

# Quantifying and interpreting gravitational waveform error

INT Workshop 22r-2a "Neutron Rich Matter on Heaven and Earth"

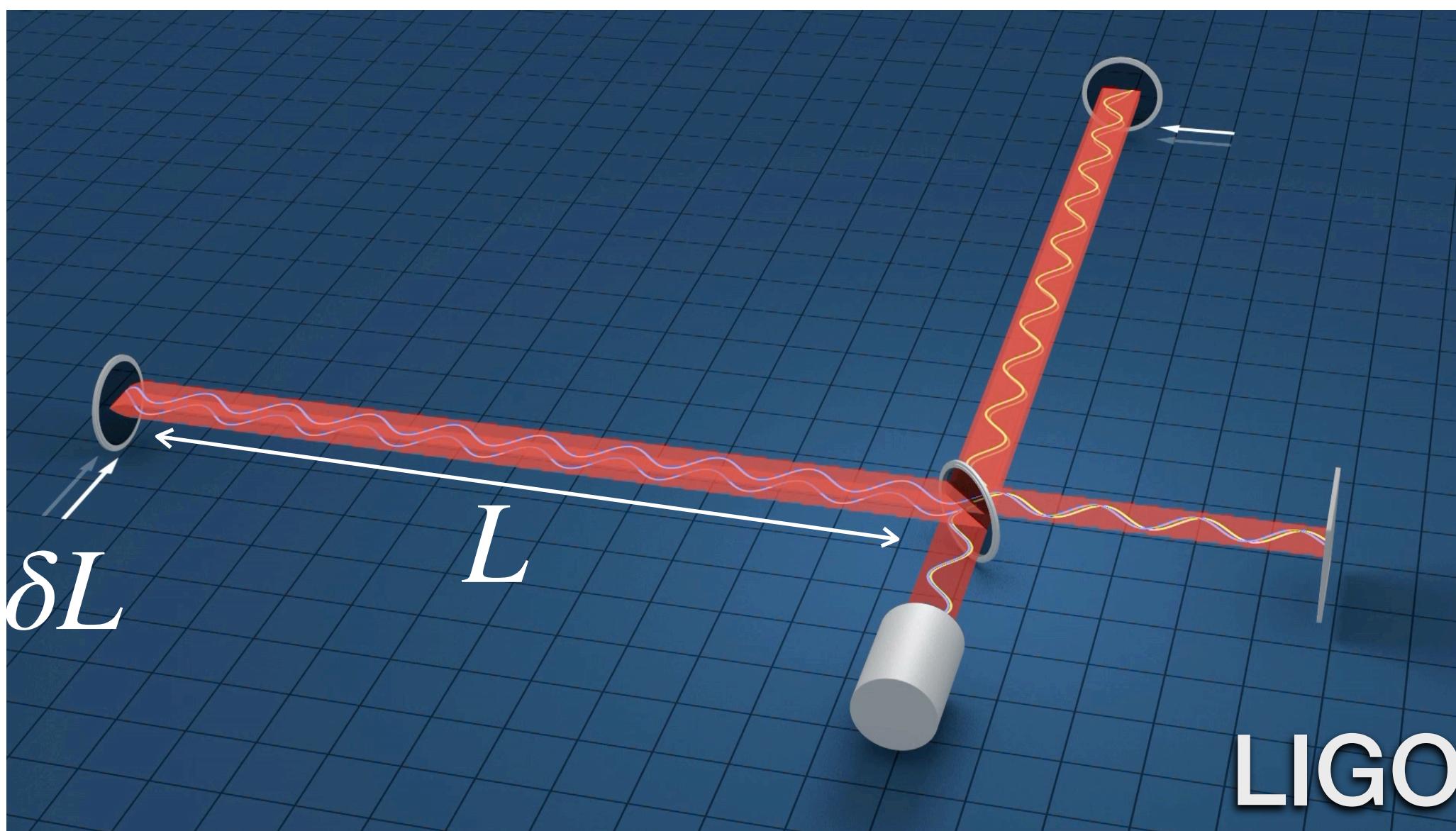
Jocelyn Read, CSU Fullerton



The work of the LSC is supported by NSF's LIGO Laboratory which is a major facility fully funded by the National Science Foundation.

# A very short orientation to GW observation

$$h = 2 \frac{\delta L}{L} \sim \frac{G}{c^2} \frac{M}{d_L} \frac{v_\perp^2}{c^2}$$



Gravitational waves come from oscillatory sources where mass is changing across your line of sight

Amplitude falls off with distance from source

Keplerian orbits at separation  $a$ ,

$$h \sim 10^{-21} \frac{100 \text{ Mpc}}{\boxed{d_L}} \frac{\boxed{M}}{1.4 M_\odot} \frac{R_S}{\boxed{a}}$$

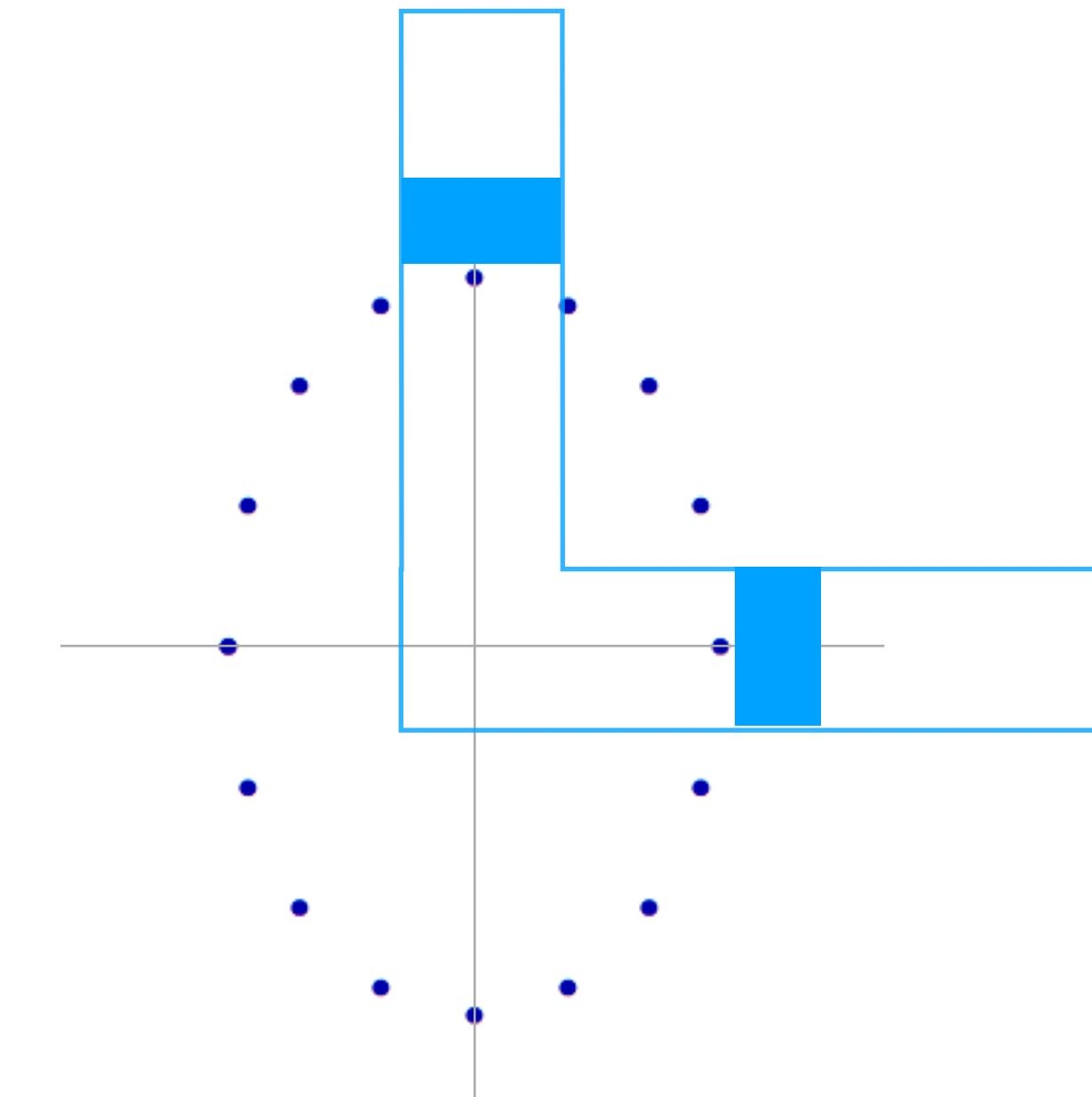


Massive objects orbit

$$f_{GW} = 2f_{\text{orb}}$$

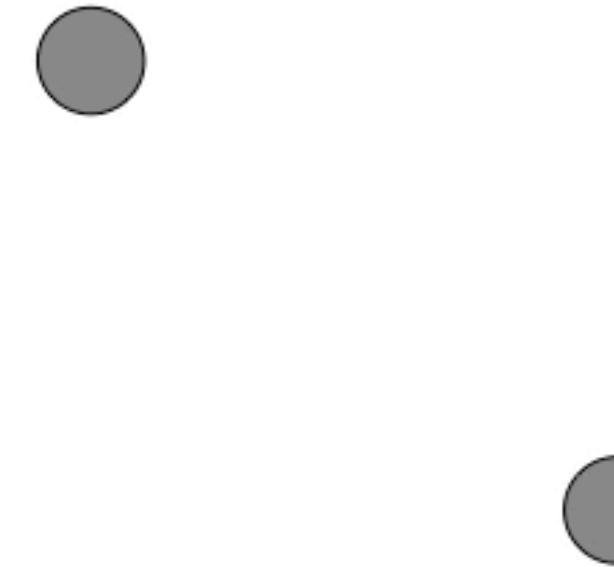
Response of test  
masses

Size of BH with mass  $M$   
 $R_S = 2GM/c^2$



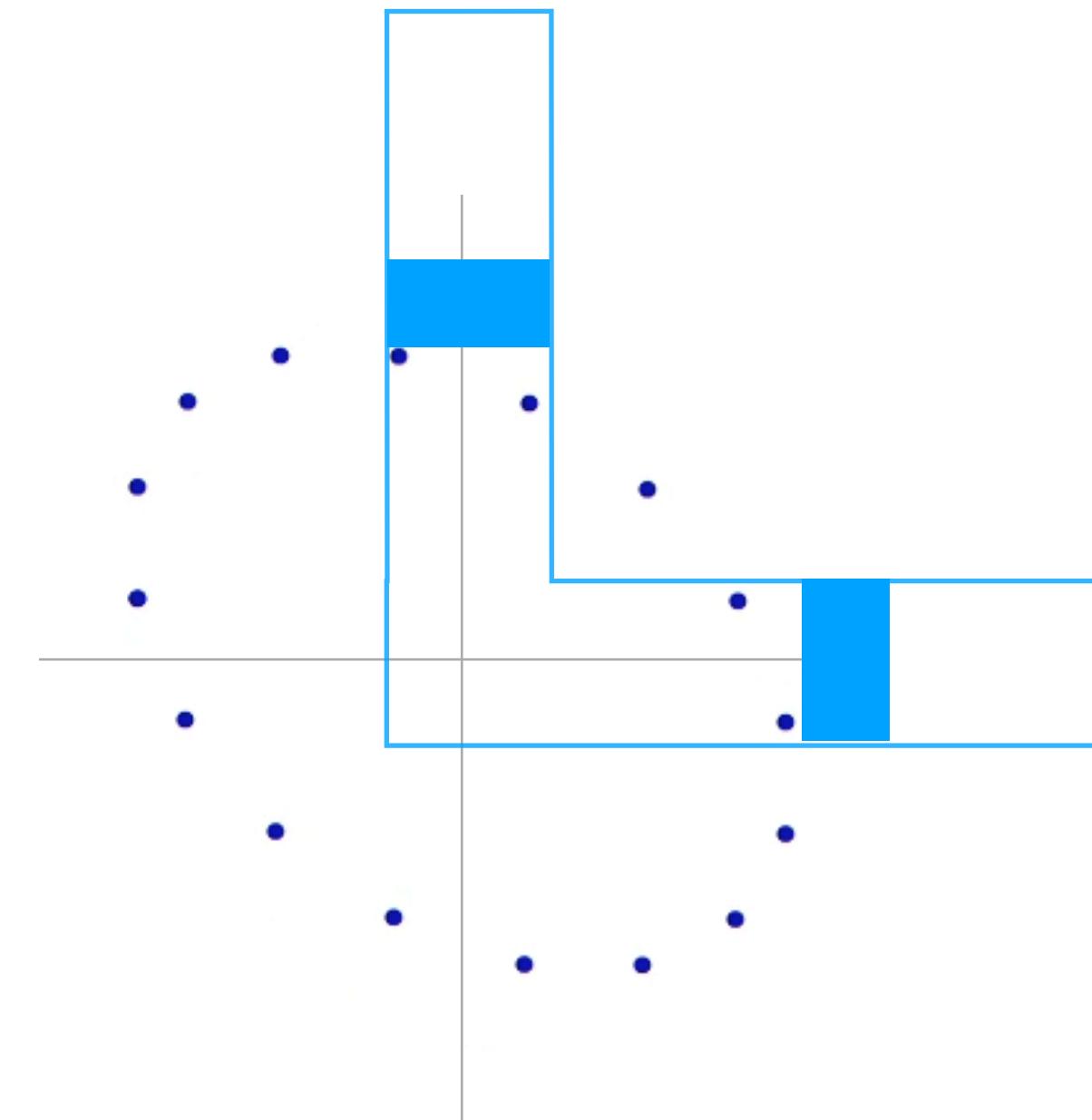
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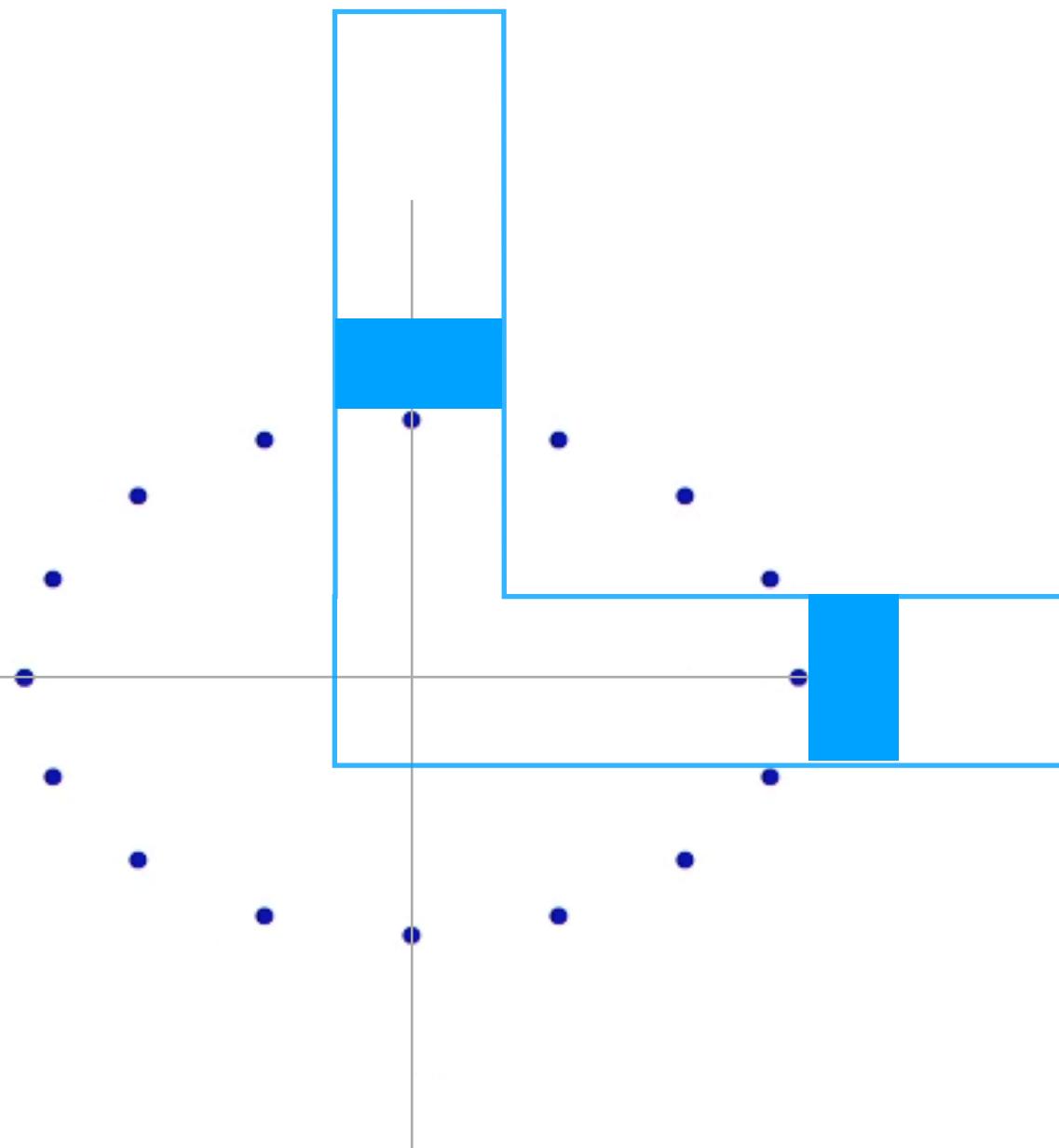
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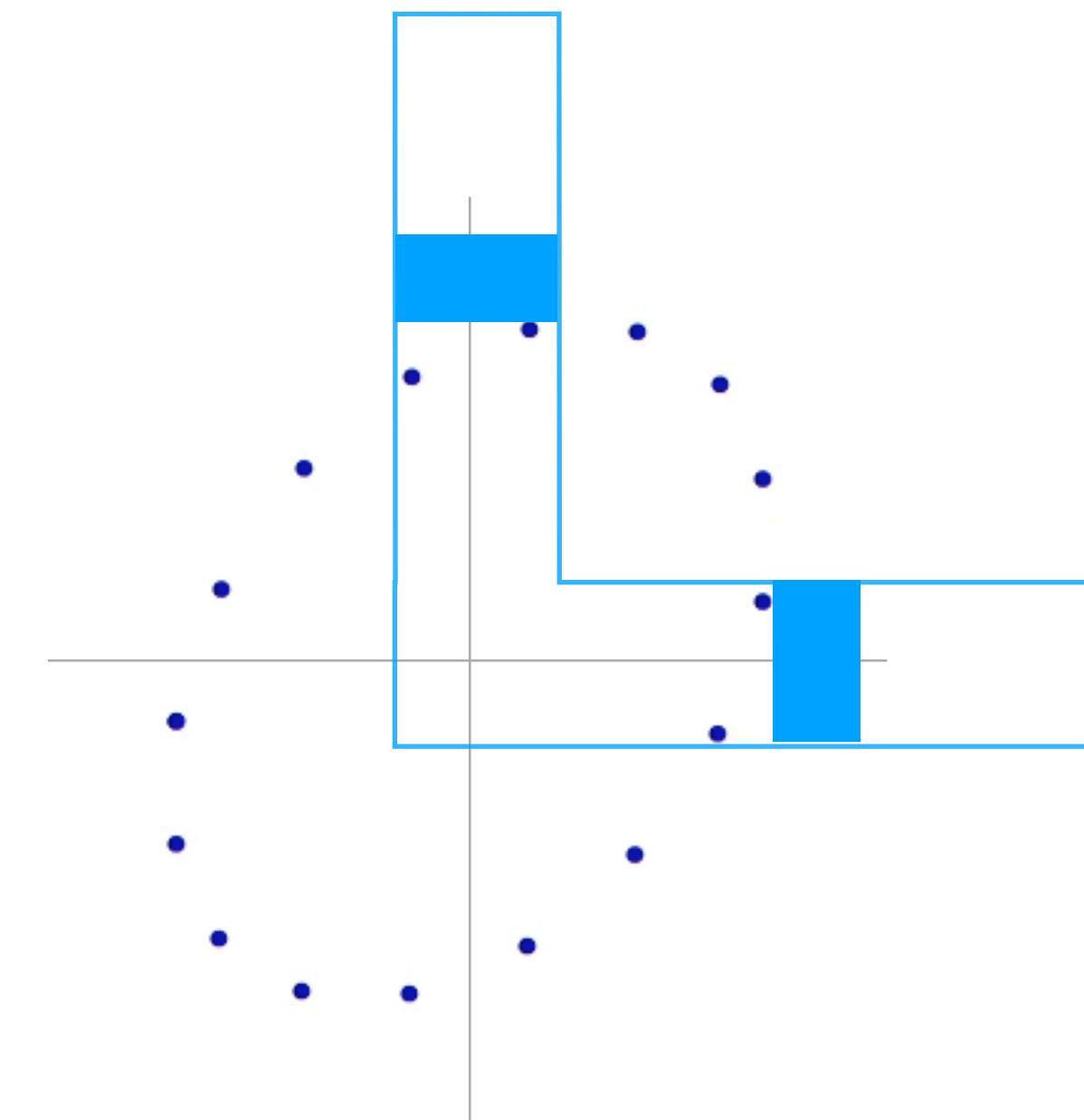
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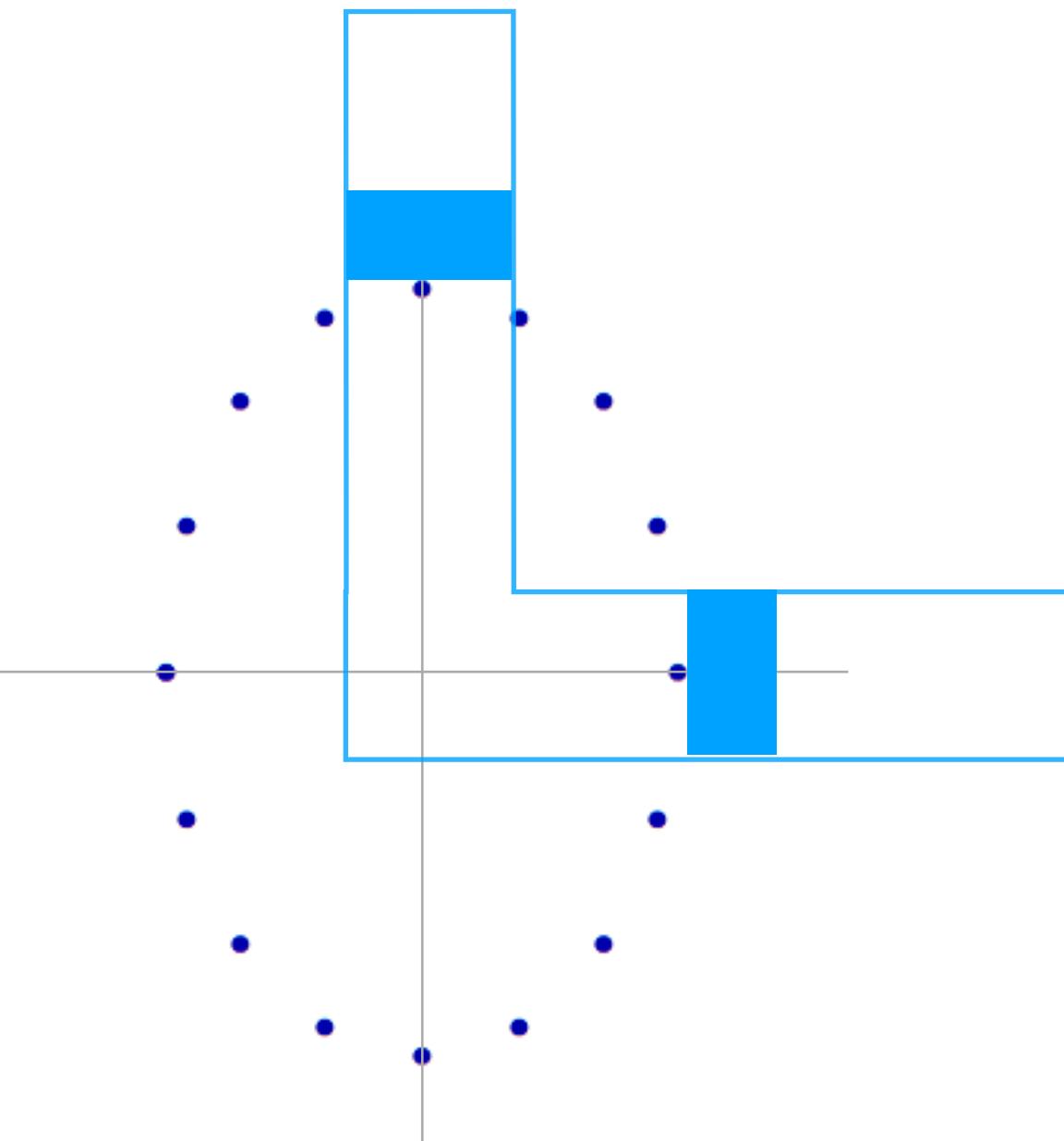
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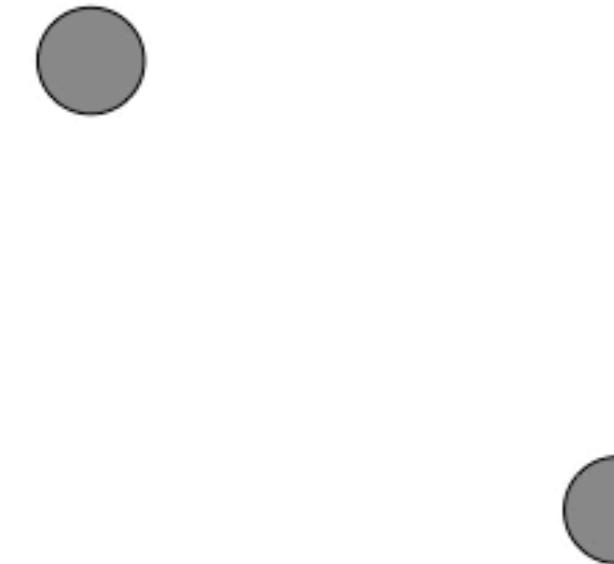
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Response of test  
masses

