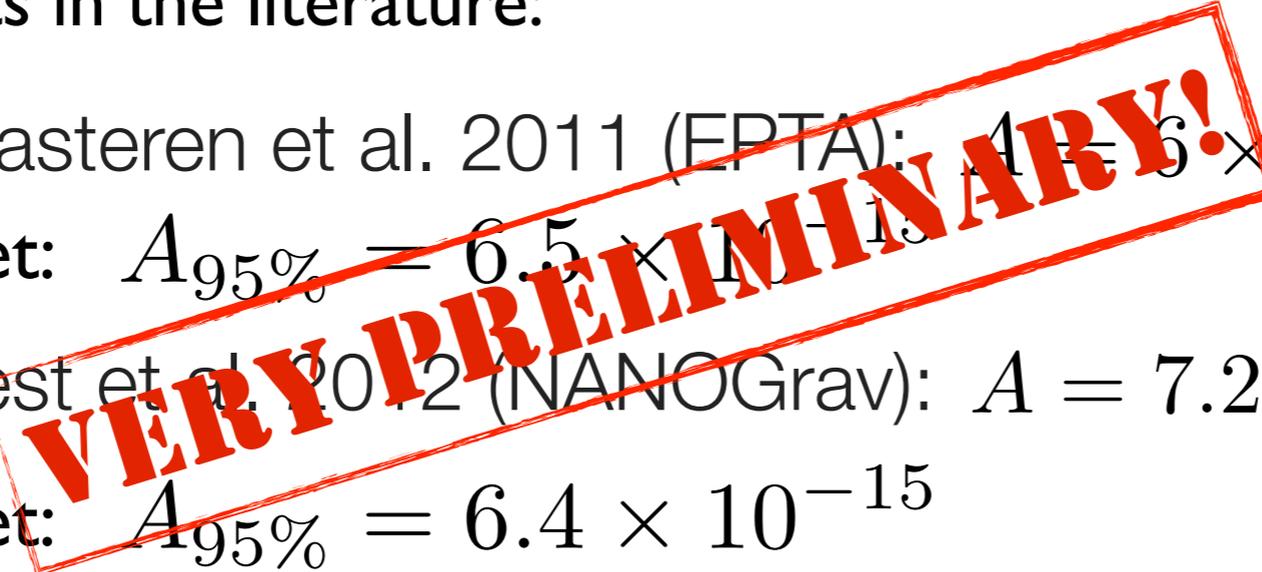
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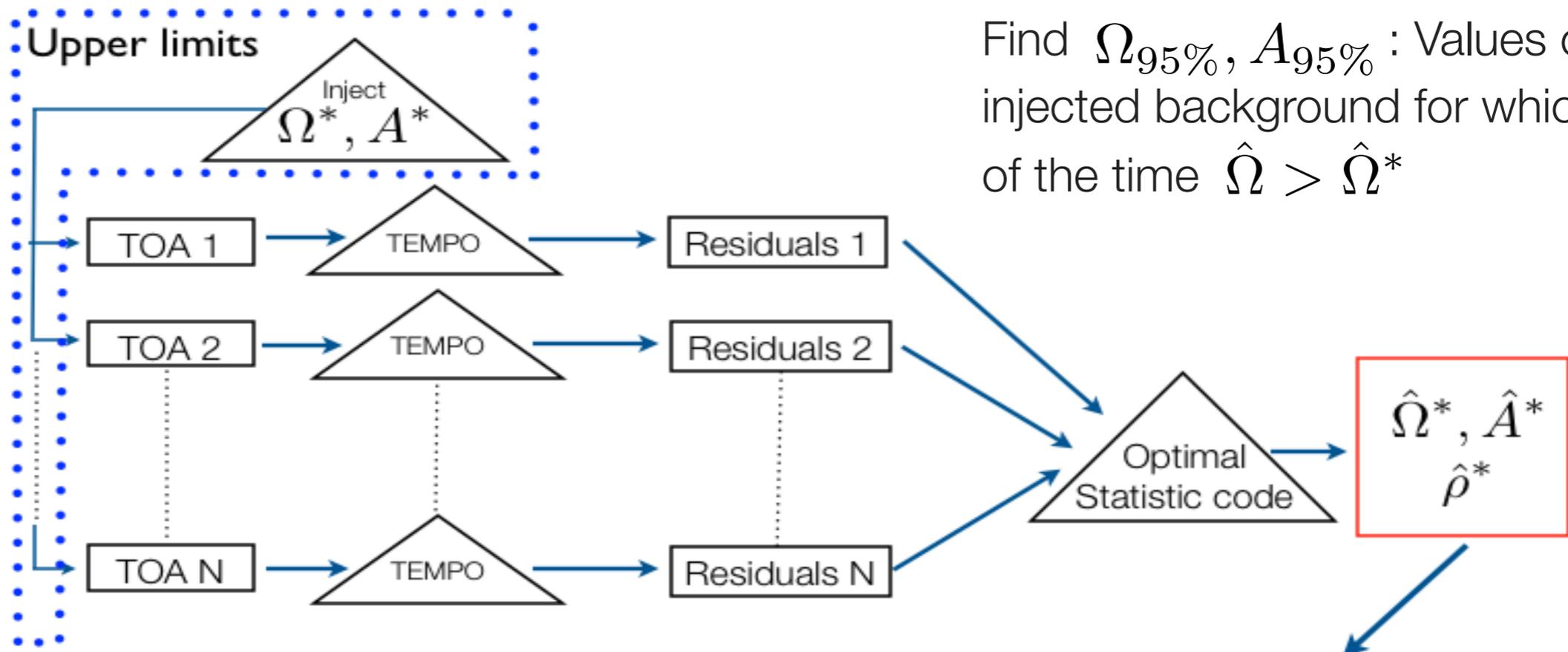
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* Would like to have a robust frequentist upper limit, obtained with injections:



