



The Gravitational wave search



COST ACTION CA17137
A NETWORK FOR GRAVITATIONAL
WAVES, GEOPHYSICS AND
MACHINE LEARNING

Elena Cuoco, EGO

Action Chair <https://www.cost.eu/actions/CA17137>

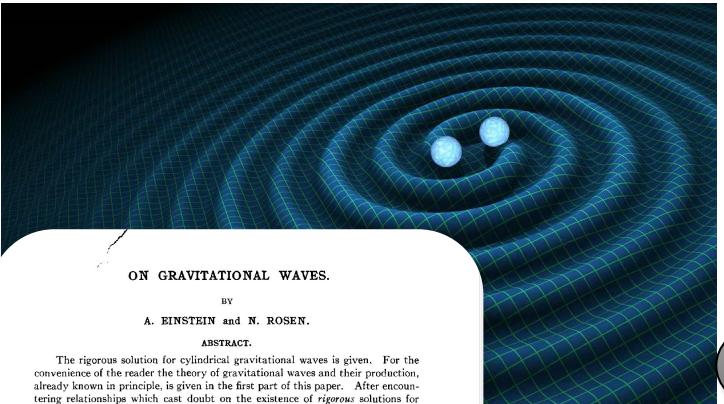
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What are Gravitational Waves (GWs)?



ON GRAVITATIONAL WAVES.

BY

A. EINSTEIN and N. ROSEN.

ABSTRACT.

The rigorous solution for cylindrical gravitational waves is given. For the convenience of the reader the theory of gravitational waves and their production, already known in principle, is given in the first part of this paper. After determining relationships which cast doubt on the existence of rigorous solutions for undulatory gravitational fields, we investigate rigorously the case of cylindrical gravitational waves. It turns out that rigorous solutions exist and that the problem reduces to the usual cylindrical waves in euclidean space.

I. APPROXIMATE SOLUTION OF THE PROBLEM OF PLANE WAVES AND THE PRODUCTION OF GRAVITATIONAL WAVES.

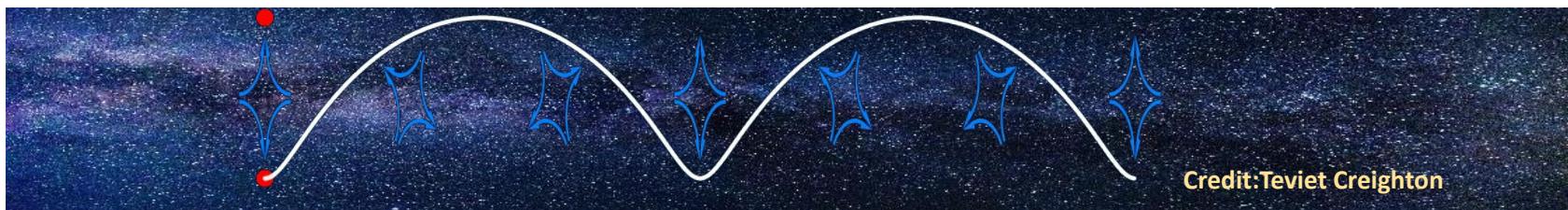
It is well known that the approximate method of integration of the gravitational equations of the general relativity theory leads to the existence of gravitational waves. The method used is as follows: We start with the equations

$$R_{\mu\nu} - \frac{1}{2}g_{\mu\nu}R = -T_{\mu\nu}. \quad (1)$$

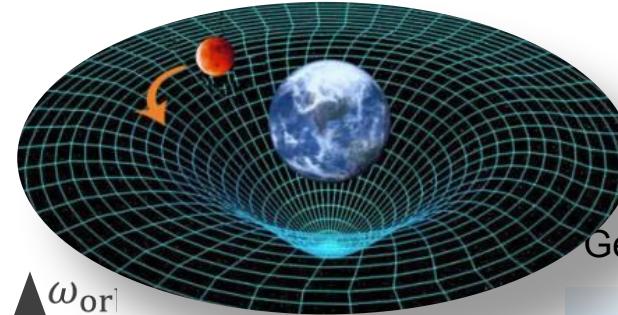
We consider that the $g_{\mu\nu}$ are replaced by the expressions

$$g_{\mu\nu} = \delta_{\mu\nu} + \gamma_{\mu\nu}, \quad (2)$$

Gravitational Waves (1916)



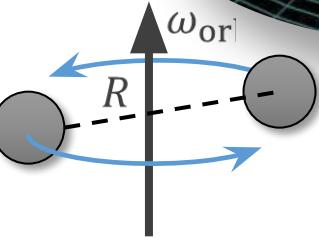
Credit: Teviet Creighton



More in the next lectures

General Relativity (1915)

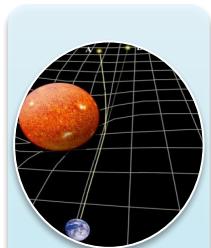
$$G_{\mu\nu} = \frac{8\pi G}{c^4} T_{\mu\nu}$$



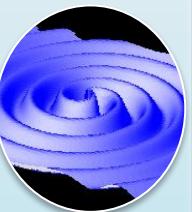
Free propagation along “z-axis” in vacuum ($T_{\mu\nu} = 0$):

$$\square h_{\mu\nu} = 0 \Rightarrow h_{\mu\nu}(t, z) = h_{\mu\nu} e^{i(kz - \omega t)} \quad \text{with } \omega/c = k$$

a long history...started 100 years ago



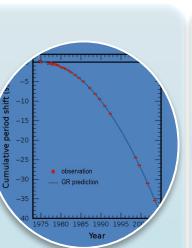
1915
•• General Relativity



1916
•• Gravitational Waves



1966
•• Weber and Resonant Bars



1974
•• Hulse-Taylor r:Observing the pulsar binary PSR B1913+16



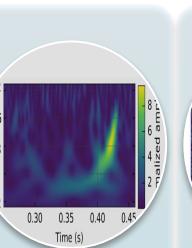
1980-1990
•• Cryogenic Resonant Bars



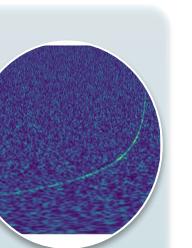
1993
•• The approval of Virgo Experiment