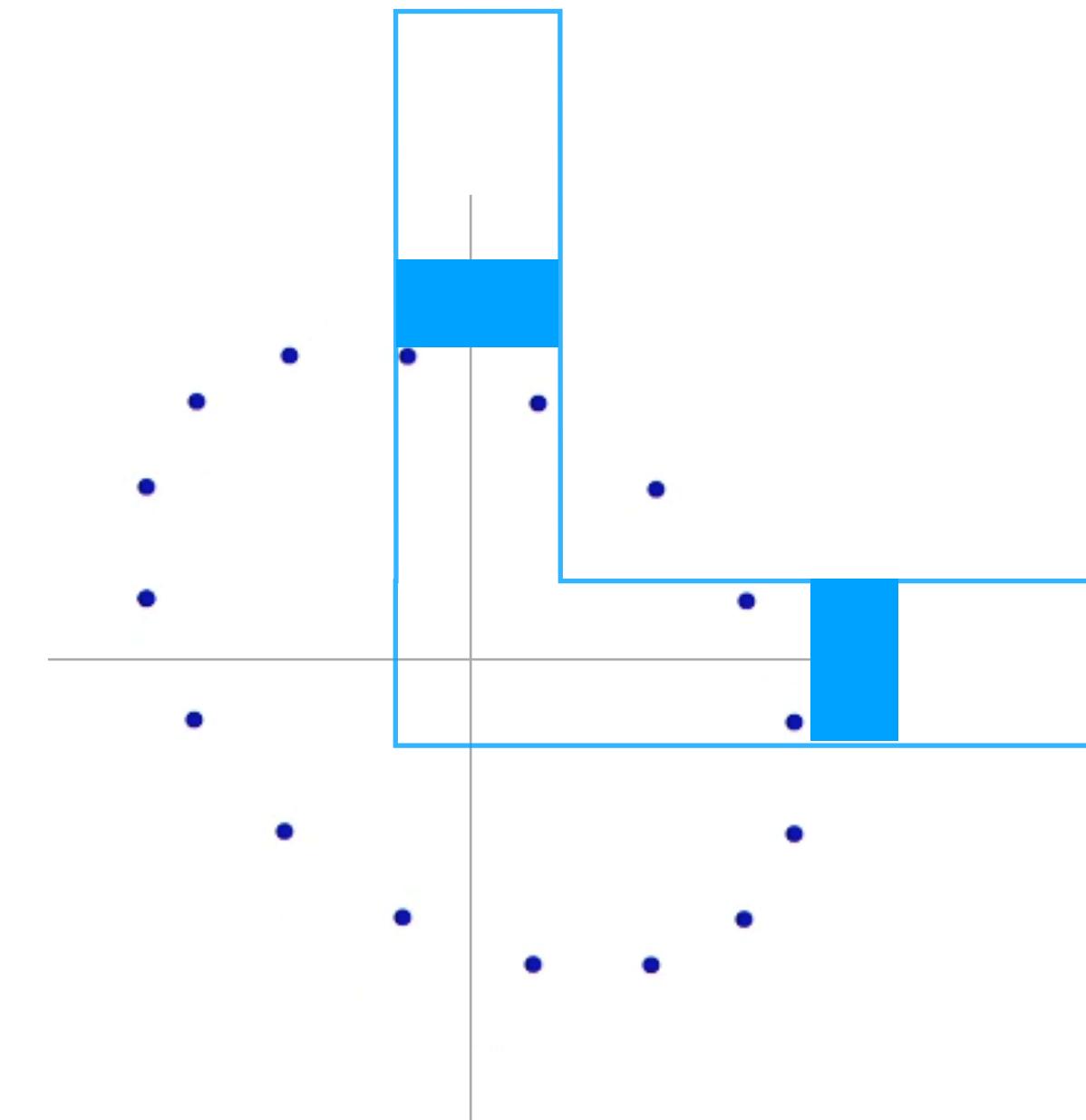
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Response of test  
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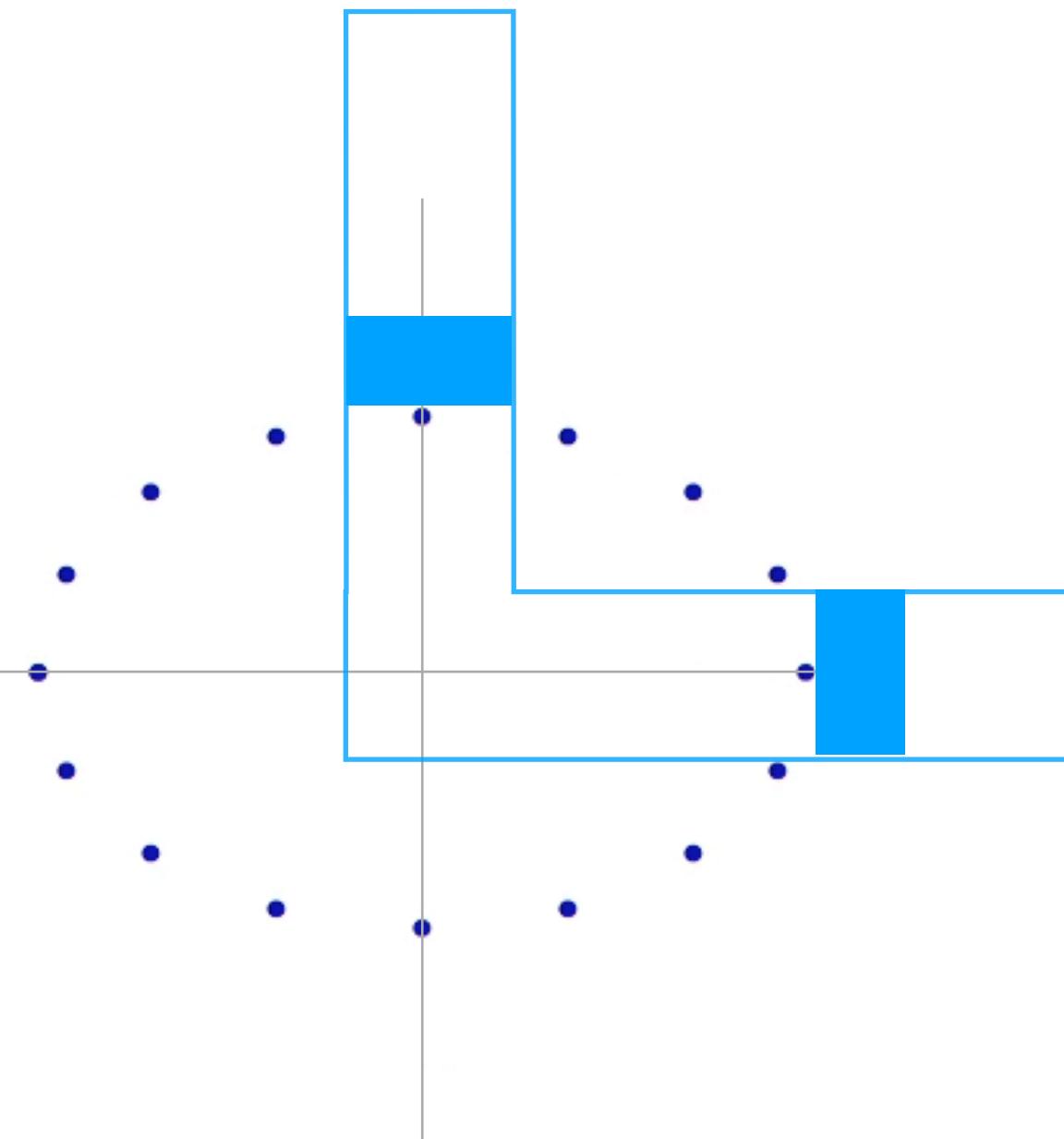
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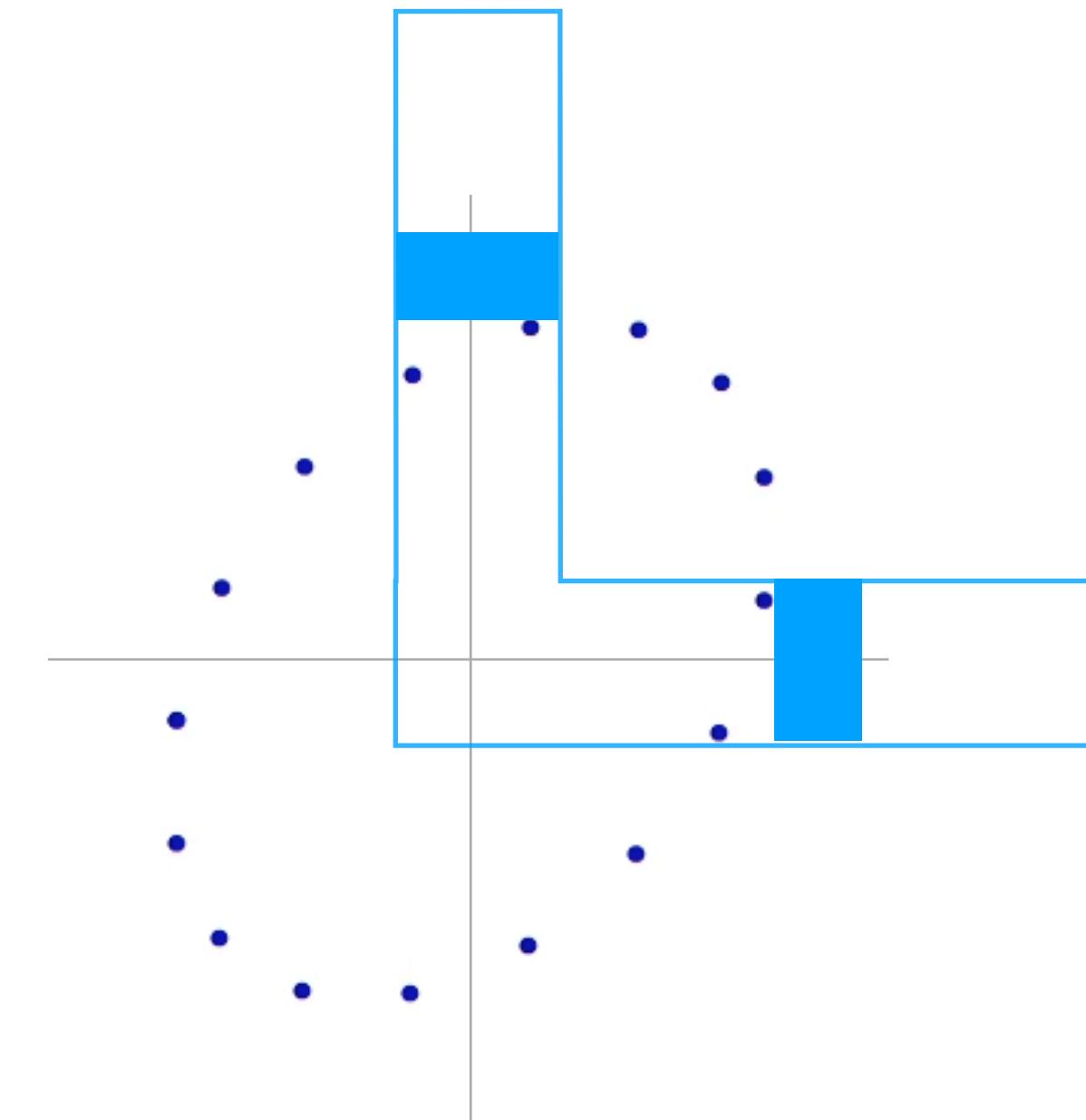
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Response of test  
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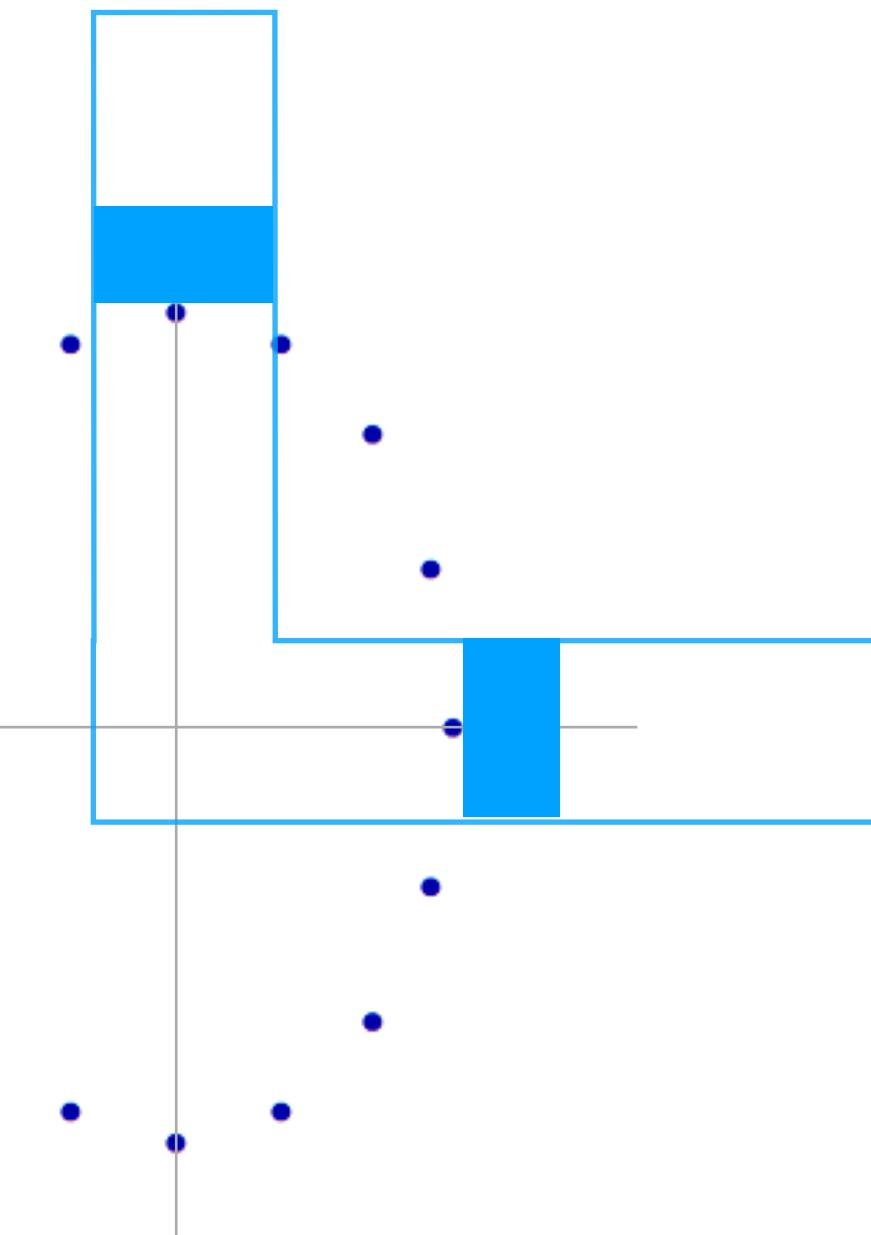
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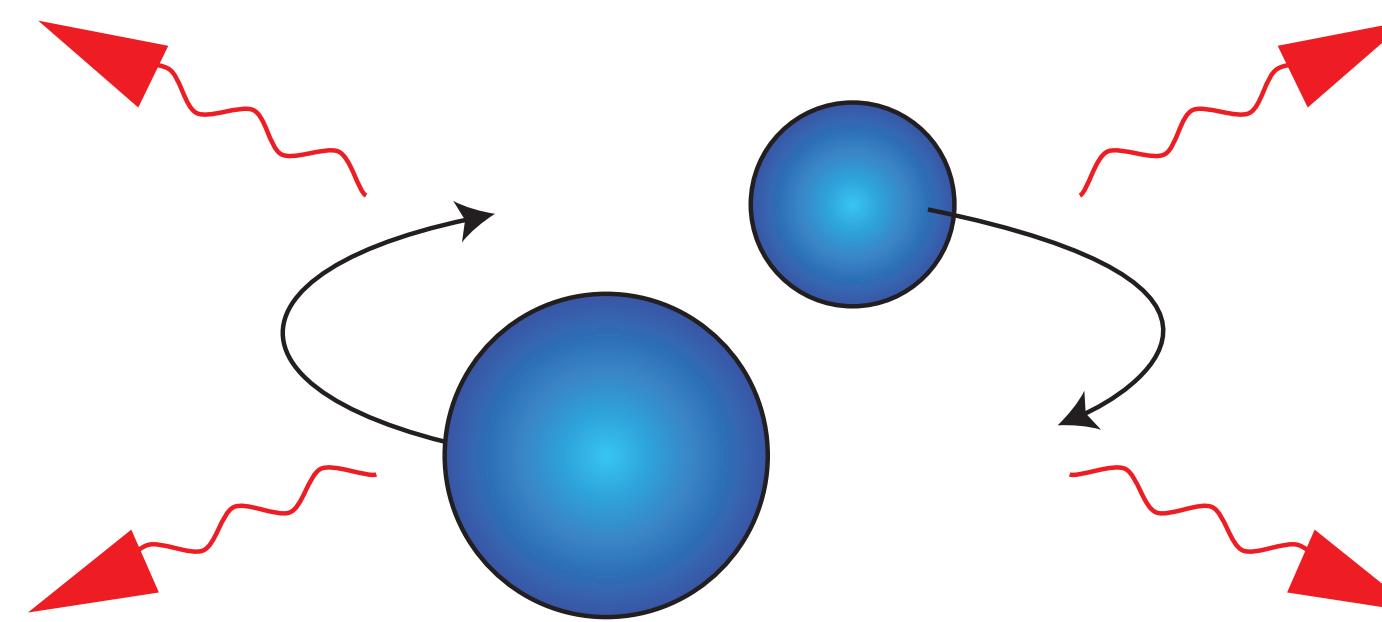
Massive objects orbit

