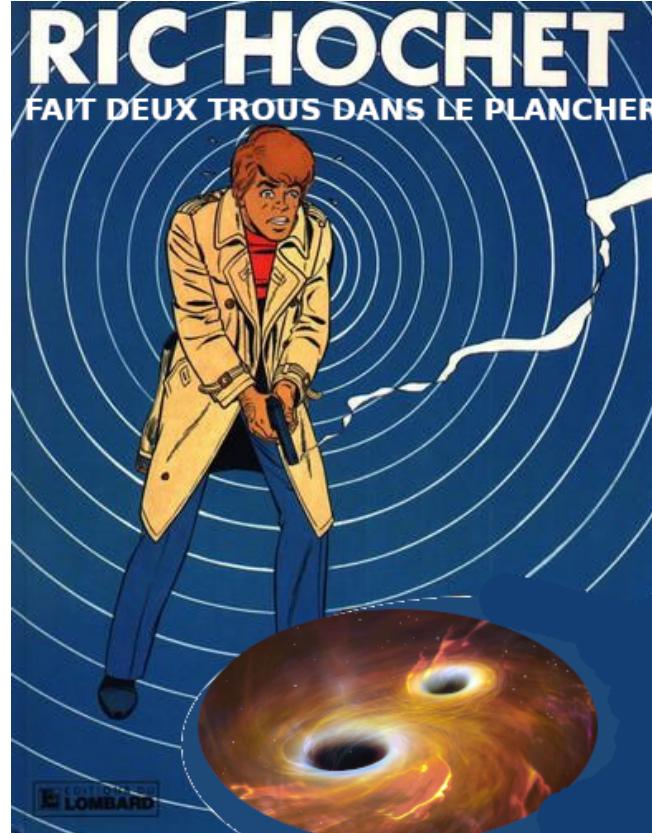
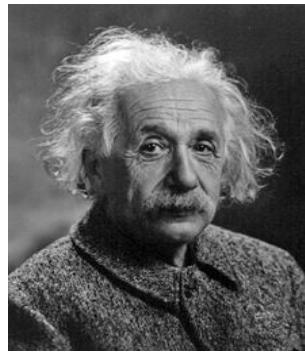
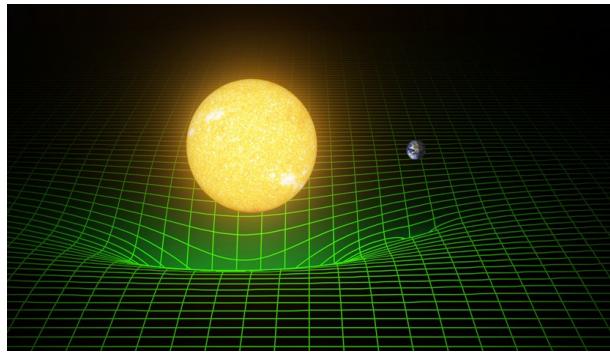
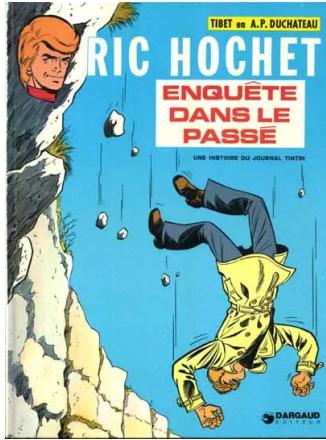


Gravitational wave astronomy:

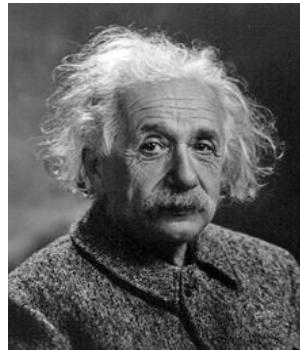
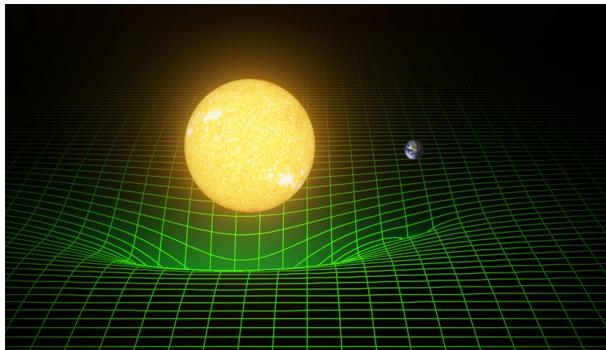
State of the art and perspectives for RICOCHET

Eric Chassande-Mottin
AstroParticule et Cosmologie (APC)
CNRS Université de Paris





Space-time is dynamic and deformable
Gravity is connected to space-time curvature



Space-time is dynamic and deformable
Gravity is connected to space-time curvature

23 mars 2022

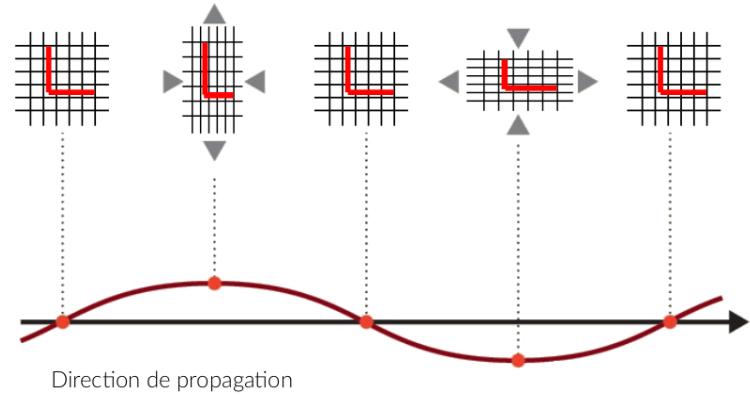
$$G_{\mu\nu} = \frac{8\pi G}{c^4} T_{\mu\nu}$$

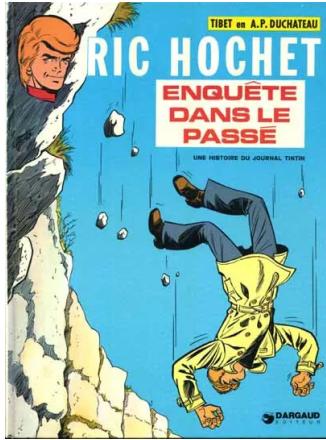


$$\square \bar{h}_{ab} = 0$$

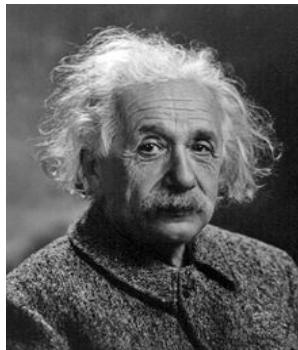
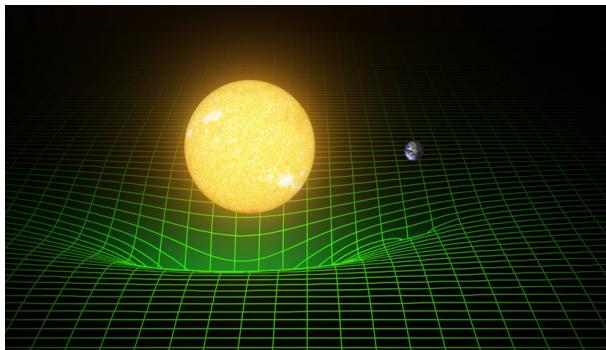
wave equation

Small perturbation of
the background metric
 $g_{ab} = \eta_{ab} + h_{ab}$





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



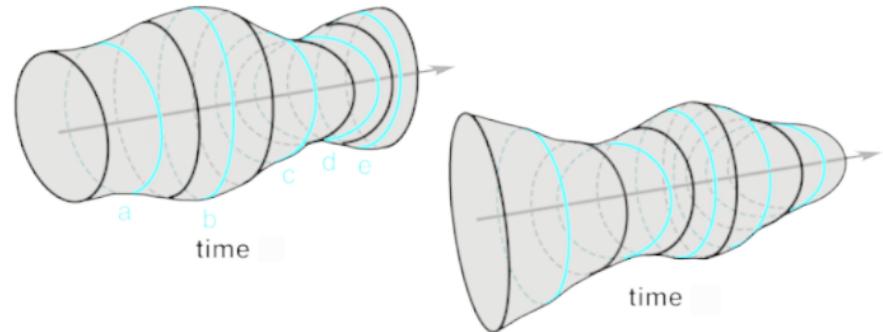
Space-time is dynamic and deformable
Gravity is connected to space-time curvature