1999+
•• Data taking from LIGO and Virgo

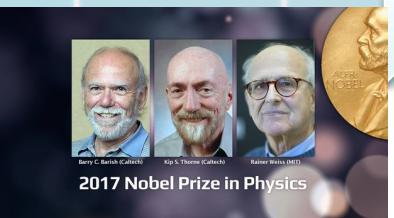


2015
•• GW BHBH detection



2017
•• BNS detection: Multi-messenger Astronomy

~100 years

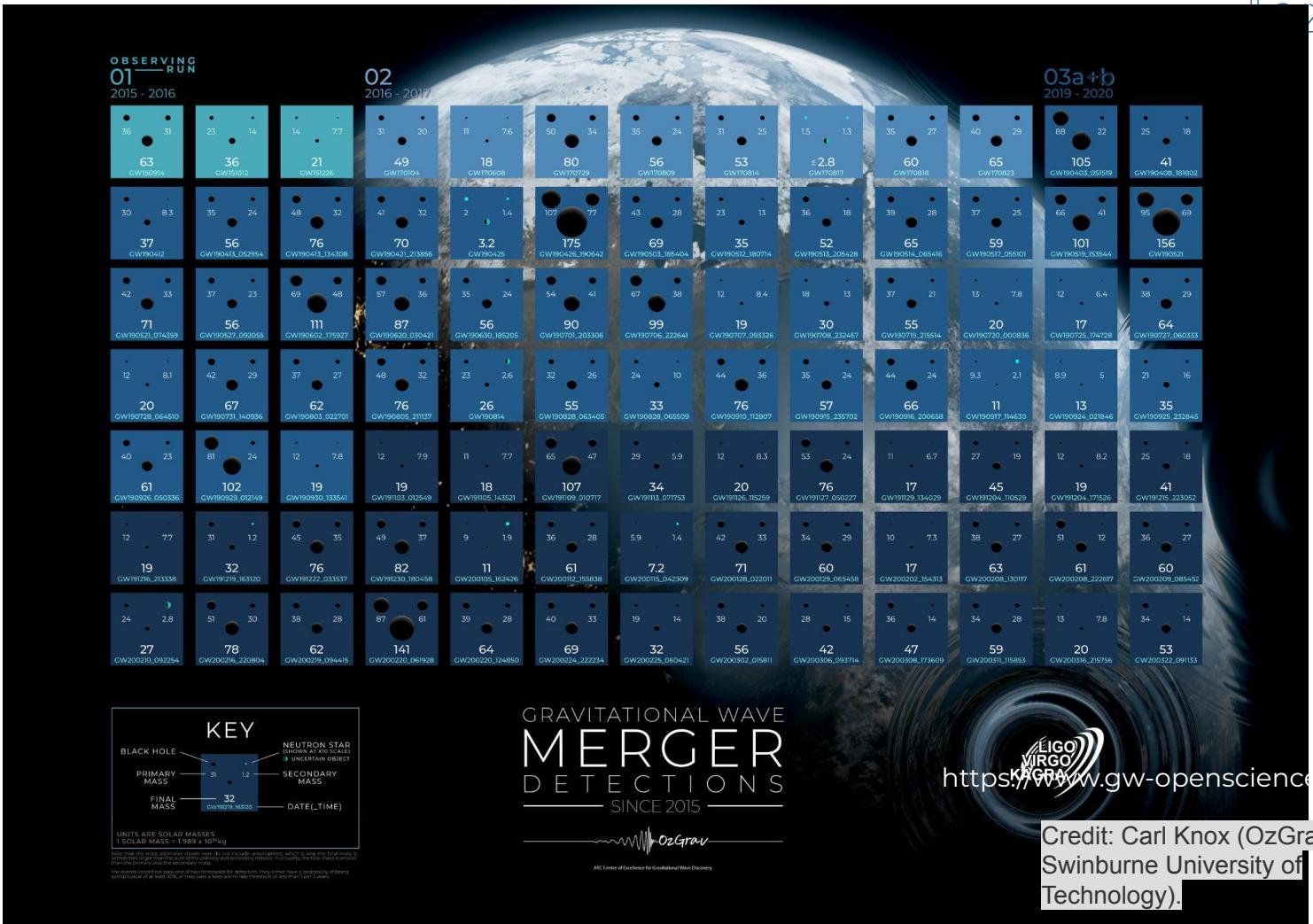


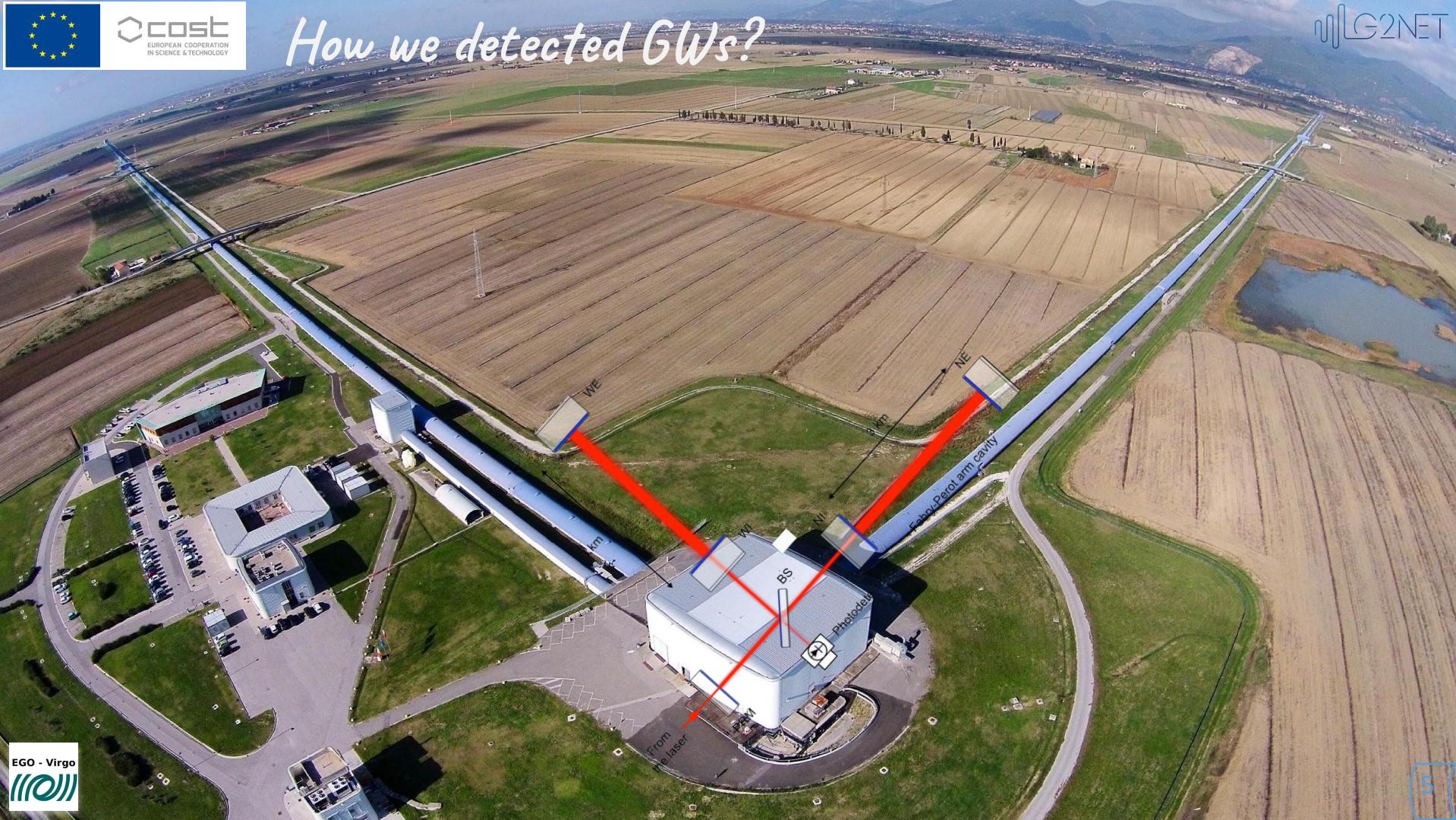
2017 Nobel Prize in Physics



So Far...

91 events!!!





How we detected GWs?

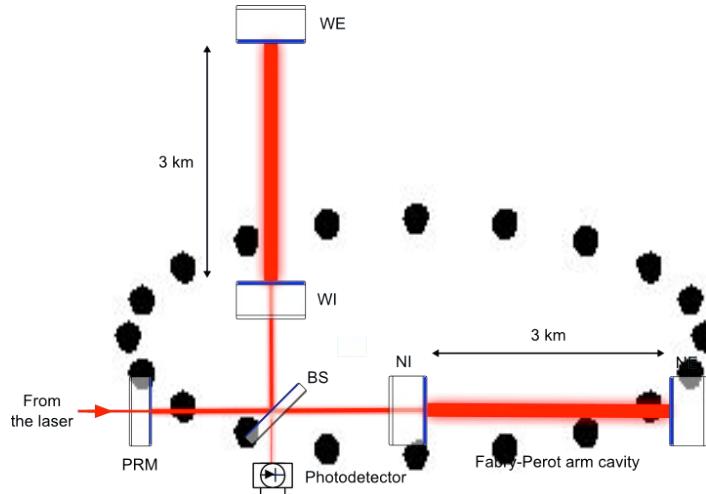
GW detectors: a simple Michelson interferometer

1. Laser light is split in two orthogonal paths by a **beam-splitter** (BS). These are reflected back toward the BS by mirrors at the ends of the arms;
2. When recombined at the BS, they interfere. If the arms are exactly the same length (up to $n\lambda_L$), the light returns entirely toward the laser: **destructive interference**;
3. If the arms differ by an amount that is not an integer number of wavelengths, then the destructive interference will be incomplete: light passes to the **photodiode** (PD)

Estimated sensitivity (I):

$$h \approx \frac{\Delta L}{L} \sim \frac{\lambda_L}{L} \sim 10^{-9}$$

Nd:YAG laser:
 $\lambda_L = 1064 \text{ nm}$

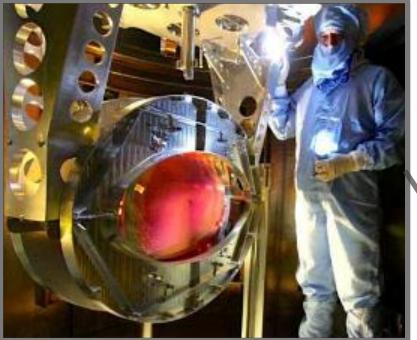
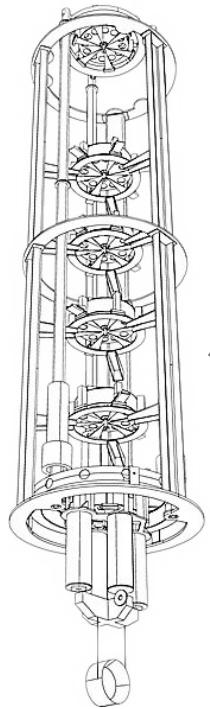




How we detected GWs?



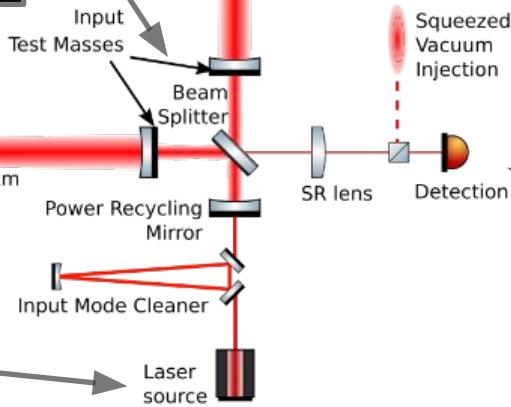
The Advanced Virgo detector



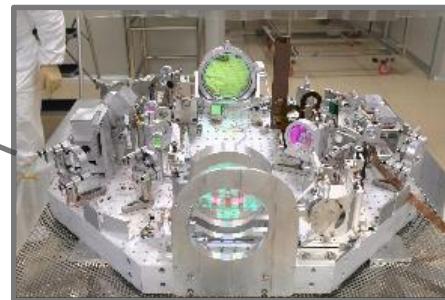
West End Test Mass



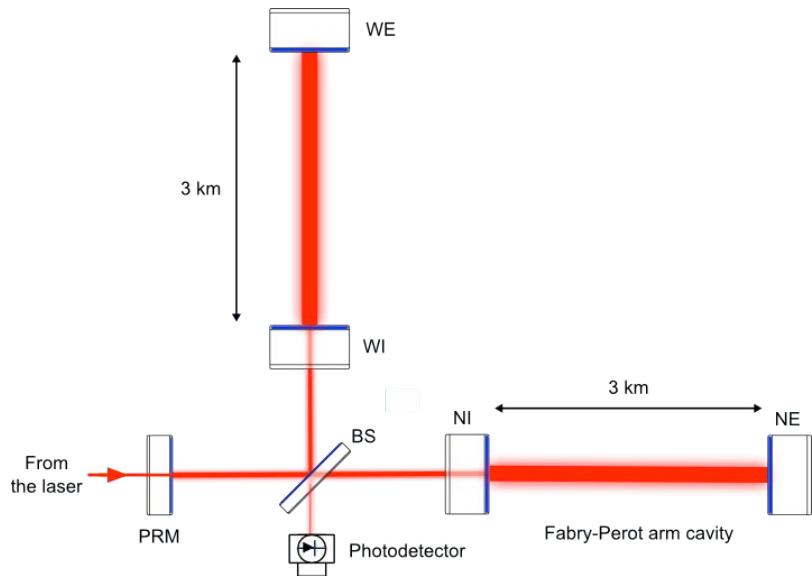
West arm , 3km



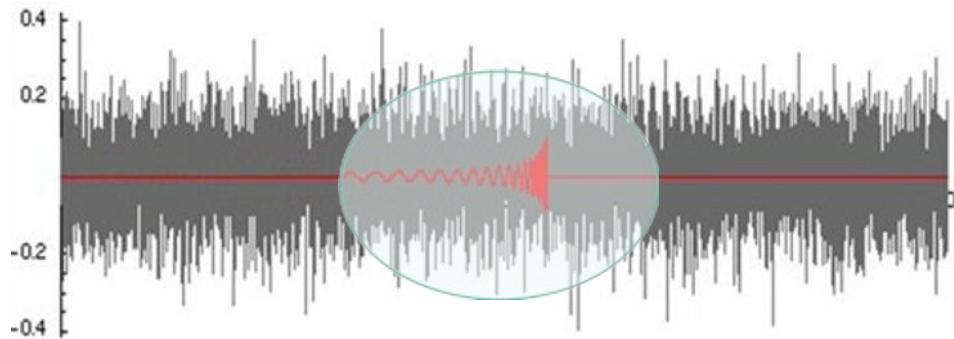
North Arm , 3km



GW detector data



Time series sequences... noisy time series with low amplitude GW signal buried in



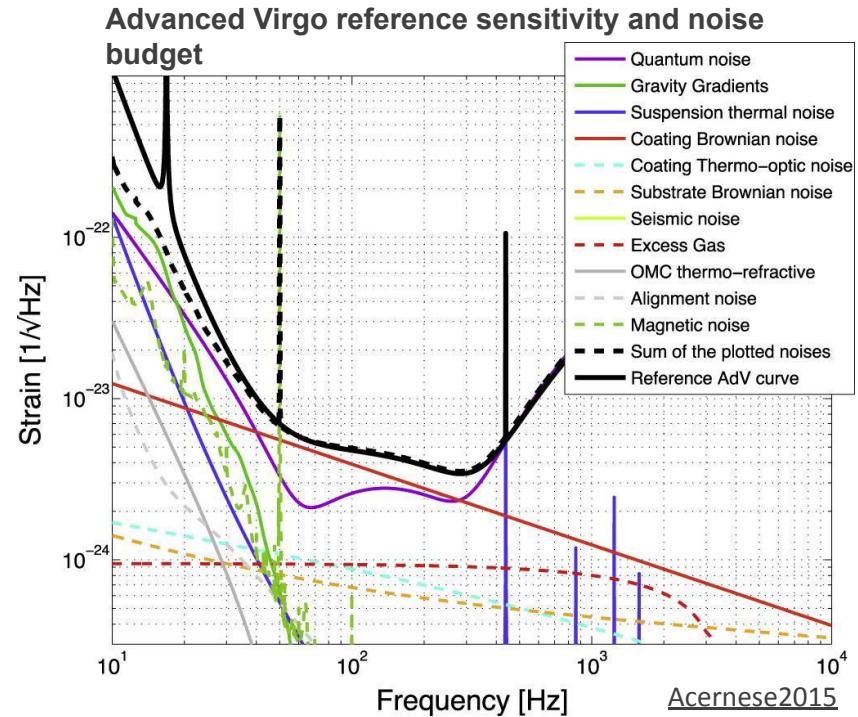
Frequency dependent strain sensitivity

Detector noise is conveniently described as a stochastic process. Its dominant contributions can be overall assumed to be stationary and Gaussian.