Response of test  
masses



# Binary luminosity

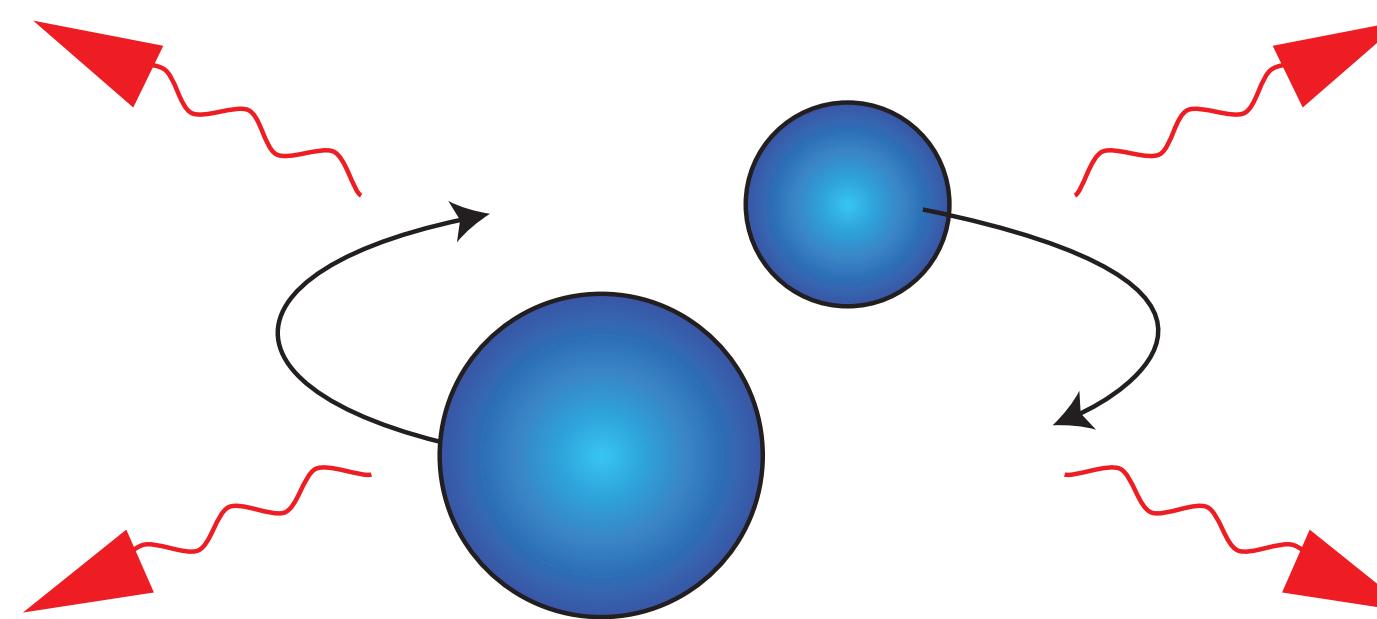
Binary schematic:  
Dave Tsang



$$\frac{dE}{dt} = \mathcal{L}_{GW} \sim 10^{59} \text{ erg s}^{-1} \frac{R_S}{a}$$

# Binary luminosity

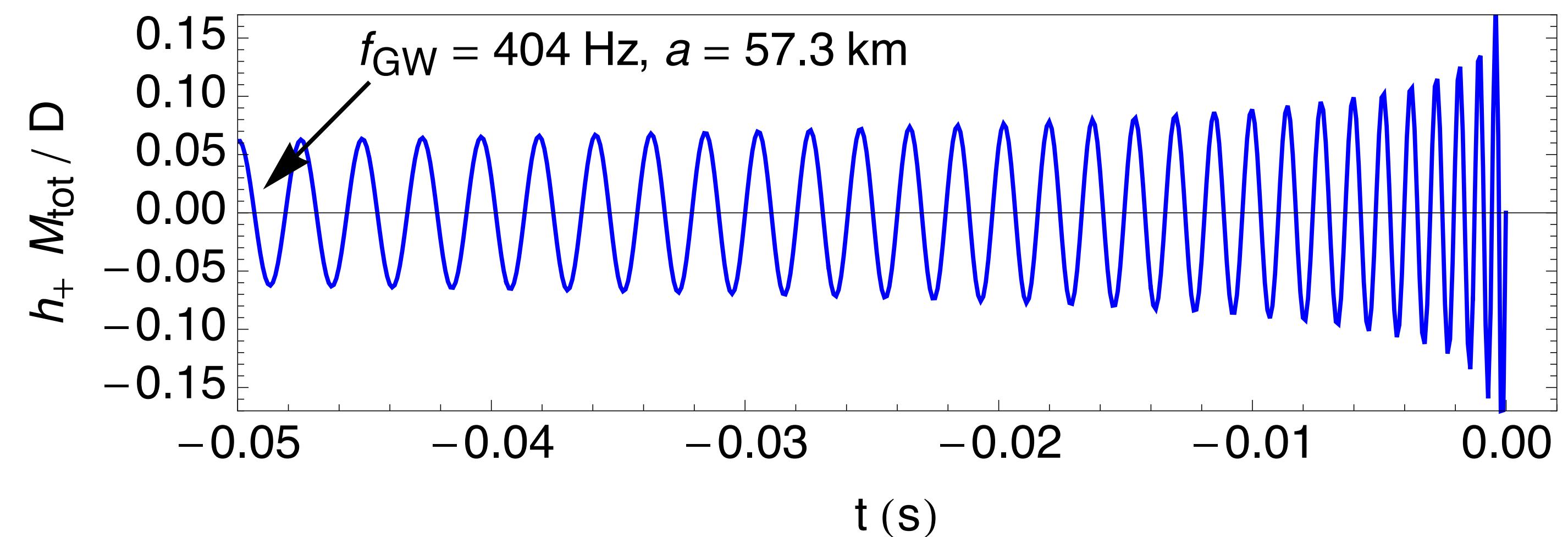
Binary schematic:  
Dave Tsang



$$\frac{dE}{dt} = \mathcal{L}_{GW} \sim 10^{59} \text{ erg s}^{-1} \frac{R_S}{a}$$

Energy balance: the “chirp”

$$\frac{da}{dt} = \frac{-\mathcal{L}_{GW}}{dE_{orb}(a)/da}$$



# Imprint of matter

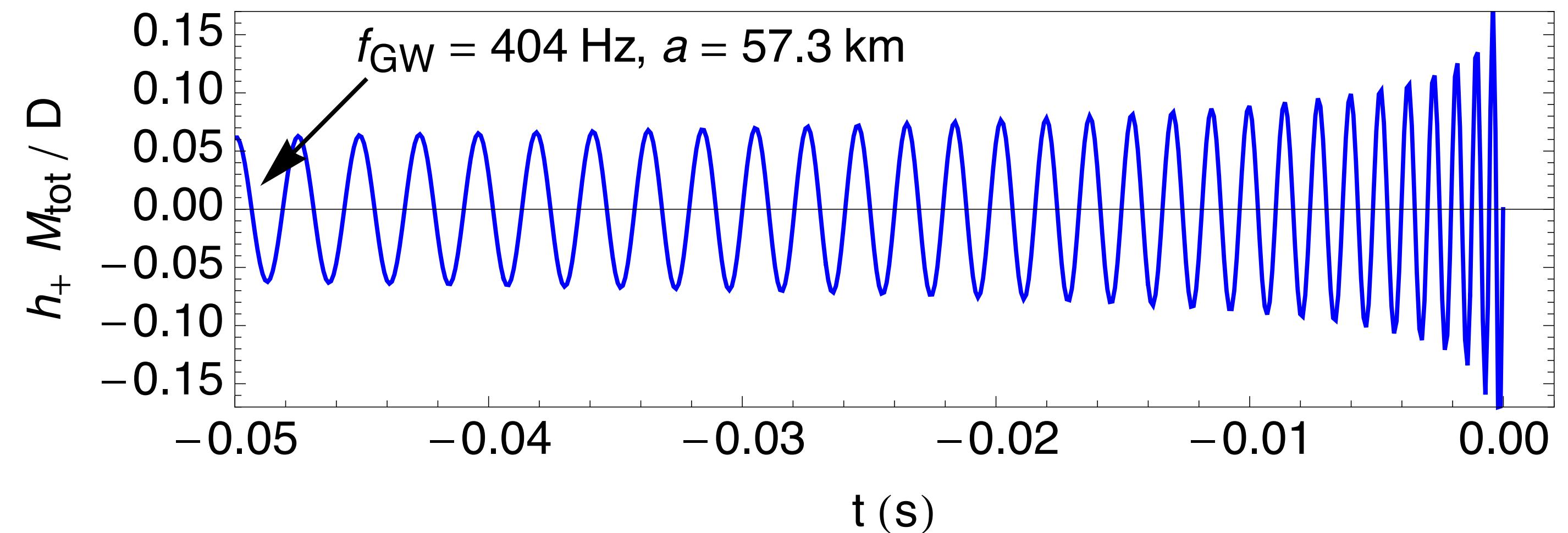
Surface contours:

NS simulation,  
David Radice



$$\frac{da}{dt} = \frac{-\mathcal{L}_{GW}}{dE_{orb}(a)/da}$$

- Orbital energy lost to the deformation of the stars
- Tidal bulges add a little quadrupole luminosity
- Both  $\propto \Lambda$  of stars:  $\Lambda_i = \frac{\lambda_i}{m_i^5} = \frac{2}{3}k_2 \left(\frac{R_i}{m_i}\right)^5$



# Imprint of matter

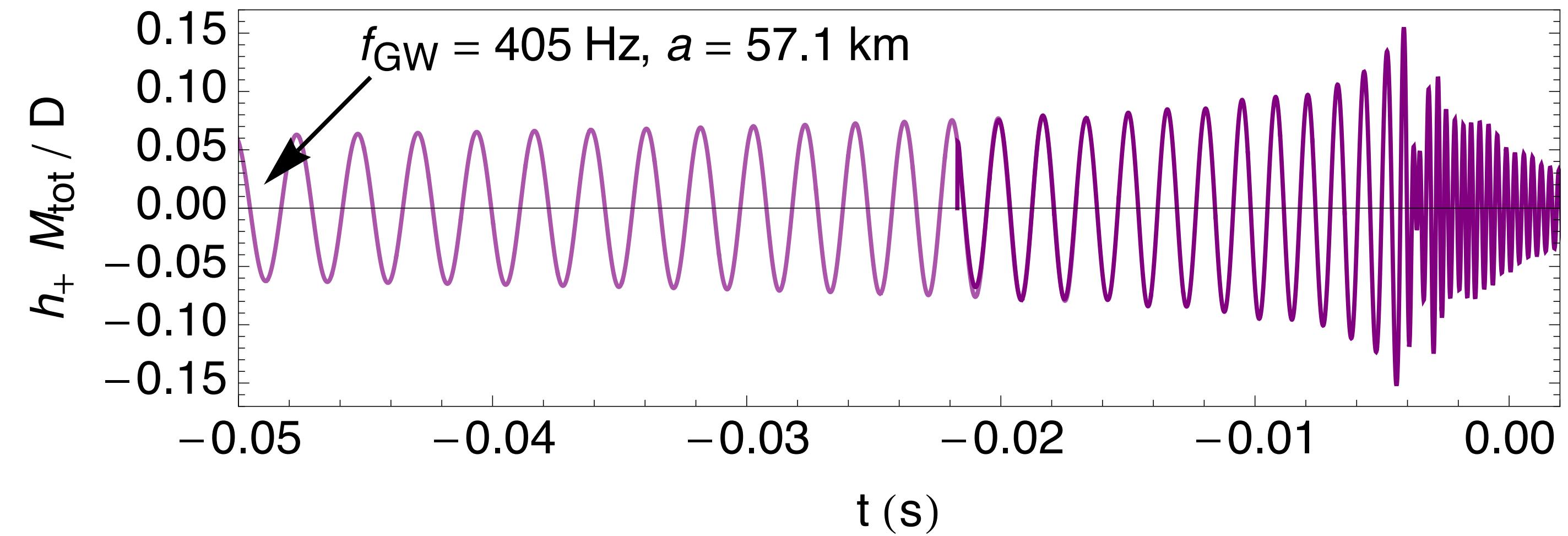
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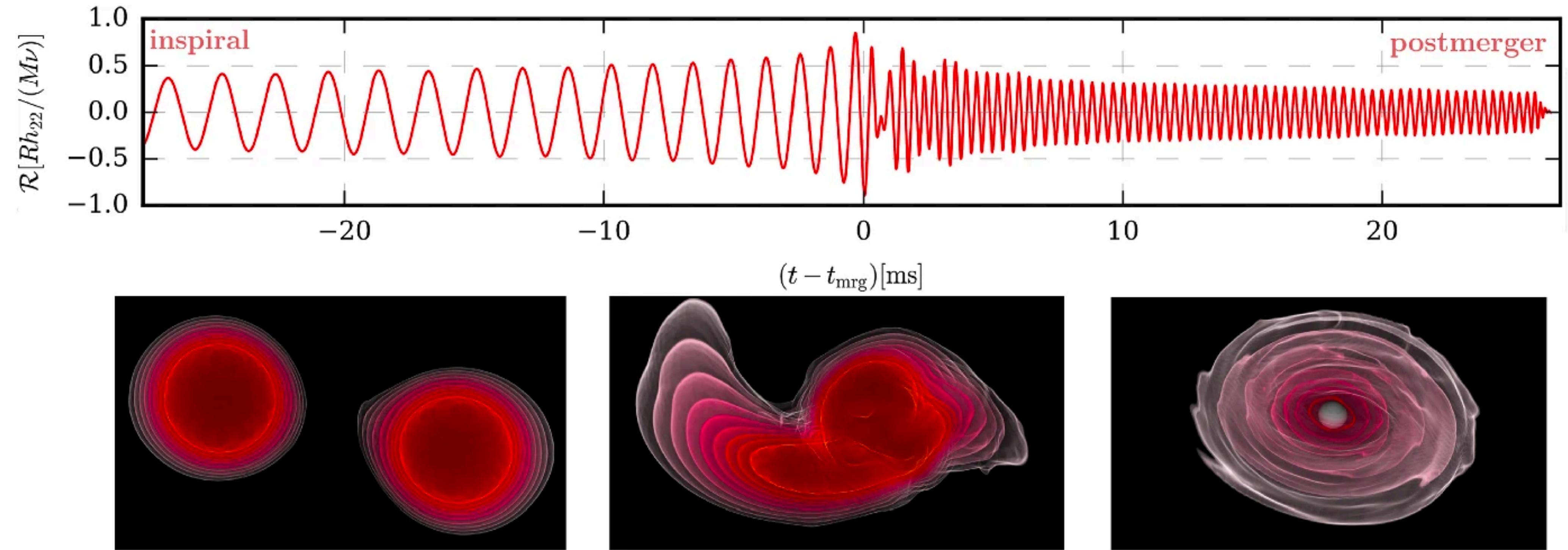
NS simulation,  
David Radice



$$\frac{da}{dt} = \frac{-\mathcal{L}_{GW} - \mathcal{L}_{GW,def}}{dE_{orb}(a)/da + dE_{def}(a)/dr}$$

