

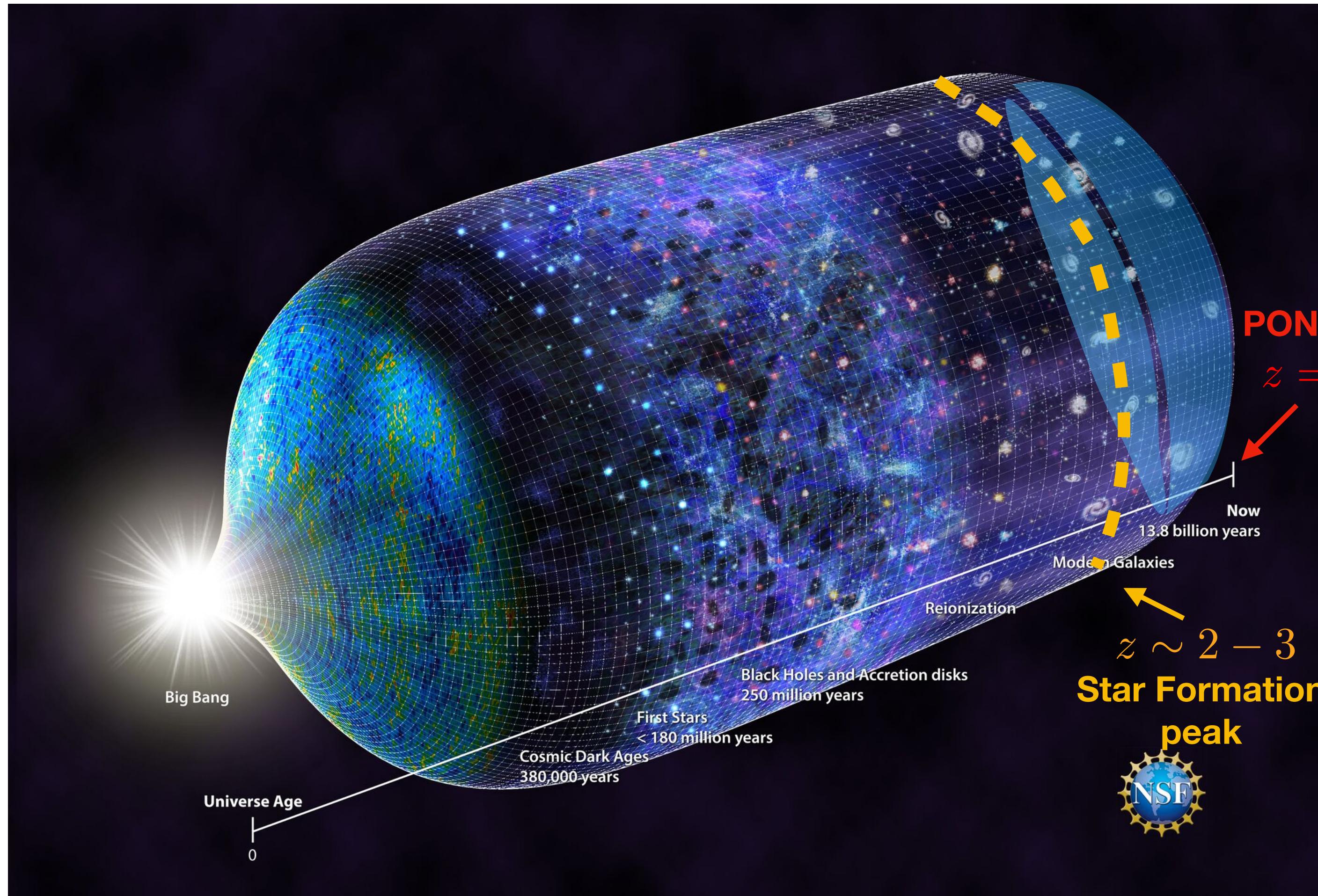
gwfast and the detection of high-redshift  
sources with third-generation  
gravitational-wave detectors



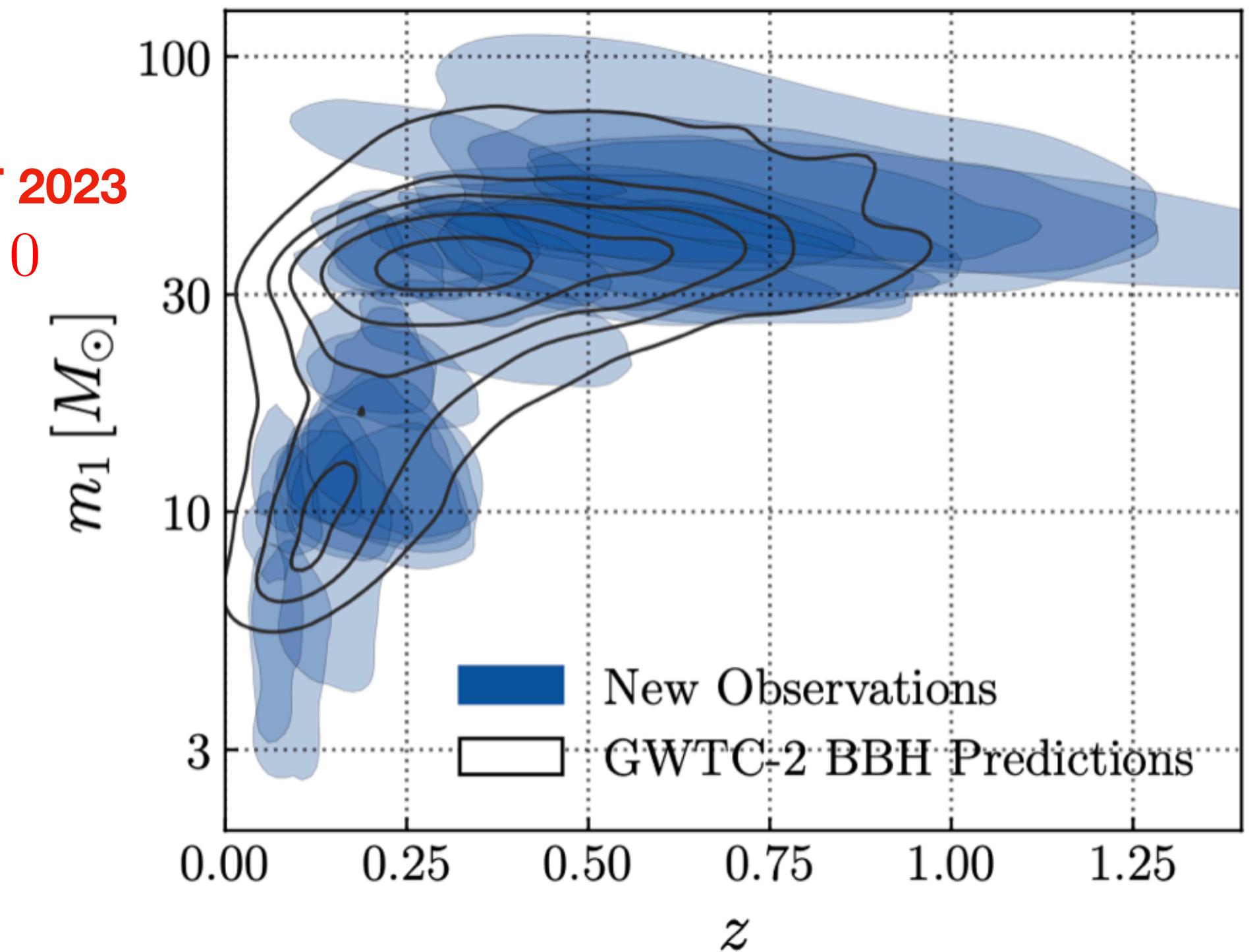
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# Cosmic history with GWs

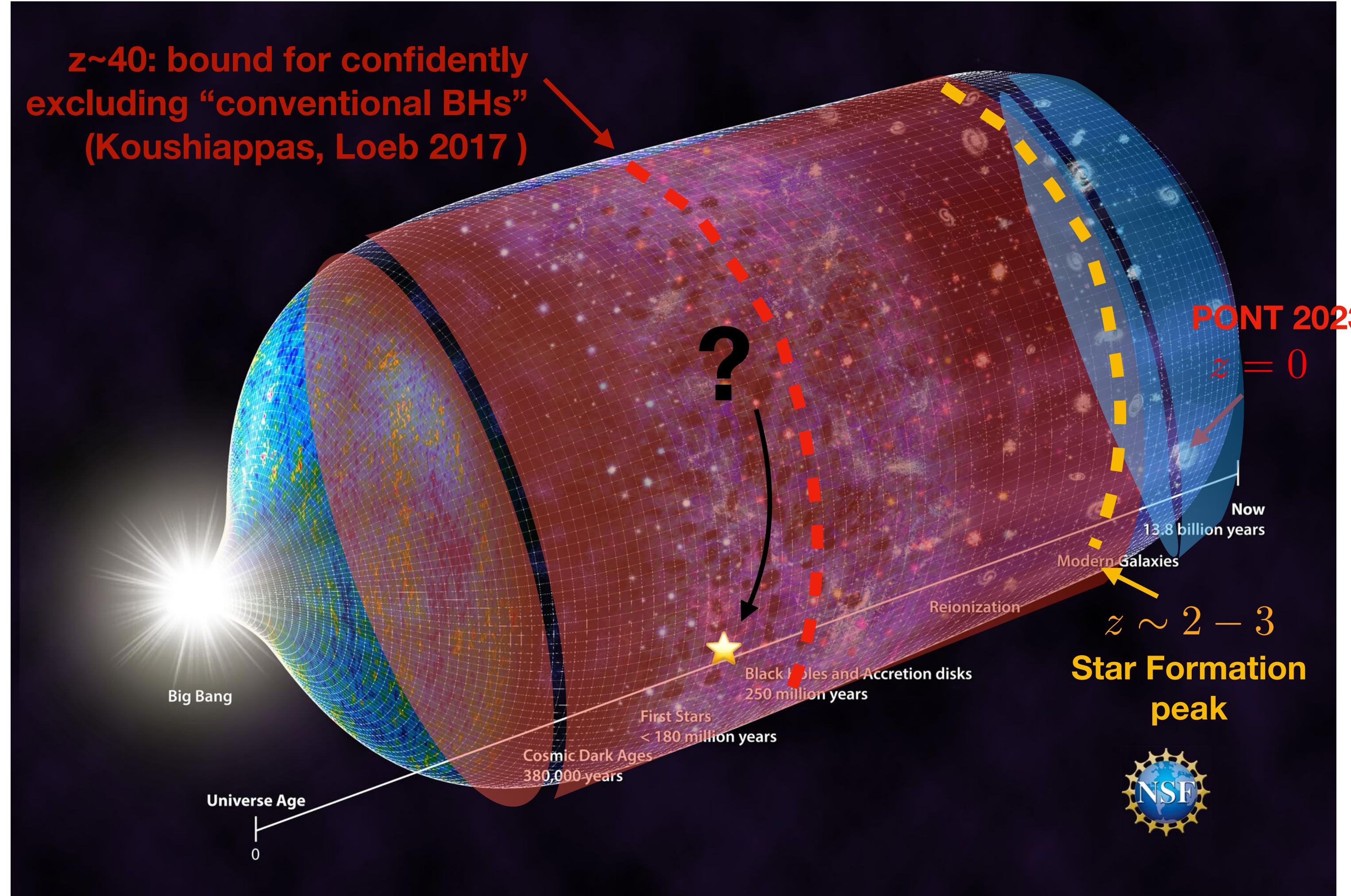


Redshift-mass distribution of new observations in GWTC-3 (LVK 2111.03634)



