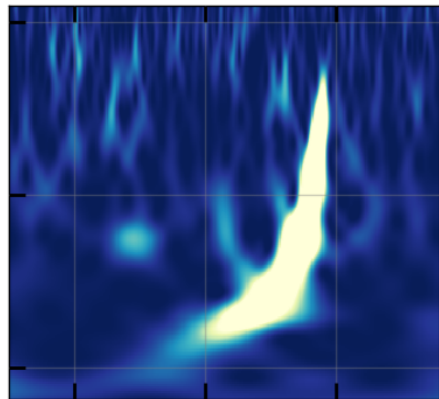
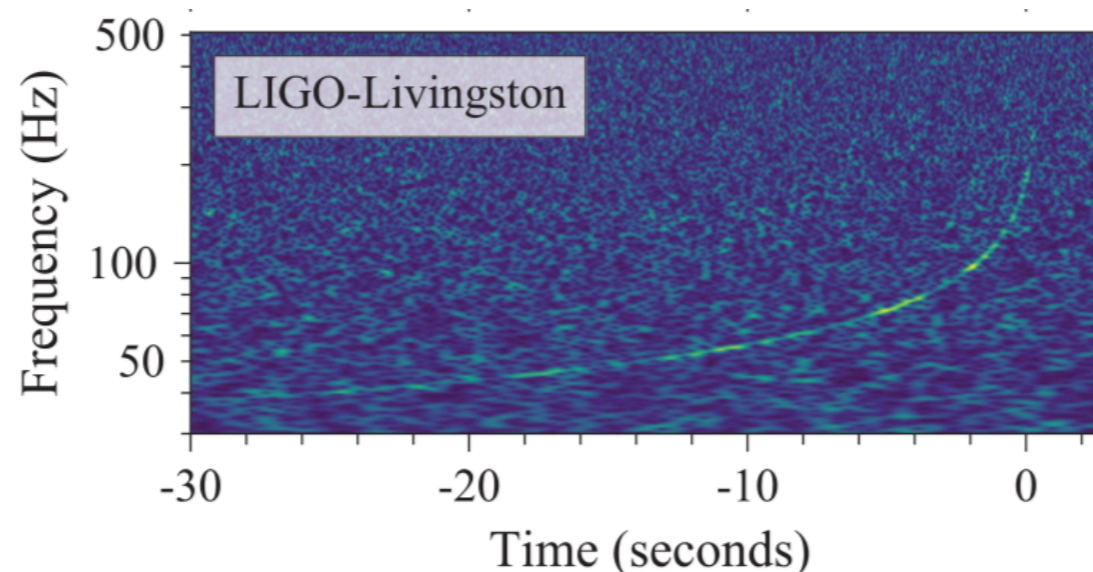
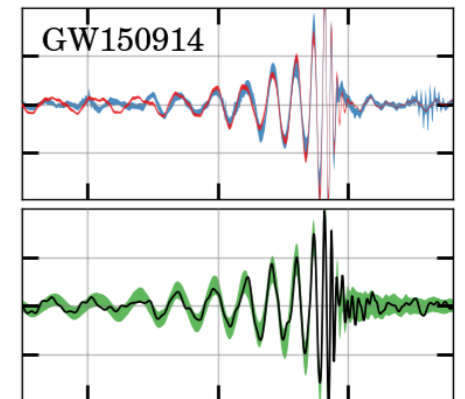


Data Analysis Techniques for Testing General Relativity with GWs



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AEI Potsdam-Golm

COST CA18108 Kickoff Meeting
Barcelona, October 2, 2019



Motivation

- GW astronomy:
 - We want to get the **“fingerprints” of GW sources** from the **shapes of their waveforms**
 - Want to learn about **binary parameters** and **astrophysics and fundamental physics** of these systems
 - **LIGO / Virgo** have set the stage with about a dozen observations in O1 & O2, more coming as we speak in O3.
- Testing General Relativity with GWs:
 - GWs emitted from merging compact binaries allow us to **test GR in the strong field regime**
 - So far, **no evidence for deviations from GR**
- First, let's look at **basic GW data analysis**:
 - How can we **infer binary parameters** given a GW signal?
 - **Ingredients**: matched filtering, model of (GR) waveform and noise

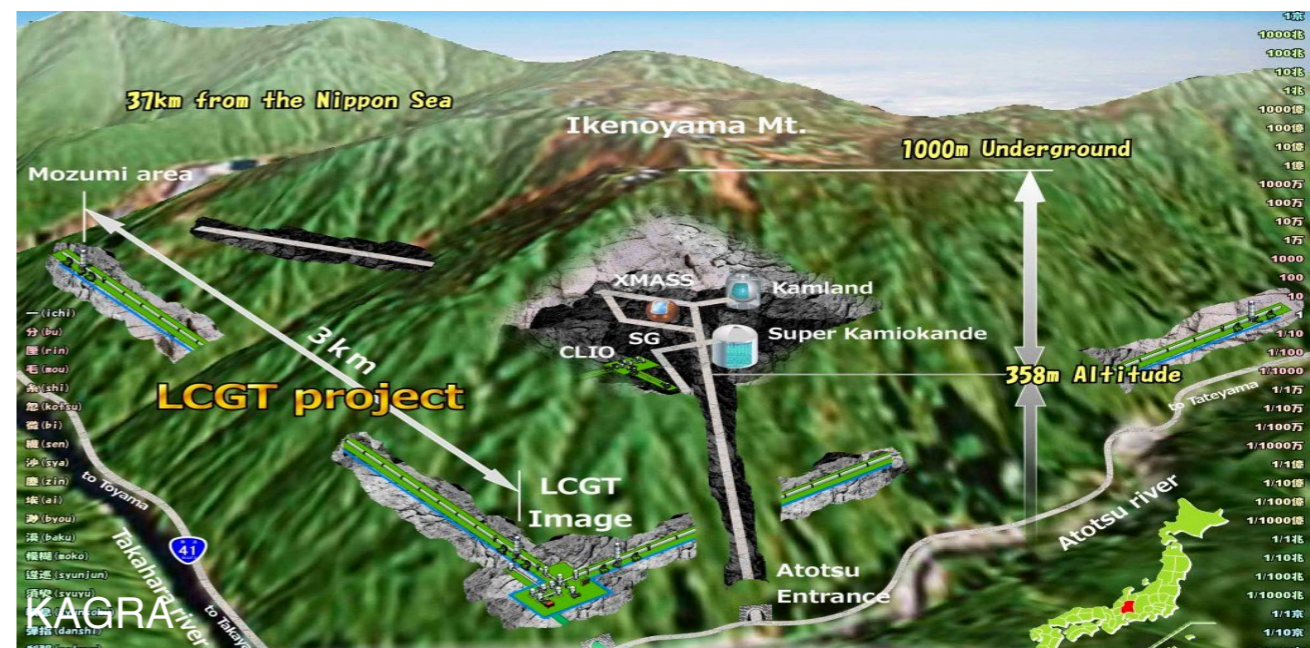
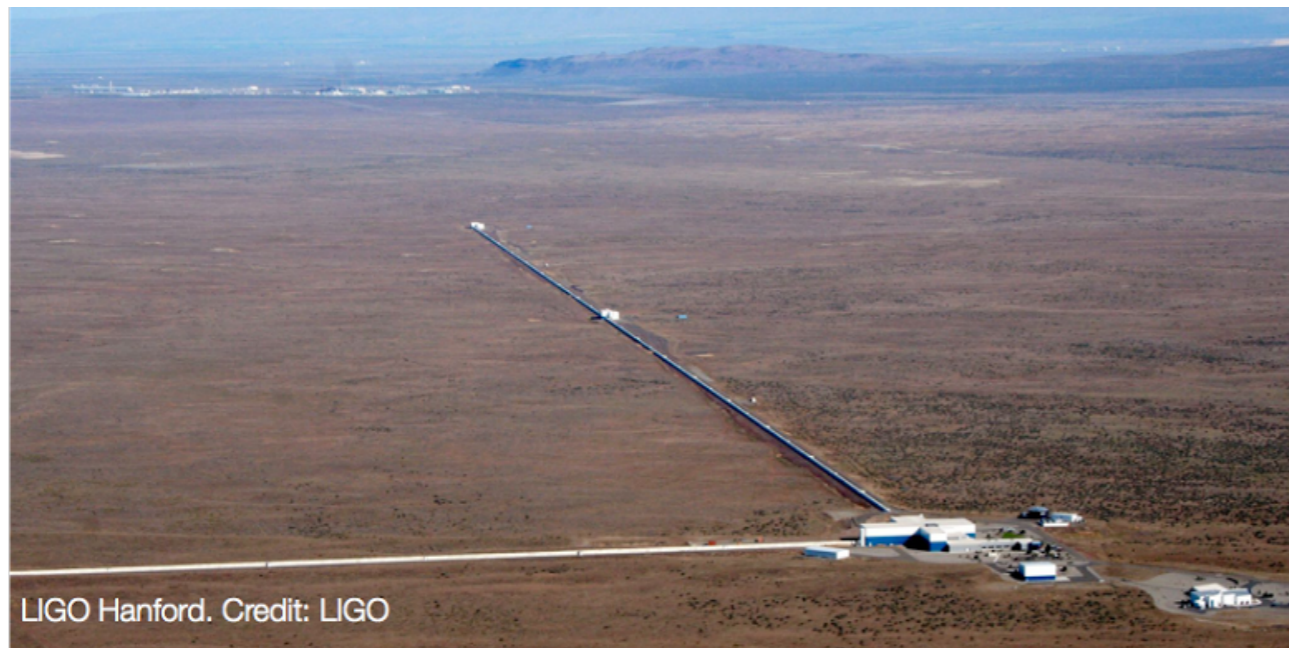