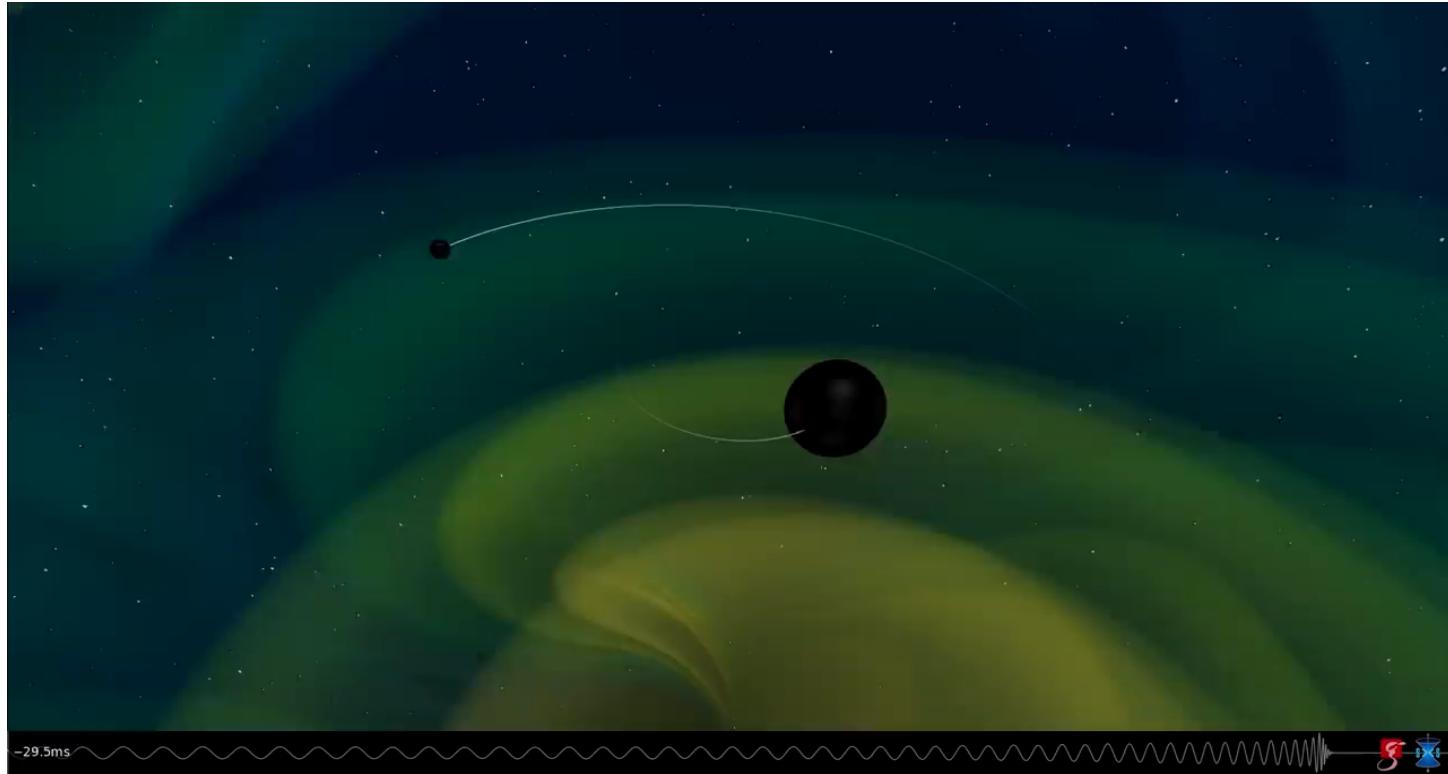
$$\square \bar{h}_{ab} = 0$$

wave equation

Small perturbation of
the background metric
 $g_{ab} = \eta_{ab} + h_{ab}$

General relativity predicts
two GW polarizations



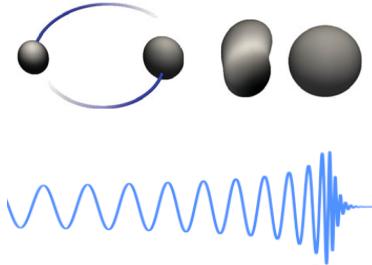


23 mars 2022

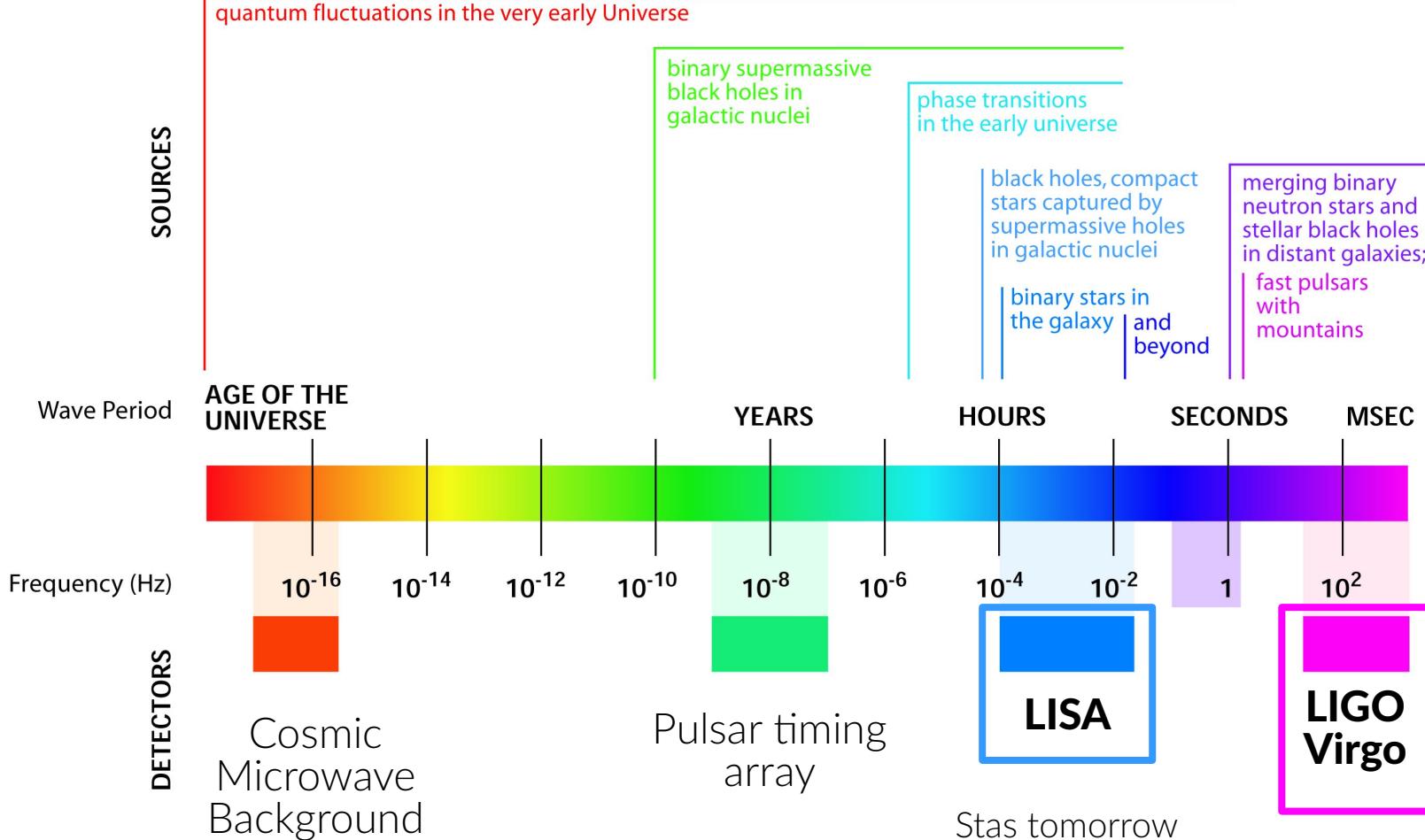
GW190412 – N. Fischer, H. Pfeiffer, A. Buonanno (Max Planck Institute for
Gravitational Physics), Simulating eXtreme Spacetimes project
<https://www.youtube.com/watch?v=5AkT4bPk-00>

$$M \sim 10^{6-8} M_{\odot} \quad M \sim 1 - 1000 M_{\odot}$$

Inspiral Merger Ring-down



$$f \propto 1/M$$





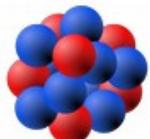
LIGO (US)



Virgo (Italy)

$$h = \frac{\delta\ell}{L} \sim 10^{-21}$$

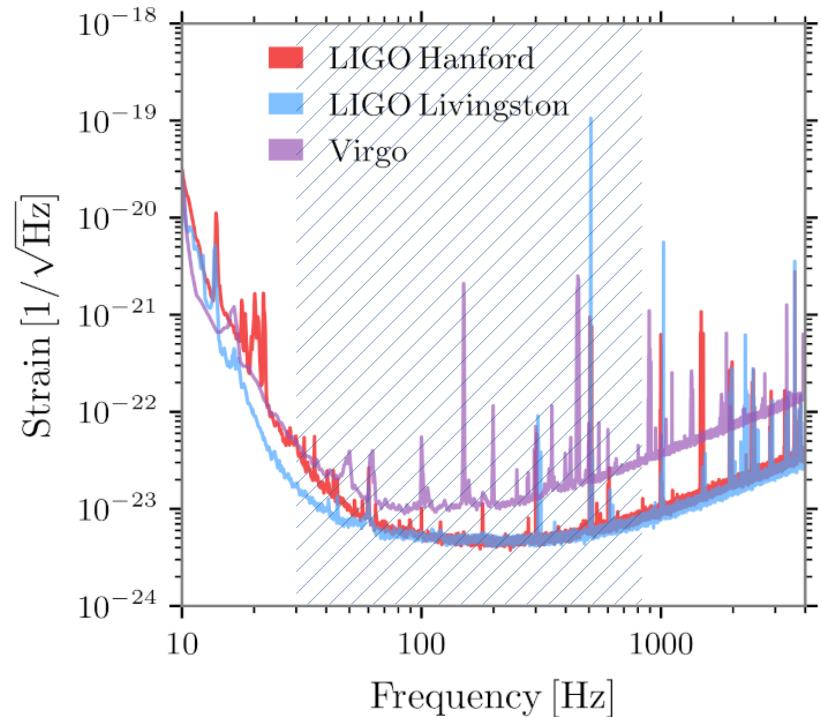
$$\delta\ell \sim 10^{-18}m$$
$$L = O(1)\text{km}$$



Radius of atomic nuclei $10^{-15}m$ ($\times 1000$)



Sensitivities during O3
2019-2020



23 mars 2022

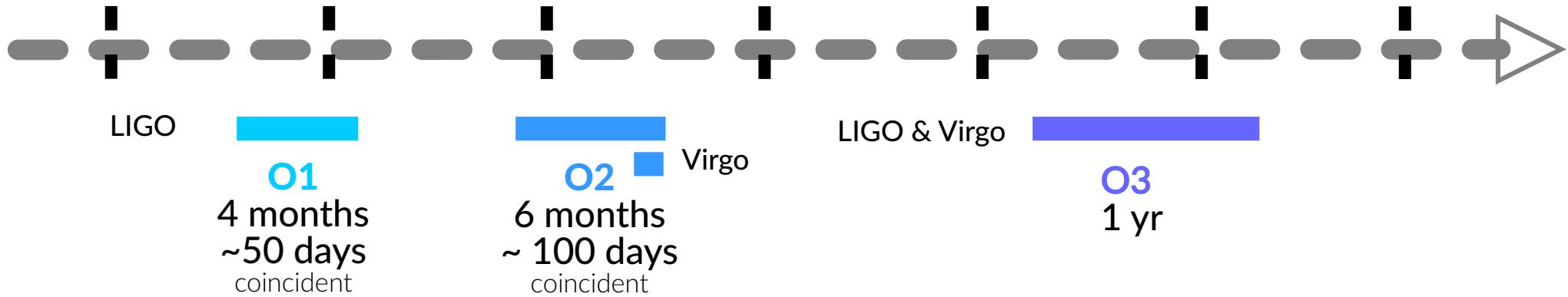
Distance range to
binary neutron stars
(averaged over sky position and inclination)

