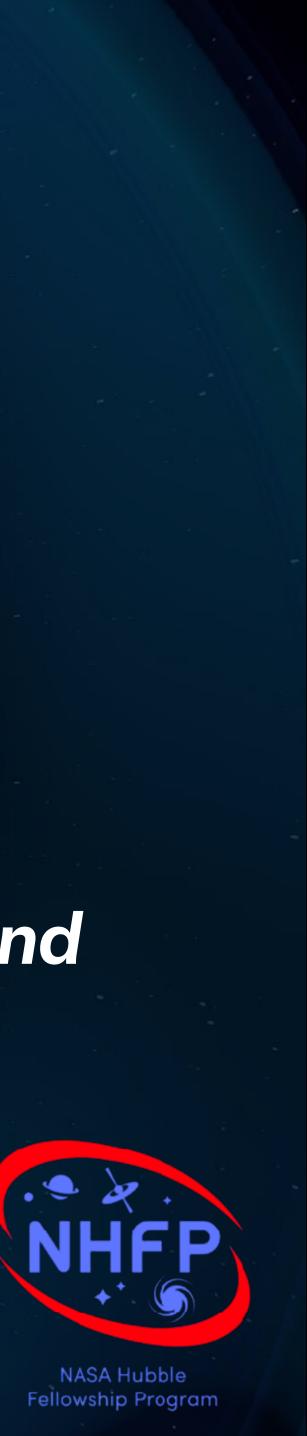
# Astrophysical Lessons from LIGO/Virgo's Black Holes

Maya Fishbach **ICERM - Statistical Methods for the Detection, Classification and Inference of Relativistic Objects** November 16 2020

CENTER FOR INTERDISCIPLINARY EXPLORATION AND RESEARCH IN ASTROPHYSICS

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### World-wide network of gravitational-wave detectors

LIGO Hanford

# LIGO Livingston



Kagra (coming soon



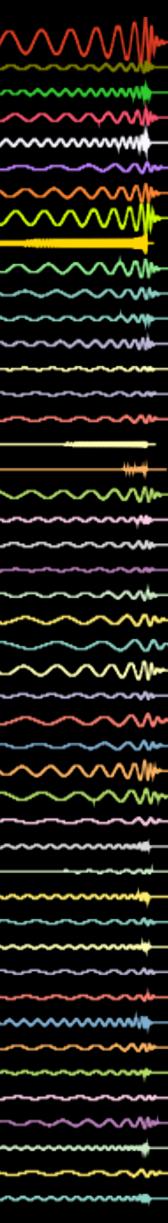
IGO India (coming ~2025

#### LIGO and Virgo have observed gravitational waves from ~50 mergers

Credit: Chris North & Stuart Lowe, https://waveview.cardiffgravity.org

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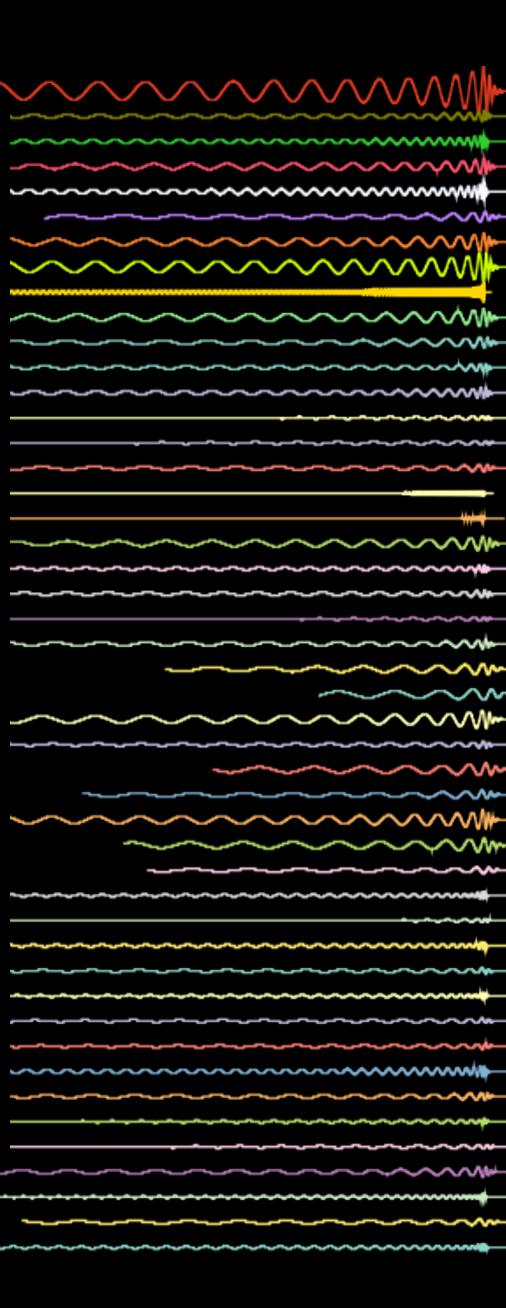
**GWTC-2** papers:

Catalog: dcc.ligo.org/P2000061/public arXiv: 2010.14527

Population paper: dcc.ligo.org/LIGO-P2000077/public arXiv:2010.14533

Tests of GR paper: dcc.ligo.org/LIGO-P2000091/public arXiv: 2010.14529

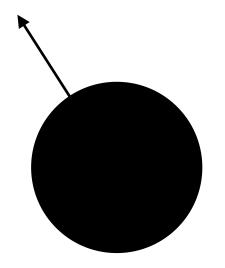




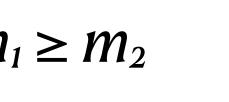
#### For each binary black hole merger, the gravitational-wave signal encodes:

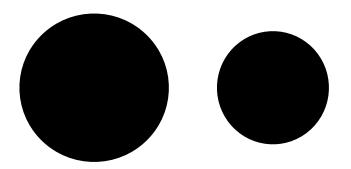
• The masses of the two components  $m_1 \ge m_2$ 

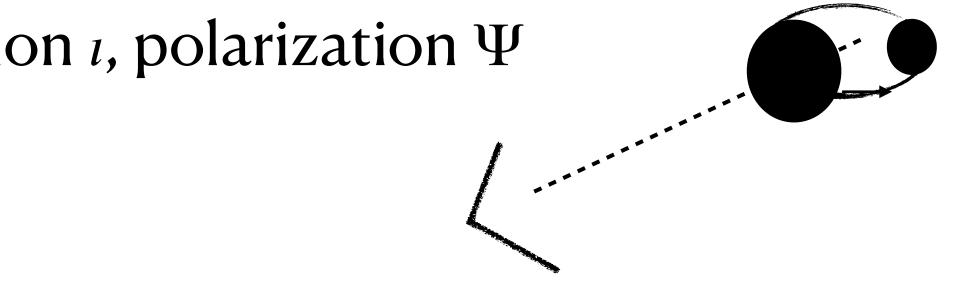
• The component spins  $a_{1,} a_2$ 



• Distance dL, sky position  $\alpha$ ,  $\delta$ , inclination  $\iota$ , polarization  $\Psi$ 







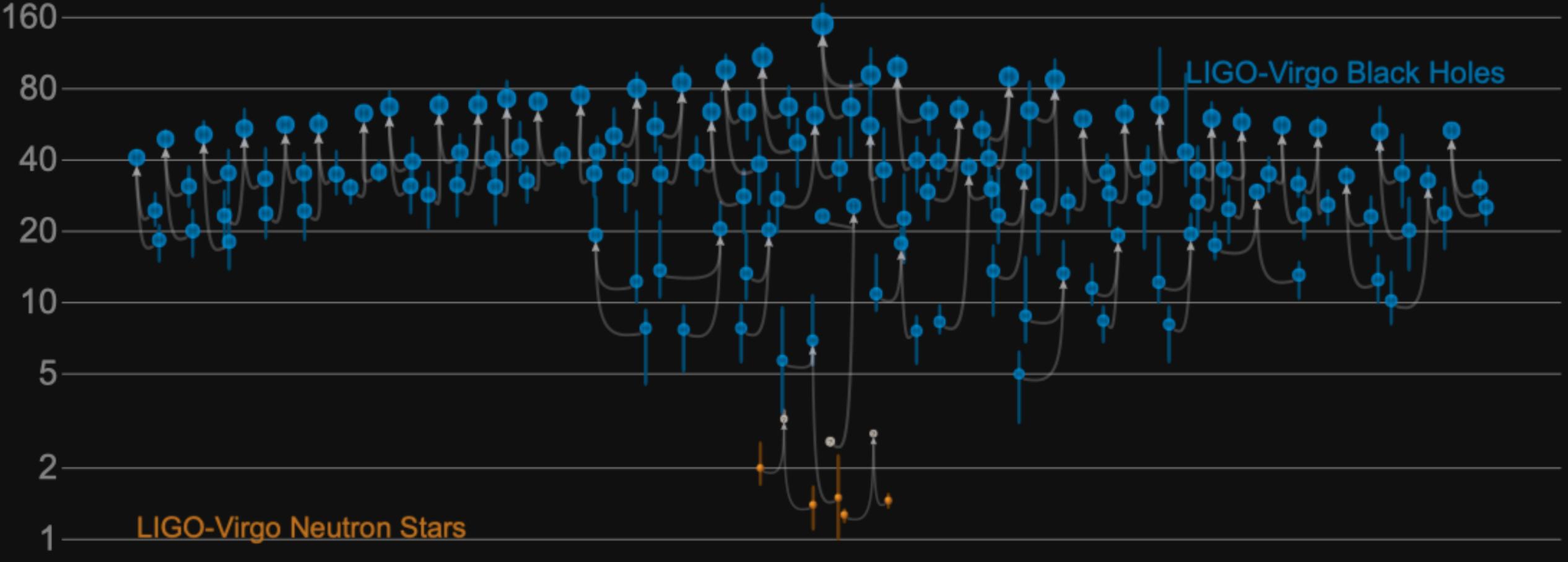
#### Measuring these parameters for each event is known as *parameter estimation*

#### Masses in the Stellar Graveyard in Solar Masses



GWTC-2 plot v1.0 LIGO-Virgo | Frank Elavsky, Aaron Geller | Northwestern

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### Parameter estimation

For individual events, measurement uncertainties are large, and our inferred posterior depends on the prior

