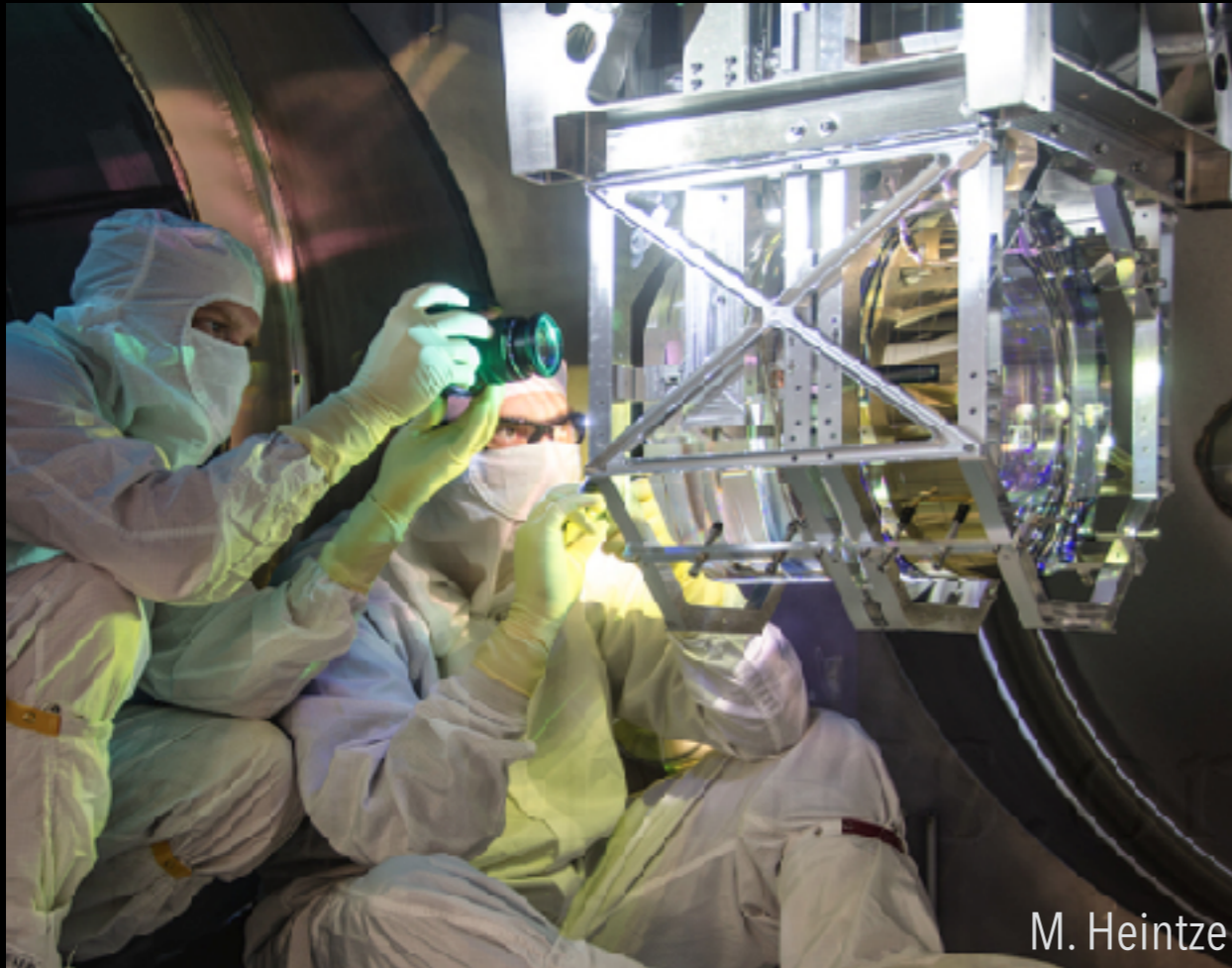
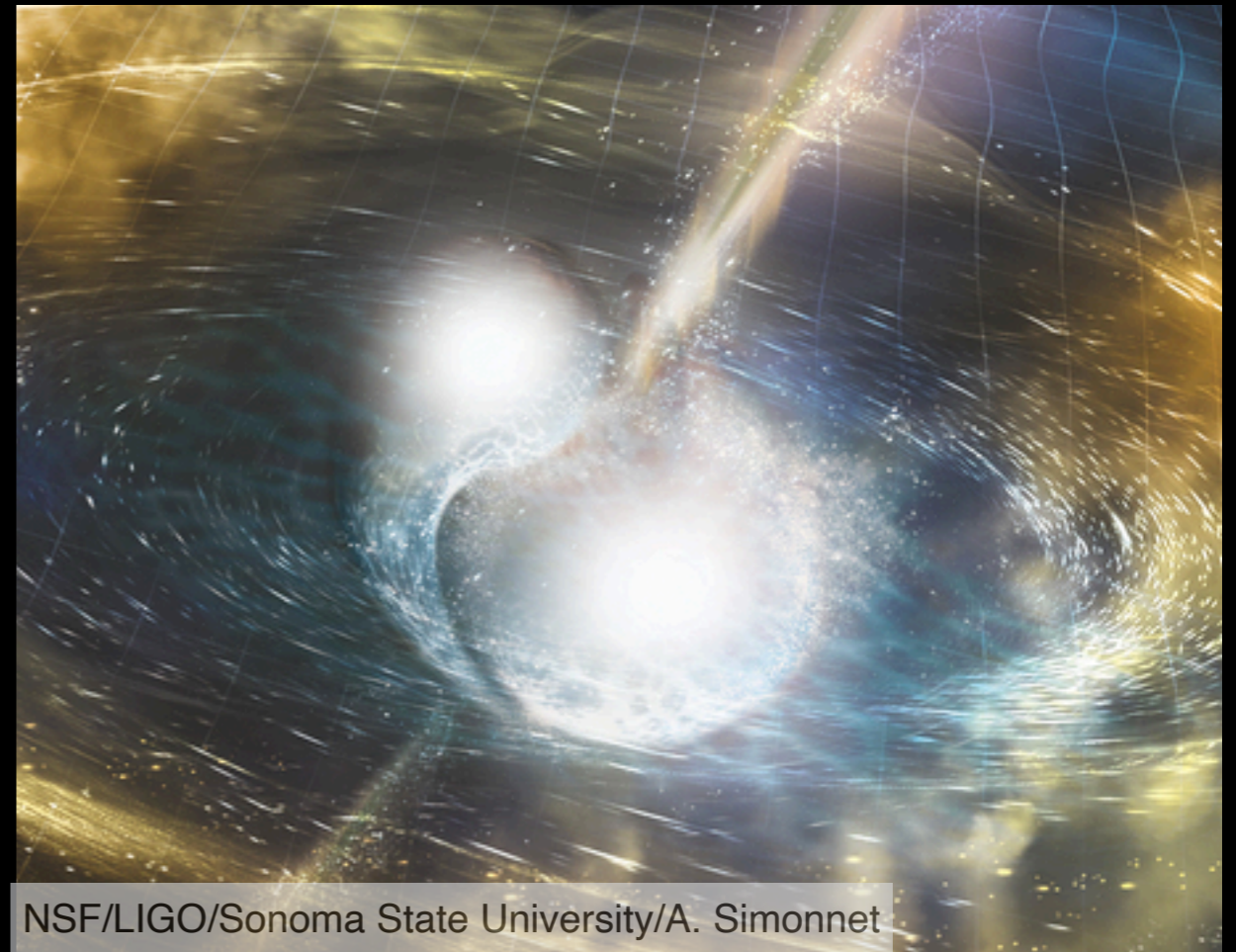


Gravitational wave astronomy



M. Heintze



NSF/LIGO/Sonoma State University/A. Simonnet



Jess McIver
GWANW student workshop
June 28, 2021



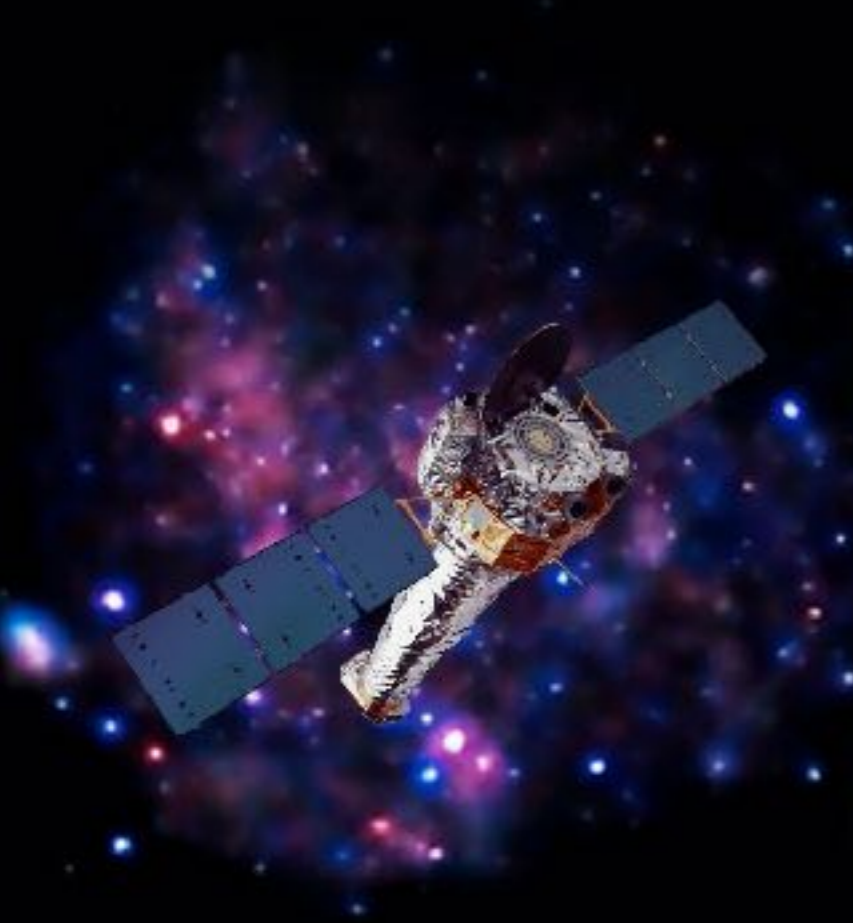
Astronomy with light

Electromagnetic Wave Windows

X-Ray

Optical

Radio



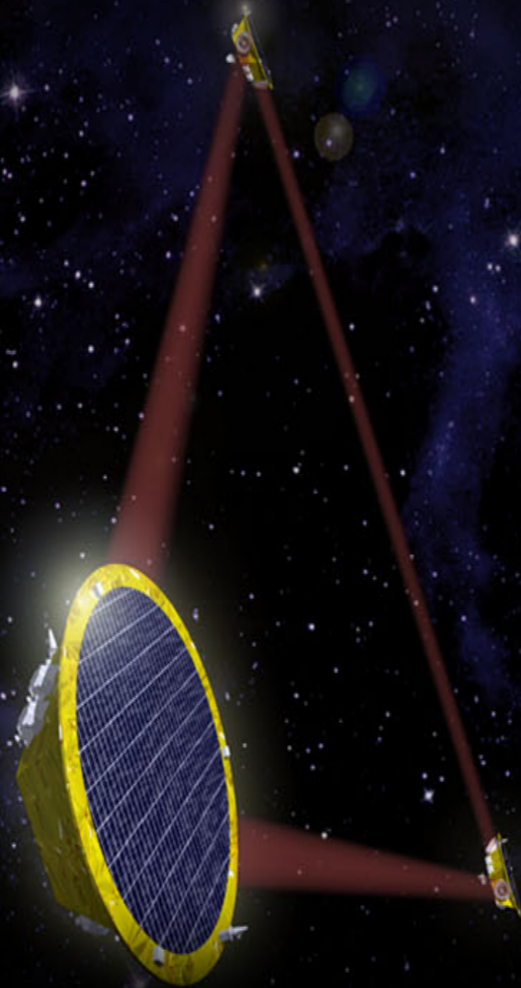
Gravitational Wave Periods

Milliseconds



LIGO/Virgo

Minutes
to Hours



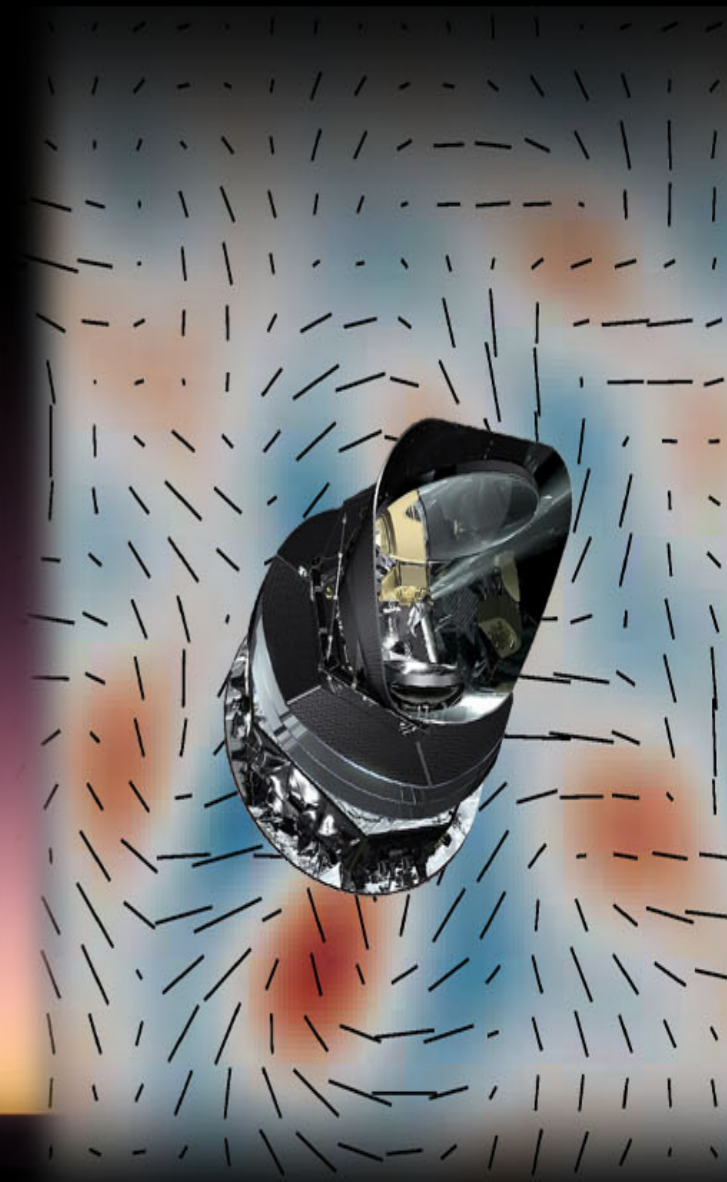
LISA

Years
to Decades

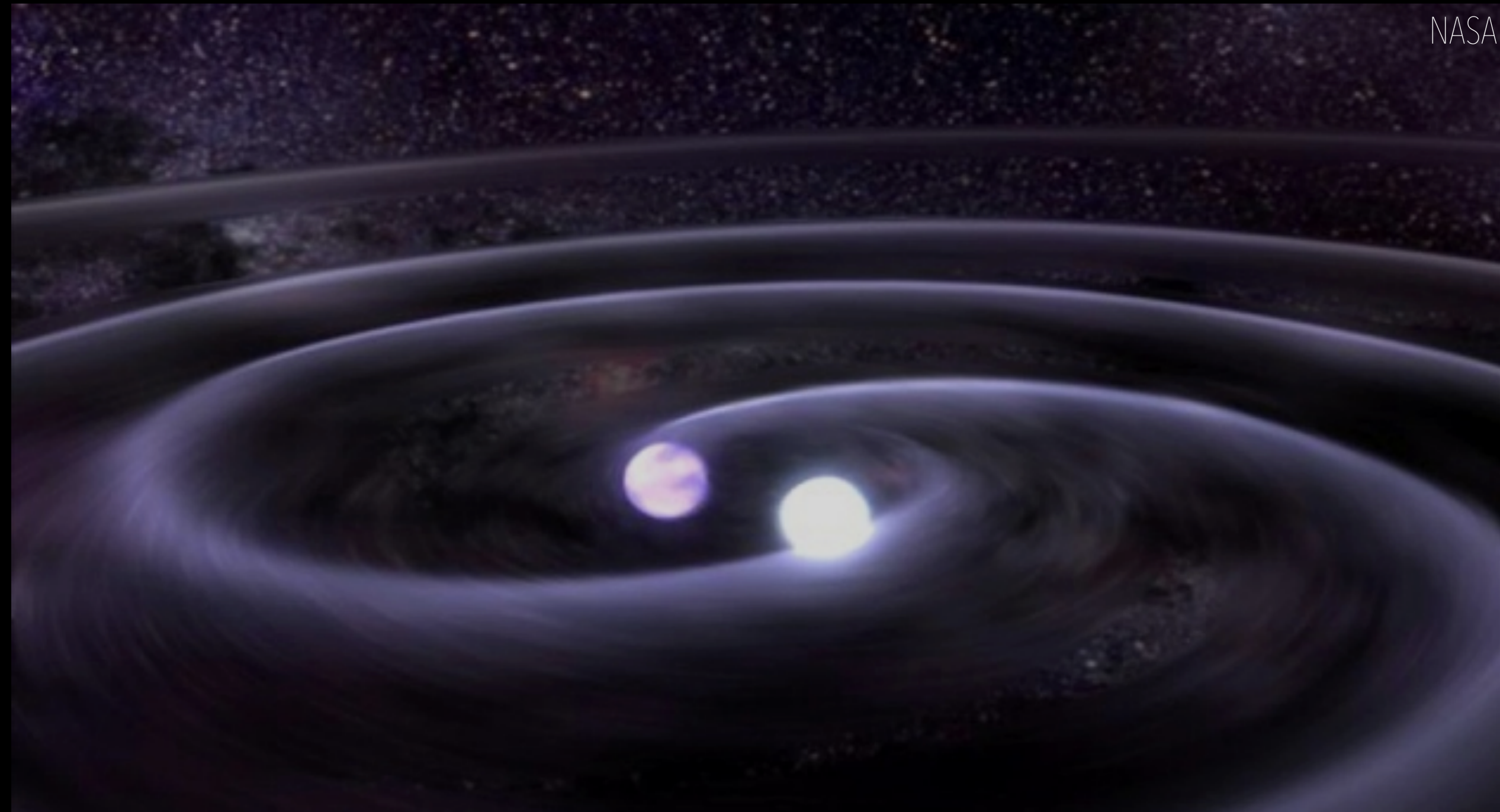


Pulsar timing

Billions
of Years



CMB polarization



gravitational waves

a new view of the universe

Independent measurement of Hubble constant

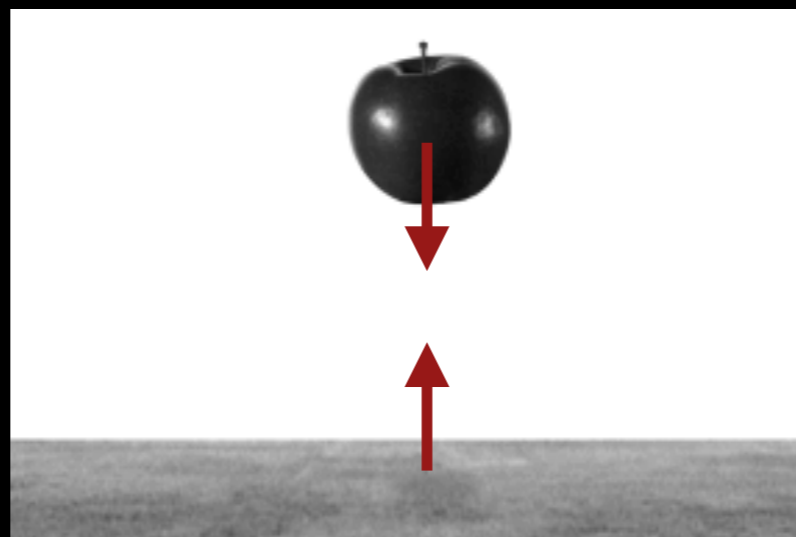
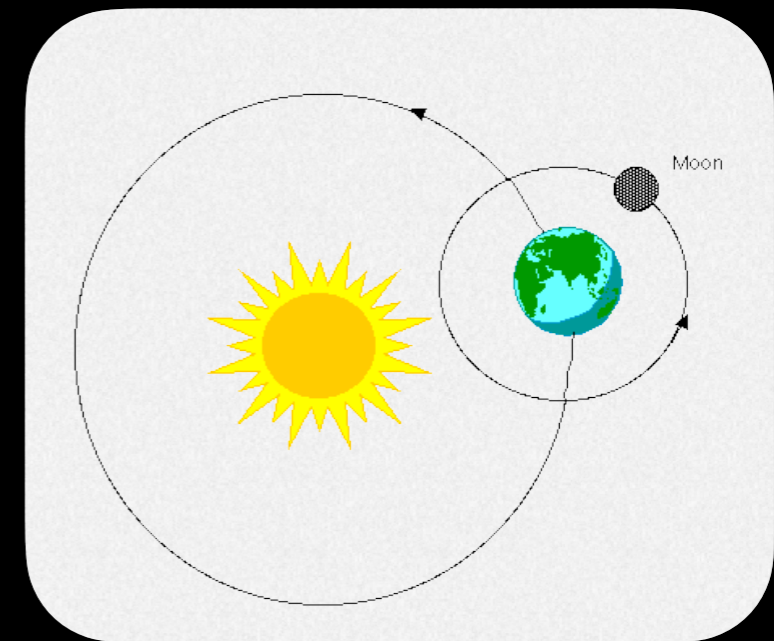
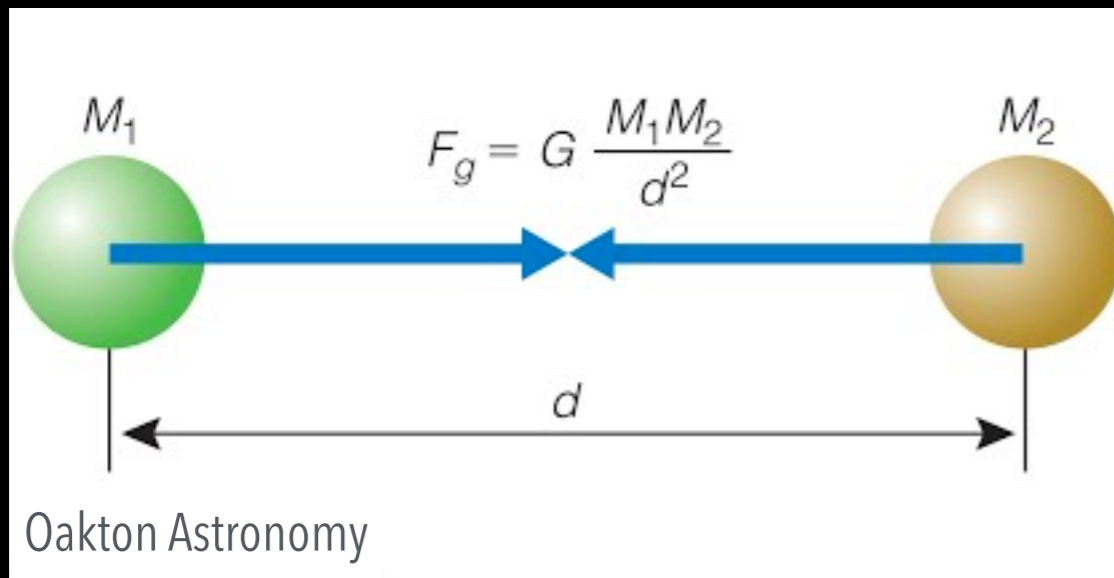
Insight into the nature of highly dense matter

Novel tests of general relativity

Census of stellar remnants across cosmic time

gravitational waves
a new view of the universe

Newton's Gravity

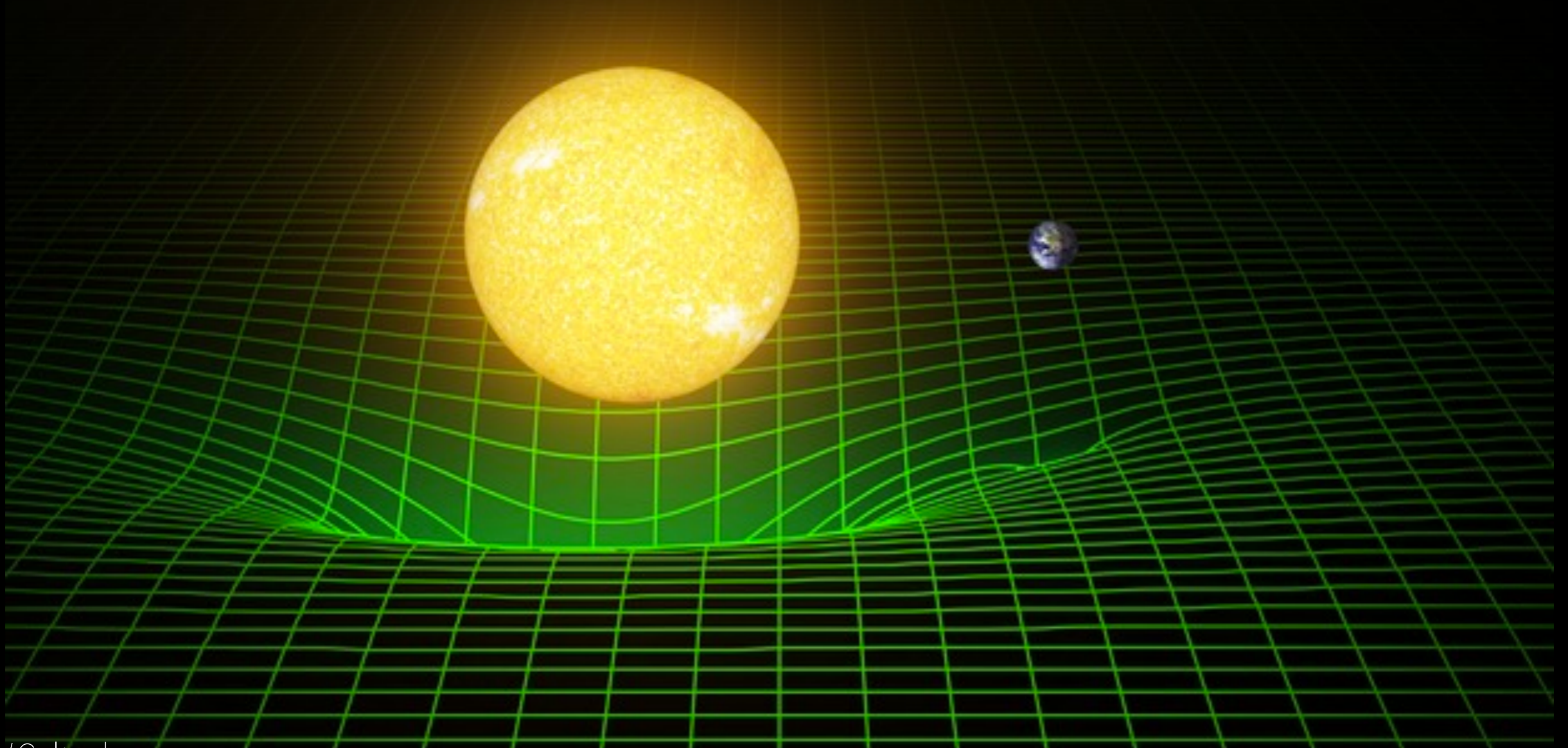


Einstein's Gravity: General Relativity

Matter tells spacetime how to curve
Spacetime tells matter how to move

$$G_{\mu\nu} = 8\pi T_{\mu\nu}$$

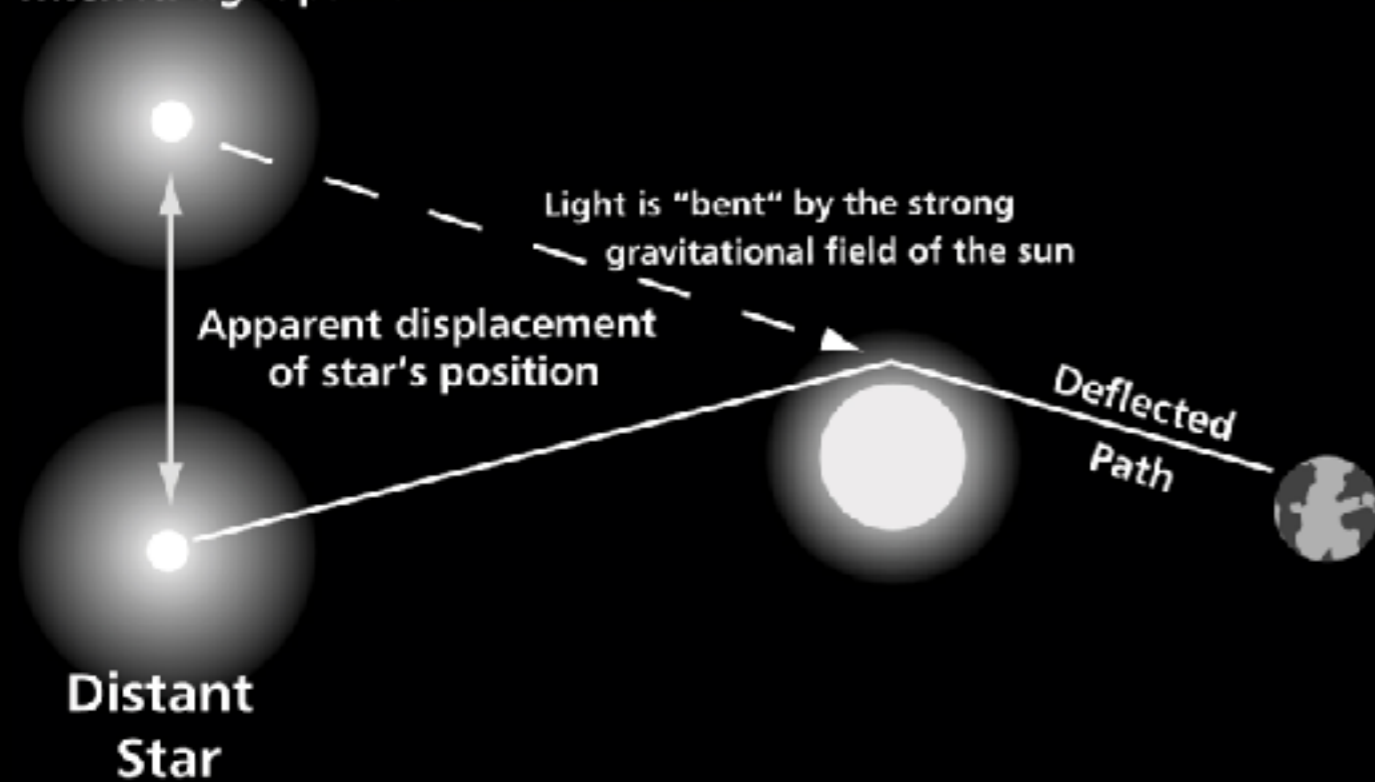
- John Wheeler



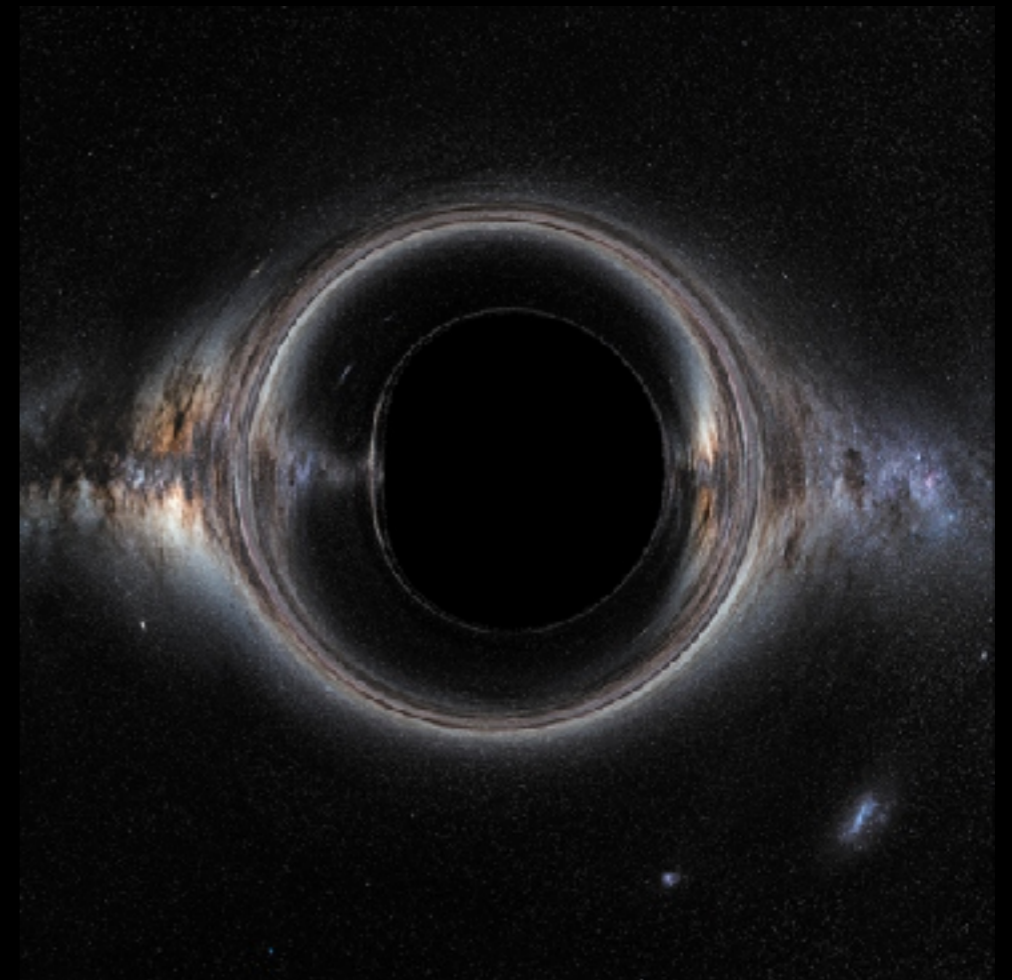
Some of Einstein's predictions

Gravity bends light

Apparent position of a distant star when its light passes close to the sun



Black holes

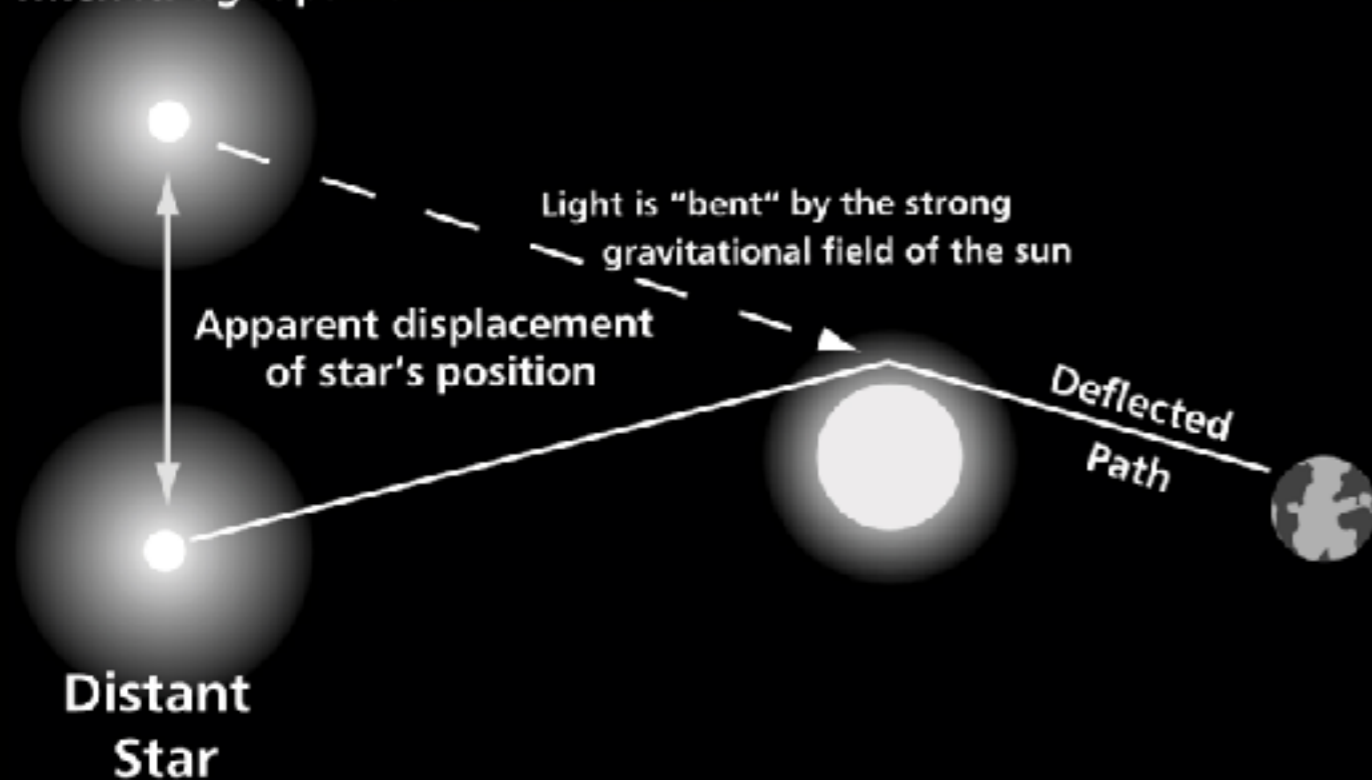


S. Brunier / ESO

Some of Einstein's predictions

Gravity bends light

Apparent position of a distant star when its light passes close to the sun



Black holes

The New York Times.

**LIGHTS ALL ASKEW
IN THE HEAVENS**

EINSTEIN THEORY TRIUMPHS

**Stars Not Where They Seemed
or Were Calculated to be,
but Nobody Need Worry.**

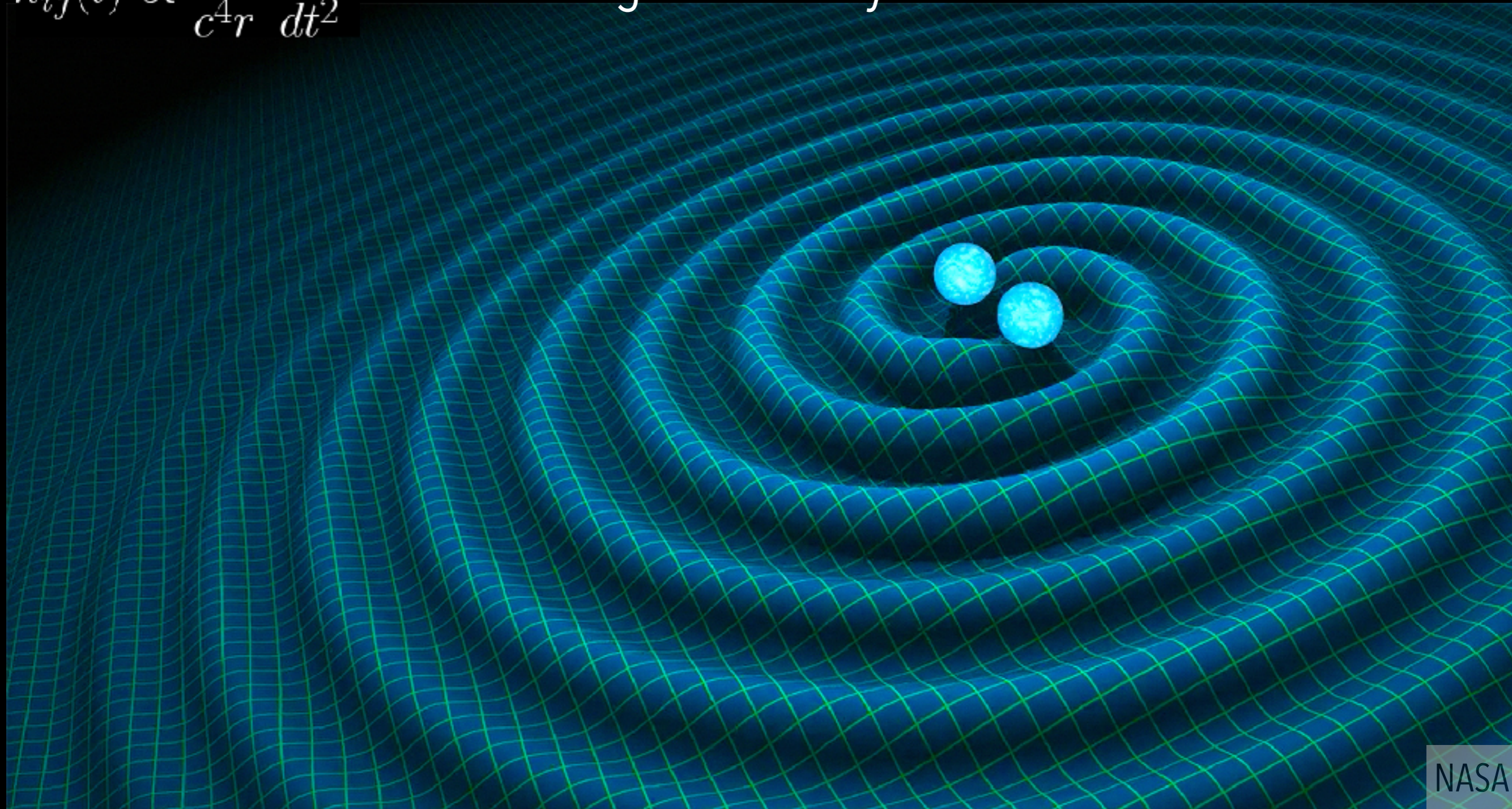
Measured by Eddington in 1919
during a total solar eclipse!