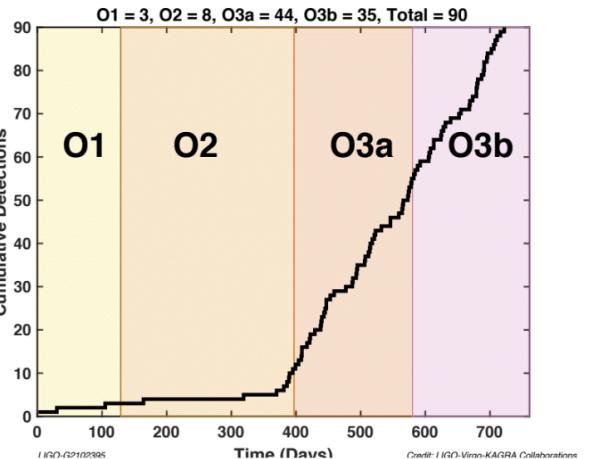
L1: 135 Mpc
H1: 115 Mpc
V1: 50 Mpc

1 parsec = 3.26 ly
= 31×10^{12} km

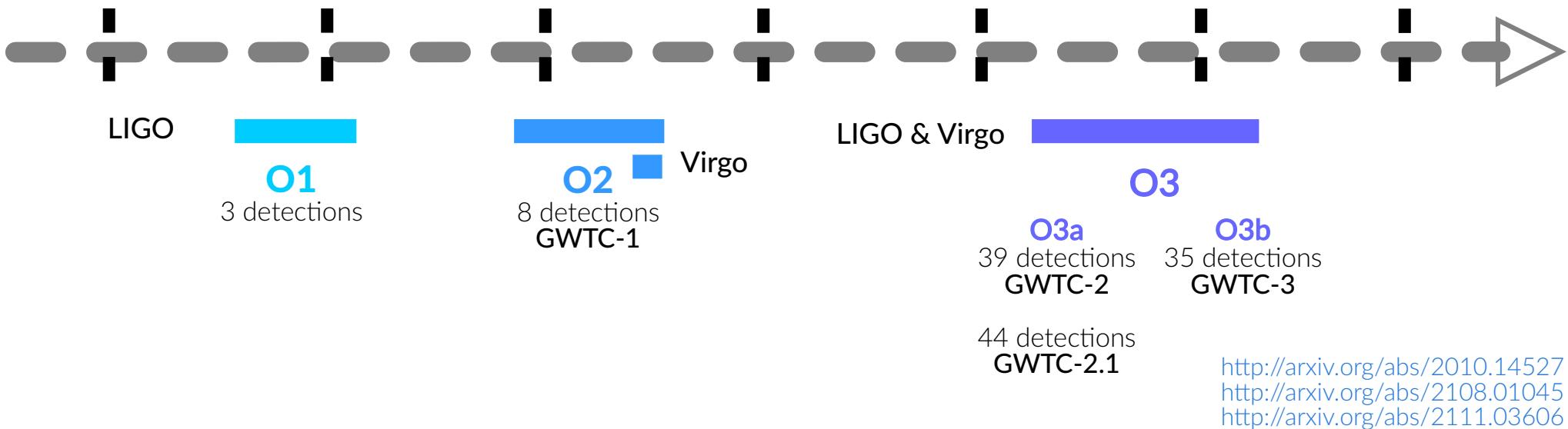


2015 2016 2017 2018 2019 2020 2021



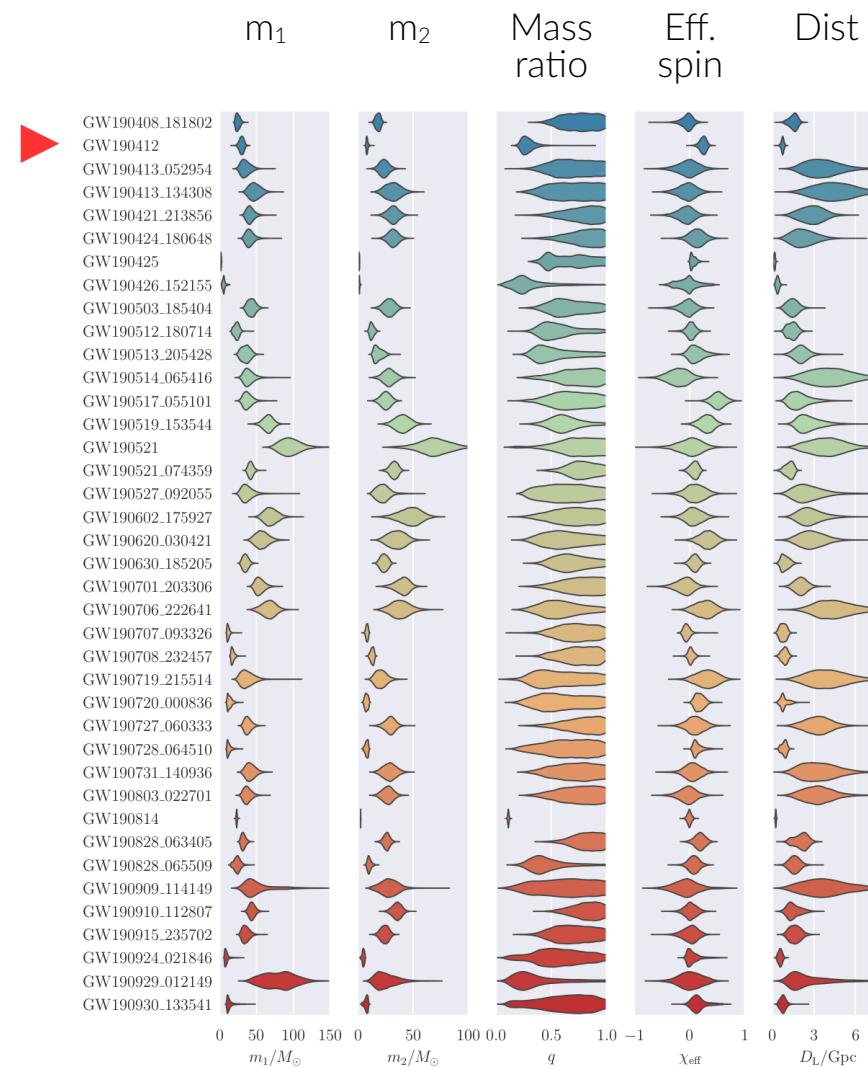
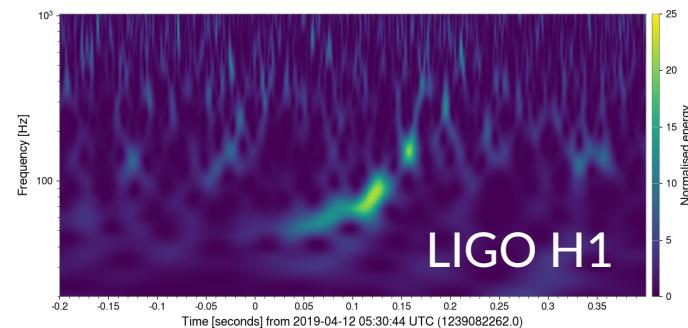
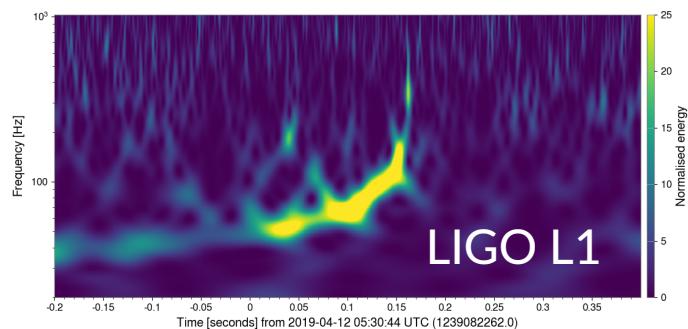


2015 2016 2017 2018 2019 2020 2021

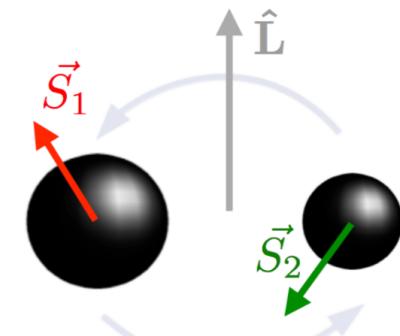


What did we detect?

- A large and unexpected population of “heavy” binary black holes

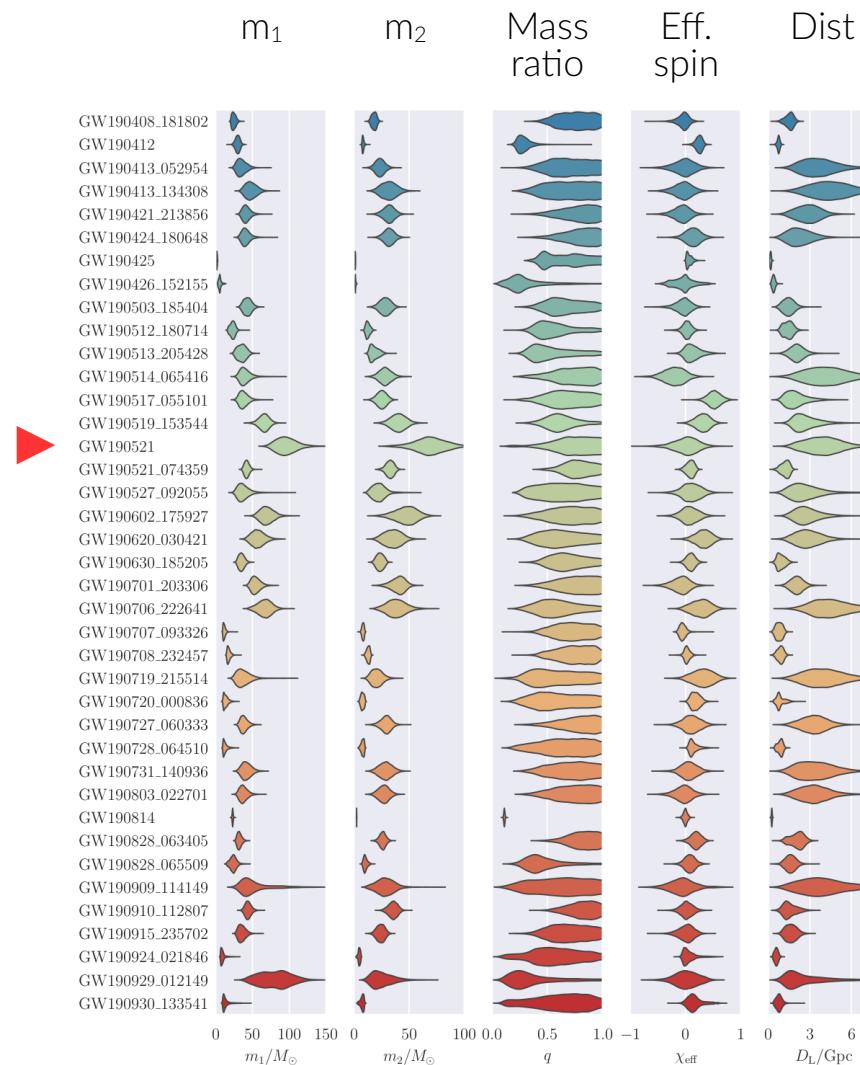


GWTC 2

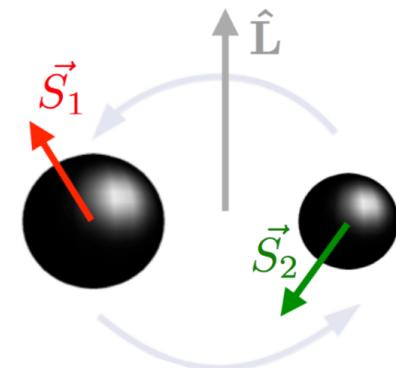


What did we detect?

- A large and unexpected population of “heavy” binary black holes
 - Raises many questions
 - How do they form?
 - In what environment?
 - Is there a single formation channel?
- Some of the detected binaries are **incompatible** with the current understanding of black hole formation from massive stars



GWTC 2

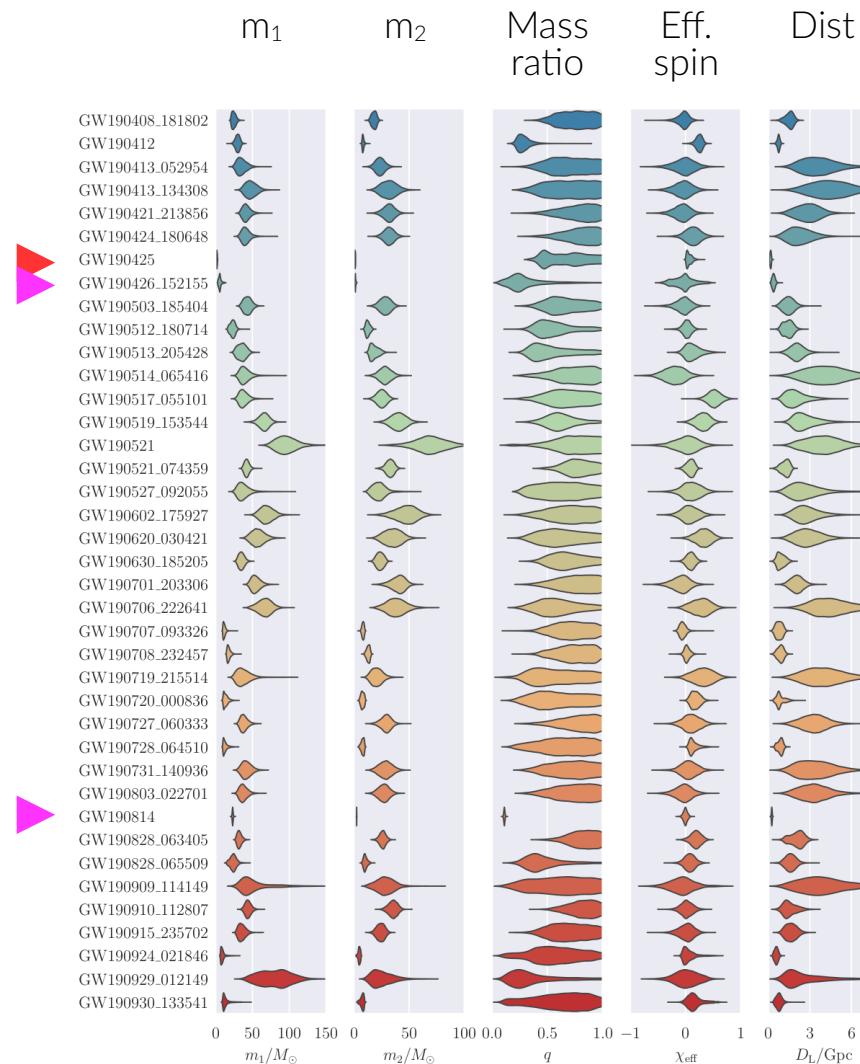


What did we detect?