GWTC-3 reaches redshift  $\sim 1.2$

# Cosmic history with Gw's

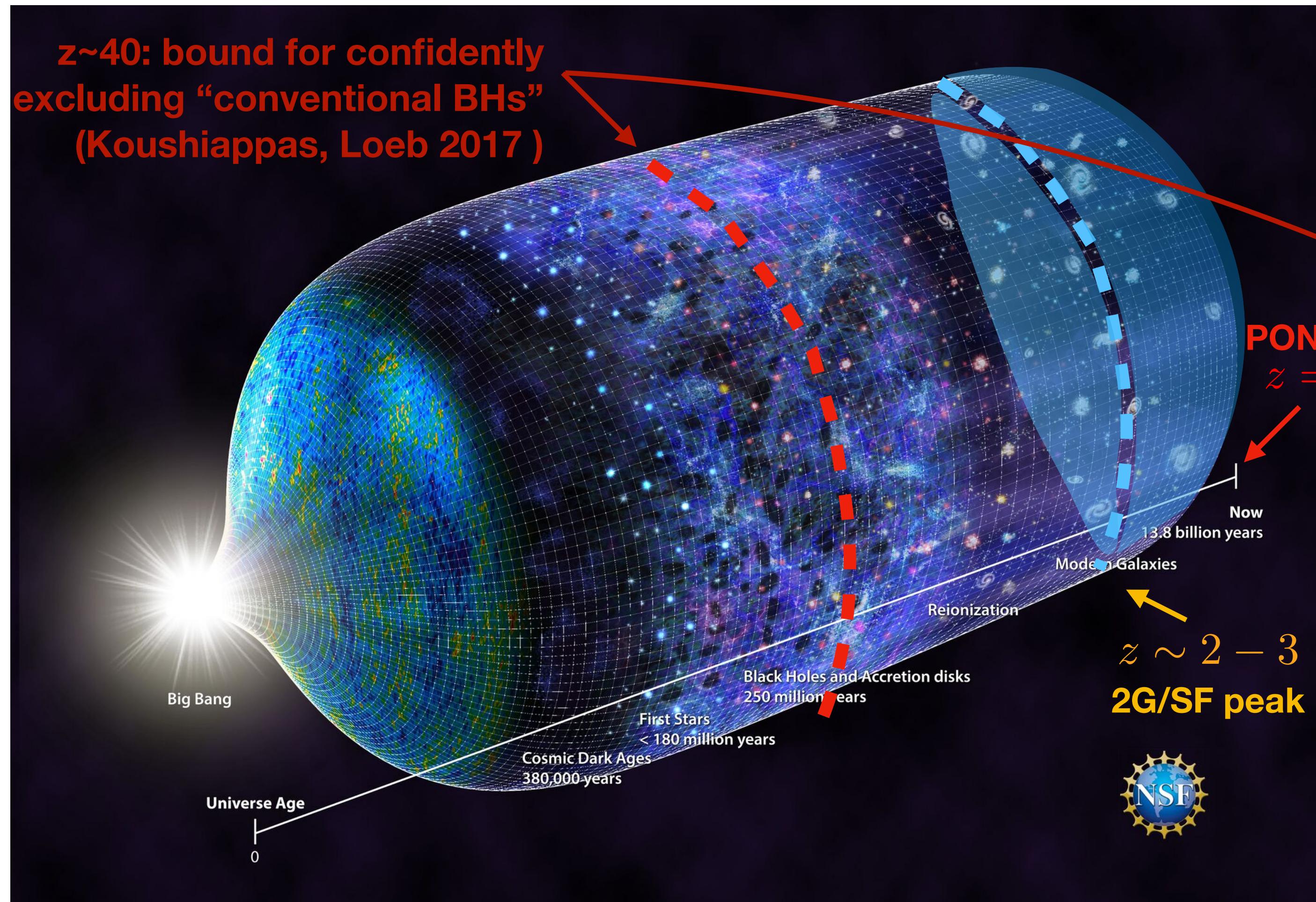


- The population of compact objects at high redshift is highly uncertain and provides a territory for potential revolutionary discoveries

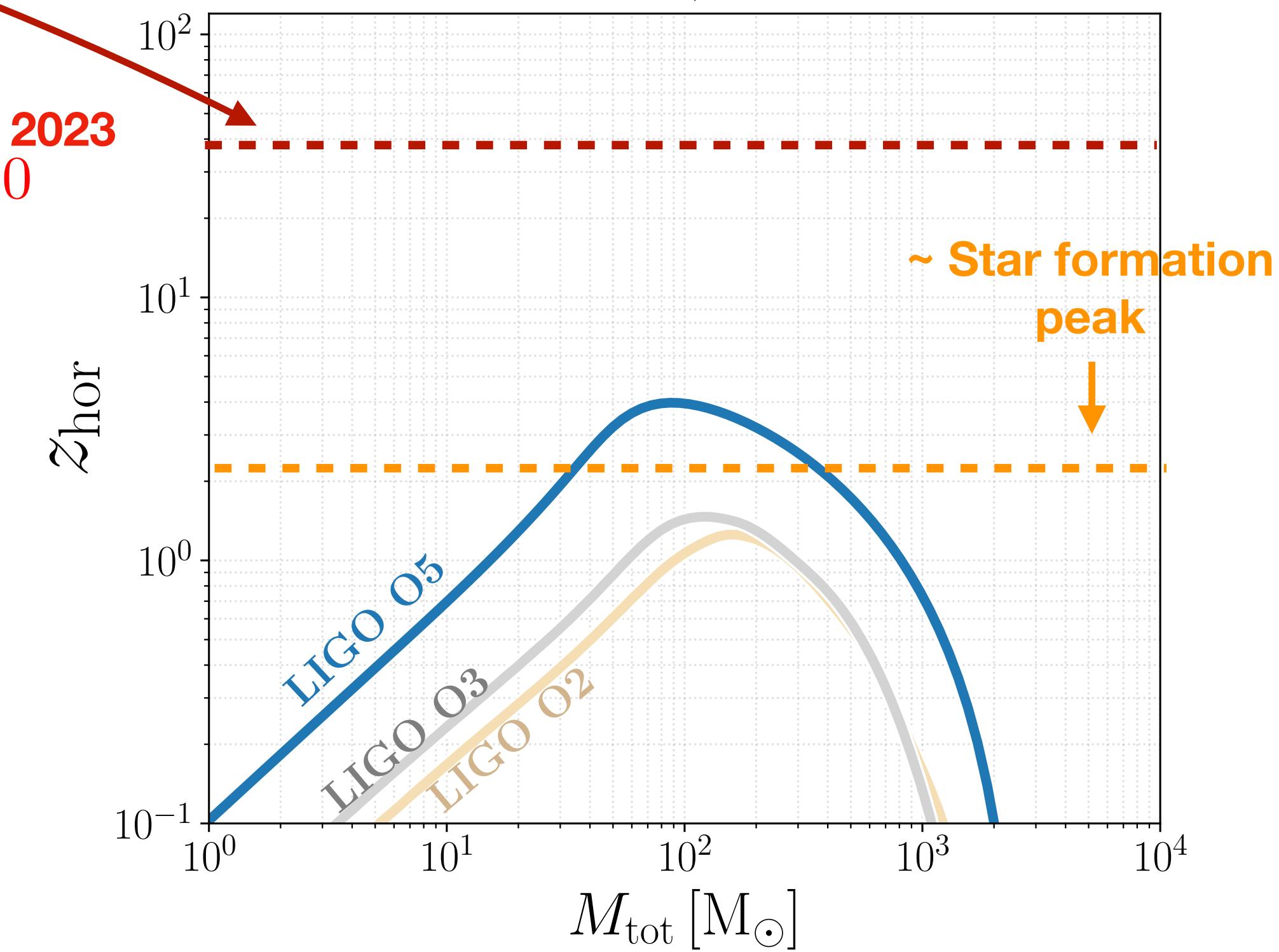
- ▶ Primordial Black Holes
- ▶ Pop III stars
- ▶ Origin of massive black holes
- ▶ Cosmology
- ▶ ?

What is the potential of GW observations of detecting and characterising sources at cosmological distances?

# Cosmic history with Gw's

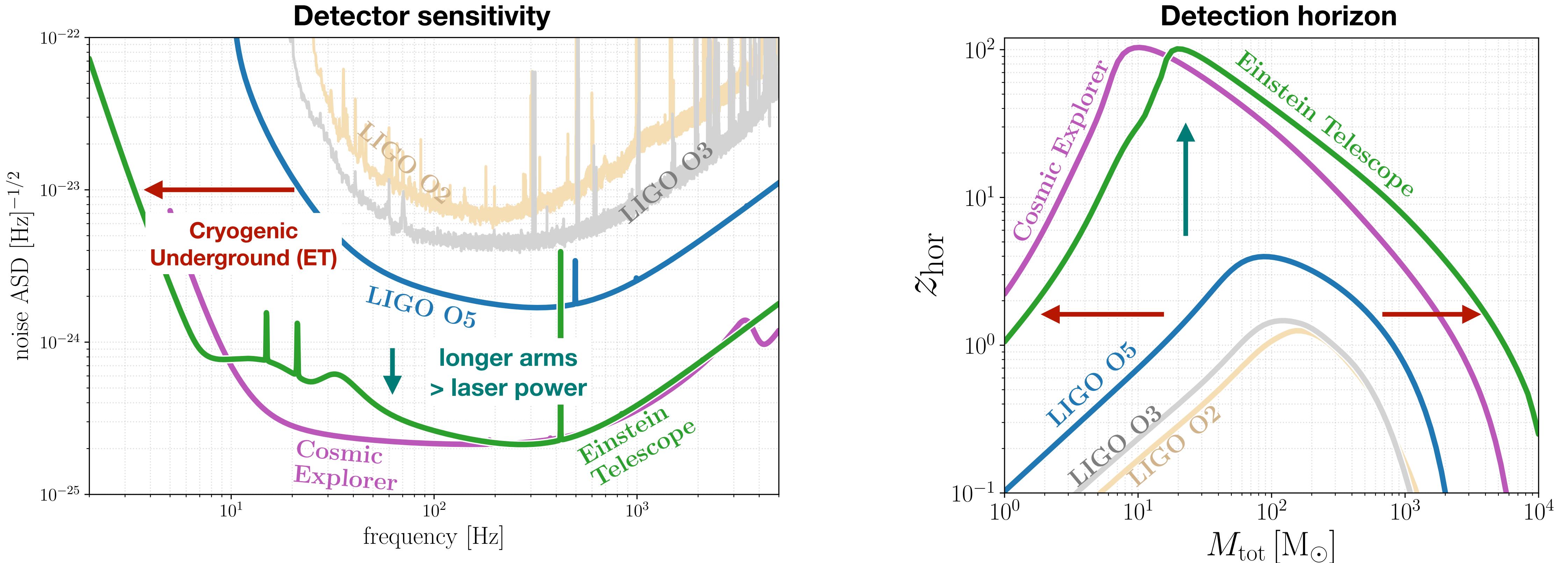


**Detection horizon** : largest redshift one could possibly detect a (equal mass, non-spinning, optimally-oriented, optimally-located) binary with given mass