# Posterior

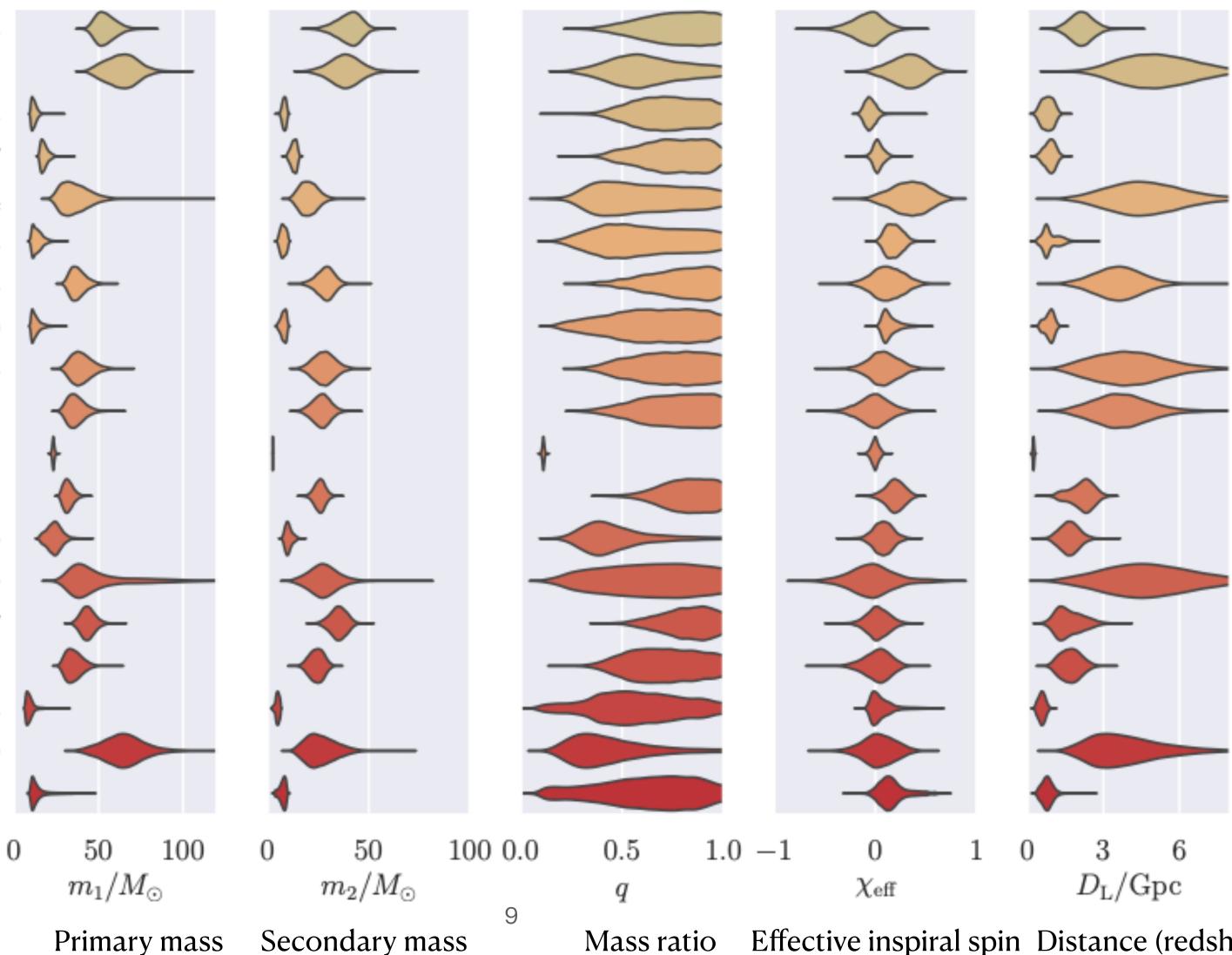
LIGO/Virgo prior: *flat* in (detector-frame) masses

 $p(m_1, m_2 \mid \text{data}) \propto p(\text{data} \mid m_1, m_2) p_0(m_1, m_2)$ Prior Likelihood



#### Measurements of individual events' parameters **Subset of events in GWTC-2**

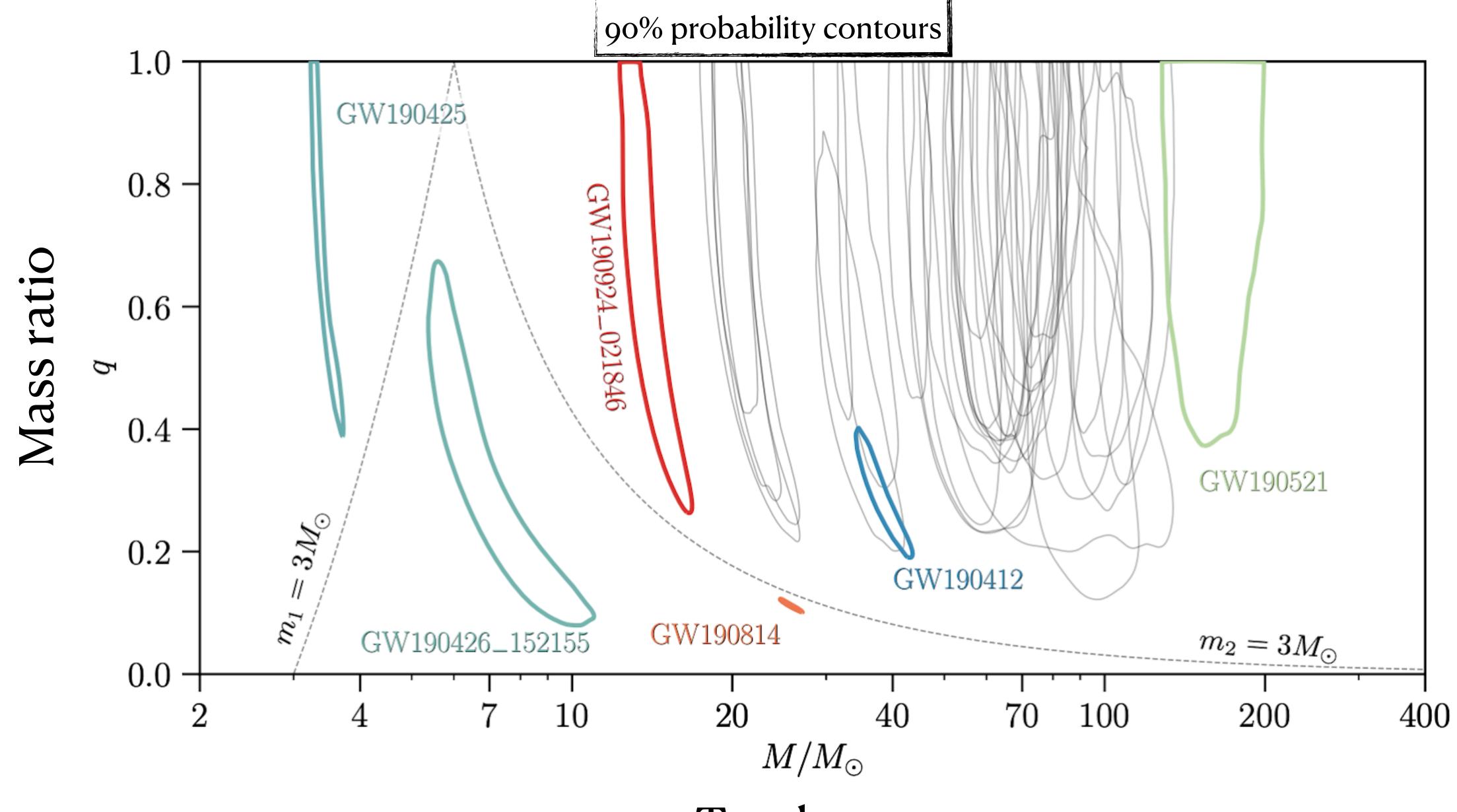
GW190701\_203306 GW190706\_222641 GW190707\_093326 GW190708\_232457 GW190719\_215514 GW190720\_000836 GW190727\_060333 GW190728\_064510 GW190731\_140936 GW190803\_022701 GW190814 GW190828\_063405 GW190828\_065509 GW190909\_114149 GW190910\_112807 GW190915\_235702 GW190924\_021846 GW190929\_012149 GW190930\_133541



Secondary mass

Effective inspiral spin Distance (redshift) Mass ratio





#### Total mass

10

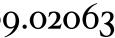
## From Single Events to a Population

- Introduce a set of population **hyper-parameters** that describe the **distributions** of masses, spins, redshifts across multiple events
- Example: Fit a power-law model to the mass distribution of black holes,  $p(mass | a) \propto mass^{-a}$
- Take into account measurement uncertainty and selection effects



**Population analysis** Find the "best" prior to use for individual events  $p(m_1, m_2 \mid \alpha)$ Population model, common to all systems Parameter estimation likelihood for event *i*  $\int p(\text{data}_i \mid m_1, m_2) p(m_1, m_2 \mid \alpha) dm_1 dm_2$  $p(\text{data} \mid \alpha) = \int_{\alpha}^{\alpha}$  $\beta(\alpha)$ Selection effects: fraction of population detectable systems in the hyperparameters population

Mandel, Farr & Gair arXiv:1809.02063



### Three Astrophysical Lessons

The population properties of binary black holes reveal how these systems are made

- 1
- Misaligned black hole spins 2.
- 3. Black hole merger rate across cosmic time

### A feature in the mass distribution at ~40 solar masses

### Three Challenges

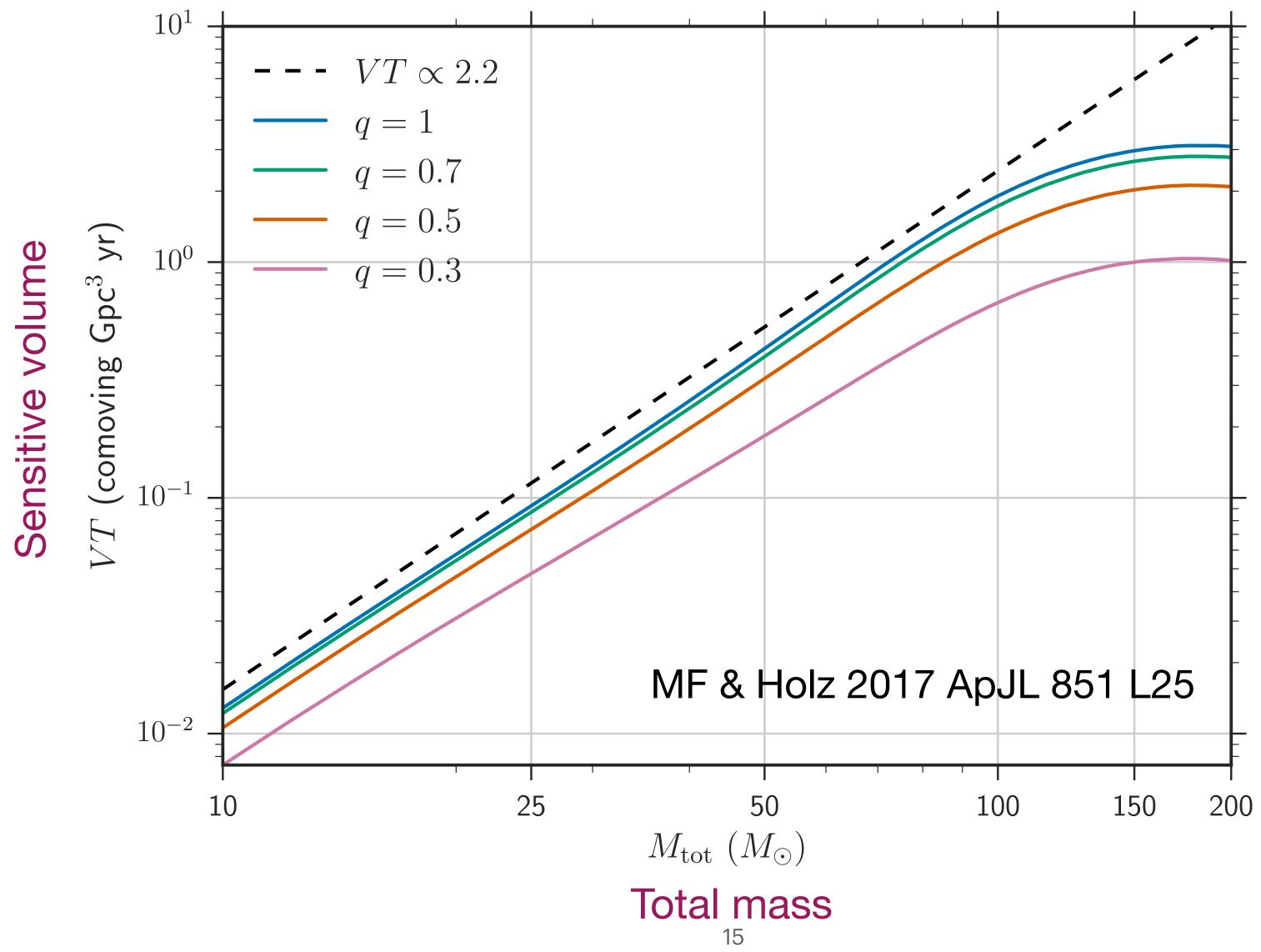
To account for when recovering the population distribution of binary black holes