Find $\Omega_{95\%}, A_{95\%}$: Values of injected background for which 95% of the time $\hat{\Omega} > \hat{\Omega}^*$

Detection?

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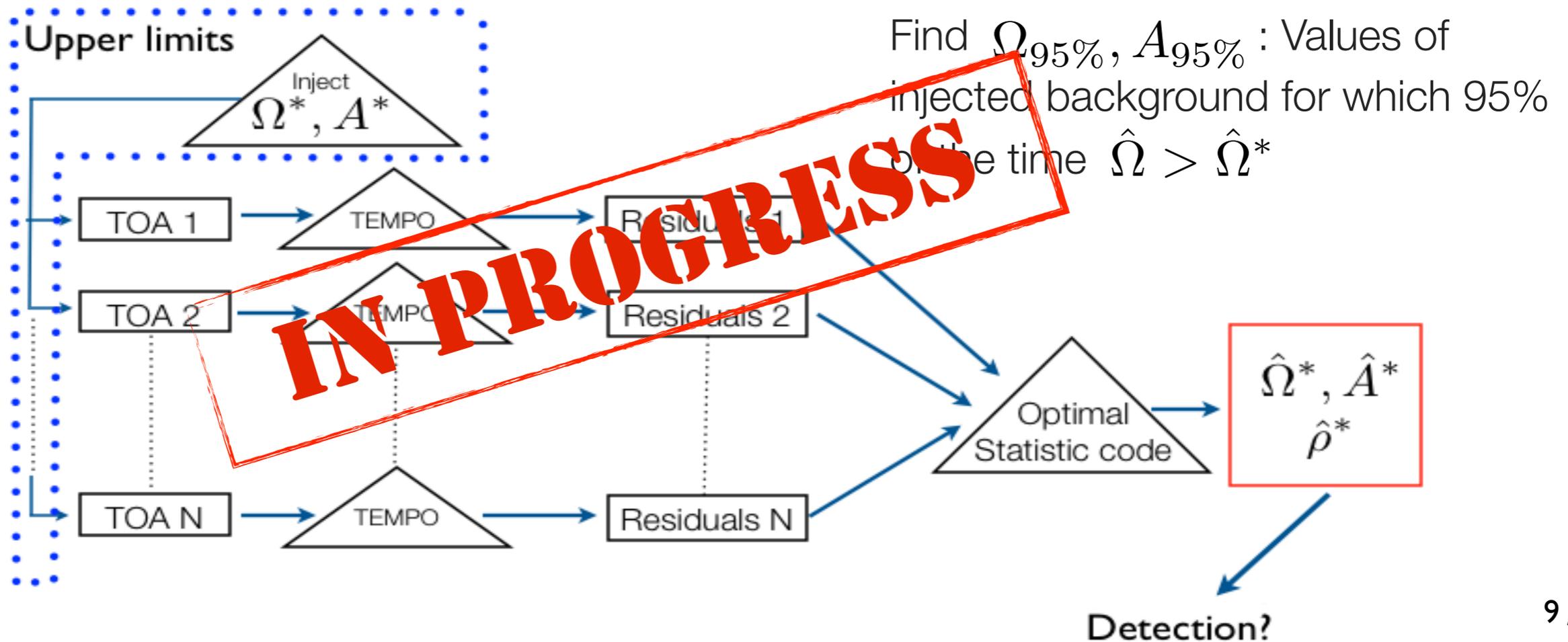
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SNR = 13

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$$\text{FOUND: } A = (1.2 \pm 0.07) \times 10^{-14}$$

$$\text{SNR} = 8.7$$

Further steps

- * Work on noise estimation (watch for upcoming paper by Ellis et al. 2012)
- * Issues with combining data sets from different PTAs
- * Need to better characterize timing noise (how much red noise is intrinsic to pulsars, interstellar medium, etc.?)
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