- Orbital energy lost to the deformation of the stars
- Tidal bulges add a little quadrupole luminosity
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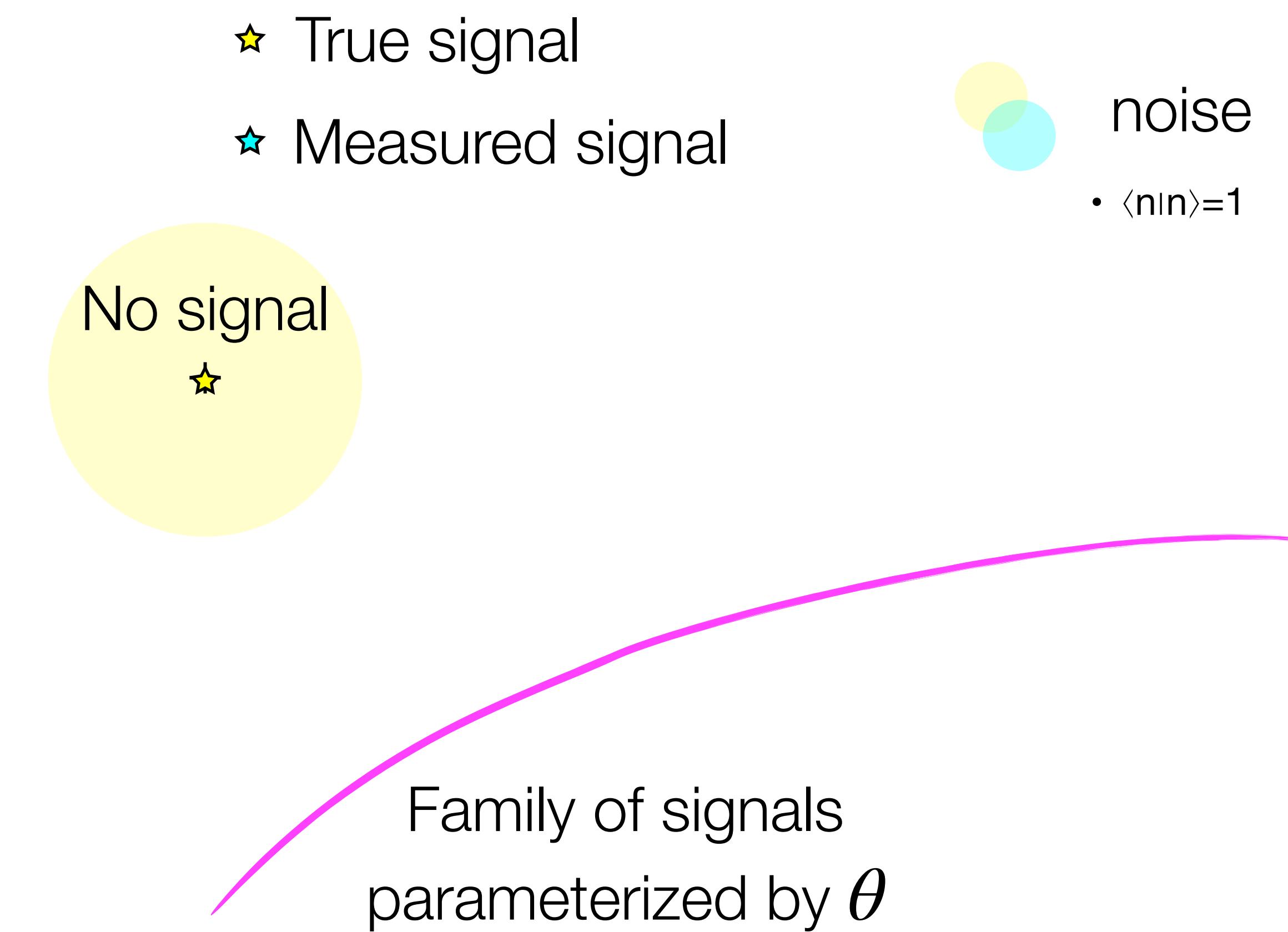


Dietrich, T., Hinderer, T. & Samajdar, A. Gen  
Relativ Gravit 53, 27 (2021)

- Stars deform in complicated, close interactions:
  - stars are not isolated, deformations are not linear, deformations are not pure quadrupole, star response is dynamic ...
- GW analysis currently uses  $\Lambda_1, \Lambda_2$  as *effective* matter descriptors in gravitational-wave models based on numerical simulation and high-order analytical expressions

# Inference from GW observations

- $\mathbf{d}_{\text{data}} = \mathbf{h}_{\text{signal}} + \mathbf{n}_{\text{noise}}$
- Power spectral density of noise  $S_n(f)$ :  
$$\mathcal{L}(\mathbf{n}) \propto \exp \left( - \sum_i 2\Delta f \frac{|n_i|^2}{S_n(f_i)} \right)$$
- Likelihood of data given a candidate signal :  
$$\begin{aligned} \mathcal{L}(\mathbf{d} | \mathbf{h}) &\propto \exp \left( - \sum_i 2\Delta f \frac{|d_i - h_i|^2}{S_n(f_i)} \right) \\ &= \exp(-\langle \mathbf{d} - \mathbf{h}, \mathbf{d} - \mathbf{h} \rangle) \end{aligned}$$
- Inner product in Fourier space;  $\langle \mathbf{n}, \mathbf{n} \rangle = 1$



# Inference from GW observations

- $\mathbf{d}$  data =  $\mathbf{h}$  signal +  $\mathbf{n}$  noise

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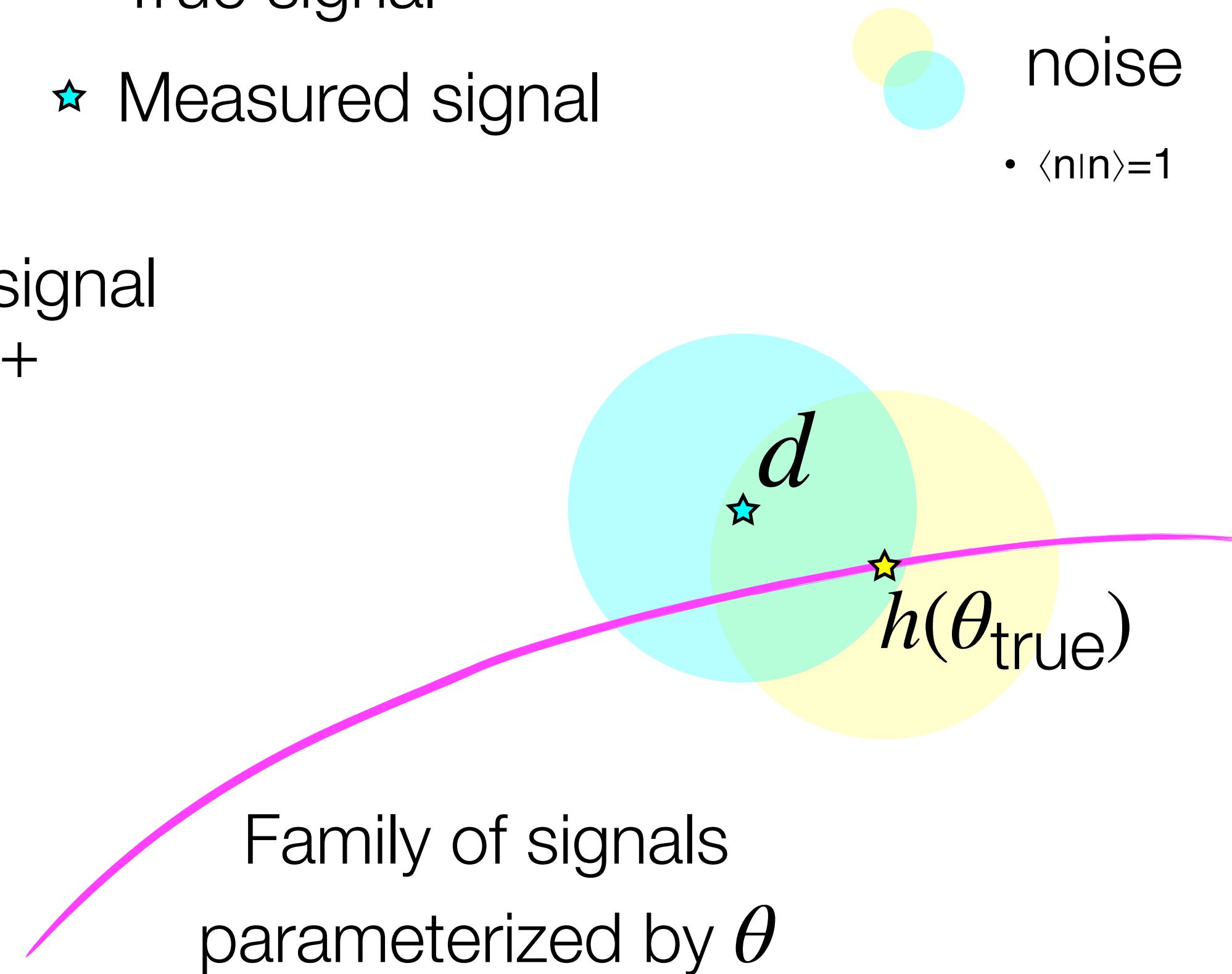
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- Inner product in Fourier space;  $\langle \mathbf{n}, \mathbf{n} \rangle = 1$

- ★ True signal
- ★ Measured signal

No signal  
+



# Inference from GW observations

- $d_{\text{data}} = h_{\text{signal}} + n_{\text{noise}}$

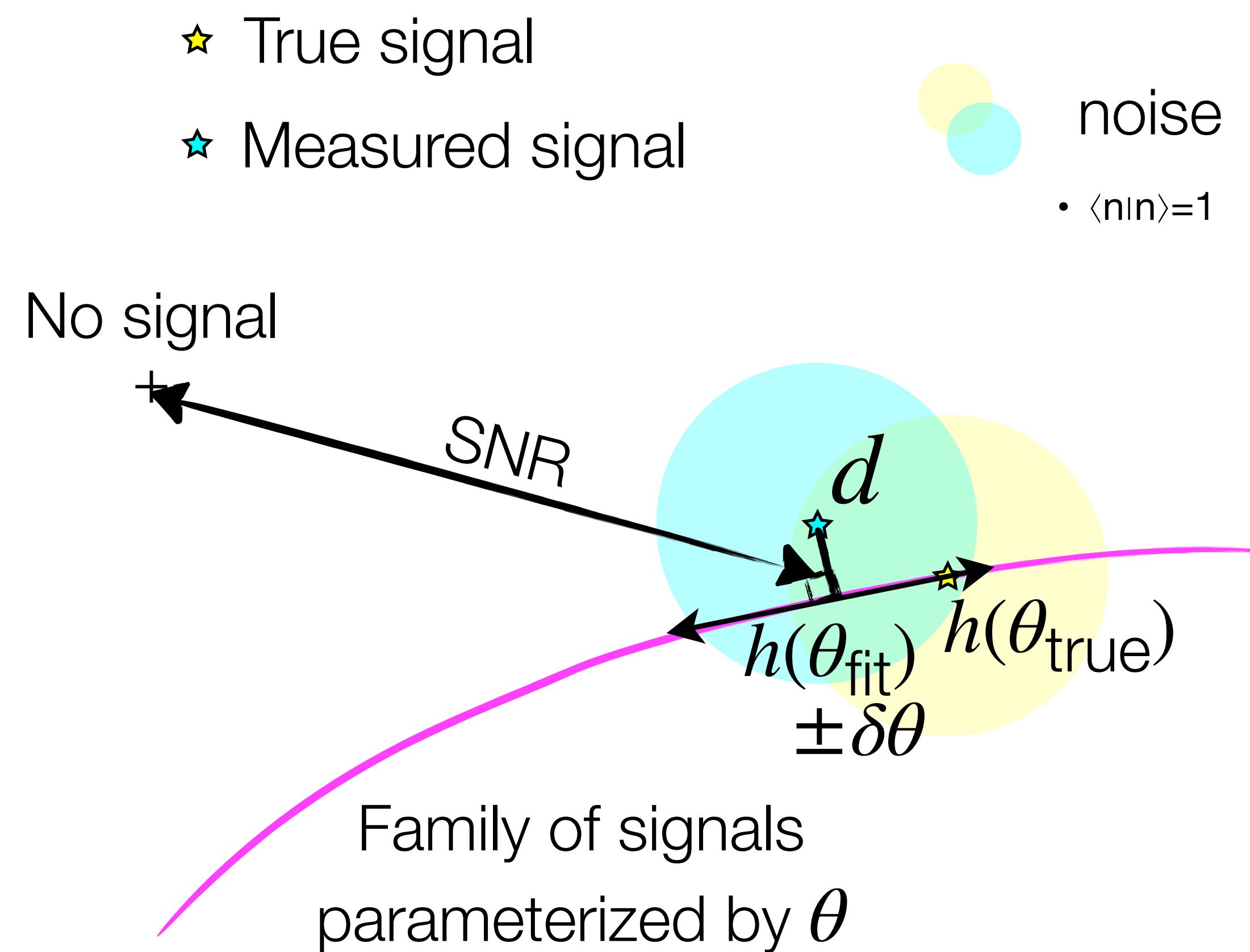
- Power spectral density of noise  $S_n(f)$ :

$$\mathcal{L}(n) \propto \exp \left( - \sum_i 2\Delta f \frac{|n_i|^2}{S_n(f_i)} \right)$$

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- Inner product in Fourier space;  $\langle n, n \rangle = 1$



# Sources of systematics

- e.g. Vitale et al 2012 Phys. Rev. D **85**, 064034, Ling Sun et al 2020 Class. Quantum Grav. **37** 225008, Essick Phys. Rev. D **105**, 082002

Detector Calibration

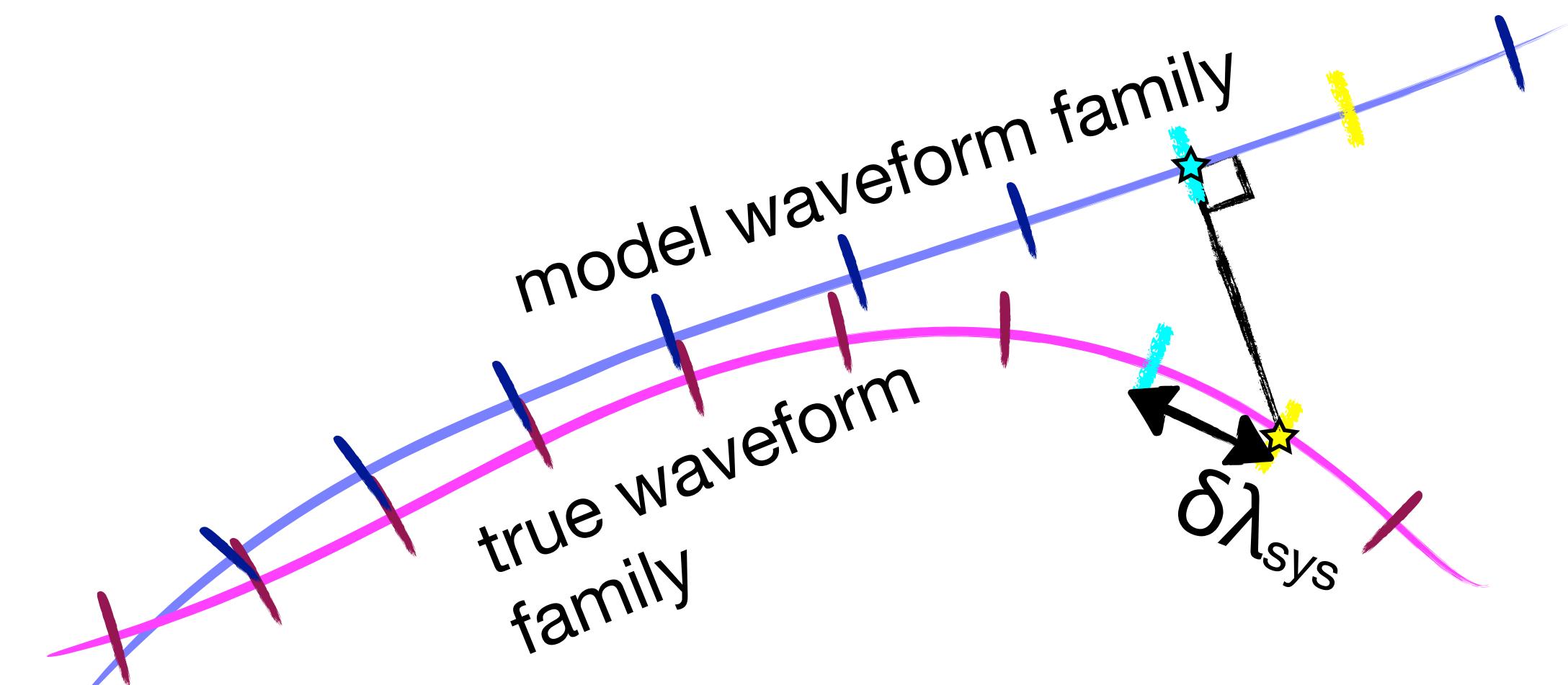
$$\mathcal{L}(d|\theta) \propto \exp \left( - \sum_k \frac{2 |d_k - h_k(\theta)|}{S_k} \right)$$