- 1.
- 2. effects)
- 3. Our models may not match the true population distribution (necessitates model checking)

### The parameters of individual systems are uncertain

Some systems are easier to detect than others (selection

#### **Example of selection effects:** Big black holes are louder than small black holes

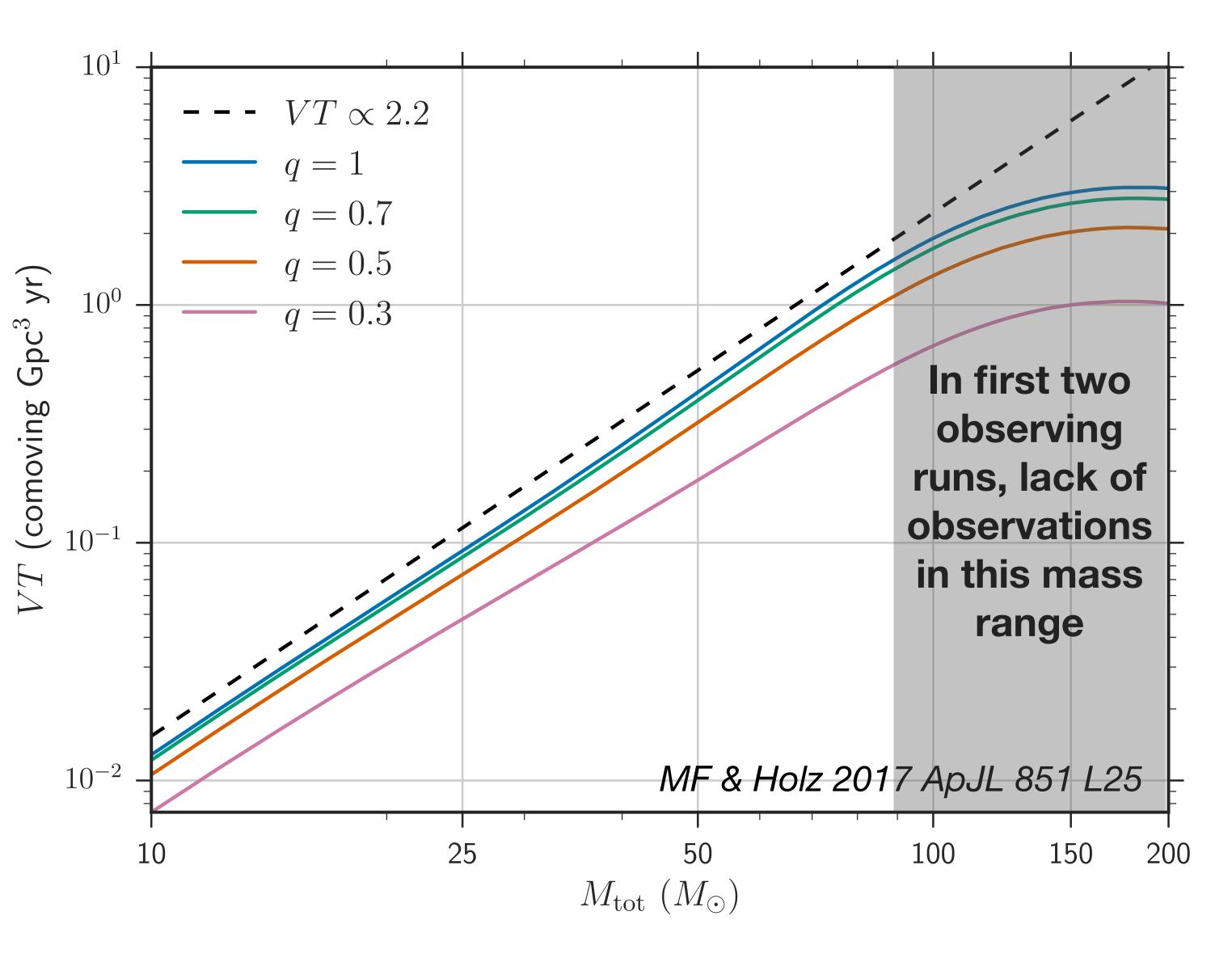


#### Astrophysical Lesson #1: Dearth of big black holes in the black hole population

## Where are LIGO's big black holes?

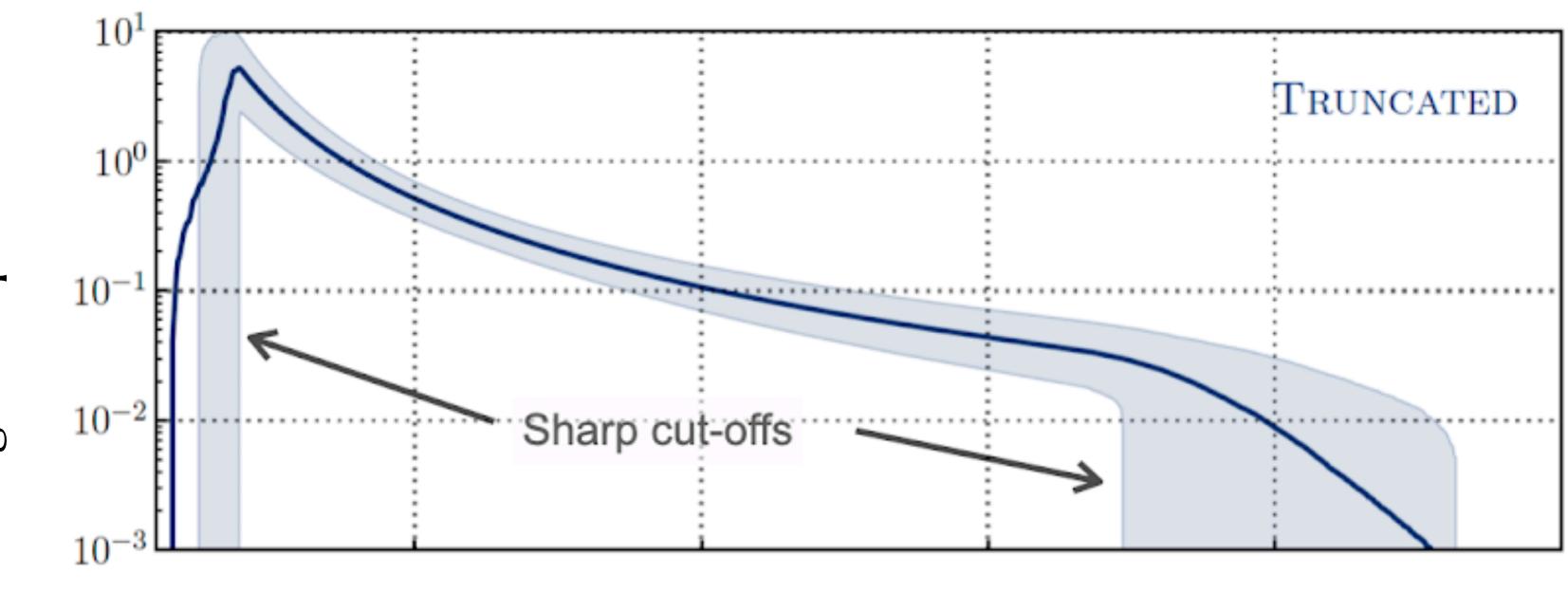
Big black holes are very loud, and yet we did not see any binary black holes with component masses above ~45 solar masses in the first two observing runs.

 $\rightarrow$  These systems must be rare in the underlying population.



#### With the first 10 binary black holes, we measured the maximum black hole mass to be ~40 solar masses

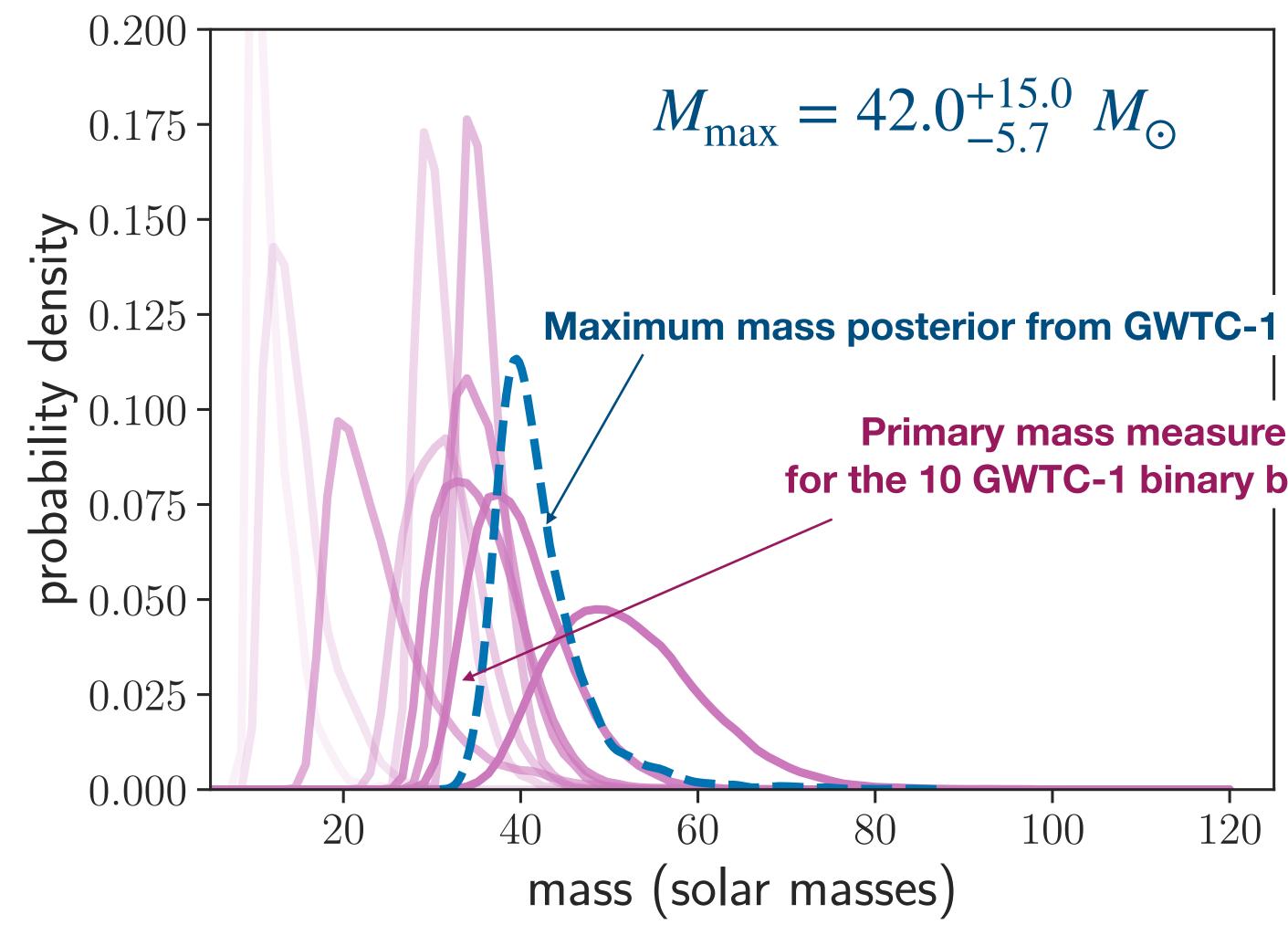
#### The black hole masses we observed were consistent with coming from a truncated power law distribution