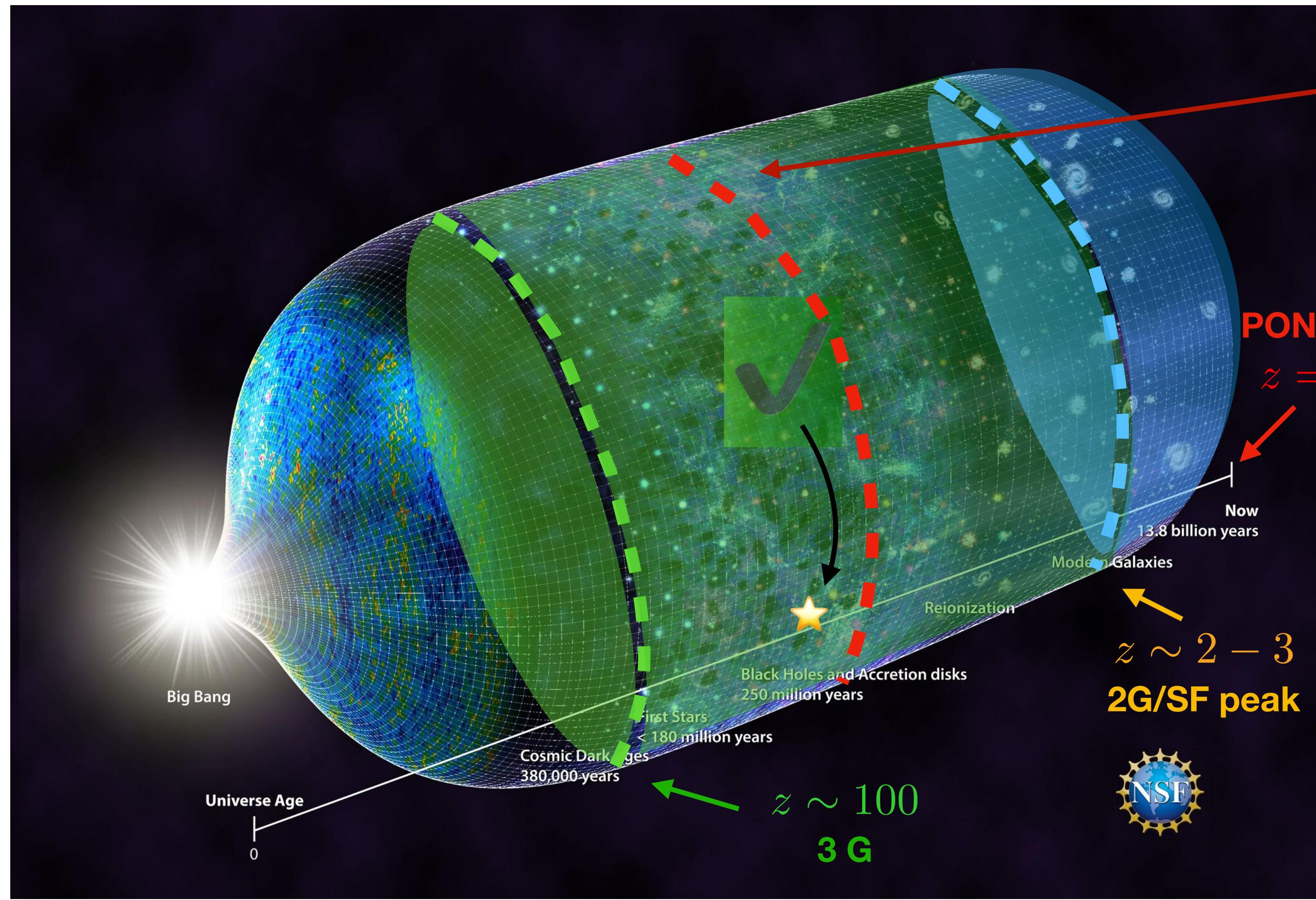
LIGO/Virgo will cover cosmic history up to redshift ~a few

# Larger horizons, larger bandwidths: 3G

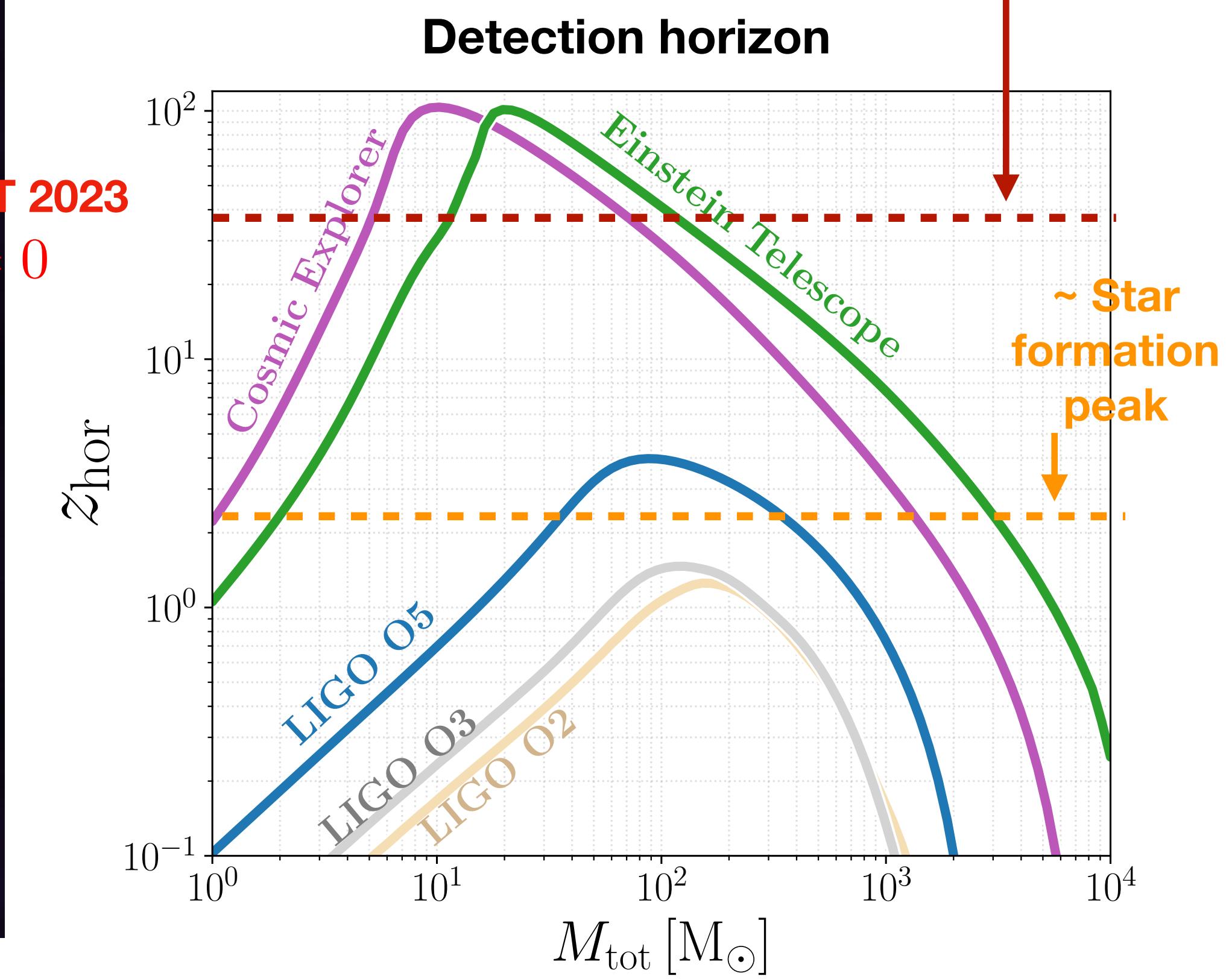


- Third-generation detectors: ~ 1 order of magnitude better sensitivity, larger frequency band. Larger horizons.
- **Einstein Telescope** in Europe. Pioneered the concept of 3G ([Punturo + 2010](#)). Conceived in 2010, included in the European Roadmap of Large Scientific Infrastructures in 2021. ET collaboration created in 2022.
- **Cosmic Explorer** in the U.S. CE white paper: [Reitze + 2019](#)

# Cosmic history with GWs



$z \sim 40$ : bound for confidently excluding “conventional BHs”  
(Koushiappas, Loeb 2017 )

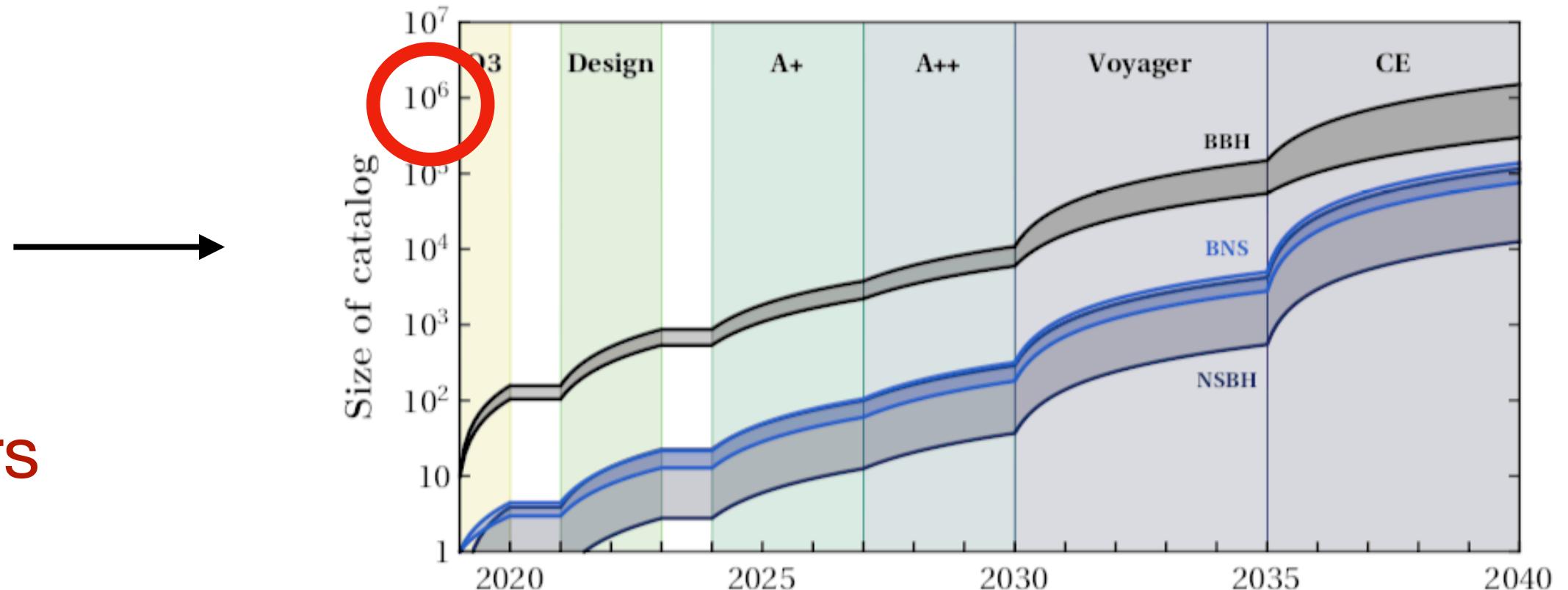


3G detectors can cover the entire star formation history and beyond

# From great sensitivities come great challenges

Basic metrics for the 3G science cases:

- **Detection rates**: up to  **$10^5$ - $10^6$  detections/year**
- Range and redshift distribution of detected events
- Accuracy in the reconstruction of the source parameters



- ▶ ~hrs to ~days for a single simulation (when feasible at all). Not affordable.
- ▶ **Fisher matrix** approximation = leading order expansion of the likelihood in 1/SNR (linear signal approximation)
- ▶ Covariance of the posterior probability:  
$$\text{Cov}_{ij} = \Gamma_{ij}^{-1}$$
  
$$\Gamma_{ij} \equiv \left( \frac{\partial h}{\partial \theta_i} \Bigg| \frac{\partial h}{\partial \theta_j} \right)_{\theta=\hat{\theta}}$$

GW SIGNAL  
↓  
PARAMETERS (MASS, DISTANCE, ...)
- ▶ **Collective effort in the 3G community**: develop different Fisher codes. **Cross-validated** within ET

**gwbench**  
Borhanian 2021 (UPenn)

**gwfish**  
Harms + 2022 (GSSI)

**gwfast**  
Iacovelli + 2022 (Geneva)

**TiDoFM**  
Li + 2022

Pieroni + 2022

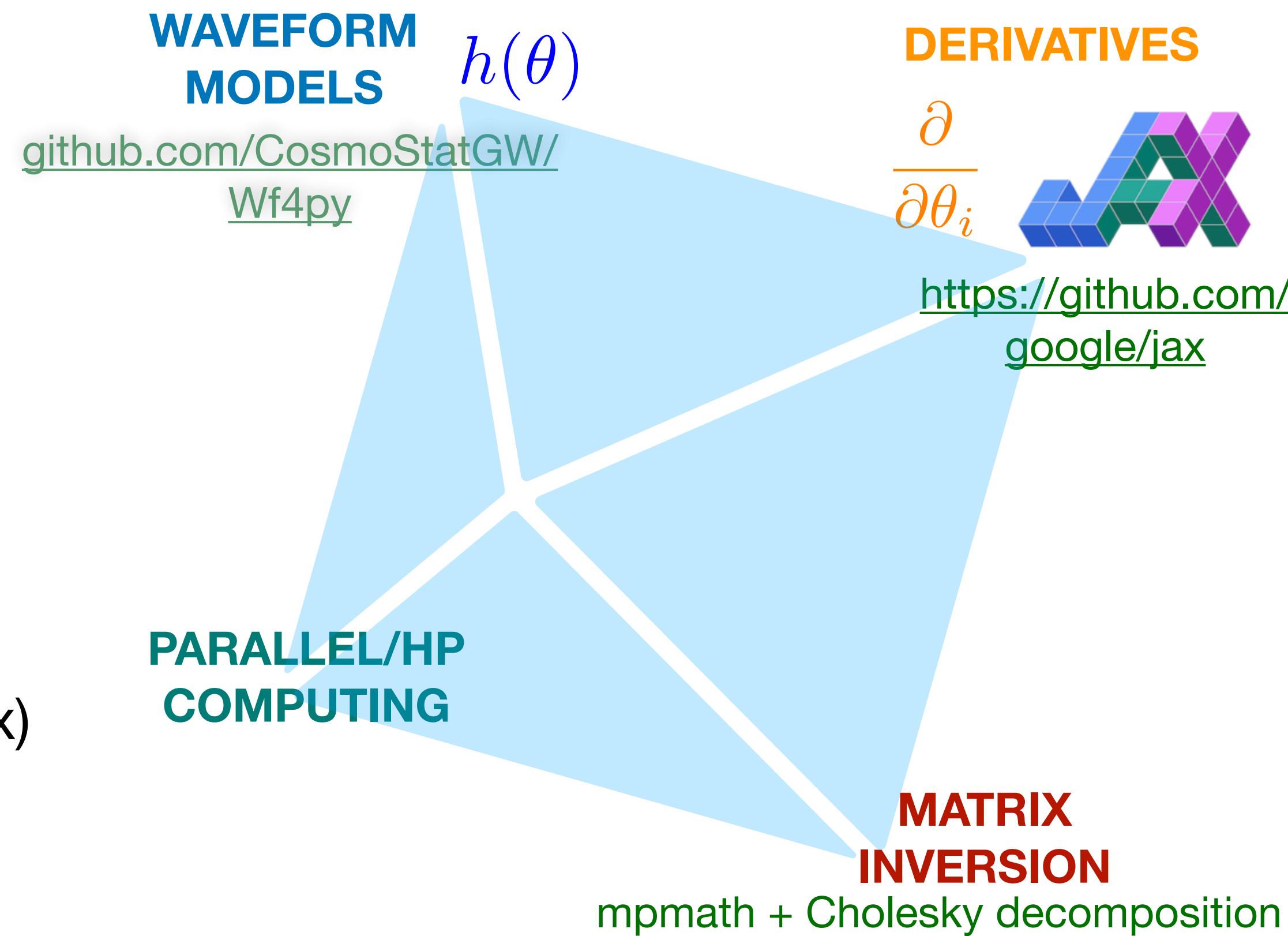


$$\text{Cov}_{ij} = \Gamma_{ij}^{-1}$$

$$\Gamma_{ij} = \left( \frac{\partial h}{\partial \theta_i} \middle| \frac{\partial h}{\partial \theta_j} \right)_{\theta=\theta_0}$$

[github.com/CosmoStatGW/gwfast](https://github.com/CosmoStatGW/gwfast)

- **Differentiable waveforms** in python. Also useful for fast bayesian inference: full PE in ~minutes? see Wong+2023, "TurboPE"
- **Automatic differentiation with jax** (library from Google): derivatives at machine precision see Campagne+2023, "JAX-COSMO" for cosmology
- **Parallel computing + single-CPU vectorization**. Directly usable on GPUs with JIT compilation. (Not possible without jax)
- PE for  $10^5$  events in < 1 day