Source models

Non-Gaussian noise distribution

Noise amplitude estimation

- ★ True waveform
- True parameter value
- ★ Best-fit model
- Best-fit parameter value

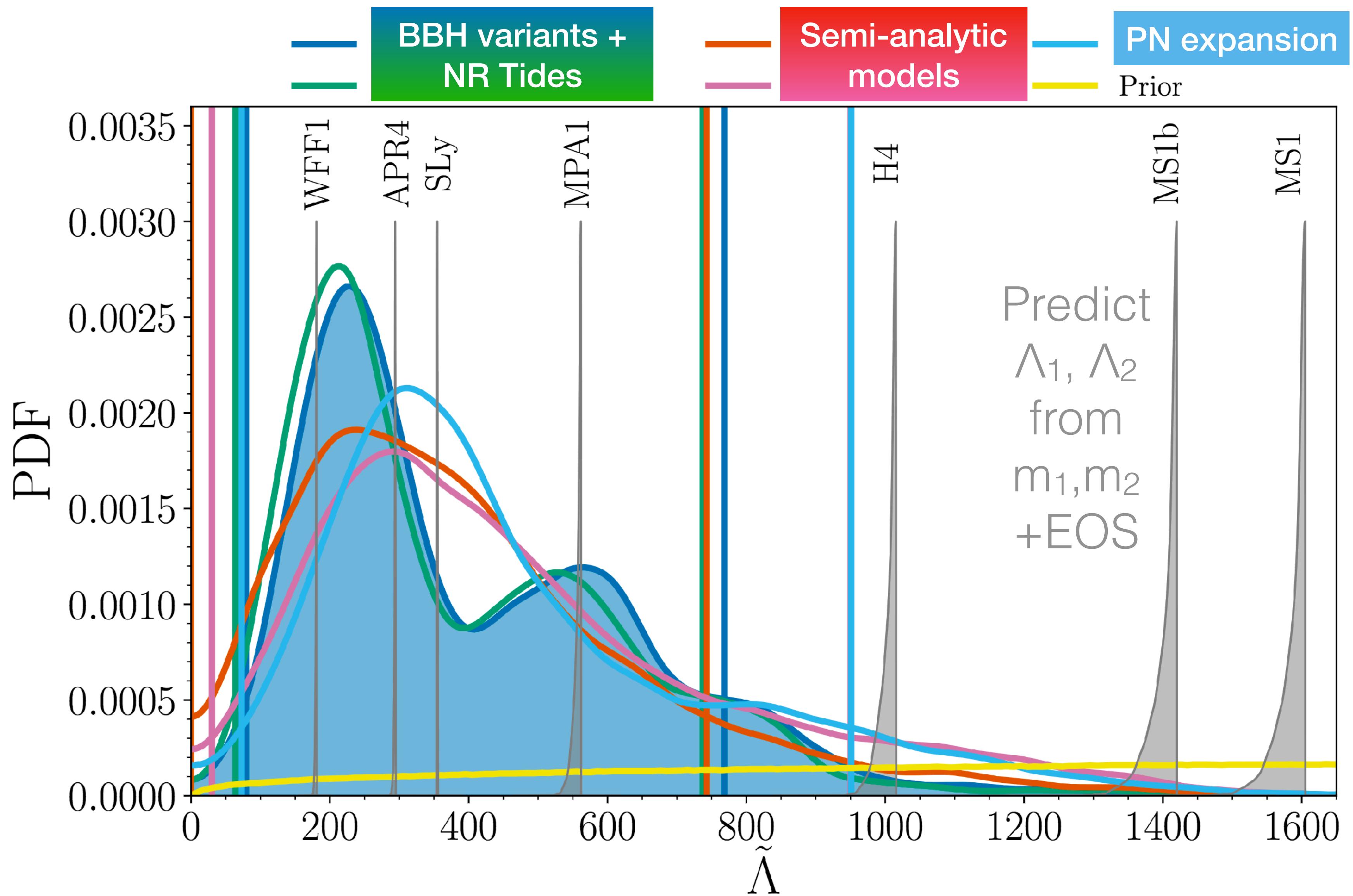


e.g. “glitches”  
Sophie Hourihane et al Phys. Rev. D **106**, 042006, Chris Panków et al, Phys. Rev. D **98**, 084016 (2018)

e.g. Sylvia Biscoveanu et al Phys. Rev. D **102**, 023008 – Published 6 July 2020, Talbot and Thrane Phys. Rev. Research **2**, 043298

# Waveform systematics:

$$\tilde{\Lambda} = \frac{16}{13} \frac{(m_1 + 12m_2)m_1^4\Lambda_1 + (m_2 + 12m_1)m_2^4\Lambda_2}{(m_1 + m_2)^5}$$



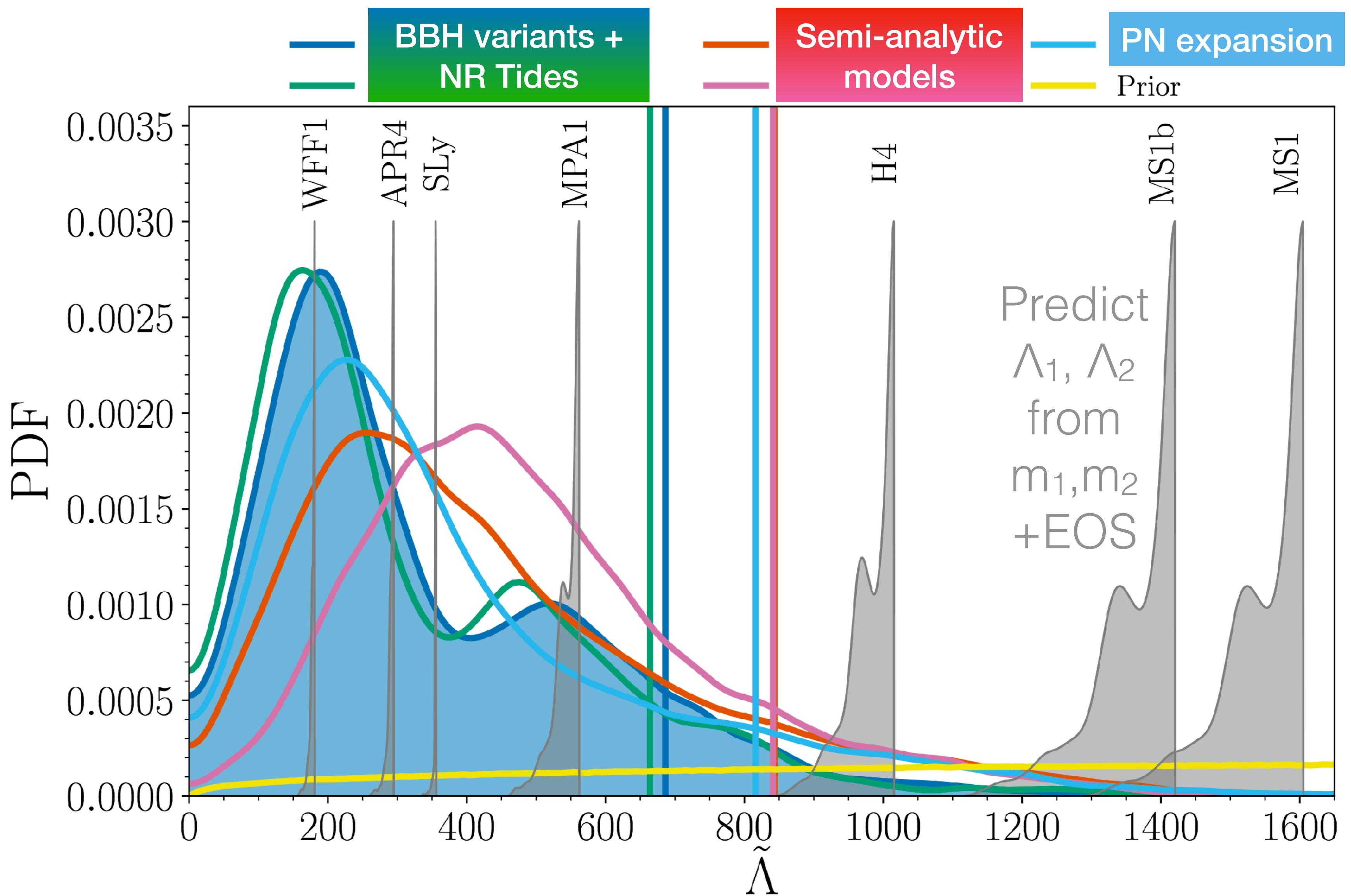
Assume low spin  
( $\chi < 0.05$ )

Fiducial WF:  
 $\tilde{\Lambda} = 330^{+438}_{-251}$

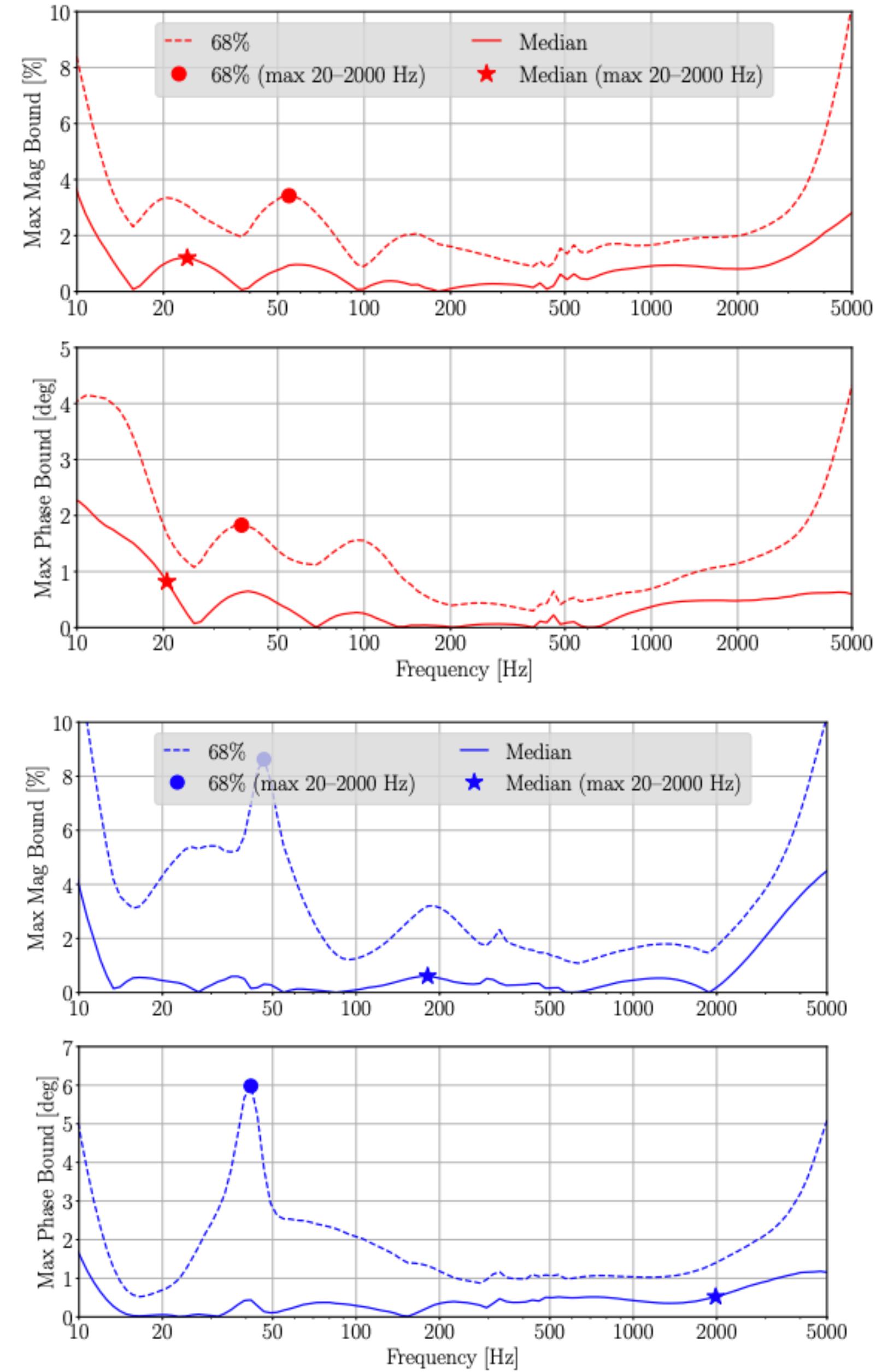
Bars denote 90% highest probability density credible interval

# Waveform systematics:

$$\tilde{\Lambda} = \frac{16}{13} \frac{(m_1 + 12m_2)m_1^4\Lambda_1 + (m_2 + 12m_1)m_2^4\Lambda_2}{(m_1 + m_2)^5}$$



# Model uncertainty: Calibration and marginalization



Sun et al 2020

- $h_{\text{obs}} = h(f)(1 + \delta A(f)) \exp(i\delta\phi(f))$
- Calibration parameters: e.g. spline functions for  $\delta A(f)$  and  $\delta\phi(f)$  with priors calibrated to detector model e.g. Sun et al 2020 Class. Quantum Grav. **37** 225008
- Marginalize over calibration uncertainty during GW inference e.g. Vitale et al 2012 Phys. Rev. D **85**, 064034

# Waveform error: source physics and the observed signal

# From Source to Strain



- Source emission model: Multipole expansion

$$h_+(t) - i h_\times(t) = \sum_{\ell=2}^{\infty} \sum_{m=-\ell}^{\ell} h_{\ell m}(t) Y_{-2}^{\ell m}(\iota, \varphi)$$

Need higher multipoles?  
SPA framework in  
Mezzasoma and Yunes  
2022,  
Hughes et al 2021

- Quadrupole-dominant:  $h_{22}(t) = \mathcal{A}(t)e^{i\psi(t)}$

- Projected onto detectors:

$$h(t) = F_+(\alpha, \delta, \psi_p)h_+(t) + F_\times(\alpha, \delta, \psi_p)h_\times(t)$$

Sky location,  
orientation,  
inclination

- Resulting amplitudes:  $h(t) = \frac{Q(\alpha, \delta, \iota, \psi)}{d_L} \mathcal{A}(t)e^{i\psi(t)}$

“Intrinsic properties”

# Intrinsic physics of a GW signal

- Source model  $h_{22}(t) = \mathcal{A}(t)e^{i\psi(t)}$  has **instantaneous frequency**:  $2\pi F(t) = \dot{\psi}(t)$
- Source masses, spins, tides: **encoded in characteristic functions** of  $F$ :