Introduction to GW data analysis for compact binary mergers

See also: “Guide to LIGO data analysis”, [arXiv:1908.11170](https://arxiv.org/abs/1908.11170)



Current GW detector network

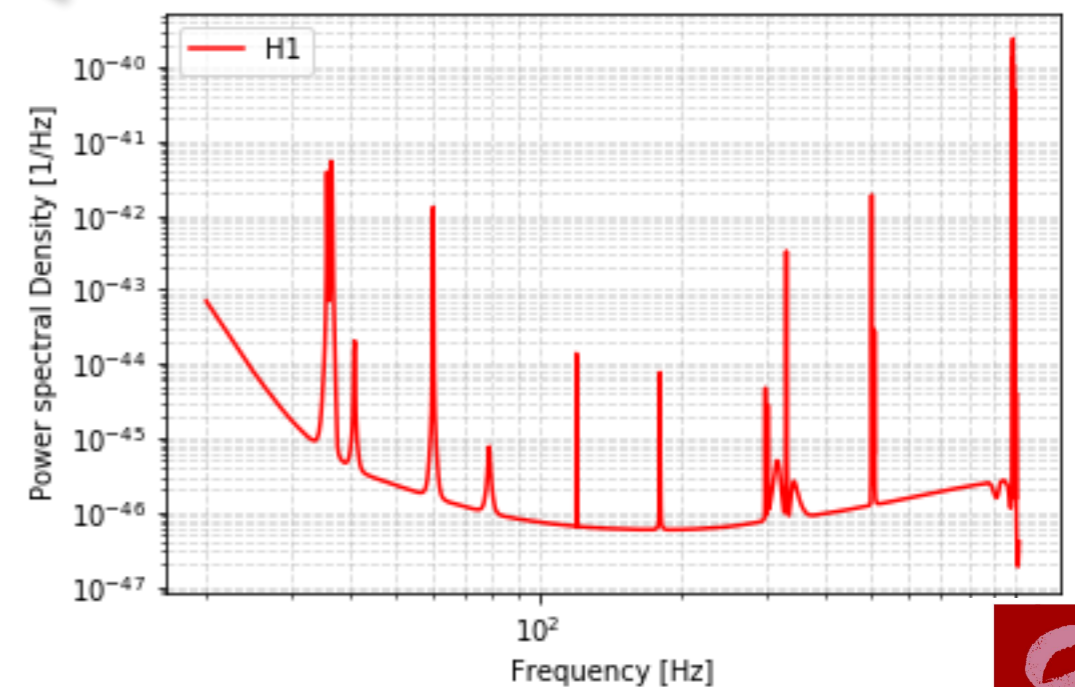
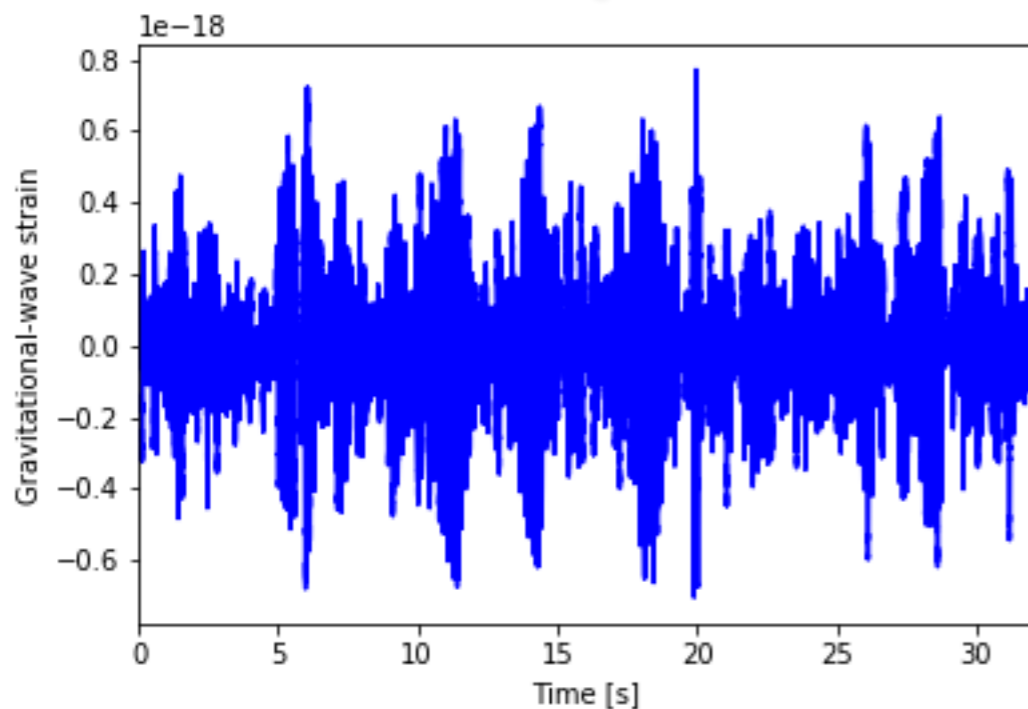
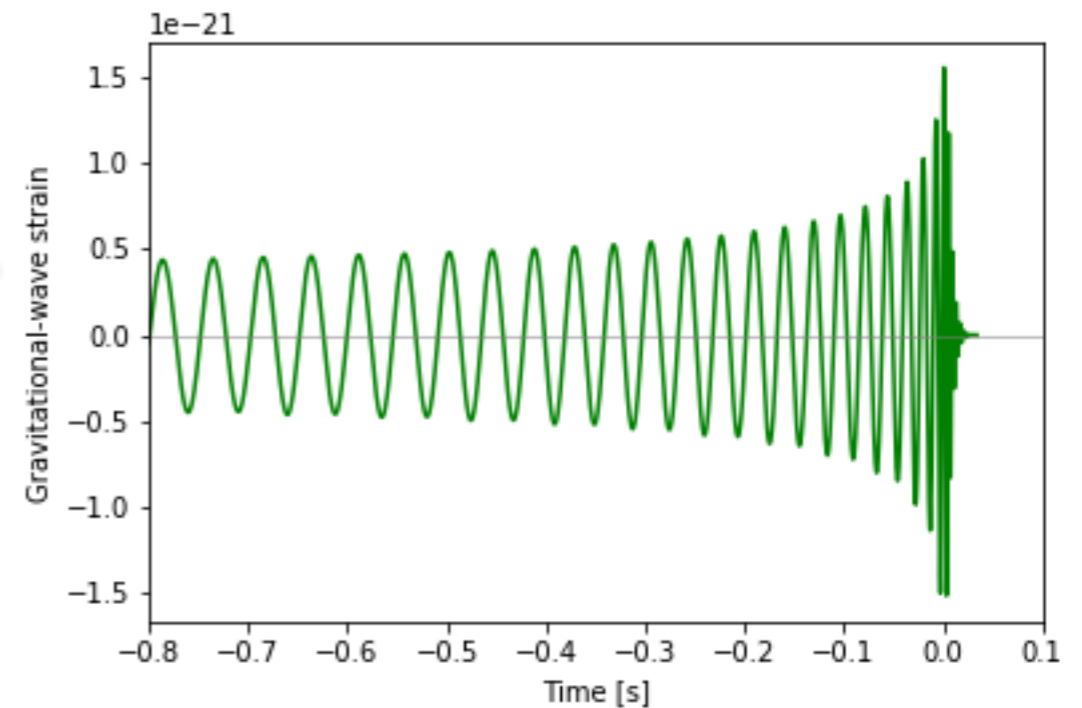