Merger rate per mass

#### Primary mass

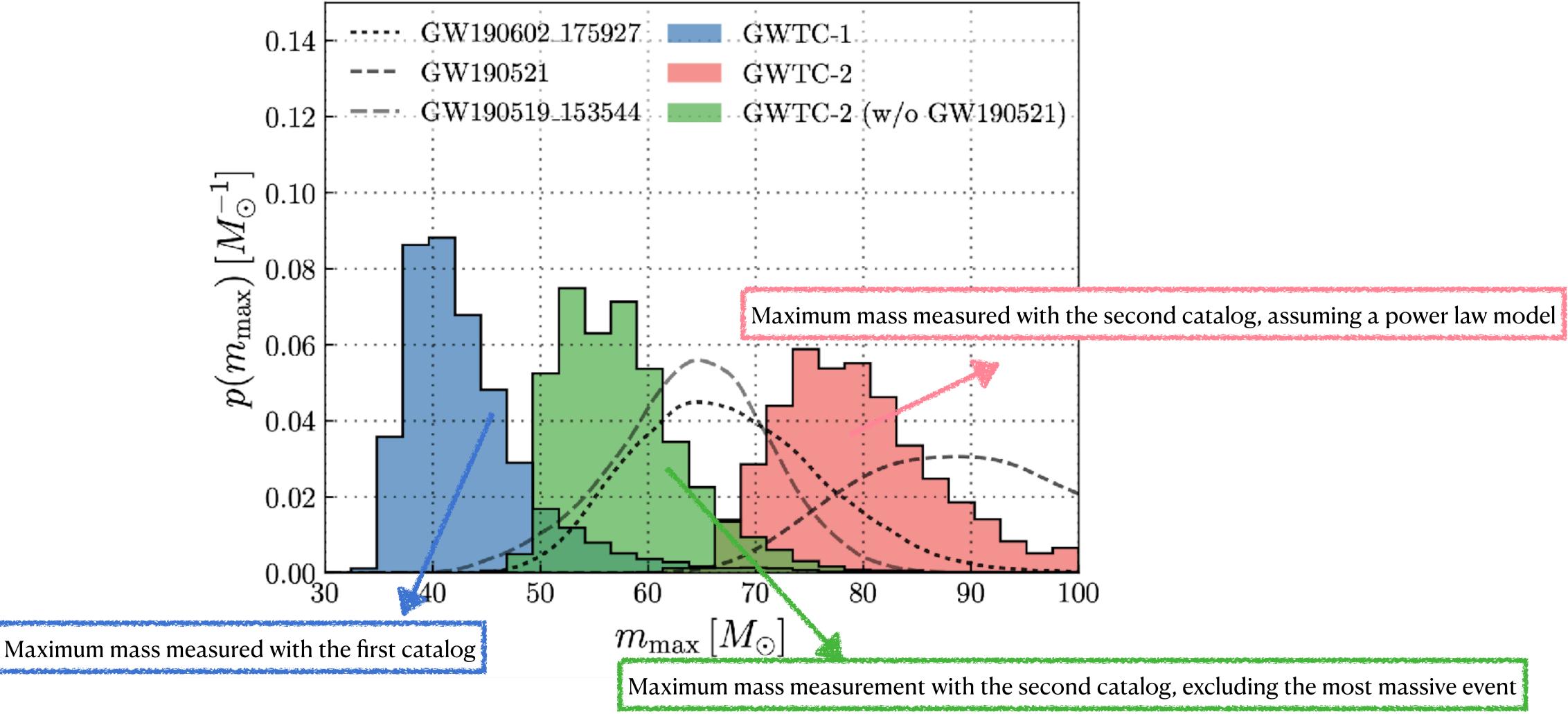
#### With the first 10 binary black holes, we measured the maximum black hole mass to be ~40 solar masses



$$M_{\rm max} = 42.0^{+15.0}_{-5.7} \ M_{\odot}$$

**Primary mass measurements** for the 10 GWTC-1 binary black holes

#### We now know that ~40 solar masses is not a sharp limit: there are bigger black holes out there!

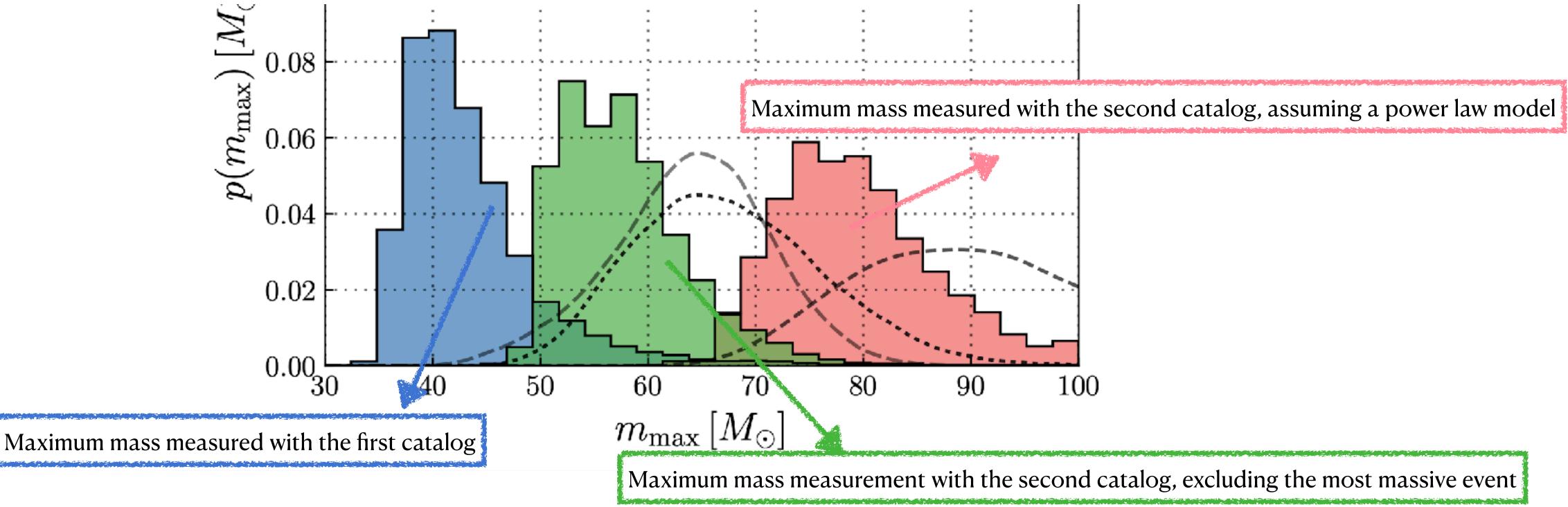


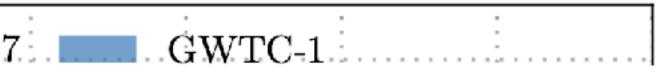
Abbott+ arXiv:2010.14533

#### We now know that ~40 solar masses is not a sharp limit: there are bigger black holes out there!

GW190602\_175927

#### **Example of challenge** #3: we need to introduce additional mass distribution features in our model to adequately fit to the data