S. Brunier / ESO

Gravitational waves

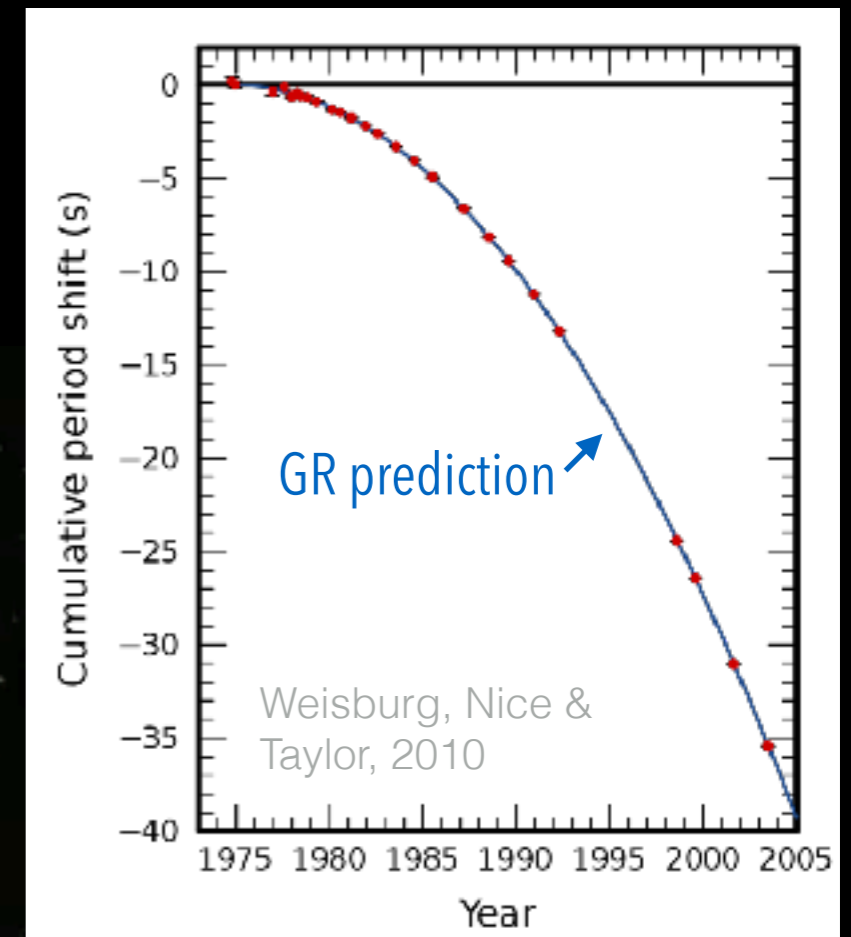
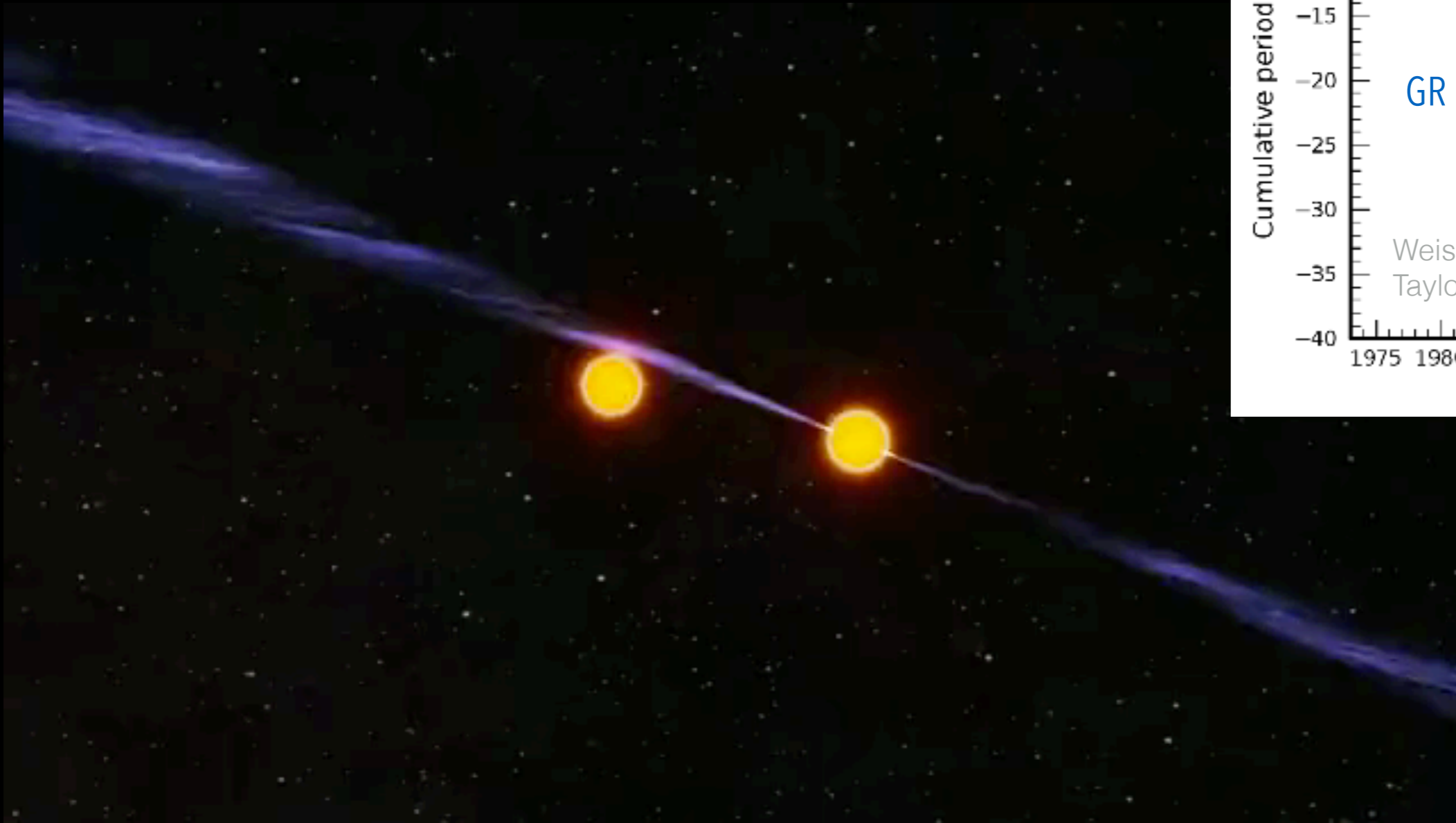
Ripples in the fabric of spacetime
generated by the acceleration of matter

$$h_{ij}(t) \propto \frac{G}{c^4 r} \frac{d^2 I_{ij}}{dt^2}$$



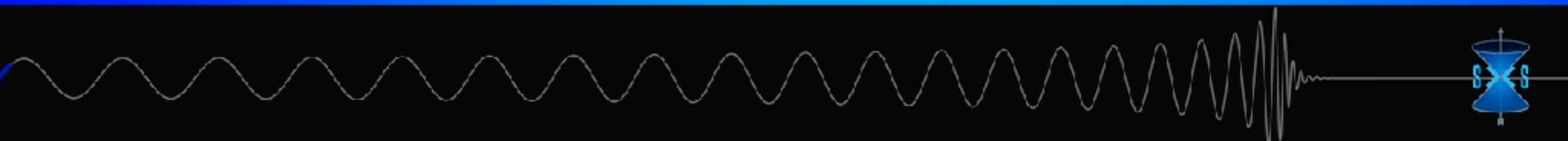
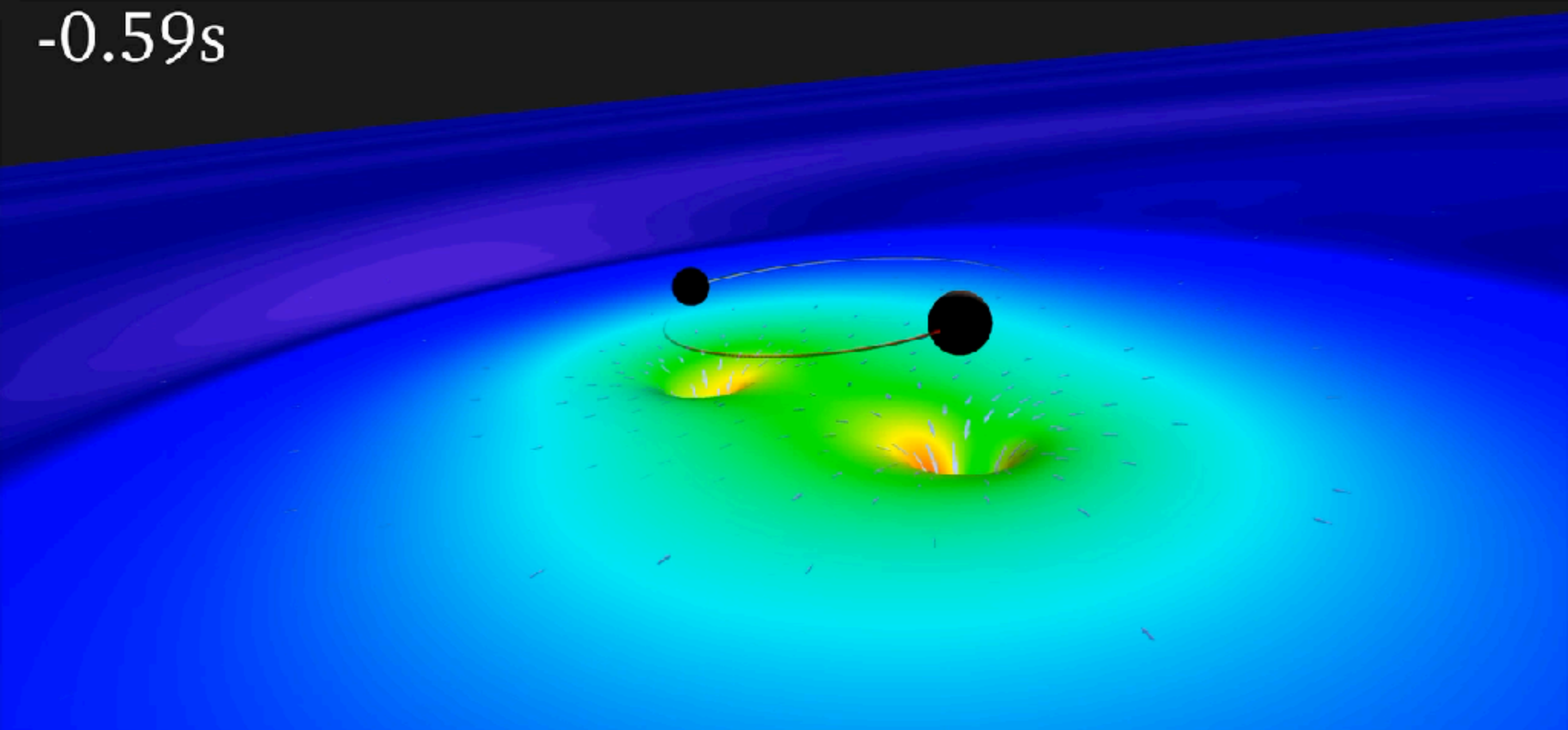
Indirect evidence of gravitational waves

Hulse-Taylor Binary Pulsar
Won the Nobel Prize in Physics in 1993!



A binary black hole coalescence

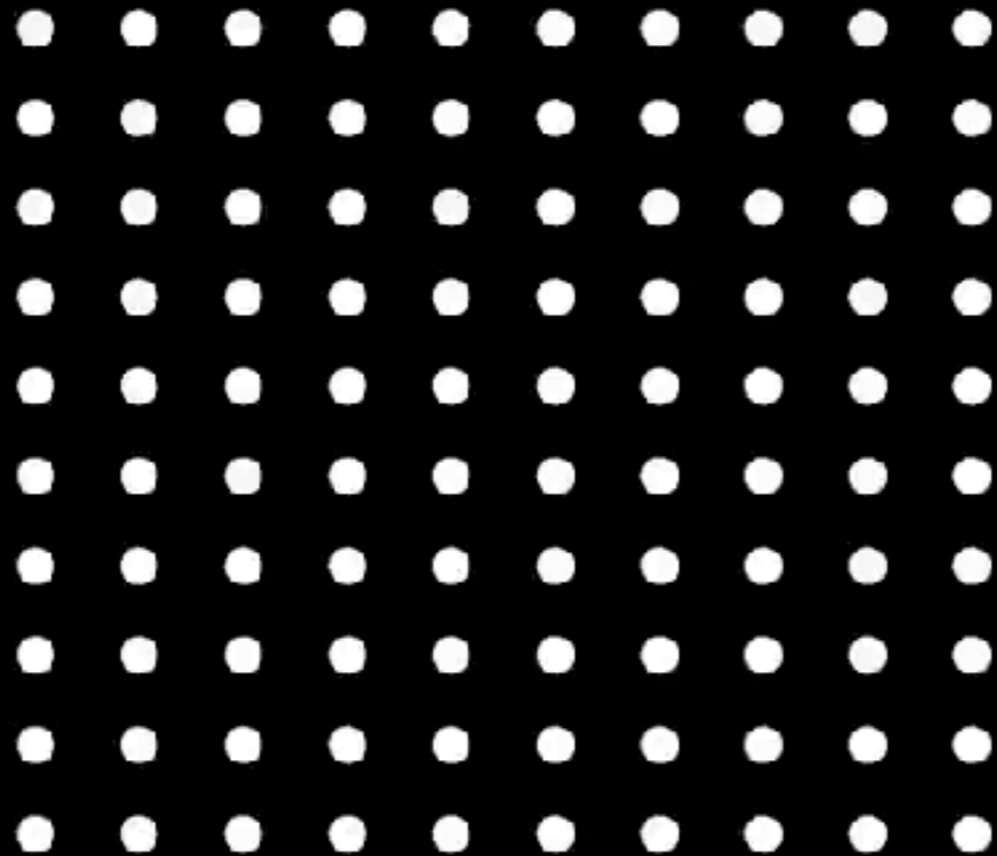
-0.59s



Gravitational wave strain

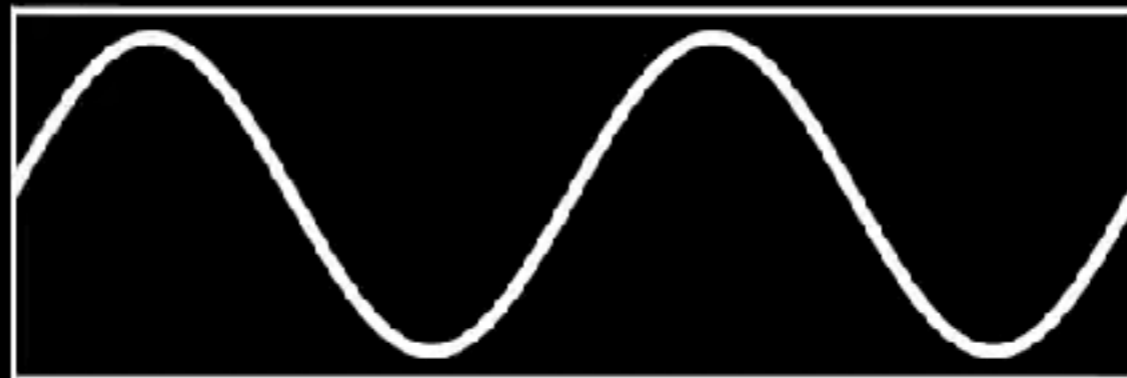
Induced
spacetime
strain $h(t)$

$$h_{ij}(t) \propto \frac{G}{c^4 r} \frac{d^2 I_{ij}}{dt^2}$$

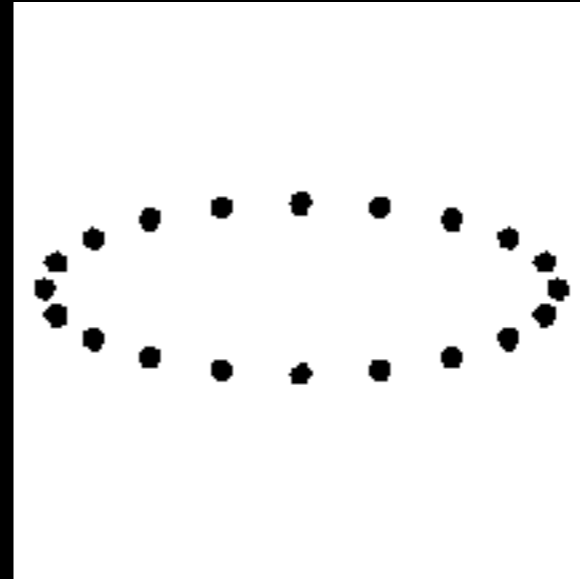
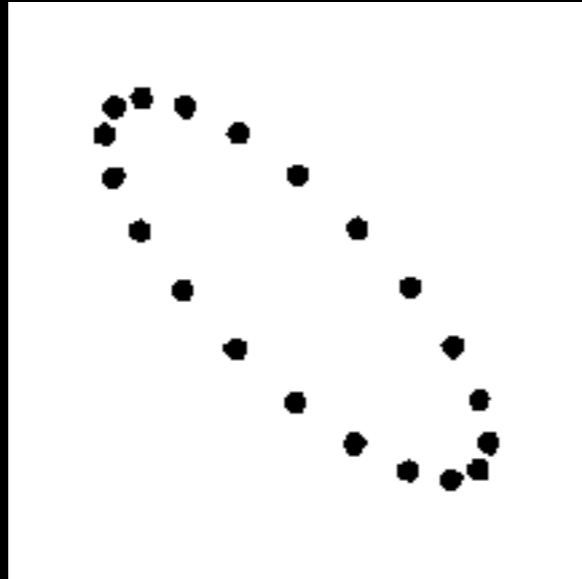


Measured
spacetime
strain $h(t)$

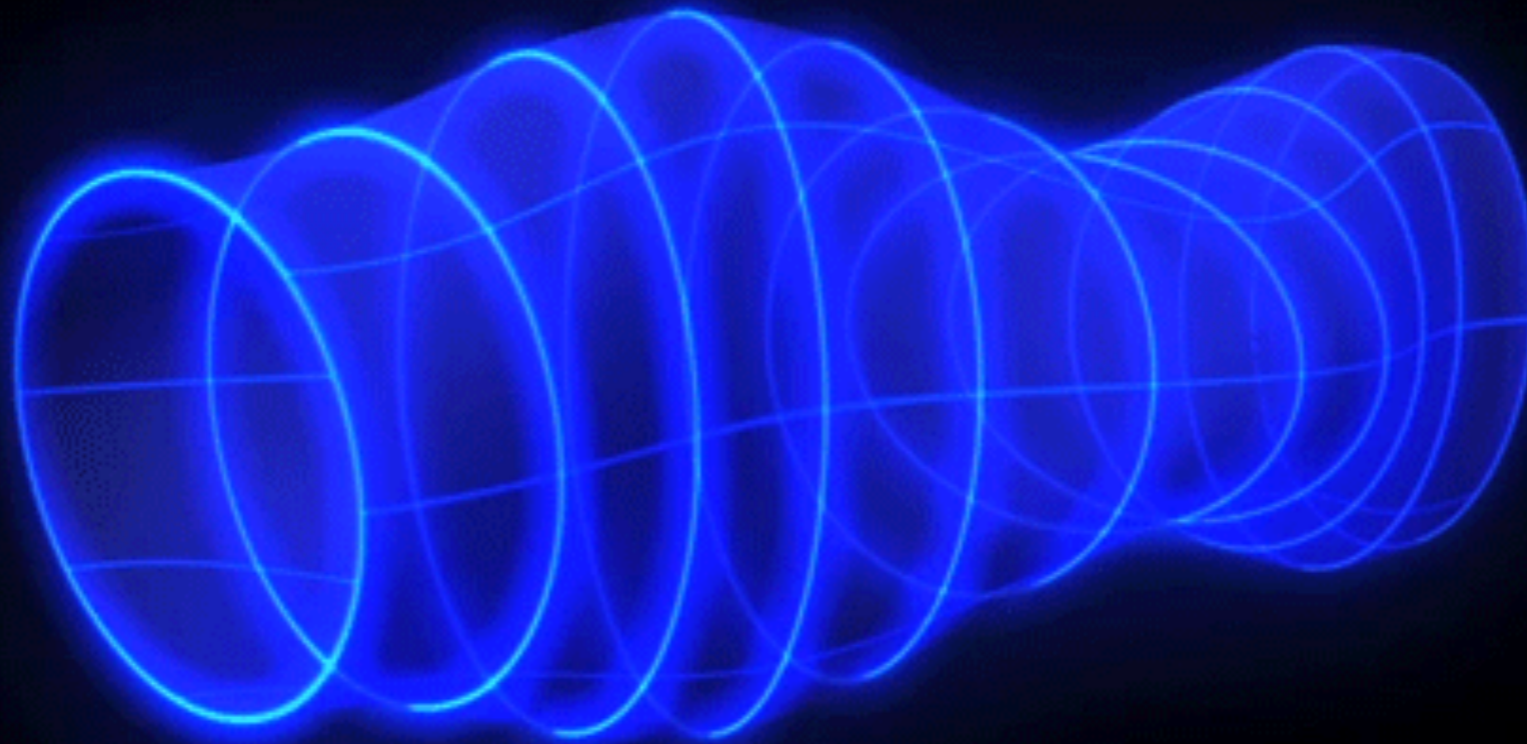
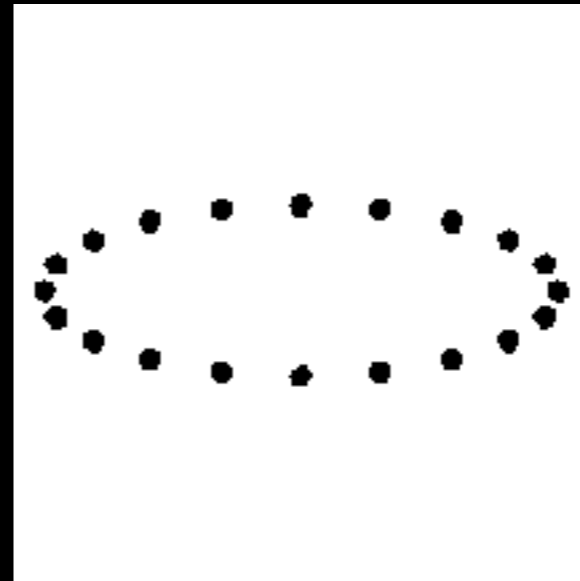
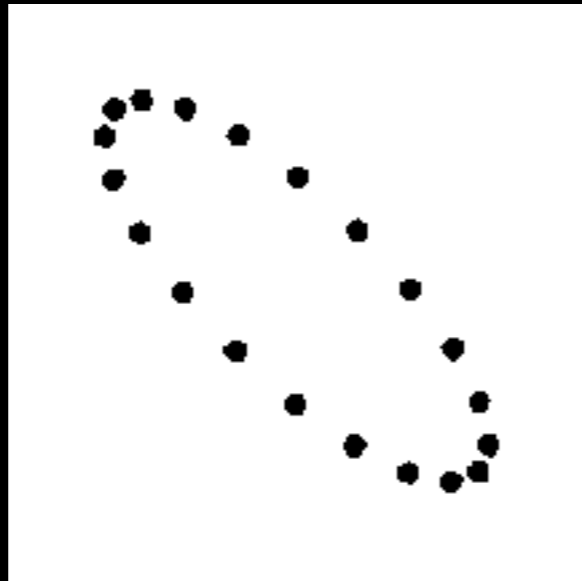
$$\frac{\Delta L}{L}$$



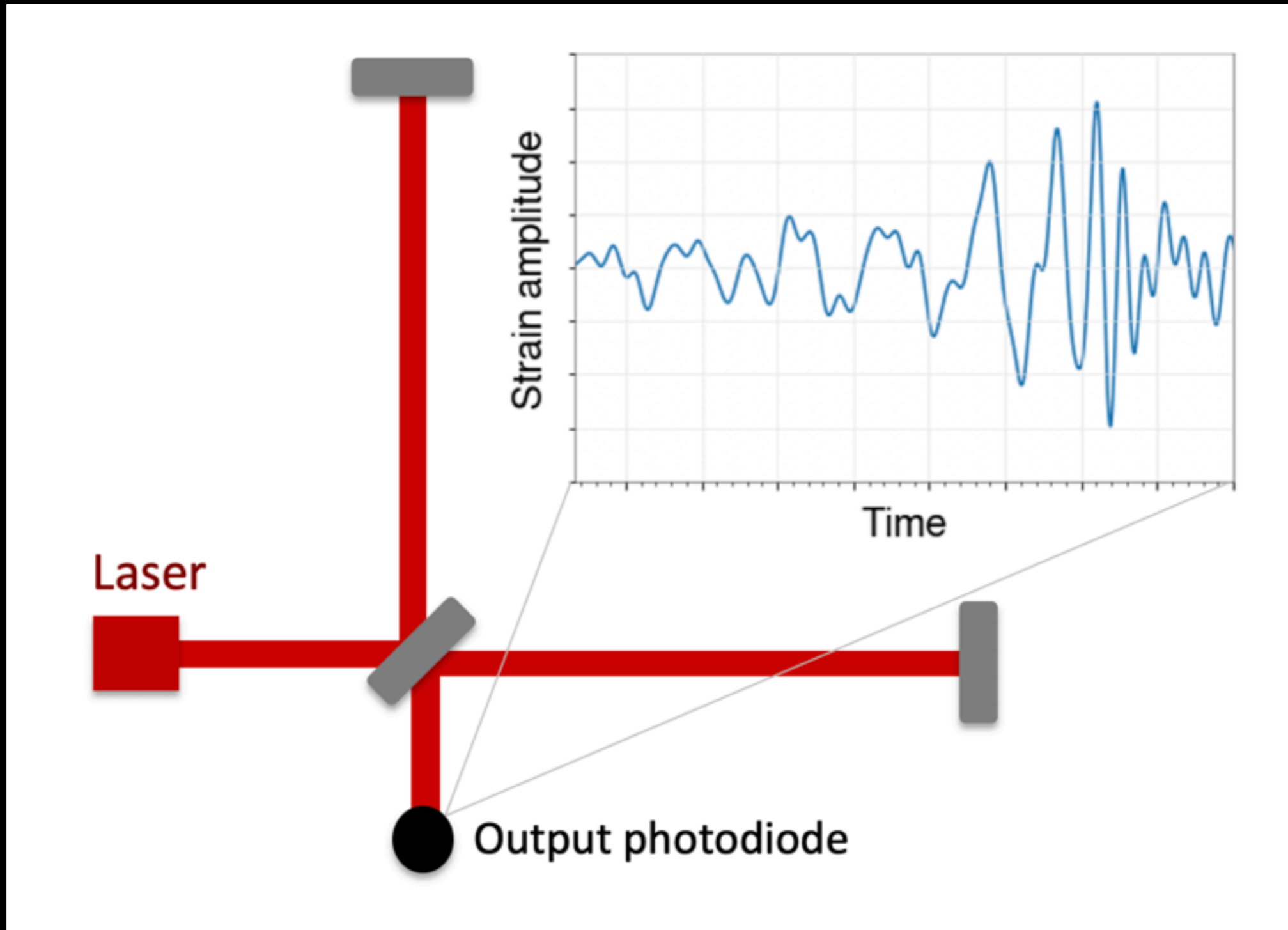
Gravitational wave propagation



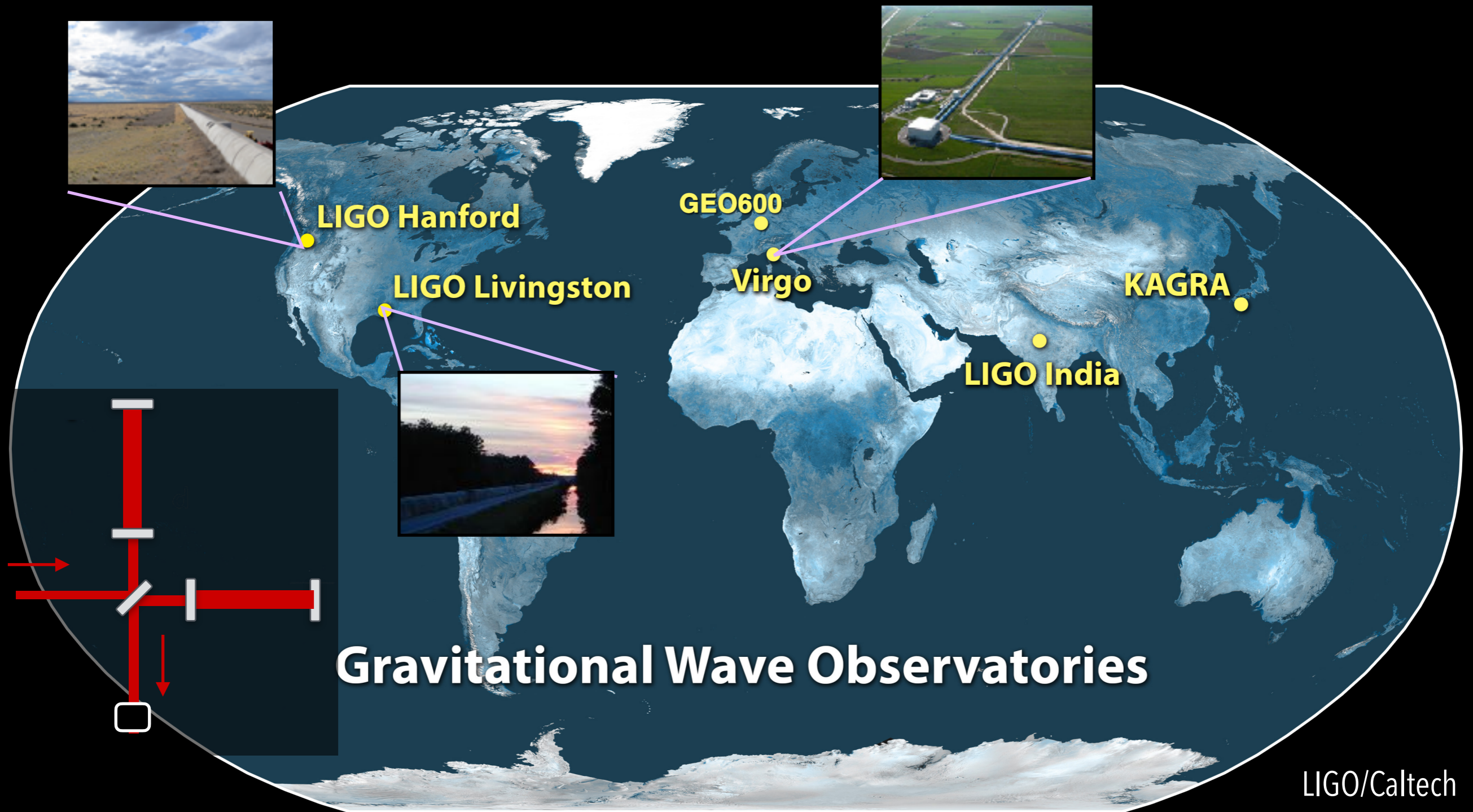
Gravitational wave propagation



Observing GWs with interferometry

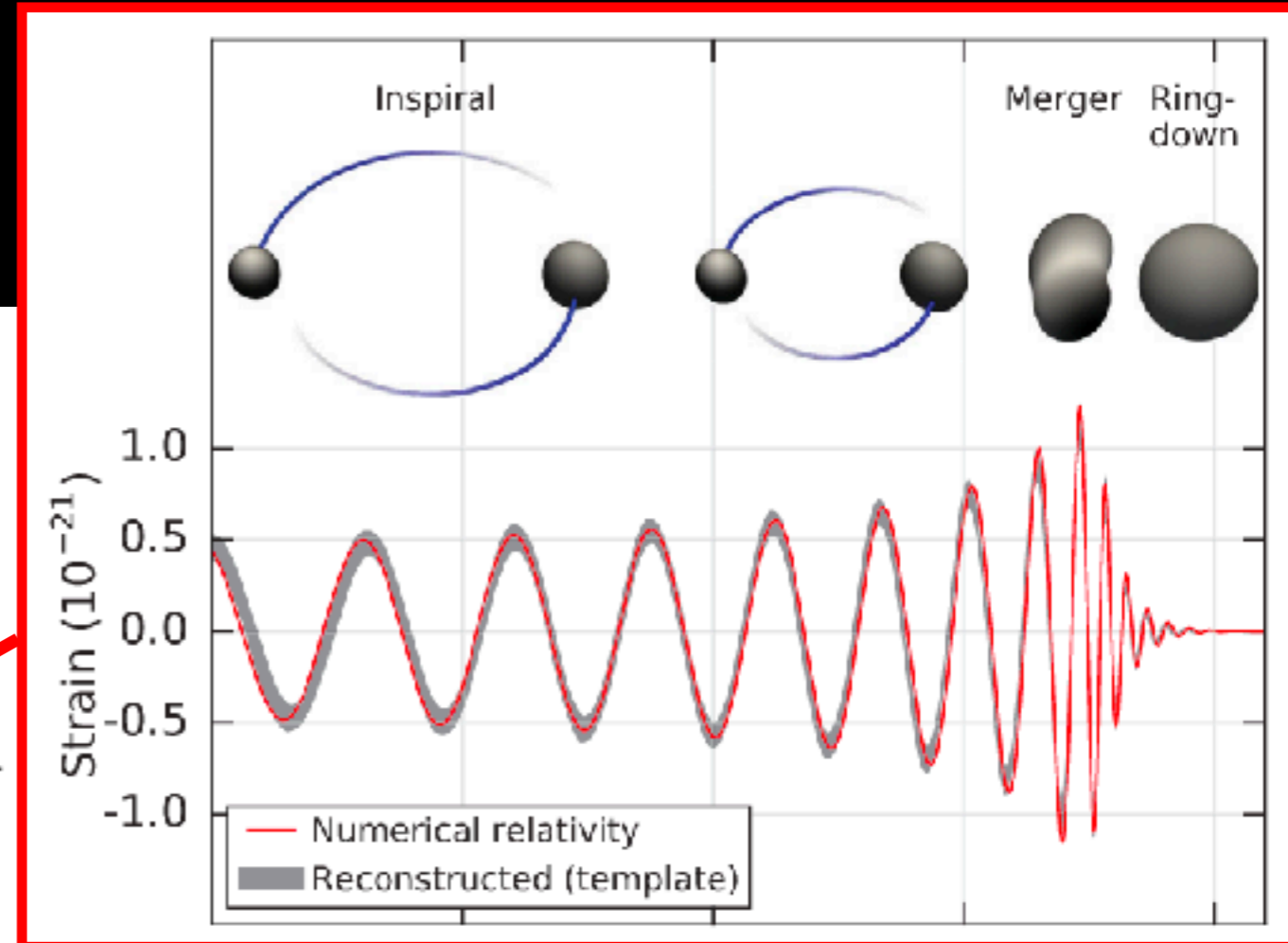
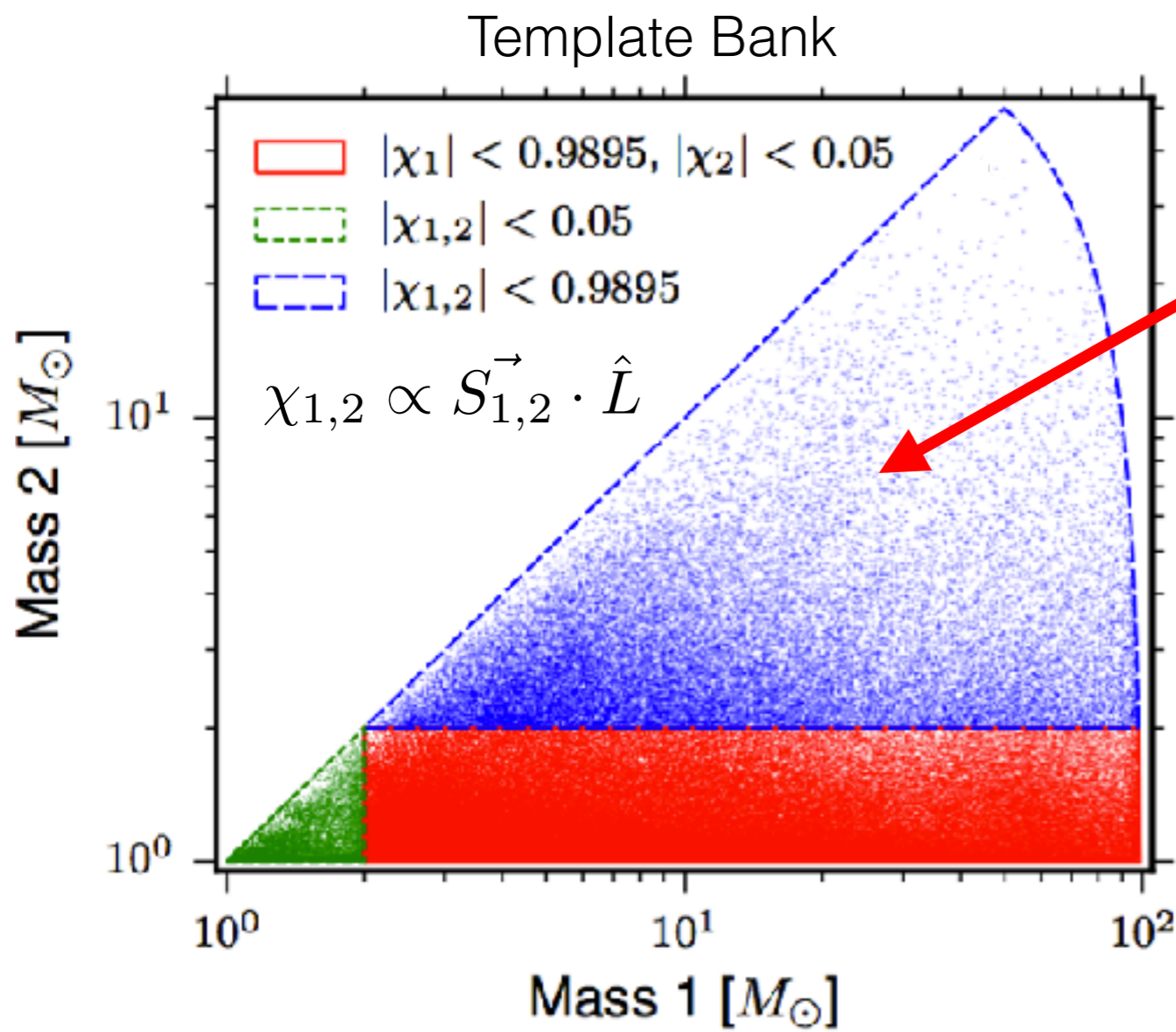


Detector network in 03



Searching for signals with matched filtering

Slide adapted from S. Caudill and M. Cabero Mueller

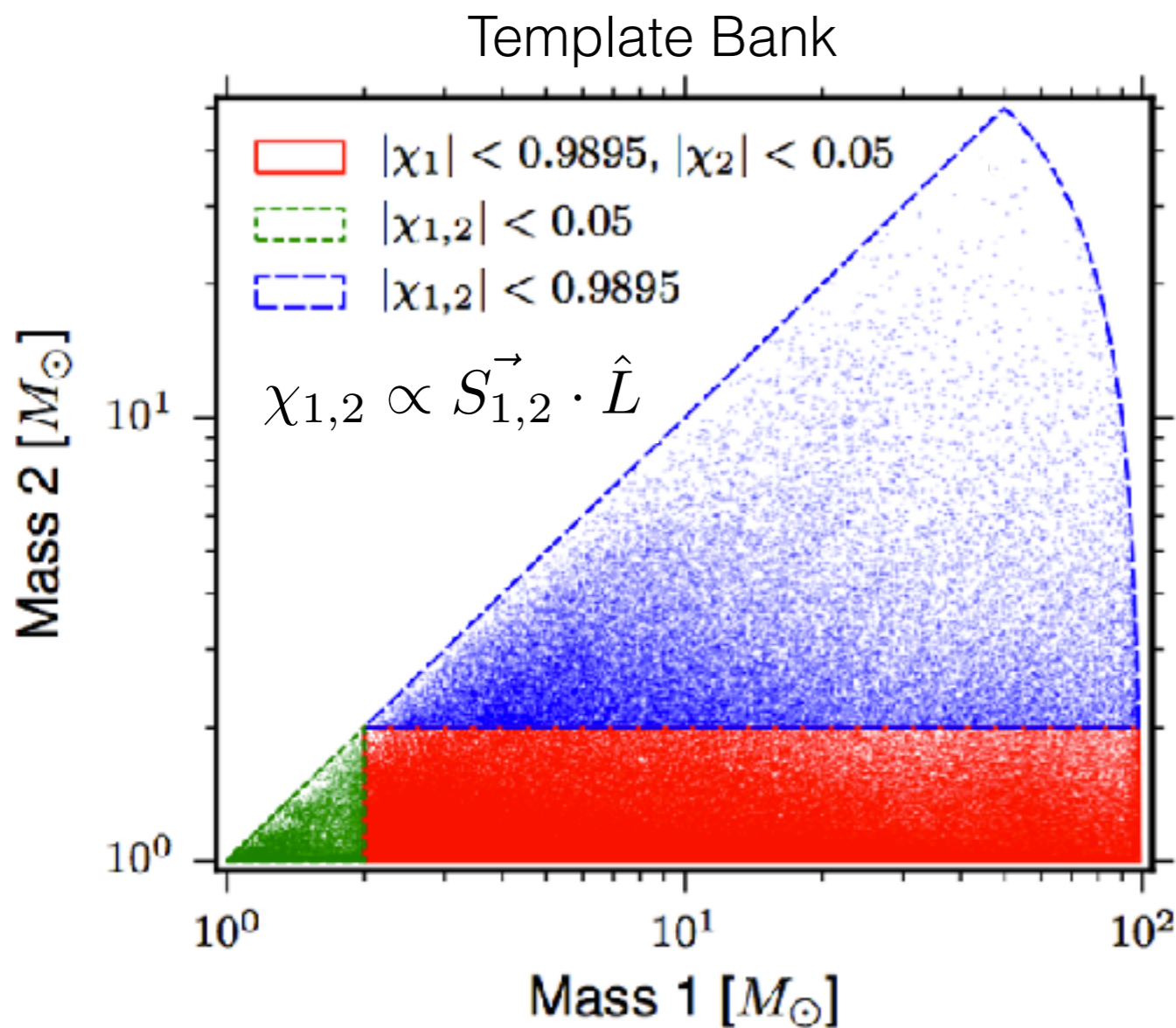


B.P Abbott et al., Phys. Rev. Lett. 116, 061102 (2016)

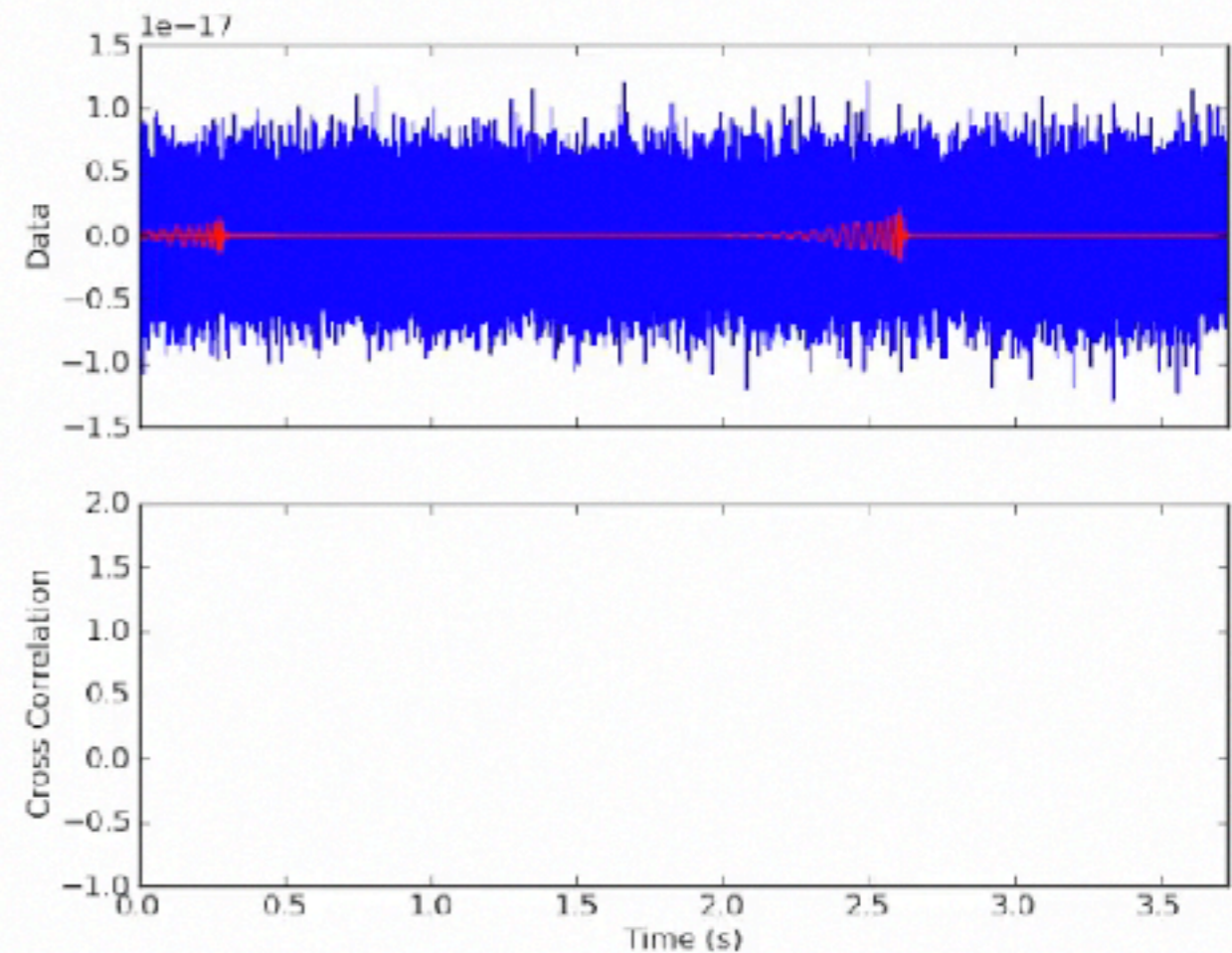
Searching for signals with matched filtering

Slide adapted from S. Caudill

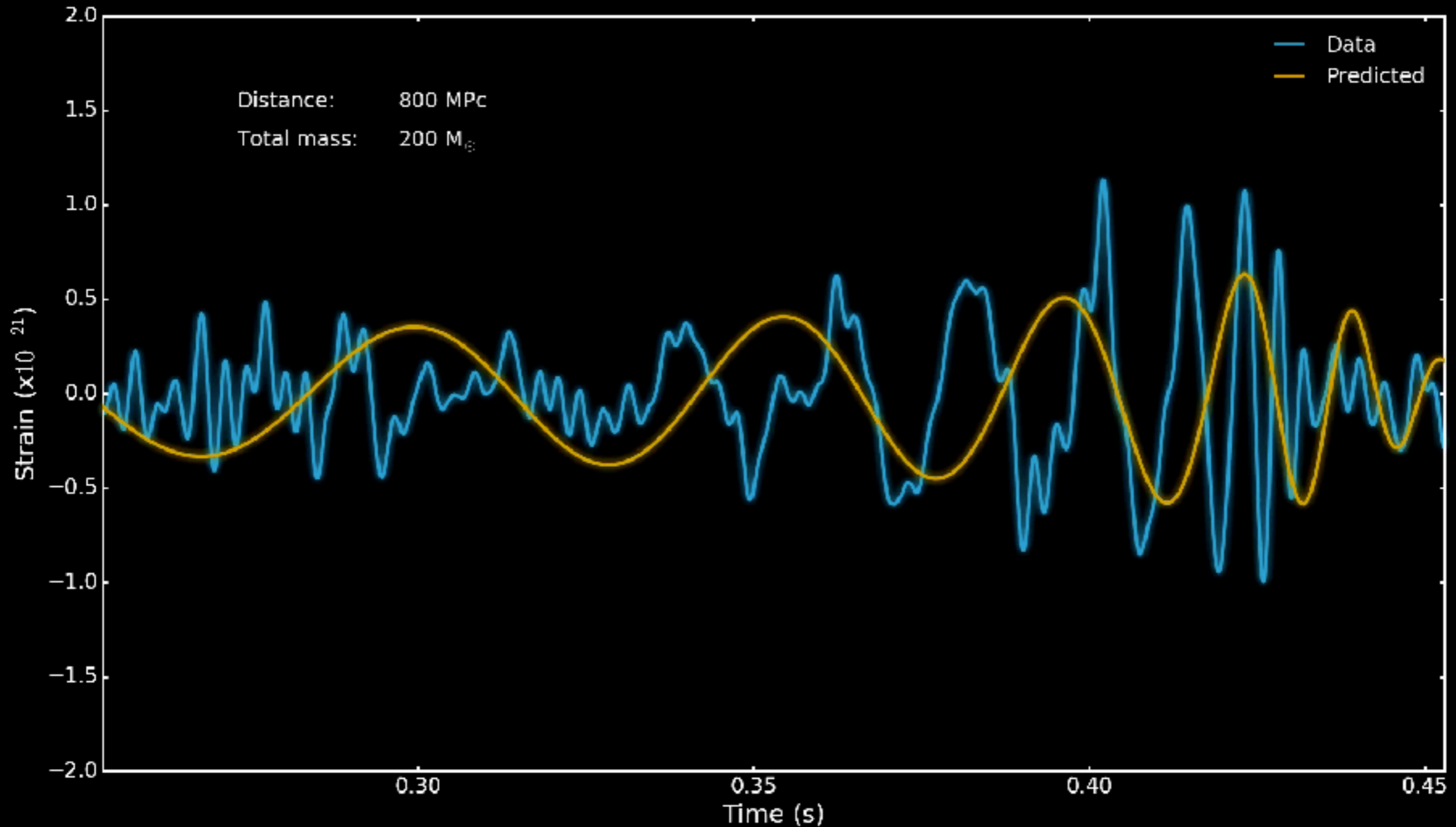
$$\rho^2(t) = \left[\langle s|h_c \rangle^2(t) + \langle s|h_s \rangle^2(t) \right] \quad \langle s|h \rangle = 4\text{Re} \int_0^\infty \frac{\tilde{s}(f)\tilde{h}^*(f)}{S_n(f)} e^{2\pi i f t} df$$