Matched filtering

Inner product:

$$\langle d | h \rangle = 4 \operatorname{Re} \int_0^\infty \frac{\tilde{d}(f) \tilde{h}^*(f)}{S_n(f)} df$$

SNR: $\rho = \|h\|$



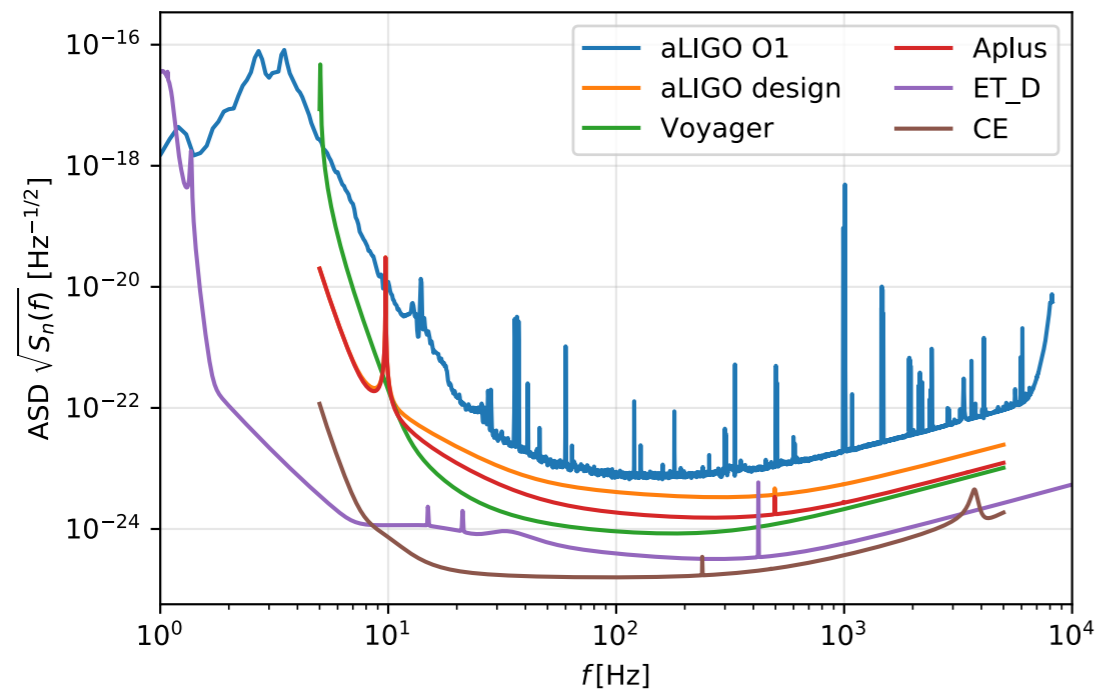
GW data analysis

- Detection:
 - Build a **bank of template waveforms** that covers parameter space
 - Want to **keep fraction of missed signals small**
 - **Cross-correlate templates against detector data**
- Parameter estimation:
 - Given a likely detection follow it up with **Bayesian methods** to find the **probability distribution of the binary parameters given the signal in the detectors and the PSD of the detector noise**
 - Need high accuracy waveforms to make sure that we don't infer wrong / biased parameters
- Both need **fast & accurate waveform models**
 - Require $O(10^7)$ - $O(10^8)$ waveform evaluations!

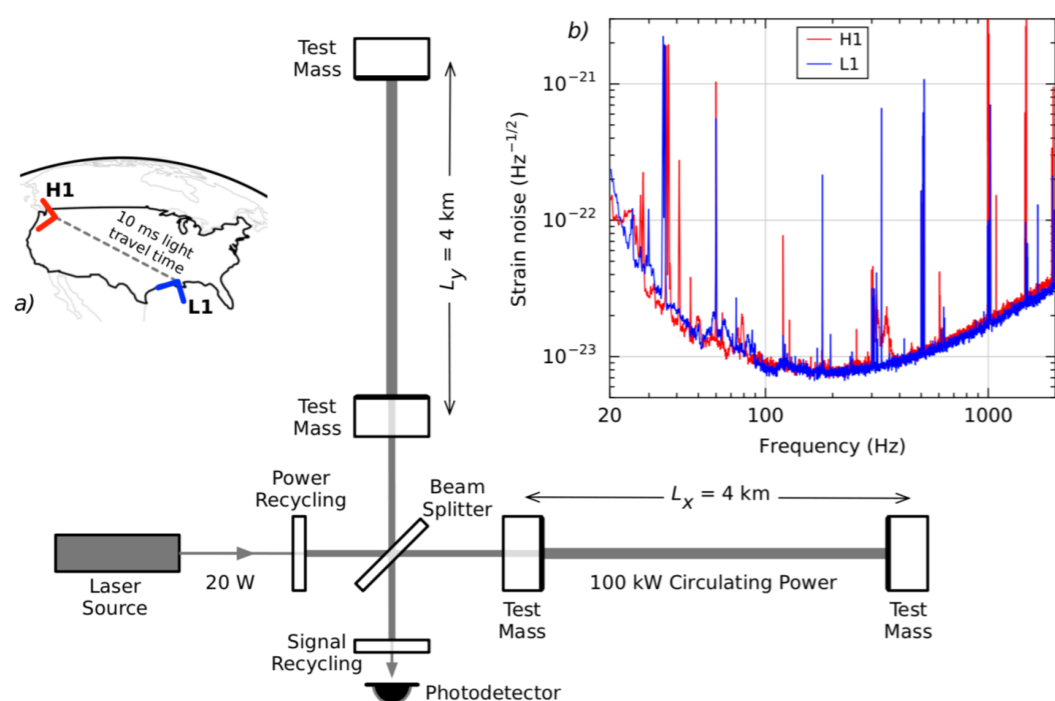
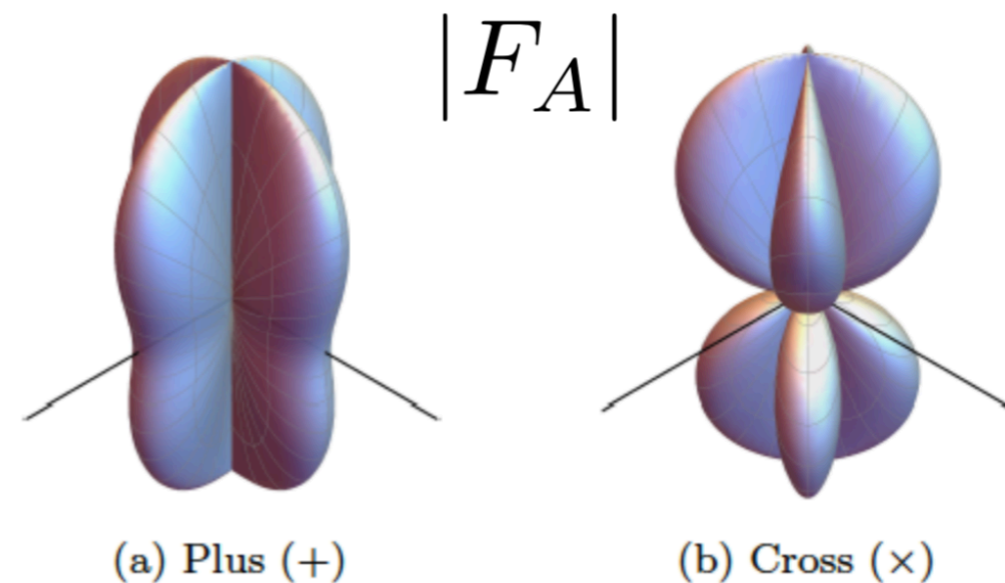


Interferometric GW detectors

Evolution of detector sensitivity



Angular response of IFO



$$h = h_A F^A \quad F^A(\hat{n}, \psi) = D^{ab} e_{ab}^A$$

$$A = +, \times, \dots$$

$$D^{ab} = \frac{1}{2} \left(d_x^a d_x^b - d_y^a d_y^b \right)$$



What do we need to model?