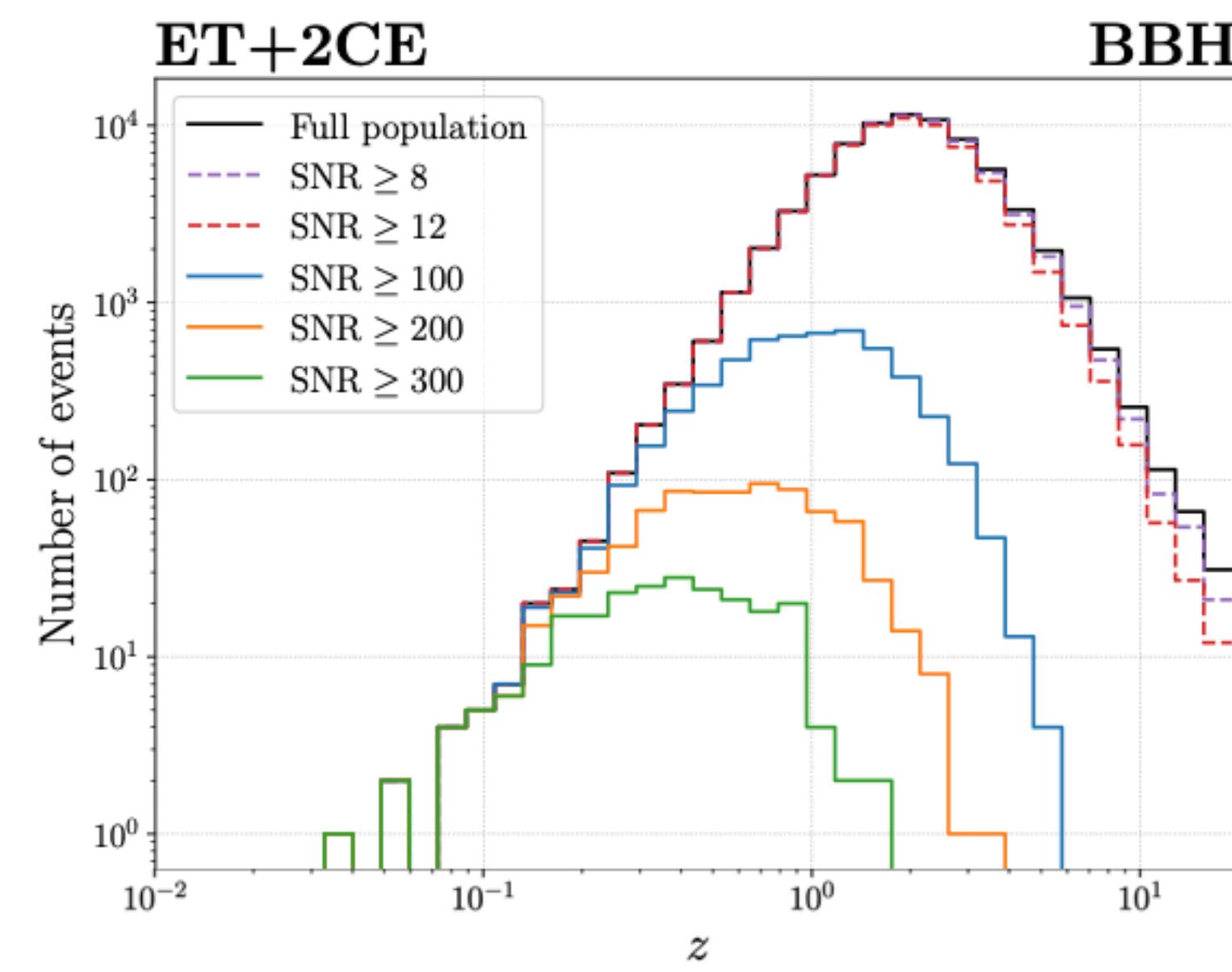


# Detection prospects

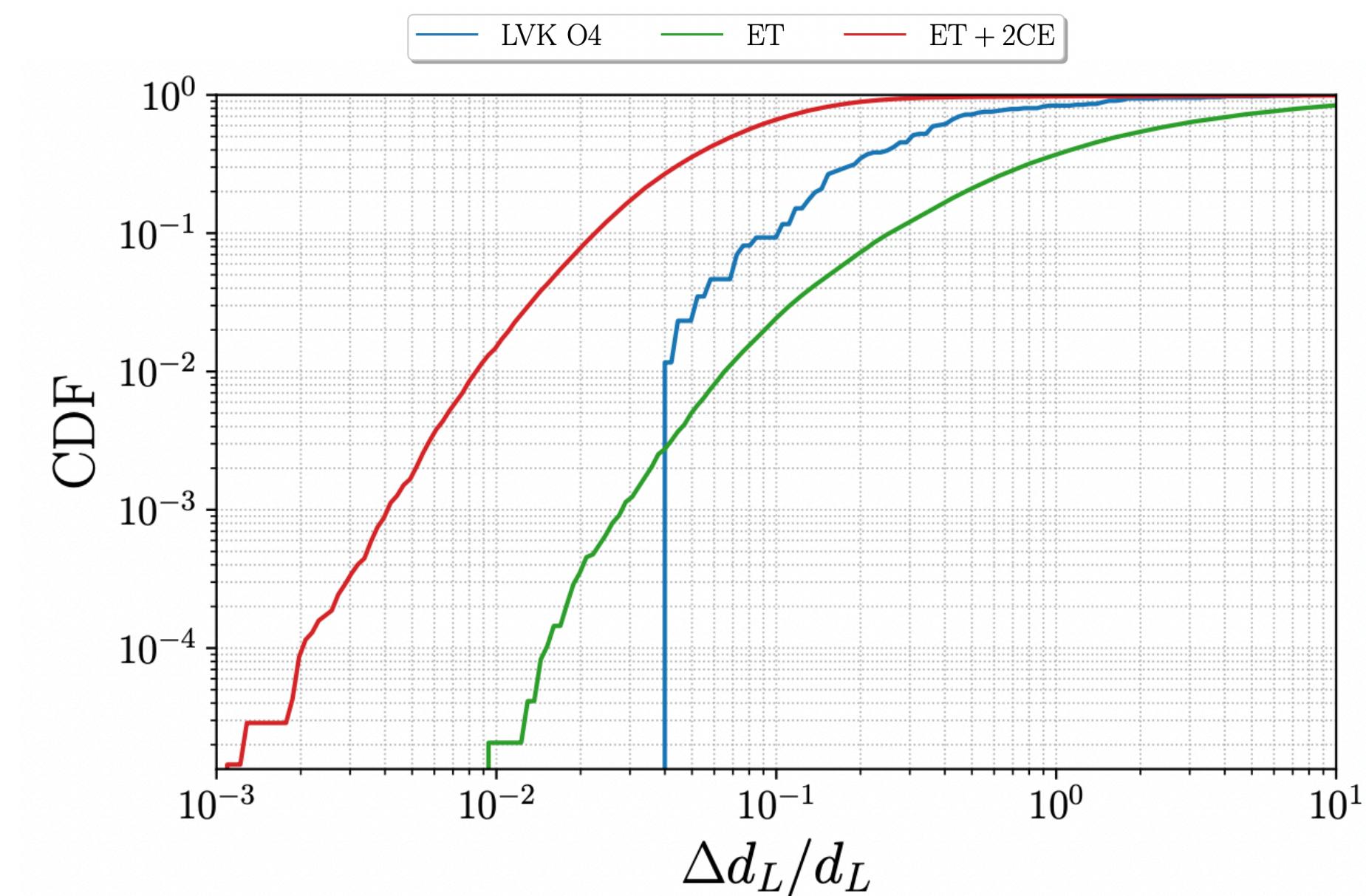


Answer from the basic metrics for the 3G science cases:

**~full population detected...**



**... with exquisite accuracy  
on distance reconstruction**

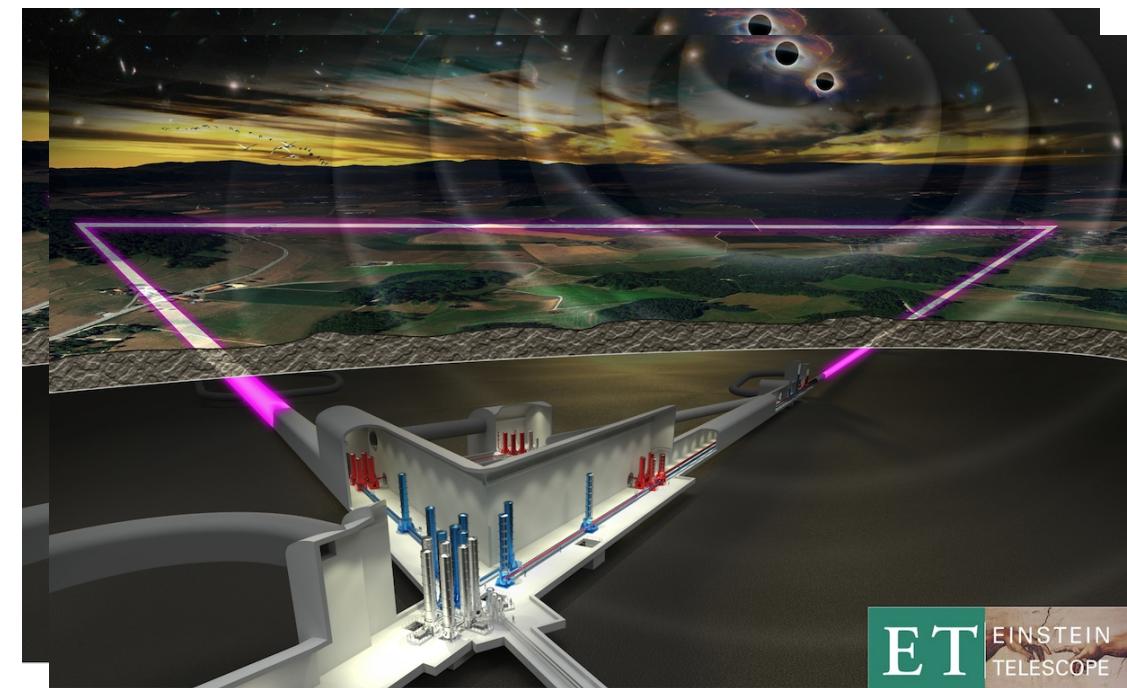
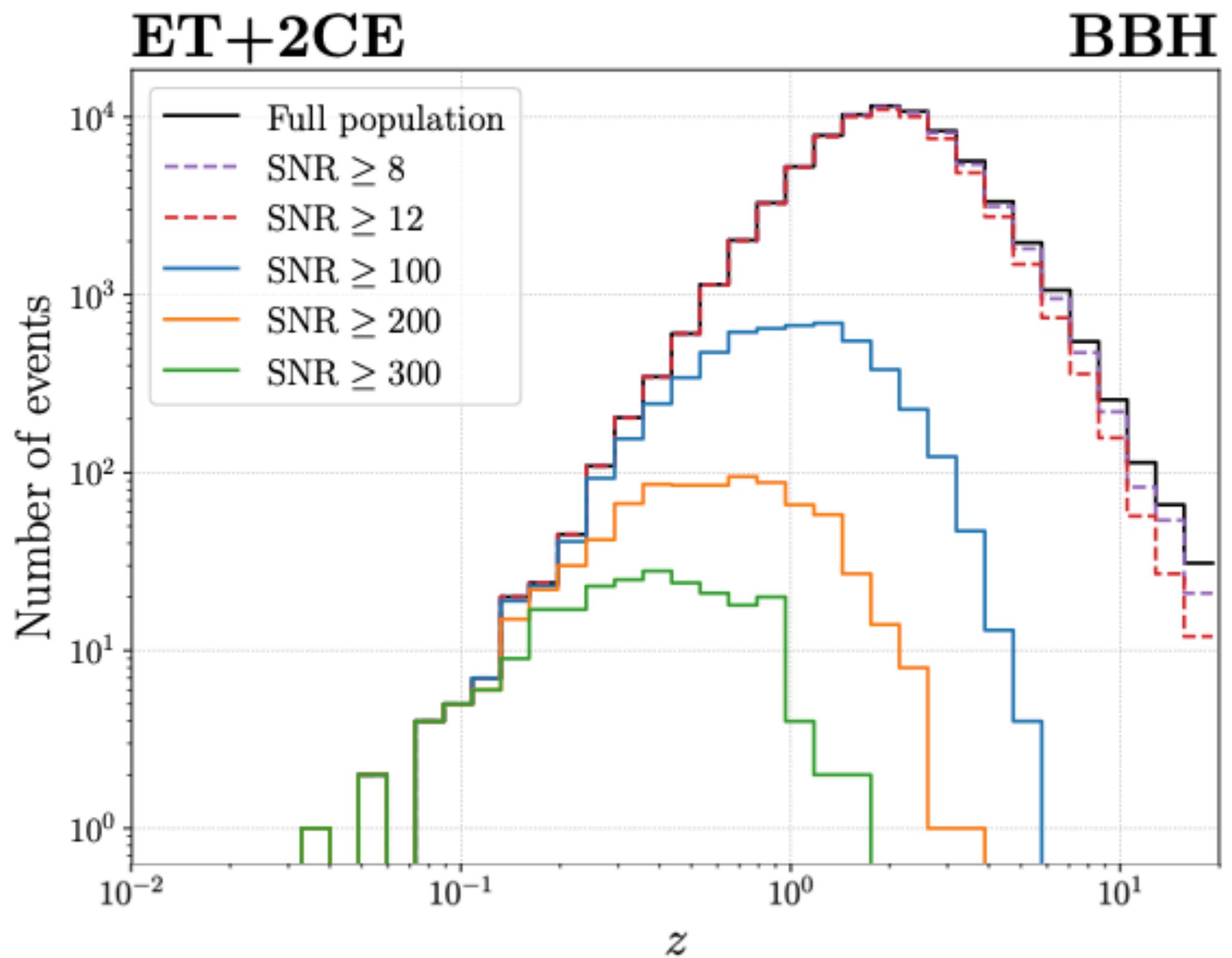


- ▶ Reference (triangular) ET design, BBH population = best-fit model from LVK Iacovelli, Mancarella, Foffa, Maggiore APJ 2022
- ▶ For comparison of different designs and broad range of science cases see Branchesi, Maggiore et al. 2303.15923
- 80+ authors, 200+ pages, 6 detector configurations, 3 noise curves, many specific science cases. Massive usage of gwfast

# Detection prospects

**“Is this the ultimate machine?”**

(question asked during a talk after seeing this plot)



# Inference prospects

- Basic metrics for the 3G science case :

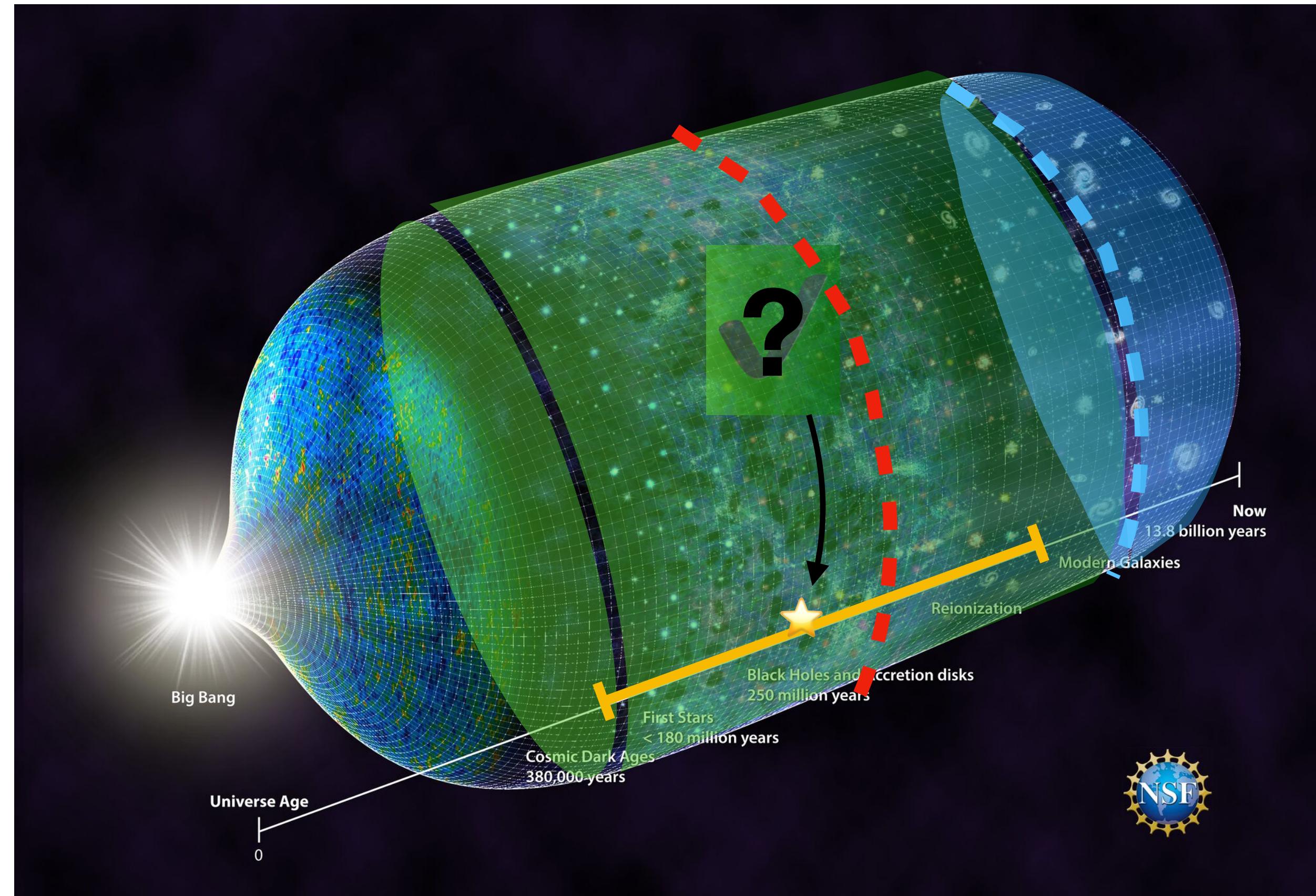
- ▶ Detection rates
- ▶ Range and redshift distribution of detected events
- ▶ **Accuracy in the reconstruction of the source parameters**