- ⇒ Its statistical properties are fully characterized by its correlation matrix, or, equivalently, by the Power Spectral Density (PSD);
- ⇒ Its Amplitude Spectral Density (ASD, square root of the PSD) provides a frequency-dependent measure of the detector sensitivity.

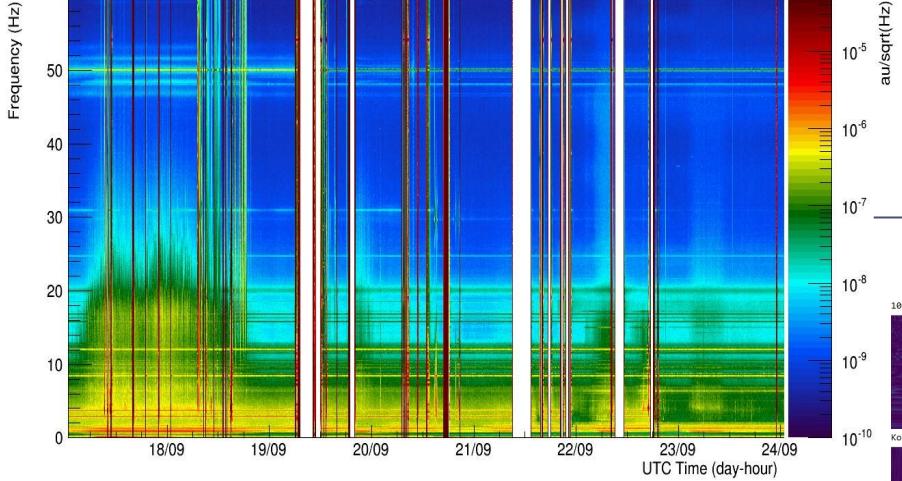
Noise sources and limitations to the sensitivity

- **Fundamental noises:** from the physical limitation of the detection principle and its implementation (continuous lines);
- **Technical noises:** from the actual implementation of the detector with components that are *not optimal*, have imperfections (dashed lines, only for \sim stationary ones);



Detector Noise

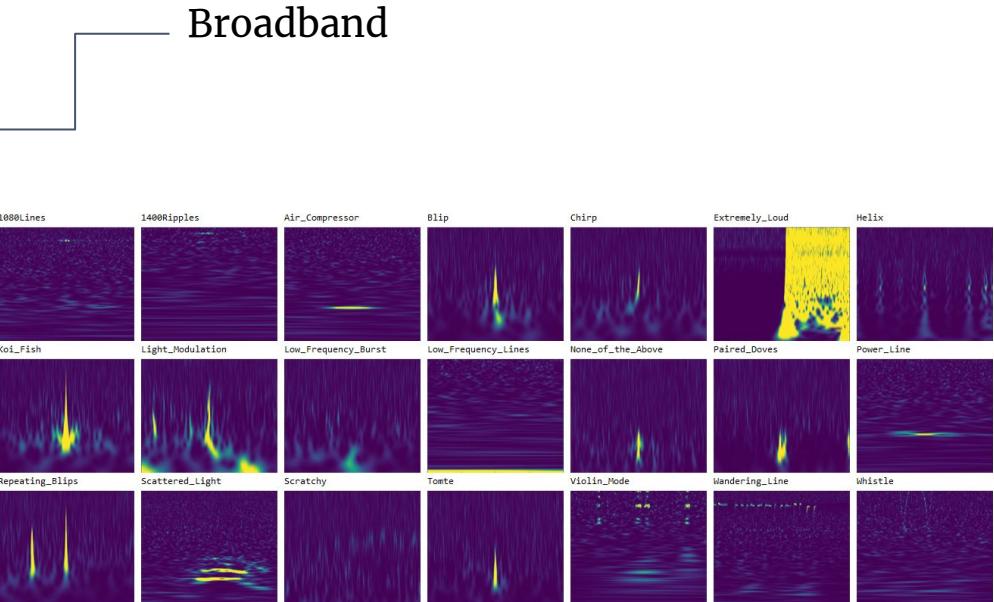
Spectrogram of V1:spectro_LSC_DARM_300_100_0_0 : start=1189644747.000000 (Sun Sep 17 00:52:09 2017 UTC)



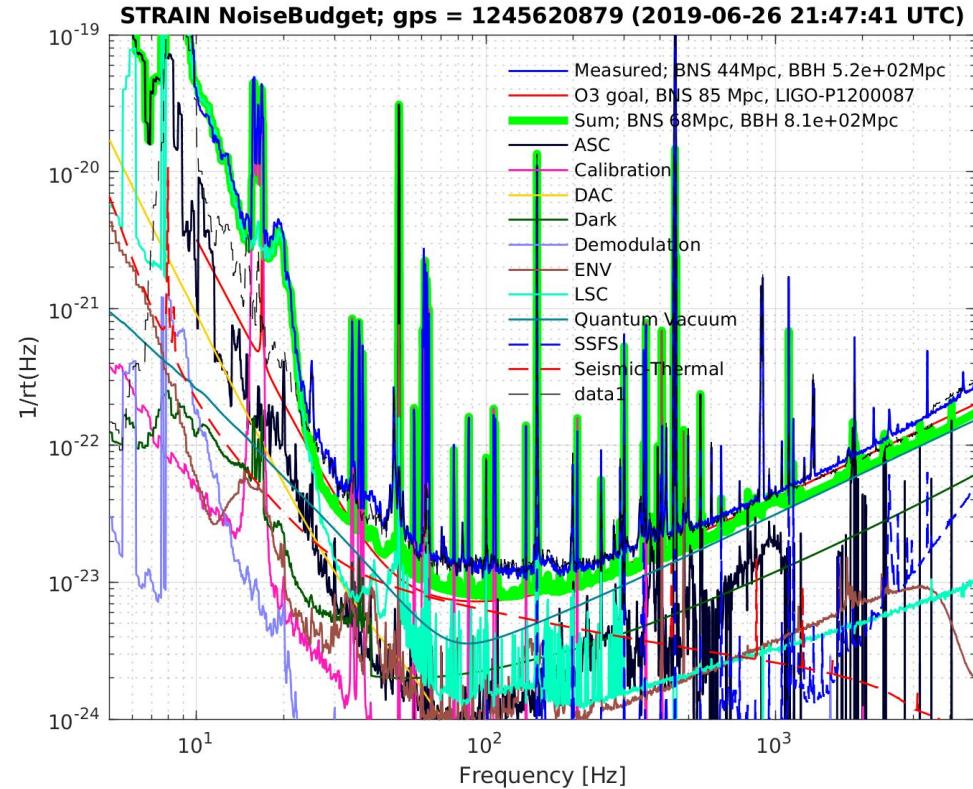
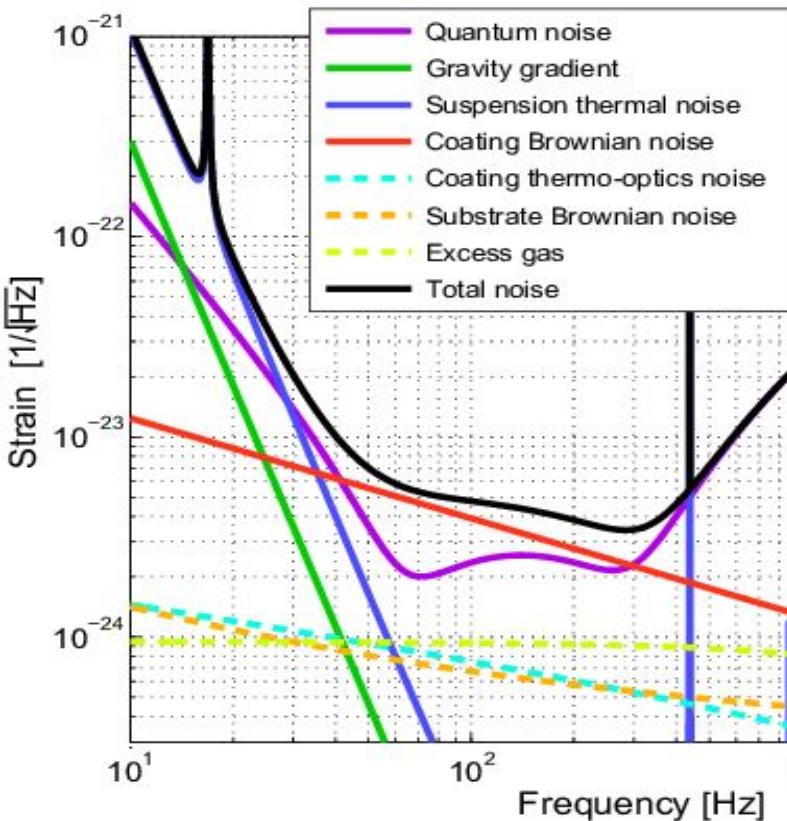
Broadband



Glitches

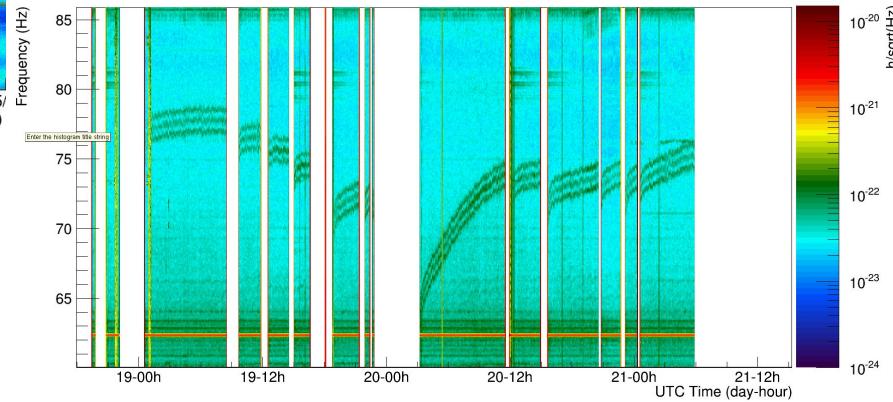
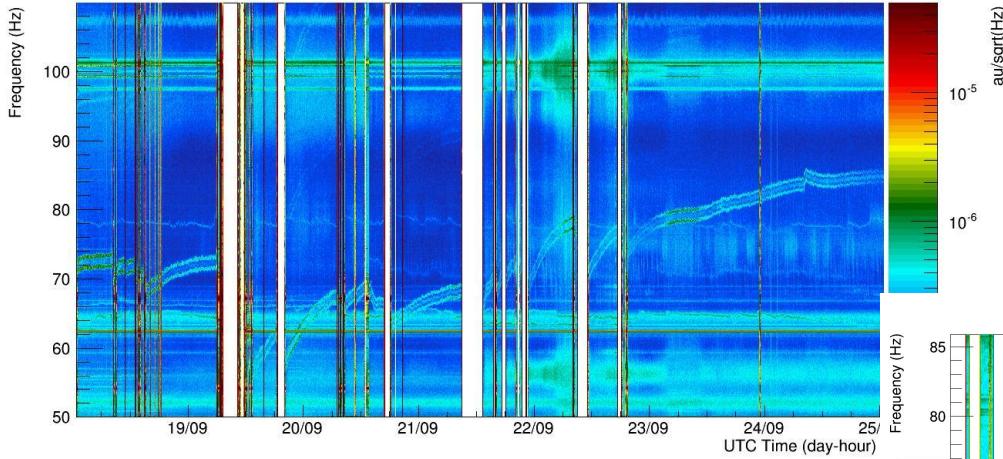