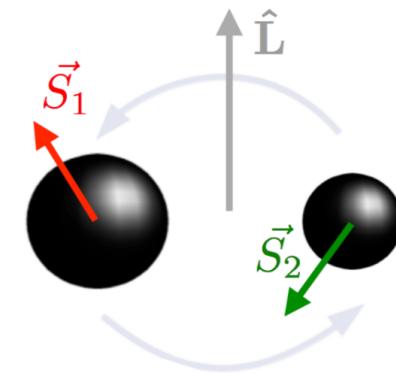
- Other types of binary systems

- Binary neutron stars
- Possible mixed black hole and neutron star binaries

Black holes from stellar core collapses are expected to be $> 3 M_{\text{sun}}$



GWTC 2





What else and for science?

- A plethora of searches and analyses
 - Tests of general relativity
 - Compact star population studies
 - Inference on cosmological parameters
 - GW lensing
 - Subsolar black holes searches
 - Unmodelled searches of short / long signals
 - Search for continuous signals from pulsars
 - Dark matter searches: boson clouds around black holes
 - Background anisotropies
 - Cosmic strings and other topological defects
- Astrophysics of compact stars
 - How many black holes in the Universe?
 - How do they form?
 - What are their properties?
- Fundamental physics
 - Is gravitation describe by the general theory of relativity?
- Cosmology
 - How fast the Universe is expanding?

gw-openscience.org



Gravitational Wave Open Science Center

Home Data Software Online Tools About GWOSC

The Gravitational Wave Open Science Center provides [data](#) from gravitational-wave observatories, along with access to [tutorials](#) and [software tools](#).



LIGO Hanford Observatory, Washington
(Credits: C. Gray)



LIGO Livingston Observatory, Louisiana
(Credits: J. Giaime)



Virgo detector, Italy
(Credits: Virgo Collaboration)

-  [O3 Bulk Data Now Available \(O3a+O3b+O3GK\)](#)
-  [GWTC-3 Catalog Data Now Available](#)
-  [Start with a Learning Path](#)
-  [Browse the Event Portal](#)
-  [Join the email list](#)
-  [Attend an Open Data Workshop](#)

- Full data set and related products freely distributed
 - ✓ 220+ papers contributed by groups around the globe
- Analysis software packages
- Documentation, usage recommendations
- Training through workshops and online course



GW Open Data Workshop

May 23 - 25, 2022

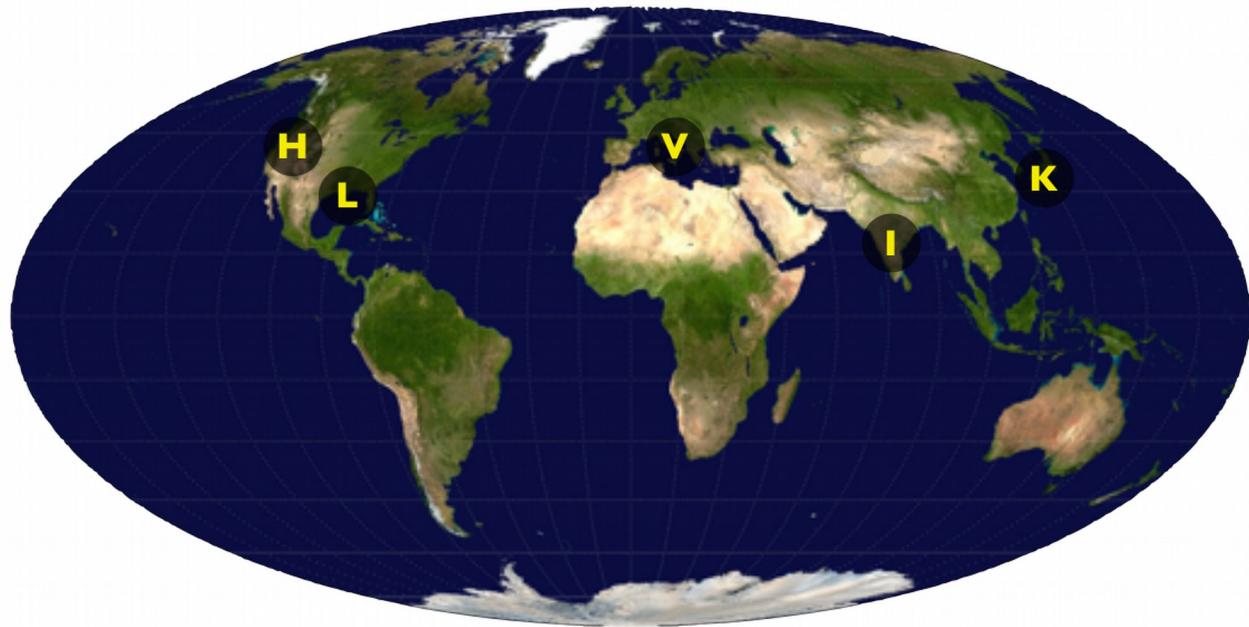
NEW

<https://www.gw-openscience.org/odw/odw2022/>

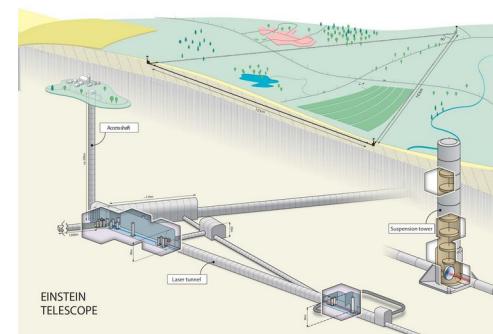
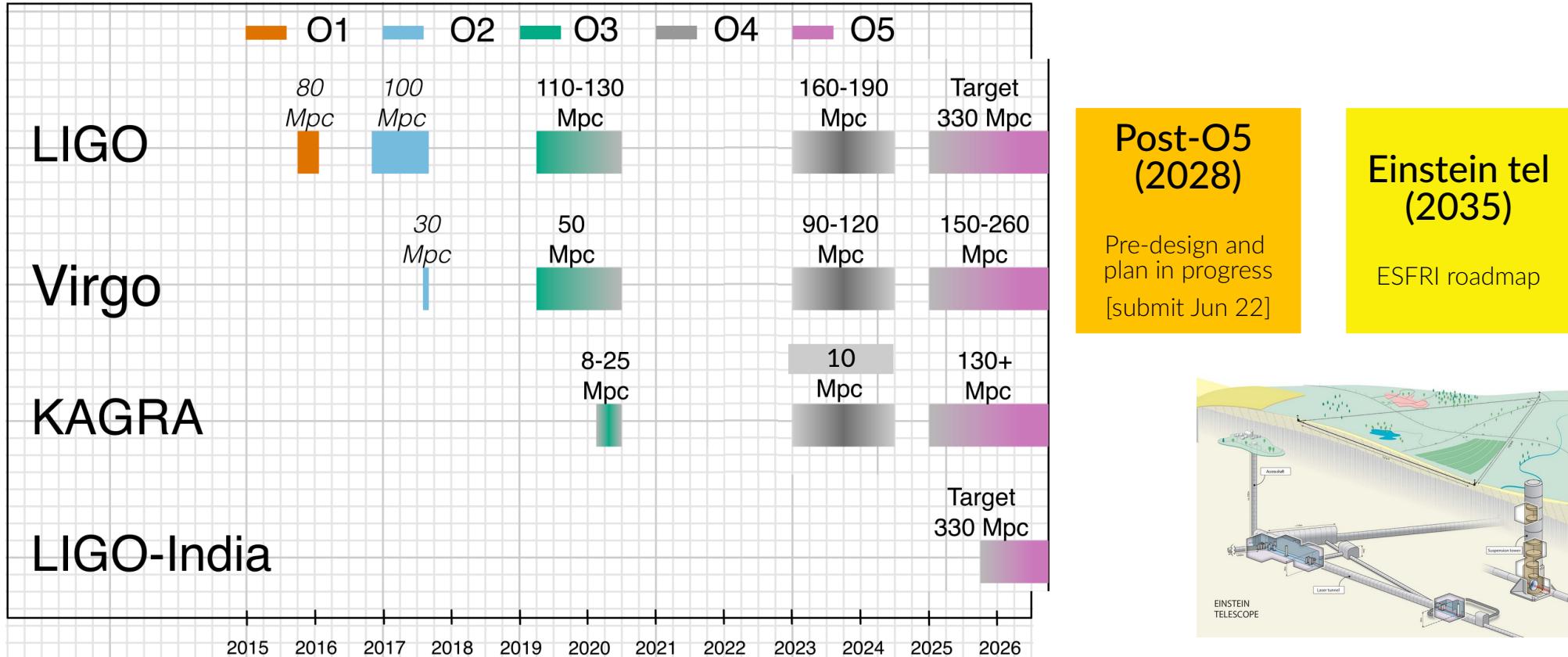
Distributed workshop with a worldwide network of study hubs