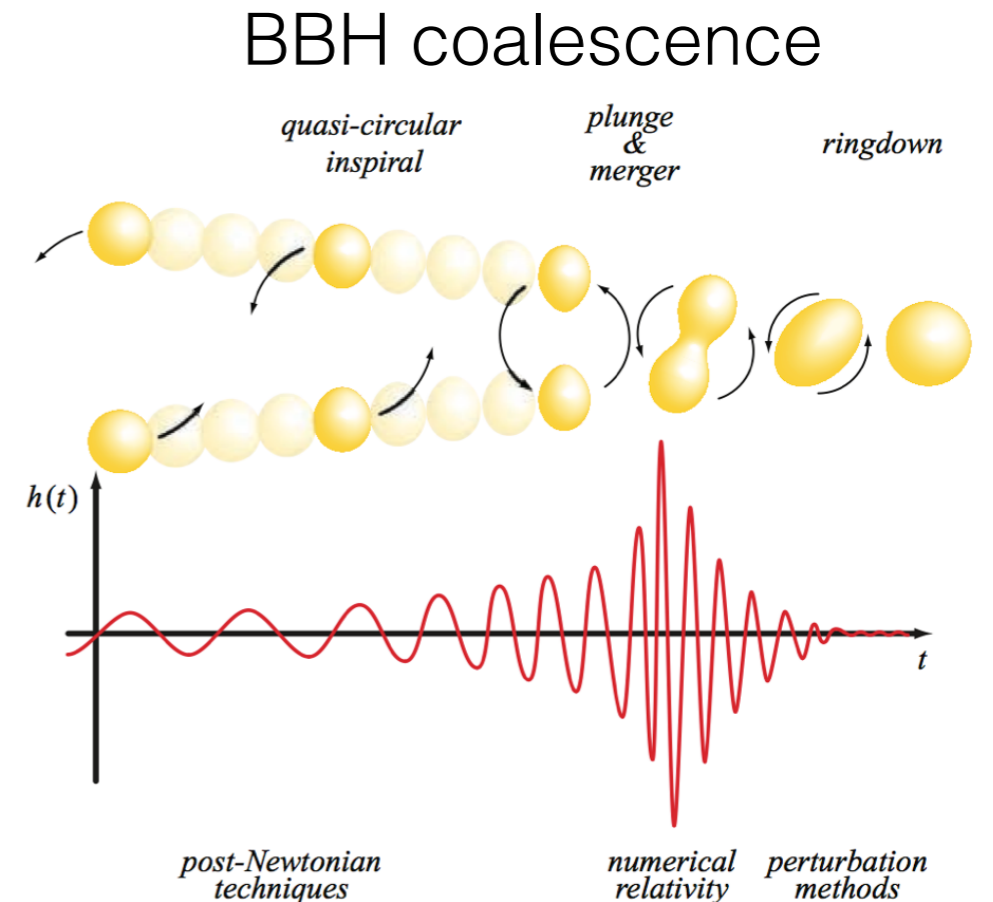
- A **waveform model** is a **parametrized function** of the waveform **polarizations** $h_{+, \times}(t; \vec{\lambda})$ or complex **modes** $h_{lm}(t; \vec{\lambda})$:

$$(h_+ - ih_\times)(t; \vec{\lambda}) = \sum_{l,m} h_{lm}(t; \vec{\lambda})^{-2} Y_{lm}(\theta, \phi)$$

- Need to model the **inspiral, merger and ringdown** stages in binary black hole coalescence.

- GW detectors record **GW strain**:

$$h(t; \vec{\theta}) = h_+(t; \vec{\lambda}) F_+(\hat{n}, \psi) + h_\times(t; \vec{\lambda}) F_\times(\hat{n}, \psi)$$



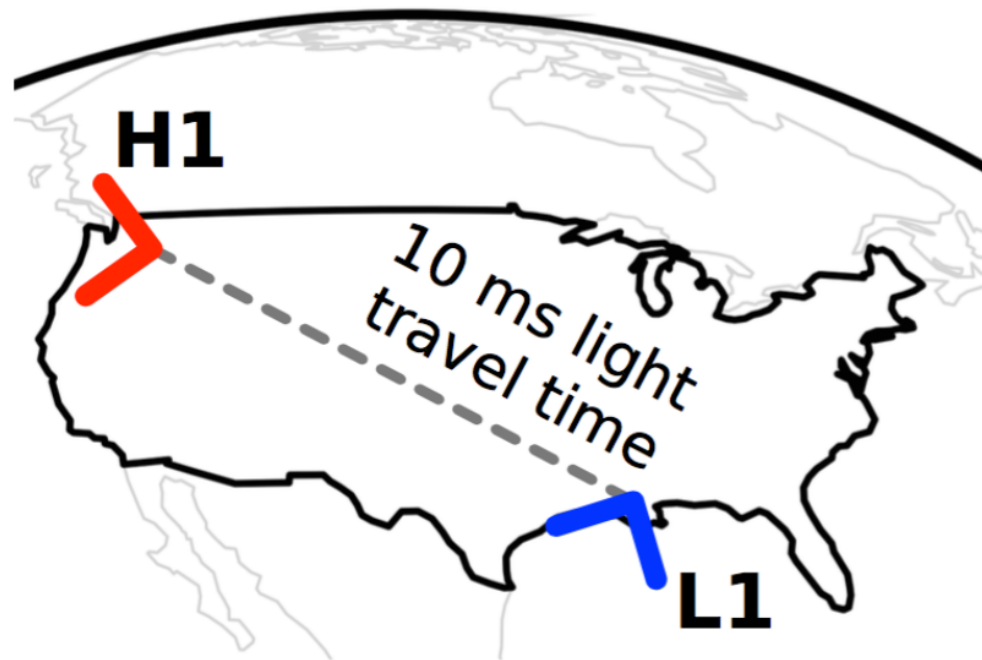
[Baumgarte & Shapiro, Numerical Relativity]



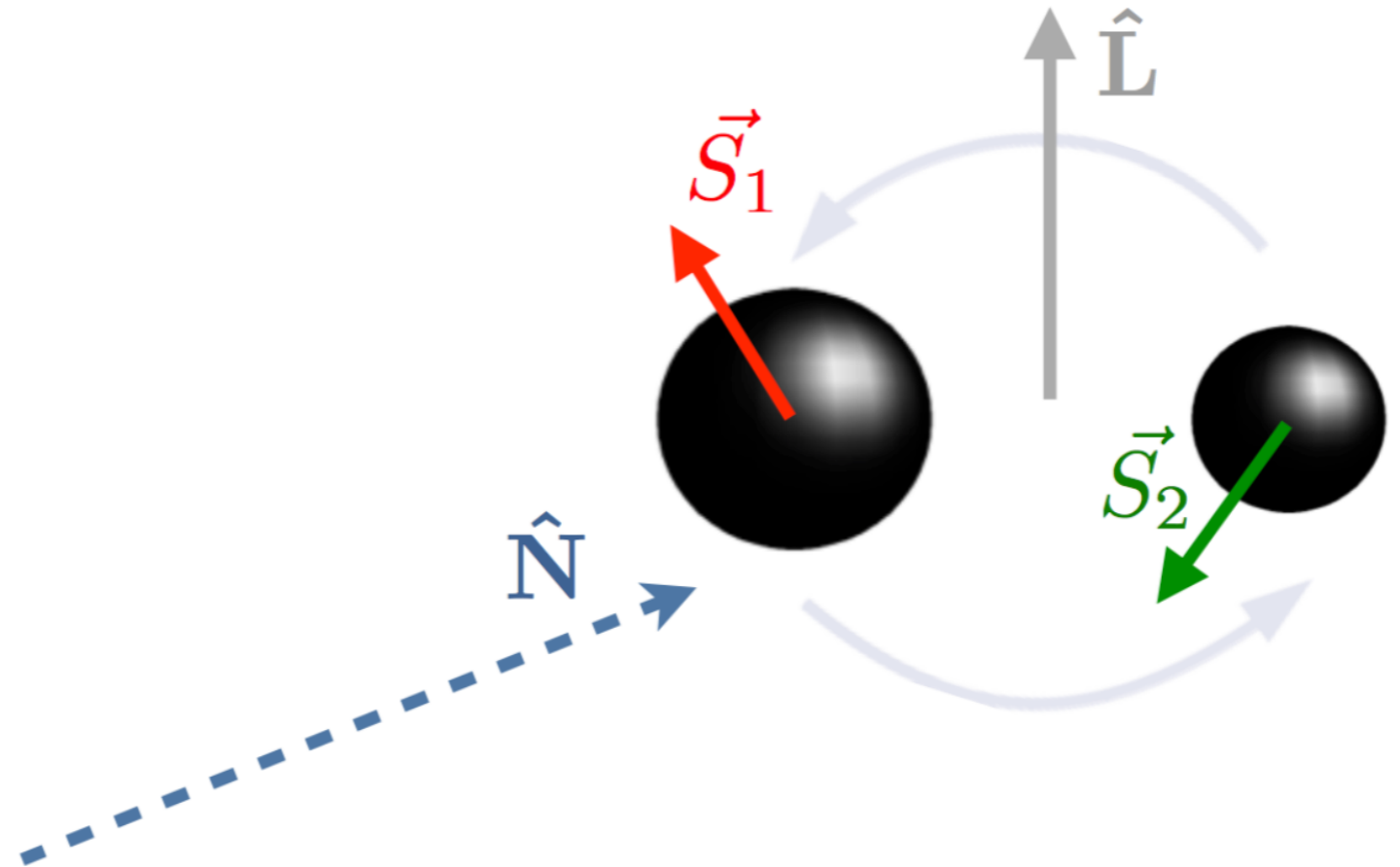
Model parameters

Intrinsic parameters:

masses, spins,
eccentricity, tidal
deformability



Credit: LIGO/Virgo

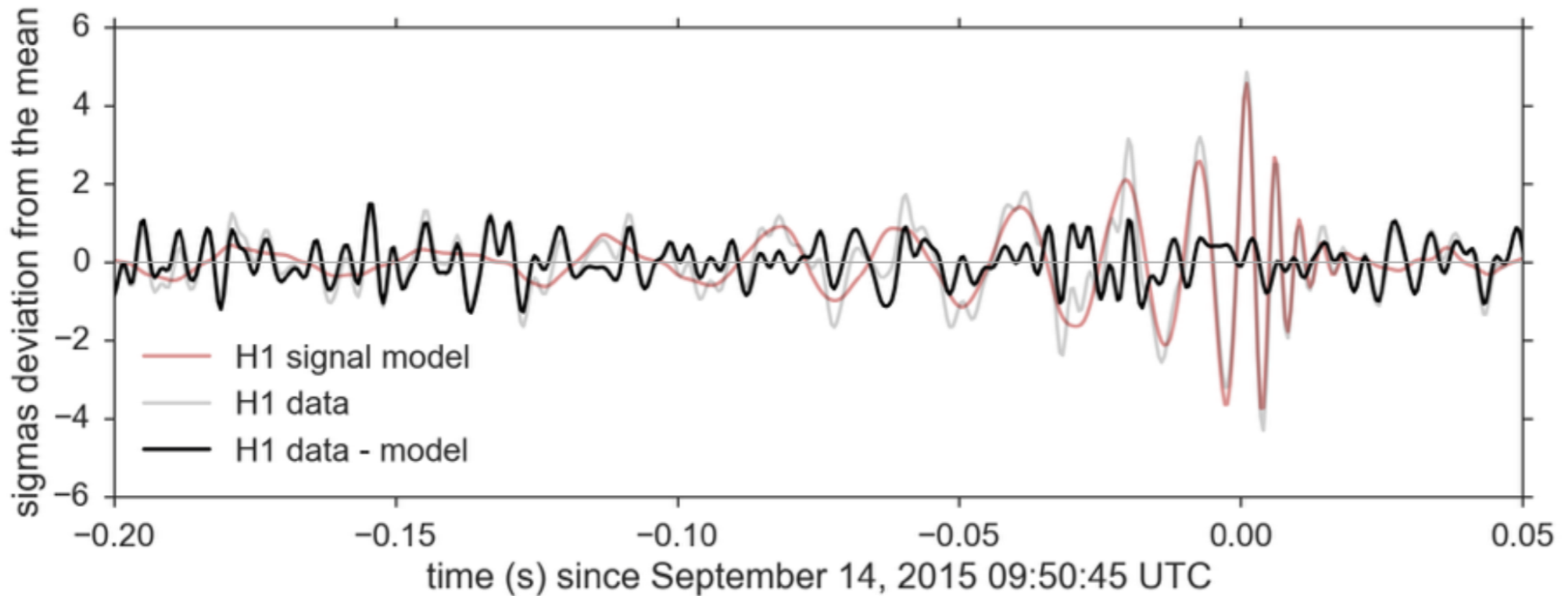


Extrinsic parameters:

time, sky position,
distance, orientation,
reference phase



To find the signal: Likelihood



- Subtract **signal model** from **data** $d - h(\vec{\lambda})$, where $d = n + h_{\text{true}}$
- Assumptions: noise is **Gaussian** (zero mean) and **stationary**

$$\mathcal{L}(d | \vec{\lambda}) \propto \exp \left[-\frac{1}{2} \left(d - h(\vec{\lambda}), d - h(\vec{\lambda}) \right) \right]$$



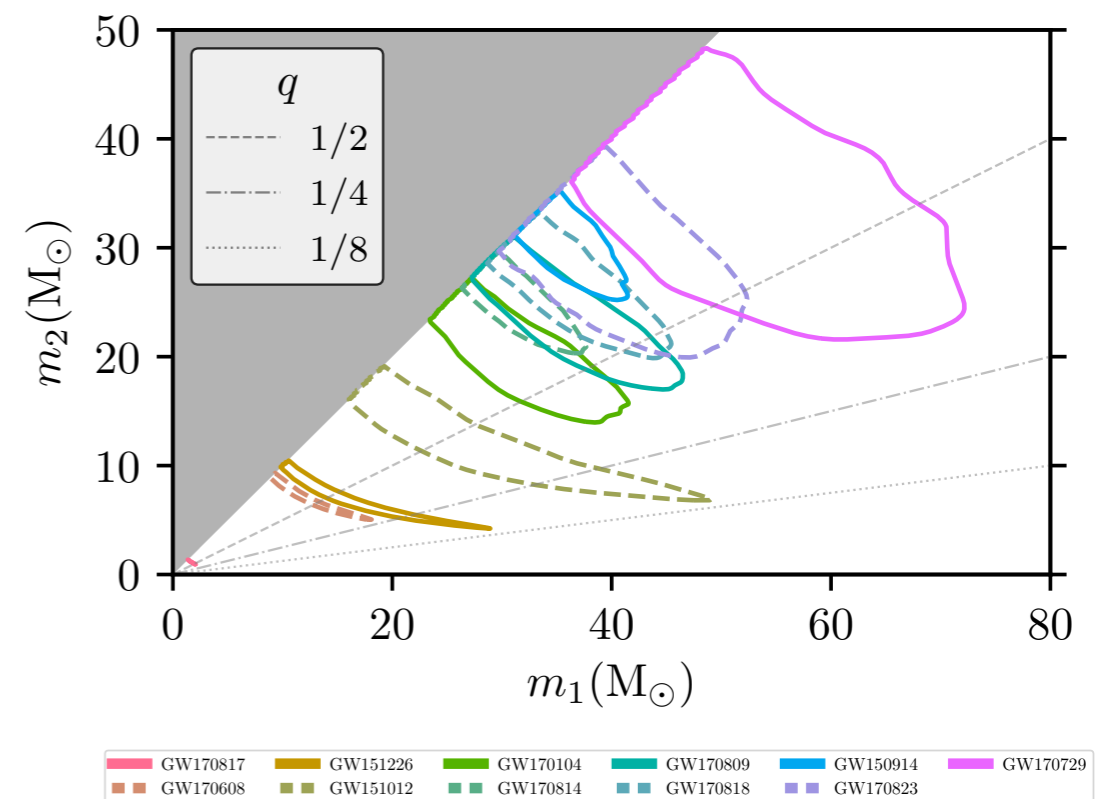
Parameter Estimation

- **Posterior probability** of model parameters $\vec{\lambda}$ given the data \vec{d} (Bayes' Theorem):

$$p(\vec{\lambda} | \vec{d}) \propto p(\vec{\lambda}) \mathcal{L}(\vec{d} | \vec{\lambda})$$

- Need **Models** for **signal** and **noise** & specify **prior knowledge**
- Numerically **sample** the posterior distribution

GWTC-1 Catalog



LVC, PRX 9, 031040, 2019



Tests of GR with GWs

See **LVC**, [arXiv:1903.04467](https://arxiv.org/abs/1903.04467)
Results on GWTC-1 Catalog