Detecting does not mean knowing that the source is actually there

$$\text{Error} \propto \frac{1}{\text{SNR}} \propto \text{distance}$$

- ▶ Distant sources are most difficult to localise
- ▶ Simulations on single sources: unlikely to get constraints better than ~10% for sources at  $z > 10$

Ng et al. APJL 2022, 2108.07276  
Ng et al. PRD 2023, 2210.03132



what is the correct figure of merit for the confidence of a high-redshift detection?

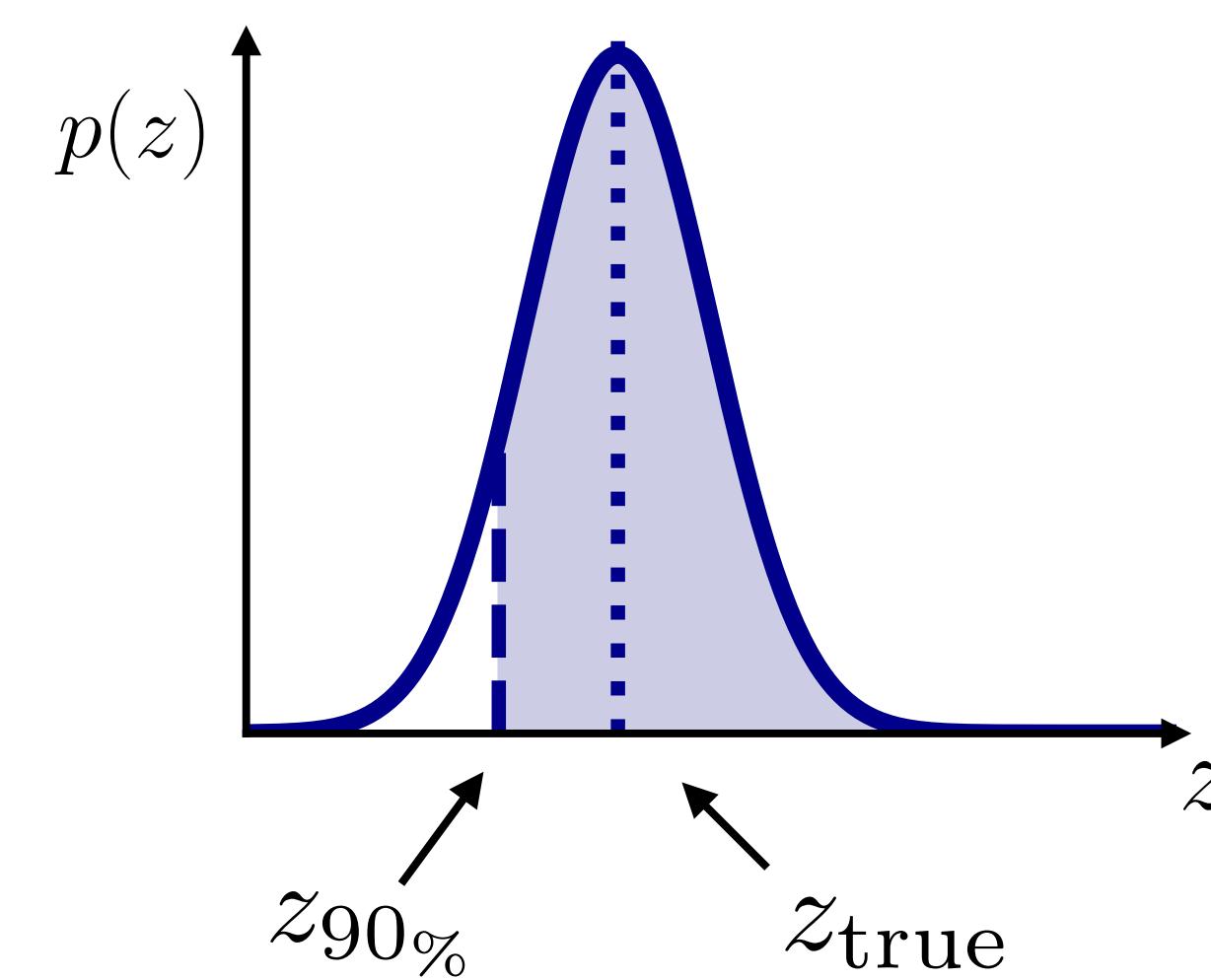
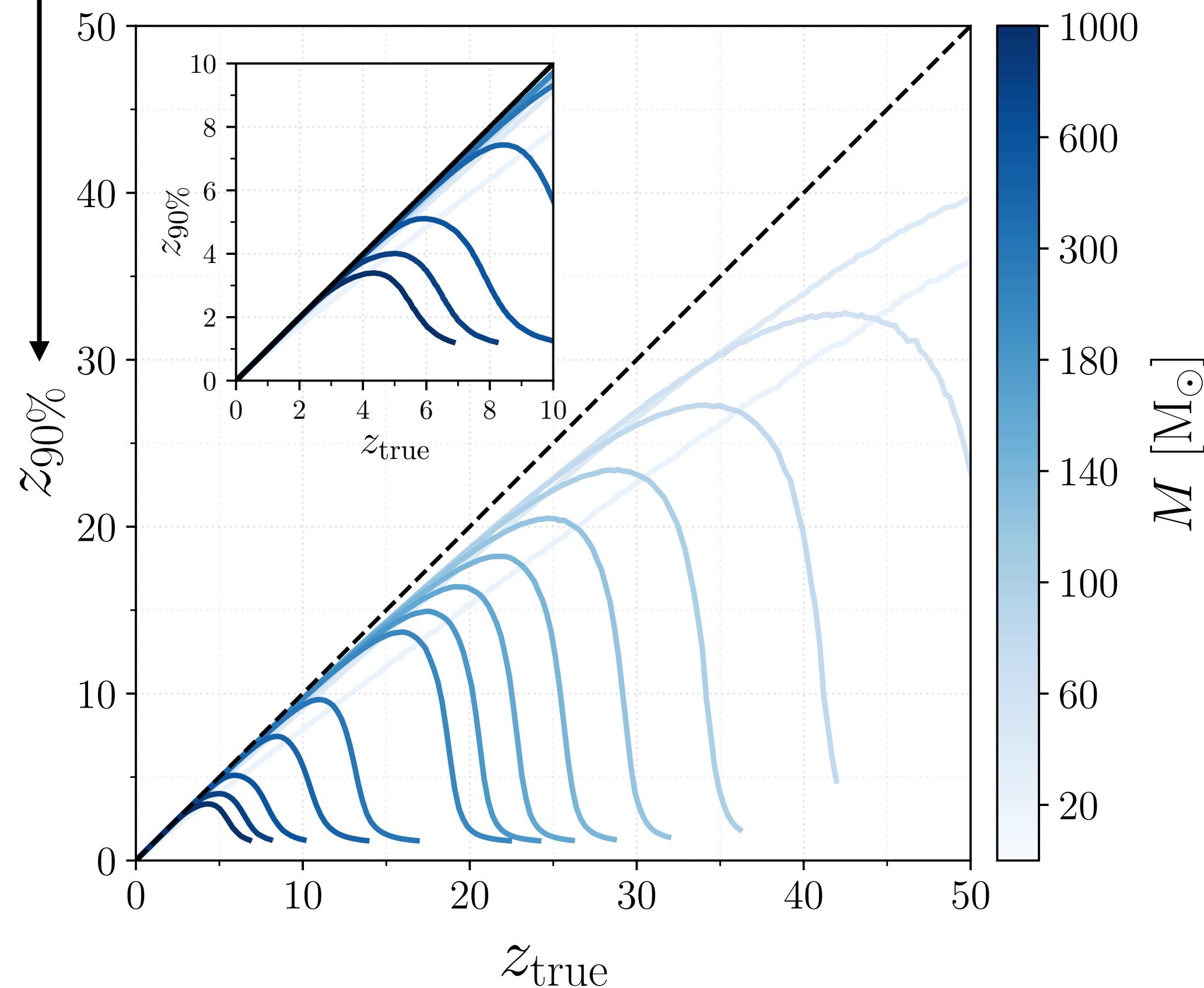
# Inference metrics