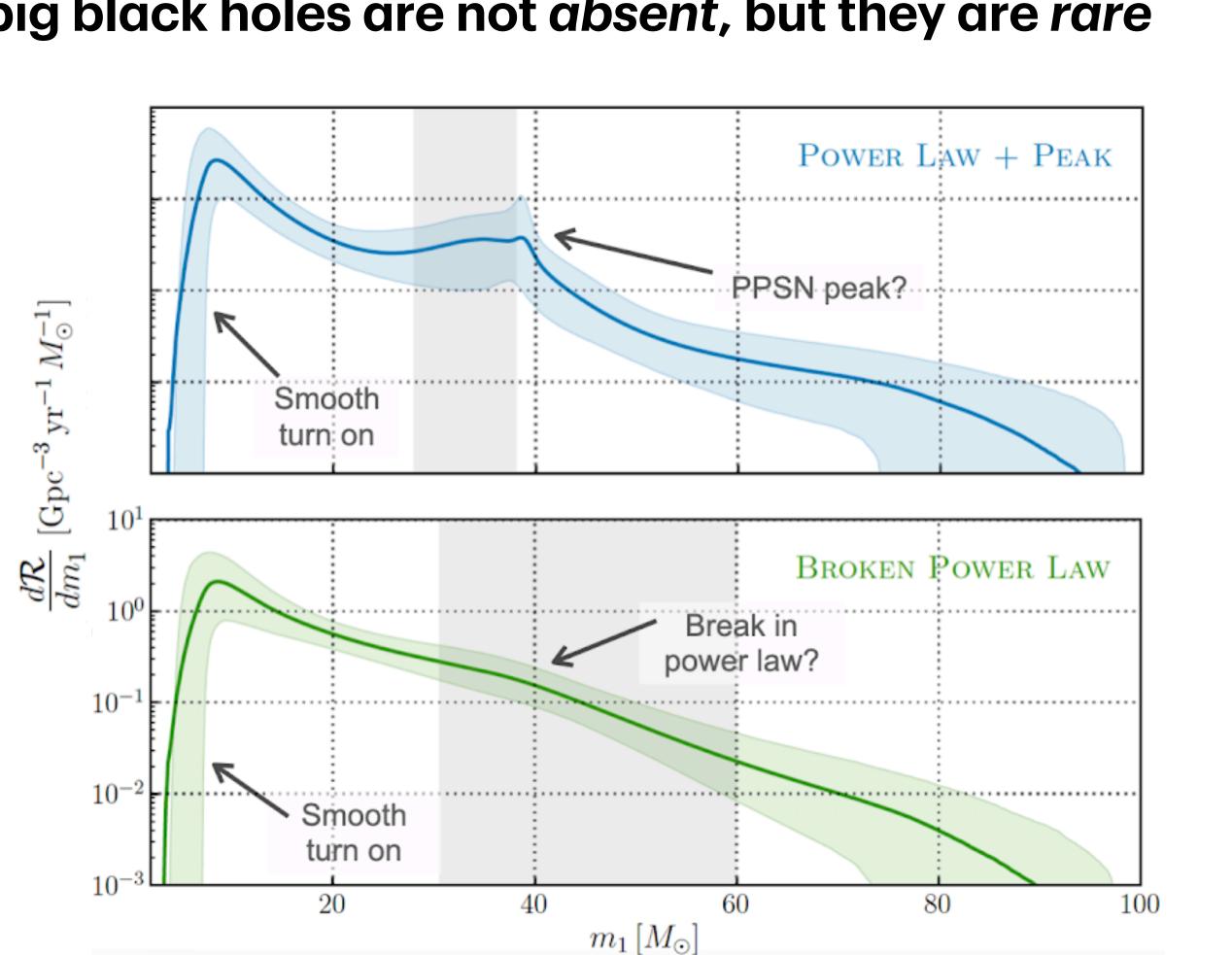




#### Nevertheless, there is a feature in the black hole mass distribution at ~40 solar masses

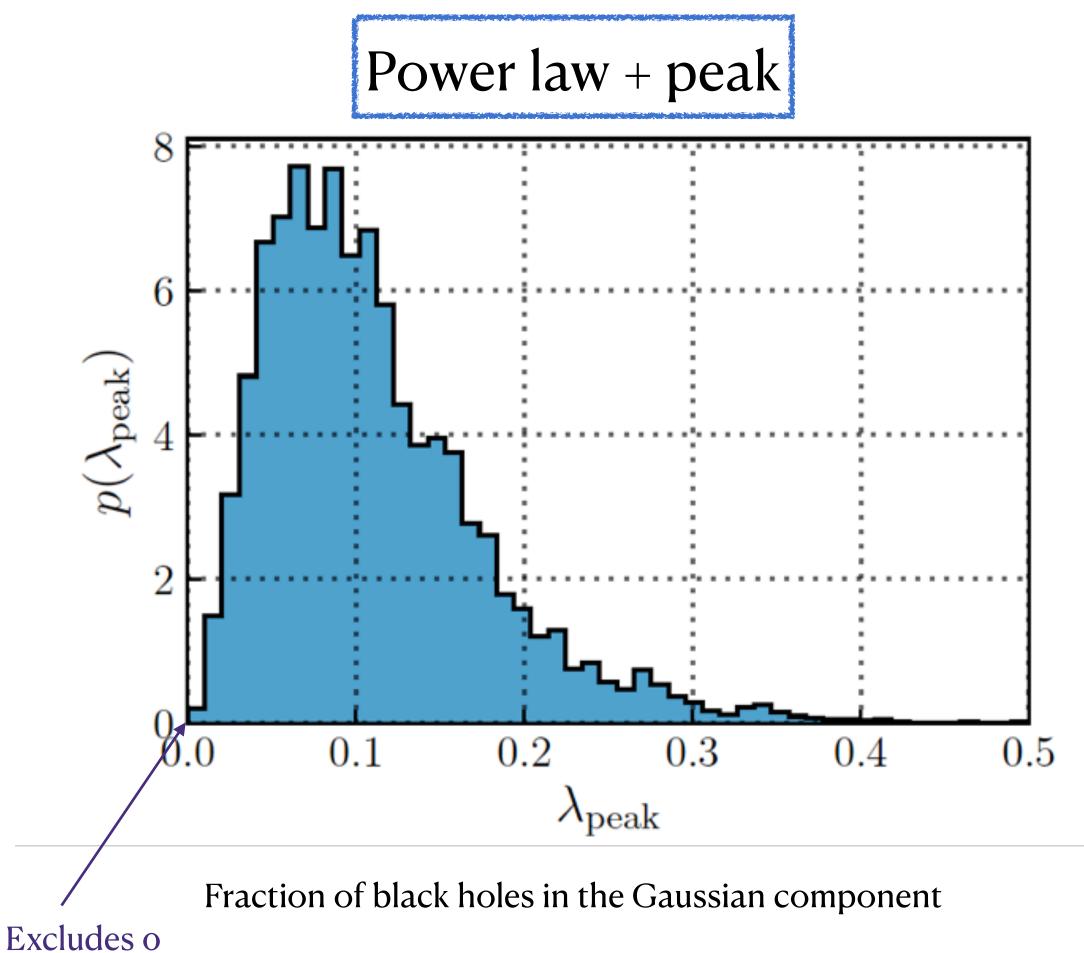
With the third observing run, we know that big black holes are not absent, but they are rare

- A truncated power law with sharp cutoffs fails to fit the data
- We must introduce additional features, like a Gaussian peak or a break in the power law
- The black hole mass distribution steepens at ~40 solar masses

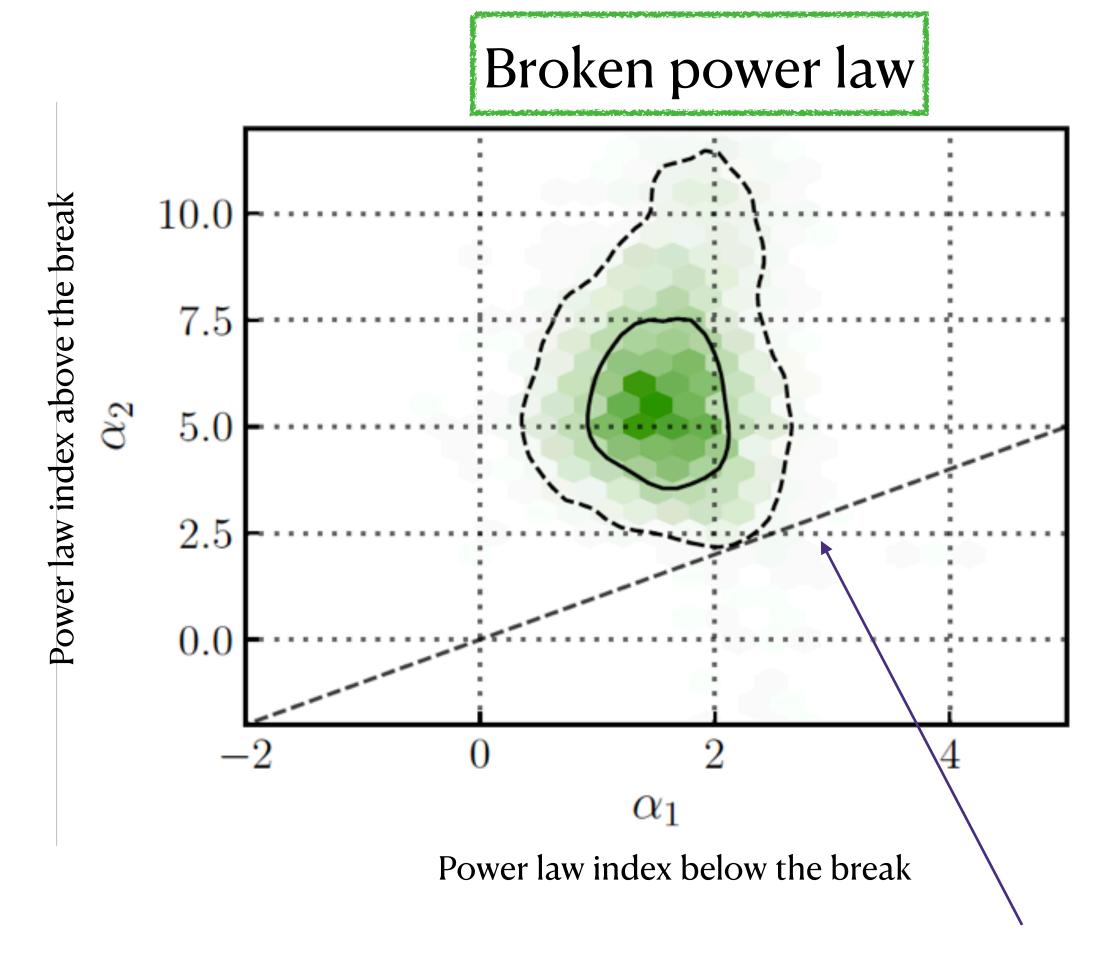




### Multiple observations allow us to resolve detailed features of the black hole mass distribution



Abbott+ arXiv:2010.14533

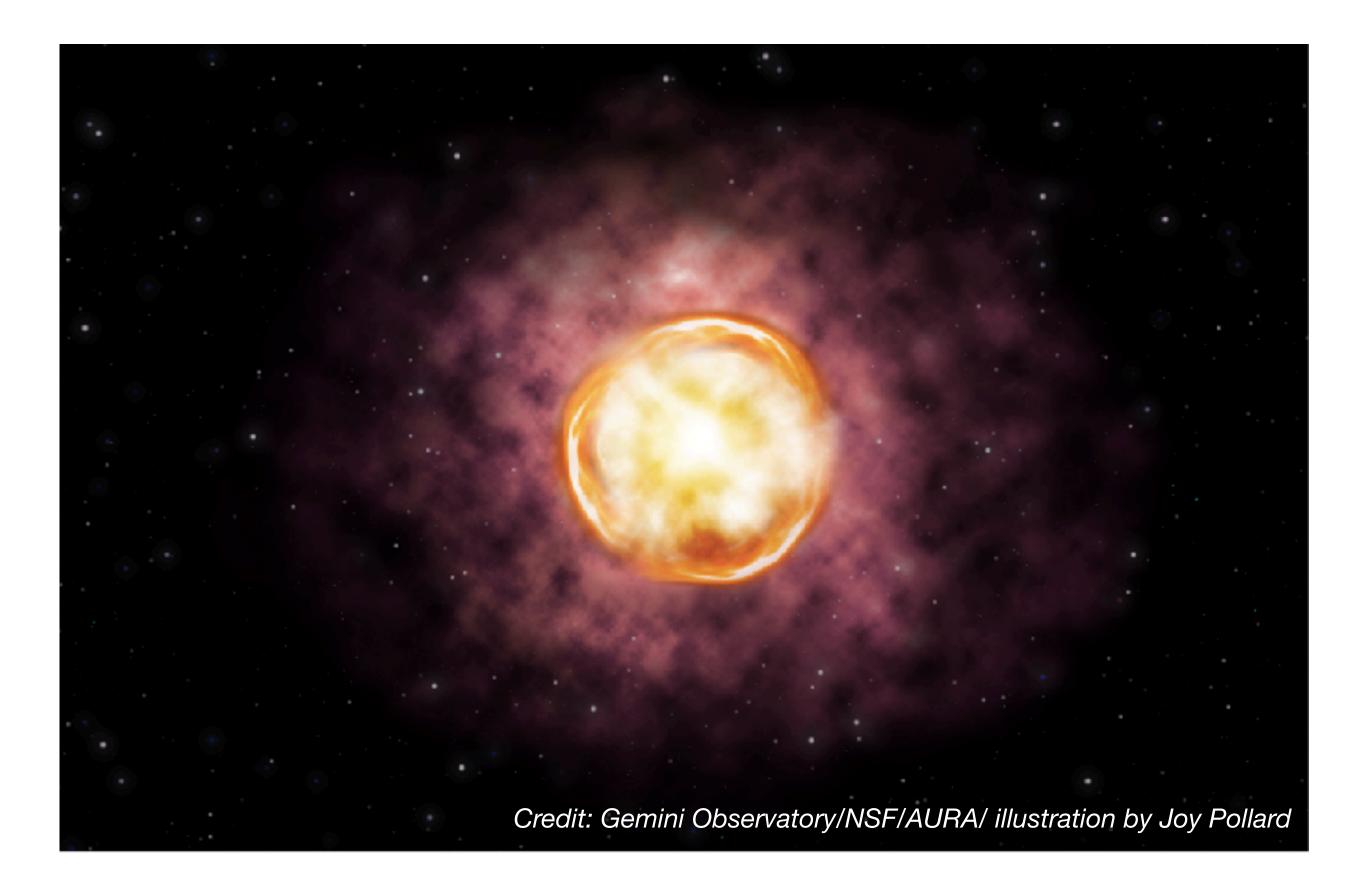


Excludes a single power law (equal indices)



#### Astrophysical Implications: Feature at ~40 solar masses caused by pair-instability supernova?

- (Pulsational) pair-instability supernovae predict an absence of black holes in the range ~40 - 120 solar masses
- Applies to black holes formed from stellar collapse
- Are black holes above this limit formed via a different channel? (E.g., from smaller black holes?) Or perhaps the limit is not as sharp as we thought? Further measurements will help us resolve this question.