Matched filter signal-to-noise ratio



Inferring mass and distance



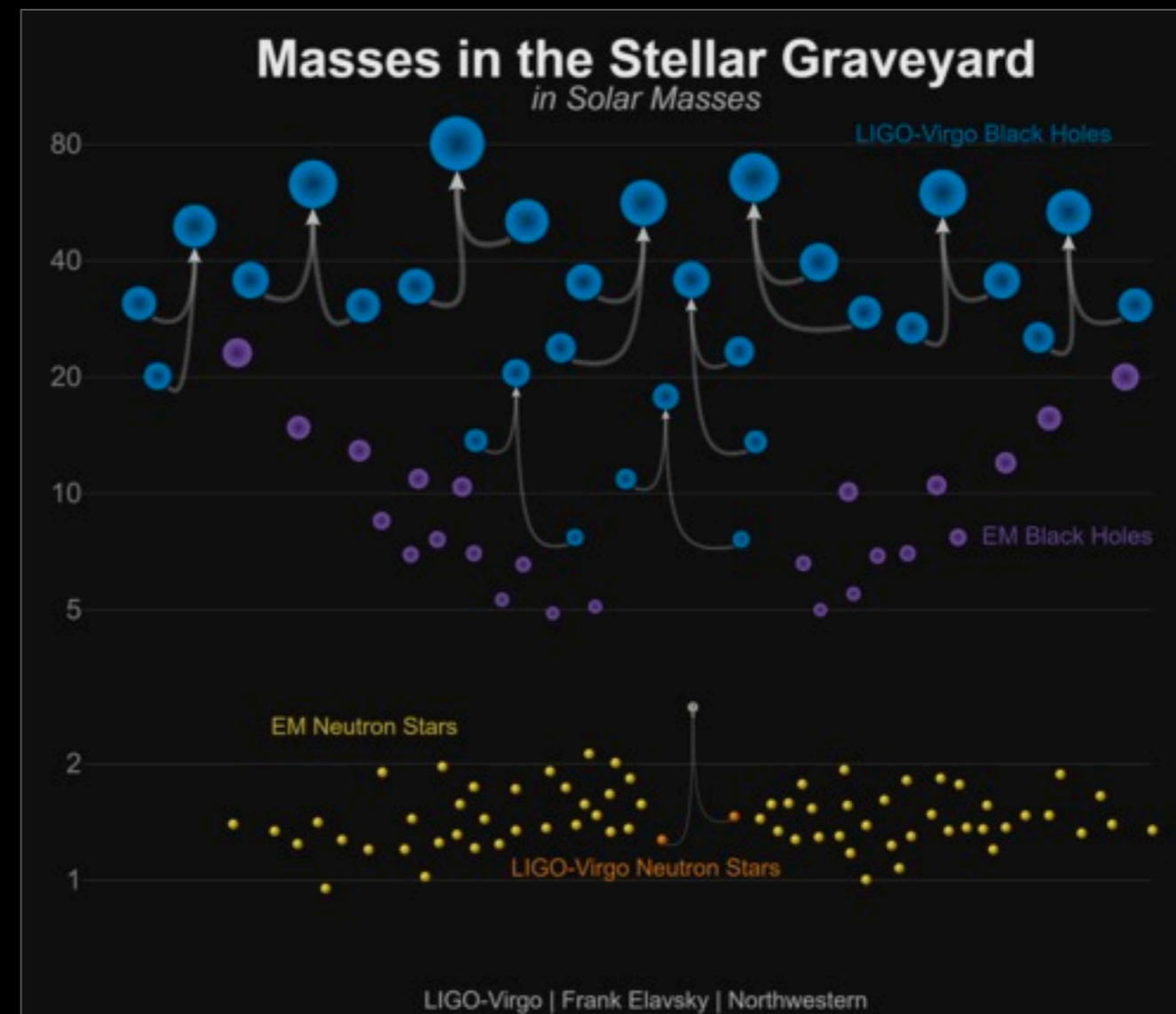
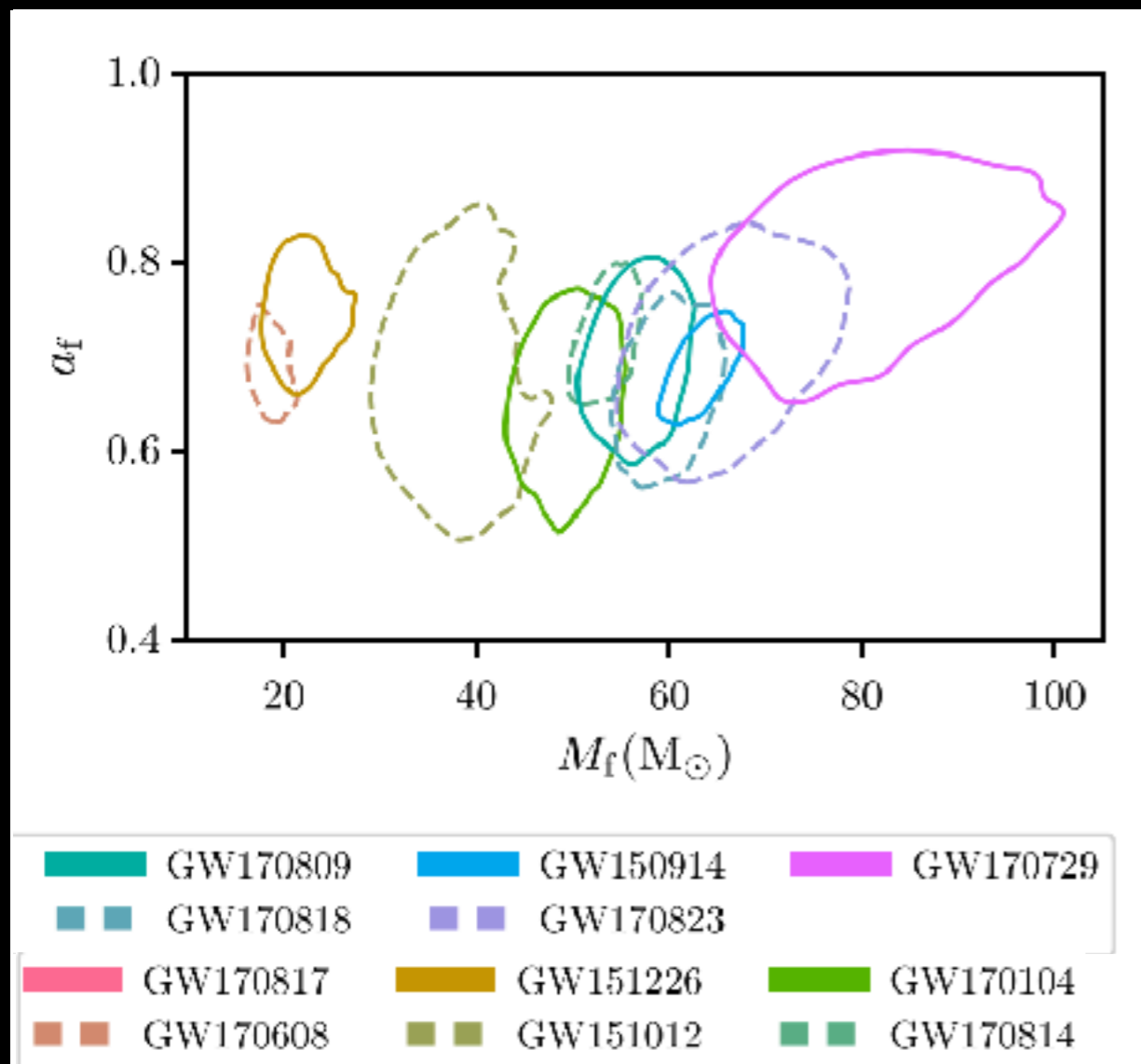
Bayesian inference of source properties

$$\mathbf{d} = \mathbf{h} + \mathbf{n}.$$

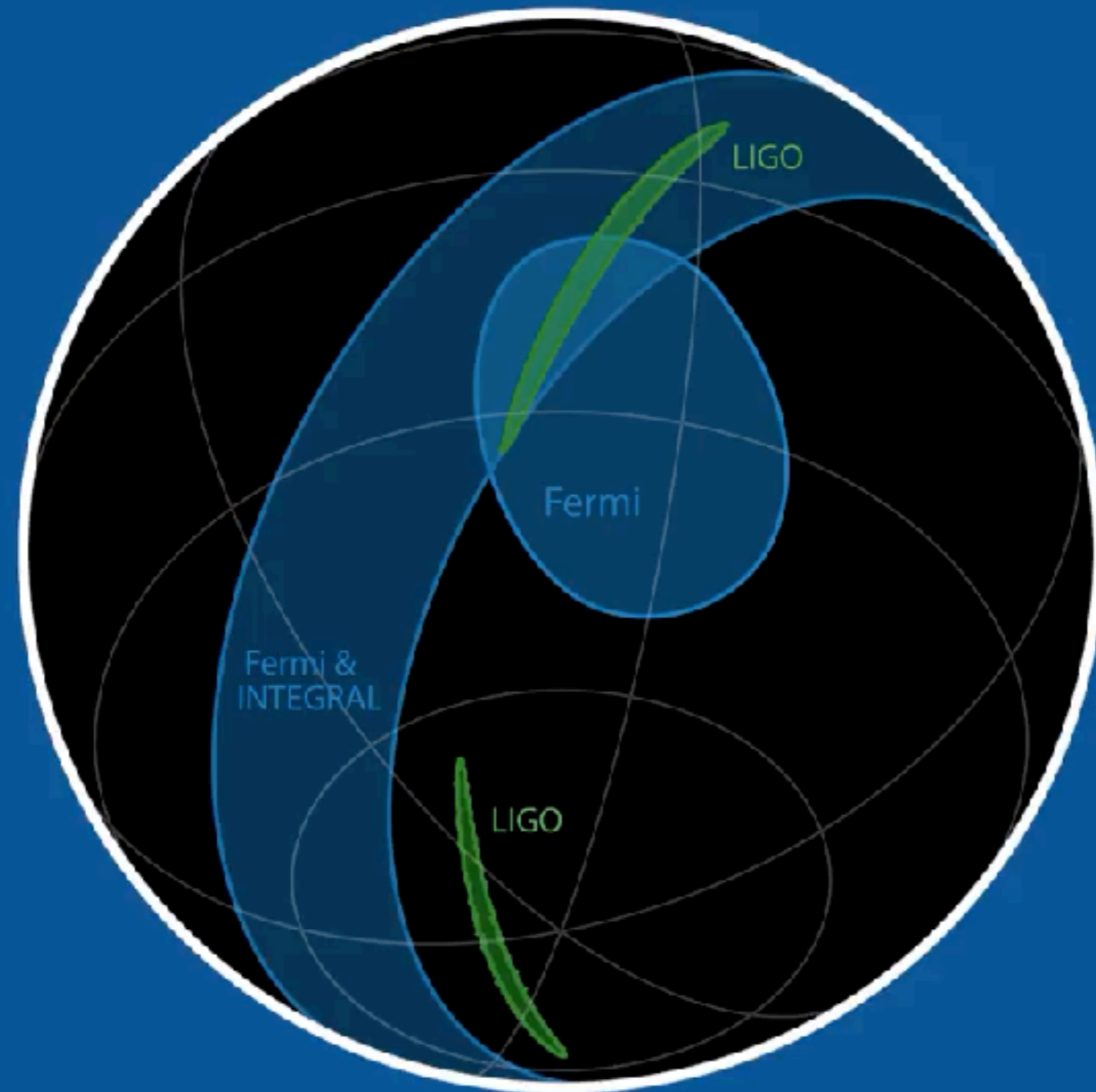
← Data model \mathbf{d} = signal (through lens of detector network) \mathbf{h} + detector noise \mathbf{n}

$$p(\mathbf{d} | H_N, S_n(f)) = \exp \sum_i \left[-\frac{2|\tilde{d}_i|^2}{TS_n(f_i)} - \frac{1}{2} \log(\pi TS_n(f_i)/2) \right]$$

← Likelihood: expect the residual of $\mathbf{d}-\mathbf{h}$ to be consistent with Gaussian noise



Sky localization with GWs



Discovery of an optical counterpart

SSS17a



August 17, 2017



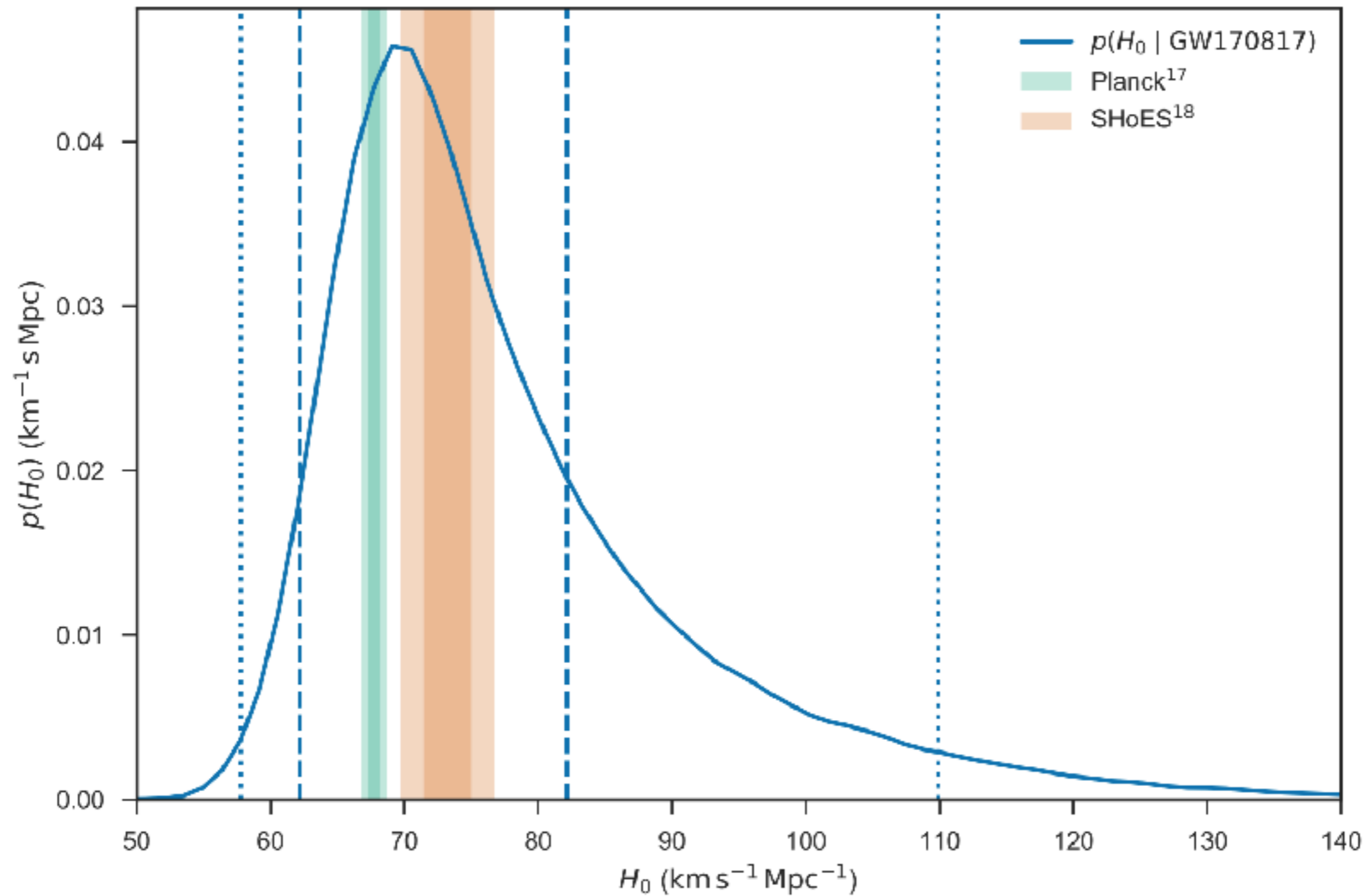
August 21, 2017

Swope & Magellan Telescopes

The first multi-messenger discovery with GWs



Cosmology with GWs

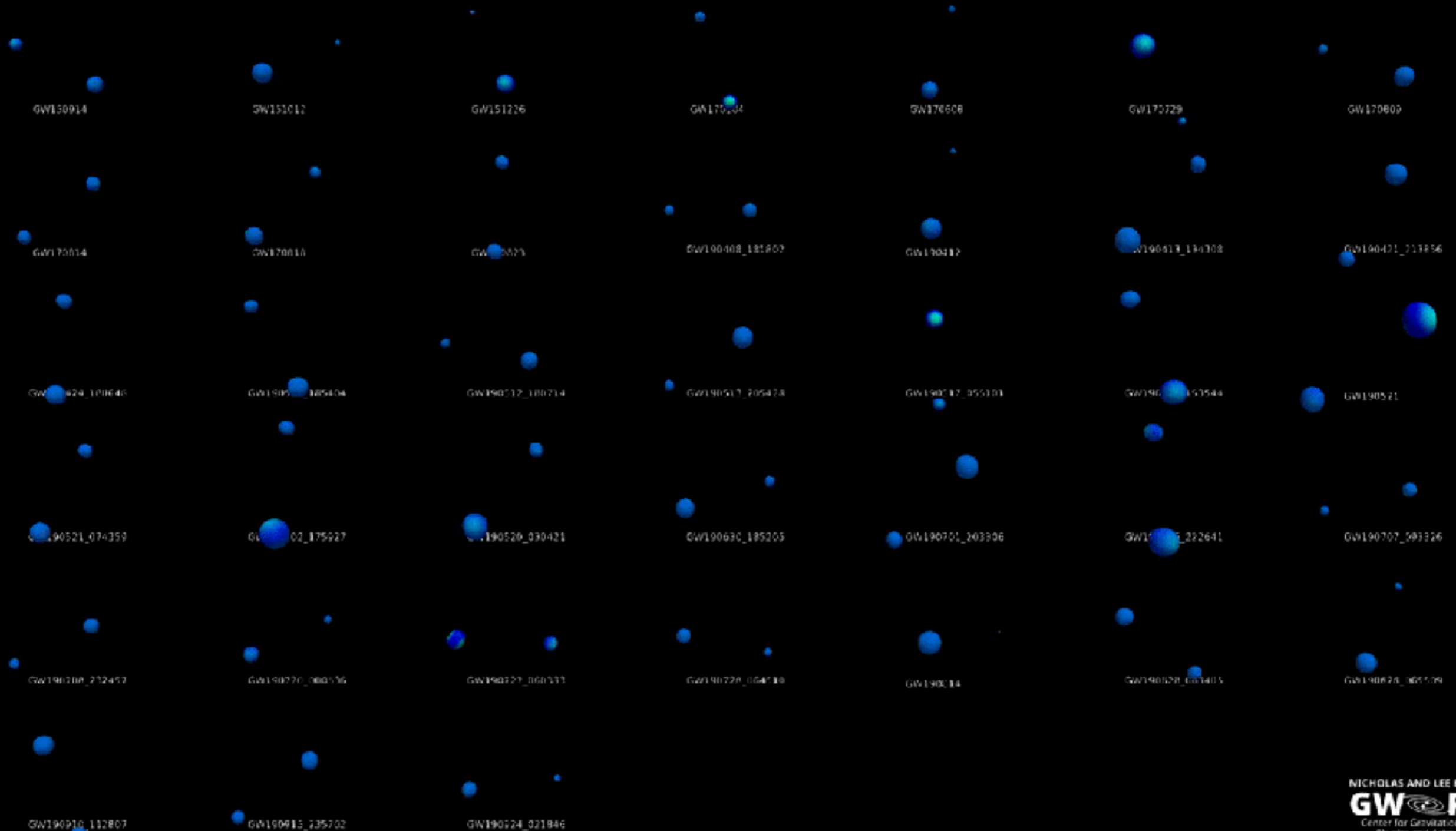


The GW Orrery: what we've observed



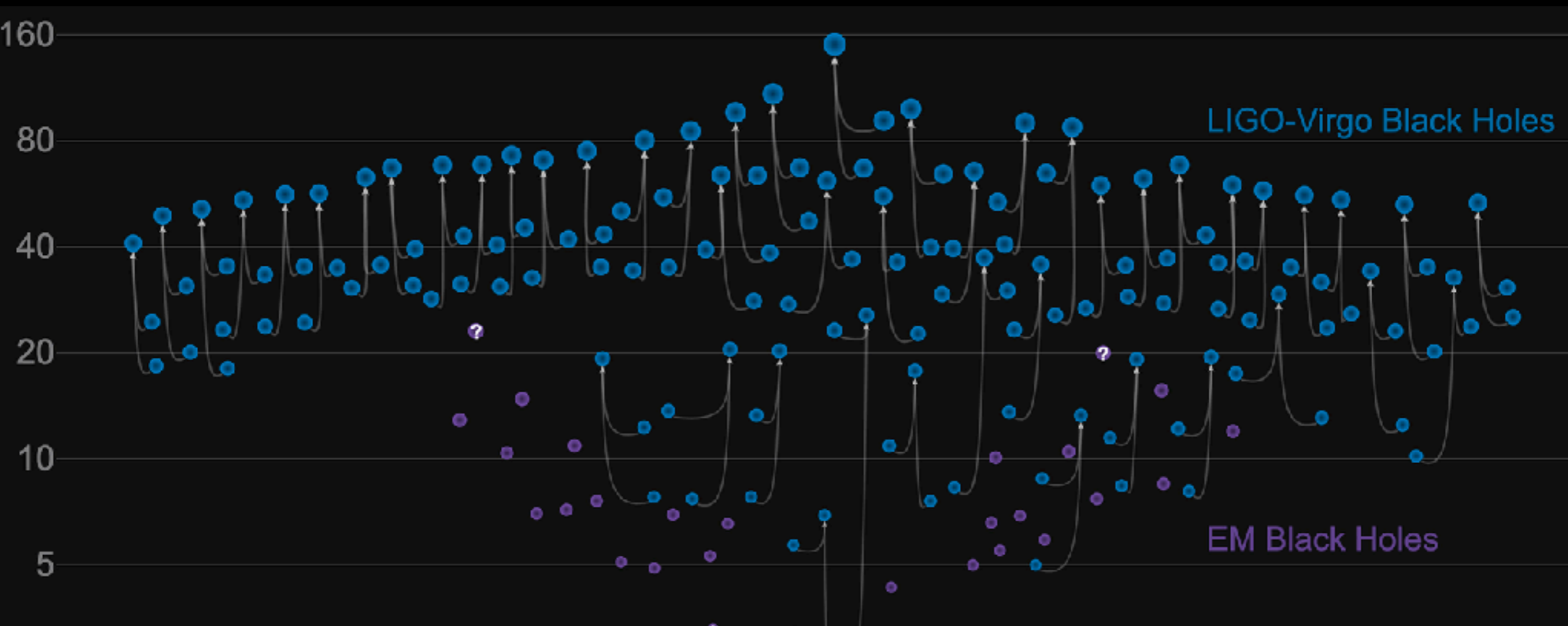
LIGO/Virgo O1 - O3a

Time: -0.30 seconds



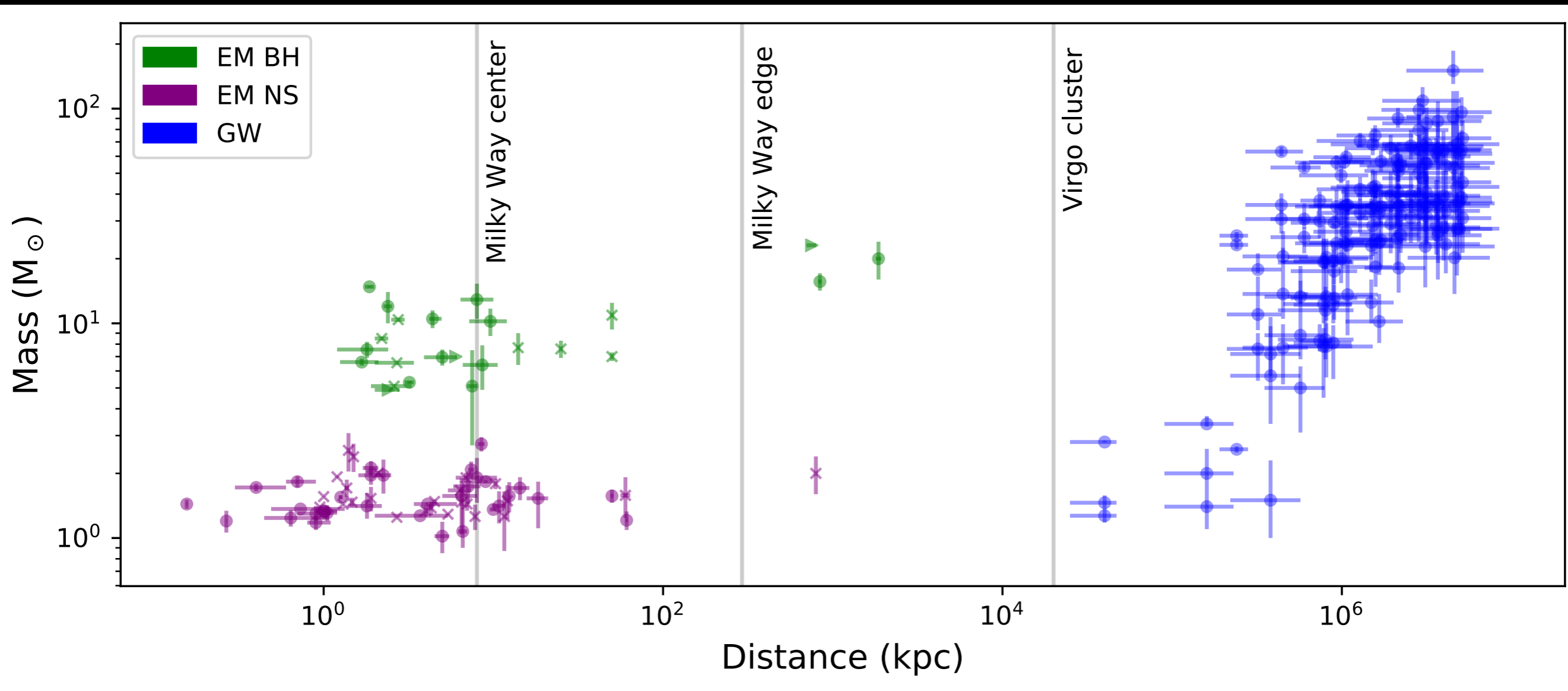
BH masses from the first half of O3

April 2019 - March 2020: Advanced LIGO and Advanced Virgo's third observing run (O3)



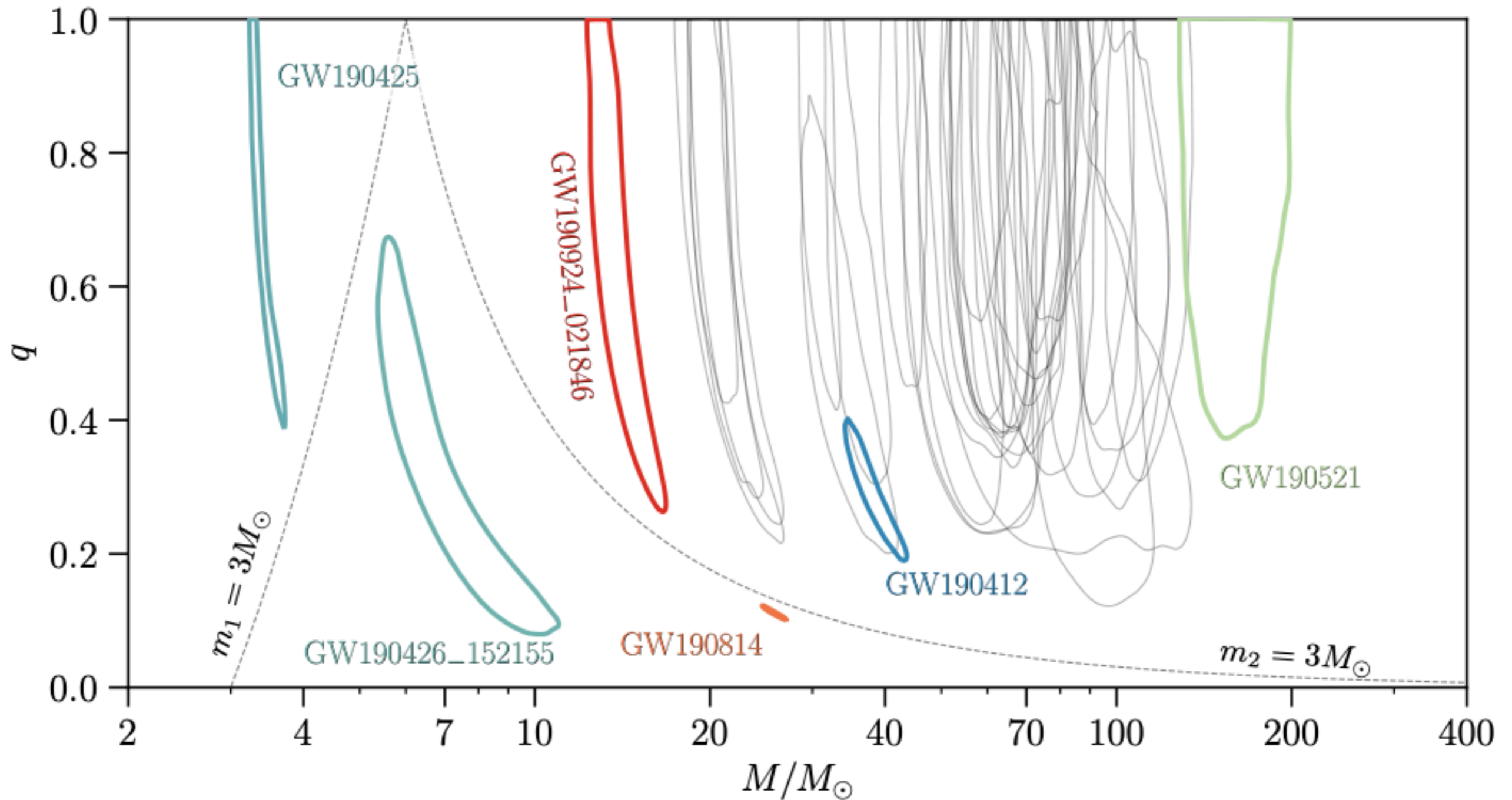
GWs and the 'stellar graveyard'

Known compact object masses vs. estimated distance



GWTC-2: estimating source properties

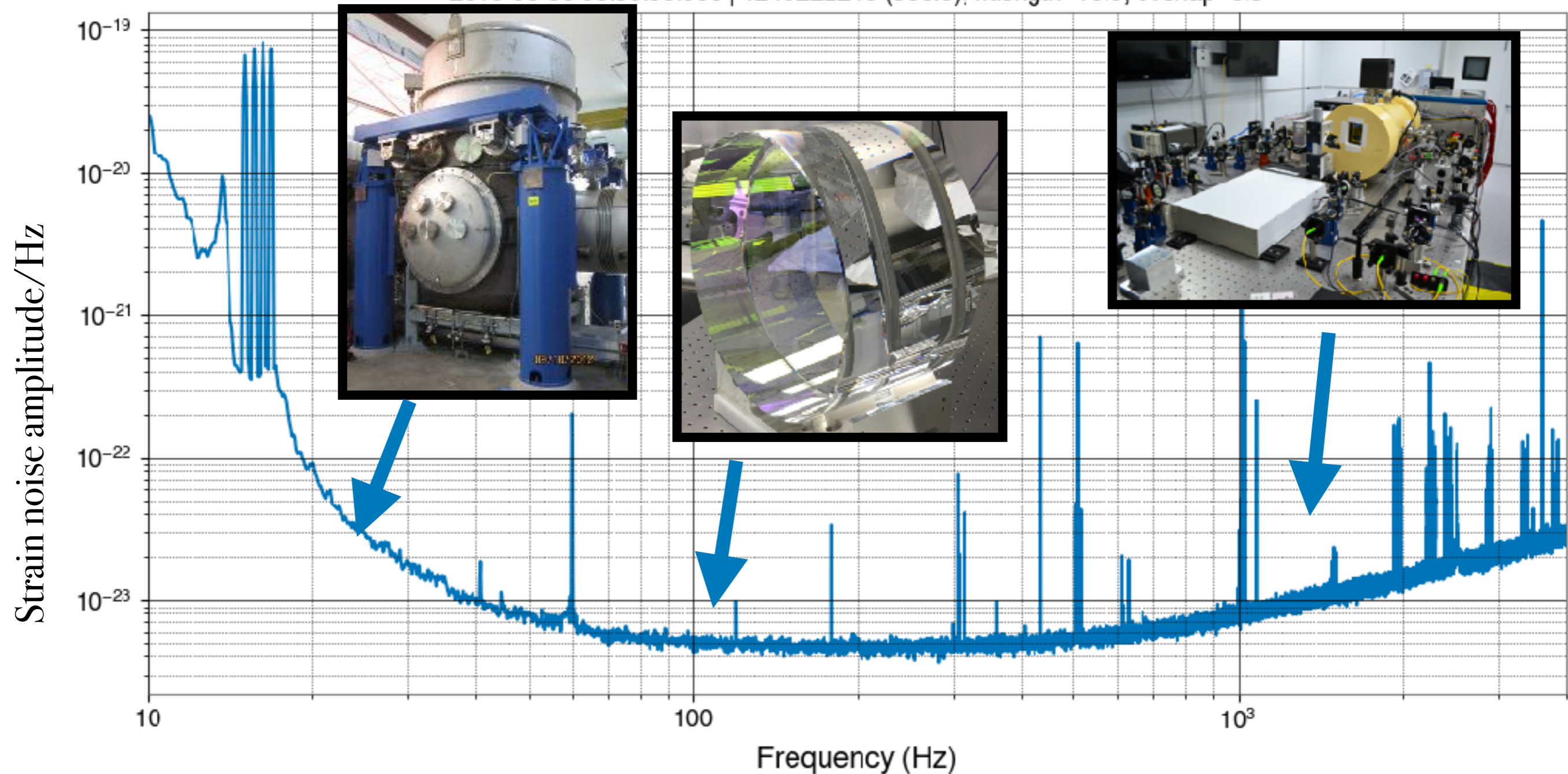
Results from LIGO-Virgo O3a: April-October 2019



Advanced LIGO noise

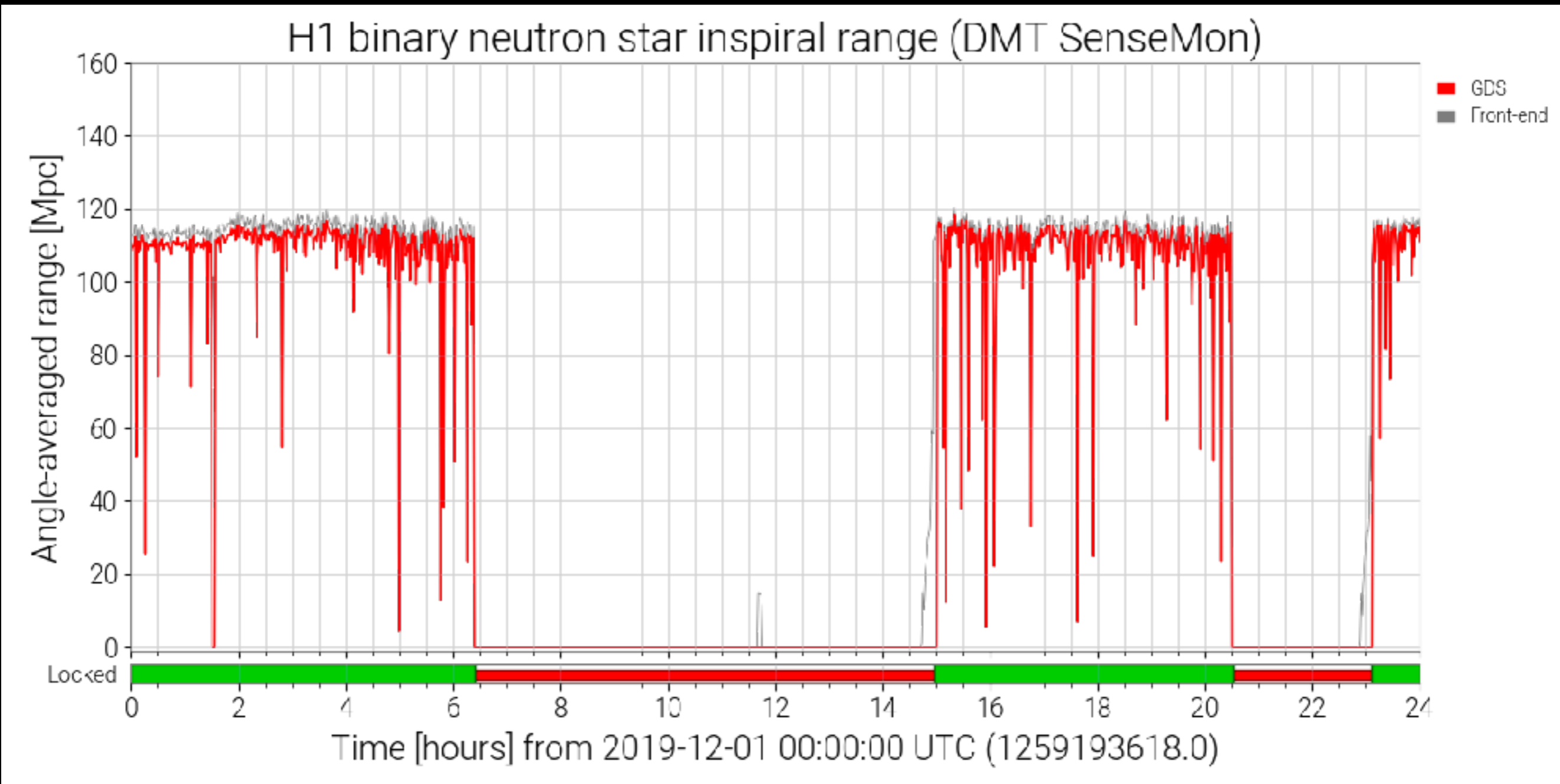
Spectrum: L1:GDS-CALIB_STRAIN,rds

2019-05-30 03:30:00.000 | 1243222218 (360.0); fftlength=10.0, overlap=0.5



Made with ligoDV web: <https://ldvw.ligo.caltech.edu/ldvw/view>

GW detector sensitivity

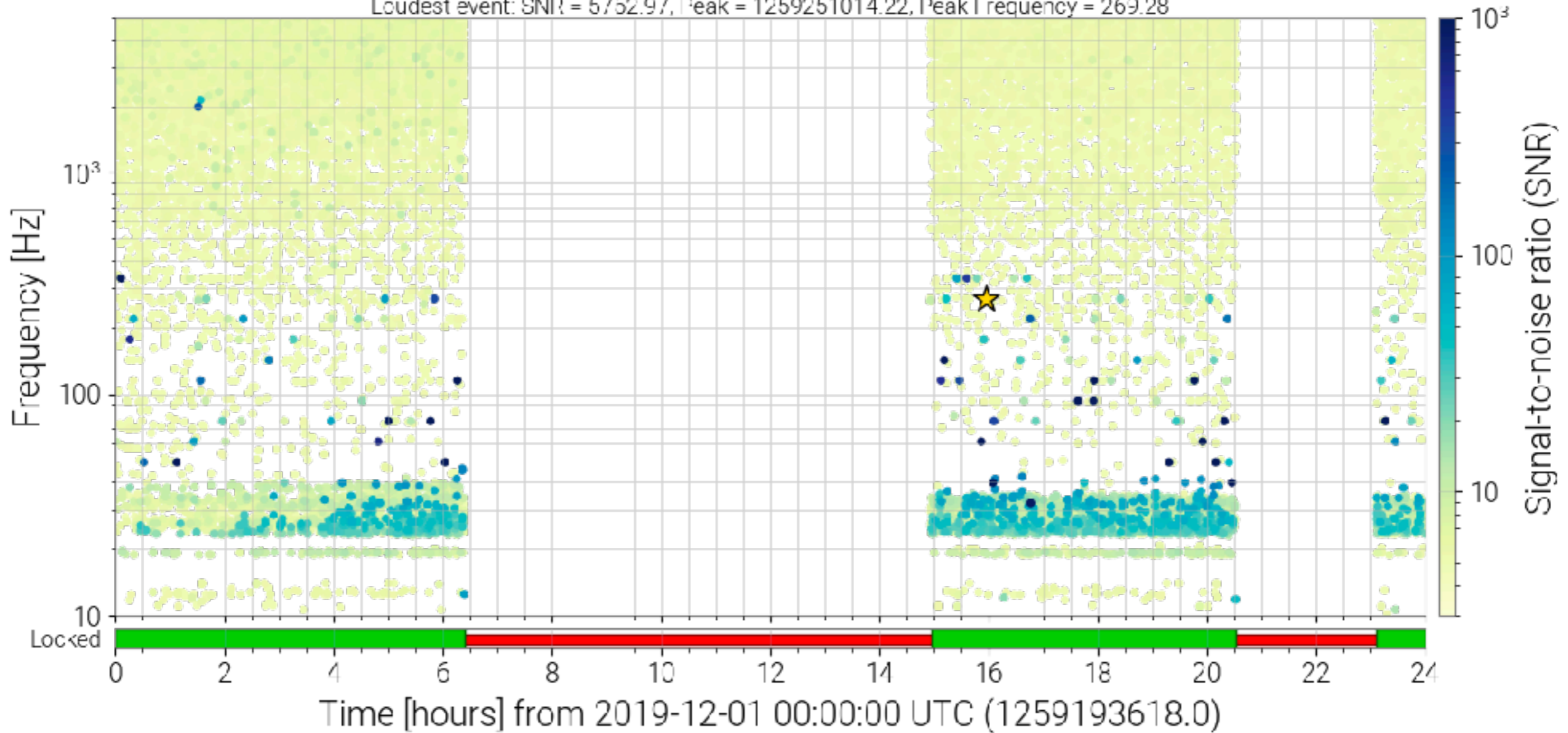


BNS inspiral range = given the PSD of the (average) noise, the distance at which we'd detect a 1.4-1.4 M_{sol} BNS with an SNR of 8, averaged over orientation and sky position angles