Noise budget: fundamental vs. actual

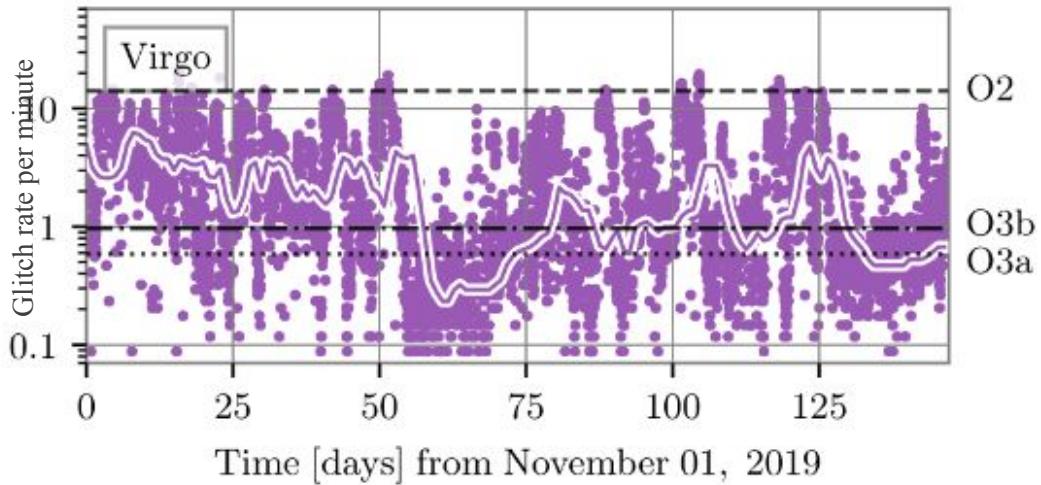


Non linear noise...

Here Machine Learning can help

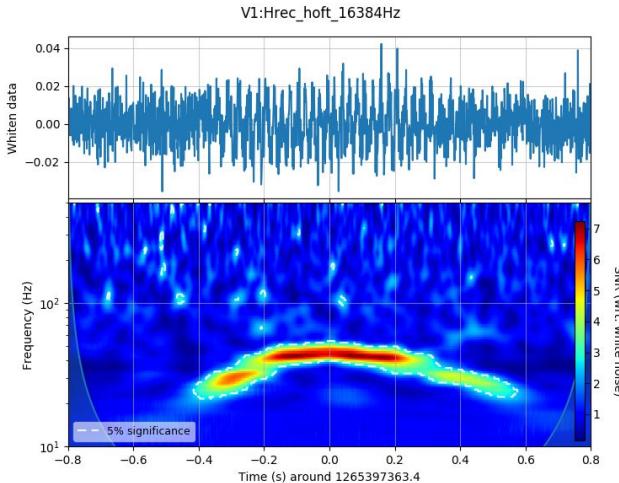


Non-stationary and transient noise



Here Machine Learning can help

Example of Scattered light glitch



The matched filter technique and the BNS range

Additive noise model:

$$\underbrace{x(t)}_{\text{detector data}} = \underbrace{n(t)}_{\text{noise}} + \underbrace{s(t)}_{\text{signal}}$$

Signal model:

$$s(t) \approx \varrho h(t)$$

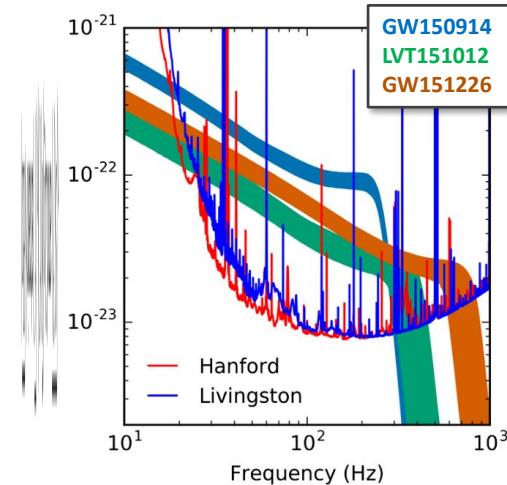
with ϱ the amplitude and $h(t) = h(t; \boldsymbol{\theta})$ the waveform model ($(\mathbf{h}|\mathbf{h}) = 1$).

Optimal detection statistic: likelihood ratio, in **stationary** and **Gaussian noise** equivalent to:

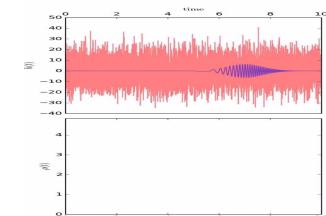
$$(x|\mathbf{h}) = 4 \Re \int_0^\infty \frac{\tilde{x}(f)\tilde{h}^*(f)}{S(f)} df$$

Compact binary inspiral range [[Bassan2014](#)]:

$$\frac{d_{\text{range}}}{1 \text{ Mpc}} = \frac{1}{2.26} \times 1.95 \times 10^{-20} \left(\frac{\mathcal{M}}{M_\odot} \right)^{5/6} \sqrt{\int_{f_{\min}}^{f_{\text{ISCO}}} \frac{f^{-7/3}}{S(f)} df}$$



[Phys. Rev. X 6, 041015](#)



International Collaboration: ground based detectors



LIGO Scientific Collaboration:

- 1263 collaborators (including GEO)
- 20 countries
- 9 computing centres
- ~1.5 G\$ of total investment

Virgo Collaboration:

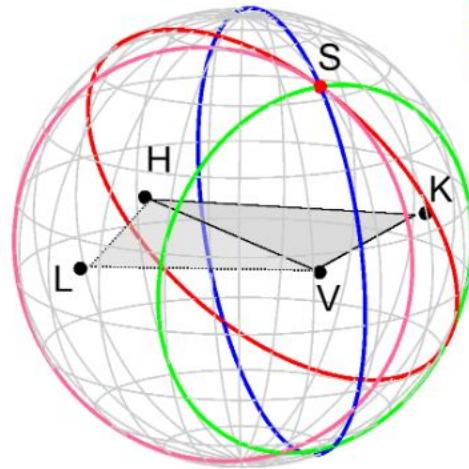
- 343 collaborators
- 6 countries
- 6 computing centres
- ~0.42 G€ of total investment

KAGRA Collaboration:

- 260 collaborators
- 12 countries
- 5 computing centres
- ~16.4 G¥ of construction costs

Why more than 1 detector?

- Source localization using only timing for a two-site network yields an annulus on the sky.
- For three detectors, the time delays restrict the source to two sky regions which are mirror images with respect to the plane passing through the three sites.
- With four or more detectors, timing information alone is sufficient to localize to a single sky region, and the additional baselines help to limit the region to under 10 deg² for some signals.

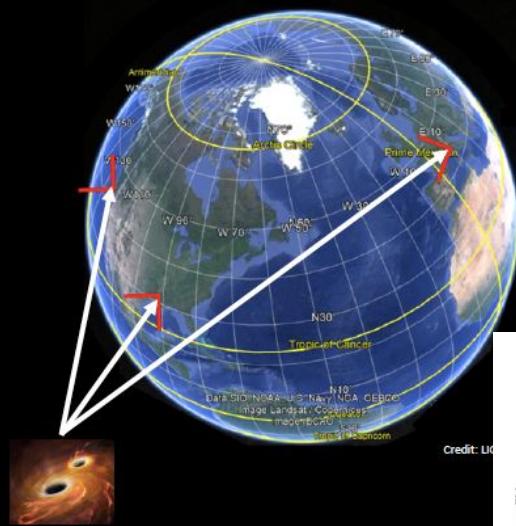


HL
HV
LK
KV

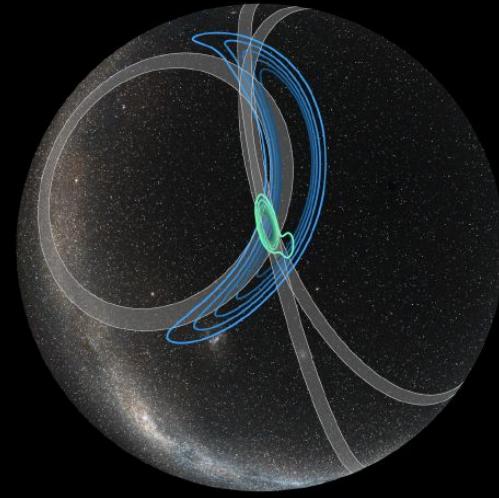
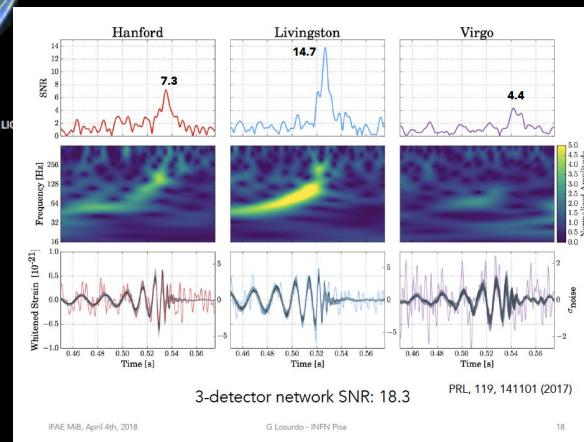
arXiv:1304.0670

- 2 detector → 100 - 1000 deg²
- 3 detector → 10 - 100 deg²
- 4 detector → < 10 deg²