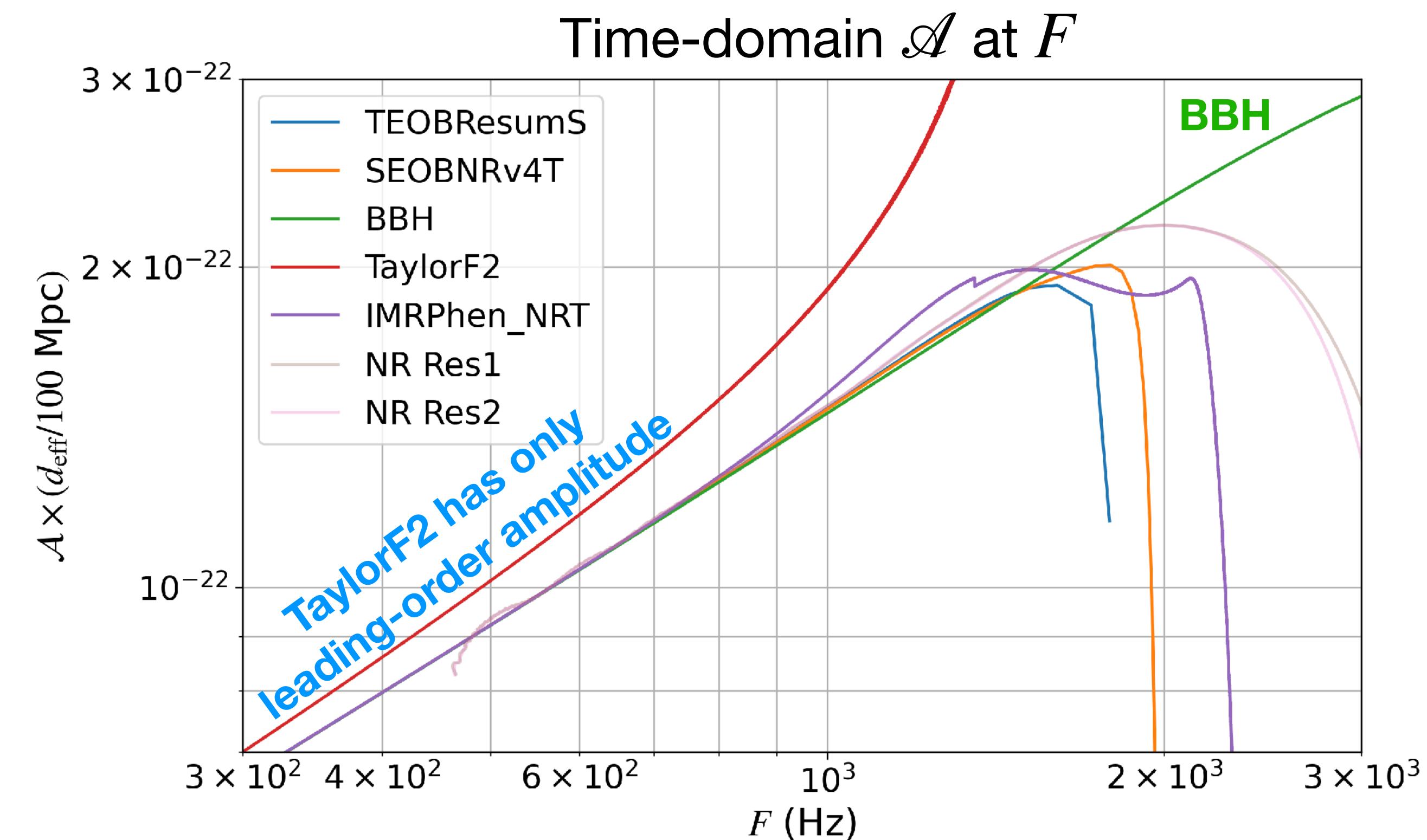
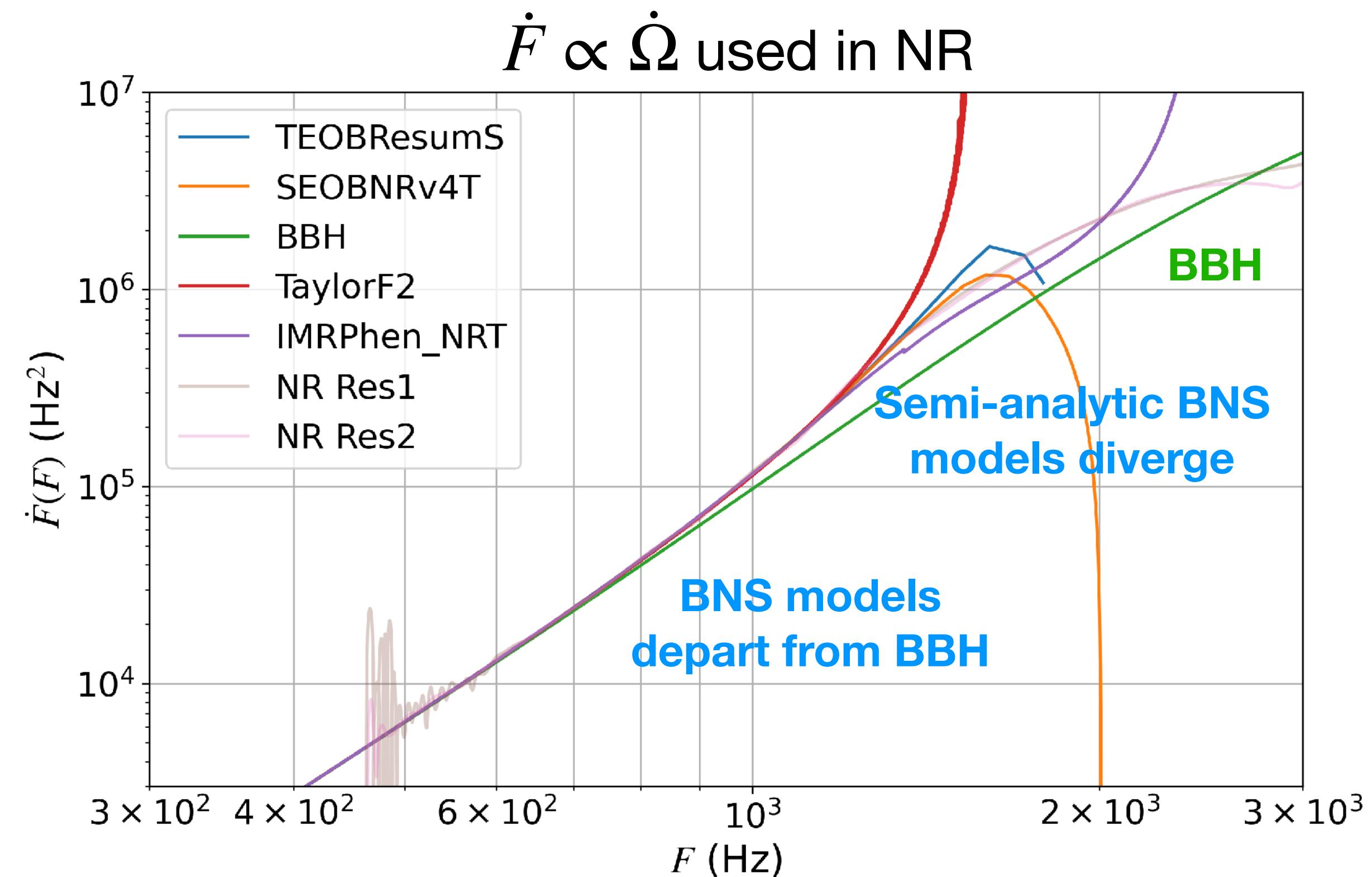
$$\mathcal{A}(F) \equiv \mathcal{A}(T(F)) \quad \text{and} \quad \dot{F}(F) \equiv dF/dT$$

- Signal  $\tilde{h}(f) = A(f)e^{i\phi(f)}$  from  $\mathcal{A}$ ,  $\phi_c$ ,  $t_c$  and integration of  $dT/dF$

$$A(f) = Q(\theta_{\text{ext}})\sqrt{T'(f)}\mathcal{A}(f)$$

$$\phi(f) = \frac{\pi}{4} + \psi(f) - 2\pi f T(f) = \phi_c - 2\pi f t_c + 2\pi \int_f^{f_c} df \int_{\tilde{f}}^{f_c} \frac{dF}{\dot{F}(F)} s$$

# Where do we model the physics well?



NR - high-res CoRe sim ‘BAM:0095’ with SLy EOS  
 Spline smoothing for  $F$  before taking derivative  
 $m_1$  &  $m_2$ : 1.349998 for all waveforms shown

From Sly:  $\Lambda_1$  &  $\Lambda_2 = 390.1104$   
 used for TEOBResumS, SEOBNRv4T,  
 TaylorF2, and IMRPhenomPv2\_NRT

# Energetics Interpretation

**Luminosity and  $\mathcal{A}$ :**

$$\mathcal{A}(F)^2 = \frac{4}{\pi} \frac{1}{d^2} \frac{1}{F^2} \mathcal{L}_{\text{GW}}(F) \text{ from integration of } |\dot{h}_{\ell m} d|^2$$

**Energy balance and  $\dot{F}$ :**

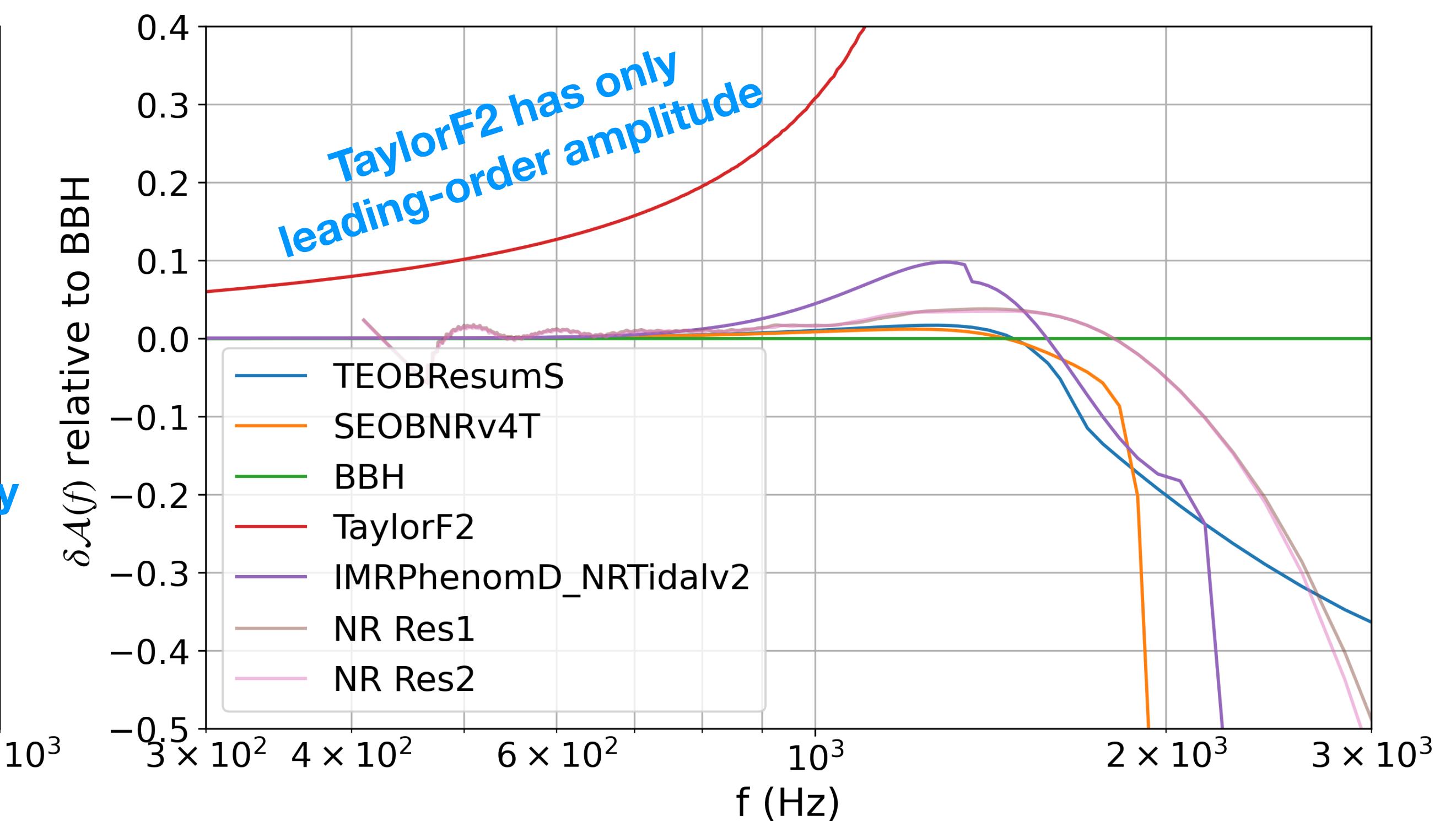
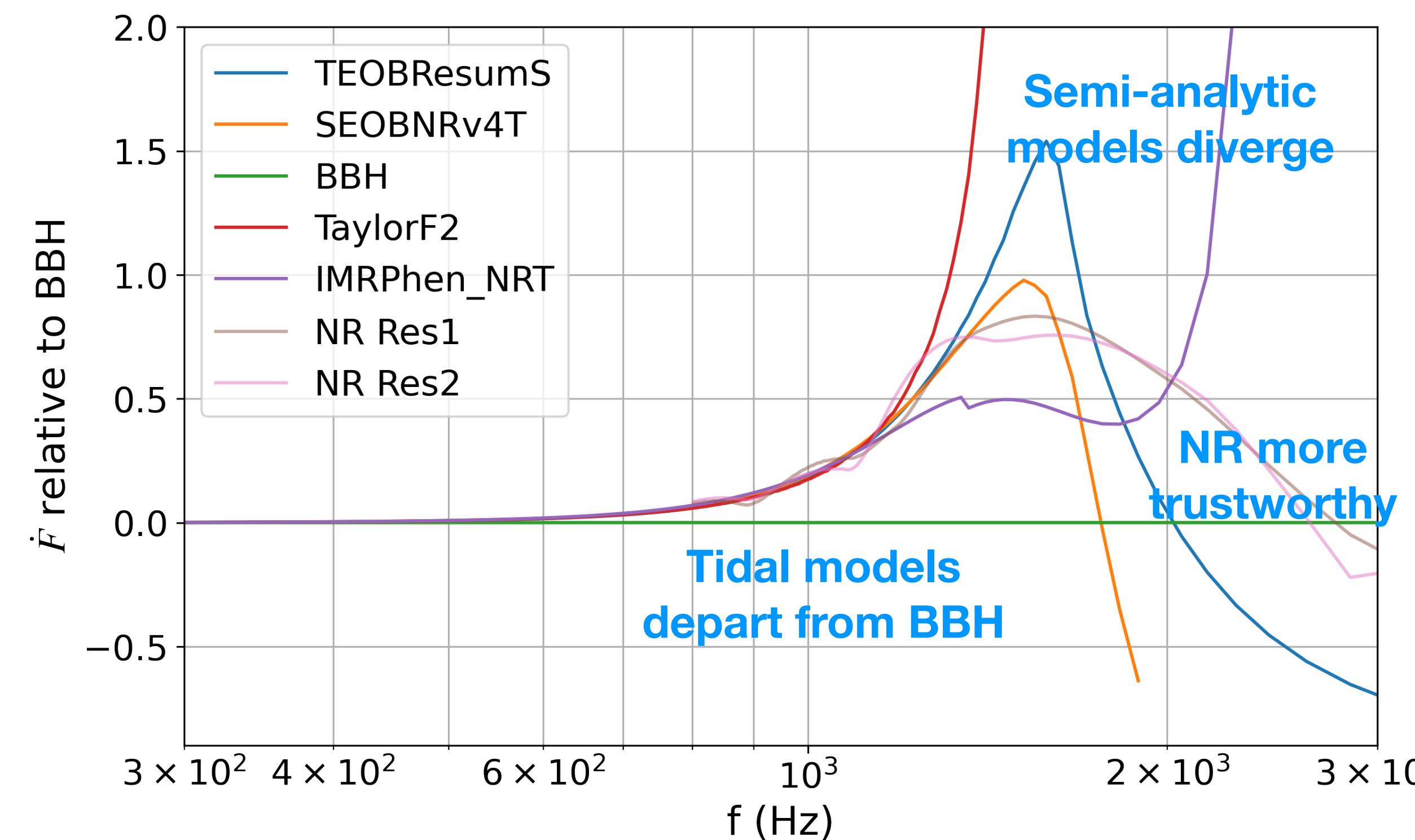
$$\dot{F}(F) = -\frac{\mathcal{L}(F)}{E'(F)} \text{ from system energy as function of emission frequency}$$

**Sources of modification:** Variation of  $E(F)$  or  $\mathcal{L}(F)$  from GR source properties, plus

- Additional luminosity  $\mathcal{L}(F)$ : non-GW energy loss  $\mathcal{L}_{MM}$  or  $\mathcal{L}_{NR}$
- Internal energy transfers  $\delta E_A, \delta E_D$  that modify how  $E$  changes with  $F$ :

$$\delta E' = \delta E_A + \frac{t_A}{t_D} \delta E_D \quad (A \text{ adiabatic, } D \text{ dynamic, } t \text{ timescales})$$

# Differences between BBH and BNS



# Energy transfers and the Fourier signal

- If there are small, linearizable corrections to the model used for PE:

$$\delta A(f) = \frac{1}{2} (\delta E' + \delta \mathcal{L}_{\text{GW}} - \delta \mathcal{L}_{\text{MM}})$$

$$\delta \phi(f) = 2\pi \int_f^{f_c} d\tilde{f} \int_{\tilde{f}}^{f_c} dF T'(F) (\delta E' - \delta \mathcal{L}_{\text{GW}} - \delta \mathcal{L}_{\text{MM}})$$

- **Applications:**

- Generically limit unmodeled energy transfers (*not in PE waveform*) in observed systems through constraints on  $\delta A, \delta \phi$ .
- Given a model of astrophysical energy transfer (like a resonant mode), can imprint on *any* underlying waveform model

# Example: Coherent waveform recovery

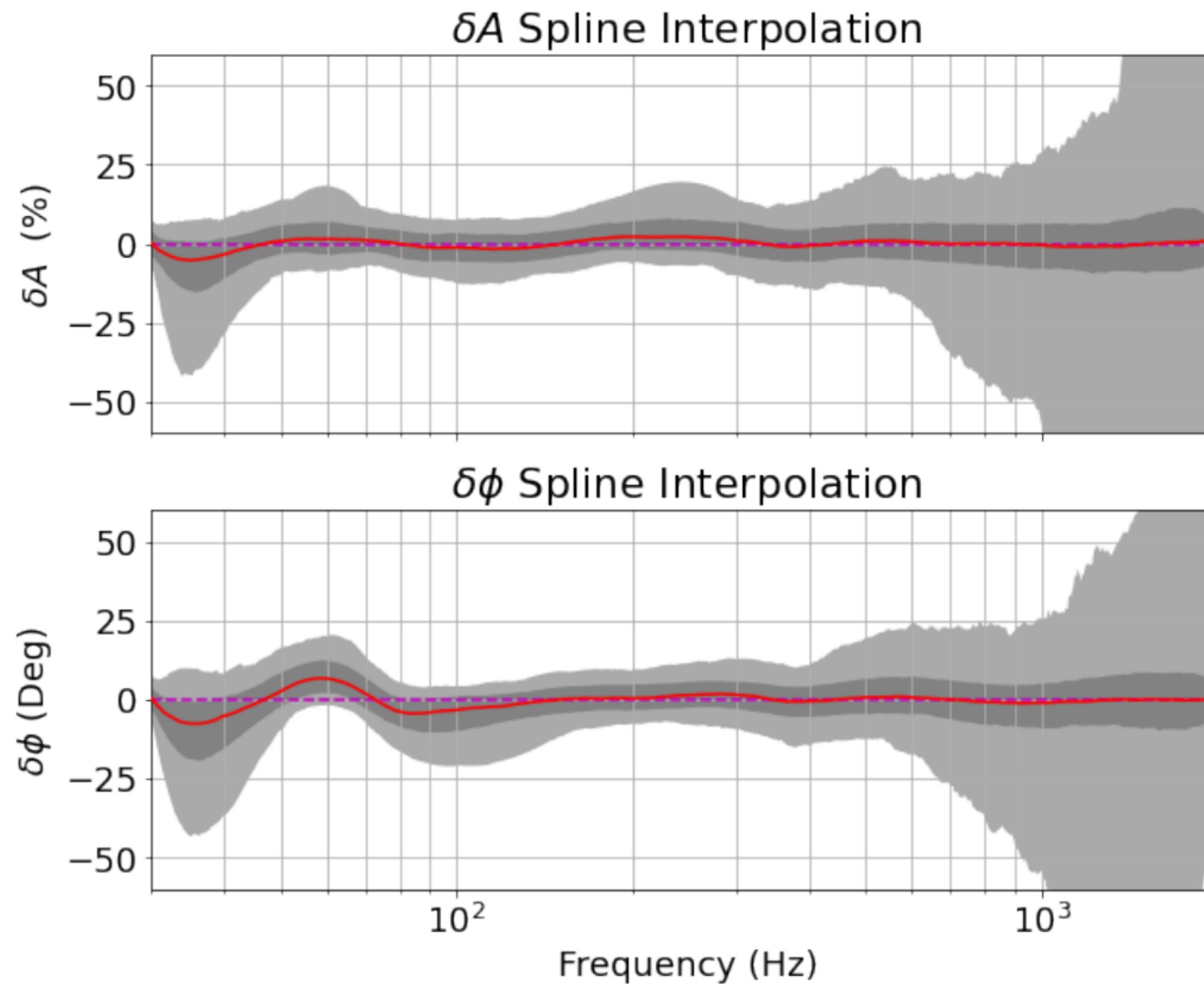


FIG. 12. Spline interpolation of GW170817 with 1 and 2  $\sigma$  credible intervals (grey) and the median spline interpolant (red) shown.