To join Paris' hub: <https://forms.gle/XXwMvRNCNVAzXHh88> **15**

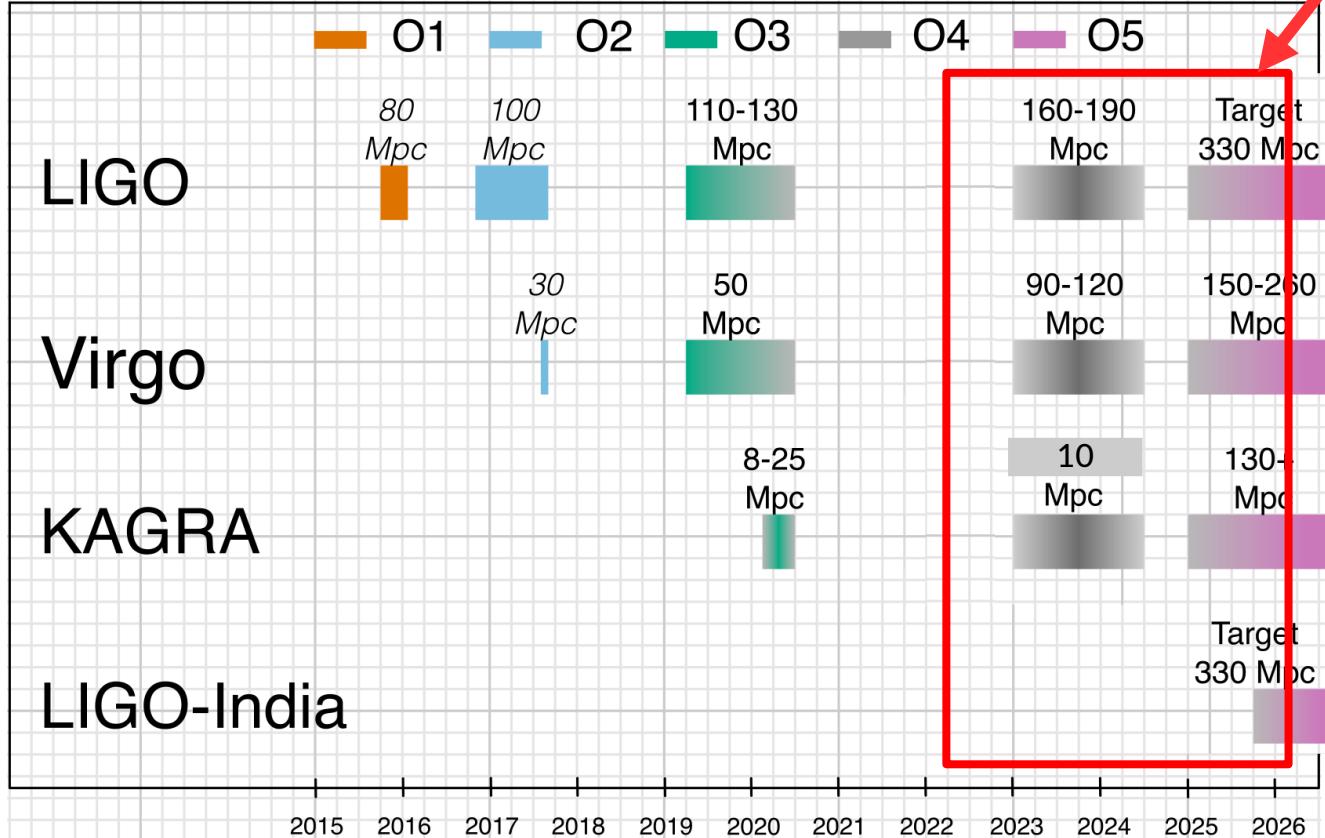
What's next?



What's next?



What's next?

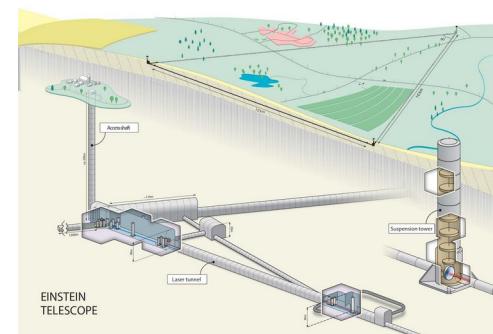


Post-O5
(2028)

Pre-design and
plan in progress
[submit Jun 22]

Einstein tel
(2035)

ESFRI roadmap



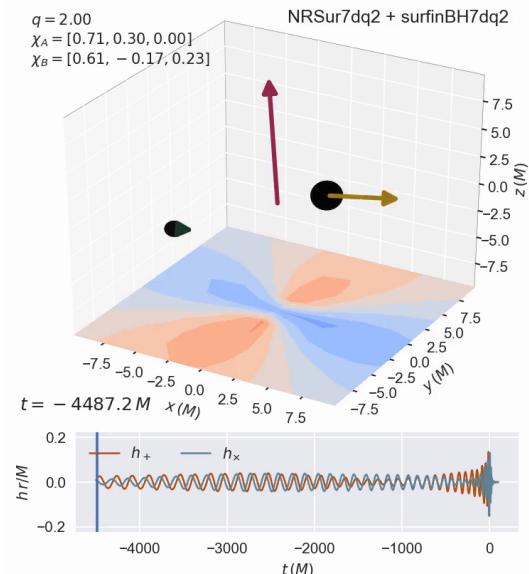
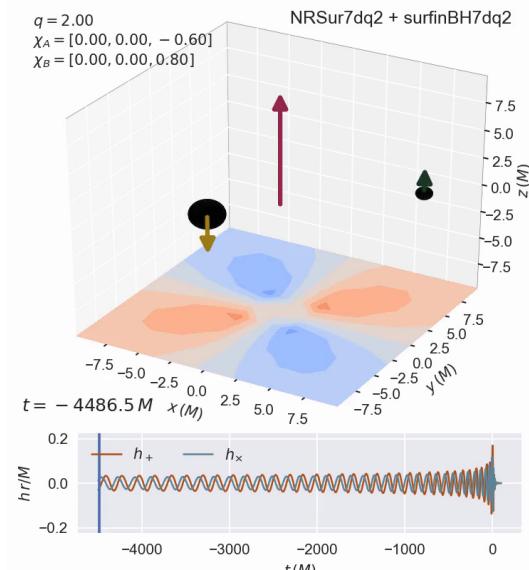


C'est bien beau tout ça,
mais on en a quoi
à carrer de ses trous noirs ?

It's the **polarization**, stupid!

GW polarization (1)

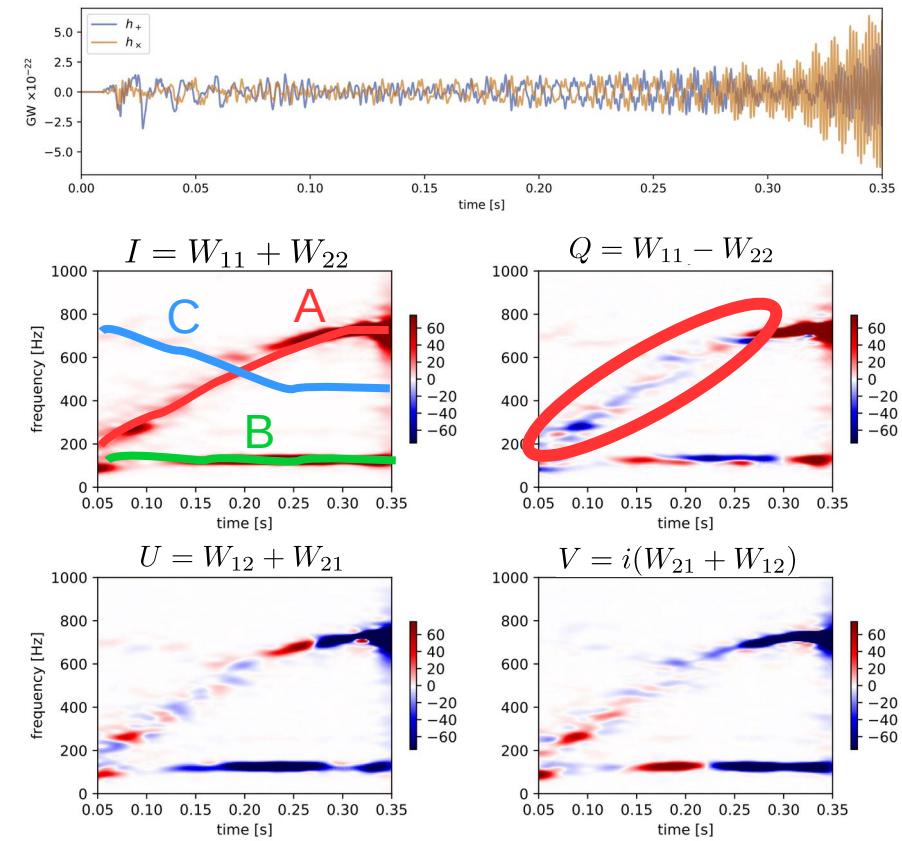
- In GR, two polarizations h_+ and h_x
 - Intrinsically, GW are a **bivariate signal**
Note: more polarizations predicted in alternative theories of gravity
- **Polarization carries physical information**
 - For compact binary mergers, wave polarization is related to the inclination of the orbital plane
 - Change of polarization → change of orientation
Smoking gun for **orbital precession**
 - **Polarized chirp = “AM-FM-PM” signal**
→ Cyril’s presentation



GW polarization (2)

- GW polarization carries physical information
 - Diagnose the complex GW signature from supernova core collapse
 - Interpret the modes during the dynamical phases of the collapse
 - 1) Prompt post-bounce convection
 - 2) Quiescence
 - 3) Standing accretion shock instability
 - During 1) and 2), mode A \rightarrow proto neutron-star g -mode oscillation
Random polarization typical of buoyancy driven convection

Simulated GW from supernova core collapse



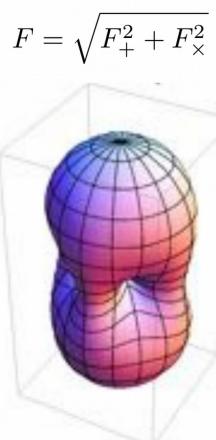
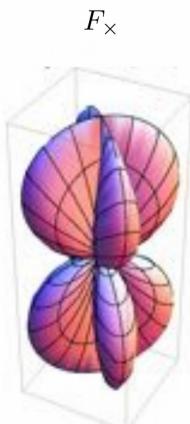
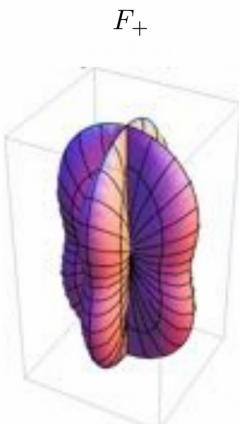
$$W_{ij}(f, t) = s_i(f, t)s_j^*(f, t),$$

Kawahara et al, 2018
<https://arxiv.org/abs/1810.00334>

Polarization reconstruction from global detector network (1)

$$h_{\text{signal}}(t) = F_+ h_+(t - \tau) + F_\times h_\times(t - \tau)$$

F_+, F_\times, τ depends on sky position θ, ϕ and polarization angle ψ



Array of linear “antennas”

→ array processing (radar) ...

... with differences:

- Irregular array geometry
- Unknown and non-monochromatic signal

Polarization reconstruction from global detector network (2)

Log-likelihood:

$$\mathcal{L}(h) = d^T h - \frac{1}{2} h^T h$$

Write $h = F\mathfrak{h}$ with

$$F = [F_+ \quad F_\times] \quad \mathfrak{h} = \begin{bmatrix} h_+ \\ h_\times \end{bmatrix}$$

Maximize $\frac{d\mathcal{L}}{d\mathfrak{h}} = 0$ and find

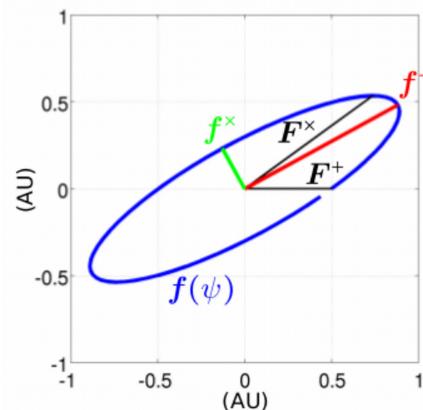
$$\mathfrak{h}^* = (FF^T)^{-1}F^T d$$

- Generalized likelihood ratio test
- Regularized when antenna pattern F is degenerate

$$\mathcal{L}(F\mathfrak{h}^*) = (d^T f_+)^2 + (d^T f_\times)^2$$

Set to 0 or
downweighted
when F is singular

Left-singular vectors of F



- Compute \mathcal{L} over the full sky and obtain a likelihood map
- Could instead regularize by requiring a specific polarization for \mathfrak{h}
→ Cyril's contributions

Open questions for RICOCHET

- **Modelling of AM-FM-PM signals**
 - Fast astrophysical template generation
- **Polarimetric processing of gravitational wave data**
 - Generic tools for polarization-based analysis / filtering
 - Noise rejection based on polarization requirement?
- **Polarization reconstruction from data**
 - Polarization priors for regularization?