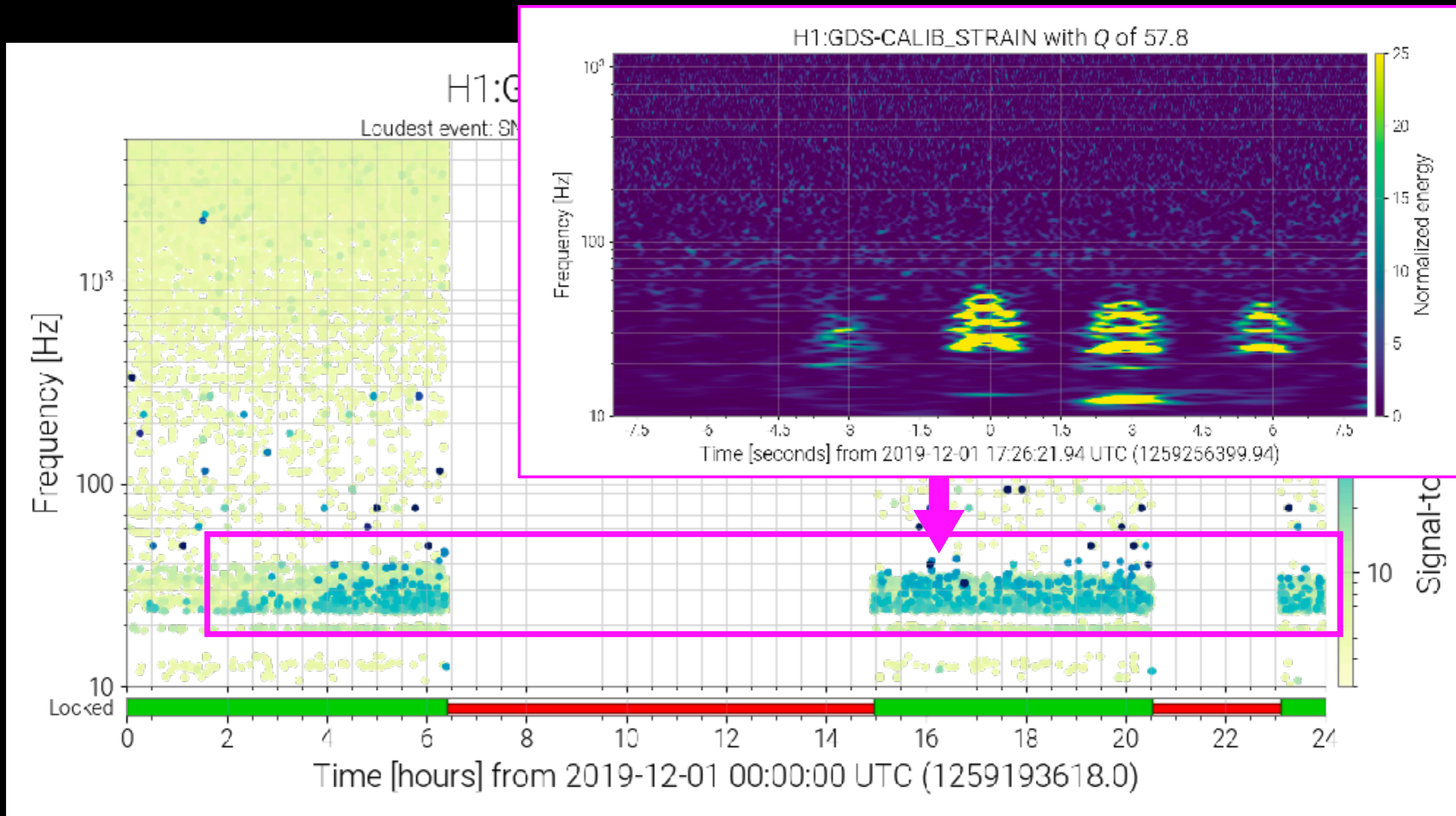
GW detector data: non-stationarity

H1:GDS-CALIB_STRAIN (omicon)

Loudest event: SNR = 5752.97, Peak = 1259251014.22, Peak Frequency = 269.28

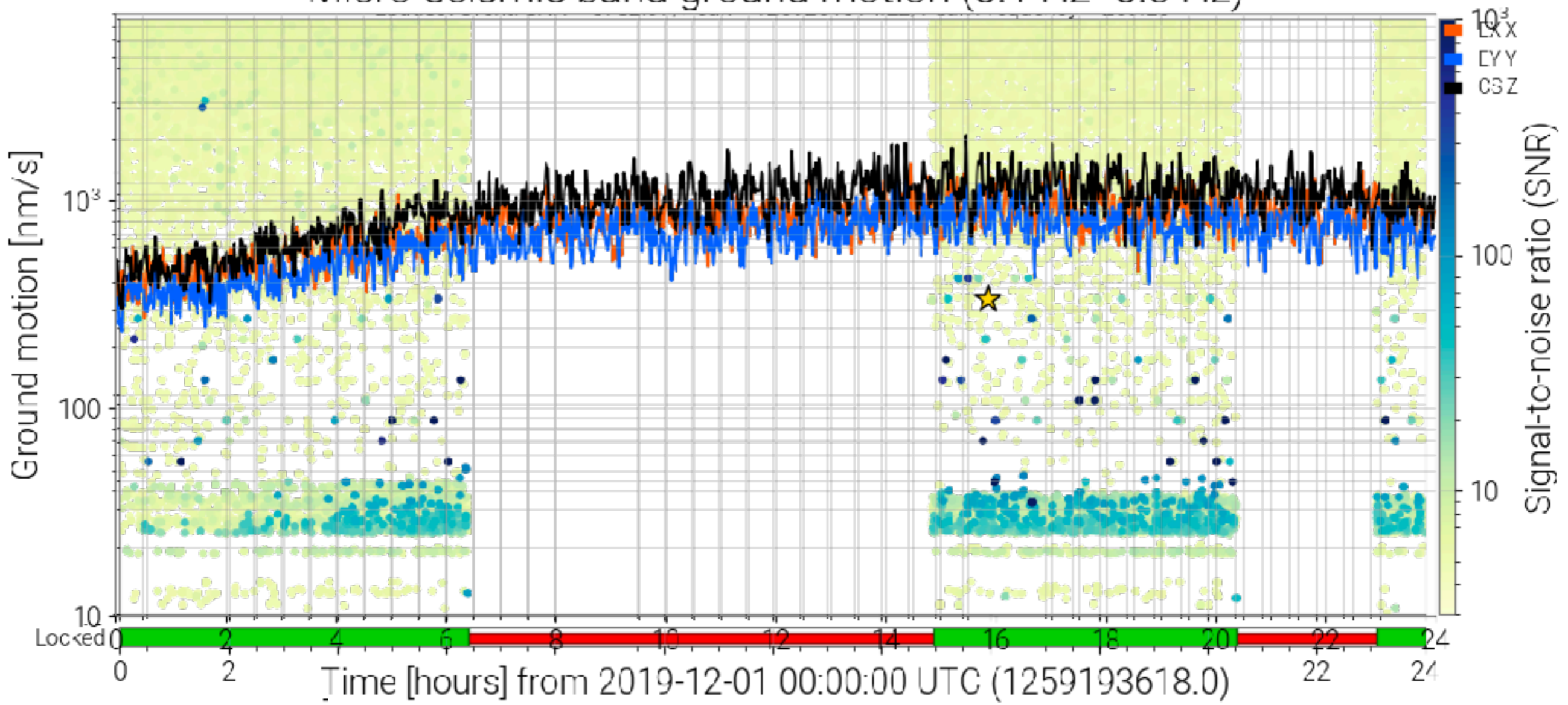


GW detector data: non-stationarity

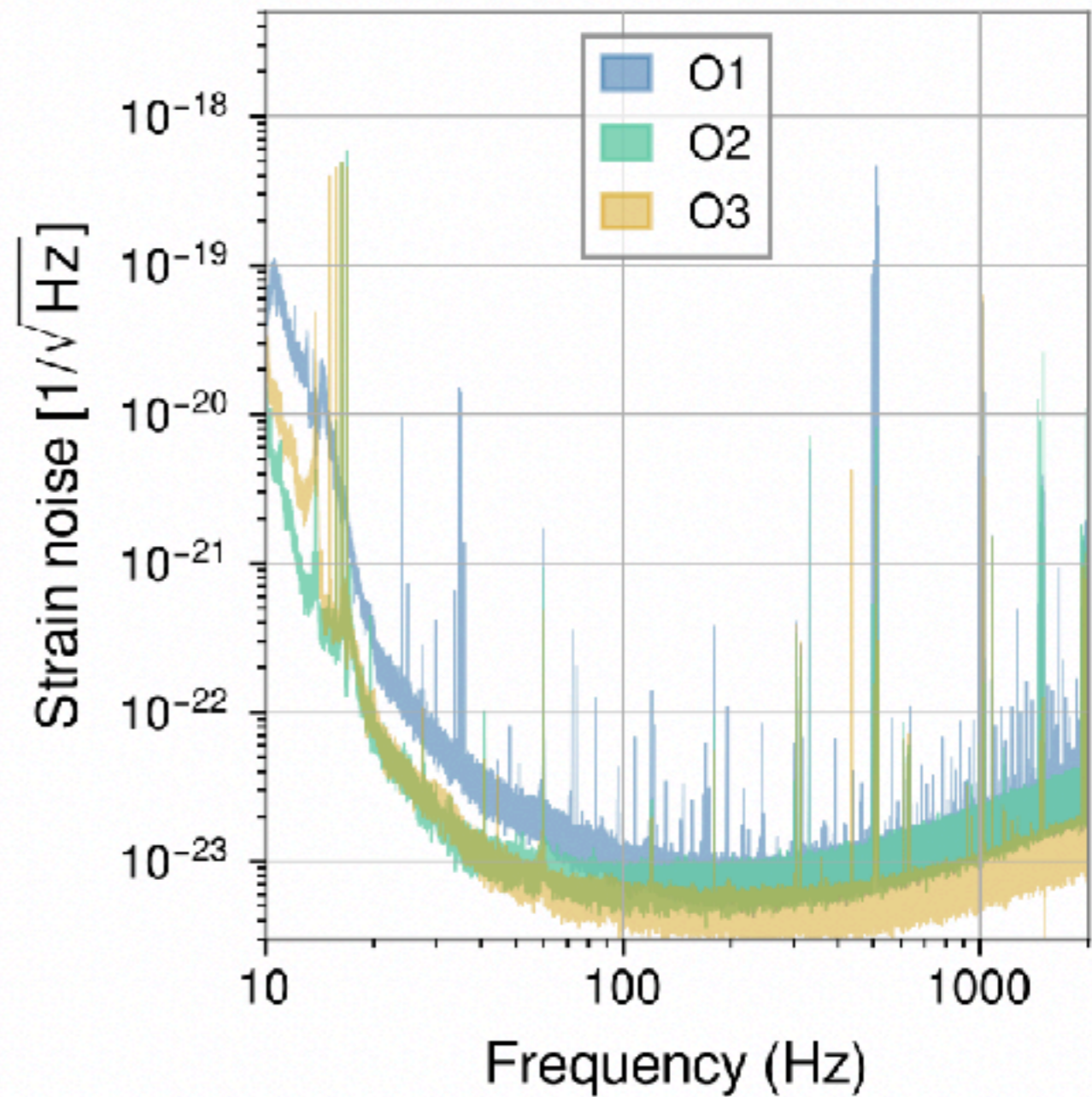
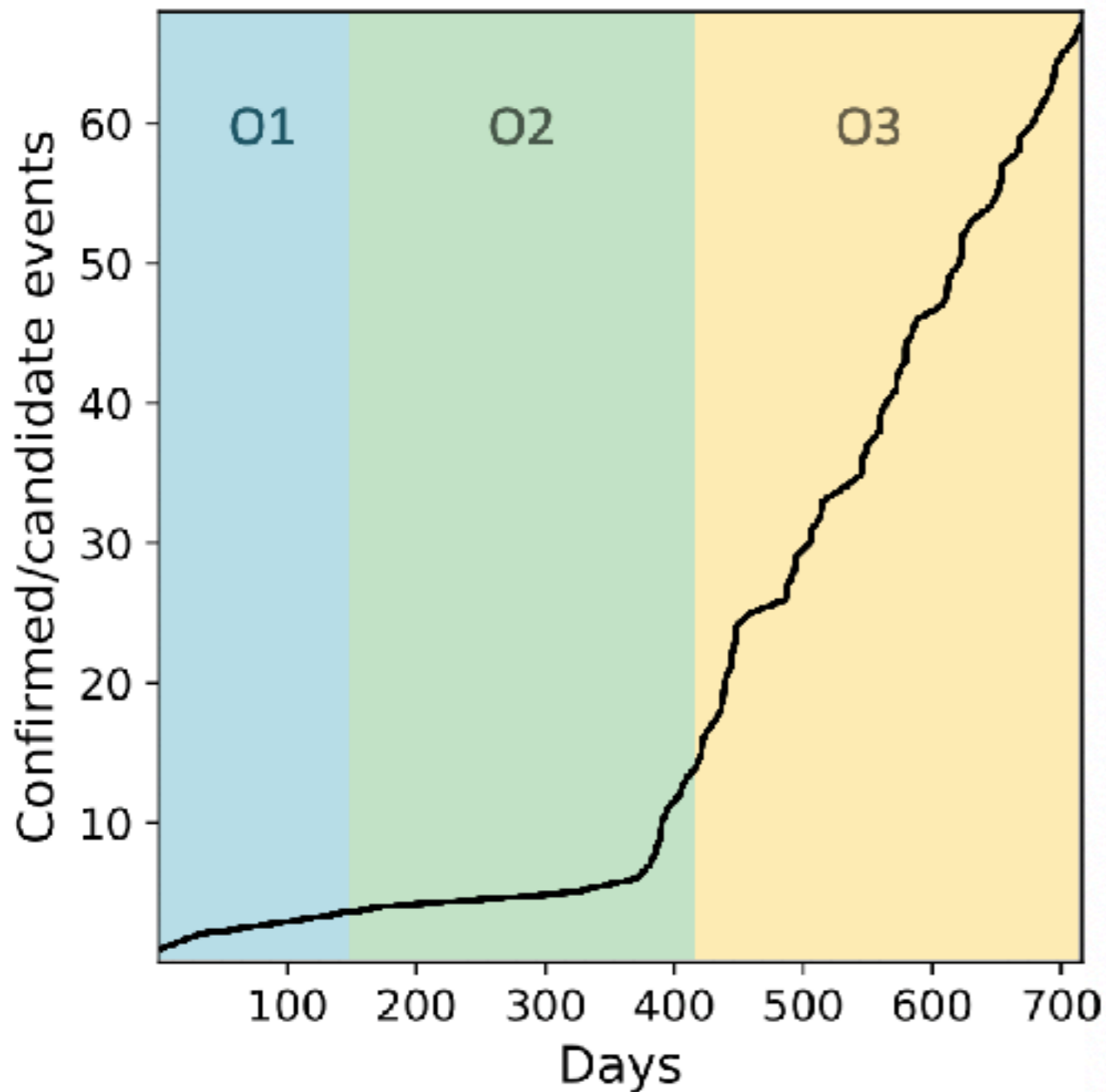


Key question: what drives non-stationarity?

Micro-seismic band ground motion (0.1 Hz--0.3 Hz)

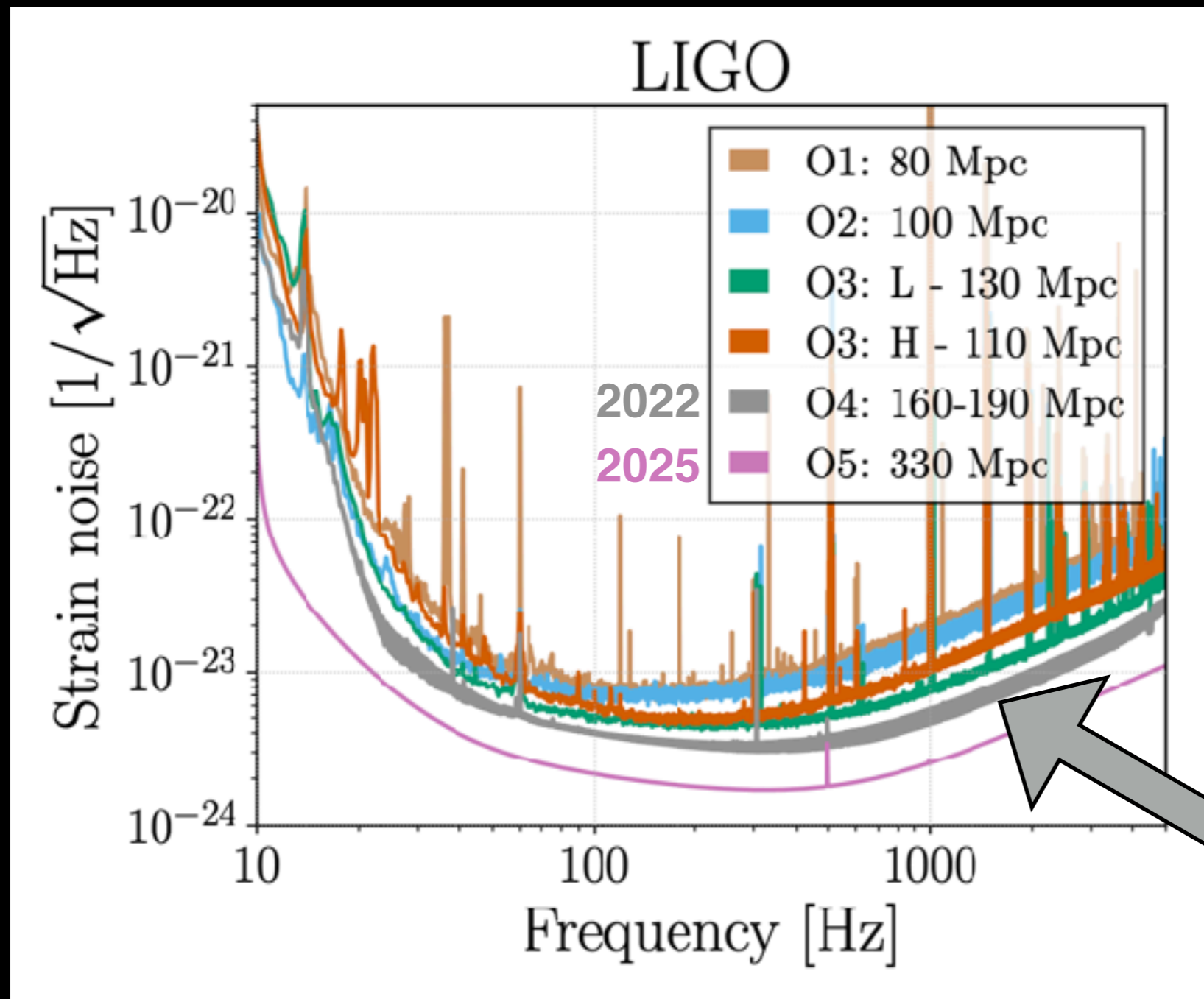


LIGO-Virgo candidate events over time



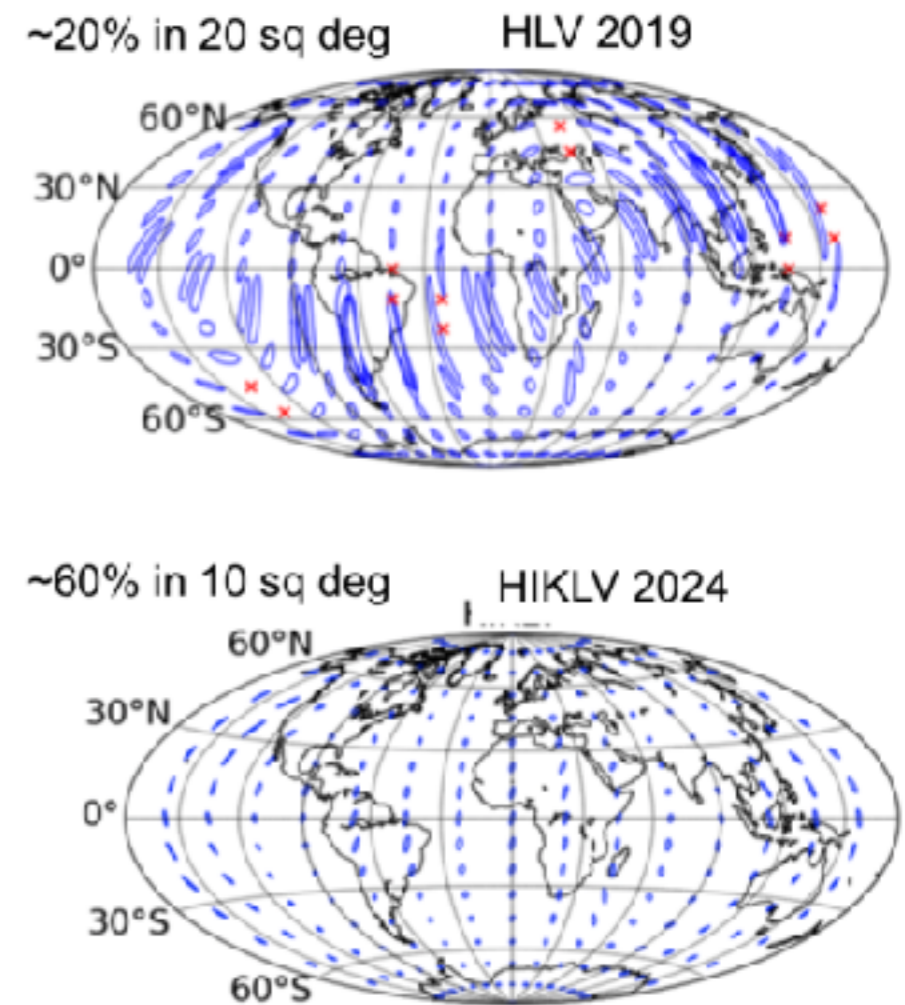
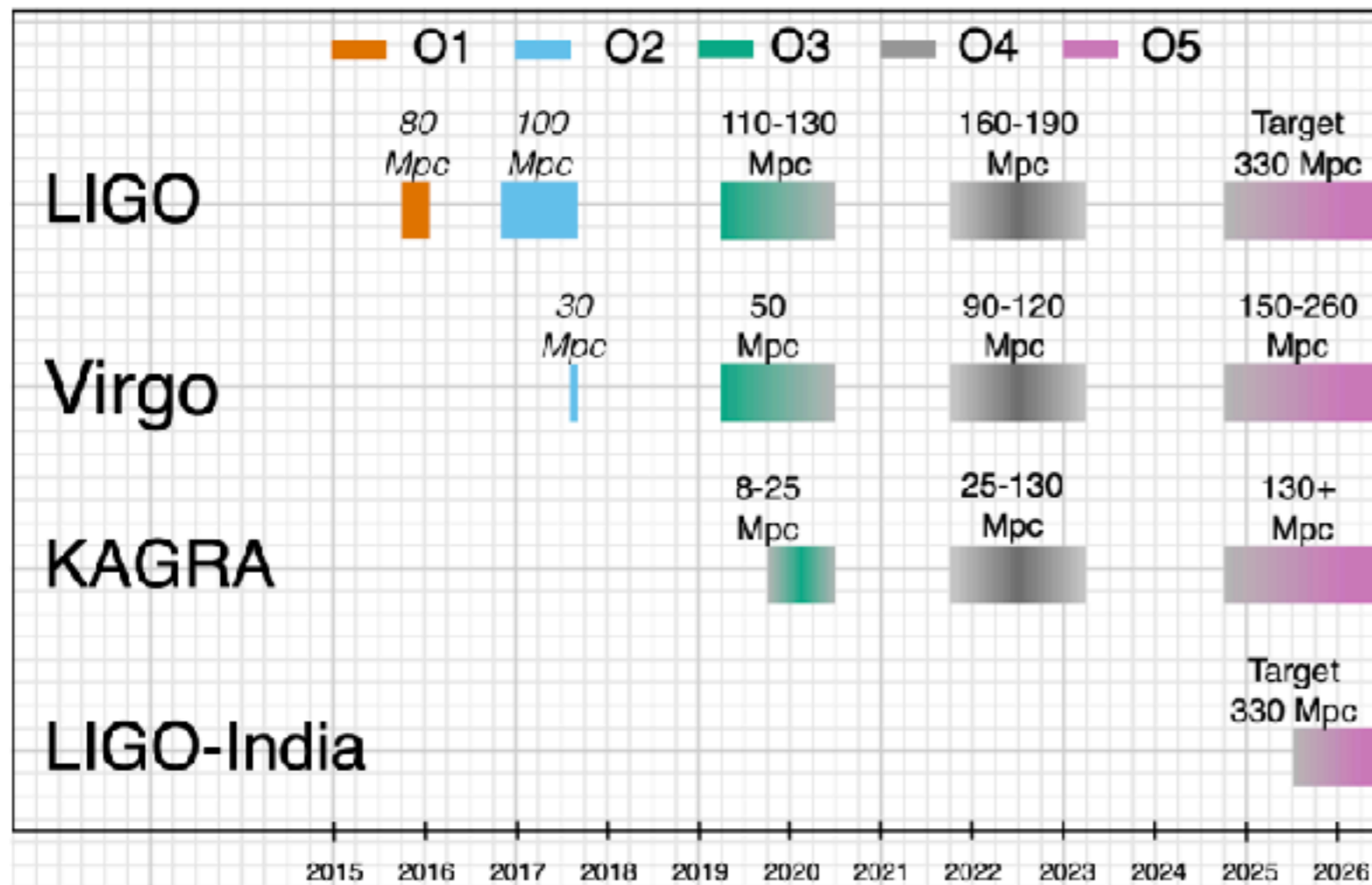
McIver and Shoemaker, in prep.

Roadmap to aLIGO design and A+

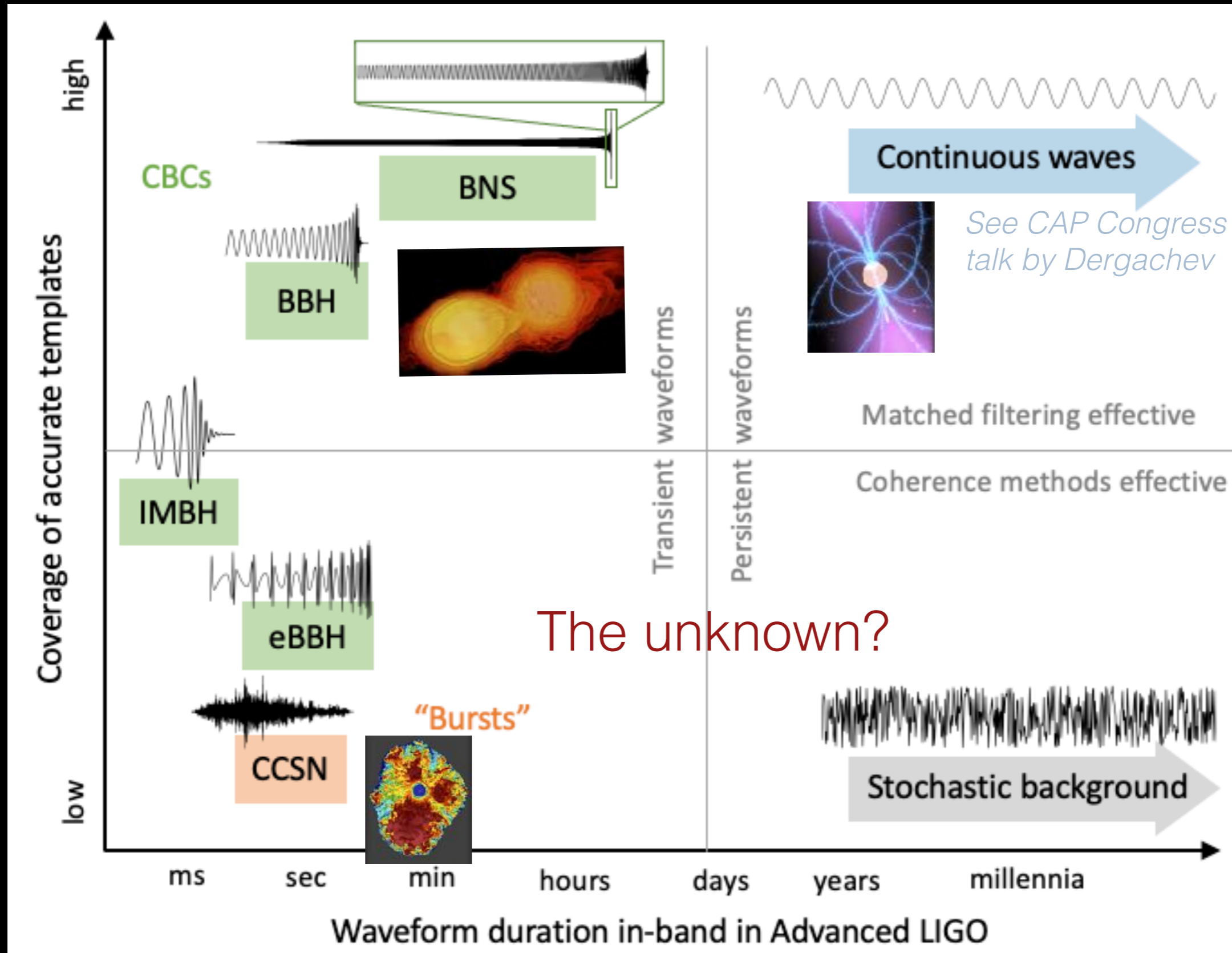


Up to **1 signal/day** at design sensitivity!

Reaching design sensitivity



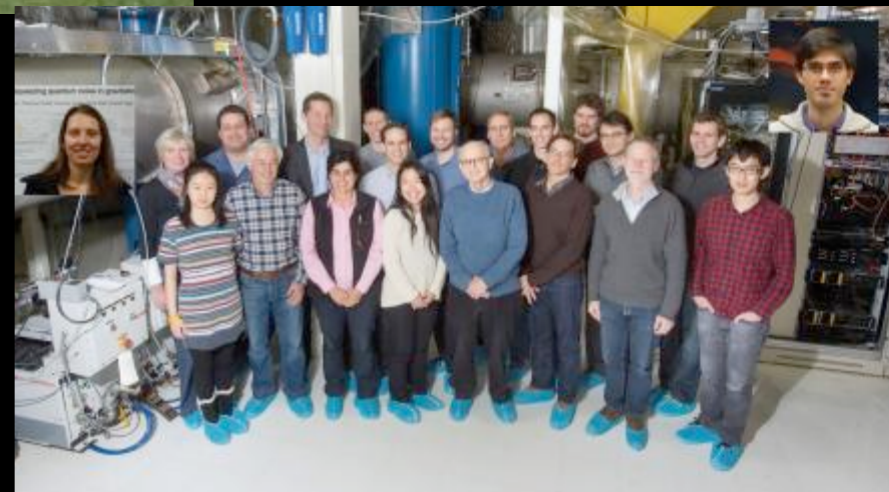
What else might we detect with current detectors?



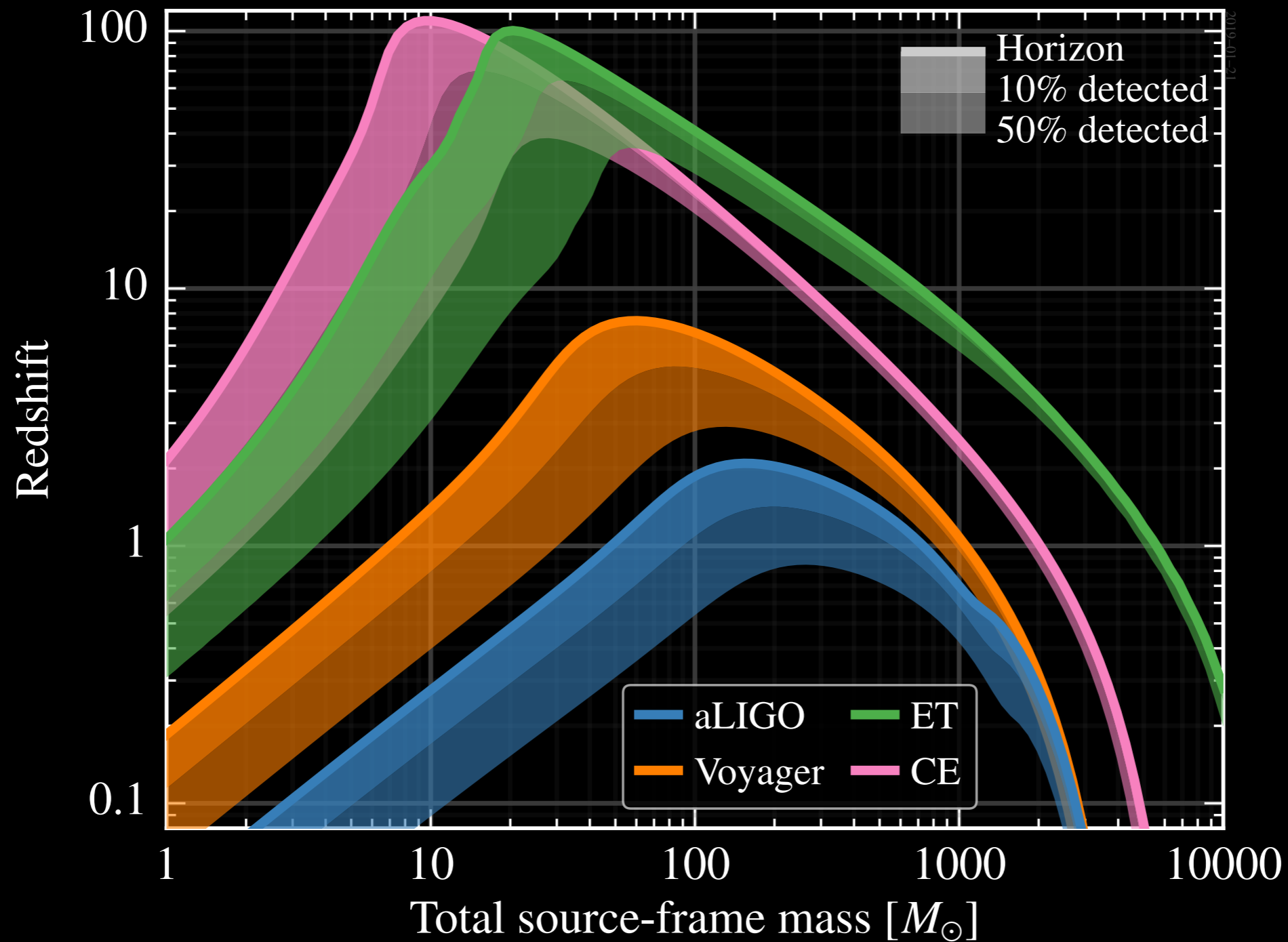
The unknown?



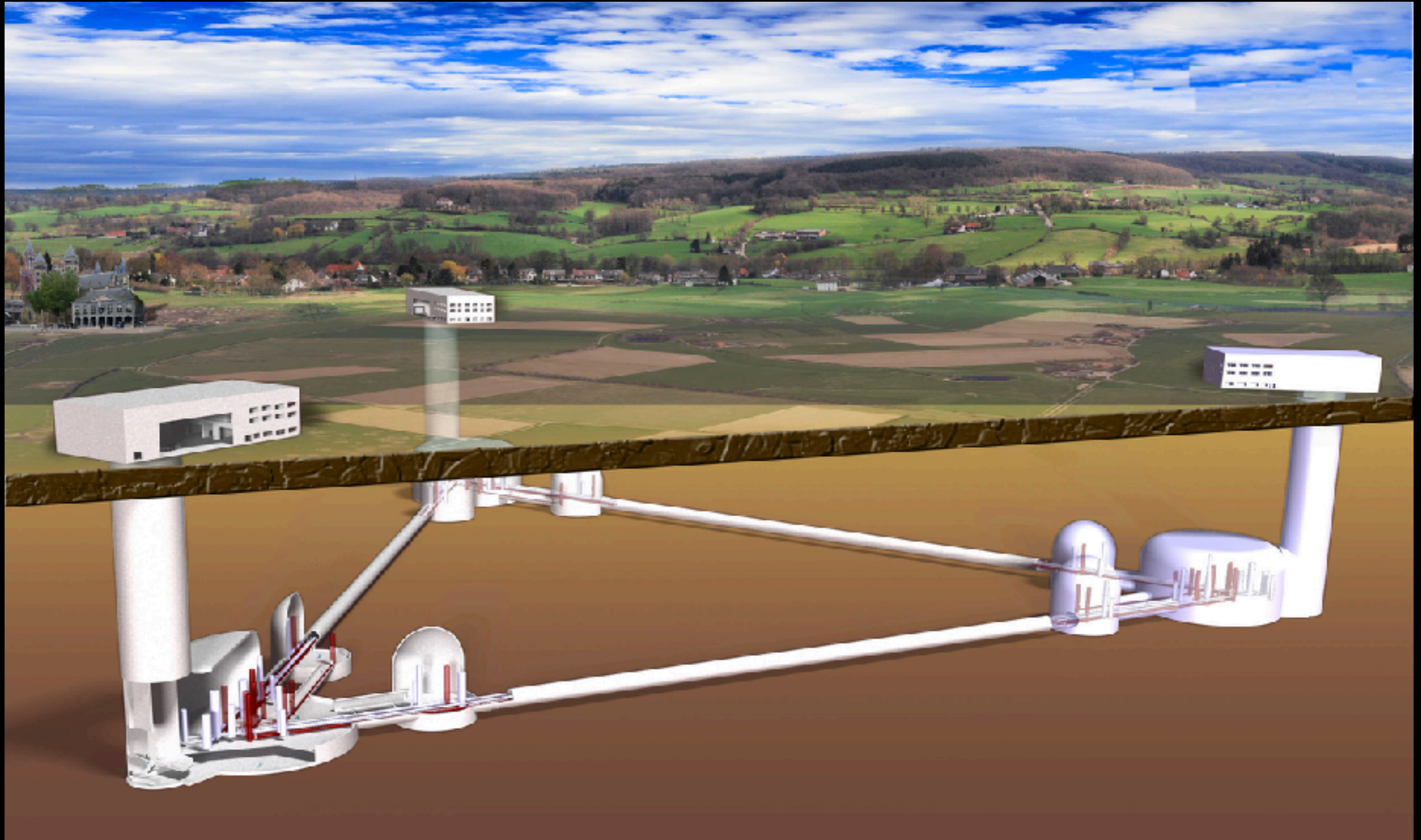
Over **1000** people from **100** institutions and **20** countries worldwide!

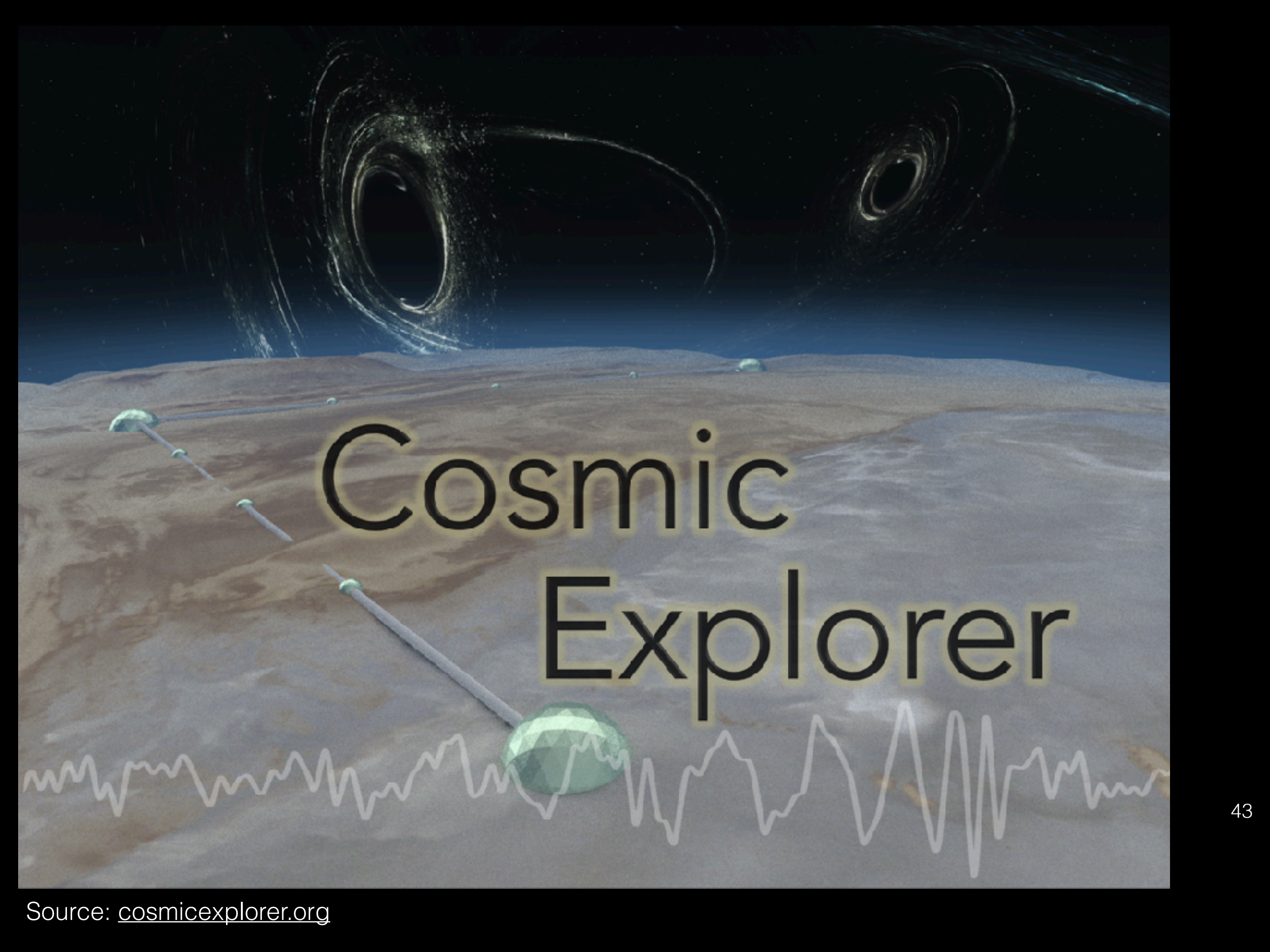


Future prospects for terrestrial gravitational wave astronomy



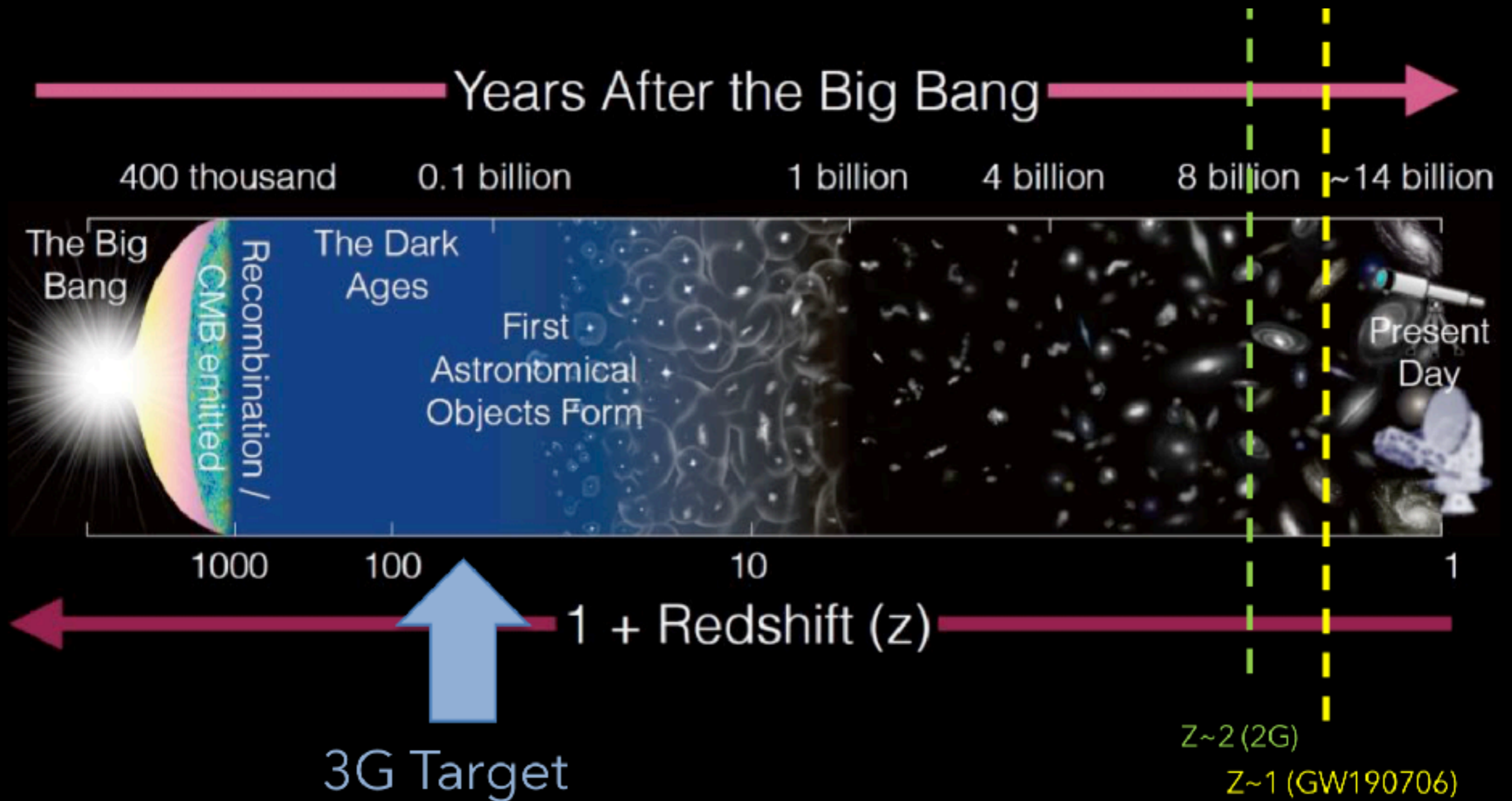
Einstein telescope



A visualization of the Cosmic Explorer gravitational wave observatory. The scene is set on the surface of the Moon, showing a network of detector arms extending across the lunar landscape. In the background, two large, glowing gravitational wells are visible against the dark sky. A white waveform representing a gravitational wave signal is overlaid at the bottom of the image.