Residuals test

- **Residual:** detector data - maximum likelihood template

$$\mathcal{R}(t) := d(t) - h(\vec{\lambda}_{\max \mathcal{L}}; t)$$

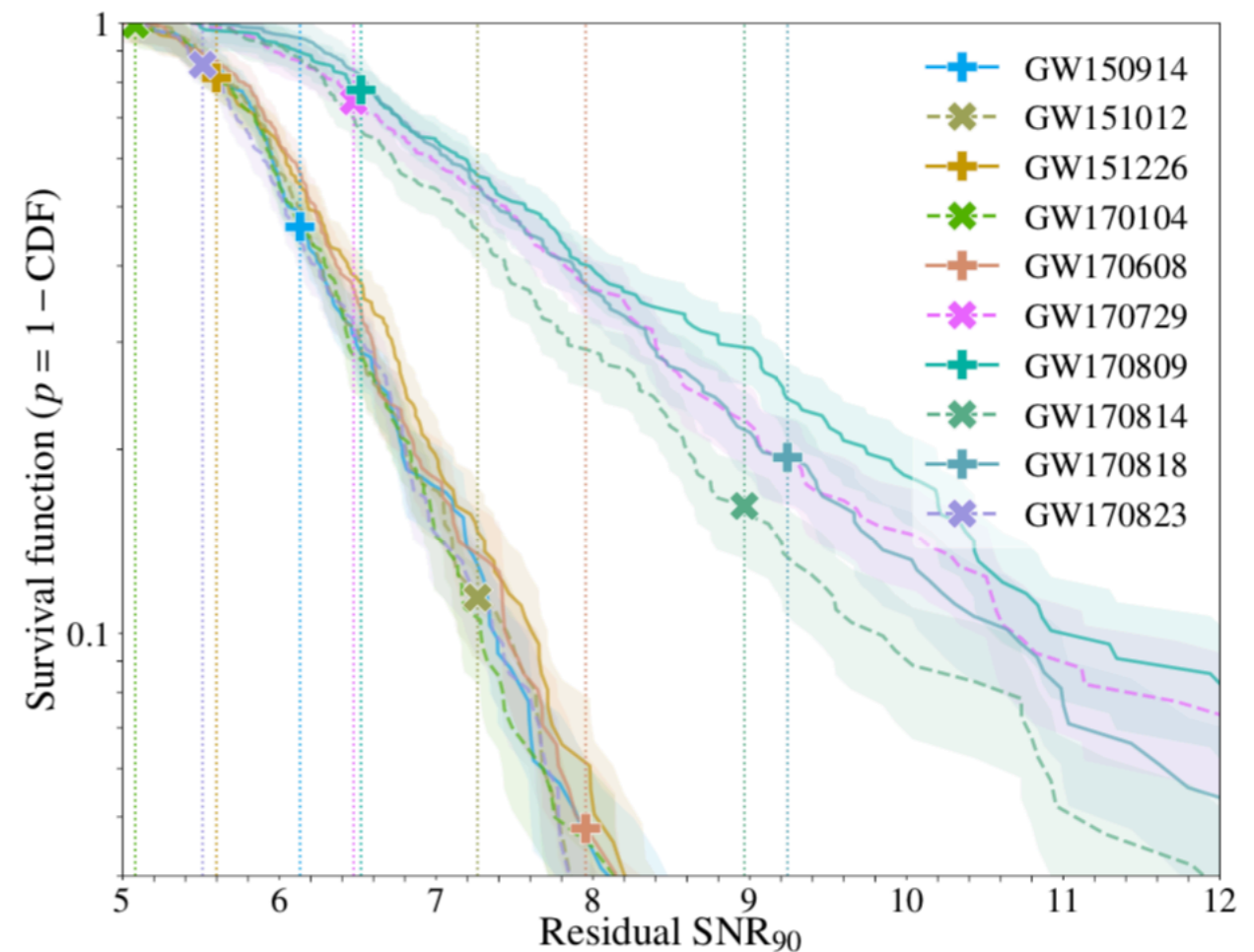
- **Compute 90% upper limit of SNR** of residuals $\rho_{90}(\mathcal{R})$

- describe signal as Gaussian noise + coherent signal

- Repeat analysis for **noise-only detector data** many times:

$$p(\rho_{90}(\mathcal{R}_{\text{noise}}))$$

- **At which percentile does** $\rho_{90}(\mathcal{R})$ **lie in** $p(\rho_{90}(\mathcal{R}_{\text{noise}}))$?



- p-values > 0.05
- Meta p-value = 0.4

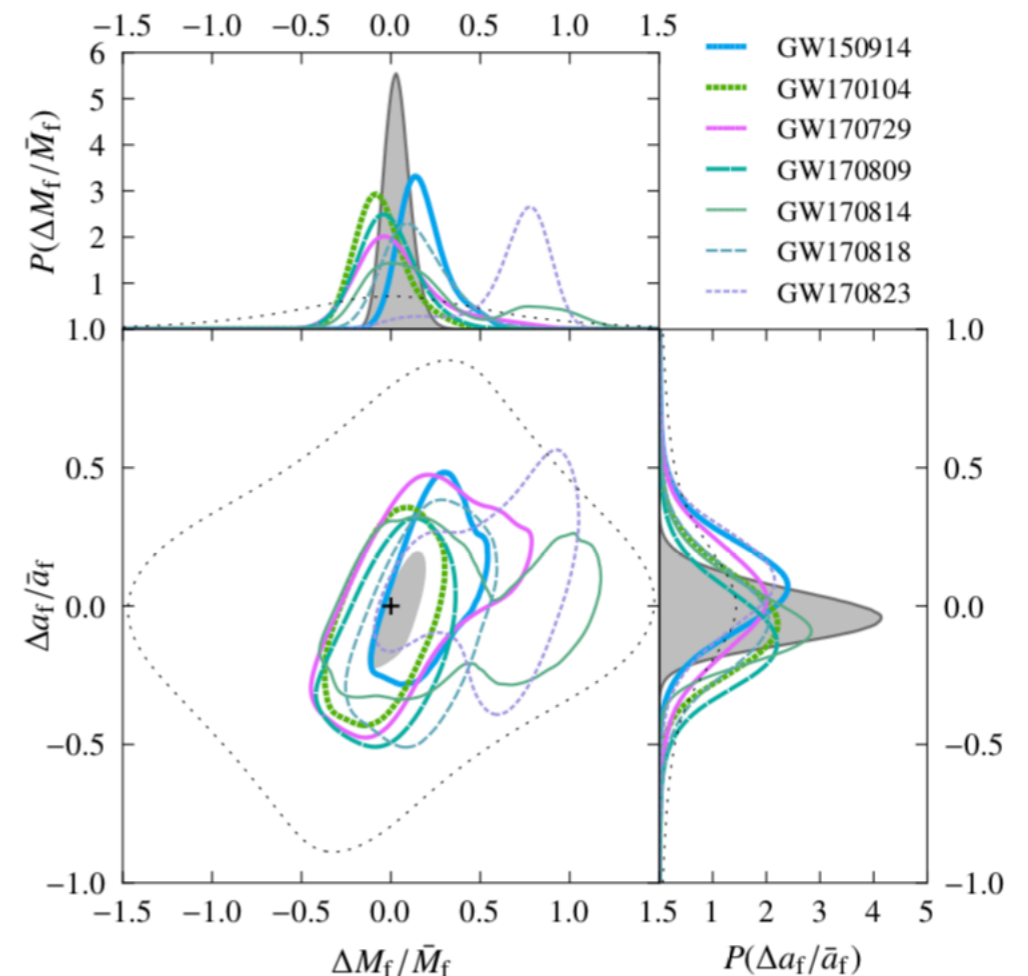
No statistically significant evidence for deviations from GR

Inspiral-merger-ringdown consistency test

- Check whether **final mass** M_f and **final spin** a_f inferred from the **low** and **high frequency parts** of the signal are consistent.
- Compute **posterior distributions** with different **frequency bounds** for likelihood integral:

- **Transition point:** innermost stable circular orbit (ISCO)
- **Normalization:**

$$\Delta M_f / \bar{M}_f := \frac{M_f^I - M_f^{\text{MR}}}{(M_f^I + M_f^{\text{MR}})/2}$$



- lines = 90% credible regions of $p(\Delta M_f / \bar{M}_f, \Delta a_f / \bar{a}_f | d)$
- Plus sign = GR value
- GR value recovered at < 80% credible level