GW170814: The first triple detection



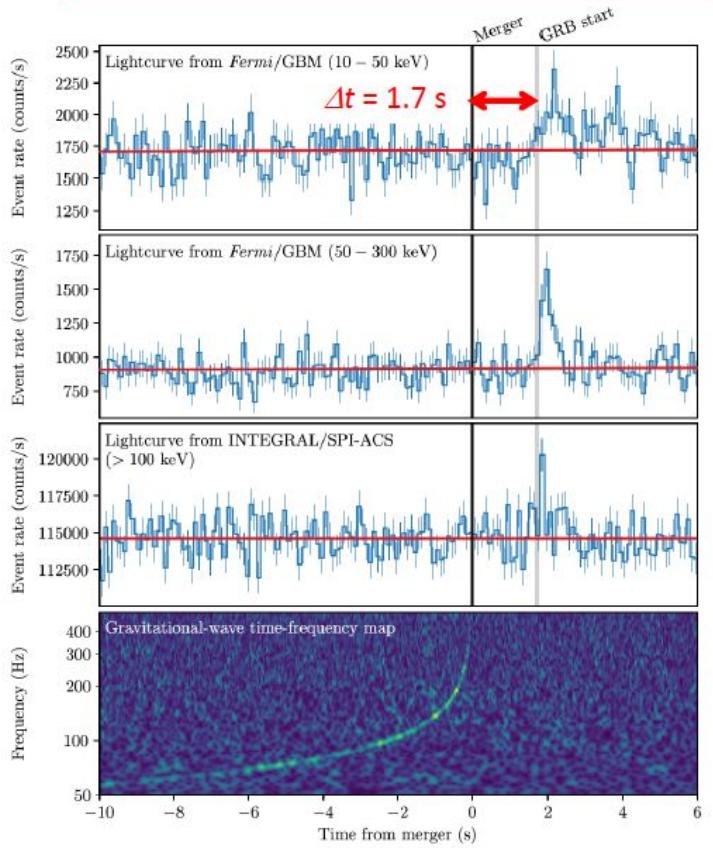
Virgo observed its first BBH coalescence ,GW170814



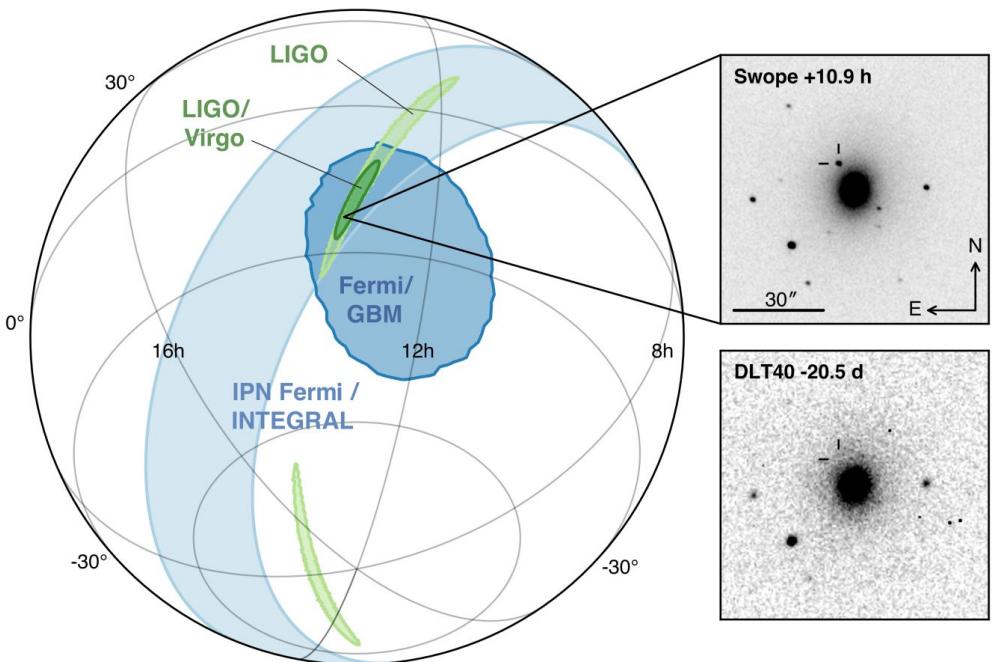
Credit: Leo Singer

LH 1160 square degrees
LHV 60 square degrees

Phys. Rev. Lett. 119, 141101 (2017)



GW170817: 17 August 2017, 12:41:04 UT: The Multi-Messenger Astronomy

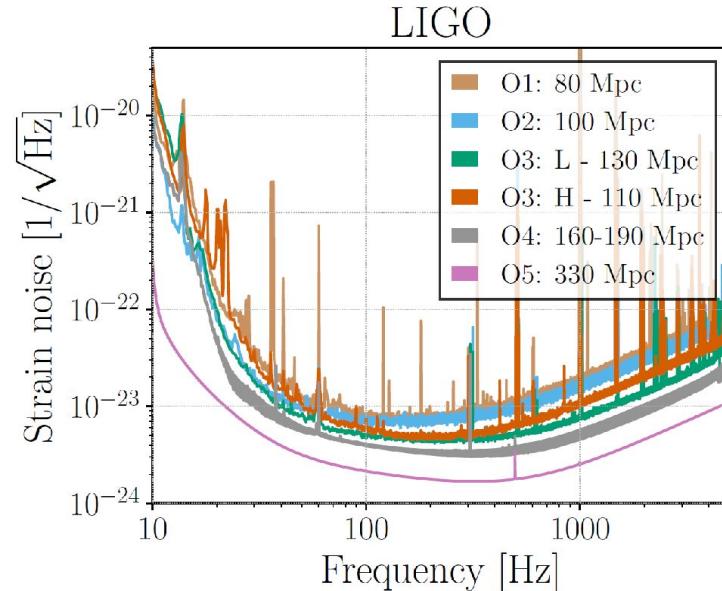
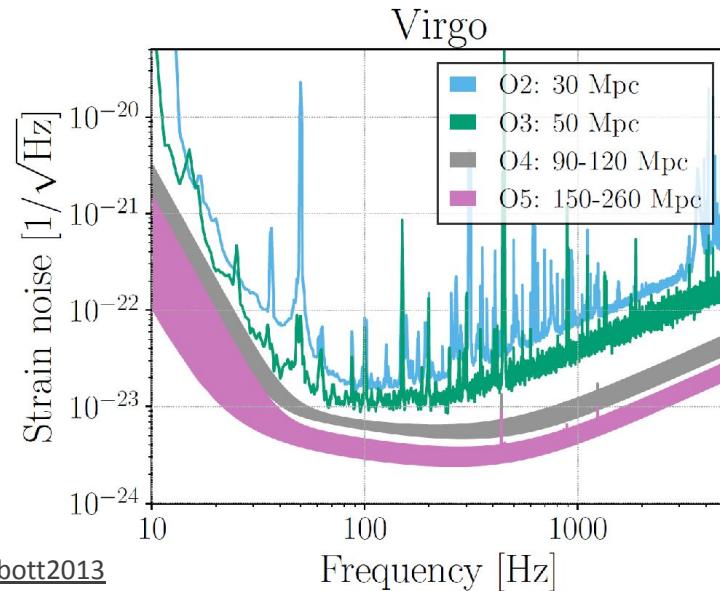


B. P. Abbott et al. (LIGO Scientific Collaboration and Virgo Collaboration)
Phys. Rev. Lett. 119, 161101 – Published 16 October 2017

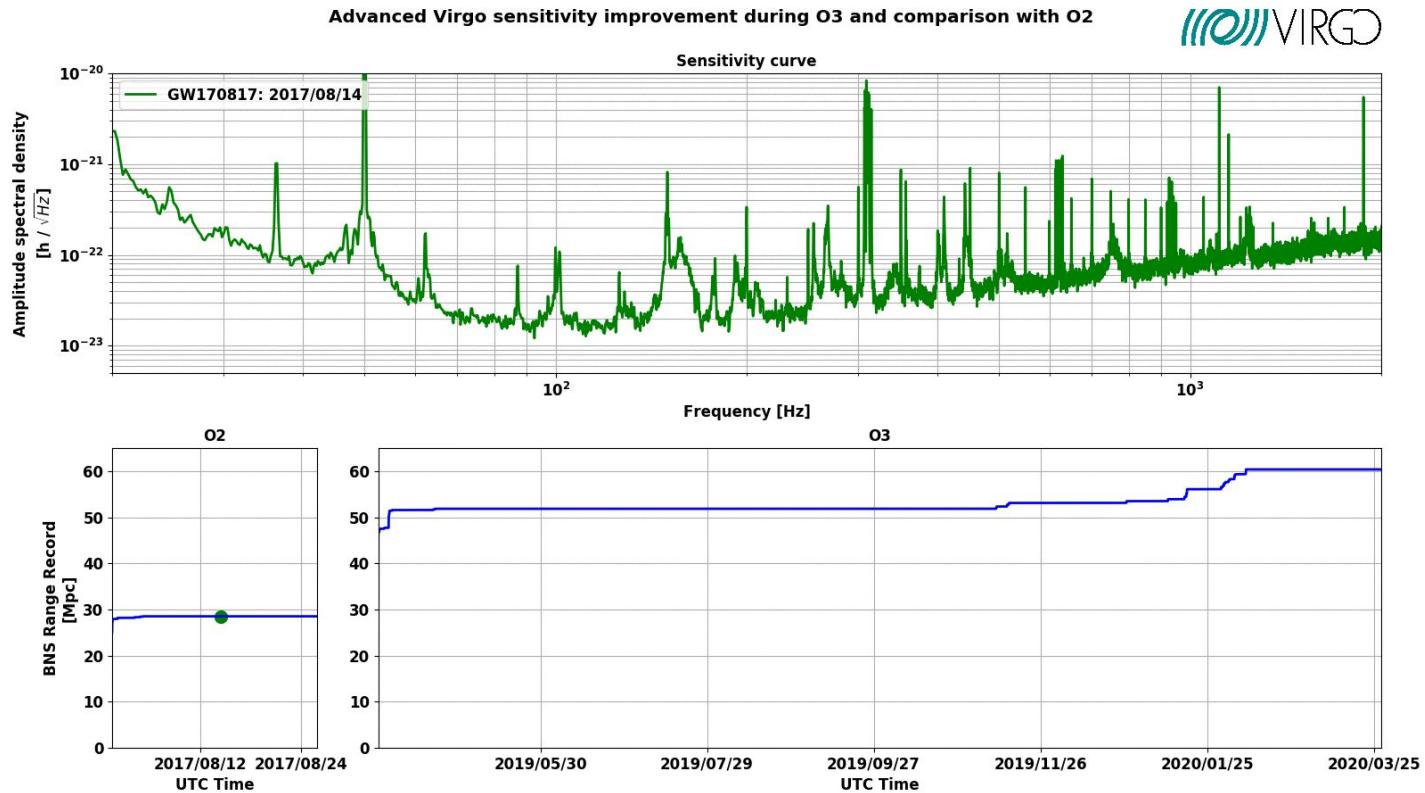
Detector sensitivities and their evolution

“Spikes” (spectral lines) in the strain sensitivity include technical noises not included in the noise budget at the previous page;

“Bumps” are usually a symptom of non-stationary or non-linear contributions to the noise.