### Astrophysical Lesson #2:

#### Black hole spins are not always aligned with the orbital angular momentum

- The gravitational-wave signal can be parameterized by two "effective" spins:
  - The effective inspiral spin measures the total spin along the orbital angular momentum axis

$$\chi_{ ext{eff}} = rac{m_1 \, \chi_1 \cos heta_1 + m_2 \, \chi_2 \cos heta_2}{m_1 + m_2}$$

• The effective precessing spin measures the spin in the orbital plane, perpendicular to orbital angular momentum axis

$$\chi_{\rm p} \sim \chi_1 \sin \theta_1$$

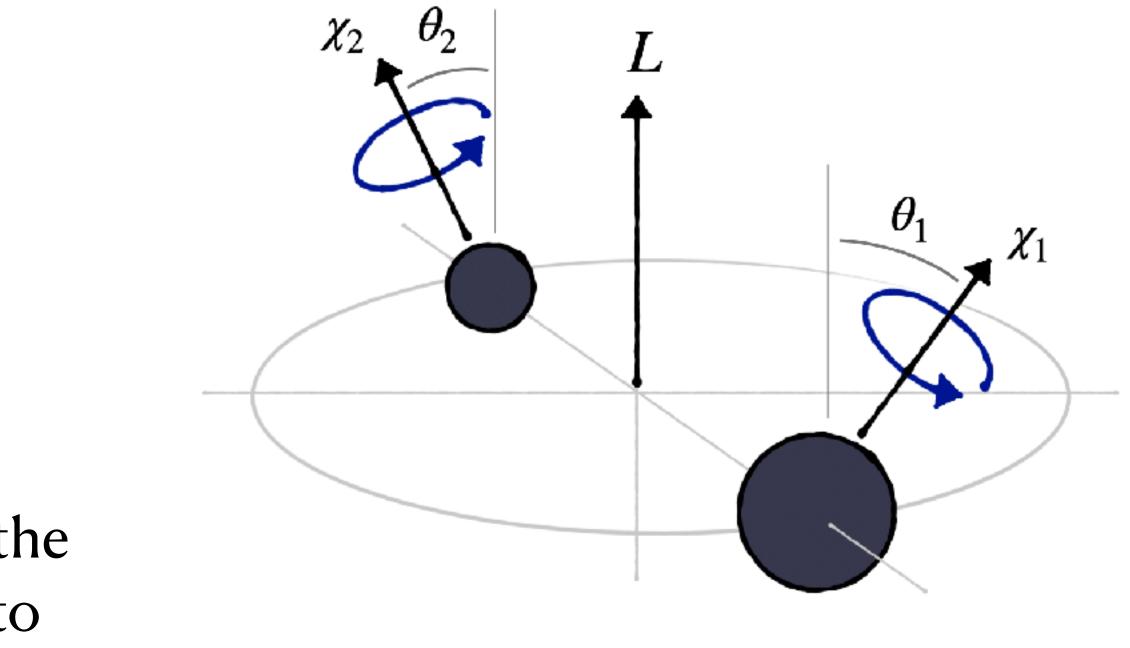
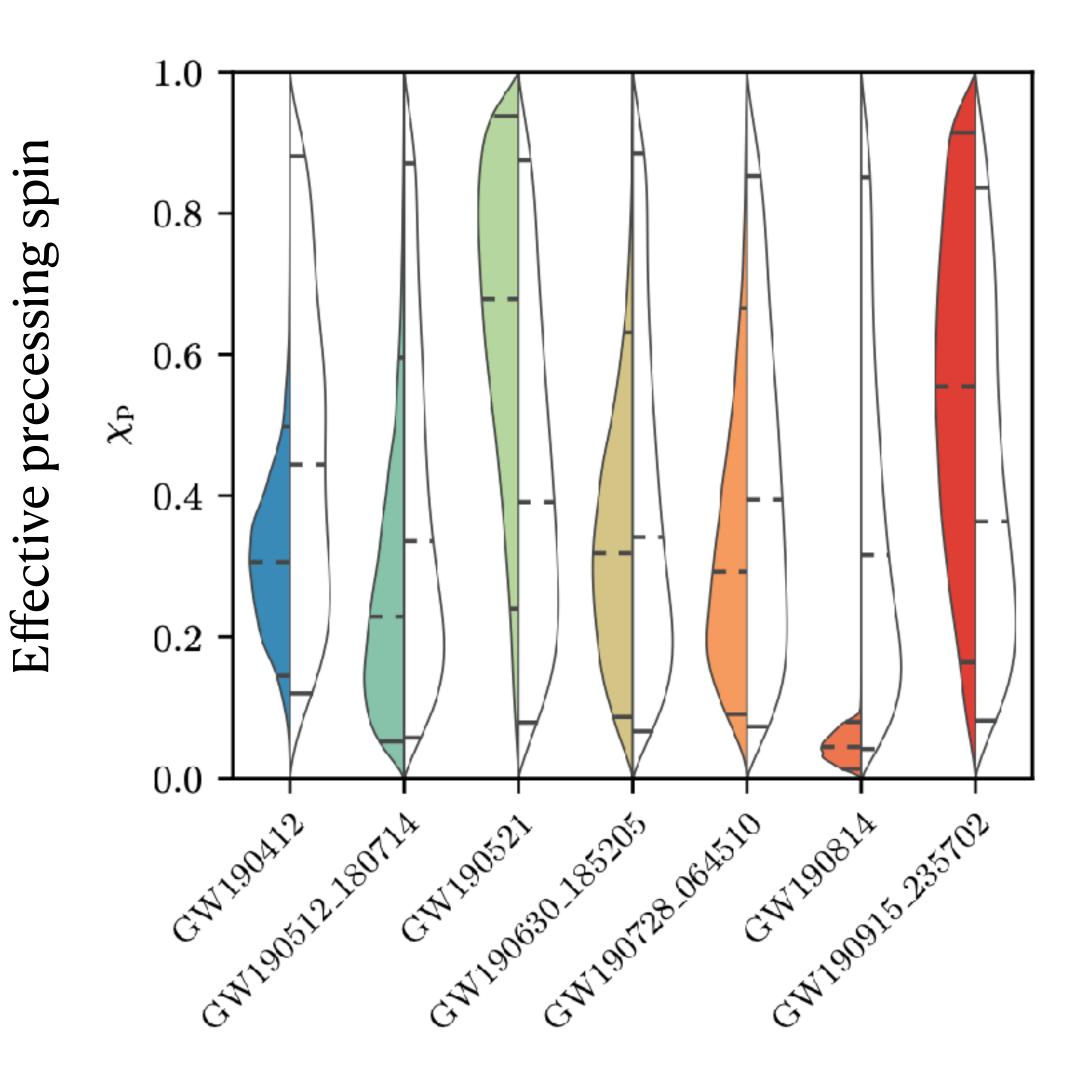


Figure credit: Thomas Callister

#### For individual events, in-plane spins tend to be poorly constrained



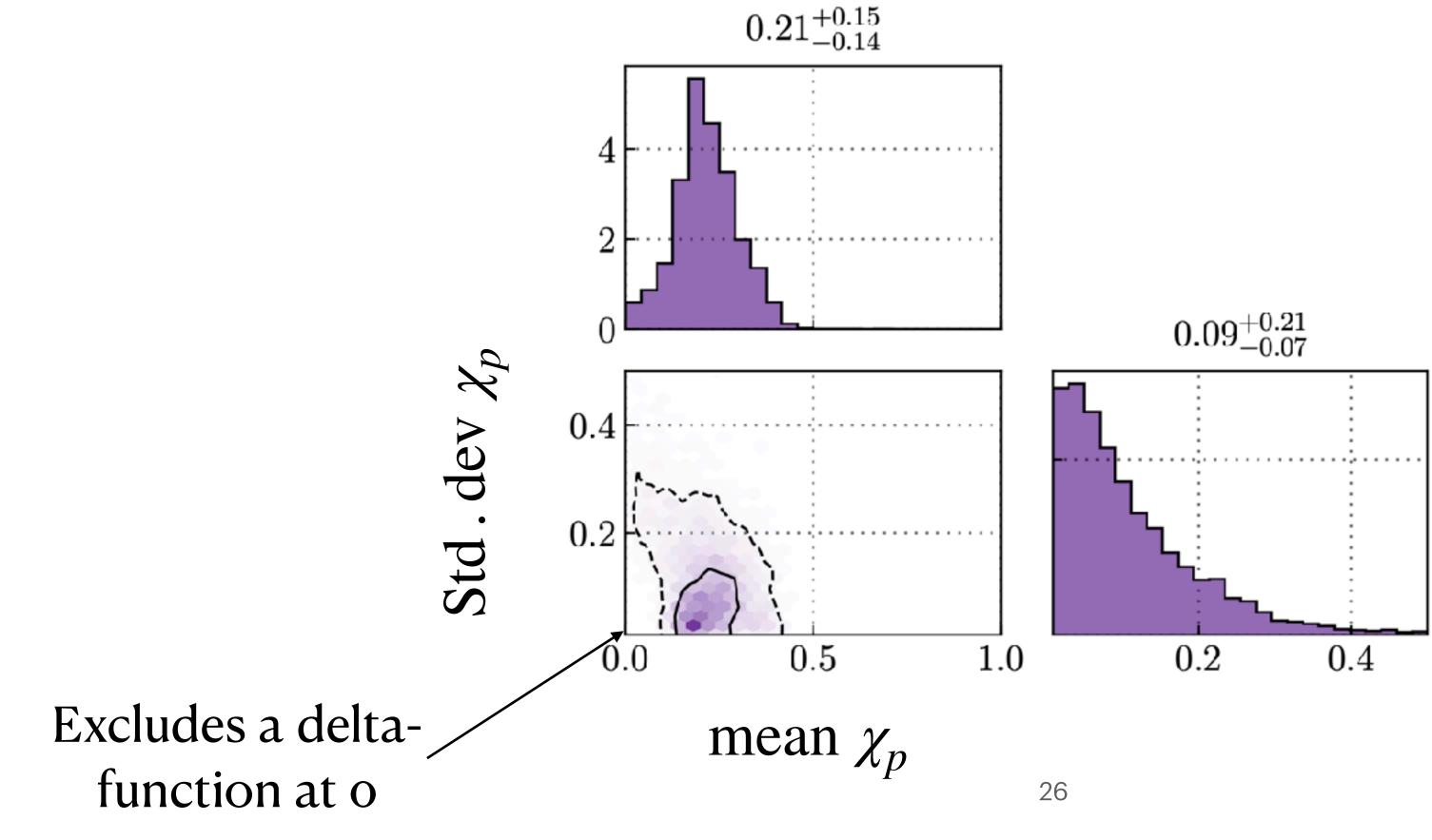
Individually, no system shows strong evidence for in-plane spins