Mancarella, Iacovelli, Gerosa,  
PRD Lett. 2023, 2303.16323

**LOWER 90% BOUND ON THE REDSHIFT**



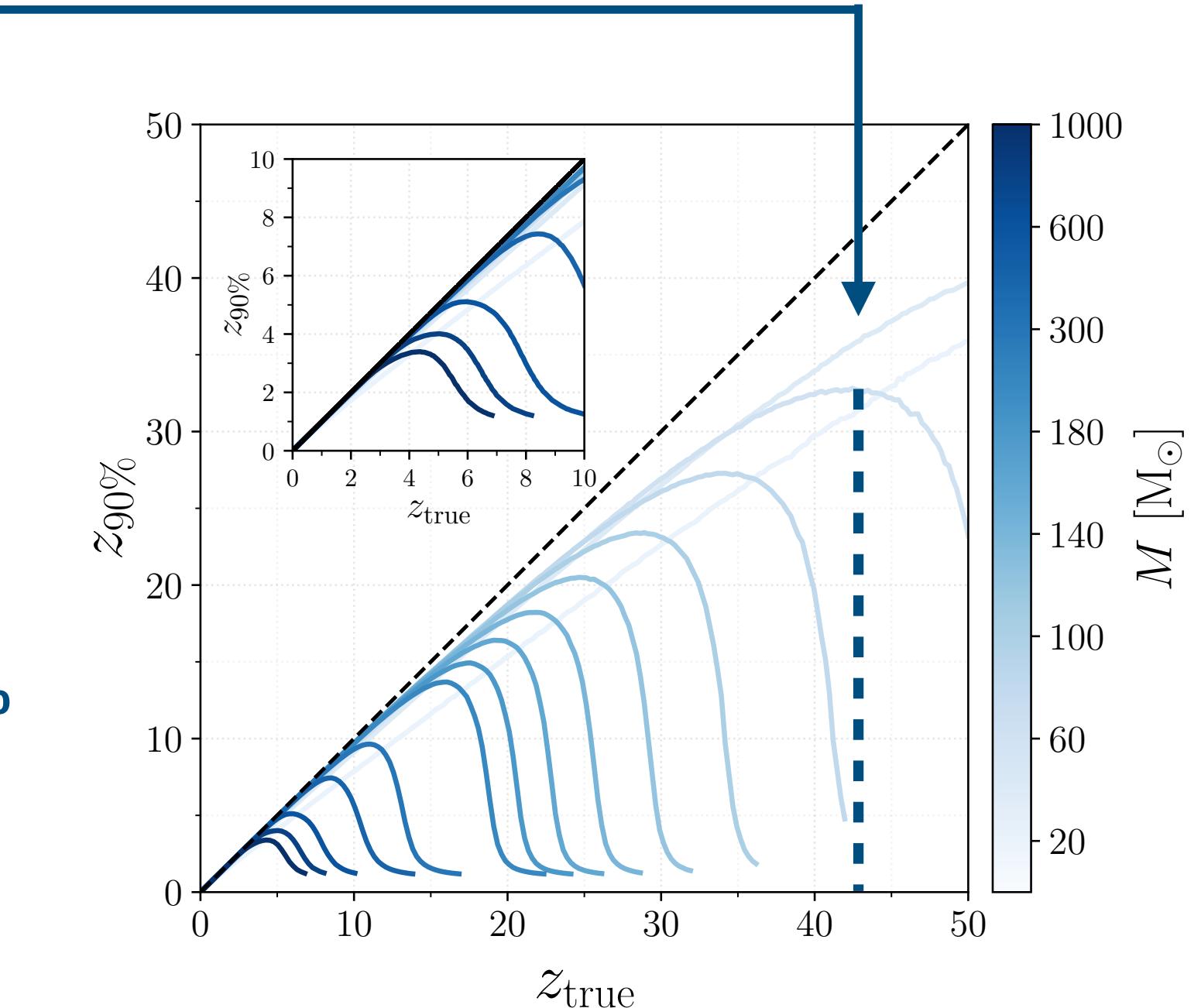
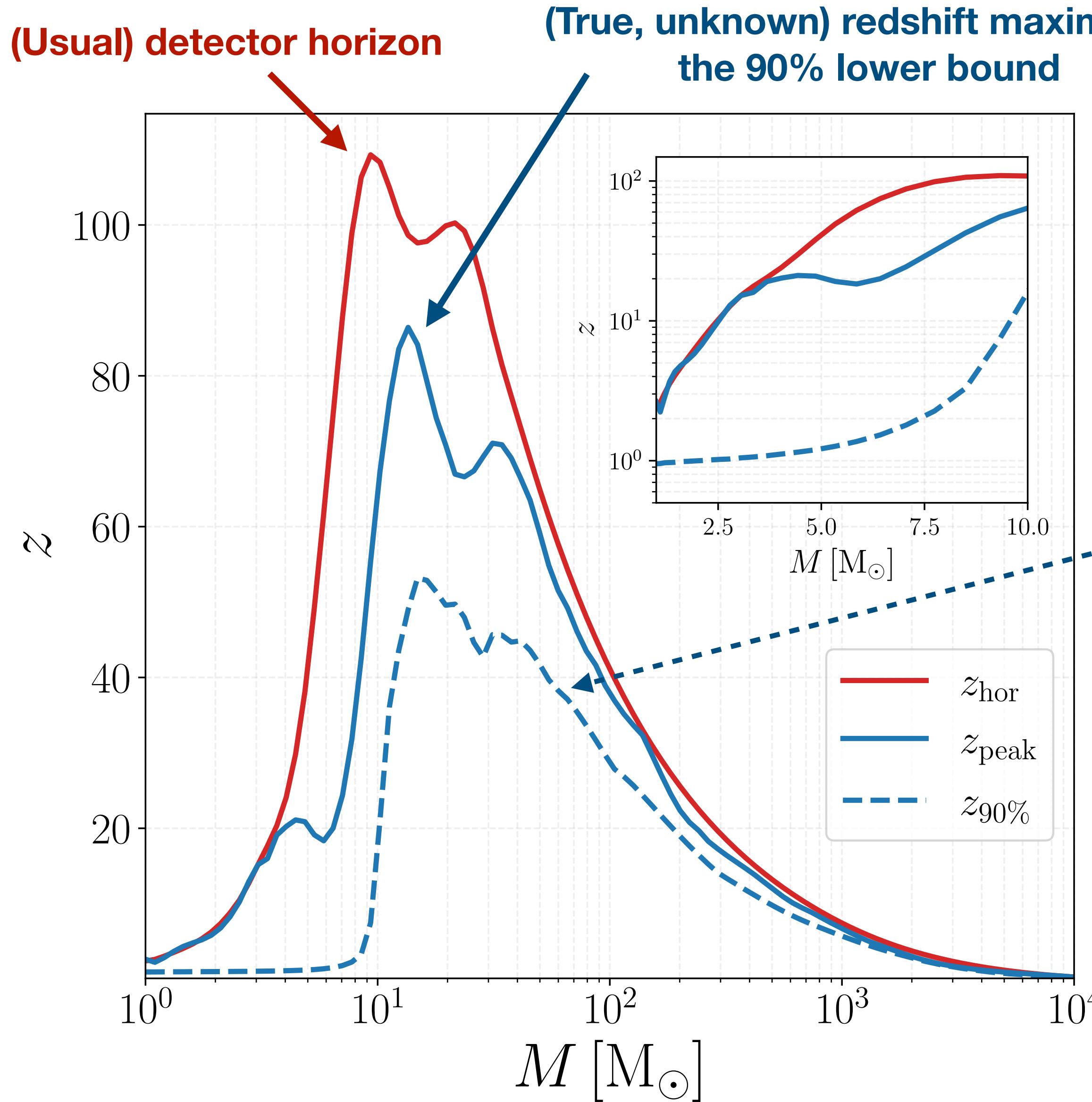
$$P(z \geq z_{90\%} | z_{\text{true}}, \bar{\theta}) = \int_{z_{90\%}}^{\infty} p(z | z_{\text{true}}, \bar{\theta}) dz = 0.9$$



- The good quantity to look at is not the true (unknown!) redshift of the source, but the lower (e.g. 90%) credible interval, e.g.  $z_{90\%}$

# Inference horizon or detector horizon?

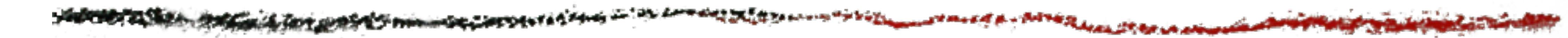
Mancarella, Iacovelli, Gerosa,  
PRD Lett. 2023, 2303.16323



- **Inference horizon:** largest redshift we can possibly put a claim on. Narrows the accessible band for single-source smoking-gun detections.
- Difference between red and blue, dashed curves = difference between detecting and inferring

# "z-z plots"

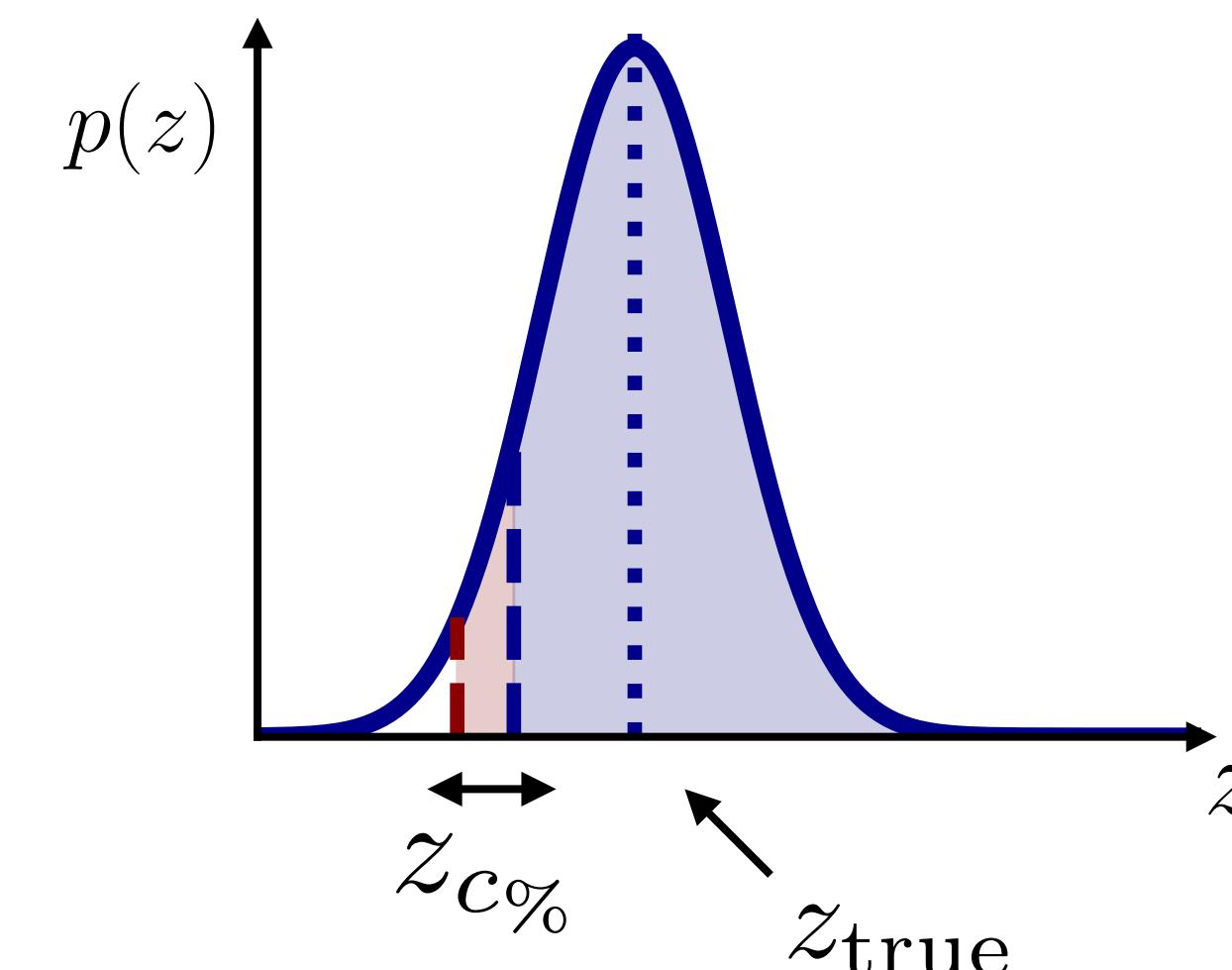
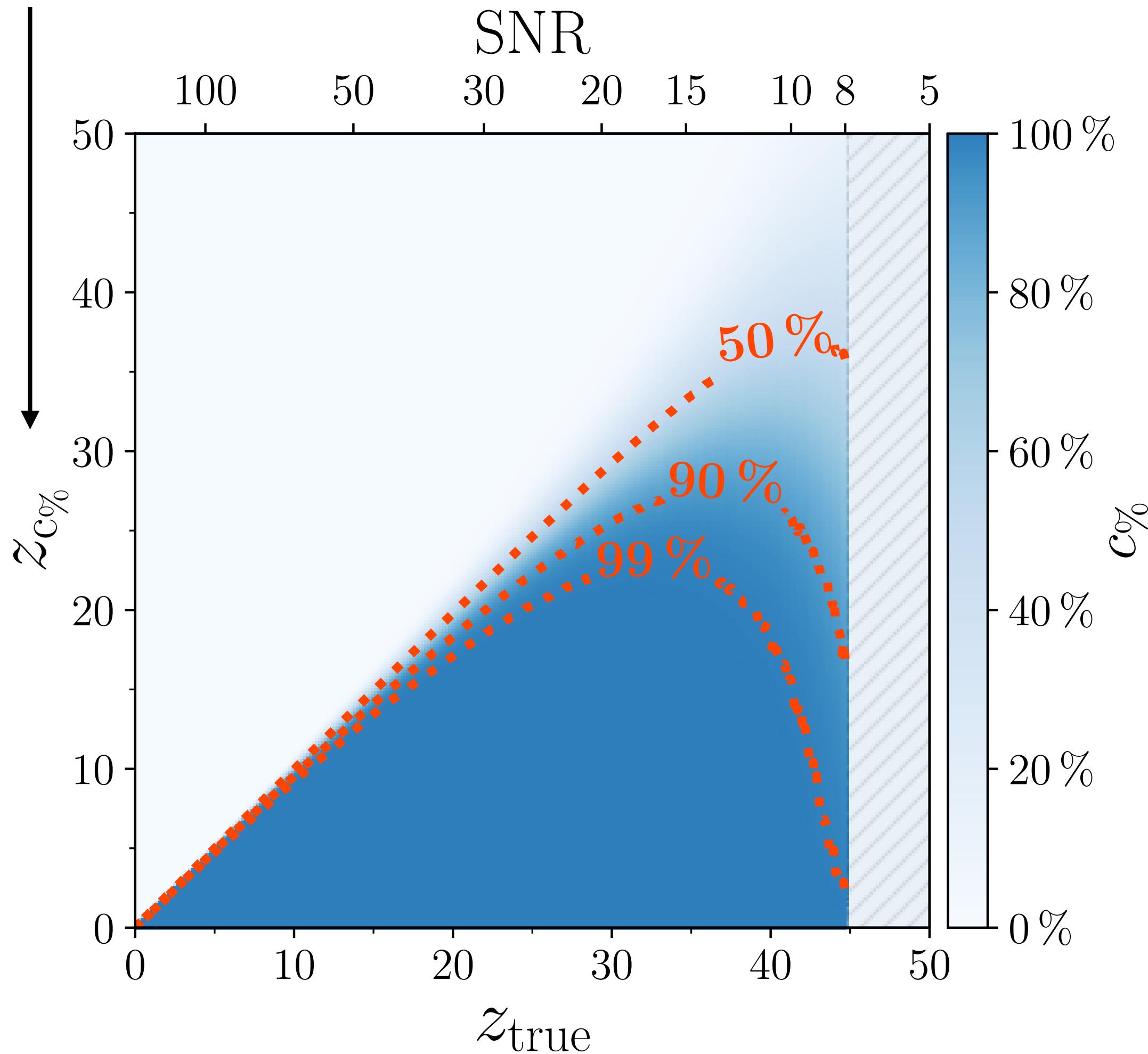
Mancarella, Iacovelli, Gerosa,  
PRD Lett. 2023, 2303.16323