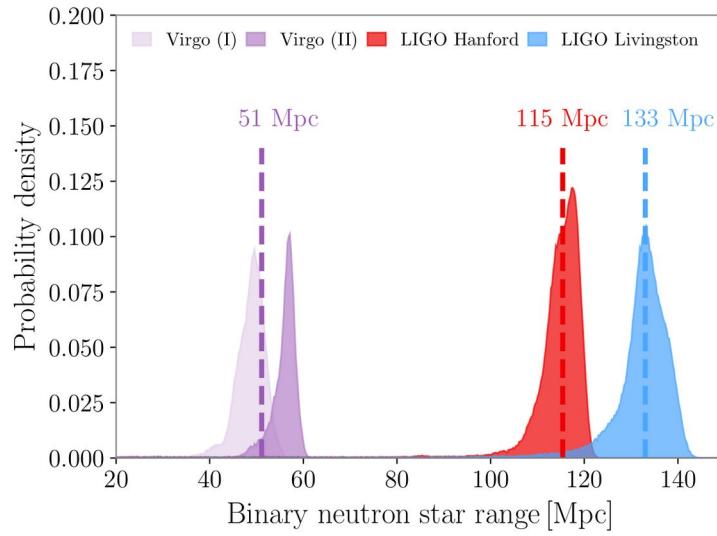
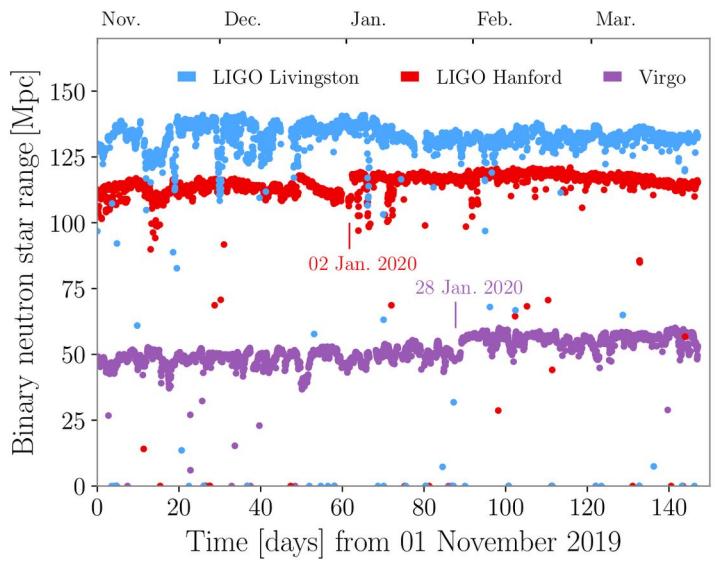


- The future of GW astronomy is a promising playground for RICOCHET

- More and better detectors = more sources and better reconstruction of polarizations

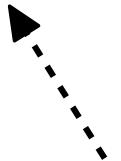
... and fun area for data science in general

Online seminar on Apr 6 at 16:00 on the lesson learned from Kaggle challenge by Chris Messenger [ask me for the Zoom link!]



Observation equation?

`data = function(signal, noise)`



Detector transfer function
and noise coupling

Recap – Gravitational waves

Outward propagating wave in z-direction

$$h(t, z) = h_{\mu\nu} e^{i(\omega t - kz)}$$

$$h_{\mu\nu} = \begin{pmatrix} 0 & 0 & 0 & 0 \\ 0 & h_+ & h_\times & 0 \\ 0 & h_\times & -h_+ & 0 \\ 0 & 0 & 0 & 0 \end{pmatrix}$$

$$\mathbf{h}(t) = h_+(t)\boldsymbol{\epsilon}^+ + h_\times(t)\boldsymbol{\epsilon}^\times$$

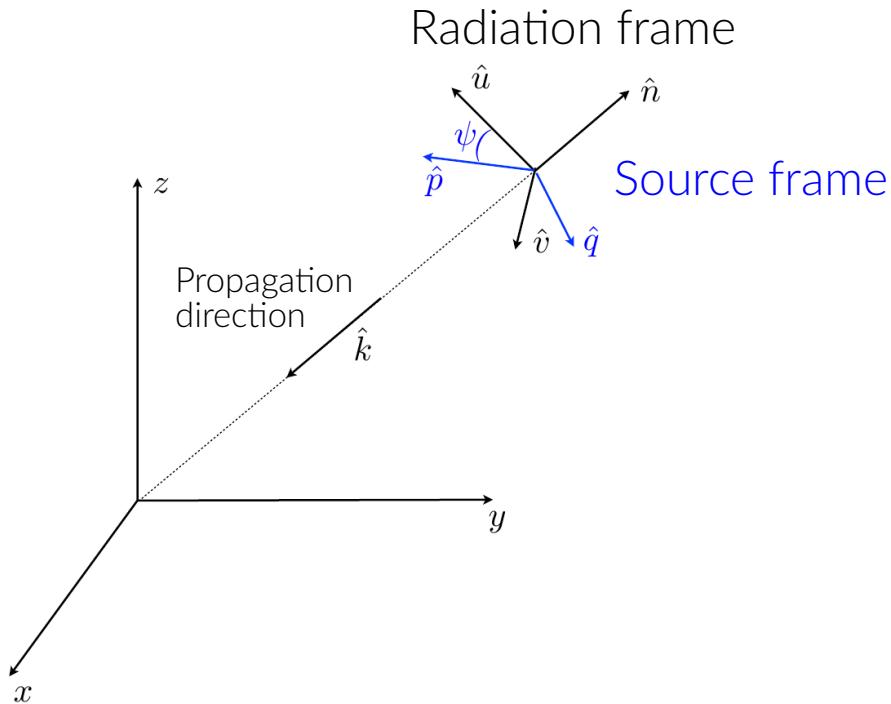
Polarization tensors

$$\boldsymbol{\epsilon}^+ = \hat{p} \otimes \hat{p} - \hat{q} \otimes \hat{q}$$

$$\boldsymbol{\epsilon}^\times = \hat{p} \otimes \hat{q} + \hat{q} \otimes \hat{p}$$

\hat{p}, \hat{q} Preferred basis in source frame

Recap – Reference frames



$$\mathbf{h}(t) = h_+(t)\boldsymbol{\epsilon}_+ + h_\times(t)\boldsymbol{\epsilon}_\times$$

$$\begin{aligned}\mathbf{e}^+ &= \hat{u} \otimes \hat{u} - \hat{v} \otimes \hat{v} \\ \mathbf{e}^\times &= \hat{u} \otimes \hat{v} + \hat{v} \otimes \hat{u}\end{aligned}$$

$$\begin{aligned}\boldsymbol{\epsilon}^+ &= \hat{p} \otimes \hat{p} - \hat{q} \otimes \hat{q} \\ &= \cos 2\psi \mathbf{e}^+ - \sin 2\psi \mathbf{e}^\times \\ \boldsymbol{\epsilon}^\times &= \hat{p} \otimes \hat{q} + \hat{q} \otimes \hat{p} \\ &= \sin 2\psi \mathbf{e}^+ + \cos 2\psi \mathbf{e}^\times\end{aligned}$$

Detector response

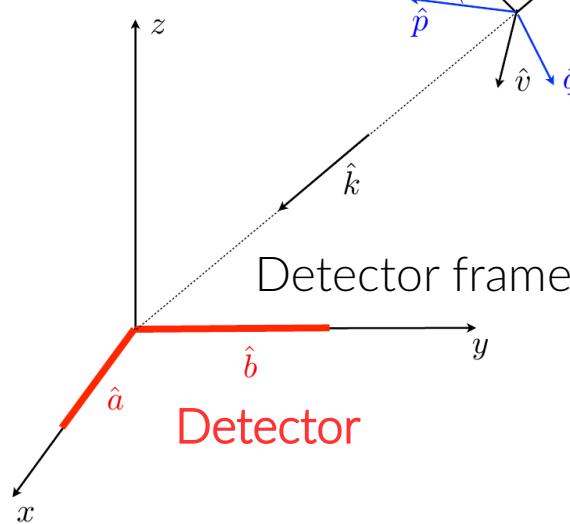
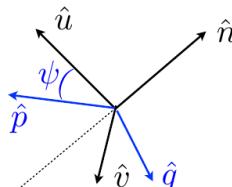
θ, ϕ Source direction in the sky

$$\hat{n} = \sin \theta \cos \phi \hat{x} + \sin \theta \sin \phi \hat{y} + \cos \theta \hat{z}$$

$$\hat{u} = \cos \theta \cos \phi \hat{x} + \cos \theta \sin \phi \hat{y} - \sin \theta \hat{z}$$

$$\hat{v} = \sin \phi \hat{x} - \cos \phi \hat{y}$$

Radiation frame



Time of flight difference along 2 directions \mathbf{a} and \mathbf{b}

$$h(t) \equiv \frac{\Delta T(t)}{2L} \approx \underbrace{\frac{1}{2} [\hat{a} \otimes \hat{a} - \hat{b} \otimes \hat{b}]}_{\text{Detector response}} : \underbrace{\mathbf{h}(t)}_{\text{Detector tensor}}$$

Detector response

Detector tensor

$$(\hat{a} \otimes \hat{a}) : \mathbf{e}^+ = \cos^2 \theta \cos^2 \phi - \sin^2 \phi$$

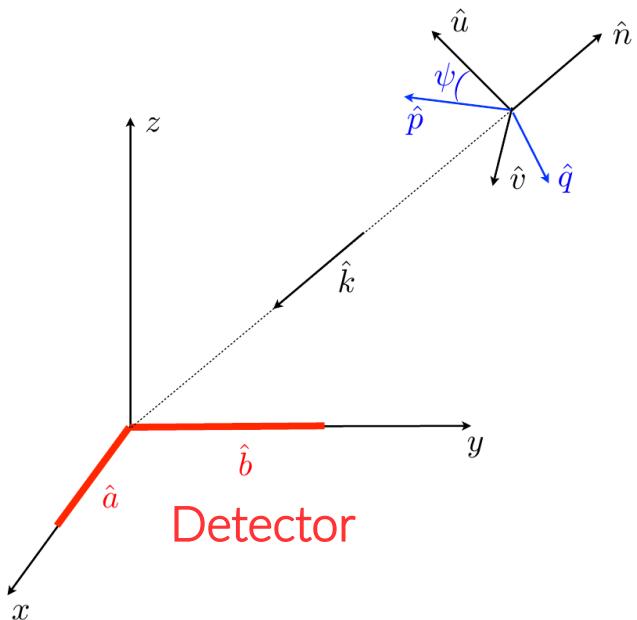
$$(\hat{a} \otimes \hat{a}) : \mathbf{e}^\times = \cos \theta \sin 2\phi$$

$$(\hat{b} \otimes \hat{b}) : \mathbf{e}^+ = \cos^2 \theta \sin^2 \phi - \cos^2 \phi$$

$$(\hat{b} \otimes \hat{b}) : \mathbf{e}^\times = -\cos \theta \sin 2\phi$$

Antenna patterns

θ, ϕ Source direction in the sky



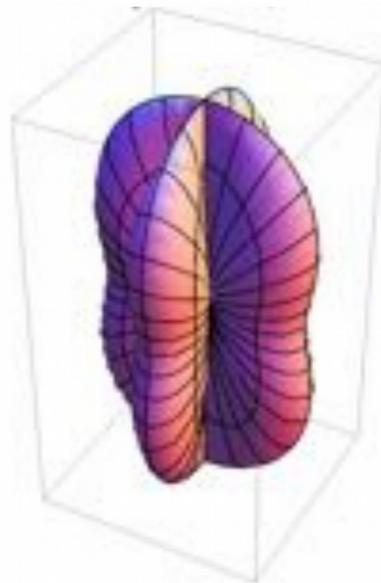
$$h(t) = F^+ h_+(t) + F^\times h_\times(t)$$

$$\begin{aligned} F^+ &= \frac{1}{2}(\hat{a} \otimes \hat{a} - \hat{b} \otimes \hat{b}) : \epsilon^+ \\ &= \frac{1}{2}(1 + \cos^2 \theta) \cos(2\phi) \cos 2\psi - \cos \theta \sin 2\phi \sin 2\psi \end{aligned}$$