Abbott+ arXiv: 2010.14527



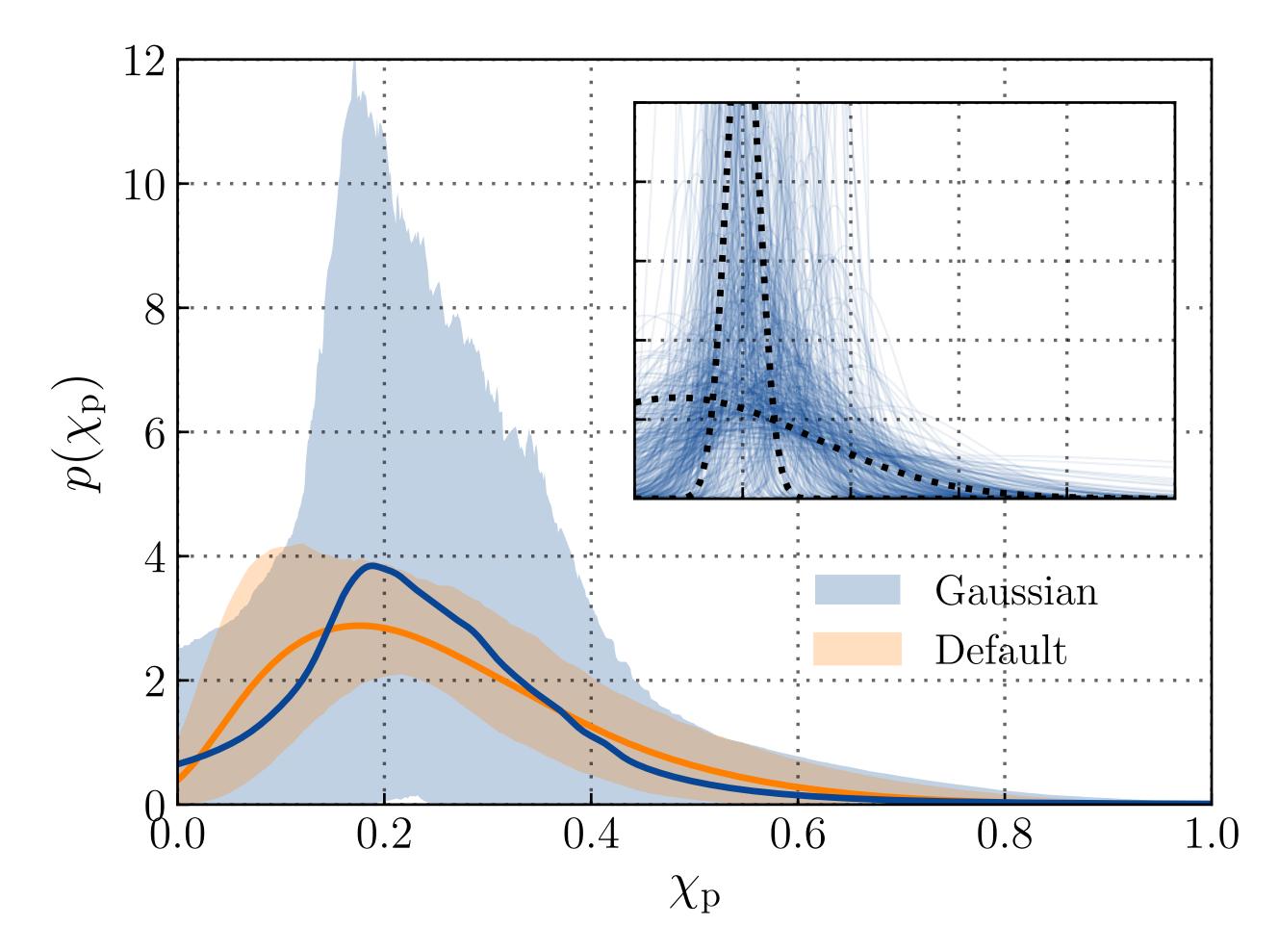
#### On a population level, we find that some systems have in-plane spins $(\chi_p > 0)$

#### We measure the mean and standard deviation of the distribution of $\chi_p$ across all events, assuming a Gaussian distribution





#### On a population level, we find that some systems have in-plane spins $(\chi_p > 0)$



Abbott+ arXiv:2010.14533

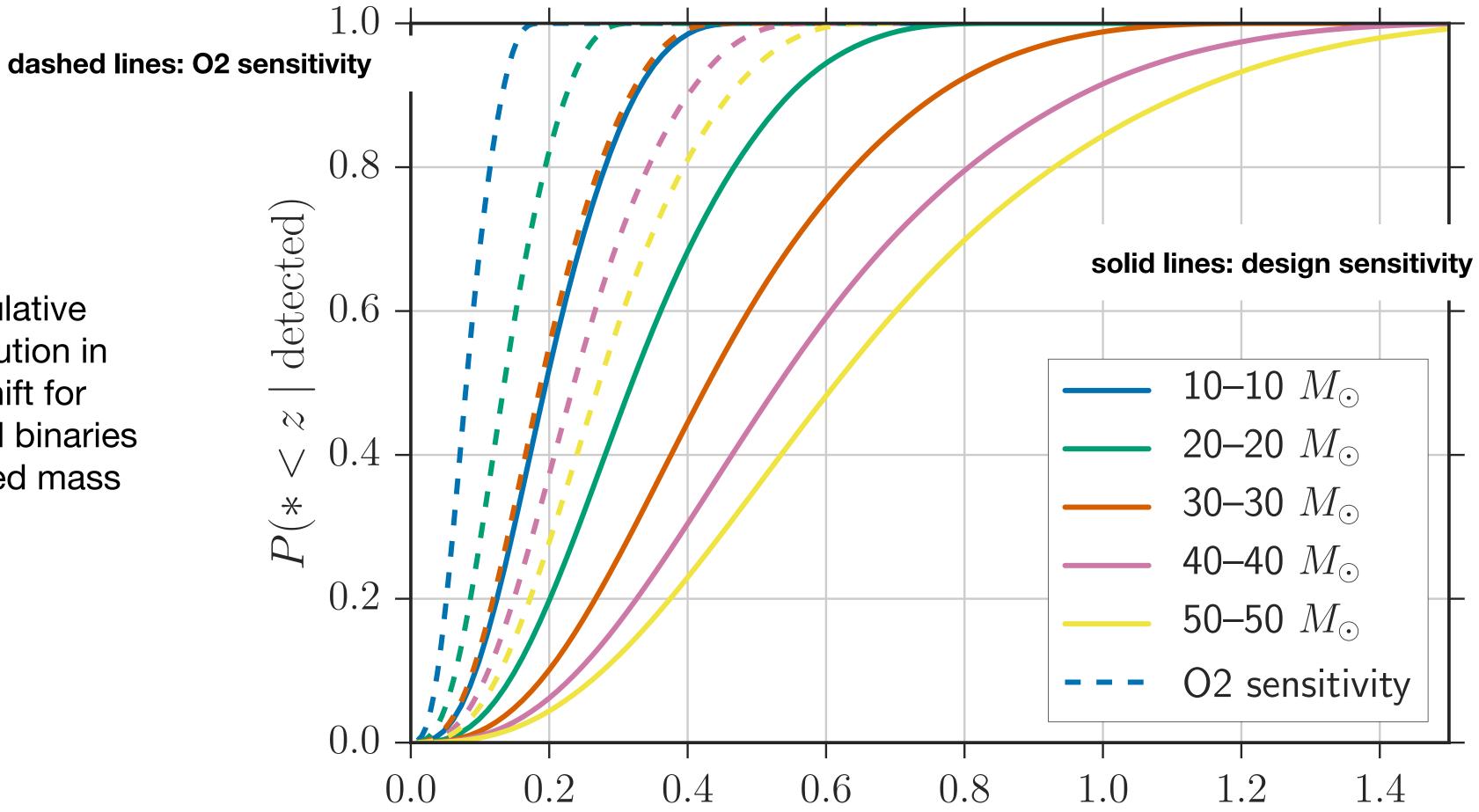


### **Astrophysical Implications of Misaligned Spins** Spin misalignments can be used to distinguish formation channels

- **Isolated field formation:** typically difficult to get large misalignments, but depends on uncertain physics like black hole natal kicks, efficiency of tides
- **Dynamical assembly:** typically expect random spin orientations, but this can depend on whether the environment is gaseous (e.g. AGN disks)