- Edelman et al Phys. Rev. D 103, 042004 (2021): Constraint on coherent departures from waveform model
- Generic signal modification described with splines for  $\delta A$ ,  $\delta \phi$ , constraint for GWTC-1
- **Interpretation with waveform energetics:** GW170817 phase shift  $\delta \phi \sim 5$  deg at 60 Hz is compatible with a **resonant energy transfer** of  $\delta E = \Delta E/E \sim 0.001$  relative to the orbital energy  $E(60\text{ Hz}) \simeq -0.006 M_{\odot} c^2$  (Scale of  $\Delta E \sim 10^{49}$  erg)

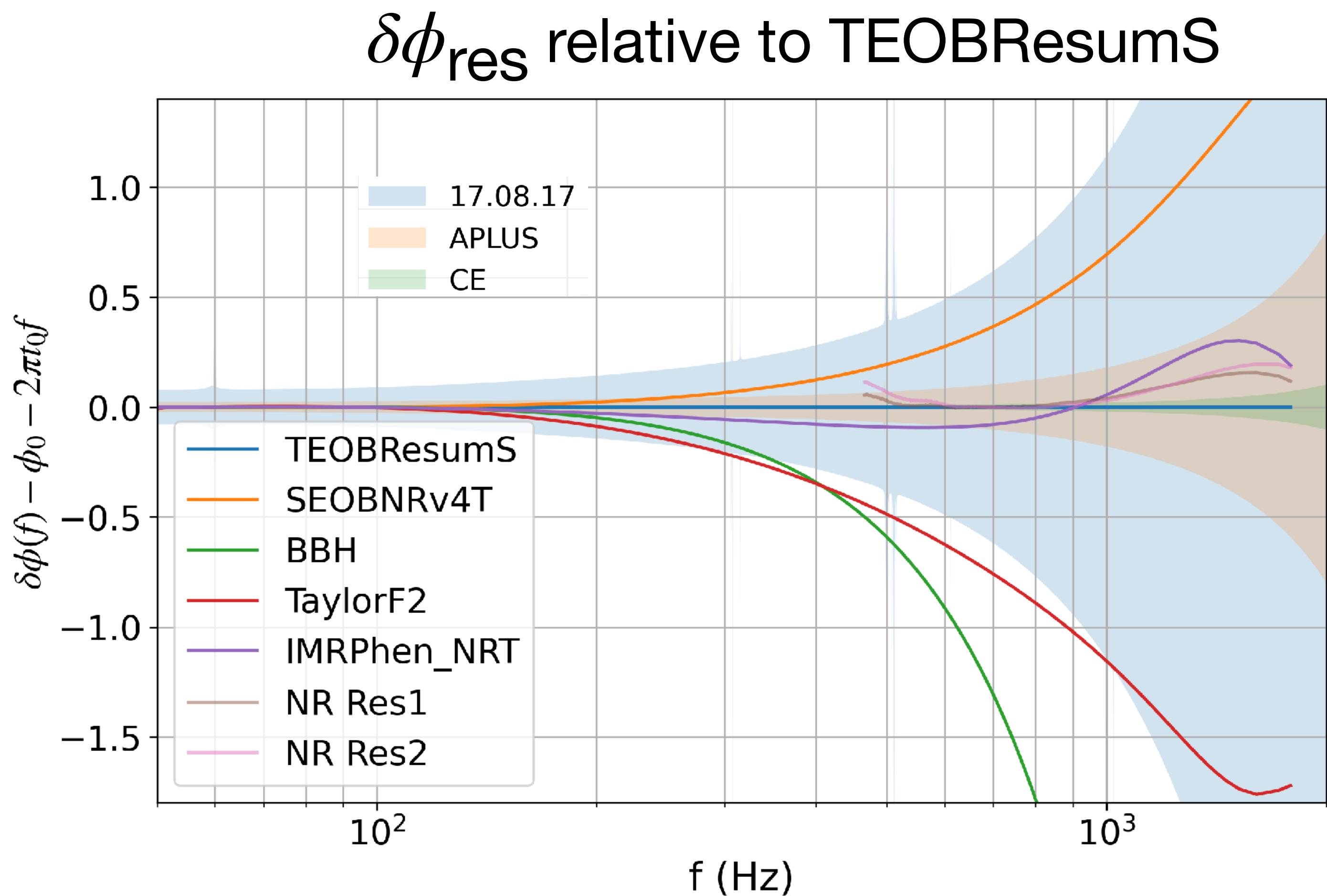
**What accuracy do current models give?  
and do future detectors need?**

# Indistinguishability

- Two waveform models have waveform difference  $\delta\mathbf{h} = \mathbf{h}_1 - \mathbf{h}_2$
- “Indistinguishable” if  $\langle \delta\mathbf{h} | \delta\mathbf{h} \rangle < 1$  “less than noise”
- $h_{\text{model}}(f) = h_{\text{true}}(f)(1 + \delta A(f)) \exp(i\delta\phi(f))$ 
  - $\delta\mathbf{h}$  from  $\delta A$  is  $A(f)\delta A(f)$
  - $\delta\mathbf{h}$  from  $\delta\phi$  via  $A(f)(1 - \exp(i\delta\phi(f)))$
- In waveforms, distinguishability is historically assessed via *mismatch*

# Waveform phase impact

- Assessing mismatch *only* - an integrated quantity - obscures the frequency dependence of waveform difference & comparison to  $S_n(f)$
- Phase differences of  $\phi_0 + 2\pi f t_0$  absorbed by marginalization over time and phase  $\phi_c, t_c$
- Here: compare **residual phase**  $\delta\phi_{\text{res}}$  without max likelihood fit  $\phi_0 + 2\pi f t_0$  (weight by variance  $S_n(f)/A(f)^2$ )

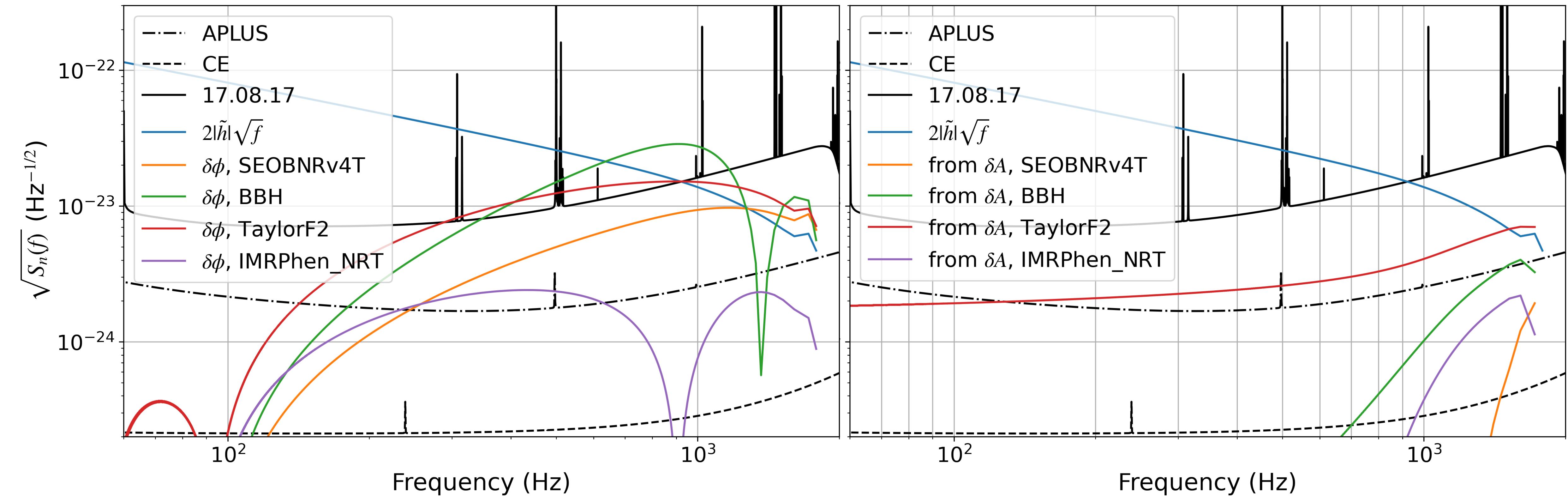


NR waveforms: relative to 700 Hz for reference  
(not long enough to fit  $\phi_0, t_0$ )

# Impact of model differences

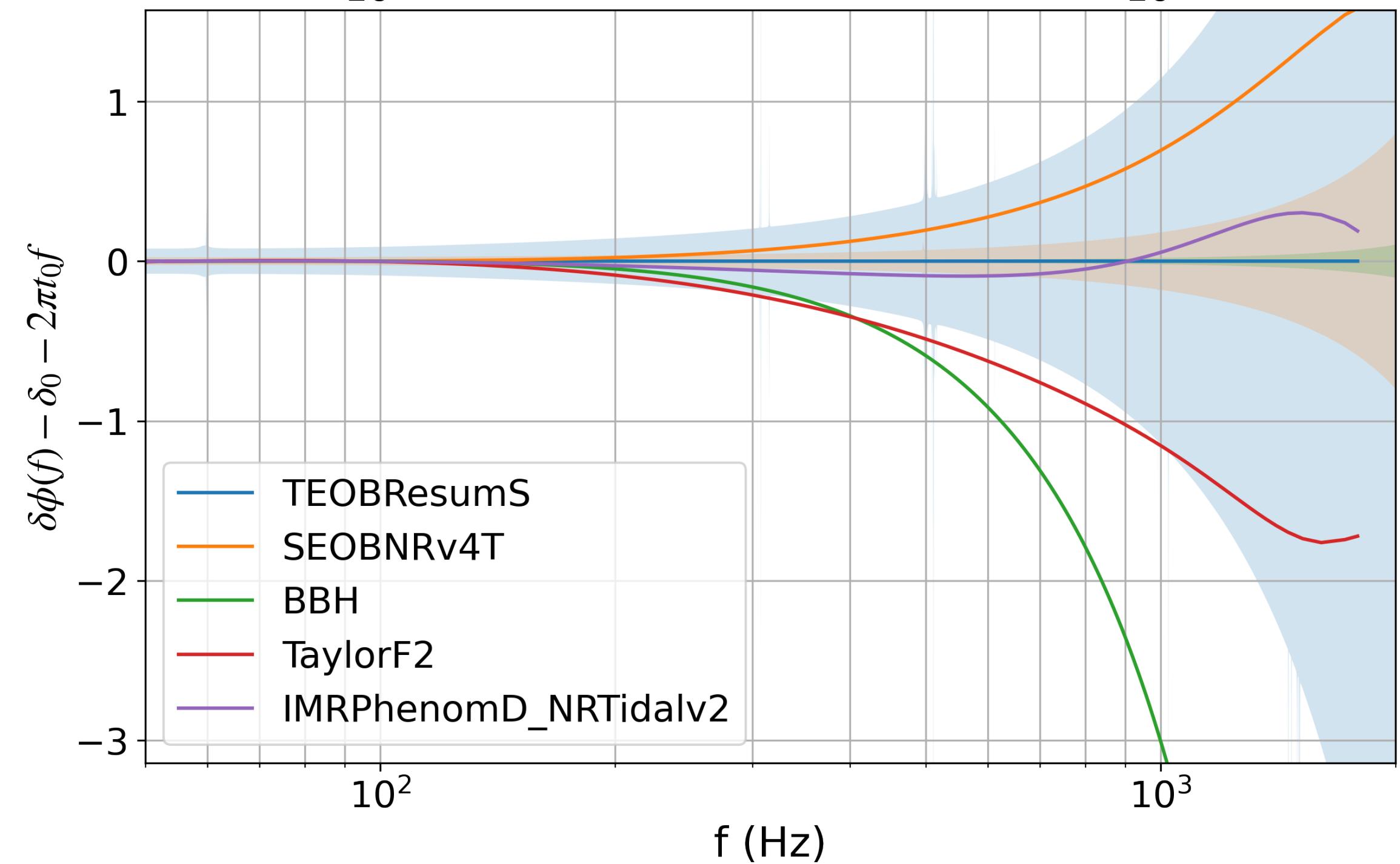
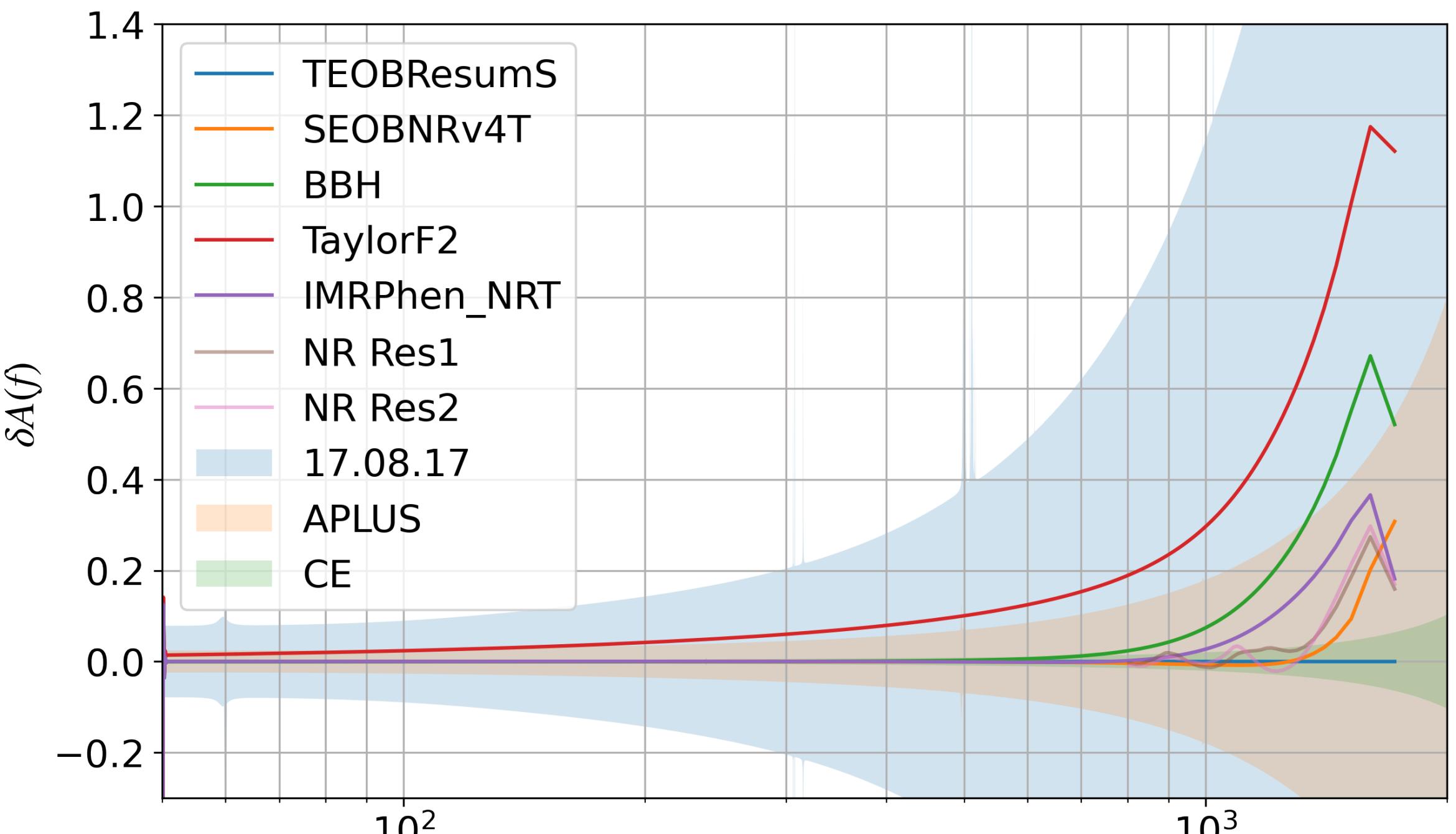
**Characteristic strain**  $4f\tilde{h}(f)$  from  $\delta\phi$  and  $\delta A$  can be compared to  $S_n(f)$

Below:  $\delta h$  of waveform models for a  $1.35-1.35 M_\odot$  BNS relative to TEOBResumS for source at 100 Mpc



# Small-angle approximation

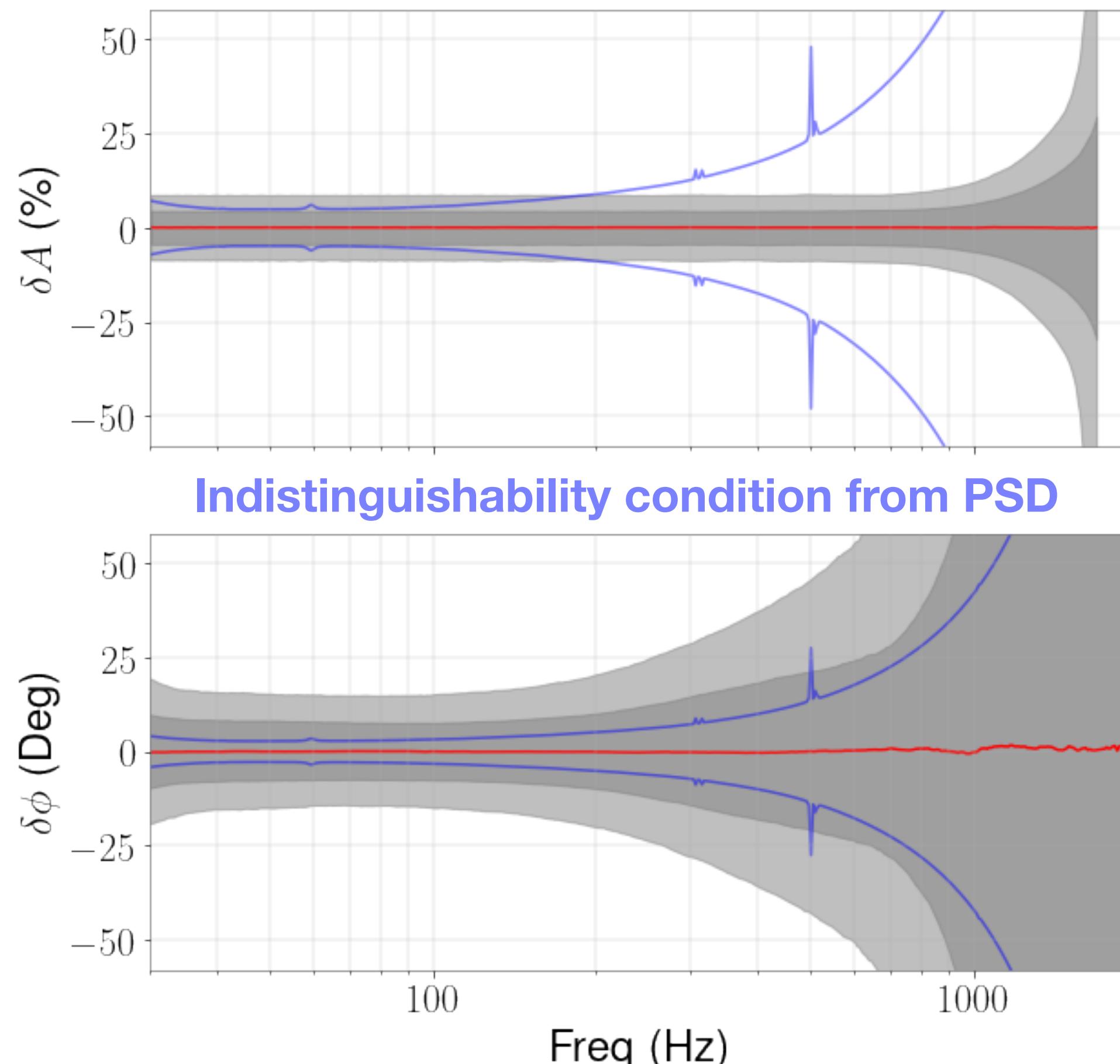
- Indistinguishability condition from characteristic strain:  
$$2\sqrt{f}|\delta\tilde{h}(f)| < \sqrt{S_n(f)}$$
sets shaded regions for reference detectors, signal  $d_{\text{eff}} = 100$  Mpc
- Waveform differences that remain in the shaded regions should be indistinguishable in that detector