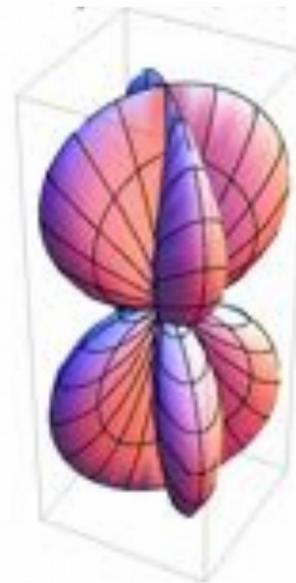
$$\begin{aligned} F^\times &= \frac{1}{2}(\hat{a} \otimes \hat{a} - \hat{b} \otimes \hat{b}) : \epsilon^\times \\ &= \frac{1}{2}(1 + \cos^2 \theta) \cos(2\phi) \sin 2\psi + \cos \theta \sin 2\phi \cos 2\psi \end{aligned}$$

Antenna patterns

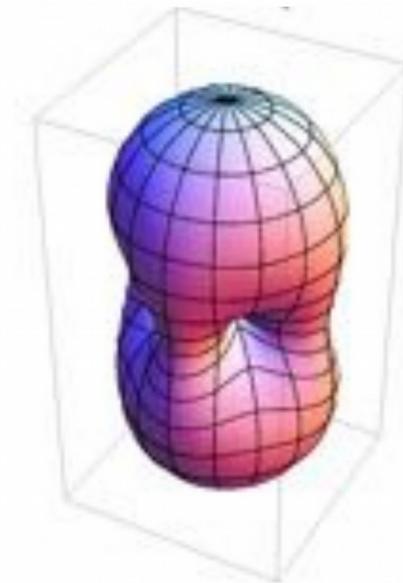
F_+



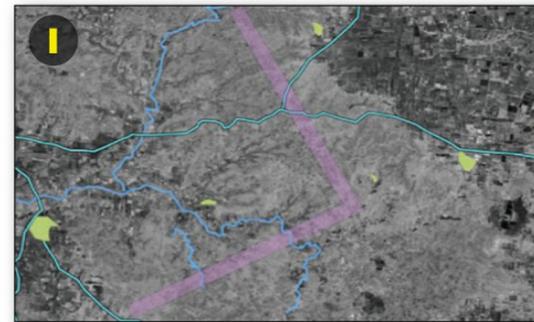
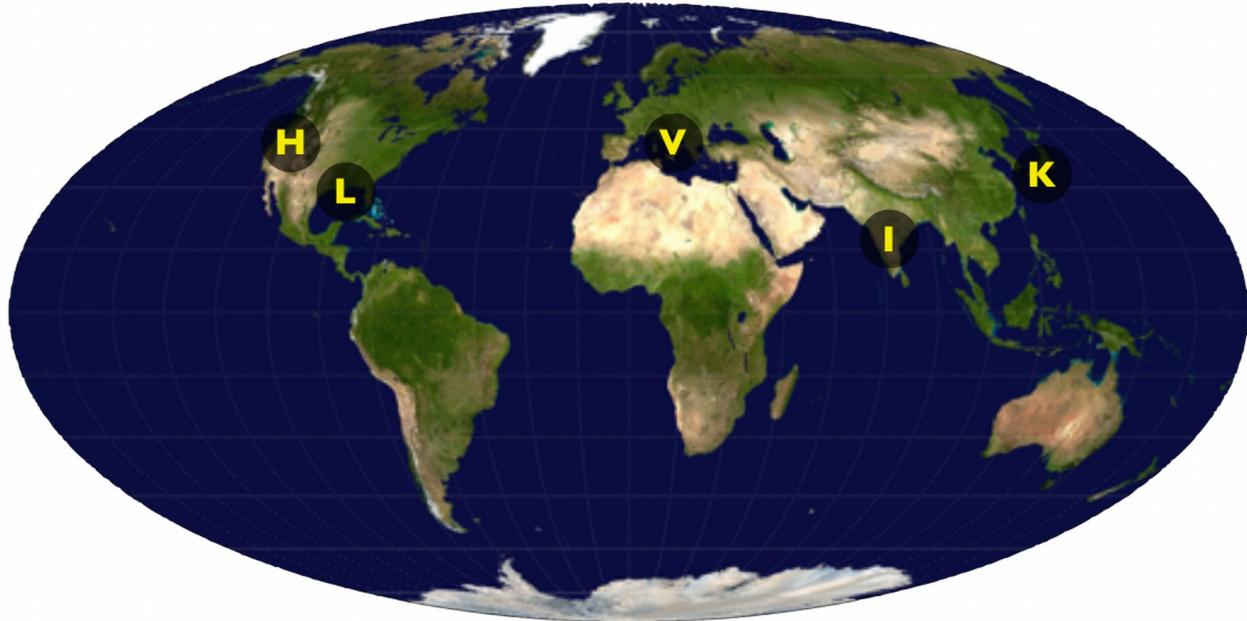
F_\times



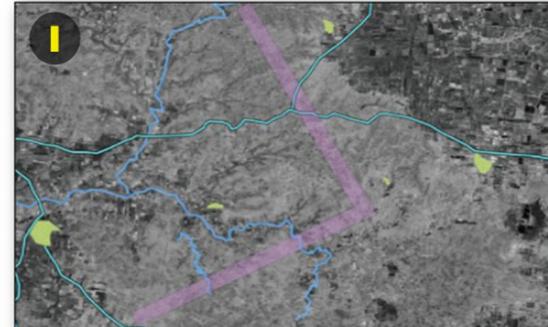
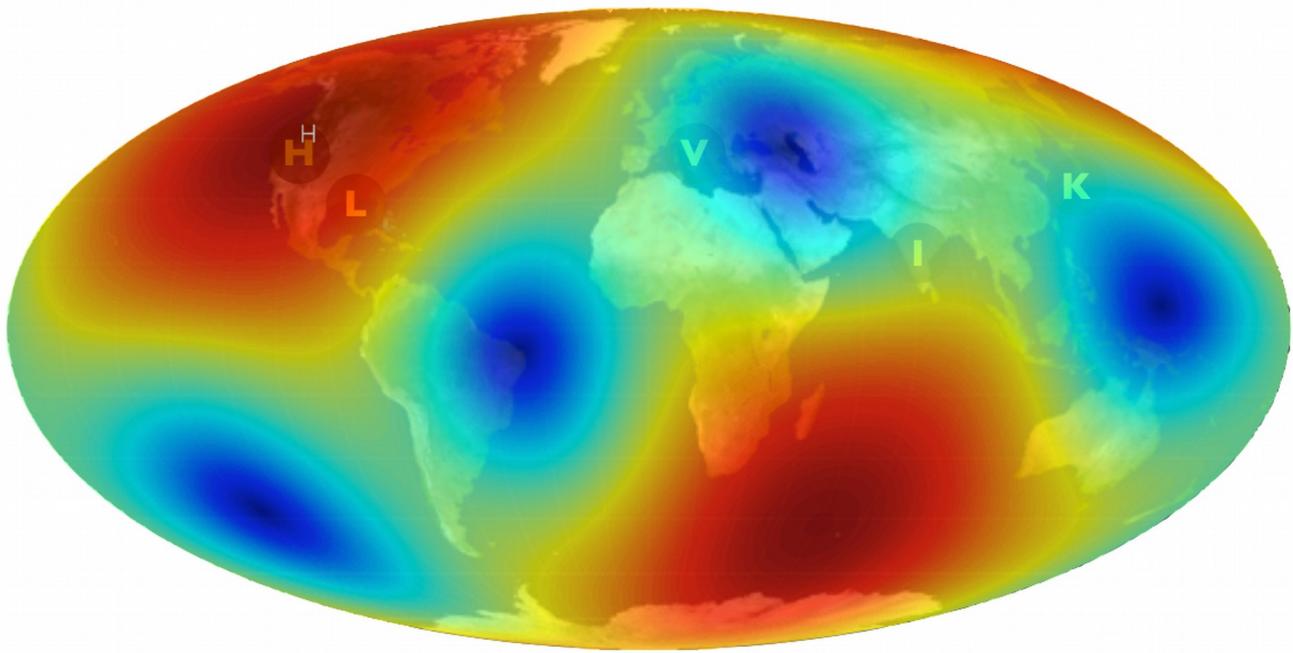
$$F = \sqrt{F_+^2 + F_\times^2}$$



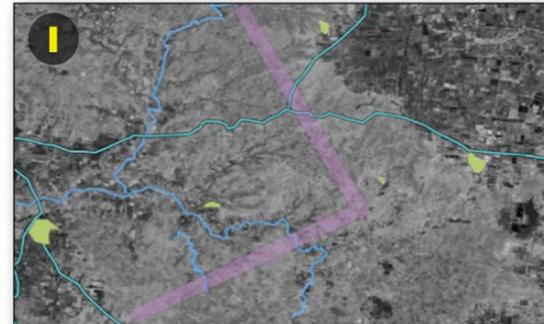
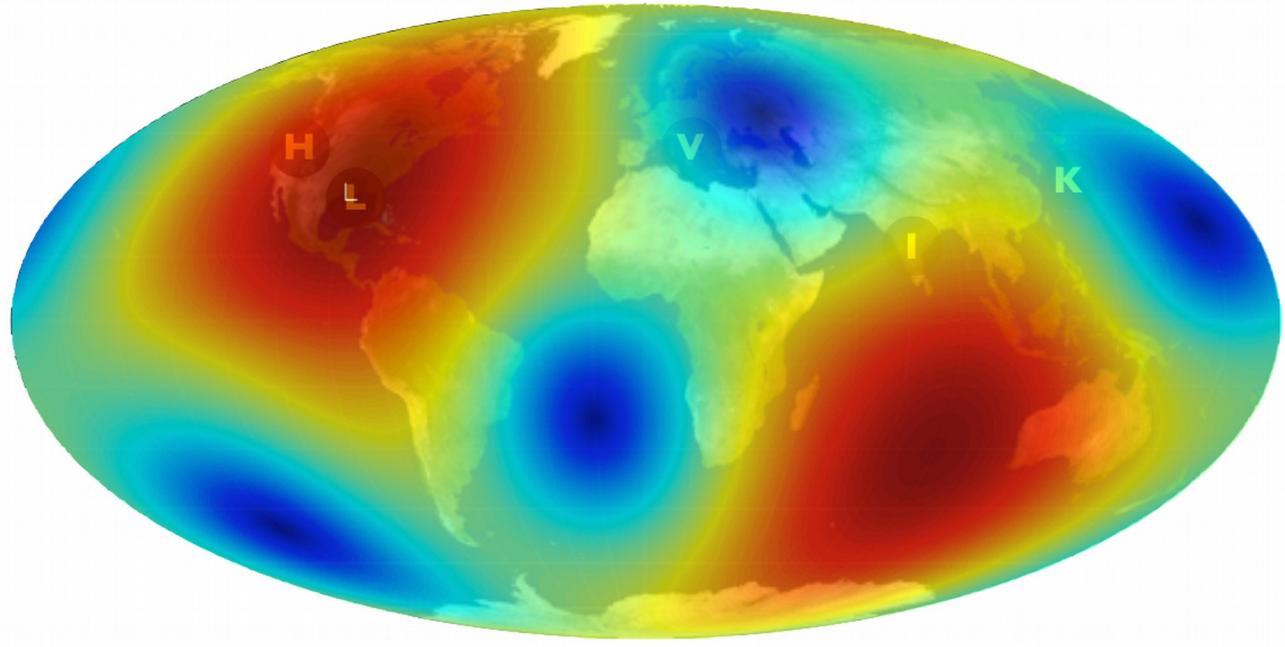
Terrestrial Network