Cosmic Explorer

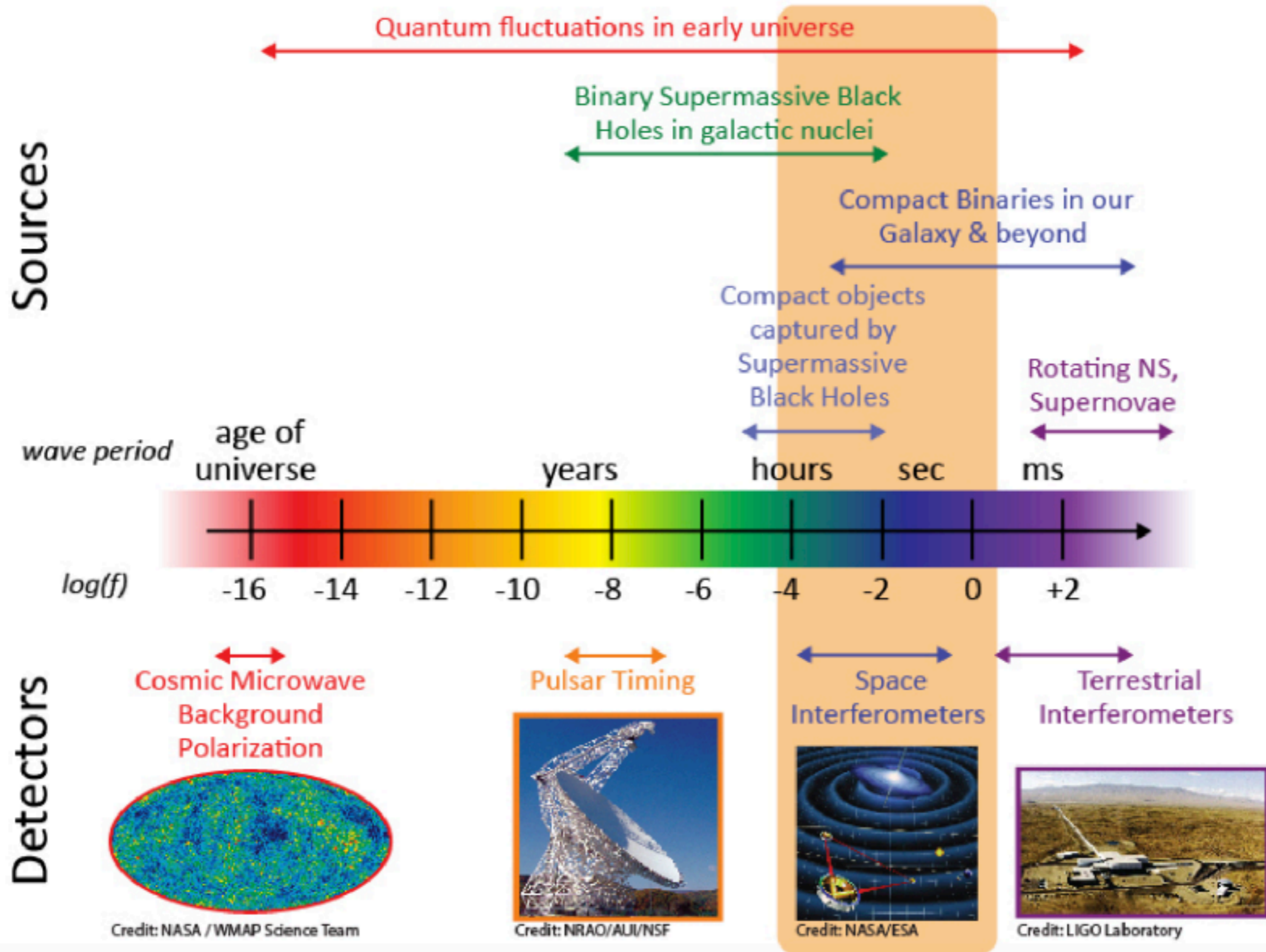




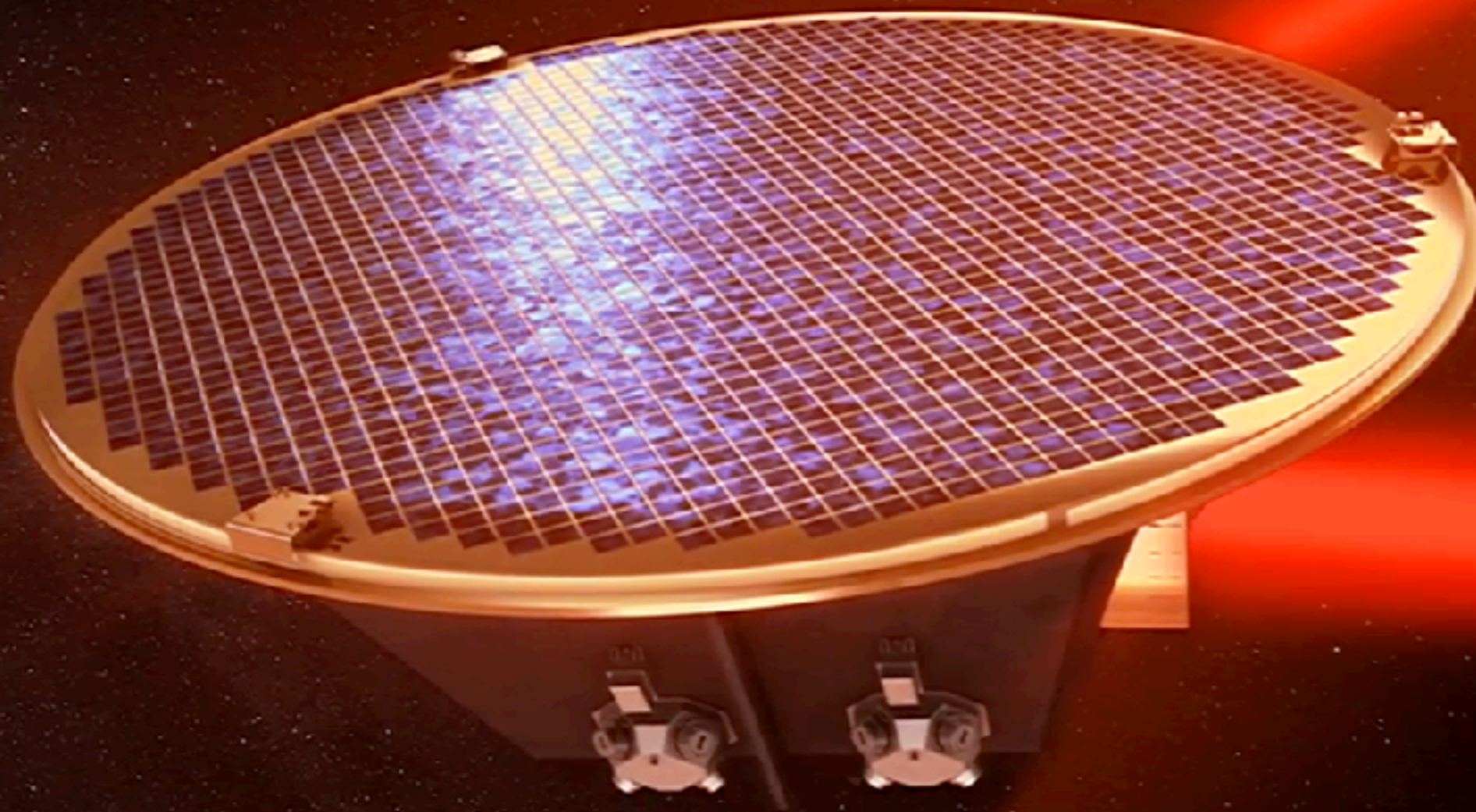
Beyond terrestrial detectors

NASA

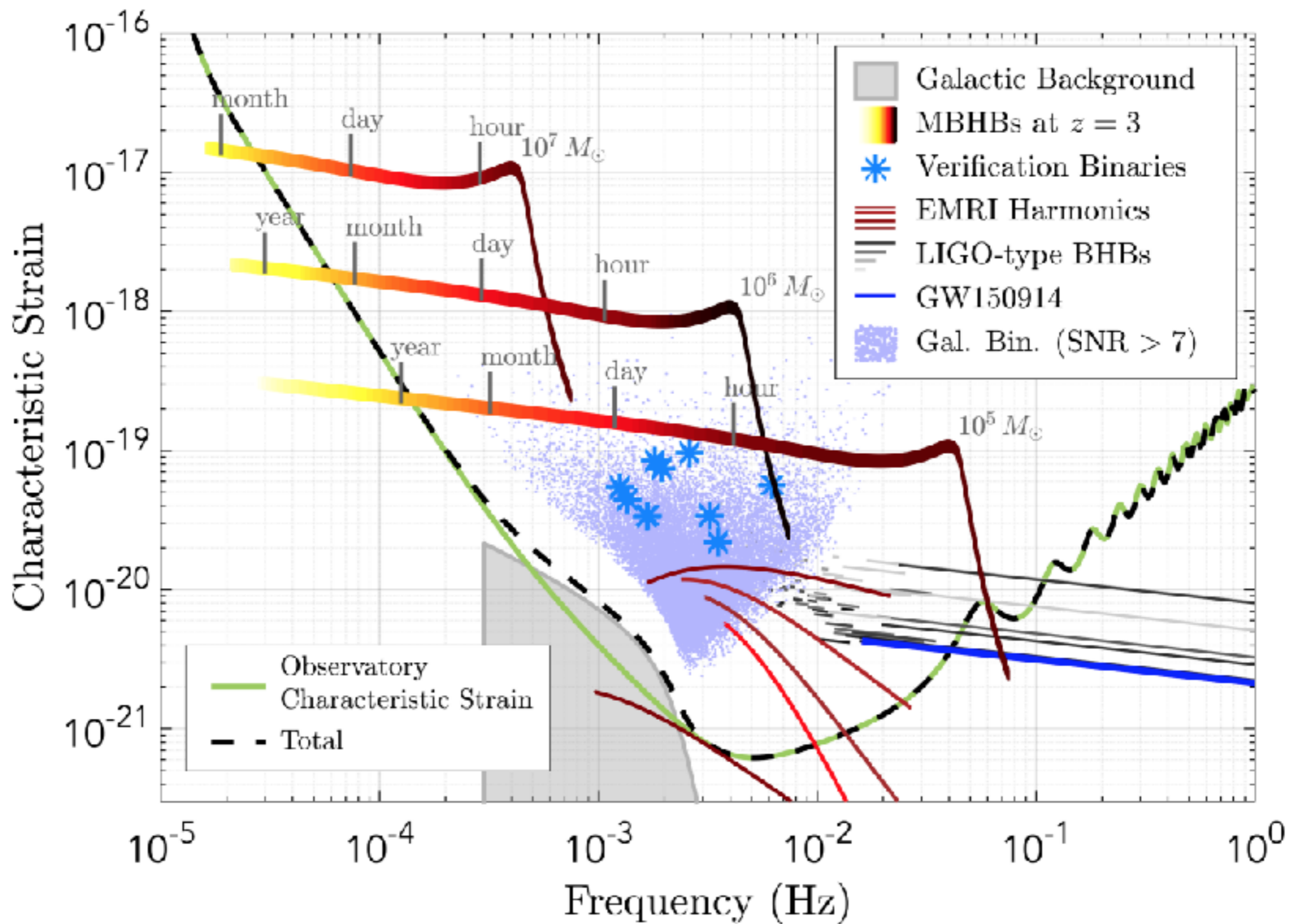
The Gravitational Wave Spectrum



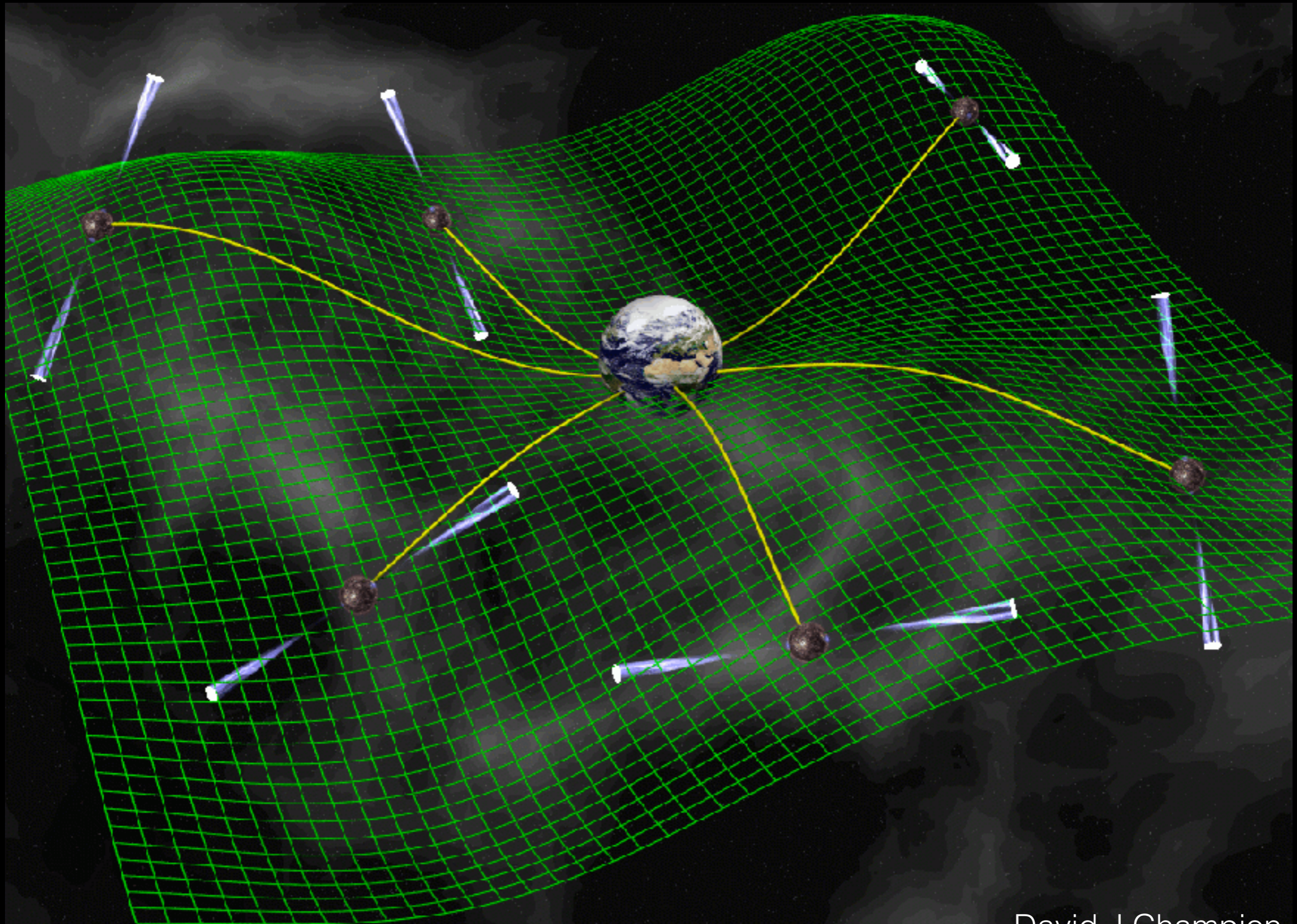
The LISA mission



LISA discovery space



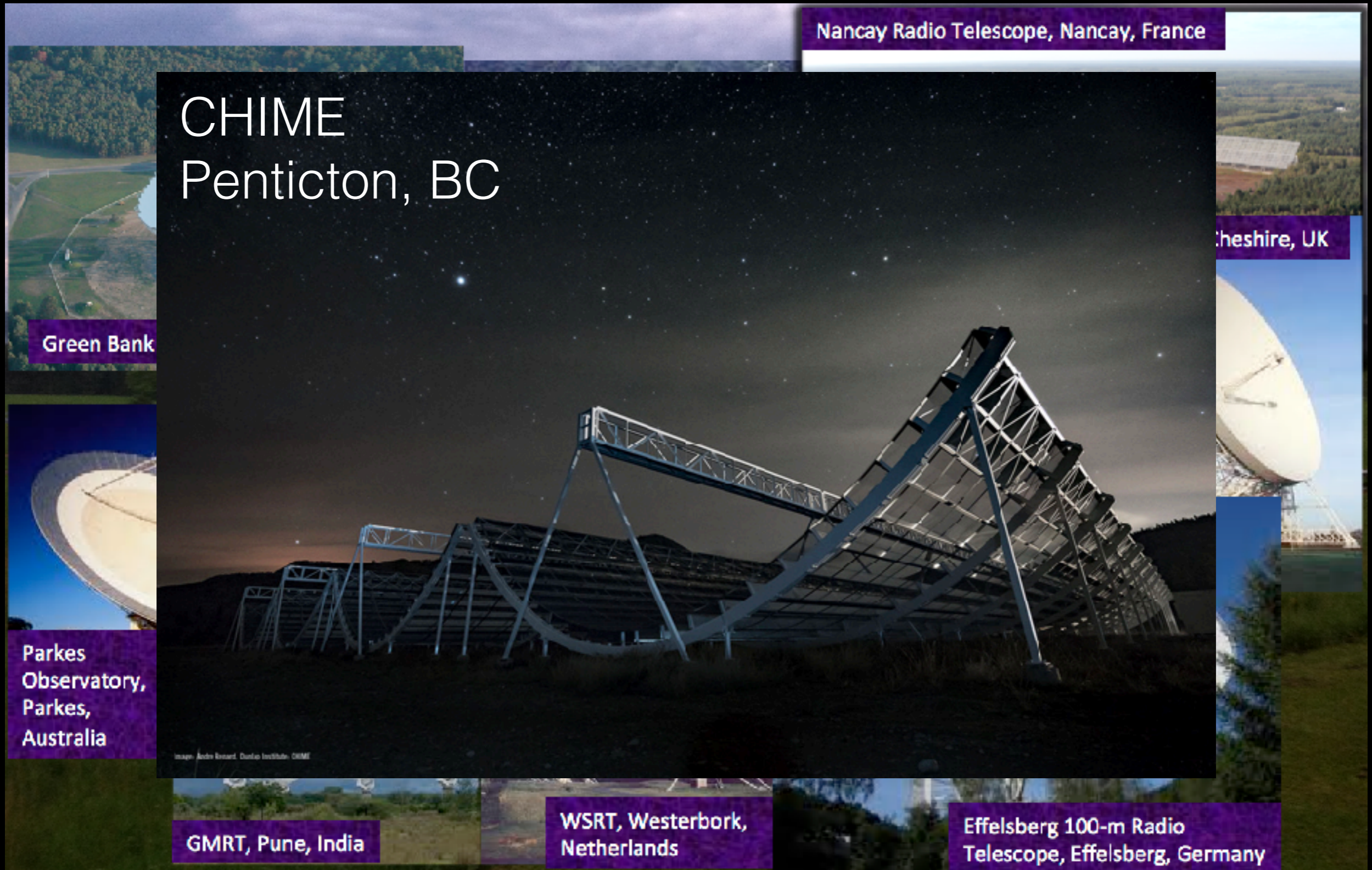
Pulsar Timing Arrays



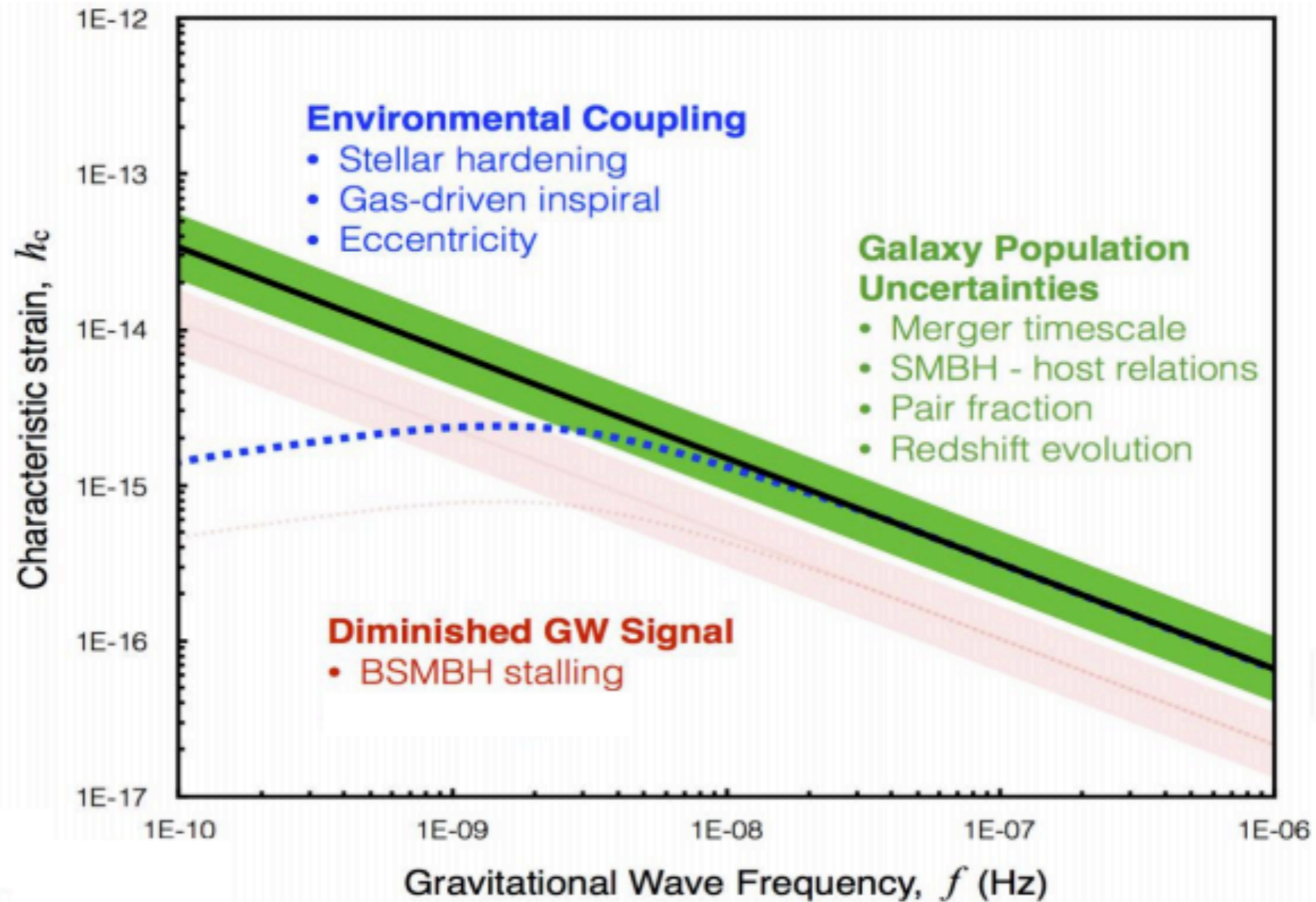
An International Radio Telescope Effort



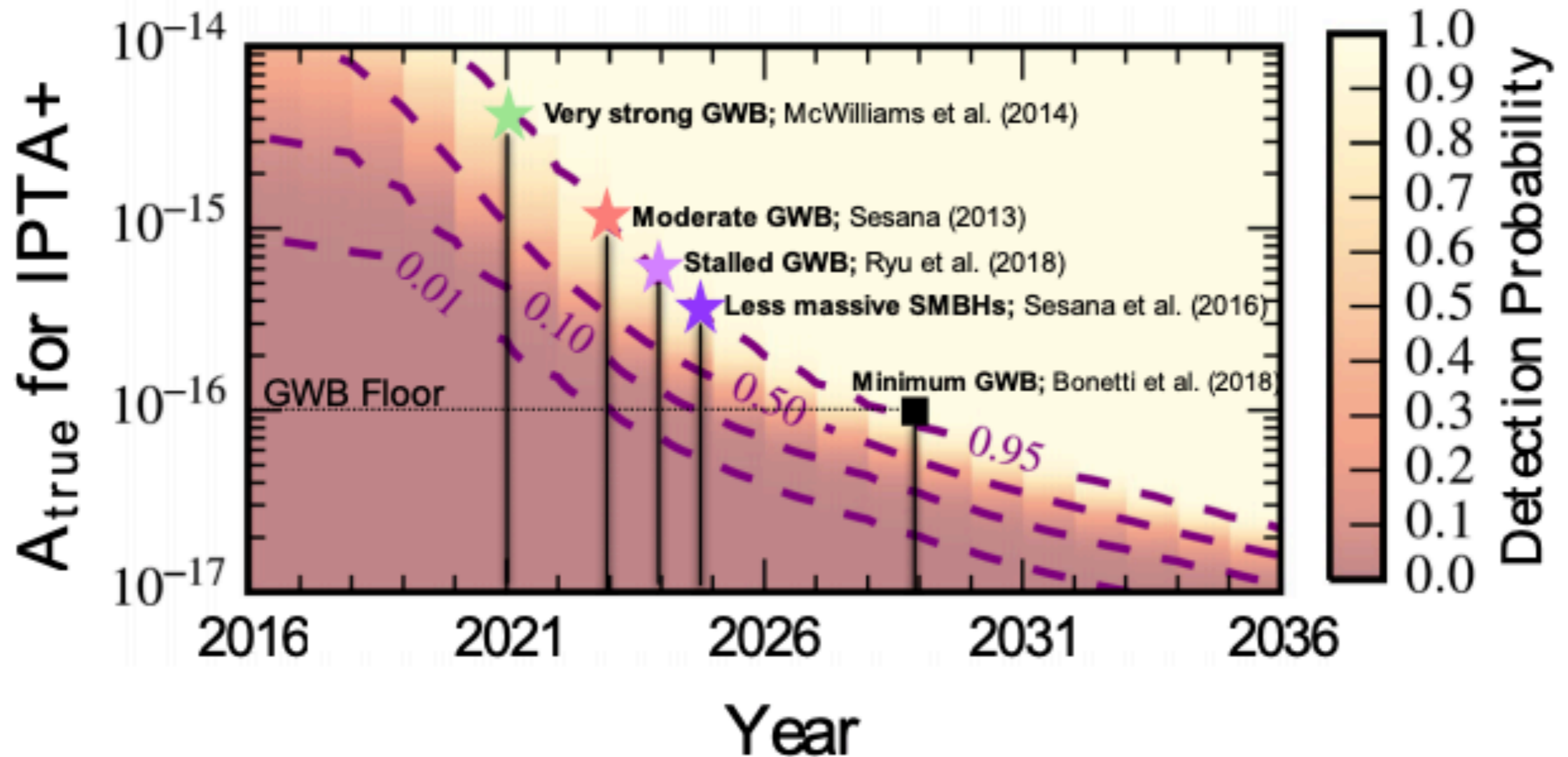
An International Radio Telescope Effort



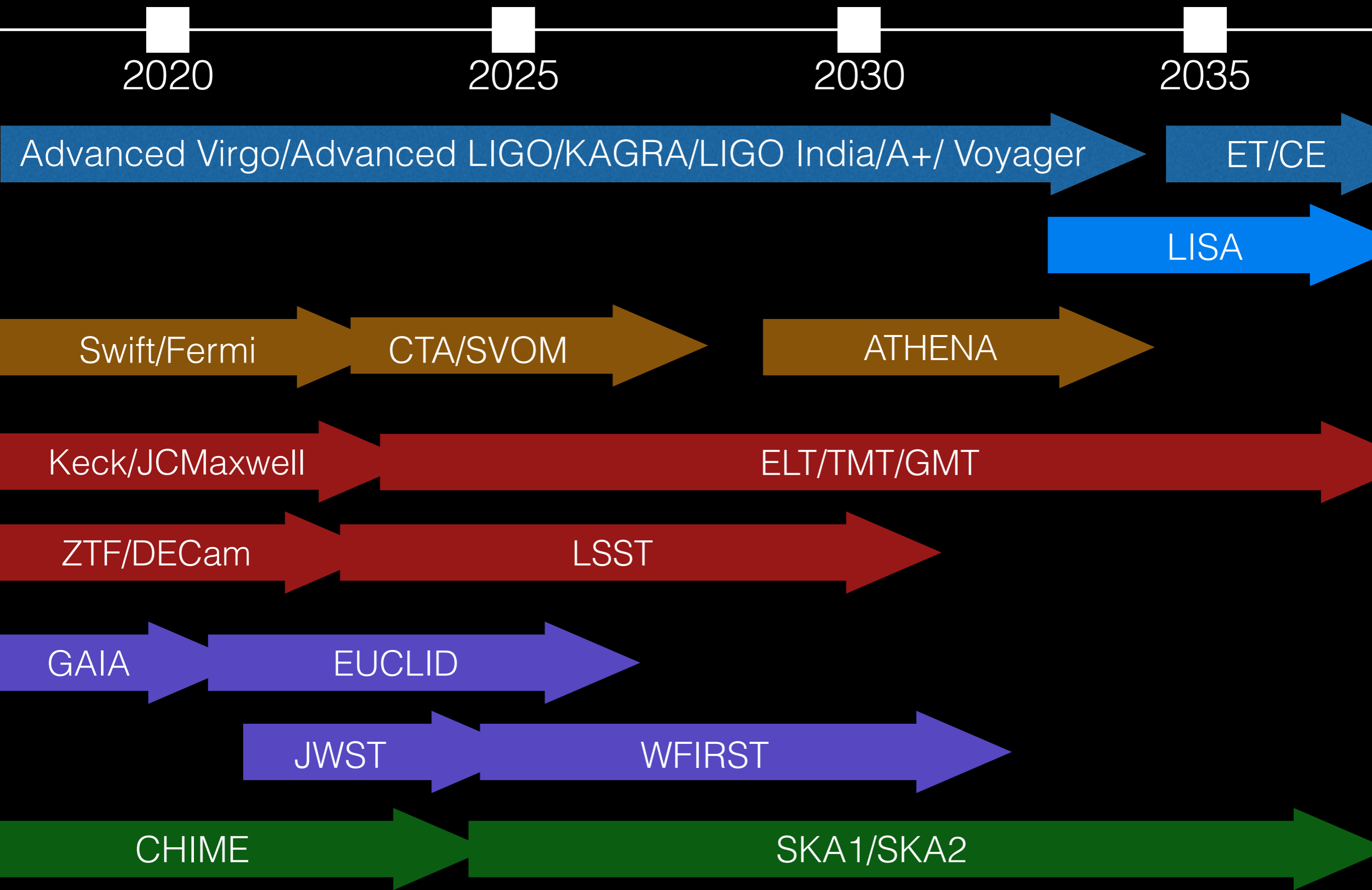
How do SMBHs get close enough to merge?



IPTA detection prospects

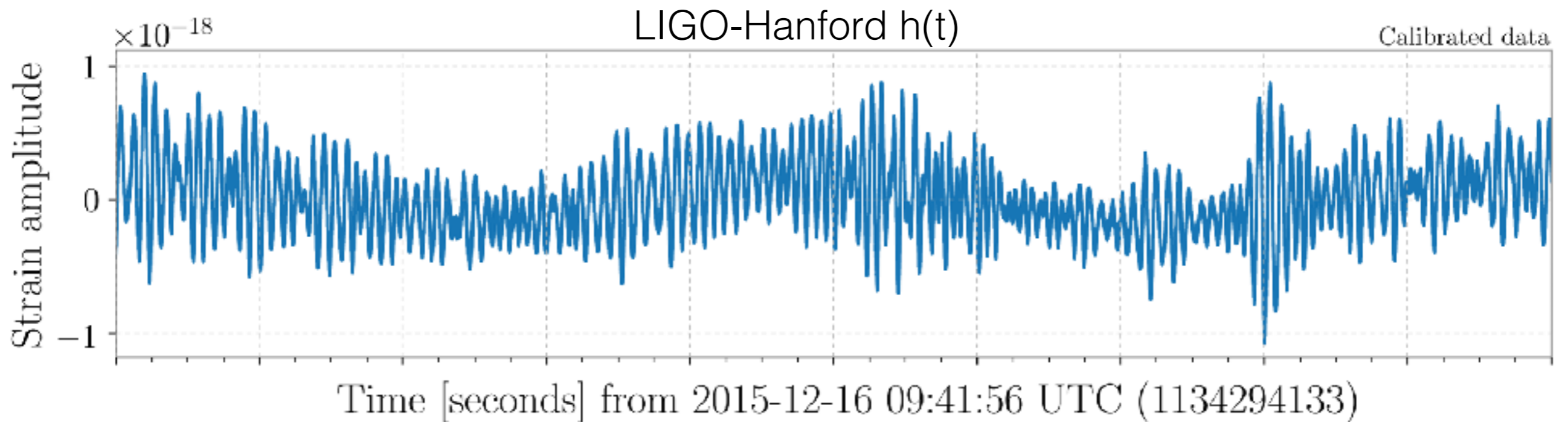


Future prospects: multi-messenger astronomy



If we have time:
Intro to GW detector data

What does GW detector data look like?



What's in a GW data file?

meta: Meta-data for the file. This is **basic information** such as the GPS times covered, which instrument, etc.

strain: Strain data from the interferometer. This is "the data", the **main measurement of spacetime strain** recorded by the LIGO detectors.

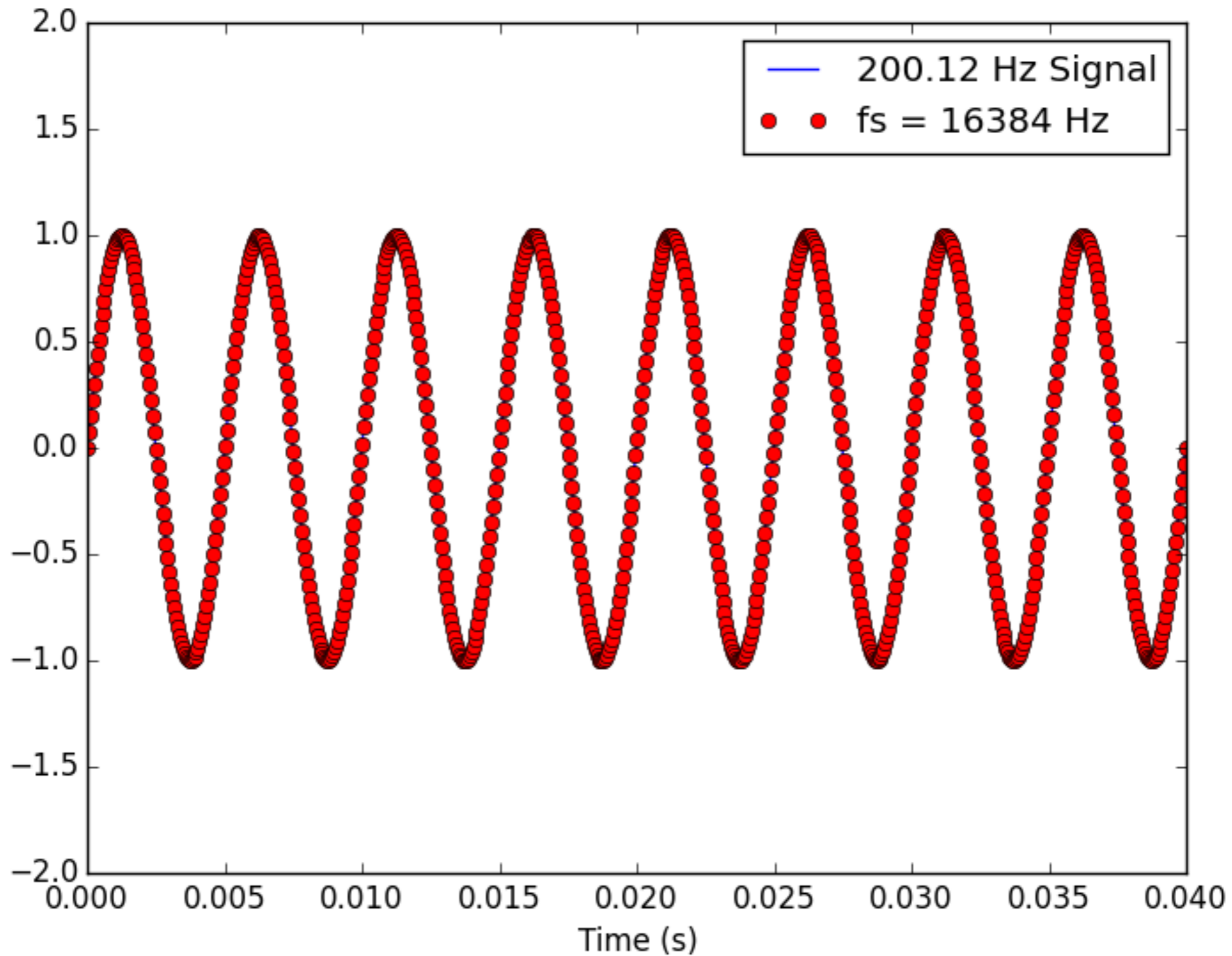
quality: A 1 Hz time series describing the **data quality** for each second of data.

$h(t)$ **sampling rate** for LIGO detectors: 16384 Hz

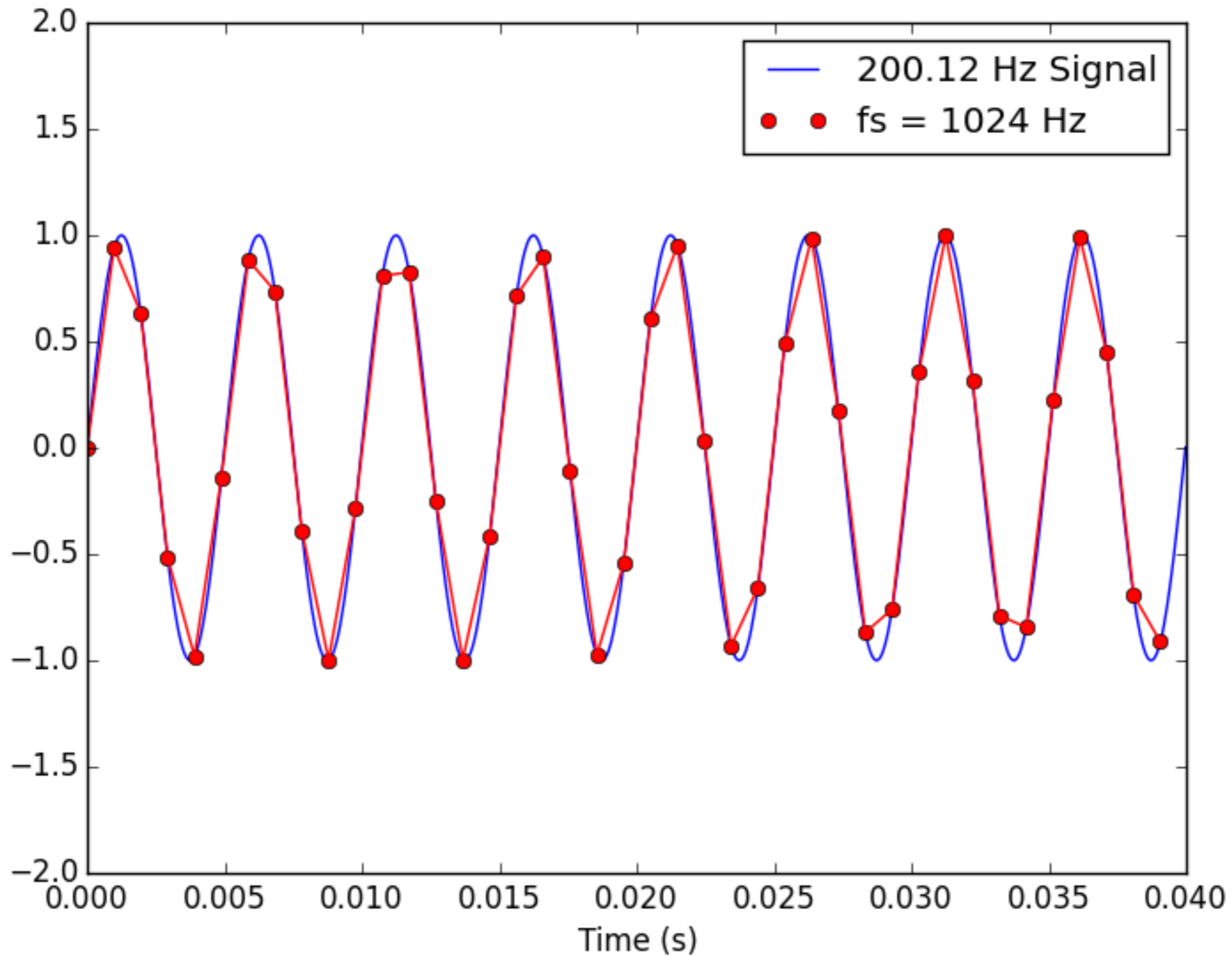
Open data: 4096 Hz and 16384 Hz

Why do we care about sampling rate, f_s ?