# Statistical/systematic: GW170817

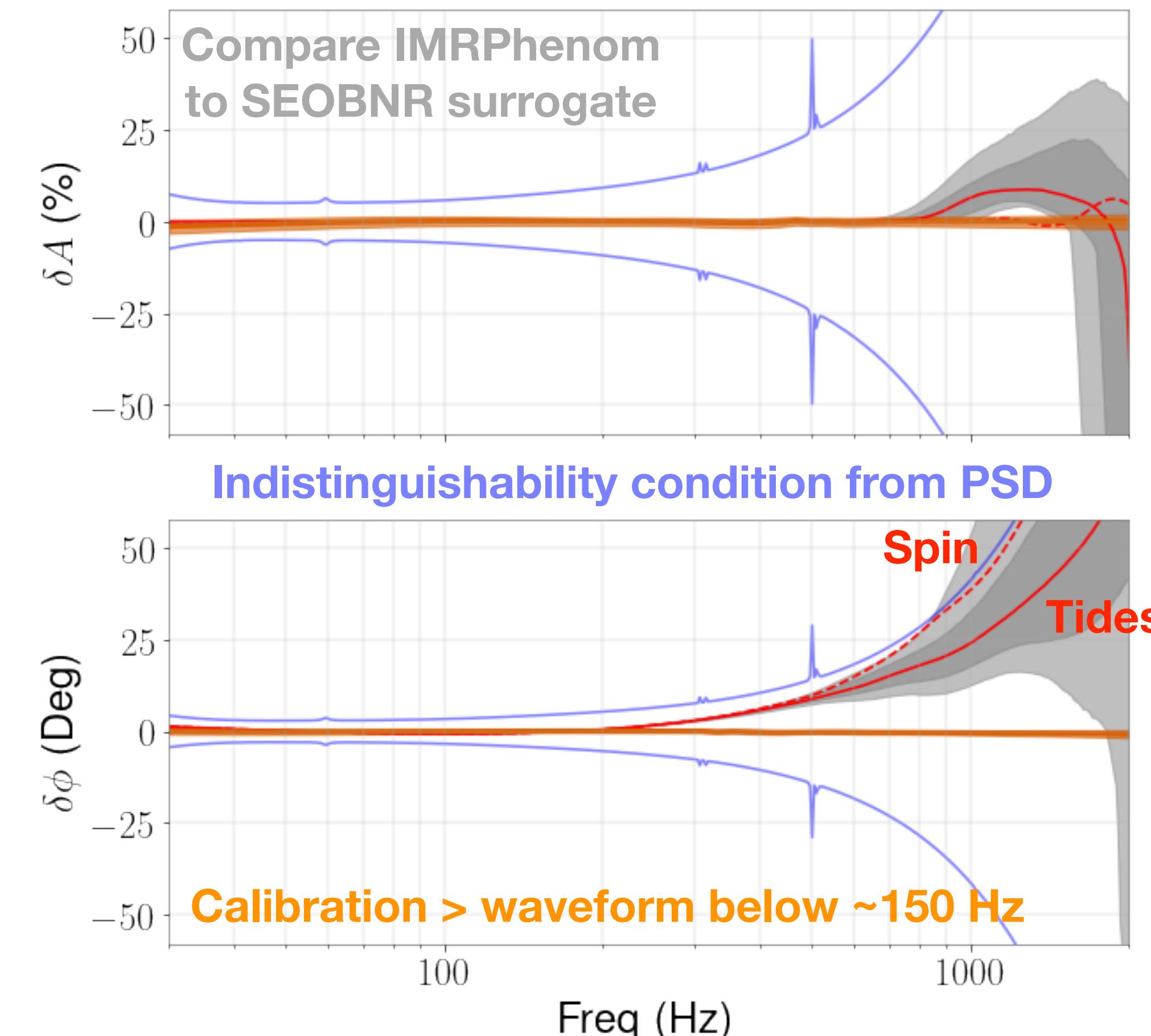
Beyond the characteristic strain estimate

Random draws from  
posterior distributions



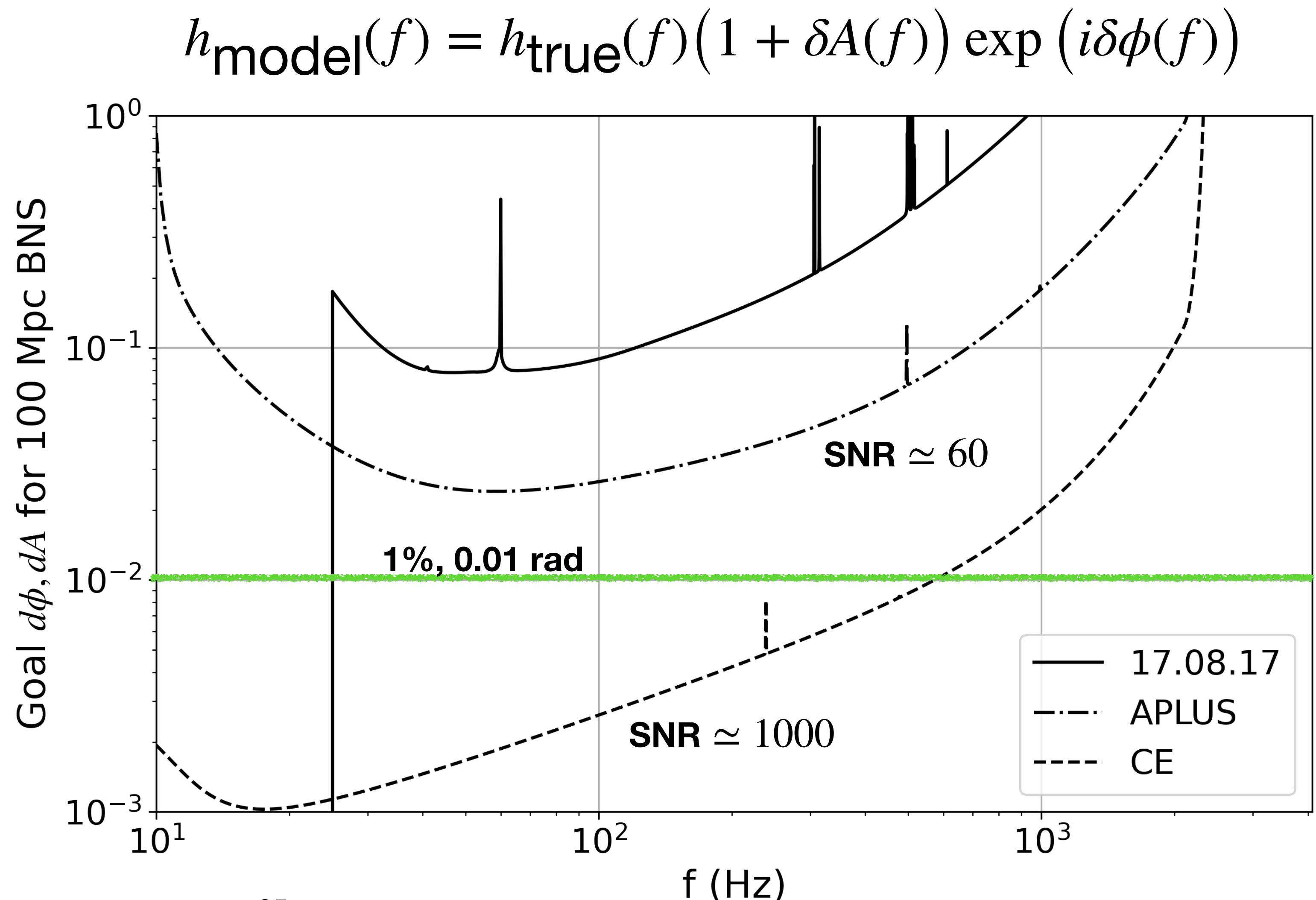
Indistinguishability condition from PSD

Calibration envelopes  
and waveform systematics



# Goals for calibration & waveforms

- Frame: Model error has potential to impact source analysis if  $\delta h = h_{\text{true}} - h_{\text{model}}$  generates **characteristic strain larger than detector noise** at a given frequency
- Goal  $\delta A$  (fractional) and  $\delta\phi$  (radians) shown
- ‘Model’ of detector (calibration) or source (waveform)
- ***PE Goal: Use the data to inform the analysis***



# **Thank you!**

# Model consistency: amplitude

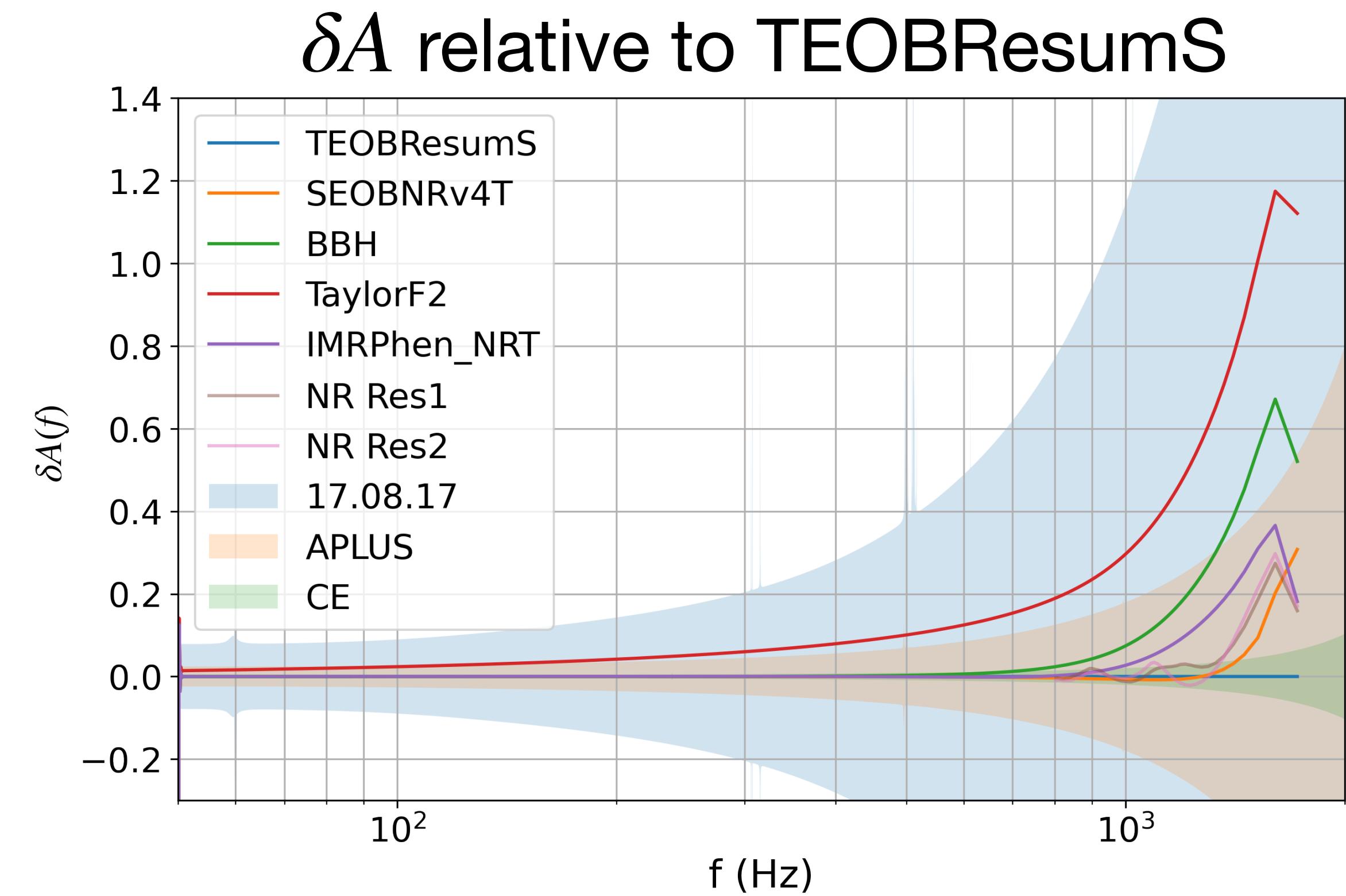
- $\tilde{h}(f) = A(f)e^{i\phi(f)}$

- in SPA:

$$A(f) = Q(\theta_{\text{ext}})(T'(f))^{1/2} \mathcal{A}(f)$$

$$\delta A(f) = \frac{A(f) - A_{\text{ref}}(f)}{A_{\text{ref}}(f)}$$

- PSD reference: condition for indistinguishability at 100 Mpc



- TaylorF2 only has leading order amplitude
- Other differences in amplitude are small

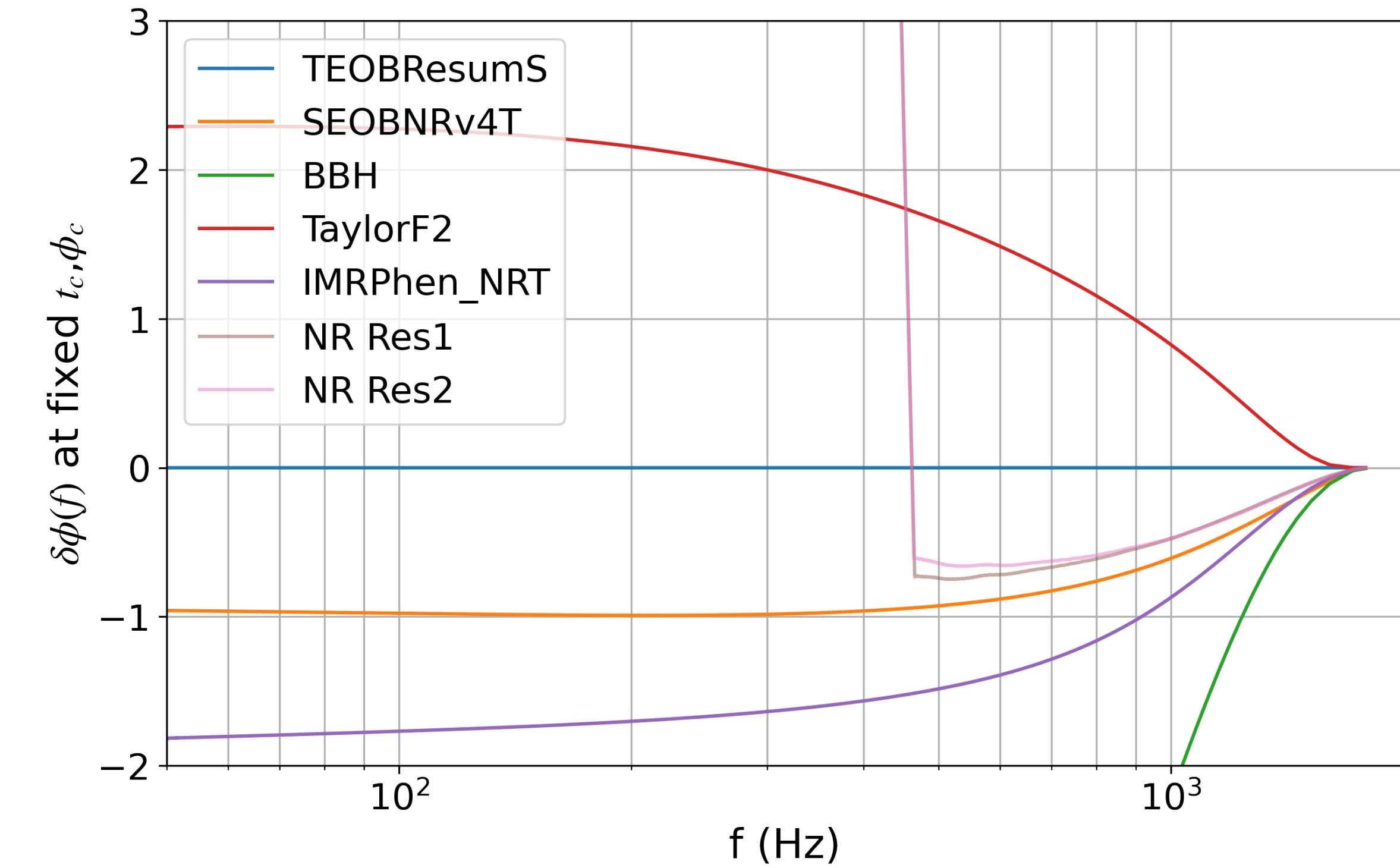
# Model consistency: phase

- Relative to **fixed**  $f_c$  of coalescence (same  $t_c$  and  $\phi_c$  for all signals)

- in SPA:

$$\begin{aligned}\phi(f) &= \frac{\pi}{4} + \psi(f) - 2\pi f T(f) \\ &= \phi_c - 2\pi f t_c + 2\pi \int_f^{f_c} d\tilde{f} \int_{\tilde{f}}^{f_c} dF T'(F)\end{aligned}$$

- $\delta\phi(f) = \phi(f) - \phi_{\text{ref}}(f)$
- Can compute for NR from time and phase accumulation  $f$  to  $f_c$



- Intrinsic model error compared to other models or numerical simulation relative to TEOB  $f_c$
- other WF models'  $f_c$  would give different alignment and potentially better NR/model agreement

# SPA validity conditions