cumulative distribution in redshift for detected binaries of a fixed mass

### Astrophysical Lesson #3:

#### Measuring the black hole merger rate across cosmic time

 $\mathcal{Z}$ 

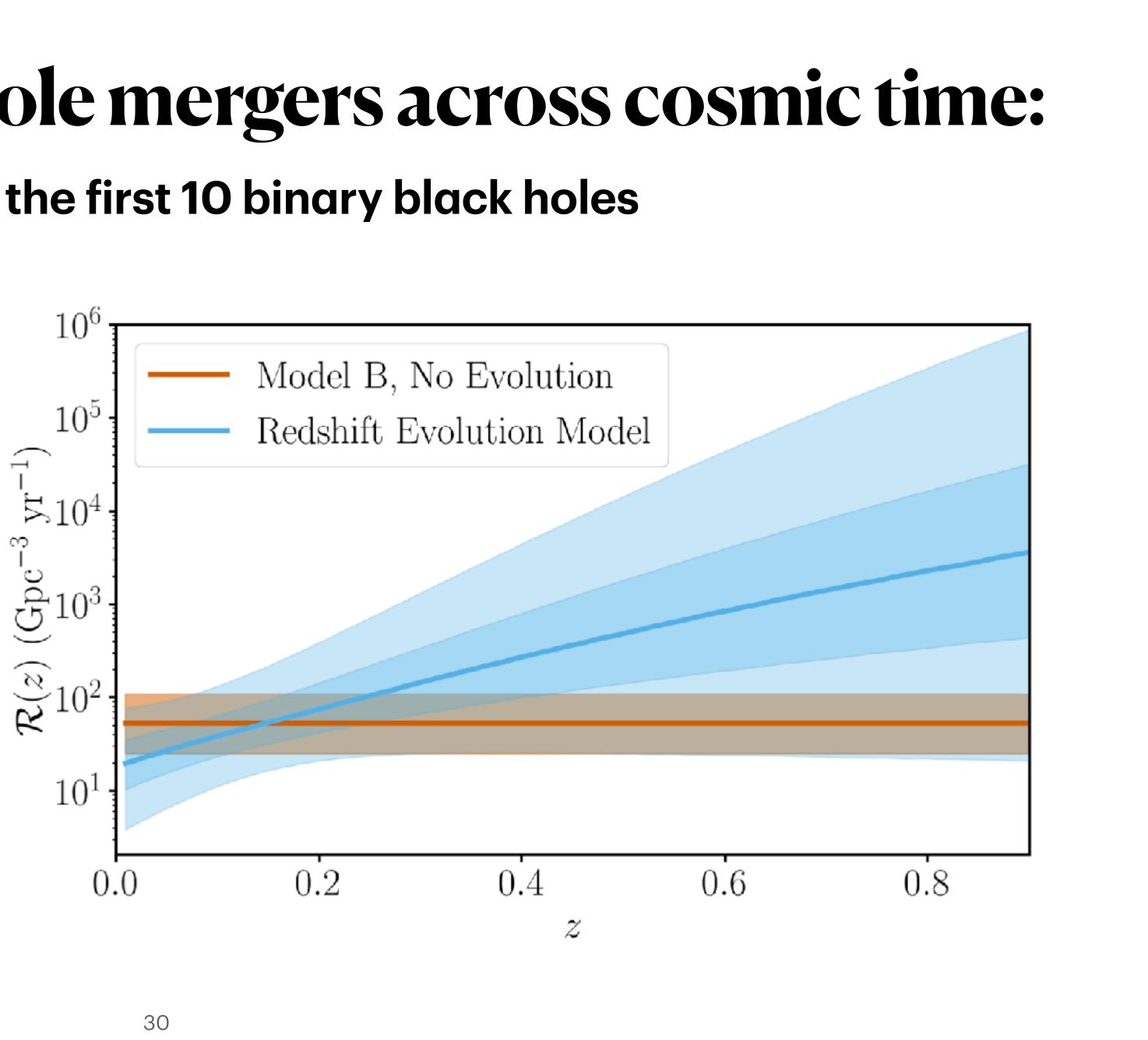
MF, Holz, & Farr 2018 ApJL 863 L41

### Merger rate of black hole mergers across cosmic time: **Inference from the first 10 binary black holes**

- Allowing the merger rate to evolve with redshift, GWTC-1 found:
  - Today (z = 0), the merger rate is between [4, 77] Gpc<sup>-3</sup> yr<sup>-1</sup>
  - 8 billion years ago (z = 1), the merger rate was higher, but uncertain by more than 4 orders of magnitude

 $10^{6}$  $10^{5}$ 

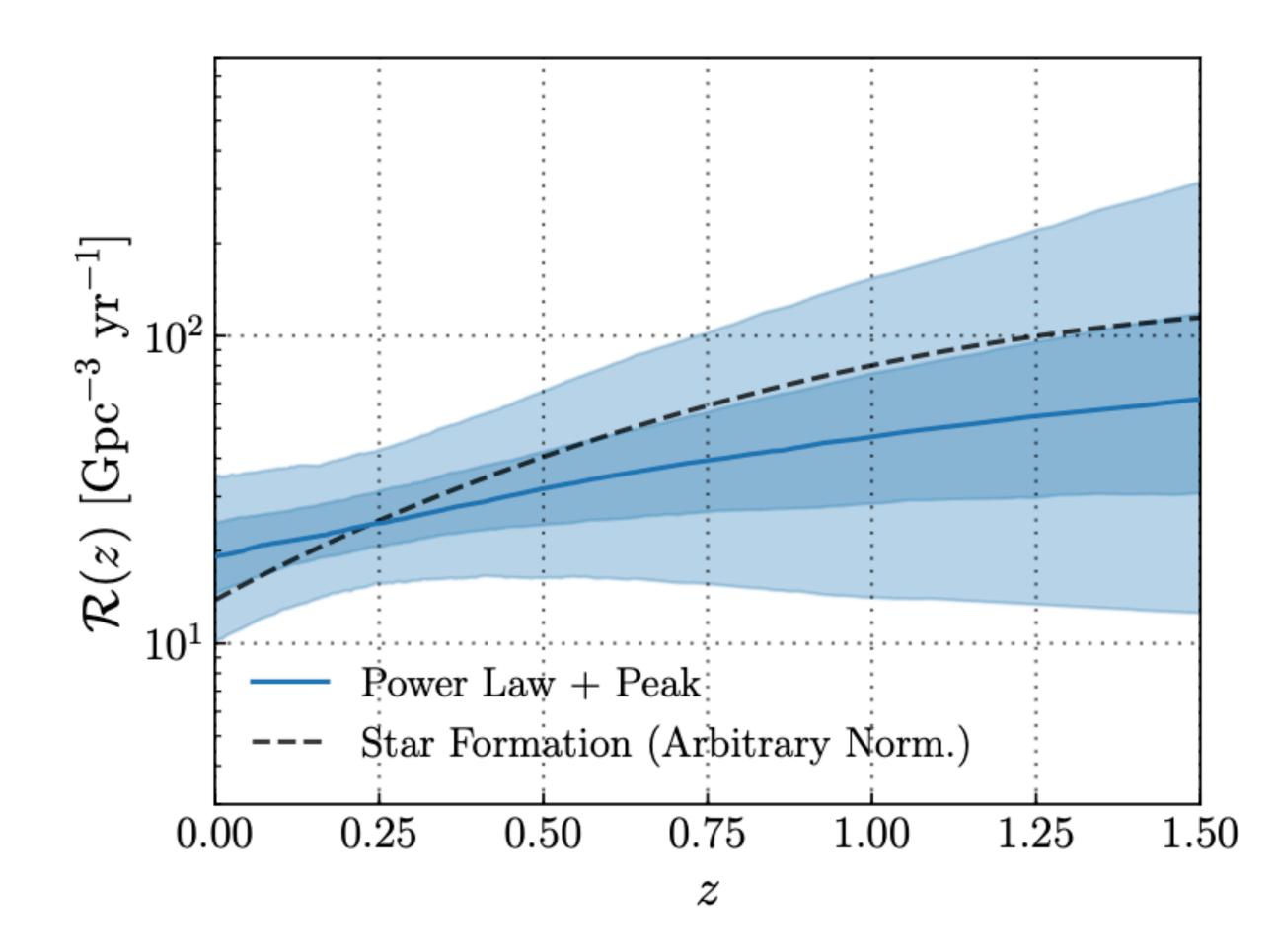
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Abbott+ 2019 *ApJL* 882 L24

### Merger rate of black hole mergers across cosmic time: Updated inference from GWTC-2

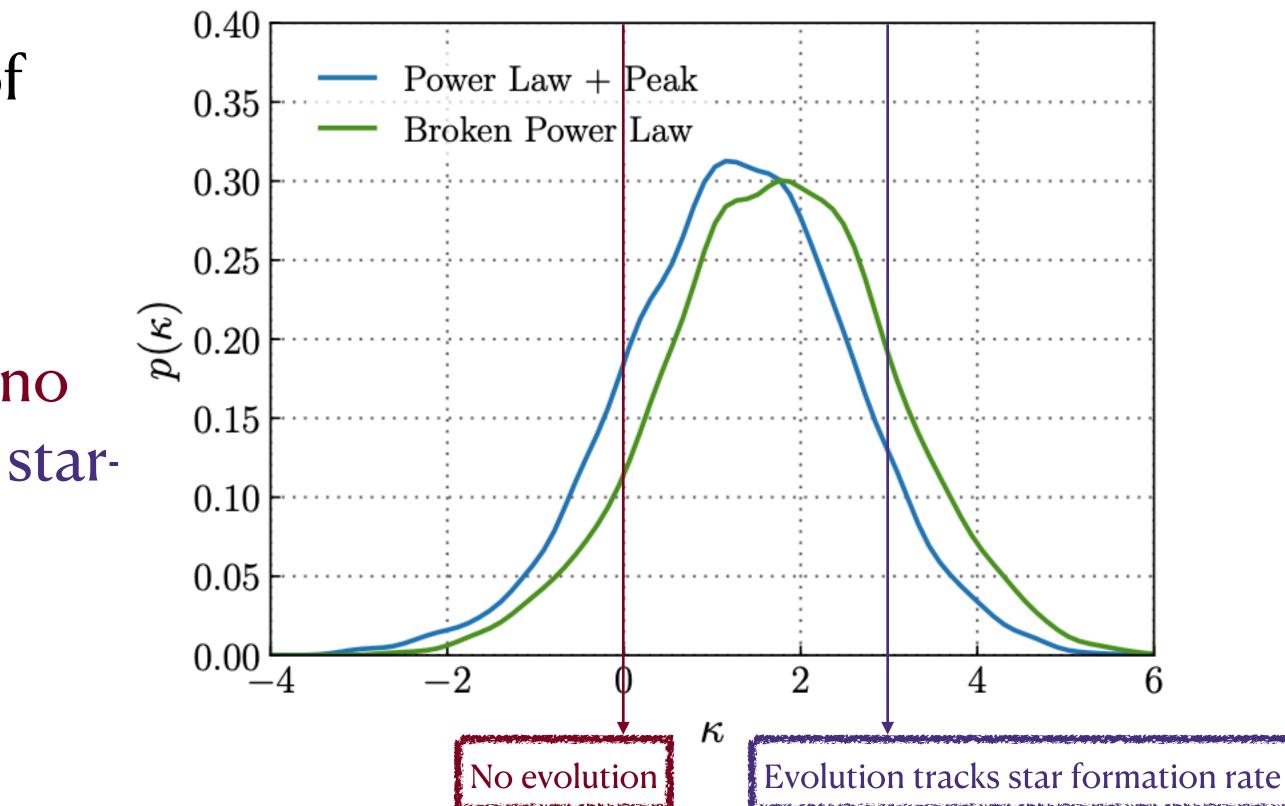
- With GWTC-2, we now know:
  - Today (z = 0), the merger rate is between [10, 35] Gpc<sup>-3</sup> yr<sup>-1</sup>
  - 8 billion years ago (z = 1), the merger rate was between 0.6 and 10 times its present rate — a significant improvement in the measurement from GWTC-1!



#### The binary black hole merger rate evolves, but slower than the star formation rate

- Assume that the rate **R** as a function of redshift z is described by  $\mathbf{R}(z) = (1+z)^{K}$
- Measure the slope *K*
- The most likely values are between o (no evolution) and 2.7 (approximating the starformation rate)

### Astrophysical Implications:





### Other astrophysical lessons in the gravitational wave data so far

Masses

- masses, which can be represented by a *break* in the power law or a Gaussian *peak*.
- There is a dearth of low-mass black holes between 2.6 solar masses and ~6 solar masses.
- an outlier.)

Spins

- isotropic.
- There are hints, but **no clear evidence that the spin distribution varies with mass**.

Rate across cosmic time

- In the local universe, the average binary black hole merger rate is between 15 and 40 Gpc-3 yr-1
- by a factor of ~2.5 between z = 0 and z = 1.

• The black hole mass spectrum does not terminate abruptly at 45 solar masses, but does show a feature at ~40 solar

• The distribution of mass ratios is broad in the range ~0.3-1, with a mild preference for equal-mass pairings. (GW190814 is

• Some binary black holes have measurable in-plane spin components, leading to precession of the orbital plane.

• Some binary black holes have spins **misaligned by more than 90 degrees**, but the distribution of spin tilts is not perfectly

• The binary black hole merger rate probably evolves with redshift, but slower than the star-formation rate, increasing



## Challenges to keep in mind

- **Parameter estimation**: The parameters of individual events are uncertain due to noise, and possibly due to systematics in our waveform models. (Aside: measuring the population distribution allows us to better infer the individual event parameters as well, by employing a population-informed prior.)
- Selection effects: We must quantify the sensitivity of our searches to gravitationalwave sources across parameter space, e.g. via an injection campaign.
- **Modeling systematics**: We must check that our population models adequately fit the data, by e.g. carrying out posterior predictive checks, checking robustness to outliers.

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### Thank you! Questions?