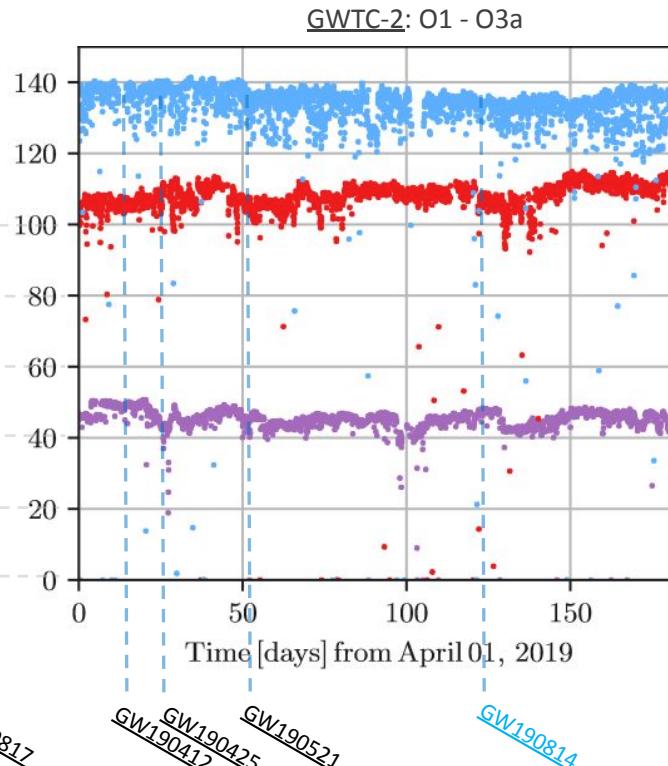
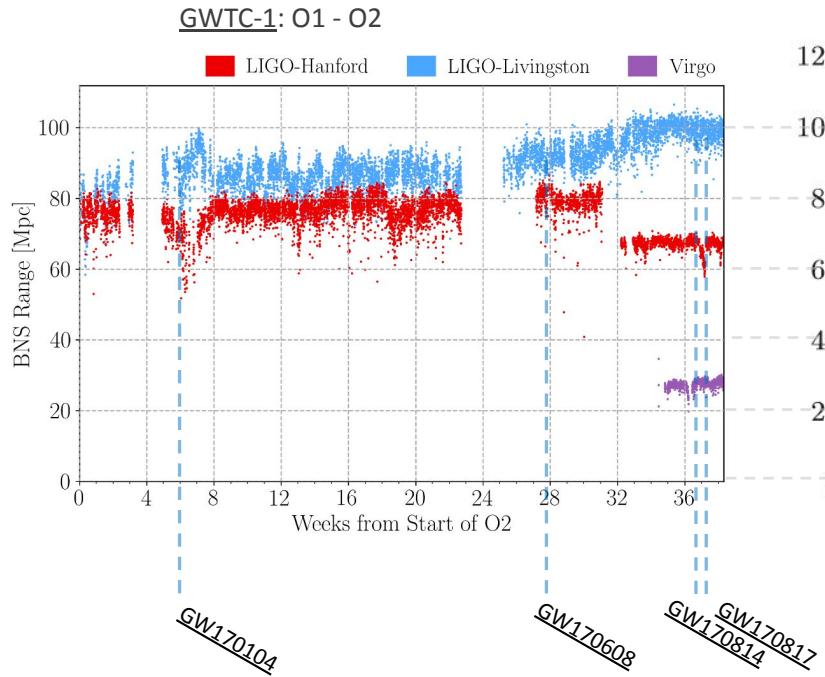


Advanced Virgo sensitivity from O2 to O3b



Increase in BNS range from O2 to O3a

Gravitational Wave Transient Catalog (GWTC): updated lists with all the GW transient detections are regularly published in the forms of catalogs.



The effective BNS Volume

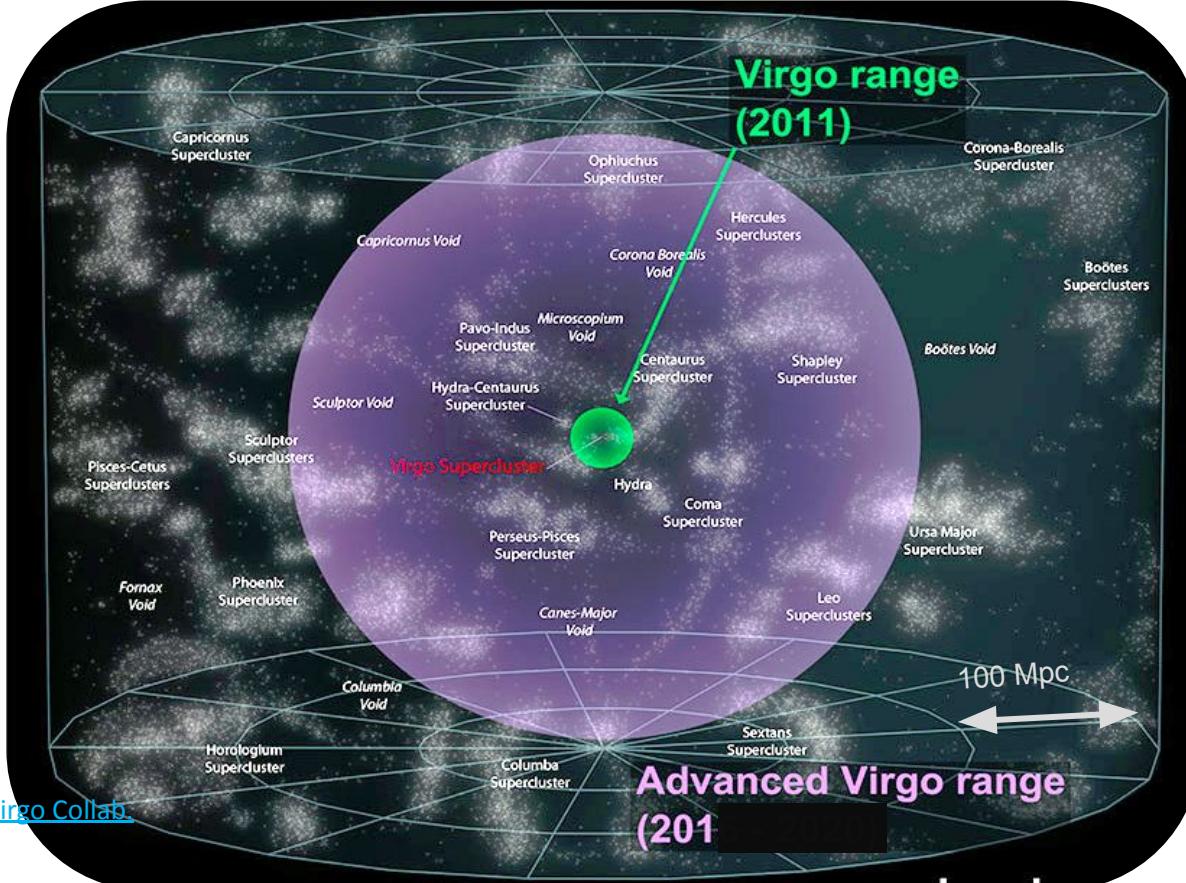


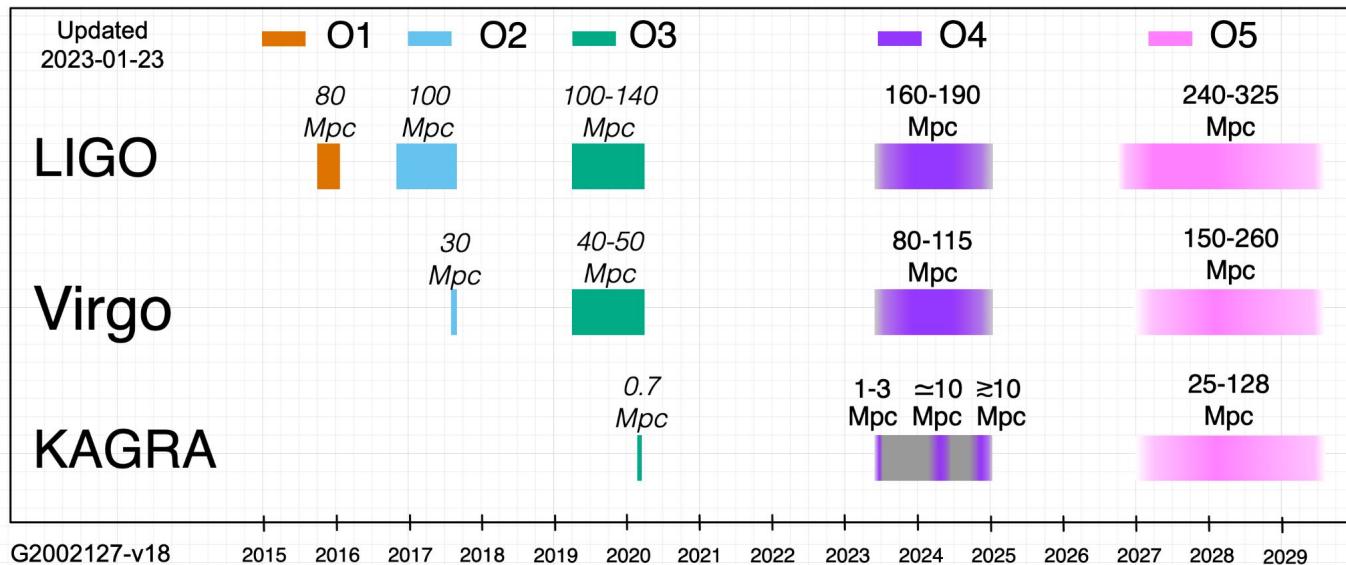
Image Credit: [Virgo Collab.](#)

Quantifying the detector performance

The detector strain sensitivity is the minimum *detectable* value of the strain produced by an incoming GW:

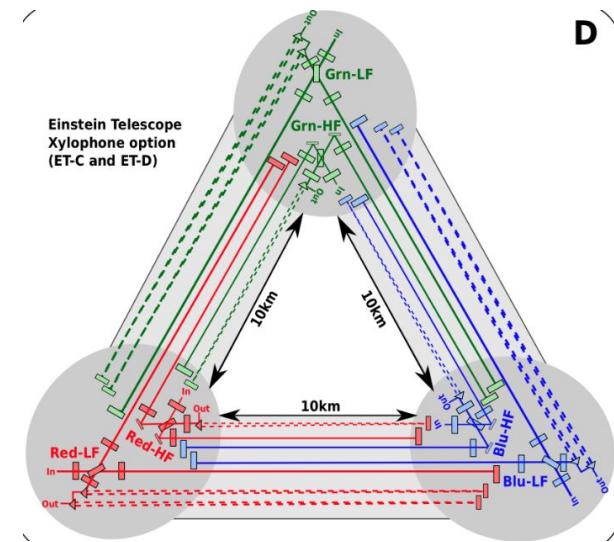
⇒ It is determined by the detector noise.

BNS inspiral range: the distance, averaged over GW polarizations and directions in the sky, at which a single detector can observe with matched-filter Signal-to-noise Ratio (SNR) of 8 the inspiral of two neutron stars.



The European 3G idea

In Europe we developed the idea of a 3G GW observatory



The Einstein gravitational-wave Telescope (ET)

ET [7] is a concept for a third generation gravitational-wave *observatory* likely with a location in Europe. To reduce the effects of seismic motion, the ET concept calls for the site to be located at a depth of about 100 m to 200 m below ground. In its final configuration it shall be arranged as an equilateral triangle of three interlaced detectors, each consisting of two interferometers. The configuration of each detector dedicates one interferometer (ET-LF) to detecting the **Low Frequency** components of the gravitational-wave signal (2–40 Hz), while the other one (ET-HF) is dedicated to the **High Frequency** components. Each interferometer will have a dual-recycled Michelson layout with about 10 km long Fabry-Perot arm cavities. In ET-LF, which operates at cryogenic temperature, thermal, seismic, gravity gradient and radiation pressure noise sources are particularly suppressed; in ET-HF, sensitivity at high frequencies is improved by high laser light power circulating in the Fabry-Perot cavities and the use of frequency-dependent squeezed light technologies.