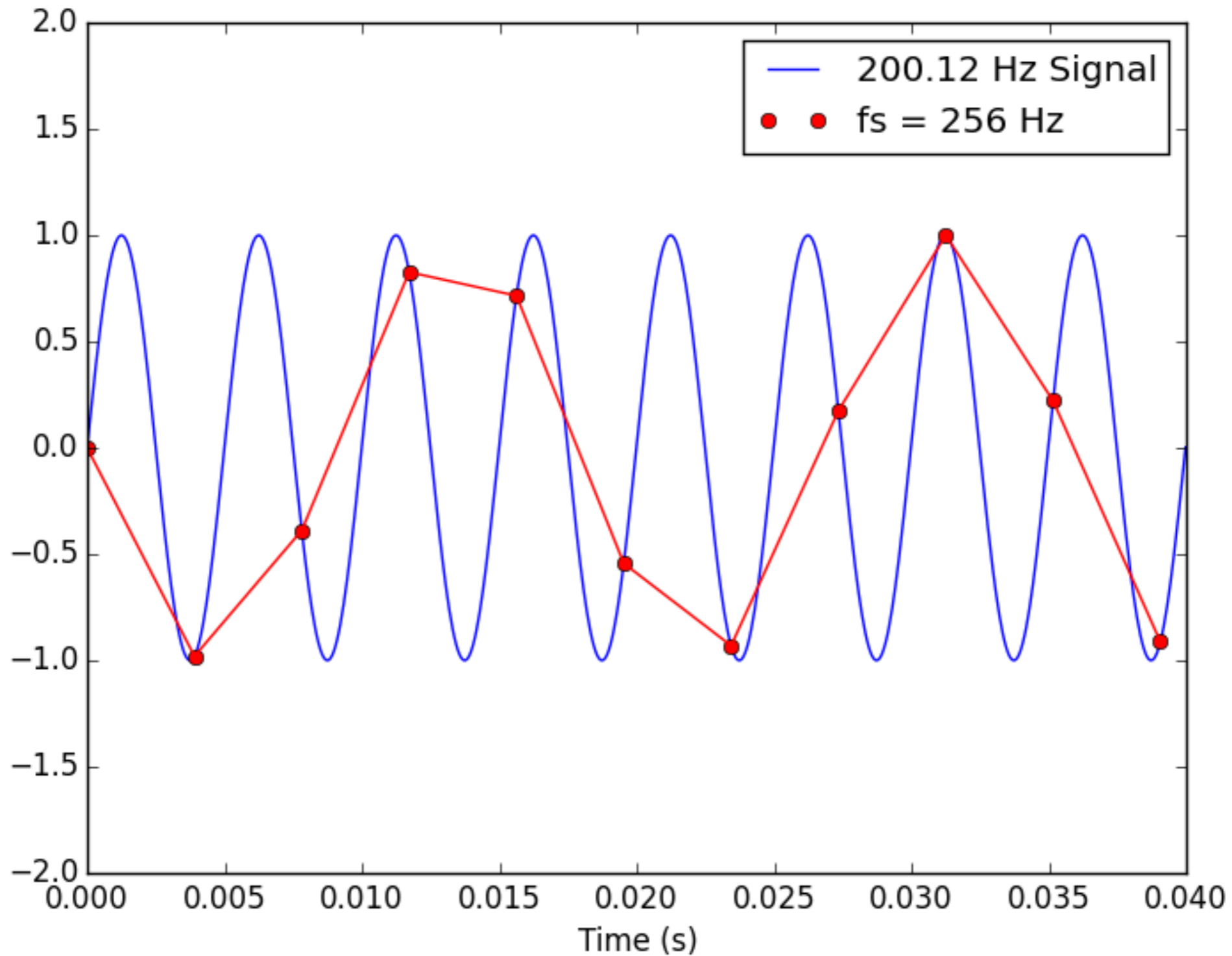
Discrete Time Samples



Discrete Time Samples



Discrete Time Samples



Nyquist Frequency

- Nyquist Frequency = $\frac{f_s}{2}$
- Data can only accurately represent frequency content below the *Nyquist frequency*
- Higher frequency signals will be lost or “aliased” to lower frequencies

Introduction to GWpy

A python package for gravitational-wave astrophysics

<https://gwpy.github.io>

Heavily dependent on numpy, scipy, astropy, matplotlib

Provides intuitive object-orientated methods to access GW detector data, process, and visualize them

Not specific to GW data other than data access routines

GWpy Quickstart

Import the class that represents the data you want to study

```
>>> from gwpy.timeseries import TimeSeries
```

Fetch some open data from the OSC

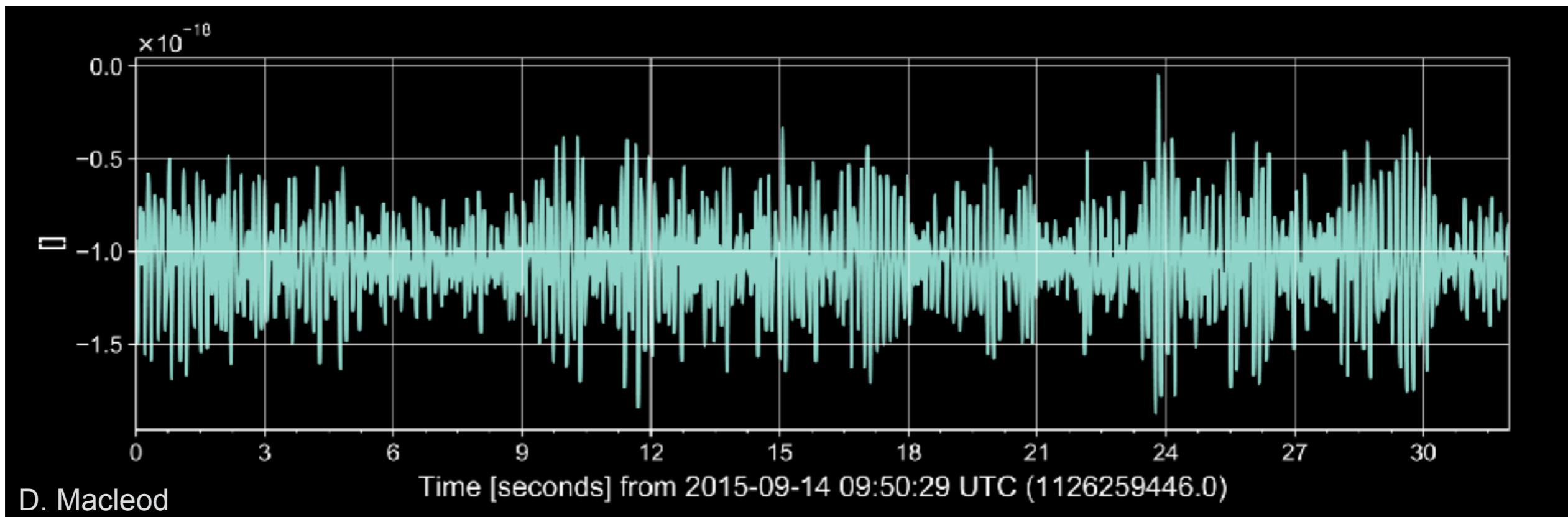
```
>>> data = TimeSeries.fetch_open_data('L1', 'Sep 14 2015 09:50:29', 'Sep 14 2015 09:51:01')
```

Make a plot

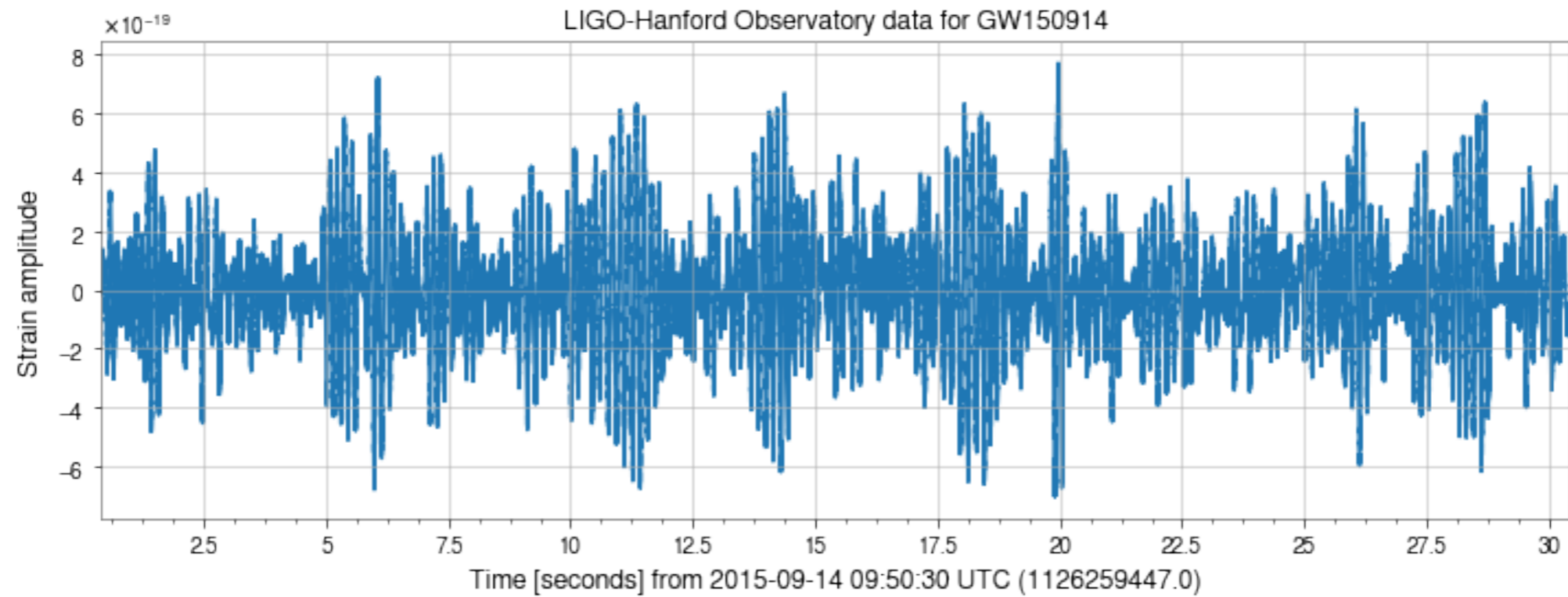
```
>>> plot = data.plot()
```

Display the plot

```
>>> plot.show()
```

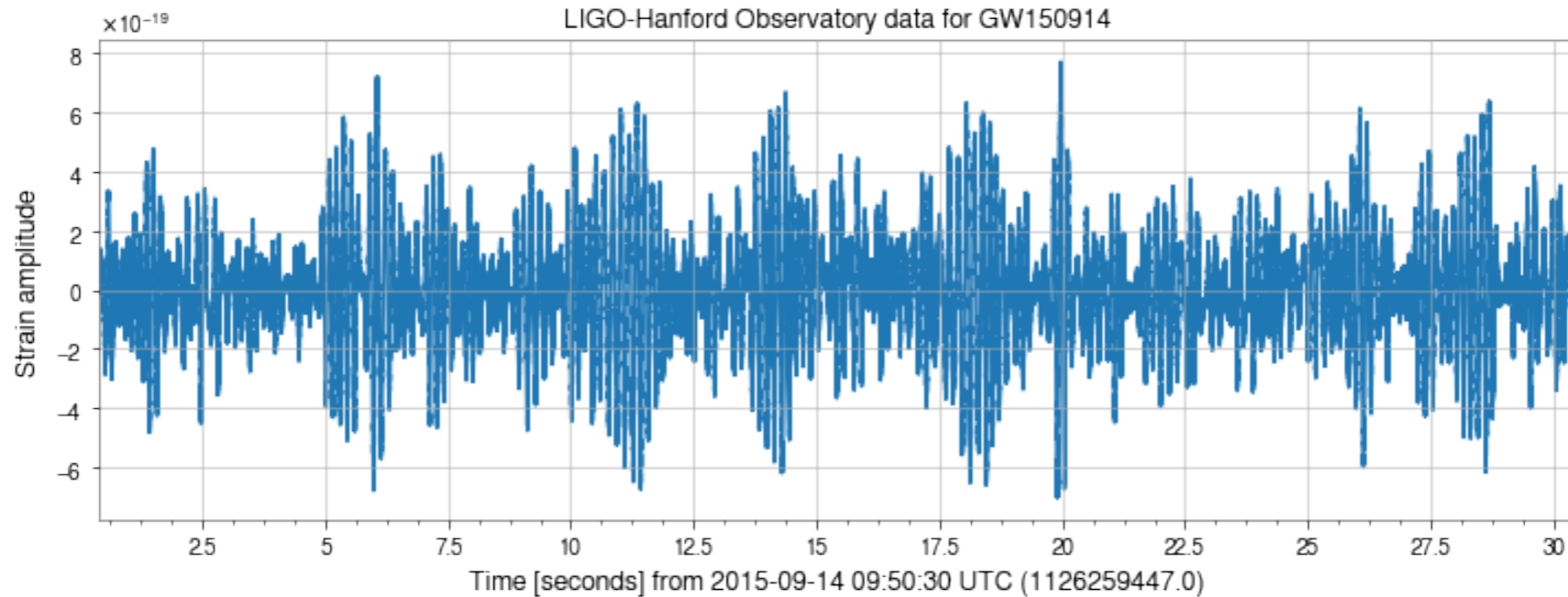


Time domain

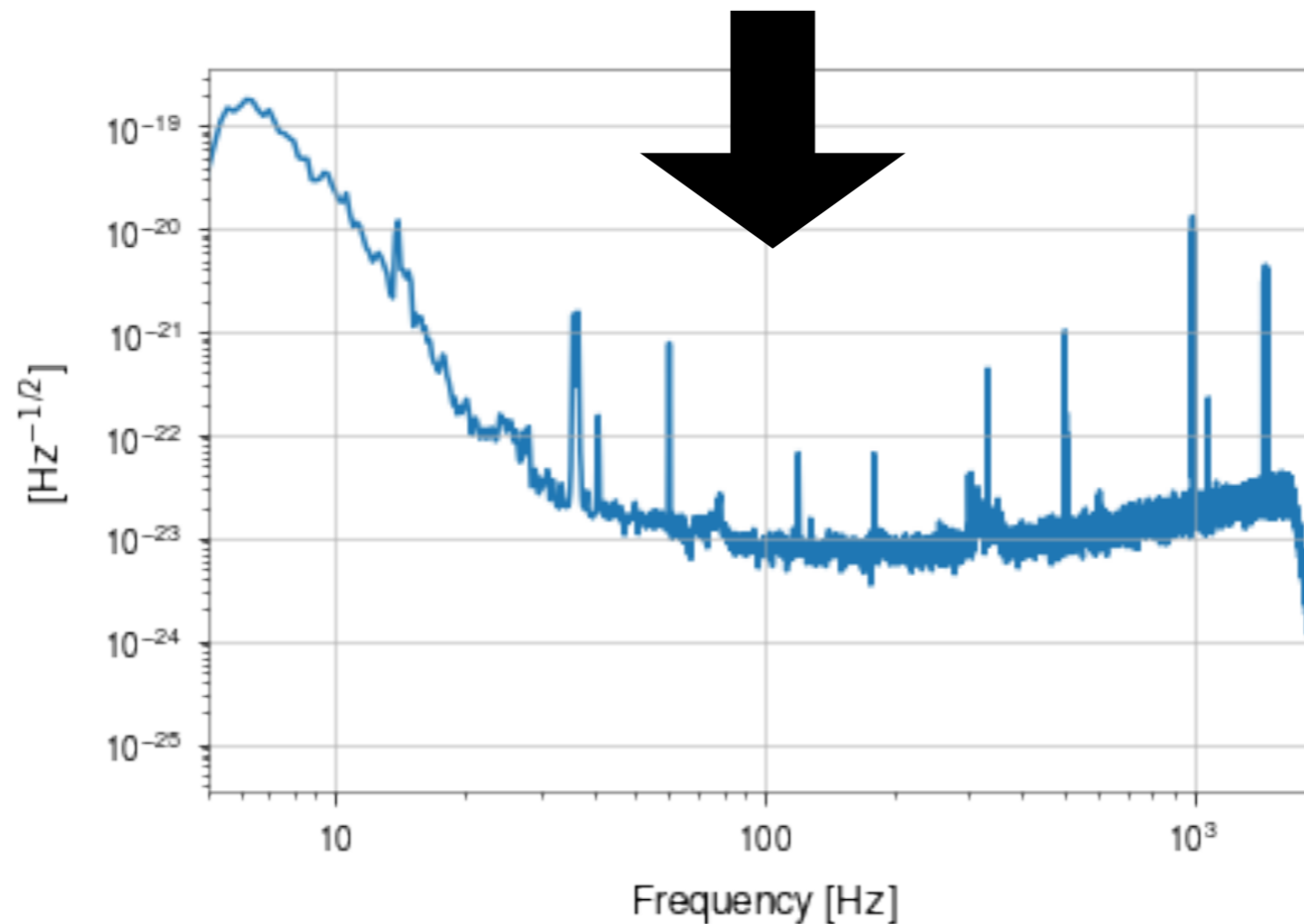


Time domain \rightarrow Frequency domain

Time series
(strain vs time)



Amplitude spectral density
($\text{Hz}^{-\frac{1}{2}}$ vs. frequency)



The Fourier Series

Any function can be represented as a sum of sines and cosines (with some coefficients that can also be functions).

$$f(x) = \sum_{n=0}^{\infty} A_n \cos\left(\frac{n\pi x}{L}\right) + \sum_{n=1}^{\infty} B_n \sin\left(\frac{n\pi x}{L}\right)$$

The Fourier Transform

When we transform our function or time (or space) into the “frequency domain”, we are **projecting $f(x)$ onto an orthogonal basis of sines and cosines.**

Fourier transform $\tilde{x}(f) = \int_{-\infty}^{\infty} dt x(t) e^{-i2\pi ft}$

The Fourier Transform

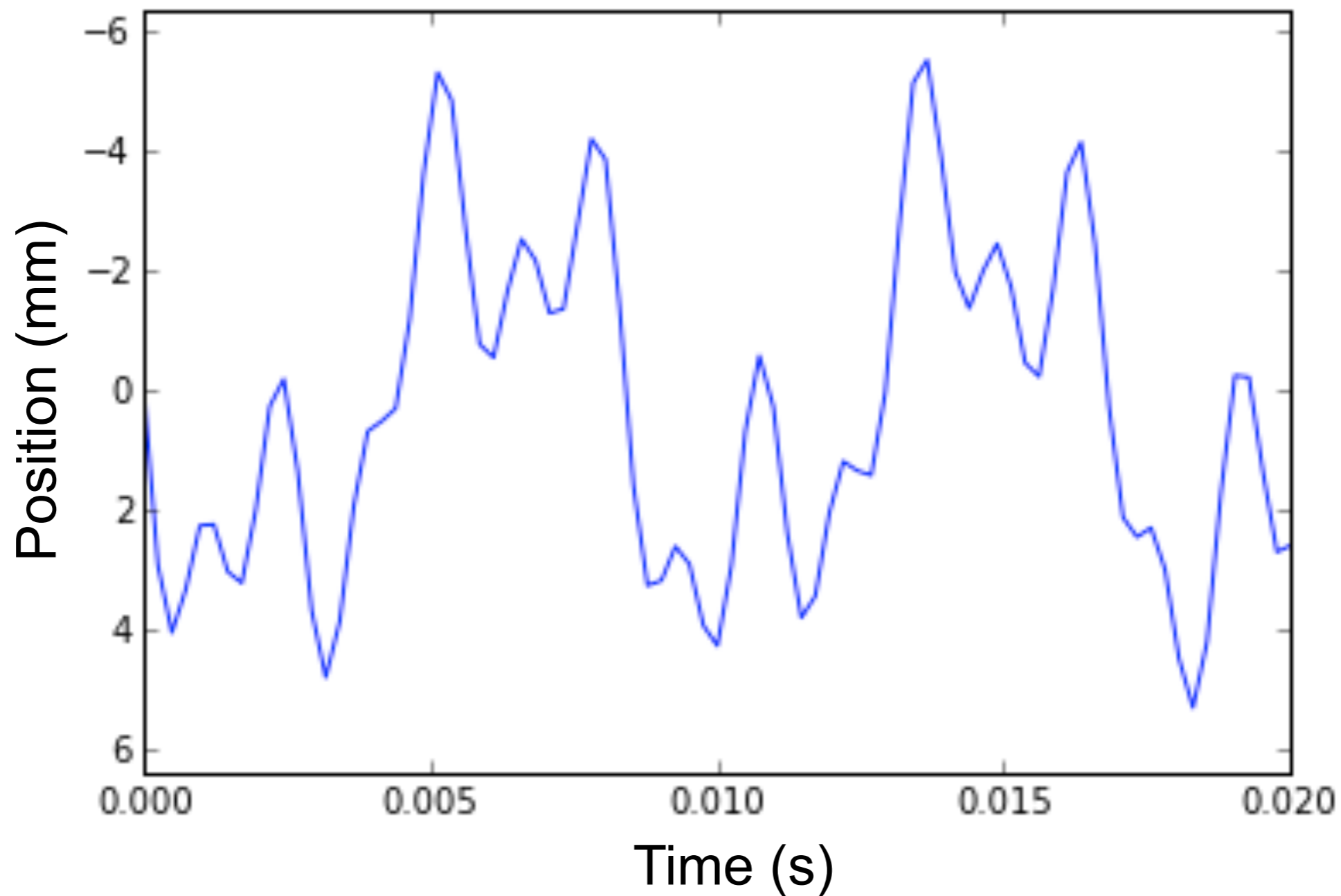
When we transform our function of time (or space) into the “frequency domain”, we are **projecting $f(x)$ onto an orthogonal basis of sines and cosines.**

Fourier transform $\tilde{x}(f) = \int_{-\infty}^{\infty} dt x(t) e^{-i2\pi ft}$

Inverse Fourier transform $x(t) = \int_{-\infty}^{\infty} df \tilde{x}(f) e^{i2\pi ft}$

Another way to think about it: when we take a Fourier transform **we are decomposing the function into its component frequencies.**

How would you describe this function?

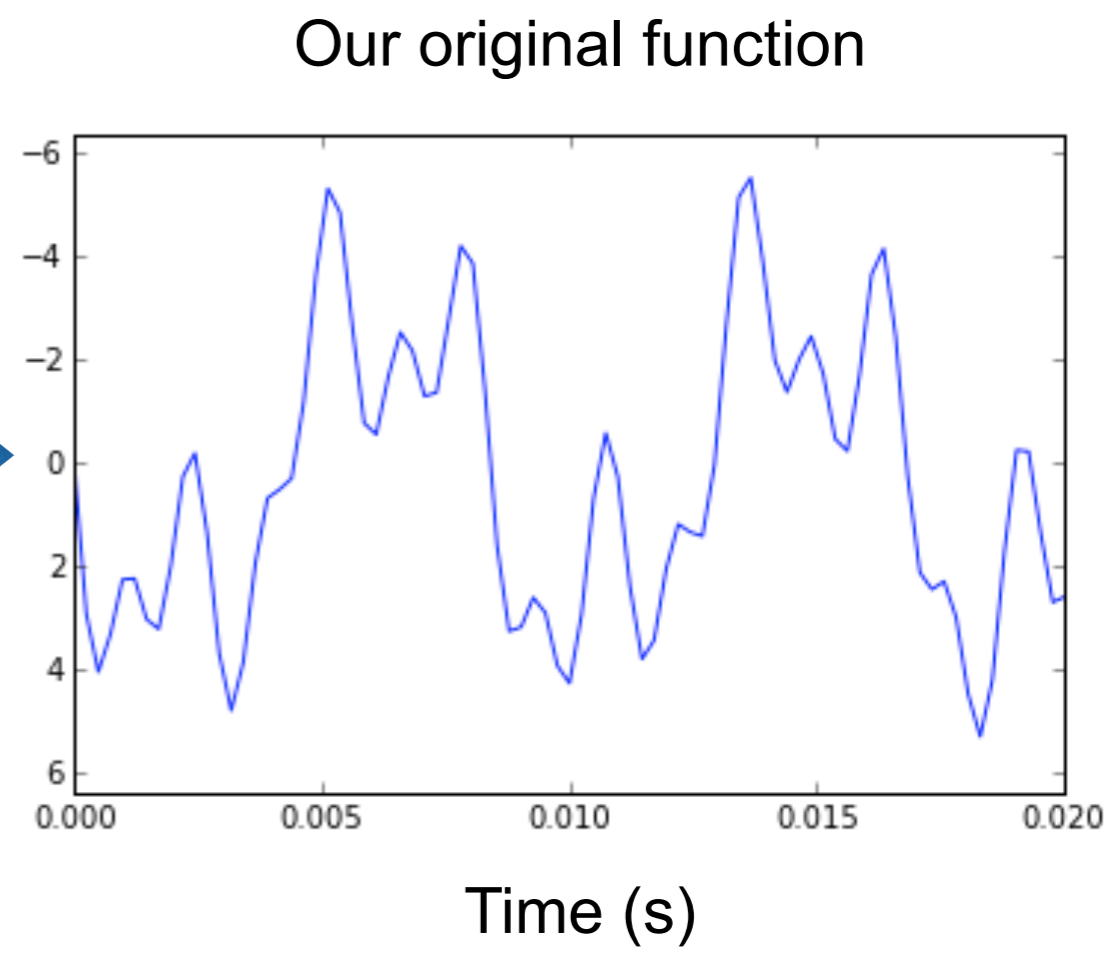
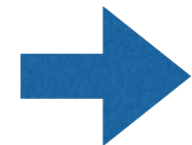
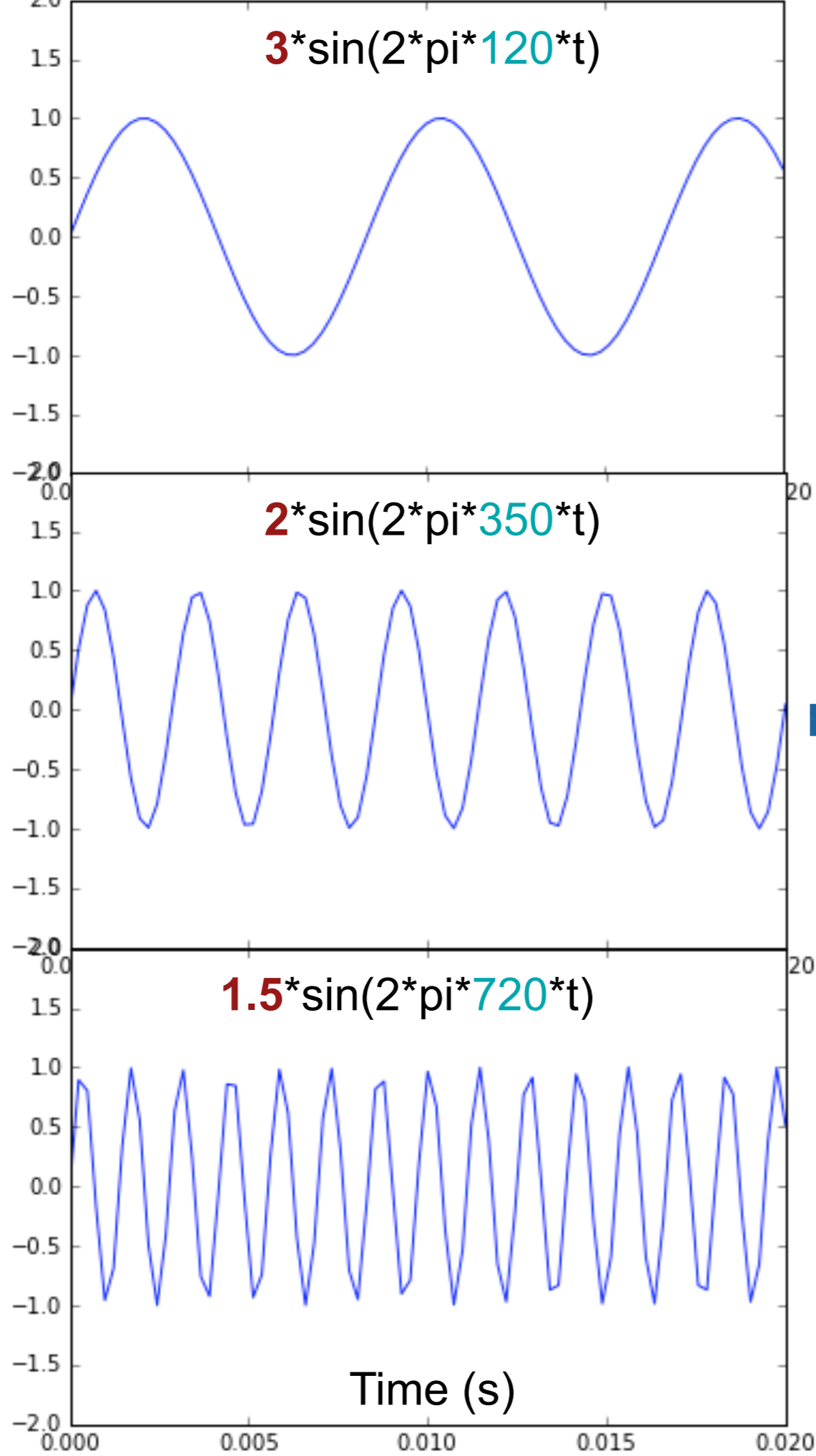


2 sinusoids

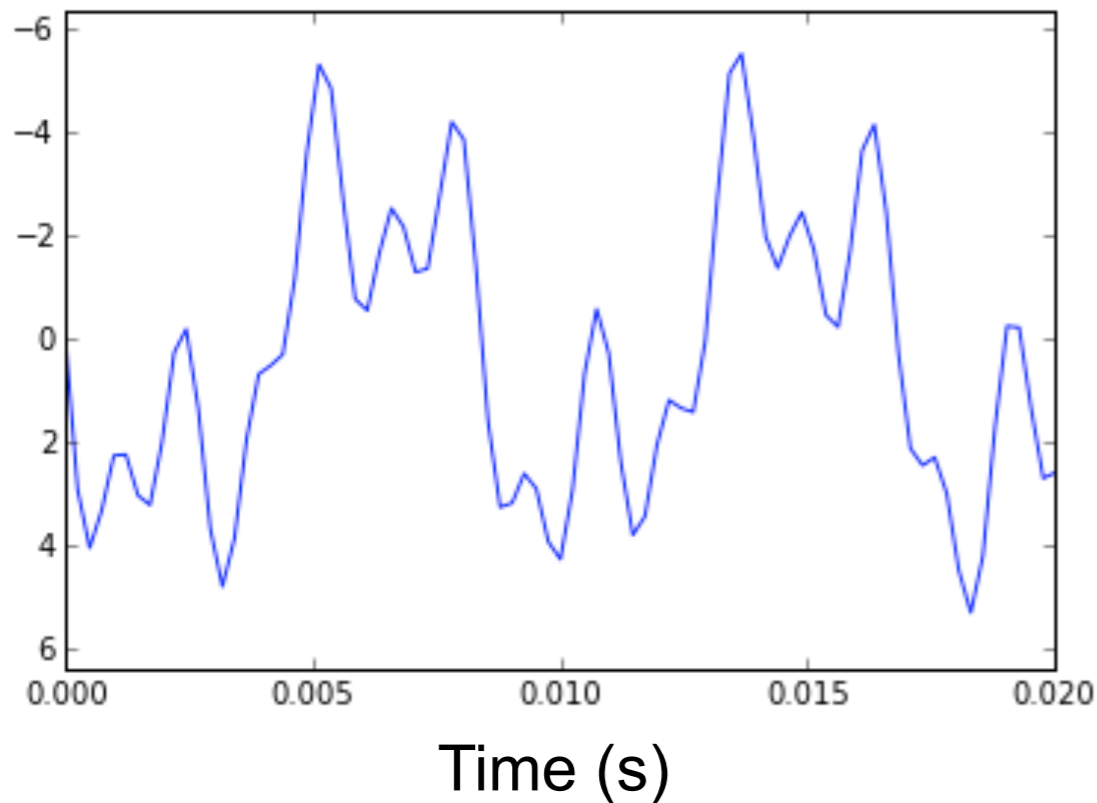
3 sinusoids

4 sinusoids

5 sinusoids



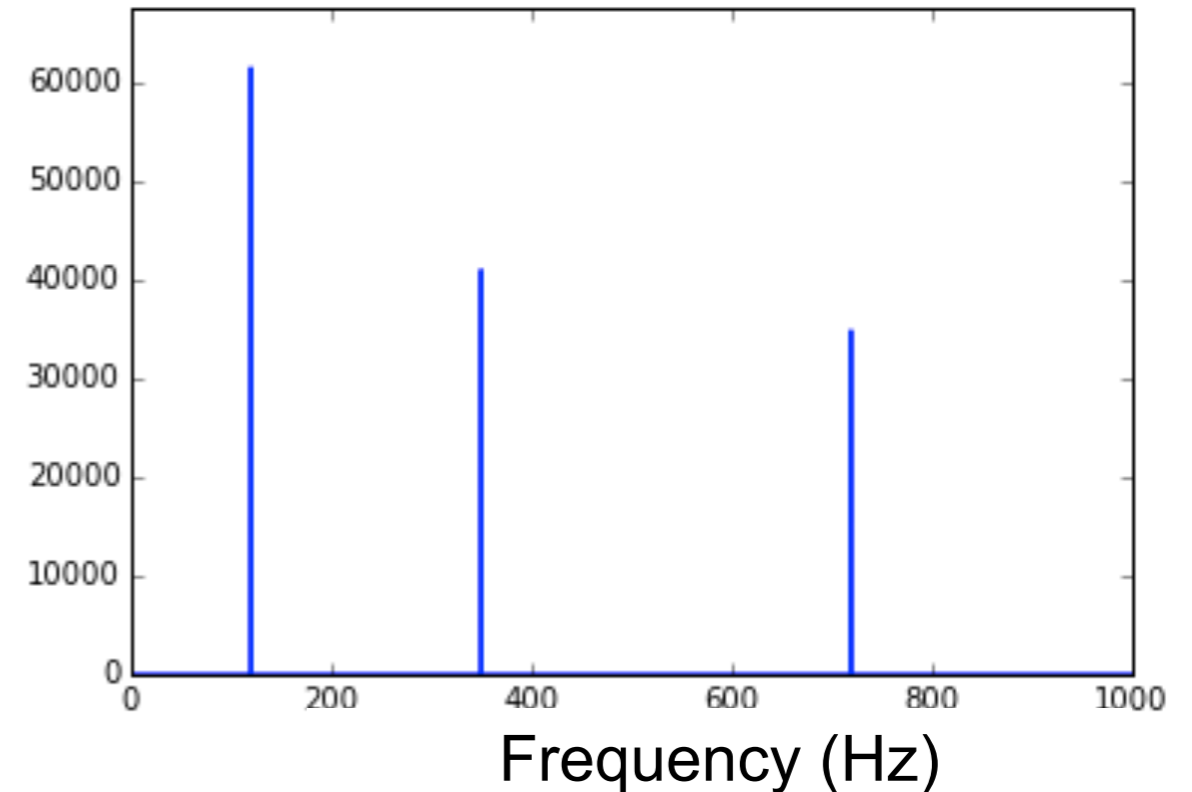
Time Domain



$h(t)$ – Position as a function of time

$$h(t) = 3 * \sin(2*\pi*120*t) + 2 * \sin(2*\pi*350*t) + 1.5 * \sin(2*\pi*720*t)$$

Frequency Domain



$H(f)$ – Amplitude as a function of frequency

$$\begin{aligned} |H(120 \text{ Hz})| &= 3 \\ |H(350 \text{ Hz})| &= 2 \\ |H(720 \text{ Hz})| &= 1.5 \\ H(f) &= 0 \text{ otherwise} \end{aligned}$$



Power Spectral Density

Parseval's theorem:

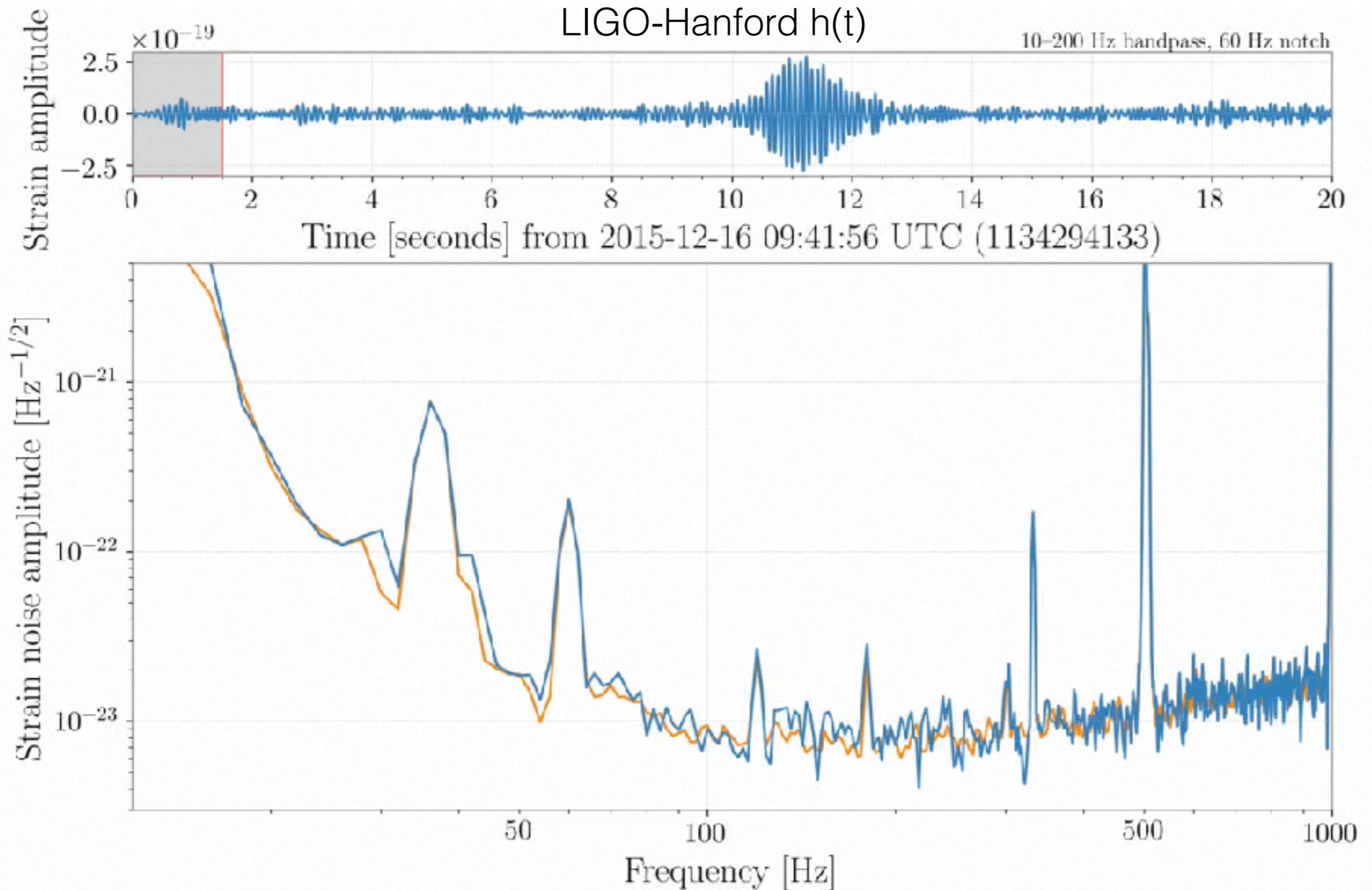
$$\int_{-\infty}^{\infty} dt |x(t)|^2 = \int_{-\infty}^{\infty} df |\tilde{x}(f)|^2$$

⇒ Total energy in the data can be calculated in either time domain or frequency domain

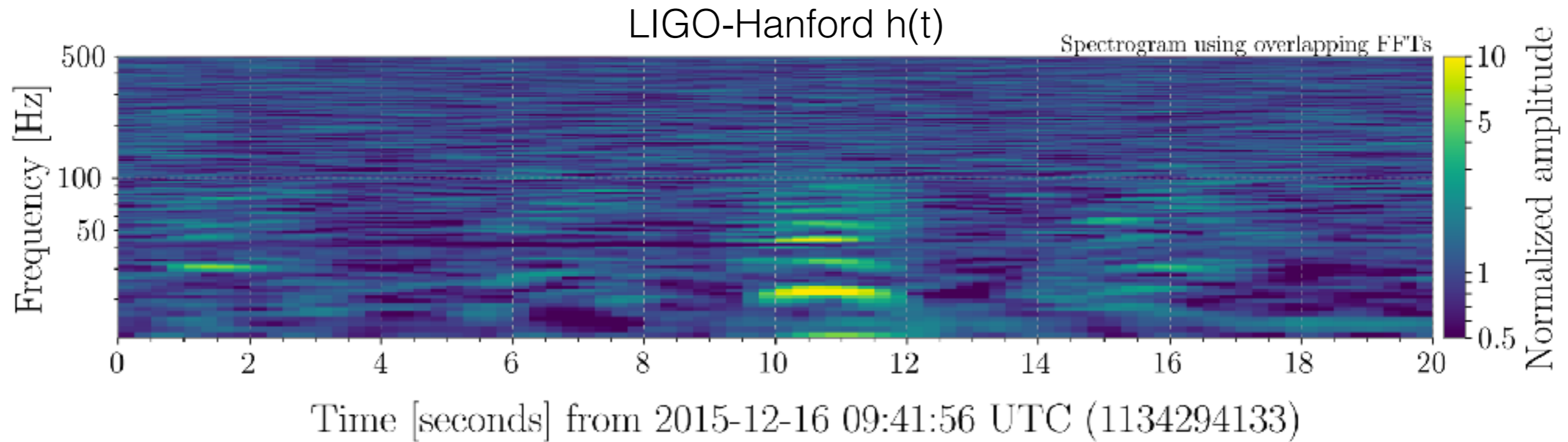
Units:

- $|\tilde{x}(f)|^2$ Energy spectral density
(normalize by 1/T to get power)
Signal energy per unit frequency (per Hz)
- $|\tilde{x}(f)|$ ∝ Amplitude spectral density
(sqrt of power for each discrete frequency)
Signal amplitude per unit frequency (per sqrt Hz)

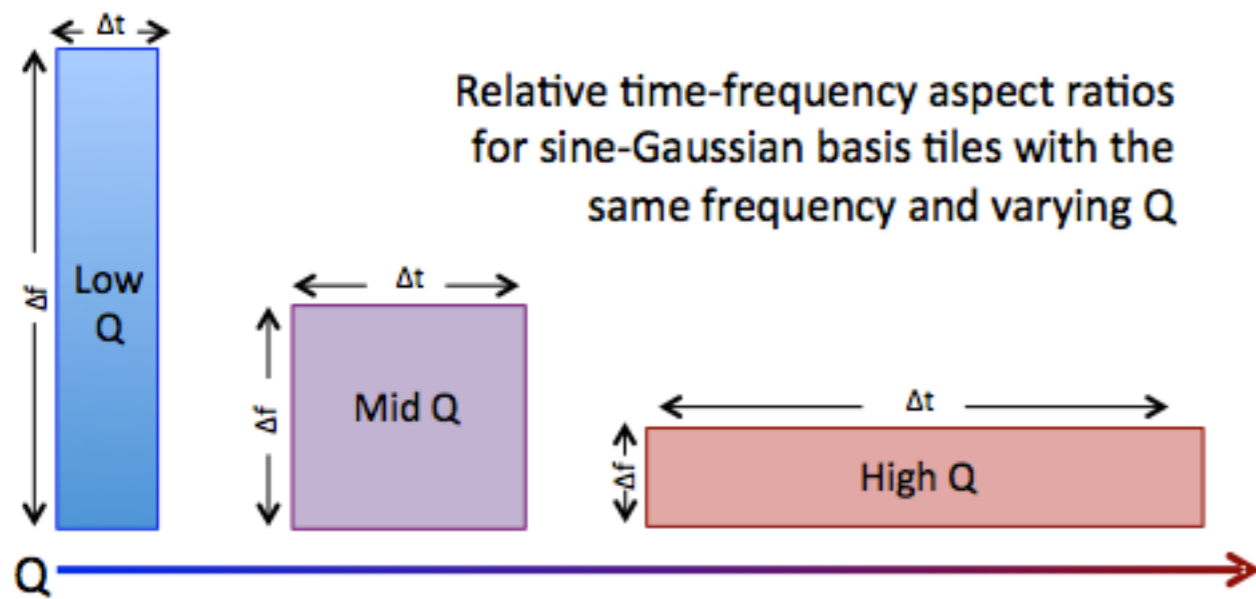
LIGO data in time and frequency



Time-frequency spectrogram



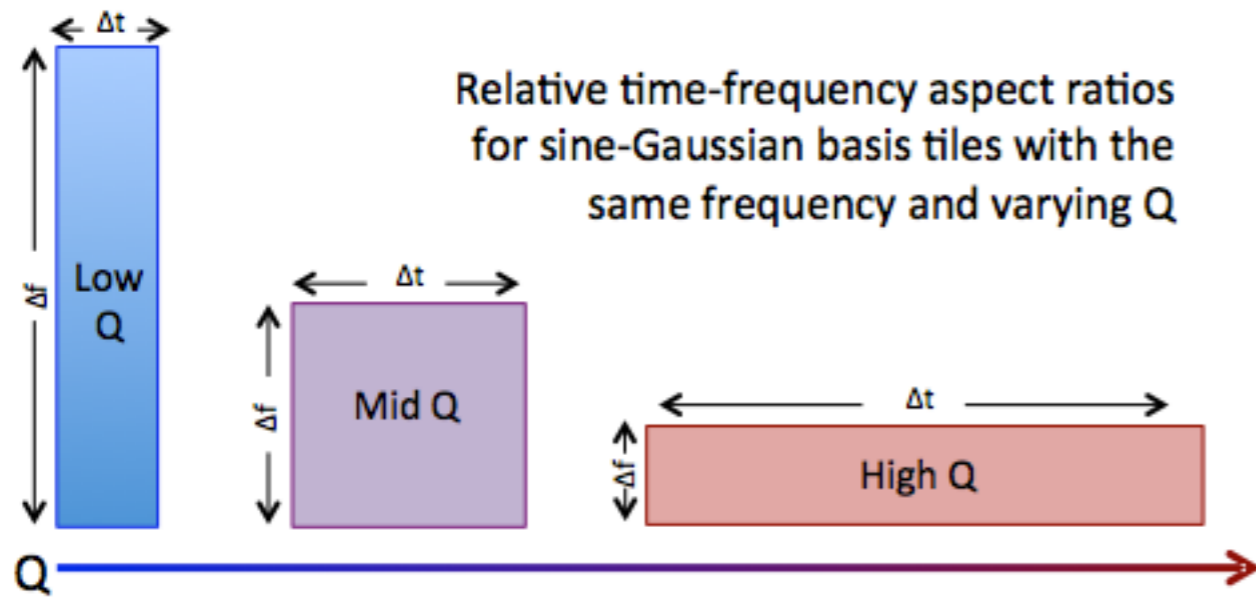
The Q transform



S. Chatterji et al. CQG (2010)
Images: McIver

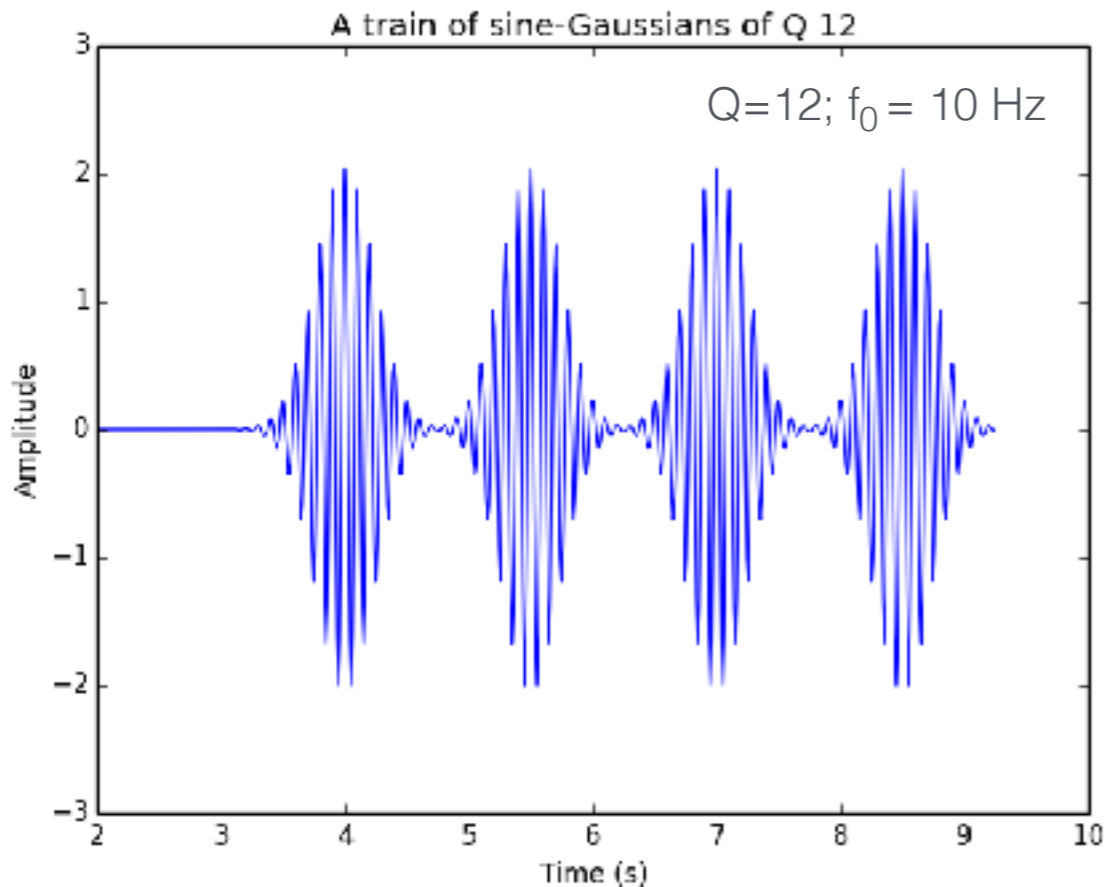
$$Q = \frac{f_0}{\Delta f}$$

The Q transform



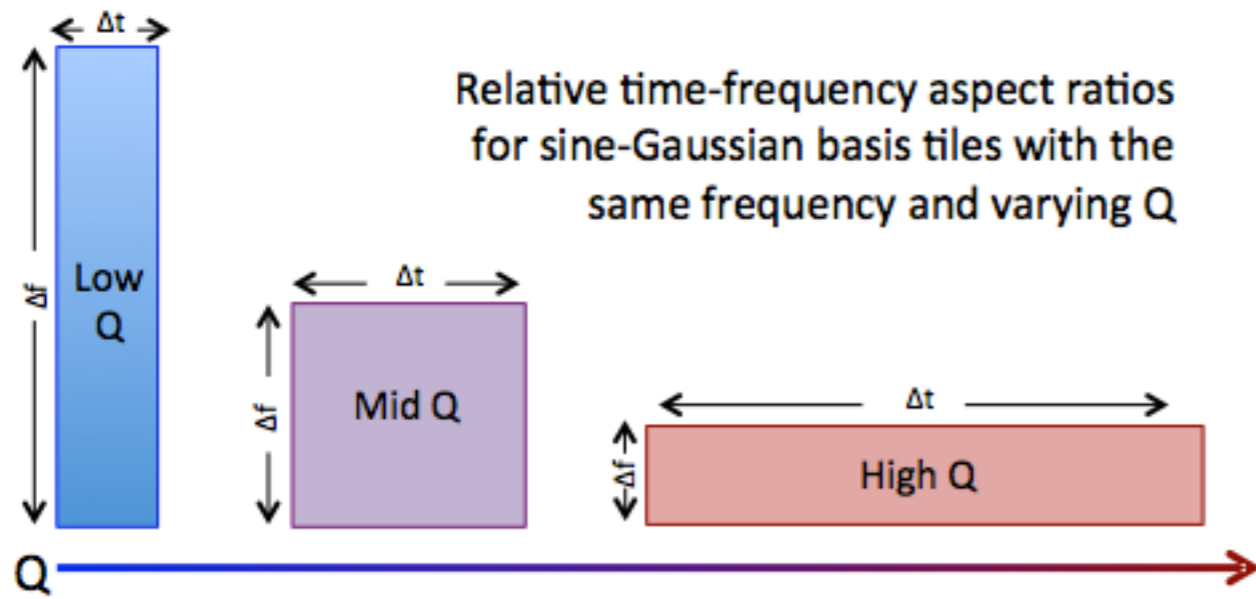
S. Chatterji et al. CQG (2010)
Images: McIver