**LOWER BOUND ON THE REDSHIFT  
AT c% C.I.**



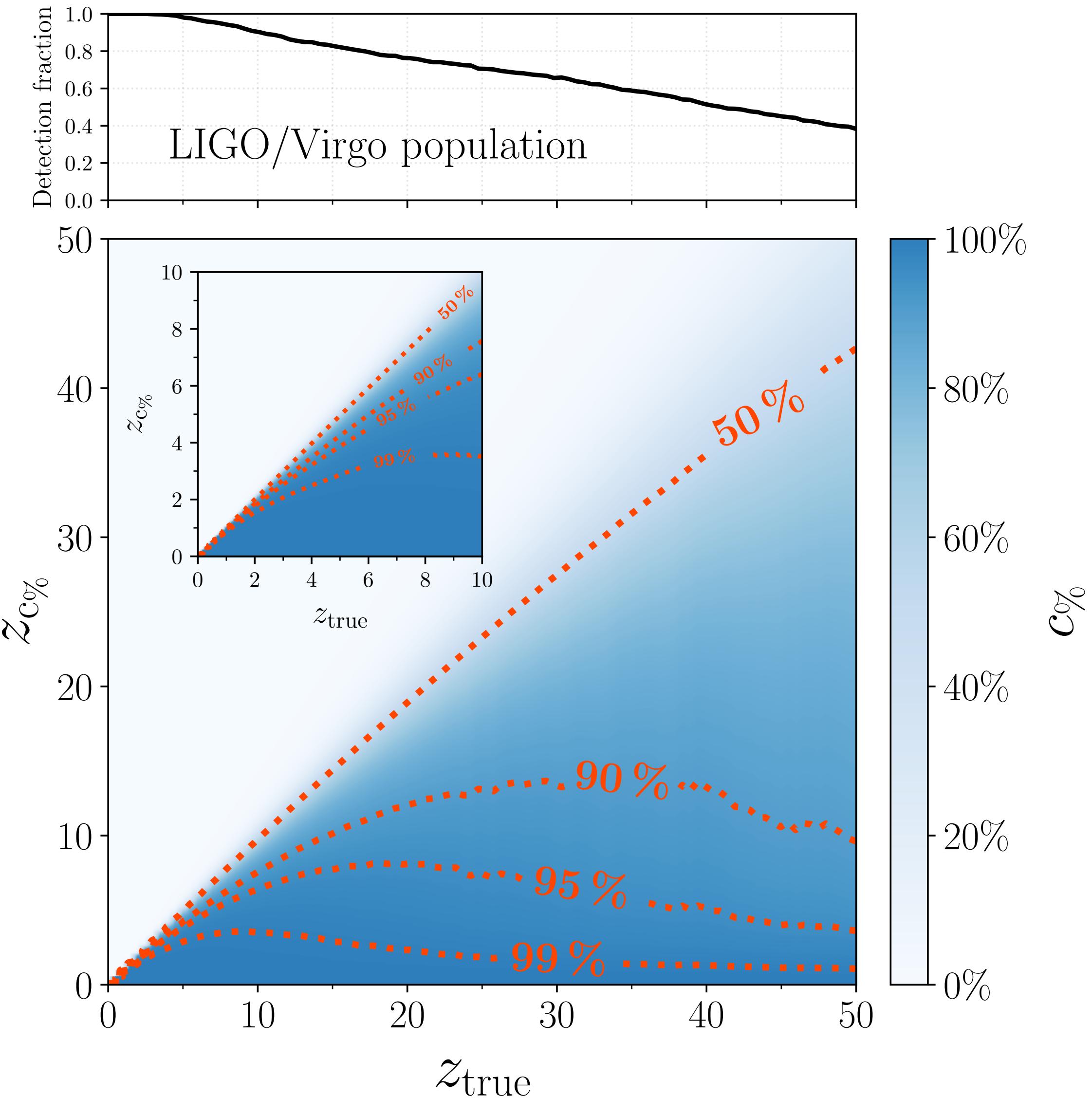
$$P(z \geq z_{c\%} | z_{\text{true}}, \bar{\theta}) = \int_{z_{c\%}}^{\infty} p(z | z_{\text{true}}, \bar{\theta}) dz = \frac{c}{100}$$



- GW150914-like source, fixed parameters
- Meaning: if the source was at  $z \sim 35$ , ET+2CE would only be able to tell that it is at  $z > 20$  at 99% C.L.

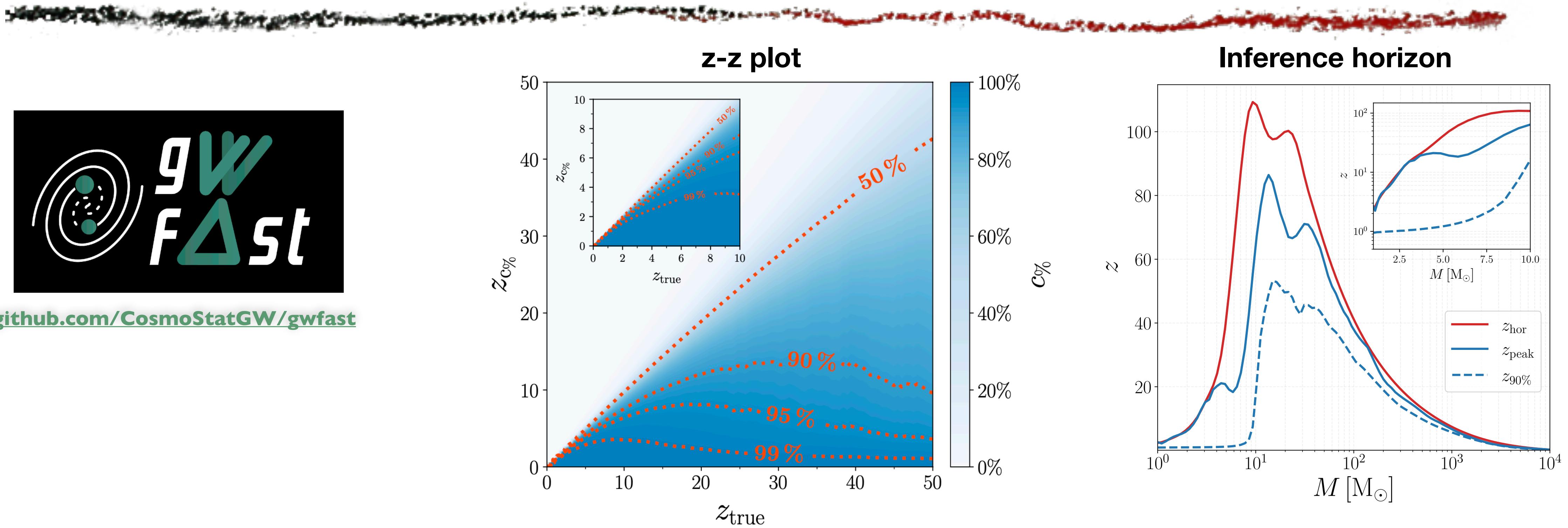
# "z-z plots"

Mancarella, Iacovelli, Gerosa,  
PRD Lett. 2023, 2303.16323



- Averaged on detected population, extrapolating LVK constraints (robust to variations)
- On average, it will be **challenging to put a claim on the primordial origin with single-event detections**. Population studies might be the way?

# Summary



- Detecting the full population of compact objects = science driver of 3G detectors
- *gwfast*: a forecast tool at the interface with other active research domains in GW data analysis (WF models in python, GPU, fast inference). Recent extensive study by the ET OSB.
- Detecting does not mean inferring that the source is actually there: z-z plots and inference horizon as realistic metrics. Confidently ruling out "conventional" star formation scenarios will be challenging with single sources



# Horizon for well-localised sources