The European 3G idea

Euregio Meuse-Rhin



SOS Enattos
Sardaigne (Italy)

<https://gwic.ligo.org/3Gsubcomm>

Cosmic Explorer (CE)

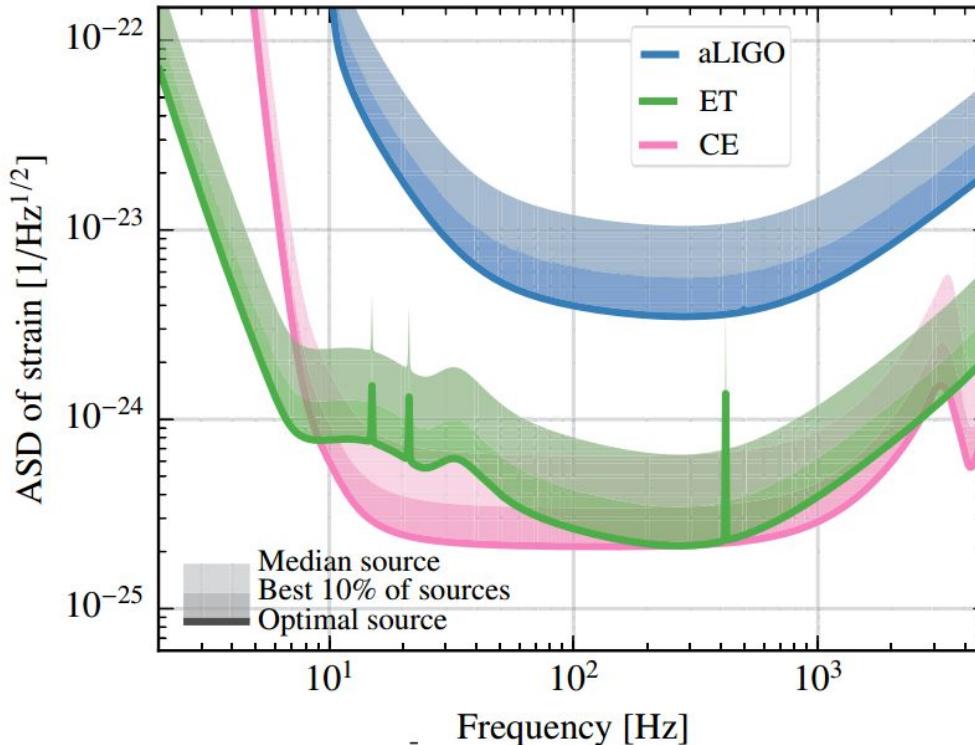
CE [8] is a concept for an L-shaped above-ground observatory with 40 km arm-length, operating a dual recycled Michelson interferometer with Fabry–Perot arm cavities, with possible site location in the US or/and in Australia. Its initial phase, called CE1, will employ scaled-up *Advanced LIGO technology* including 320 kg fused silica test masses, 1.4 MW of optical power, and frequency-dependent squeezing. A major upgrade, CE2, will exploit the full potential of the new facility by using *Voyager technology* such as silicon test masses and amorphous silicon coatings operating at 123 K, with 1.5 or 2 μm laser light and 3 MW of optical power in its arm cavities.



NSF funded in 2018 the Conceptual Design Study of a 3G facility: *Cosmic Explorer: 40km – L shaped detector*

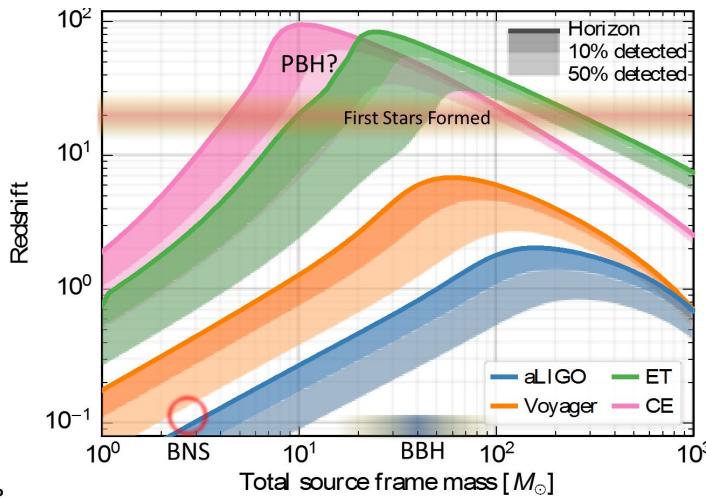
ET and CE sensitivity

3G R&D: Research and Development for the Next Generation of Groundbased Gravitational-wave Detectors

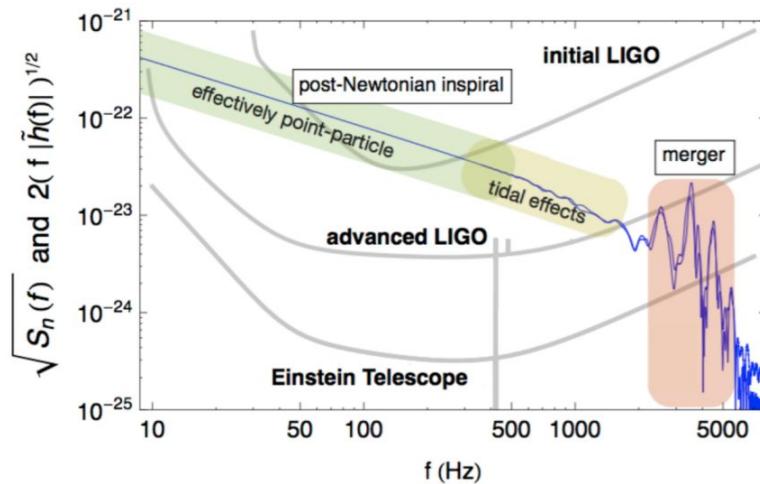


Science case with 3G detectors

From The Next-Generation Global Gravitational-Wave Observatory: New Astrophysics with the Farthest, Oldest, and Most Violent Events in the Universe : With 3G GW observatories ten times more sensitive than current instruments we will investigate the fundamental physics of the primeval Universe and probe its dark sectors



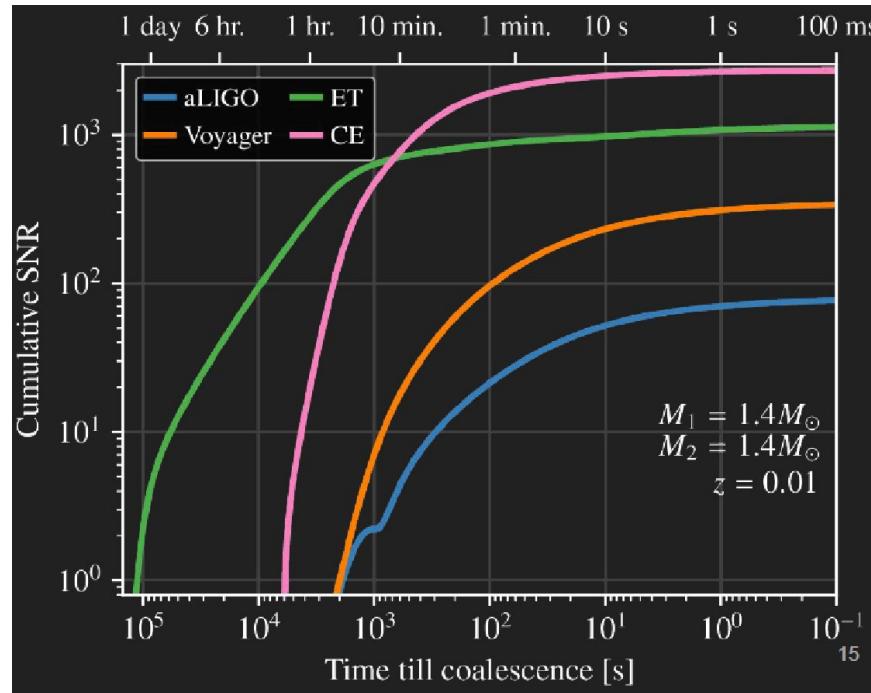
- Primordial BH
- BBH merger from globular clusters
- Intermediate massive BH
- Star formations
- GRB from BNS/BHNS at high z
- Post merger phase



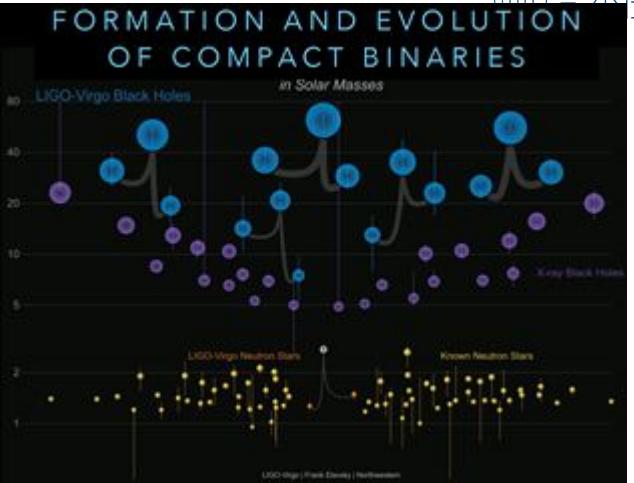
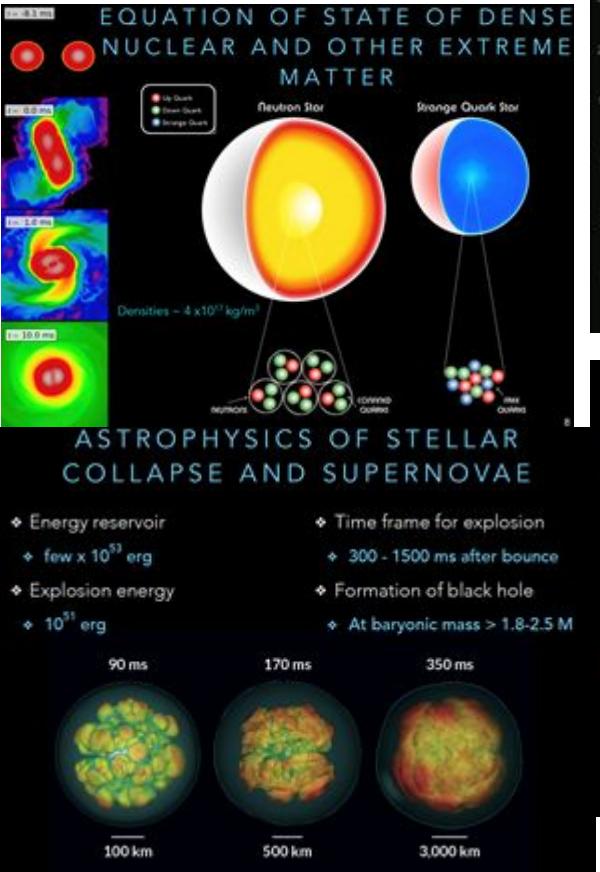
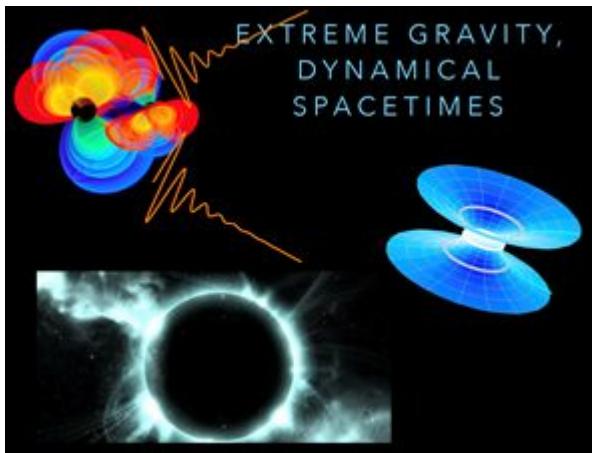
Early warning