$$Q = \frac{f_0}{\Delta f}$$

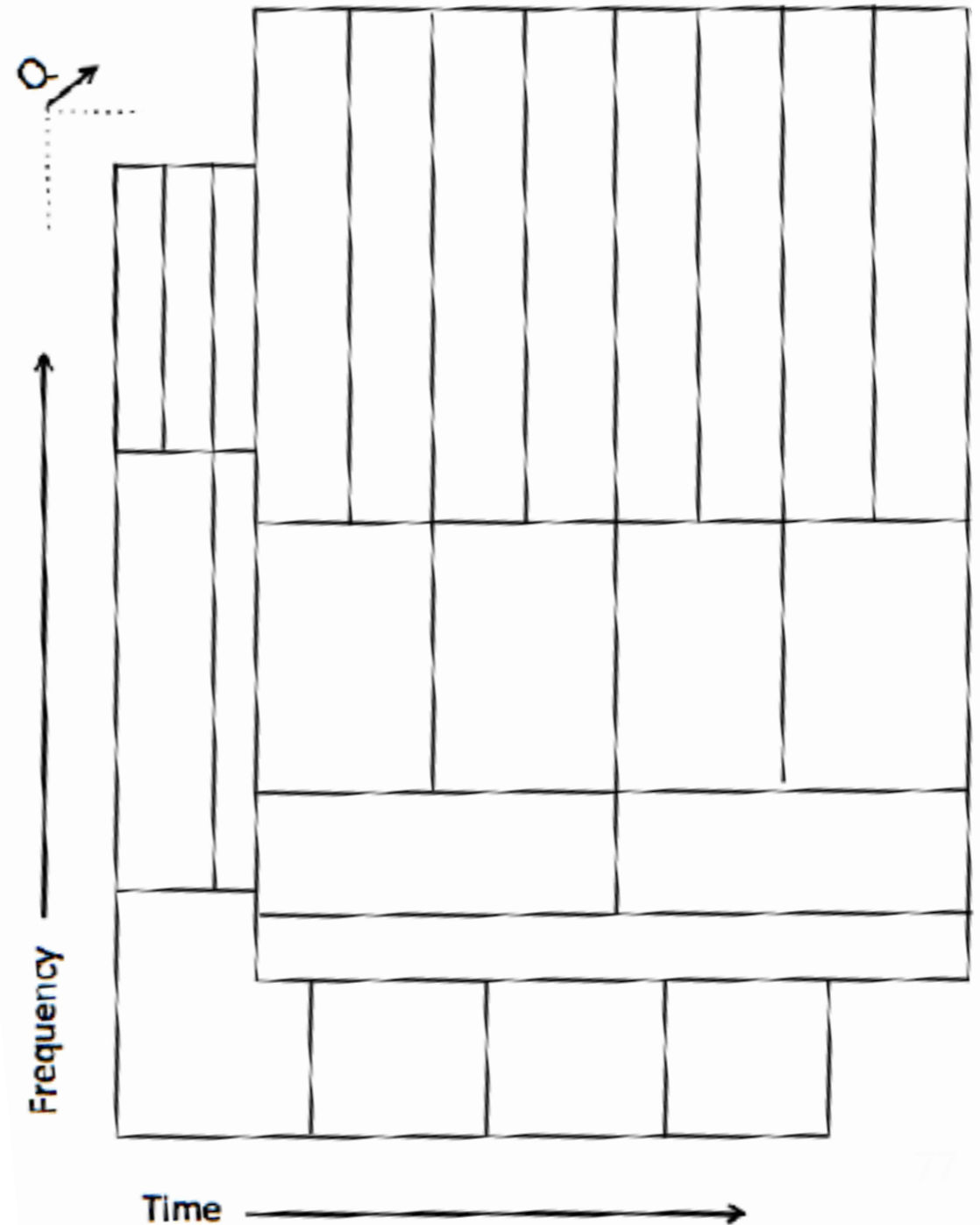
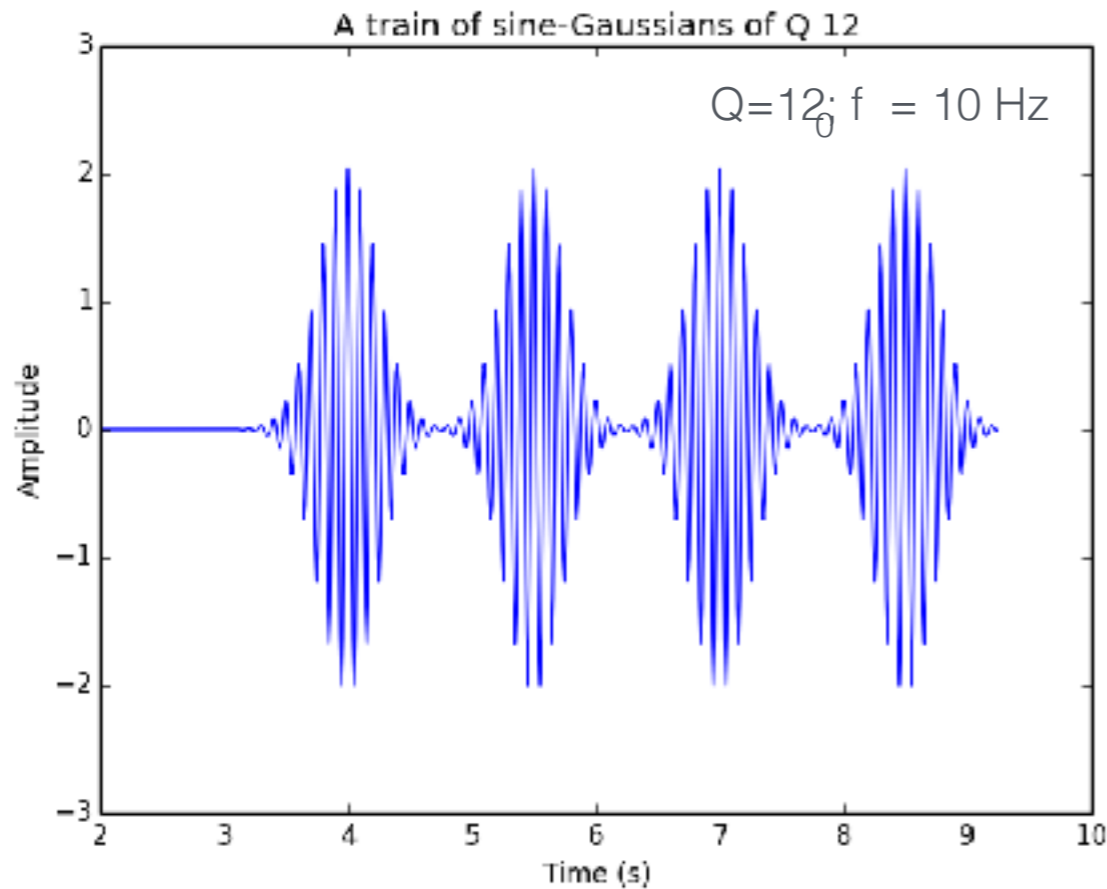


The Q transform

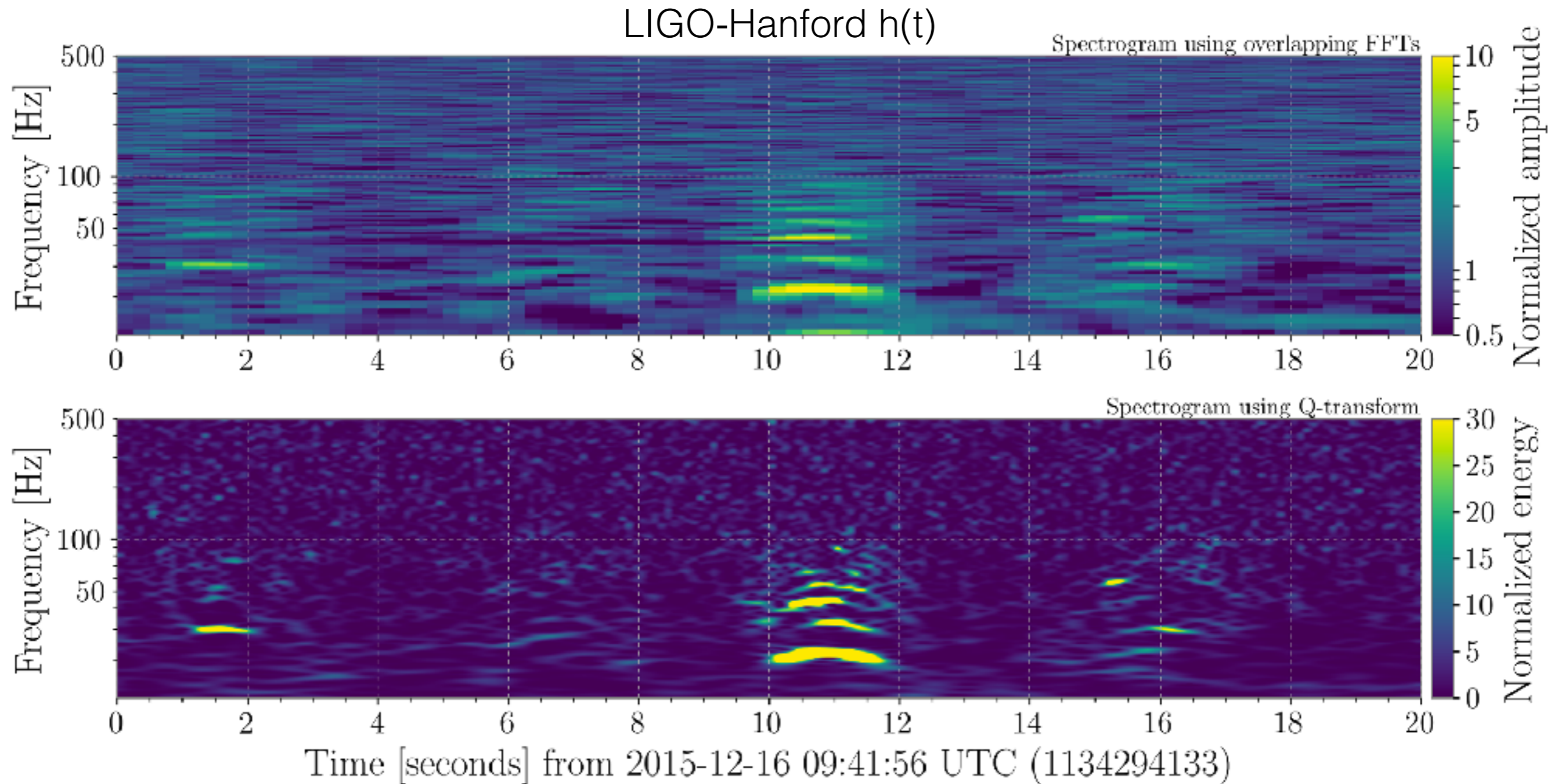
S. Chatterji et al. CQG (2010)
Images: McIver



$$Q = \frac{f_0}{\Delta f}$$



Time-frequency spectrograms



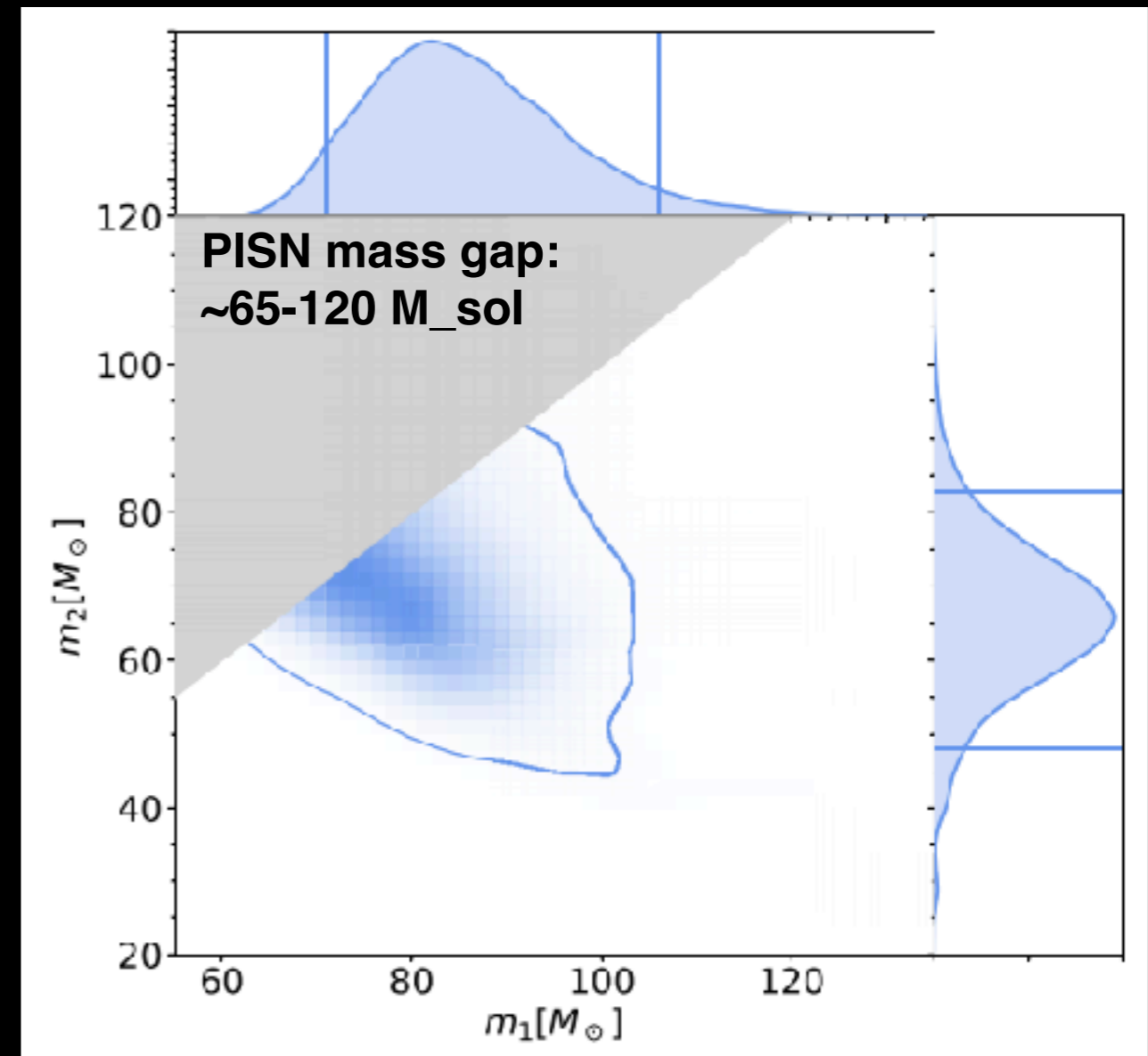
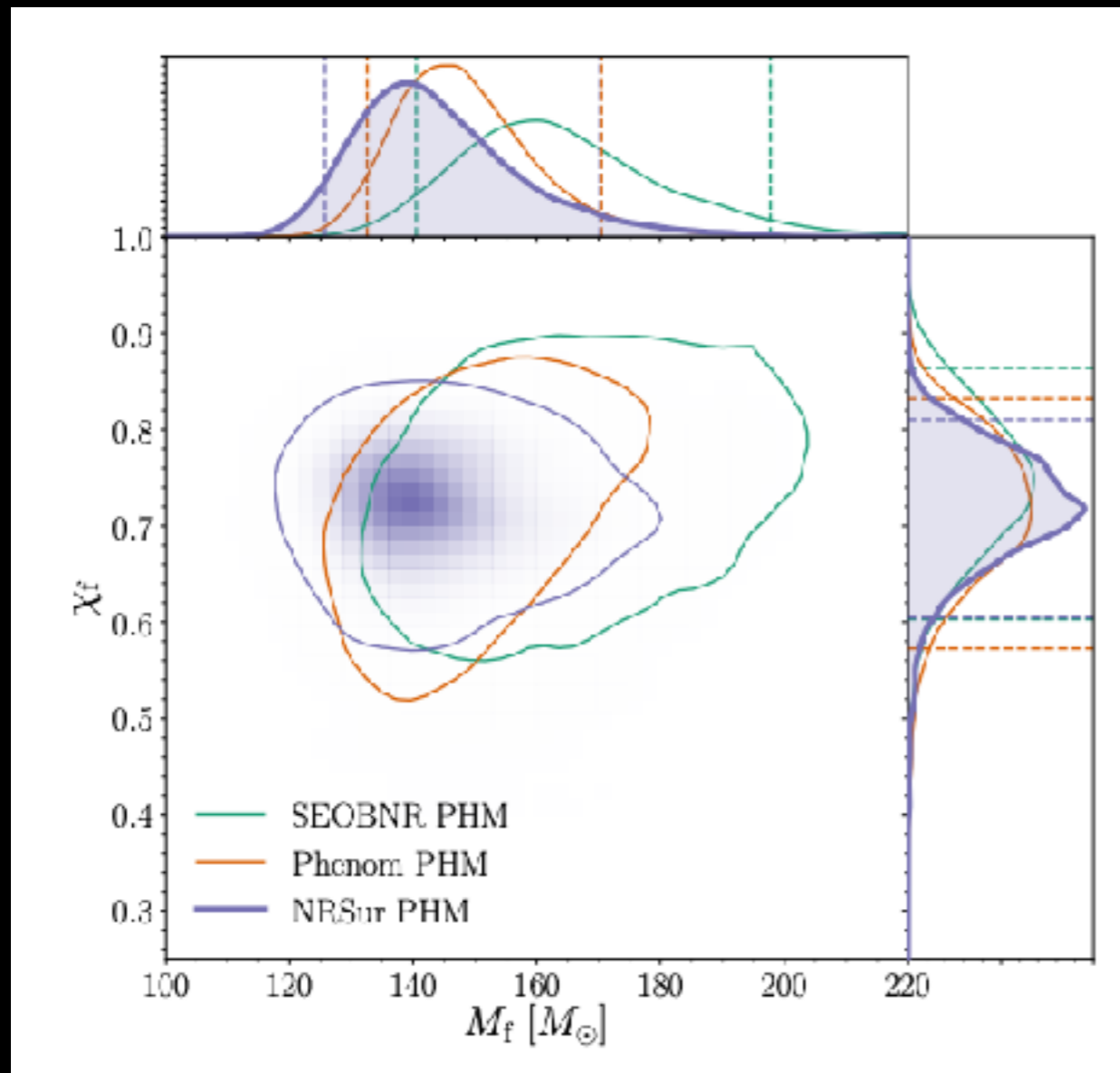
Extra slides

Major result from O3: GW190521

85, 66 solar mass BBH: First intermediate mass black hole detection!

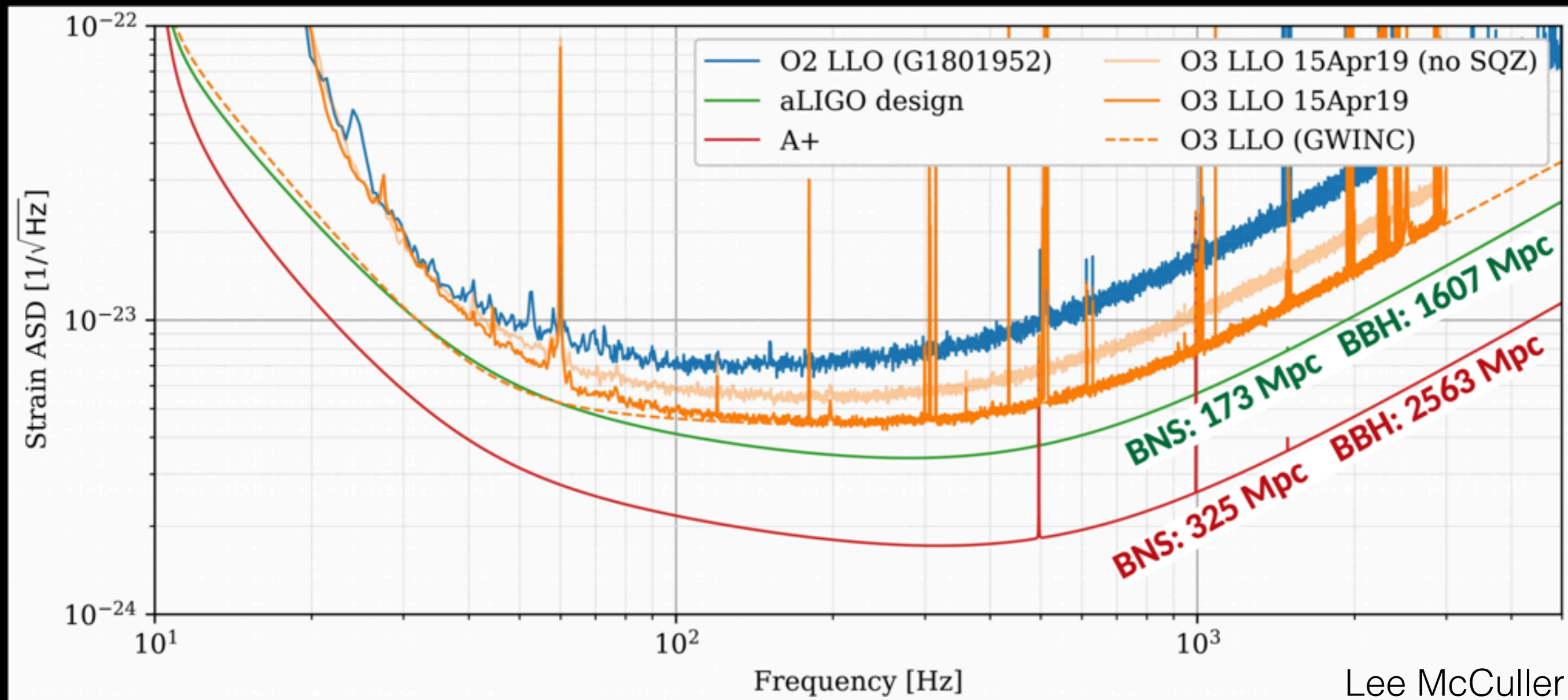
Mass of final BH unequivocally $> 100 M_{\text{sol}}$
 ~ 8 solar masses of energy released in GWs!

Primary mass in PISN mass gap!
0.32% probability below $65 M_{\text{sol}}$



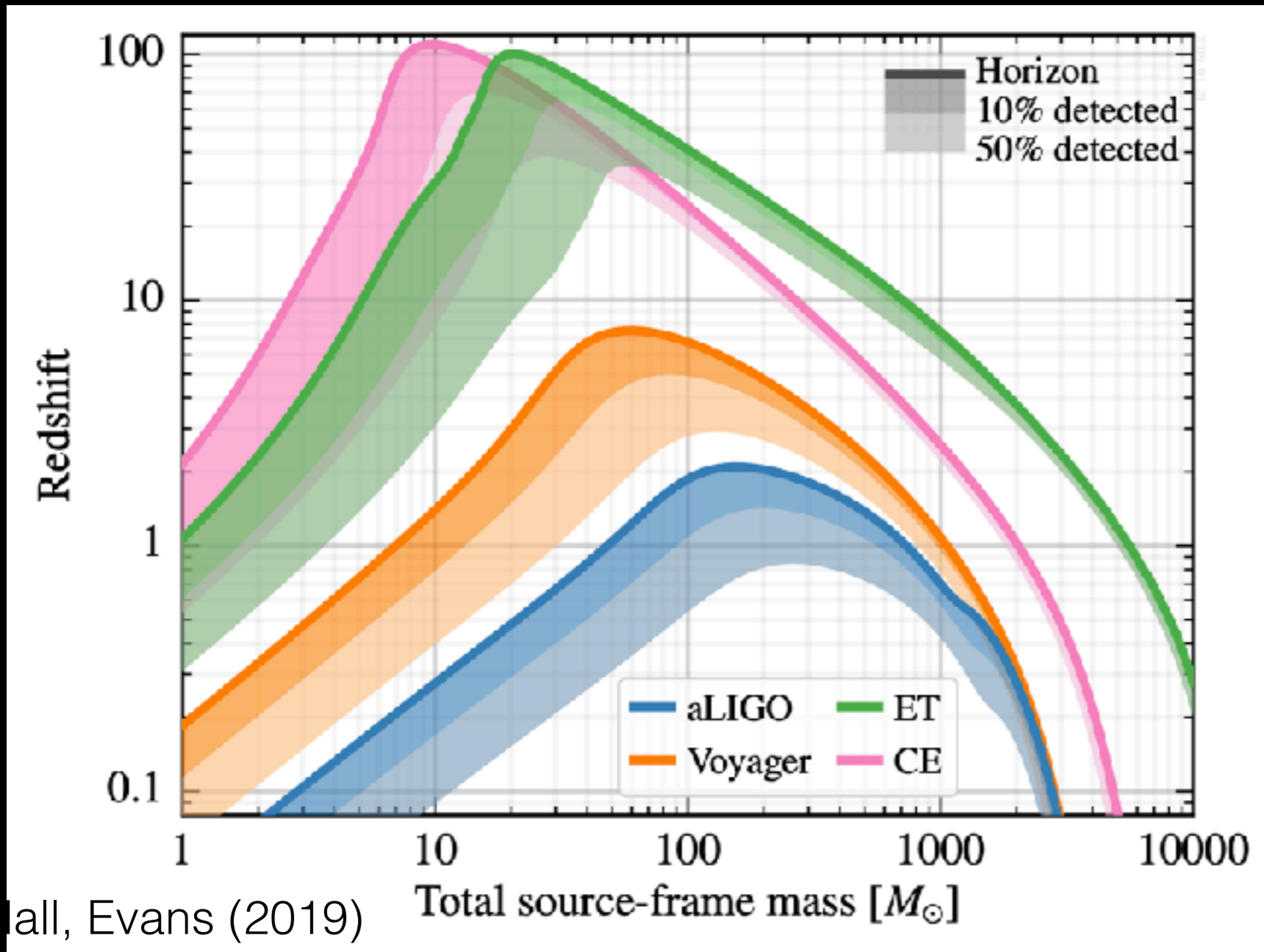
A+ by the mid 2020s

- Frequency-dependent light squeezing
- 300m filter cavity
- Improved coatings
- Bigger beam splitter, improved suspensions



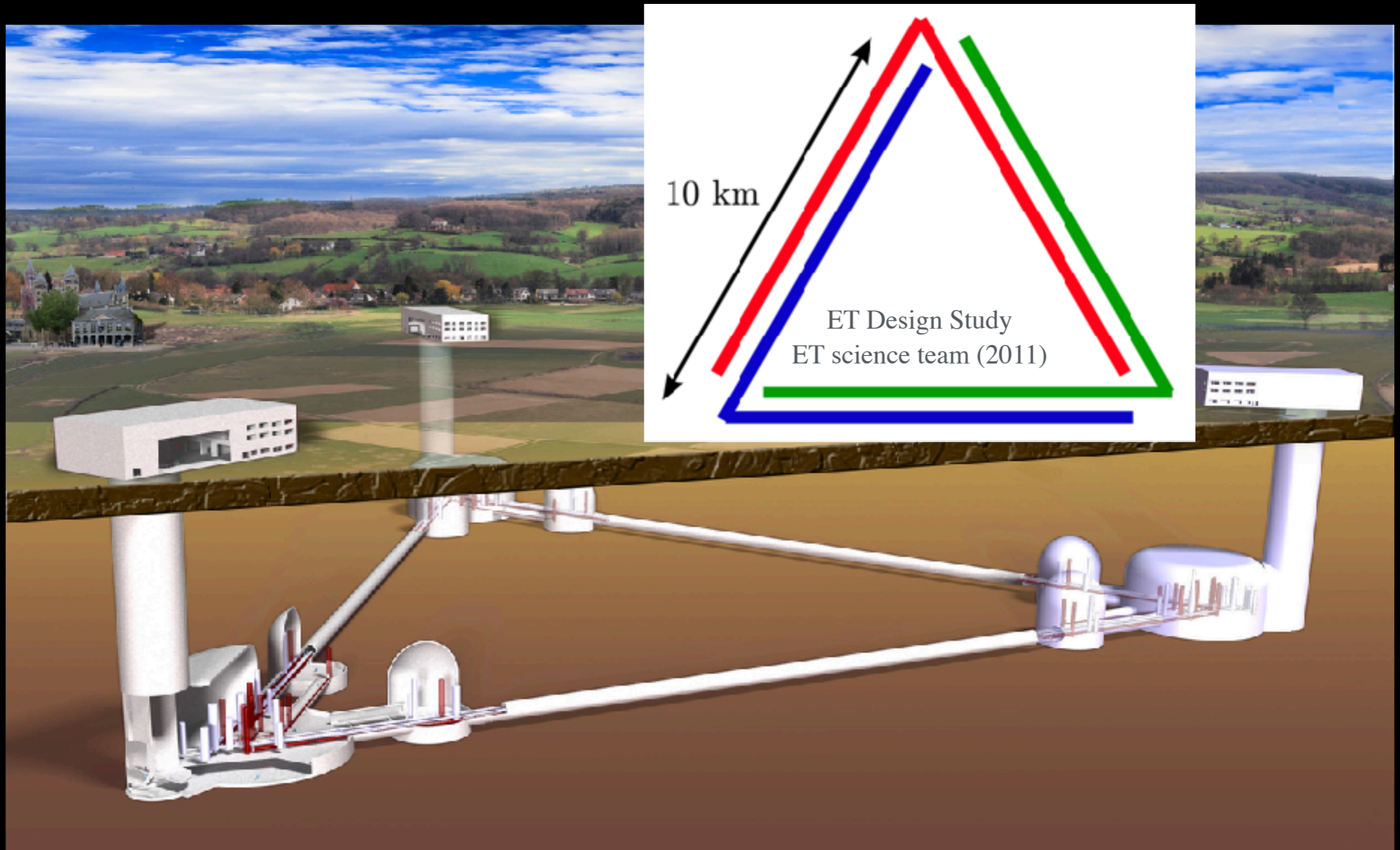
Lee McCuller

Detector range



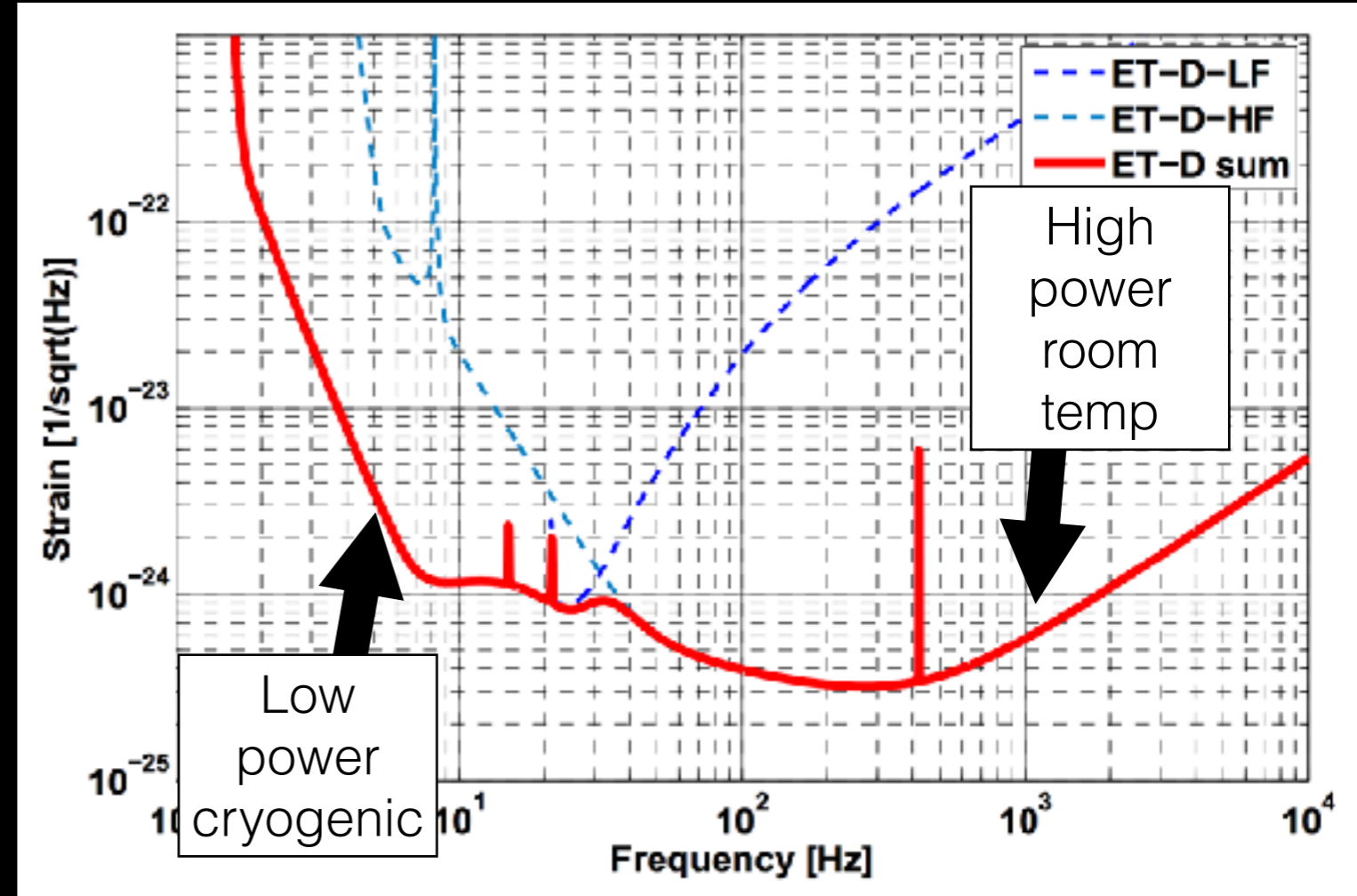
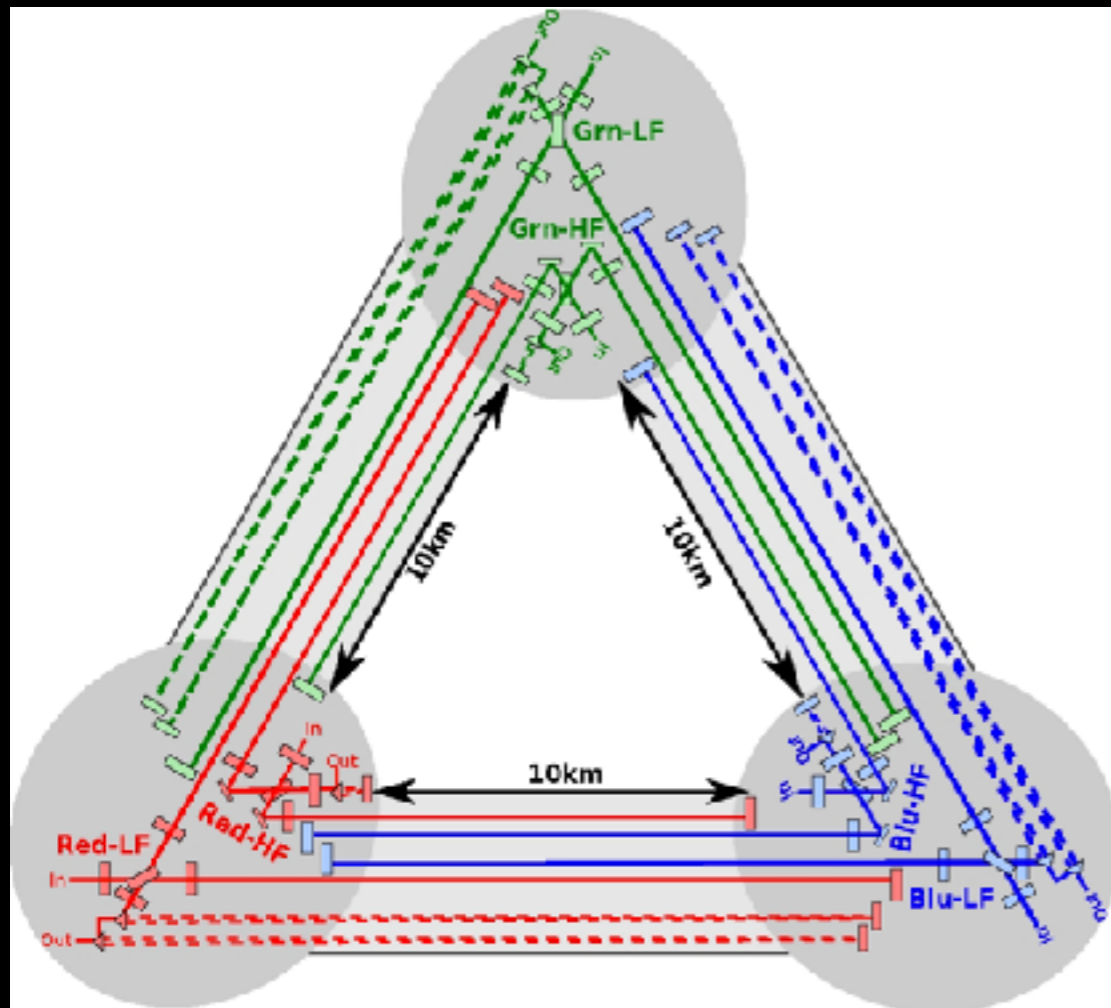
- Thousands of high SNR events
- Precise tests of GR in highly curved spacetime
- New GW sources at high frequencies, including CCSNe
- All stellar-mass BBH mergers in the visible Universe!

Einstein telescope

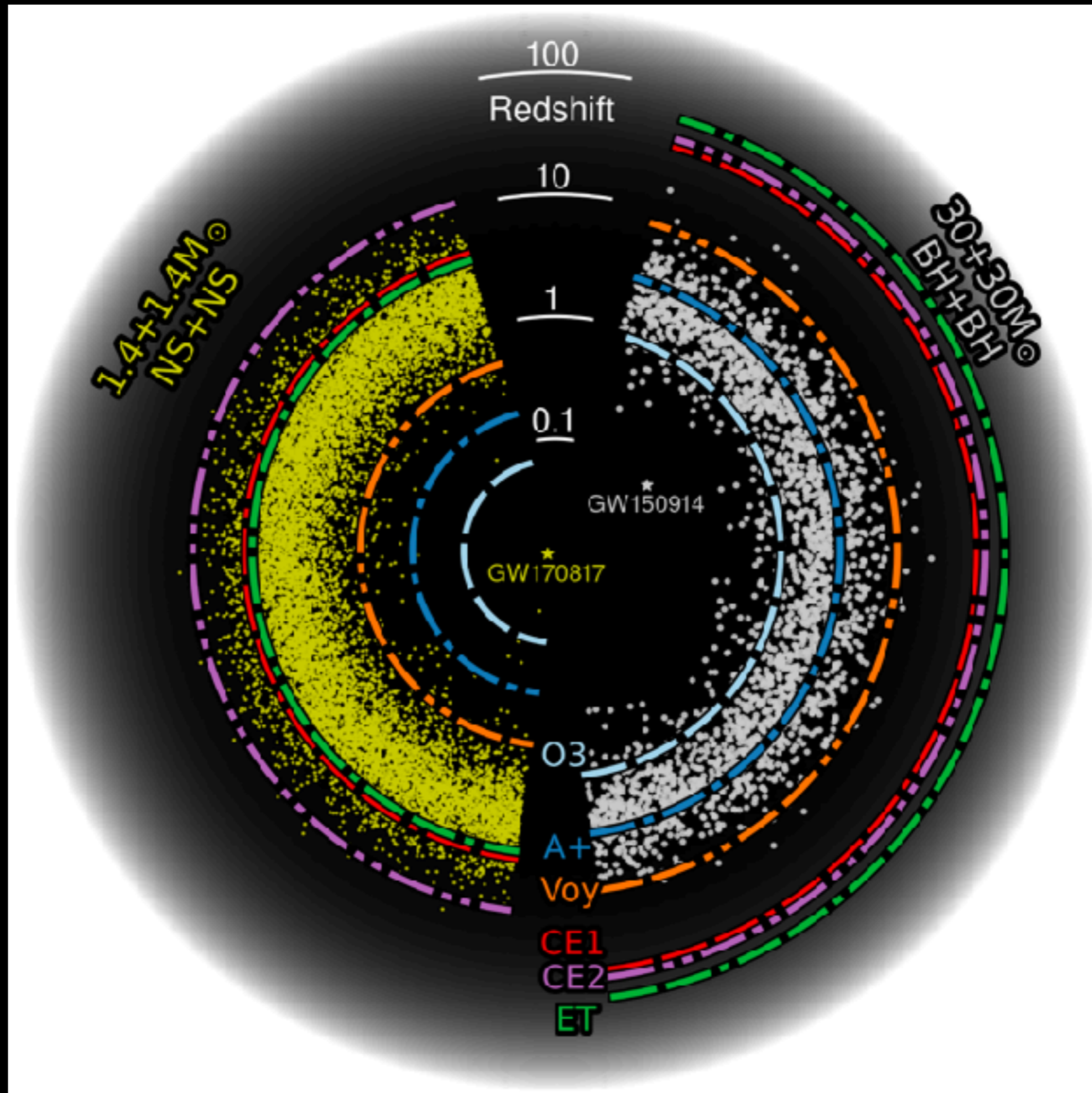


Einstein telescope

Three detectors... **Six interferometers**



The range of next generation GW detectors



Galaxy formation and evolution

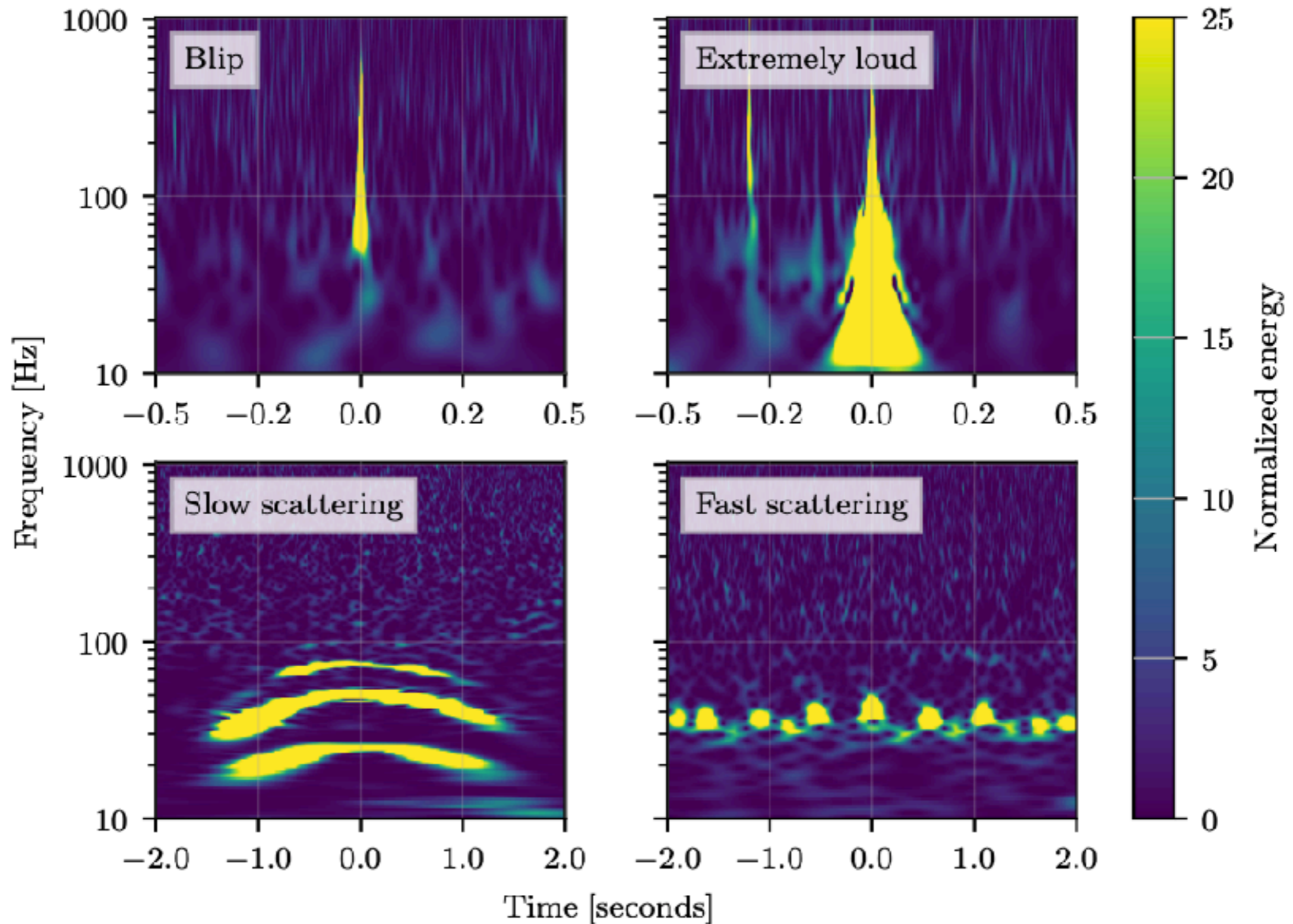
LISA will be able to localize massive BH sources to a few arcminutes at $z=1$!