All events consistent with GR

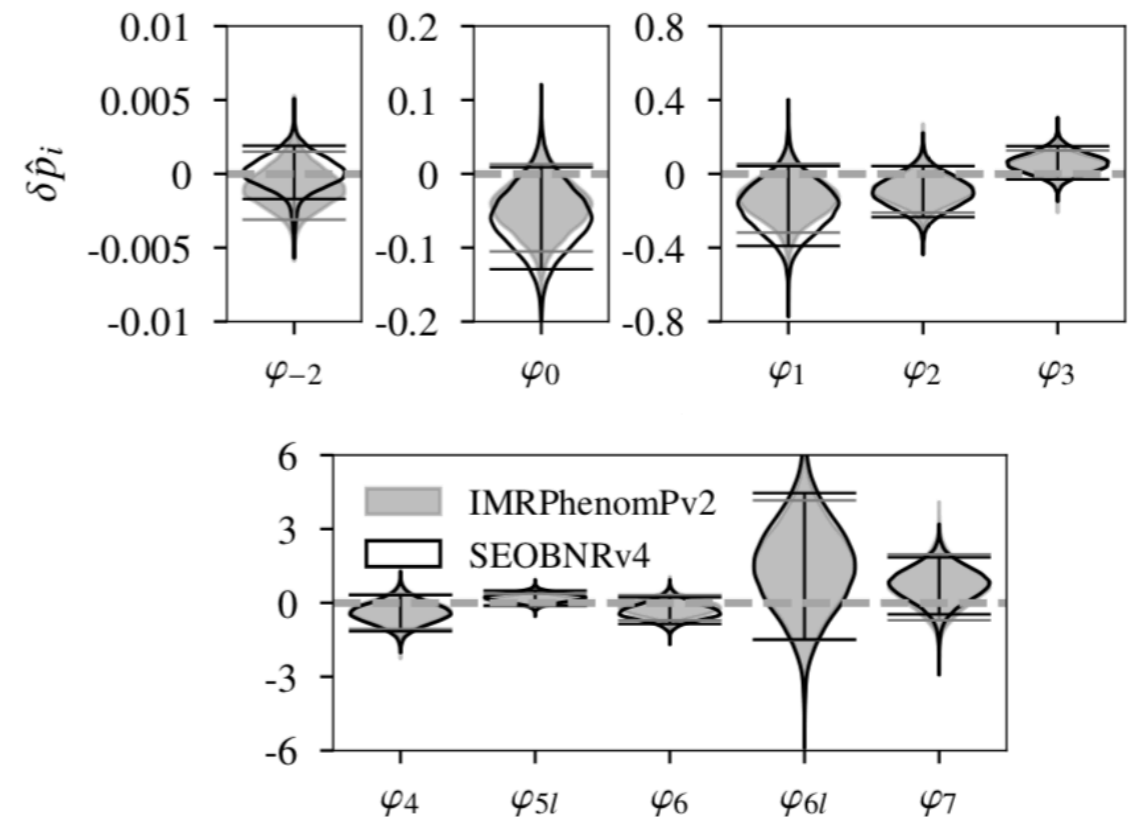
Parametrized test of GW generation

- Compute **posteriors** $p(\delta\hat{p}_n | d)$ of **deviations in coefficients** p_n of the **phase of waveform** models
- Templates have to be **phase coherent** with the signal to a fractions of a radian to capture the SNR of an event
- post-Newtonian **phase** up to 3.5PN or $\mathcal{O}((v/c)^7)$

$$\Phi(\vec{\theta}; f) = 2\pi f t_c - \varphi_c - \pi/4$$

$$+ \frac{3}{128\eta} (\pi M f)^{-5/3} \sum_{i=0}^7 \varphi_i(\vec{\theta}) (\pi M f)^{i/3}$$

- **Fractional deviations**, $\delta\hat{p}_n := (\varphi_n - \varphi_n^{\text{GR}}) / \varphi_n^{\text{GR}}$ except for -1PN and 0.5PN which are *zero* in GR



- Combined posteriors for $\delta\hat{p}_n$ for the most significant events
 - Horizontal lines: 90% CR
 - GR value = 0
- All events consistent with GR

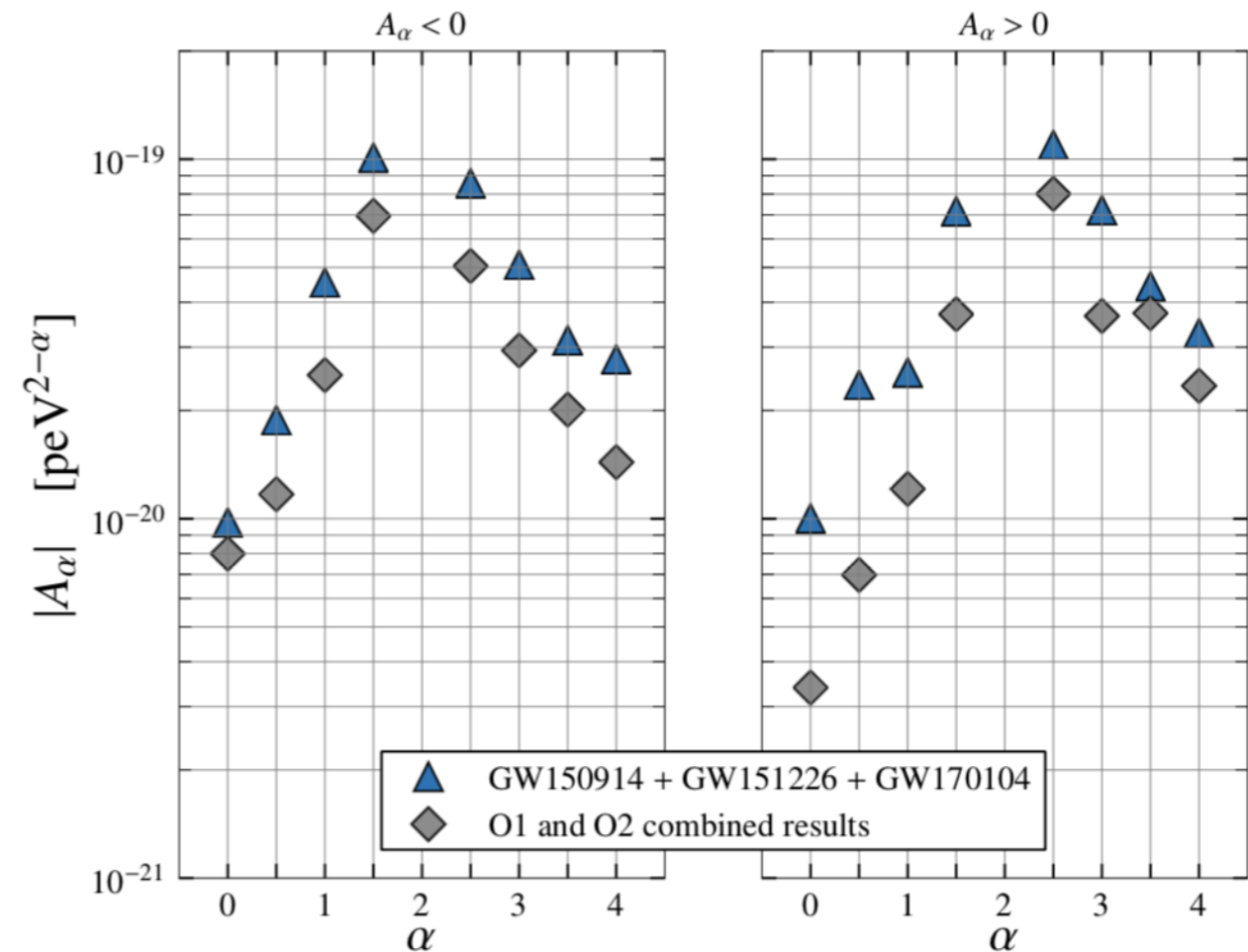
Parametrized test of GW propagation

- Assume a **phenomenological dispersion relation**

$$E^2 = p^2 c^2 + A_\alpha p^\alpha c^\alpha$$

where **GR** has $A_\alpha = 0$

- **Massive graviton** ($\alpha = 0, A_\alpha > 0$)
- **Lorentz-violating theories**
- **Dispersive propagation of GWs** except for $\alpha = 2$
- Use GR waveforms and only modify propagation