This will enhance the
Multimessenger physics

Time before the merger



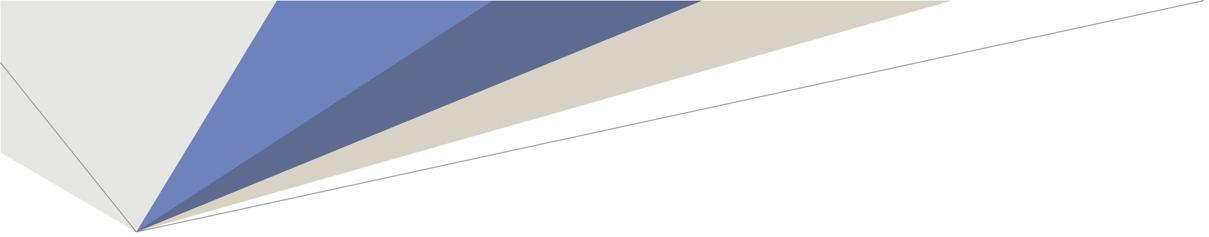
GW and Fundamental science



STANDARD SIREN COSMOLOGY

- Compact binaries are standard sirens; GW observations can measure the luminosity distance
- Can measure distance and redshift from GW observations of binary neutron stars



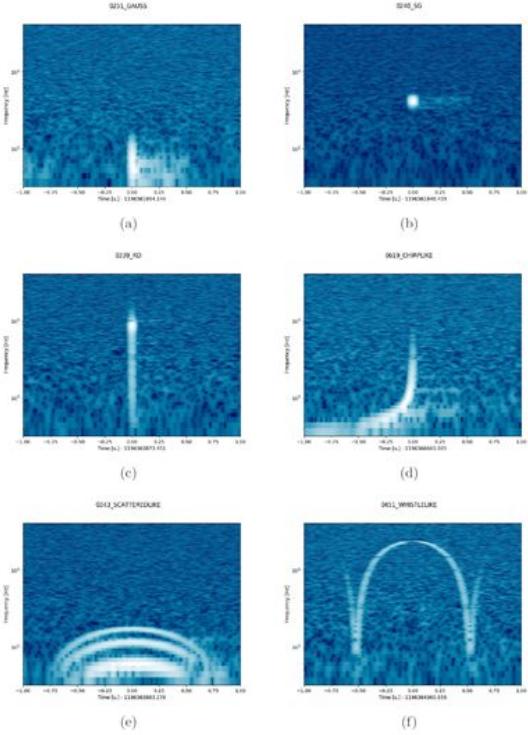


How Machine learning could help Gravitational Wave Science?

Control system and noise cancellation

- ❖ **Adaptive control**
- ❖ **Newtonian Noise removal**
- ❖ **Not stationary and Not linear noise identification**
- ❖ **Relation among main channels and auxiliary channels**

Signal classification instead of Human vetting



ML

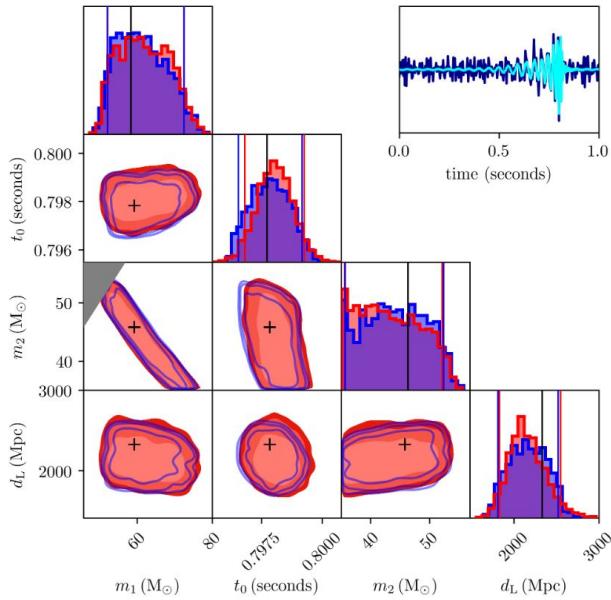


More details in
Razzano & Cuoco 2018, CQG, 35, 9

| | | True class | CHIRPLIKE | GAUSS | NOISE | RD | SCATTEREDLIKE | SG | WHISTLELIKE |
|-----------------|---------------|------------|-----------|-------|-------|-------|---------------|-------|-------------|
| Predicted class | CHIRPLIKE | 1.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| | GAUSS | 0.000 | 0.997 | 0.003 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| NOISE | NOISE | 0.000 | 0.000 | 1.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| | RD | 0.000 | 0.003 | 0.000 | 0.994 | 0.000 | 0.003 | 0.000 | 0.000 |
| SCATTEREDLIKE | SCATTEREDLIKE | 0.000 | 0.000 | 0.000 | 0.000 | 1.000 | 0.000 | 0.000 | 0.000 |
| | SG | 0.000 | 0.000 | 0.000 | 0.003 | 0.000 | 0.997 | 0.000 | 0.000 |
| WHISTLELIKE | WHISTLELIKE | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 1.000 |
| | CHIRPLIKE | 1.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |

Faster in identifying noise versus signals

Fast Parameter estimation



Bayesian parameter estimation using conditional variational autoencoders for gravitational-wave astronomy

Gabbard, Hunter et al. arXiv:1909.06296

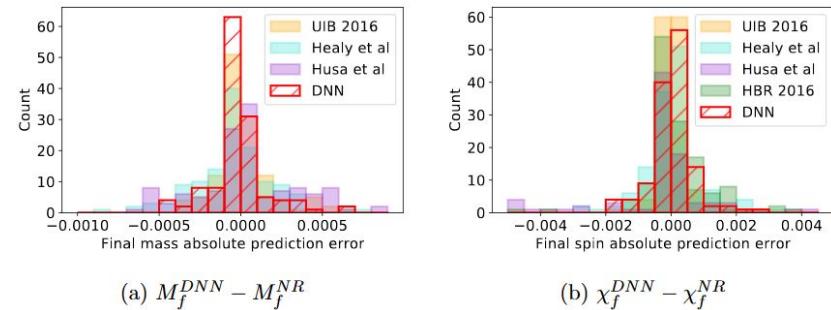
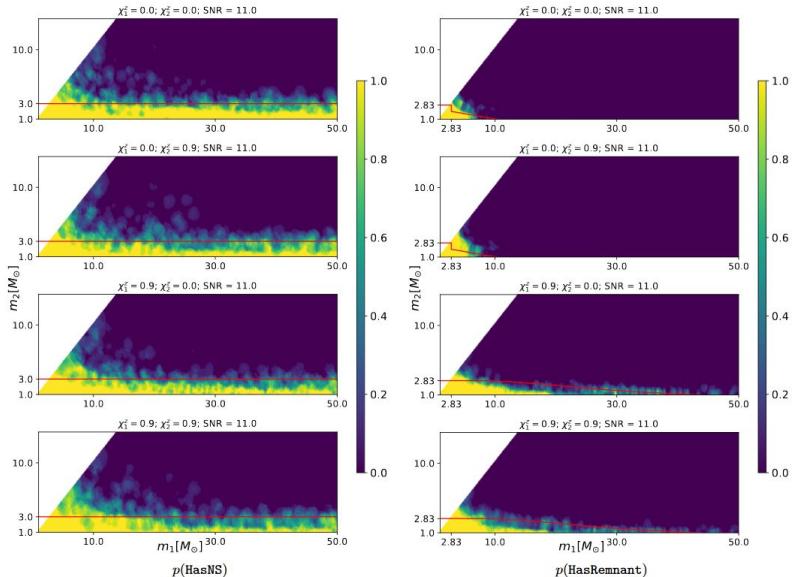


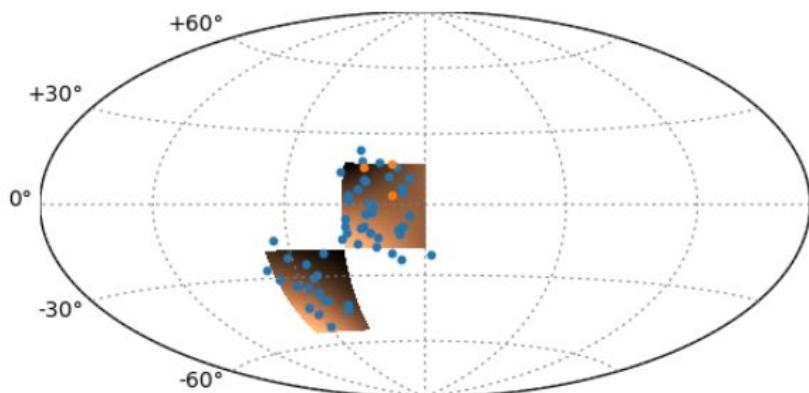
Figure 2: Residual error on the remnant mass $M_f(\eta, S_{eff}, \Delta\chi)$ (a) and spin $\chi_f(\eta, S_{eff}, \Delta\chi)$ (b) as predicted by the DNN for the non-precessing BBHs. Our error is compared with the fits performed by the UIB group in 2016 [6], Healy et al [34], Husa et al [12] and Hofmann, Barausse and Rezzolla (HBR) [13].

Predicting the properties of black holes merger remnants with Deep Neural Networks

Leïla Haegel, Sascha Husa, arXiv:1911.01496



and much more...



A Machine Learning Based Source Property Inference for Compact Binary Mergers

[Deep Chatterjee](#), et al [arXiv:1911.00116](#)

Using Deep Learning to Localize Gravitational Wave Sources

[Chayan Chatterjee](#), [Linqing Wen](#), [Kevin Vinsen](#), [Manoj Kovalam](#),
[Amitava Datta](#)
[arXiv:1909.06367](#)

The future: Artificial Intelligence for 3G detectors

Many low SNR signals (overlapping signals)

Many transient noise disturbances (glitches)

Not stationary/not linear noise (strange noise coupling)

Many monitoring auxiliary channels (“big” data)

Computational and timing efficiency (Fast alert system)

We should think to new approach for our data analysis



Thank you



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