S. McWilliams et al. 2011
arXiv 1104.5650

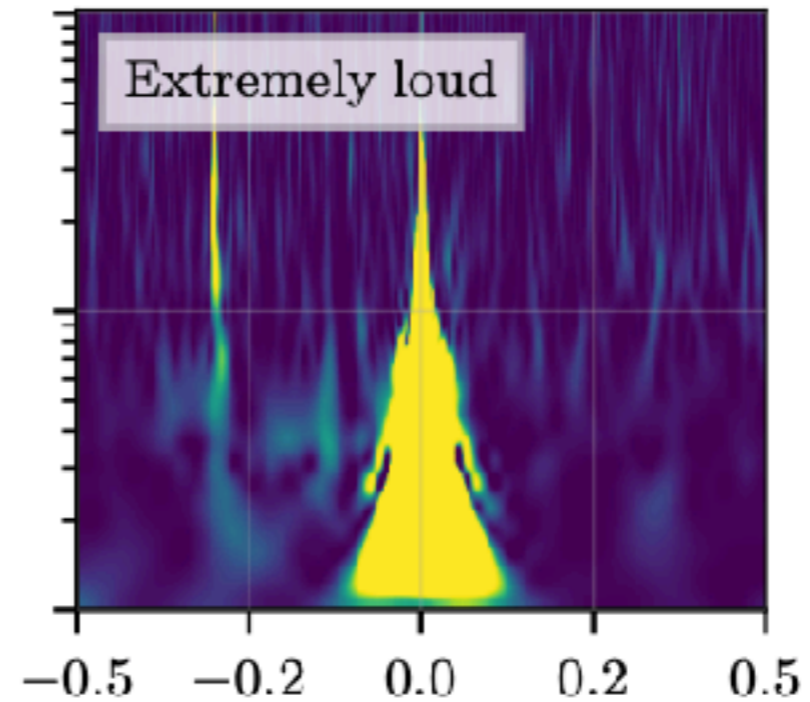
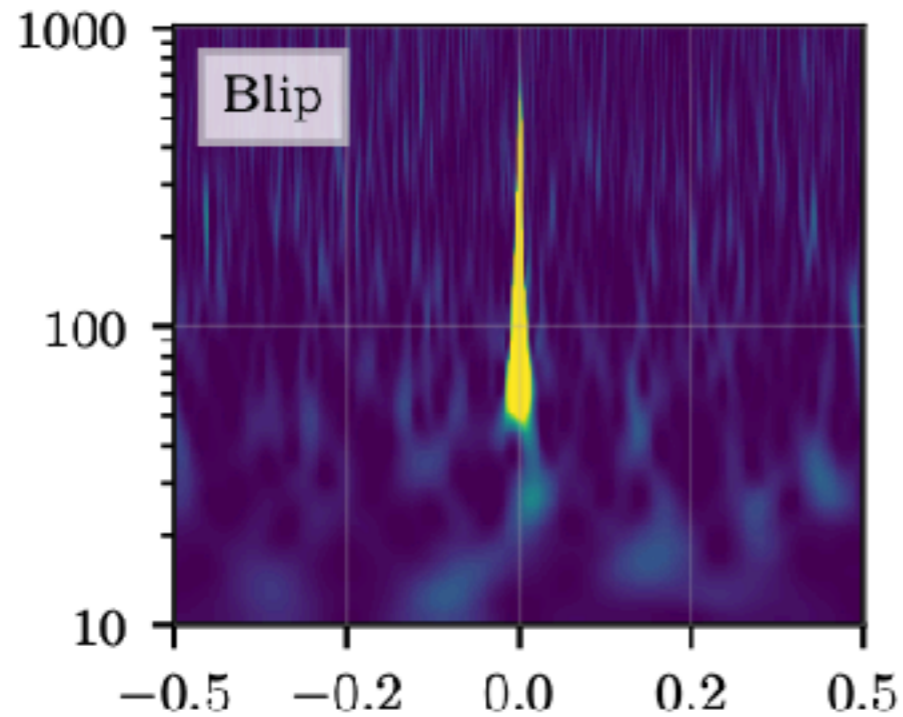
LISA will be able to measure massive BH distance with less than 10% error at $z=4$!

E. Berti et al. 2005. arXiv 0504017

"Worst offender" glitches



"Worst offender" glitches



Blips

- Few known witnesses
- Shared time-frequency morphology with high mass CBC signals

Extremely loud

- Much more common in O3 than in O2 for LIGO detectors
- Few clear witnesses
- Pollute PSD estimation

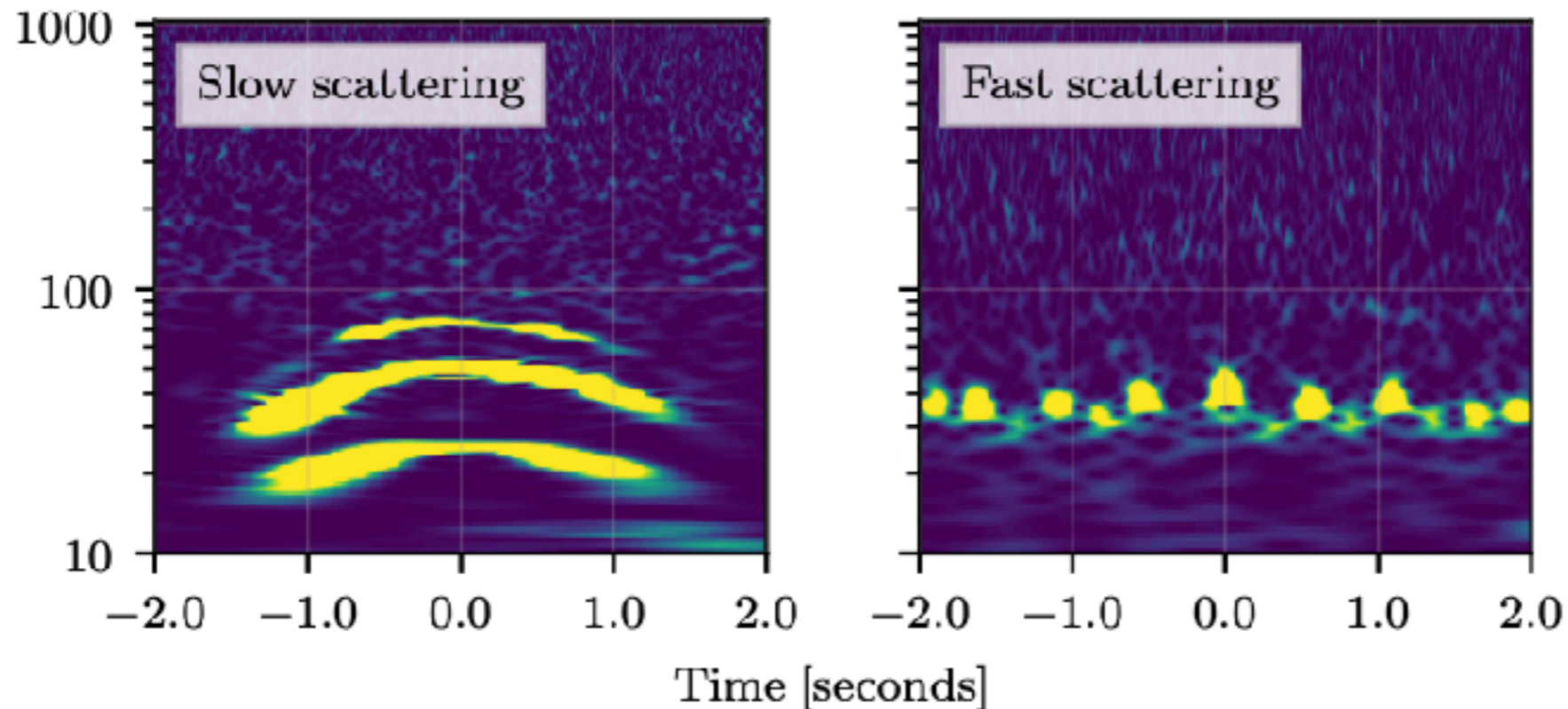
"Worst offender" glitches

Slow scattering

- Well understood witnesses and coupling
- Still difficult/impractical to veto because they are at times so frequent

Fast scattering

- Modulated fast scattering
- Troublesome for lower mass CBC templates
- Most comment LIGO-Livingston: thought to be understood for O3



Estimating the PSD

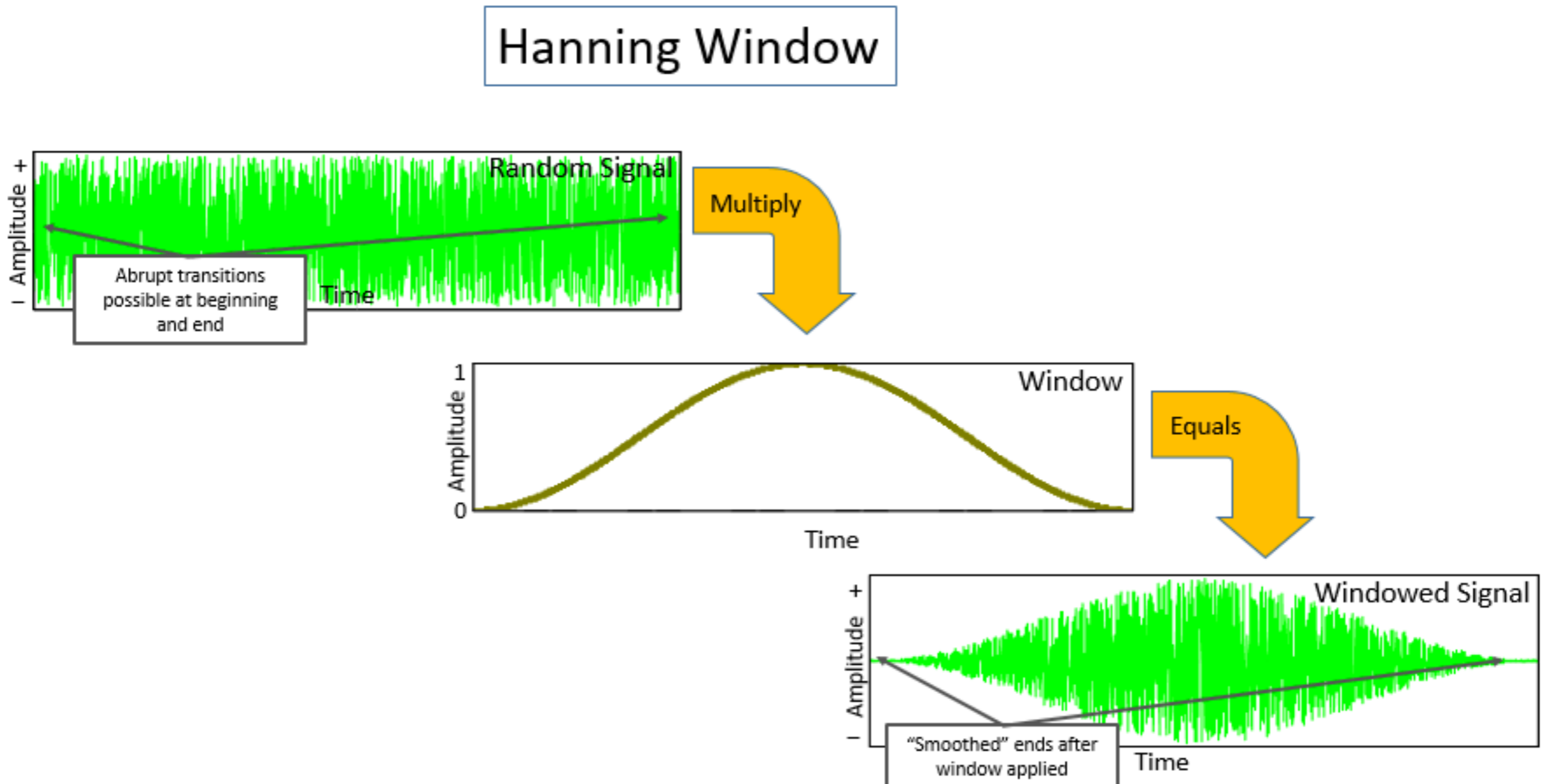
Step 0: Take a **Fast Fourier Transform (FFT)**, which is any algorithm useful for quickly estimating the **Discrete Fourier Transform** that describes a **discrete time series**.

$$\begin{aligned} X_k &= \sum_{n=0}^{N-1} x_n \cdot e^{-\frac{i2\pi}{N}kn} \\ &= \sum_{n=0}^{N-1} x_n \cdot [\cos(2\pi kn/N) - i \cdot \sin(2\pi kn/N)], \end{aligned}$$

Need to shift our thinking to discretized data; **frequency bins instead of continuous smooth sinusoids**

Estimating the PSD

Step 1: Apply a window to your data (if it's linear! as a time series is) to prevent **spectral leakage** from the assumption the signal is periodic.



Estimating the PSD

A single windowed FFT is unbiased (i.e. will give the correct mean PSD), but has **high variance**.

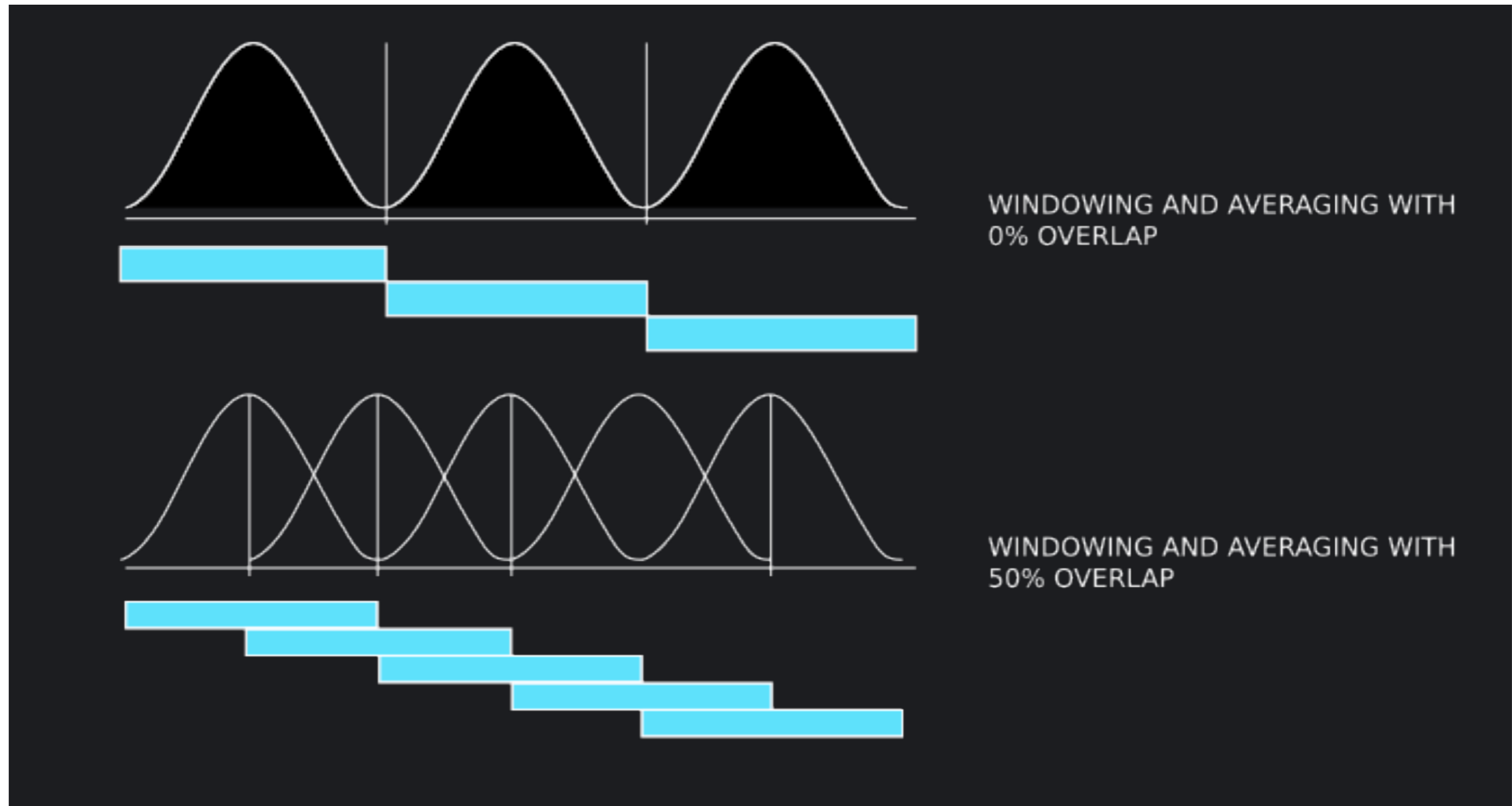
Solution: average several FFTs!

Step 2: Divide your data into shorter time segments; take a windowed FFT of each, and average these together.

Note you lose some frequency resolution this way.

Welch's method averages the mean value for each frequency bin across FFTs, with some overlap in the data analyzed.

Averaging FFTs

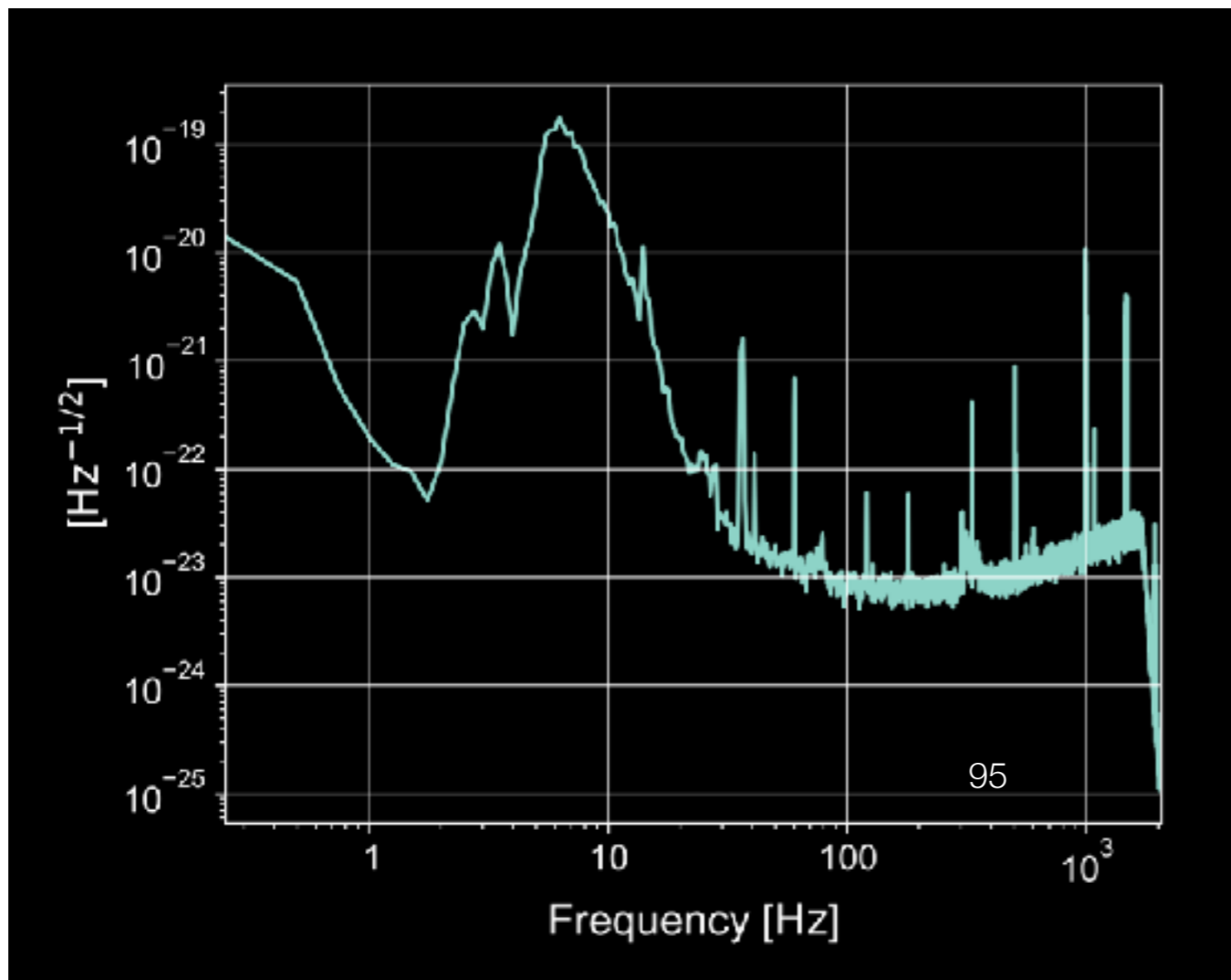


Signal processing with GWpy

GWpy provides **FFT wrappers** to estimate frequency-domain content of data:

FFT length (s)  Overlap between averages (s) 

```
>>> asd = data.asd(4, 2)
```



Can also specify:

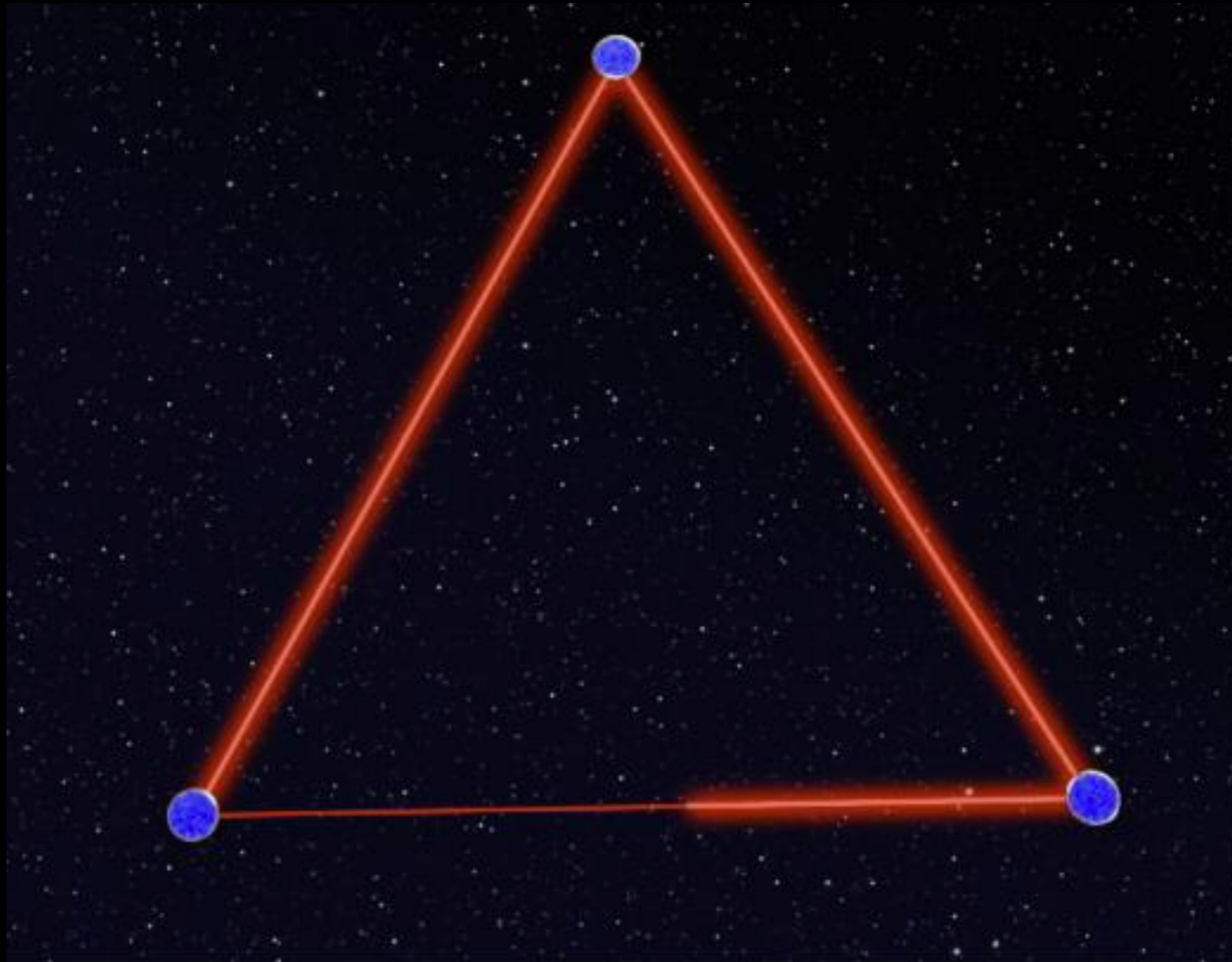
Time window
(default = Hanning)

Averaging method
(default = Welch)

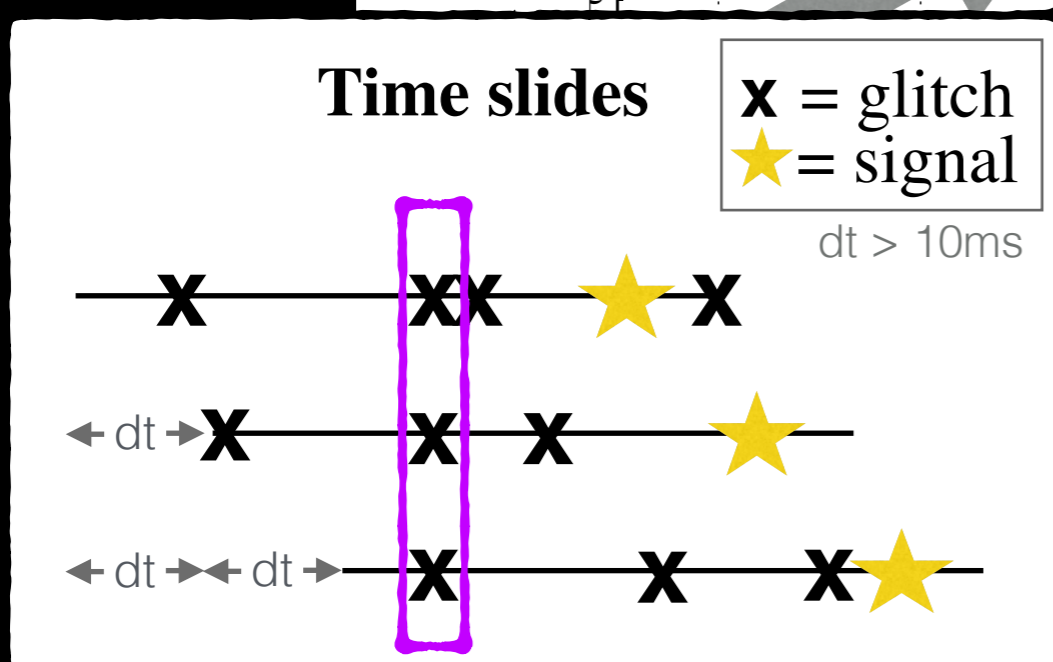
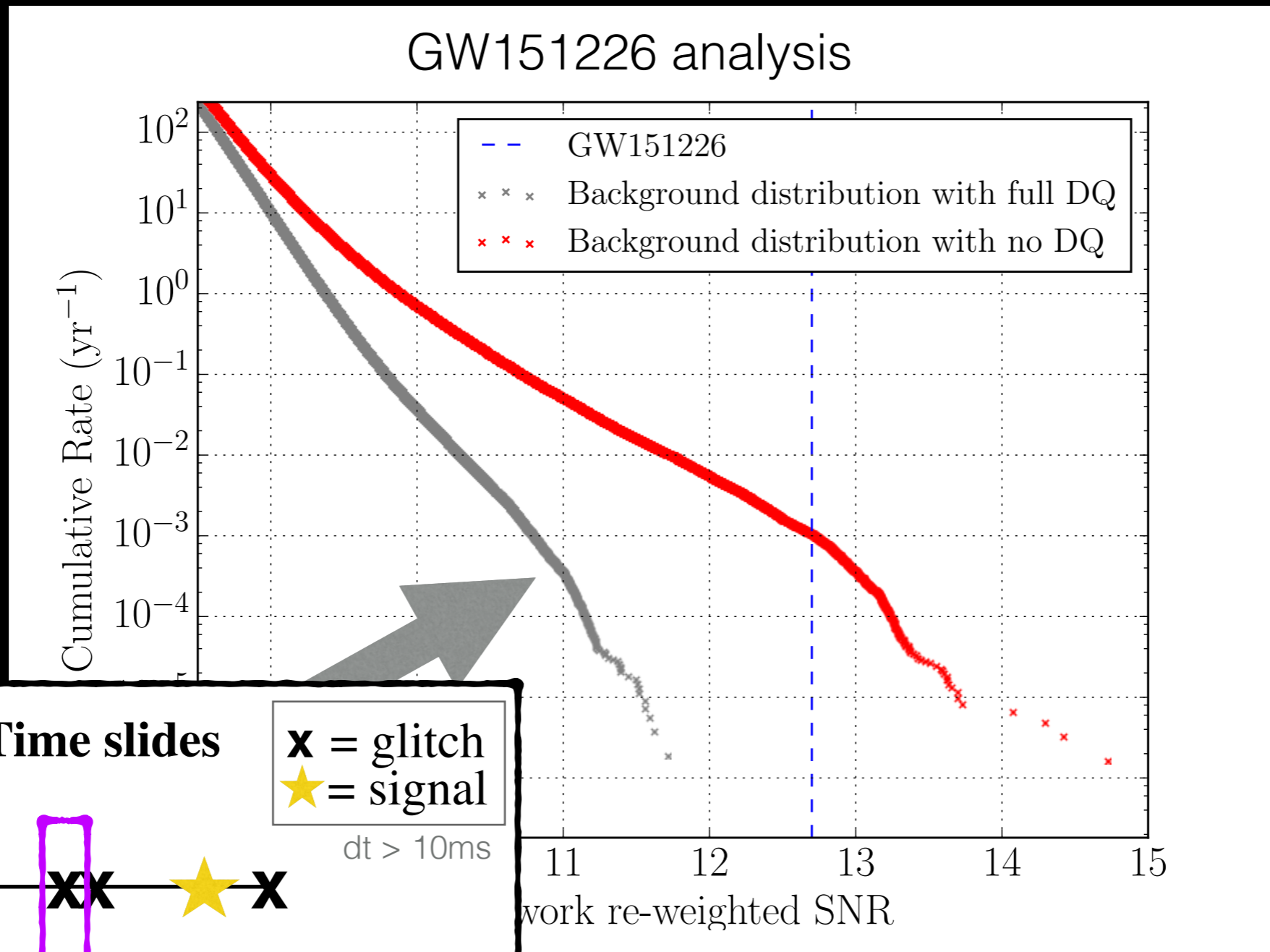
The LISA mission



Beyond terrestrial detectors



The significance of a detected event



B.P Abbott et al. CQG (2018)

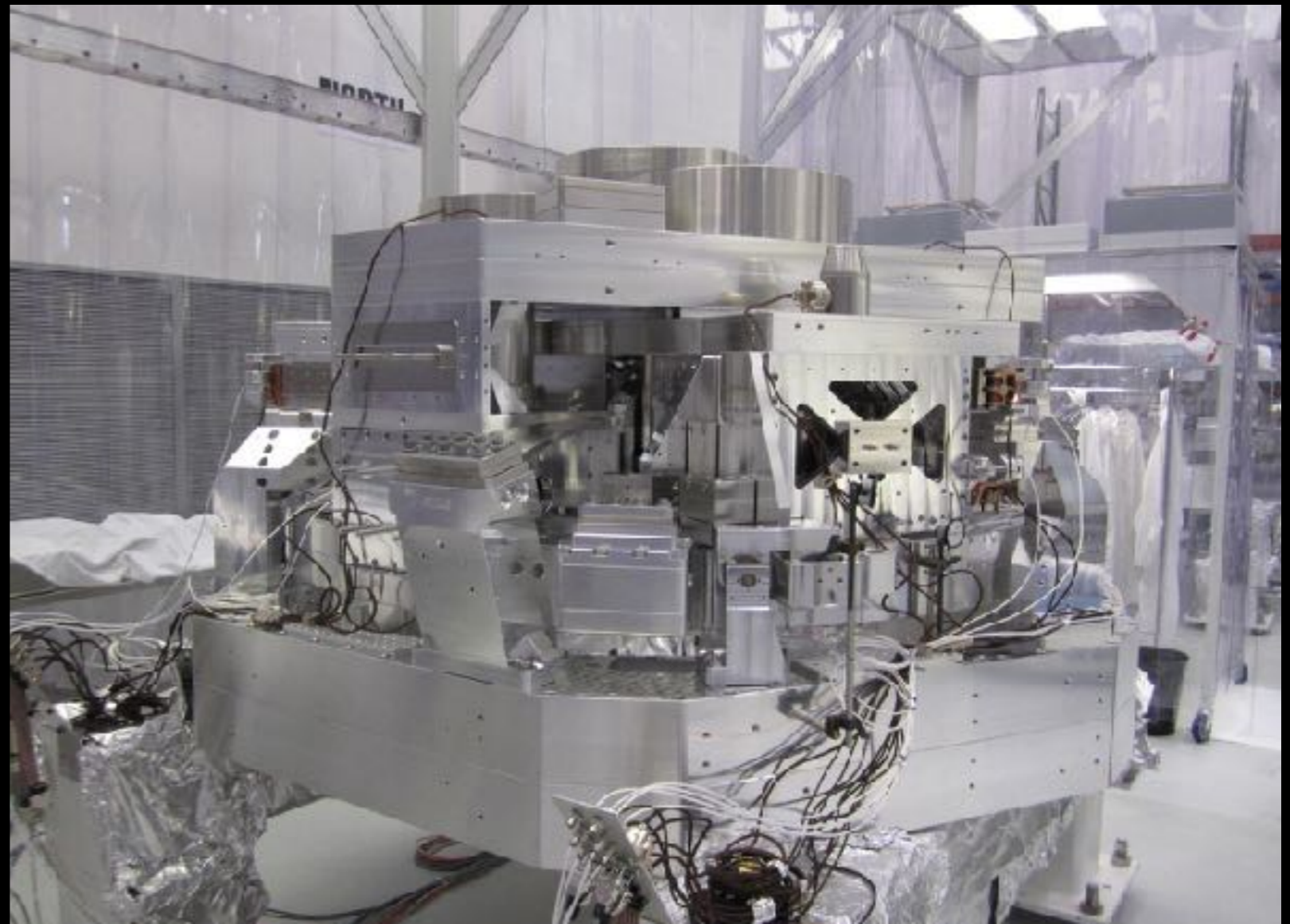
Dynamics of dead stars



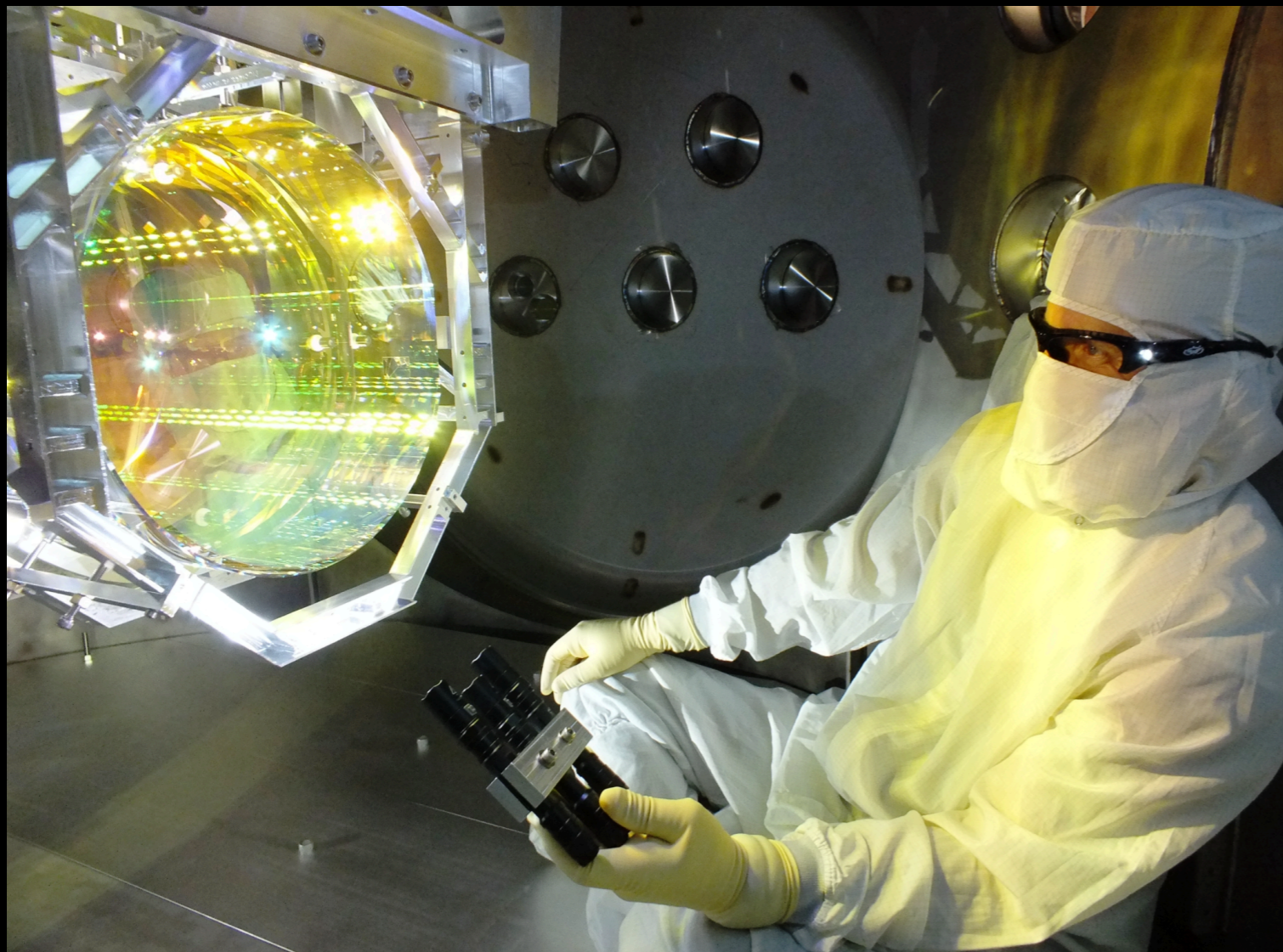
Seismic isolation: active isolation



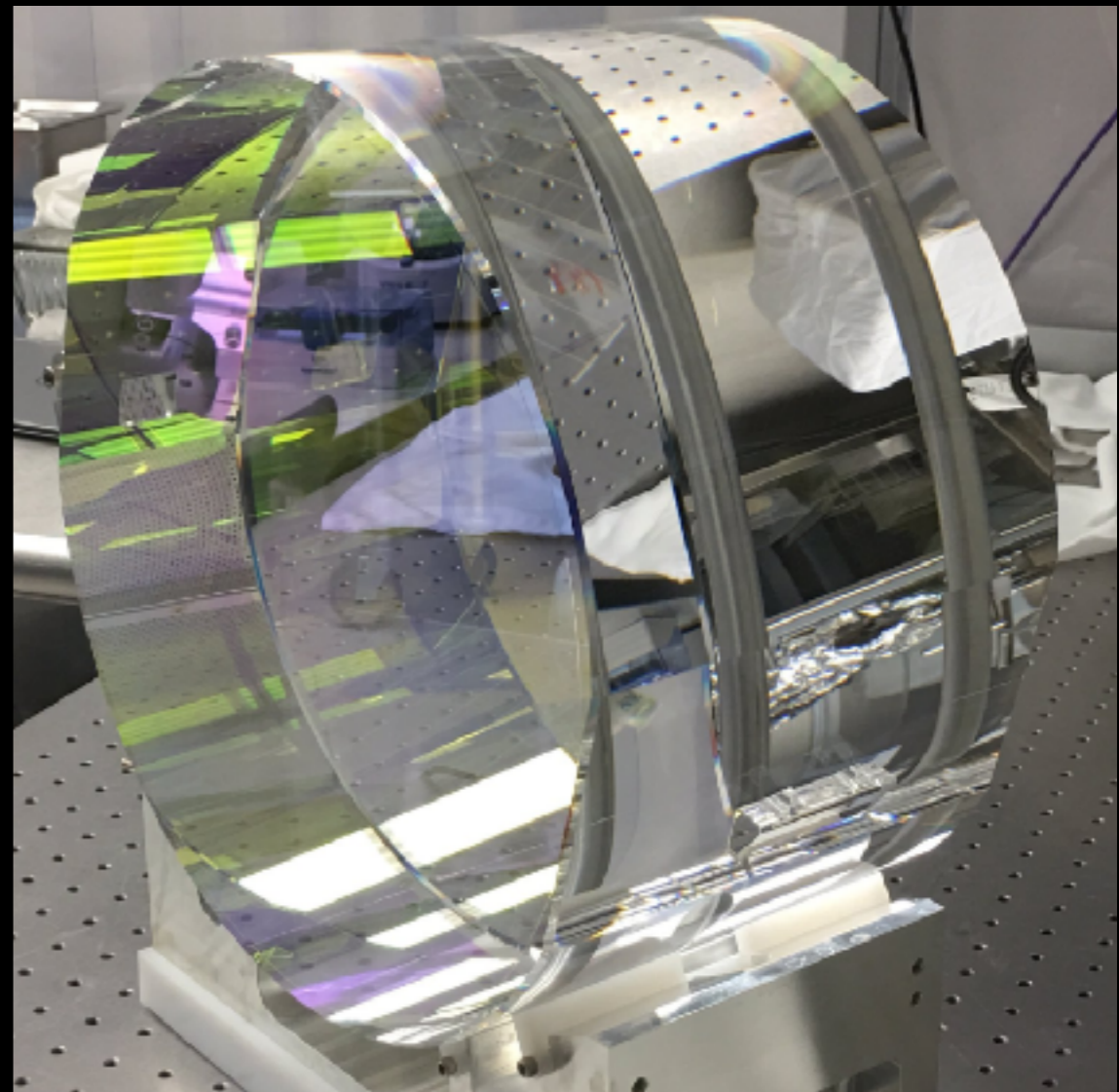
LIGO/Caltech



Advanced LIGO optics



M. Heintze



K. Toland

The Advanced LIGO input laser



How sensitive is the LIGO experiment?