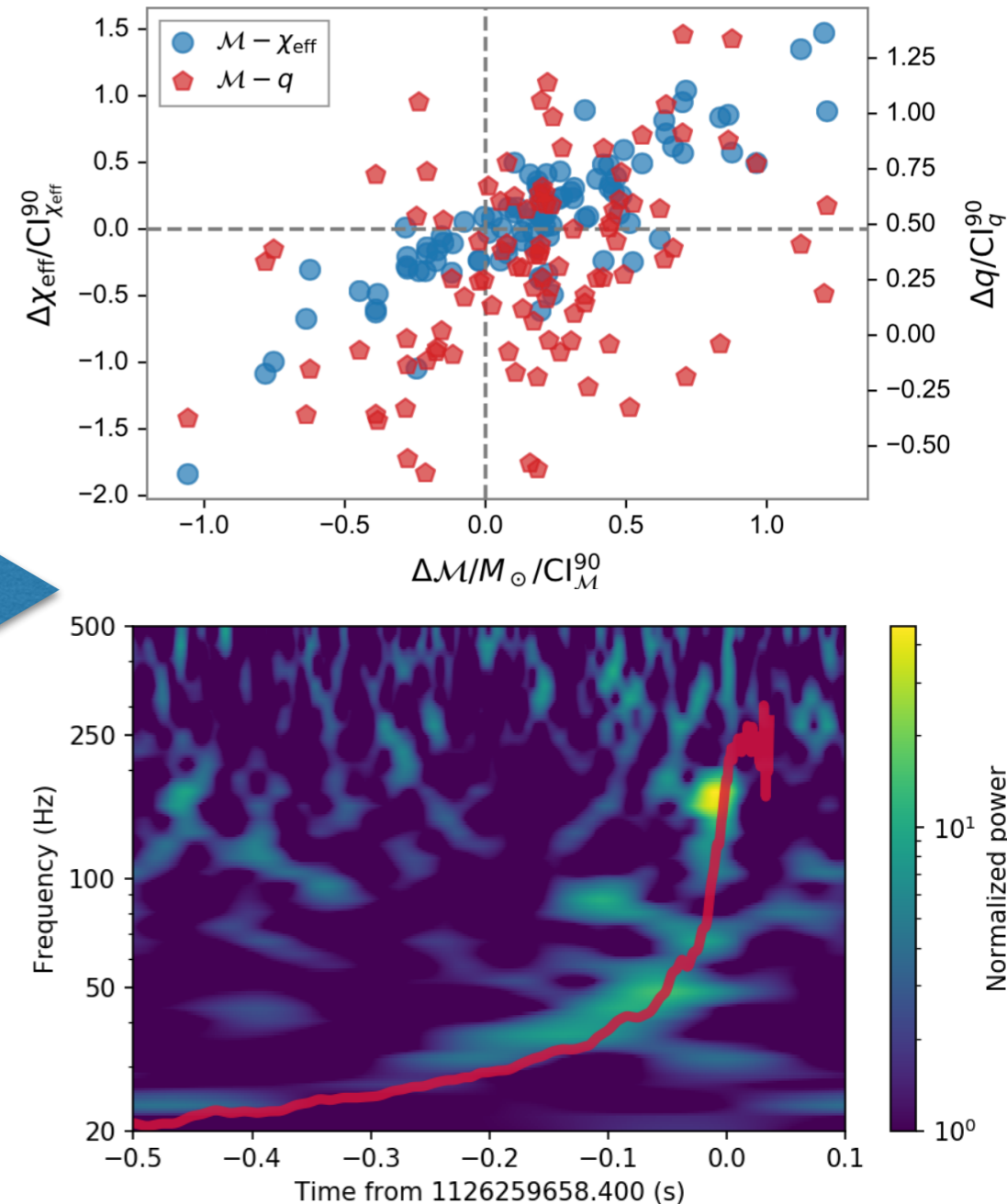
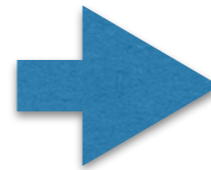
- 90% credible upper bounds on $|A_\alpha|$
 - $1\text{peV} \simeq h \times 250\text{Hz}$
 - $m_g \leq 4.7 \times 10^{-23} \text{eV}/c^2$
- No indication for dispersive propagation of GWs.

Constraints on Alternative Polarizations

- For events observed with three or more GW detectors:
 - is possible to **distinguish purely tensor** from **purely vector** or **purely scalar perturbations**
 - detectors have **different antenna patterns** for different polarizations
- Compute **Bayes factors** between options:
 - GW170817: **BF > 10²⁰** in favor of **pure tensor polarizations**
 - Weaker constraints from binary black hole events (SNR and sky localizations play a role)

Conclusion & Outlook

- Will have **many more events** during O3 and future observing runs: **statistical errors** of the combined results will soon **decrease significantly**
- Potential sources of **systematic errors**:
 - **imperfect modeling of GR waveforms** & missing physics problem for 2G design & 3G detectors (ET)
 - **calibration uncertainties**
 - **noise artifacts**
- Goal: **inspiral-merger-ringdown waveforms for alternative theories of gravity**
 - This is hard: need to solve **initial value problem** for 2-body problem: well-posedness?
 - Obtain waveform in the **inspiral** regime
 - Develop **numerical relativity** codes for alternative theories

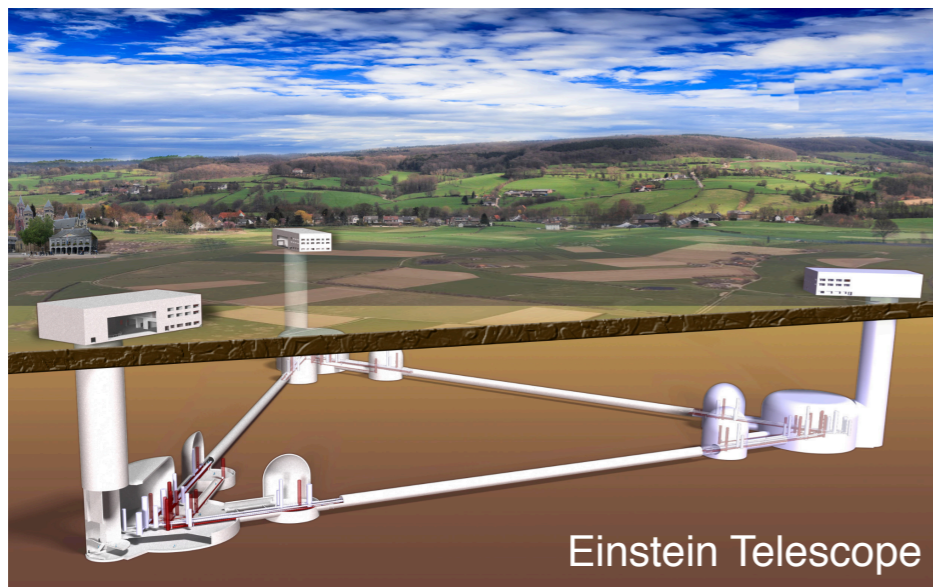


Biases / stat error and power in residual from population study

Einstein Telescope and 3G Science

Science Targets for 3G GW Detectors

- *determine* the properties of the **hottest and densest matter** in the Universe
- *reveal* the **merging BH population** throughout the Universe; seeds
- *investigate* the **particle physics** of the **primeval Universe** and probe its dark sectors



- *3G Science Case Document, led subgroup on waveforms & data analysis*
- *3G White paper on Extreme Gravity and Fundamental Physics, arXiv:1903.09221*
- *3G network sensitivity ~ 20 times better than aLIGO/Virgo: **precision measurements!***



Extra slides



Phase contributions from dispersion relation

- Treat the GW as a **stream of gravitons**, which travel at the **particle velocity** $v_p/c = pc/E = 1 - A_\alpha E^{\alpha-2}/2 + O(A_\alpha^2)$
- **Length scale** of modifications to the Newtonian potential $\lambda_A := hc|A_\alpha|^{1/(\alpha-2)}$
- Fourier domain **dephasing** due to modified dispersion relation:

$$\delta\Phi_\alpha(f) = \text{sign}(A_\alpha) \begin{cases} \frac{\pi D_L}{\alpha - 1} \lambda_{A,\text{eff}}^{\alpha-2} \left(\frac{f}{c}\right)^{\alpha-1}, & \alpha \neq 1 \\ \frac{\pi D_L}{\lambda_{A,\text{eff}}} \ln\left(\frac{\pi G \mathcal{M}^{\text{det}} f}{c^3}\right), & \alpha = 1 \end{cases}$$

$$\lambda_{A,\text{eff}} := \left[\frac{(1+z)^{1-\alpha} D_L}{D_\alpha} \right]^{1/(\alpha-2)} \lambda_A \quad D_\alpha = \frac{(1+z)^{1-\alpha}}{H_0} \int_0^z \frac{(1+\bar{z})^{\alpha-2}}{\sqrt{\Omega_m(1+\bar{z})^3 + \Omega_\Lambda}} d\bar{z},$$

Mirshekari et al, PRD 85, 024041 (2012)