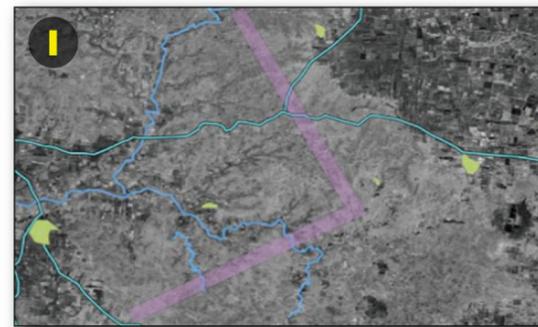
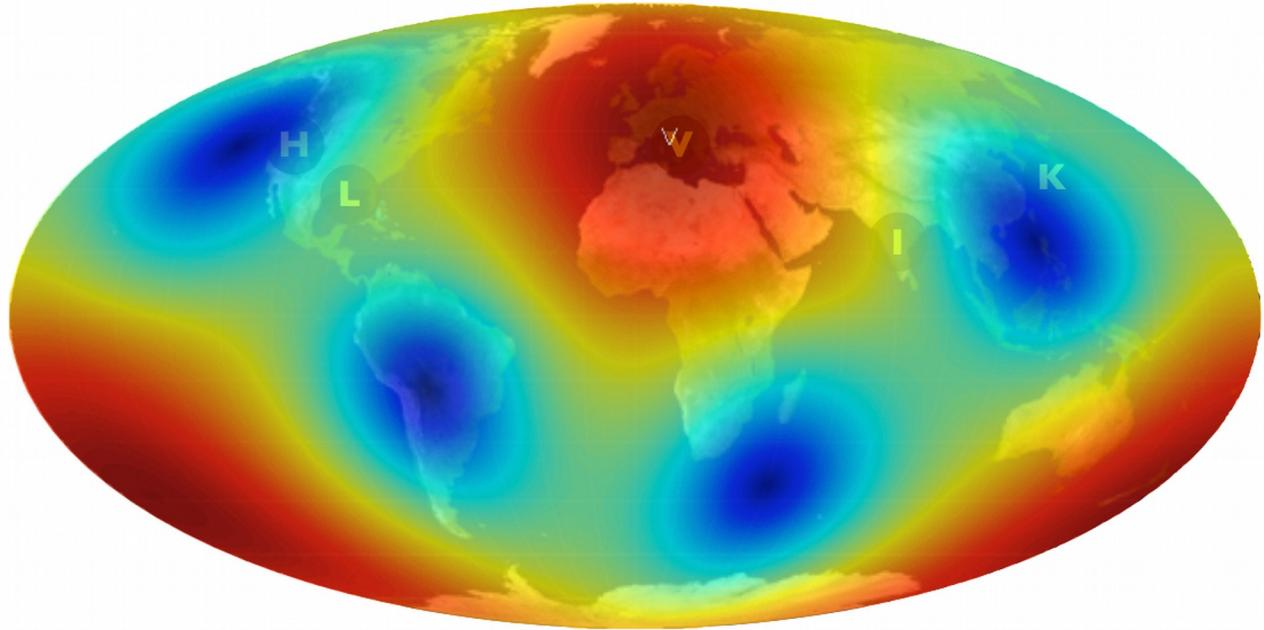
Terrestrial Network



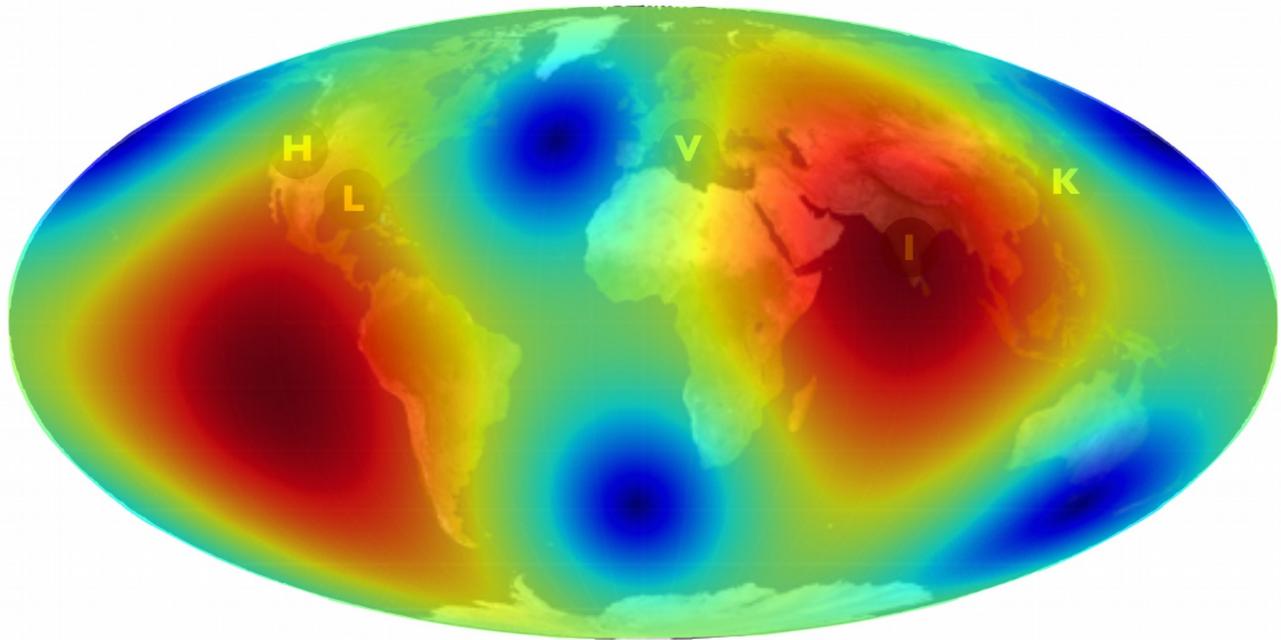
Terrestrial Network



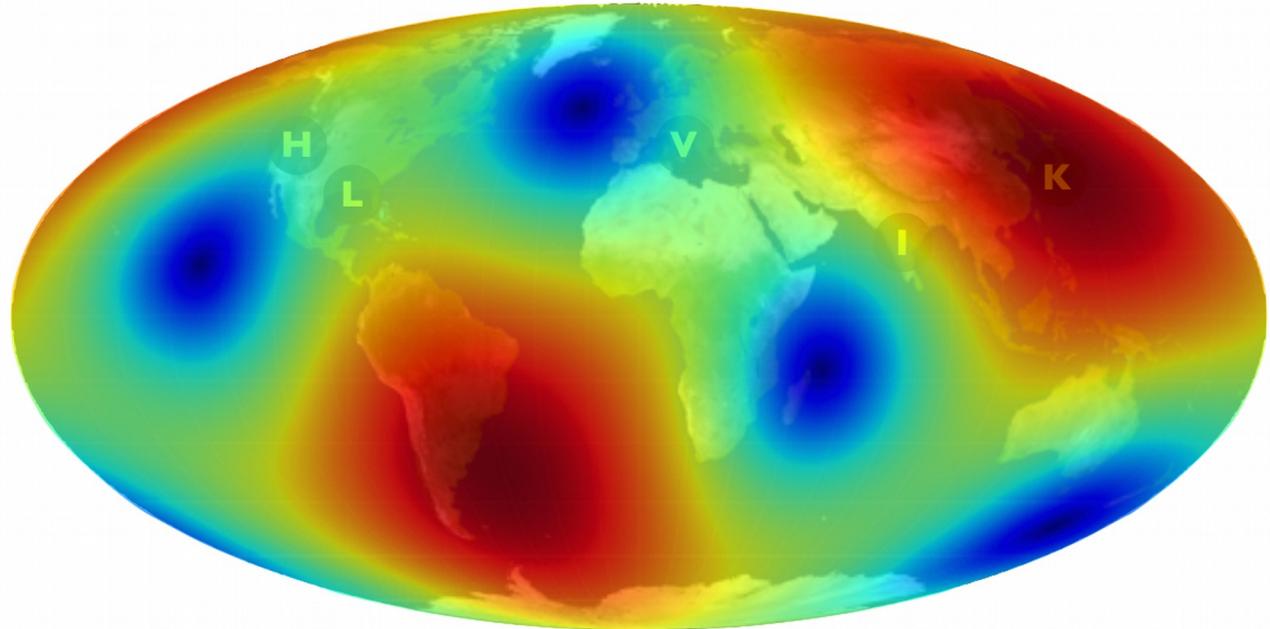
Terrestrial Network



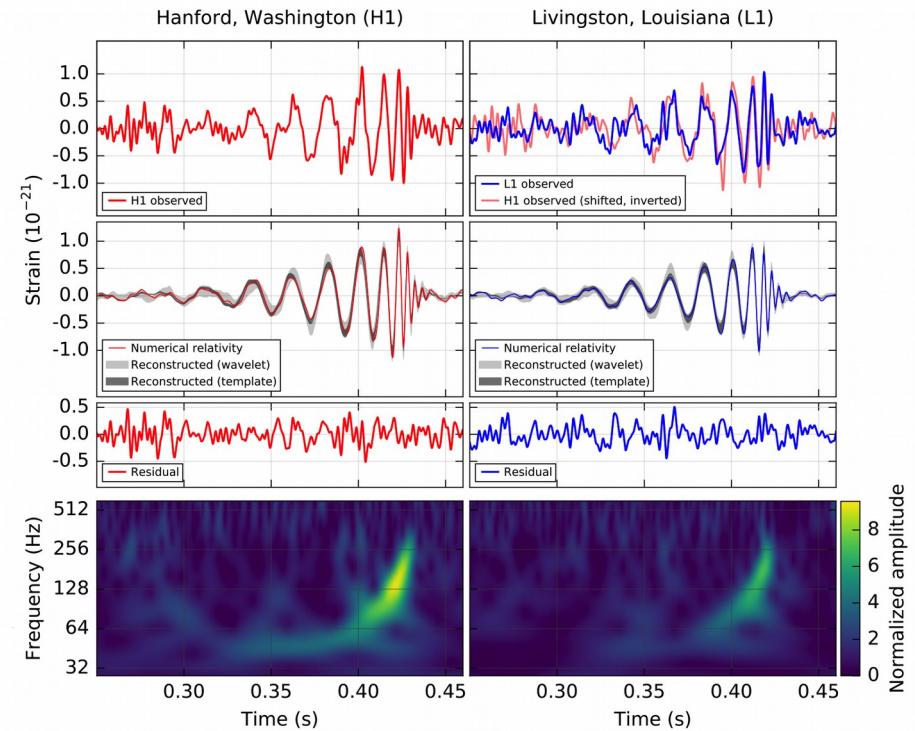
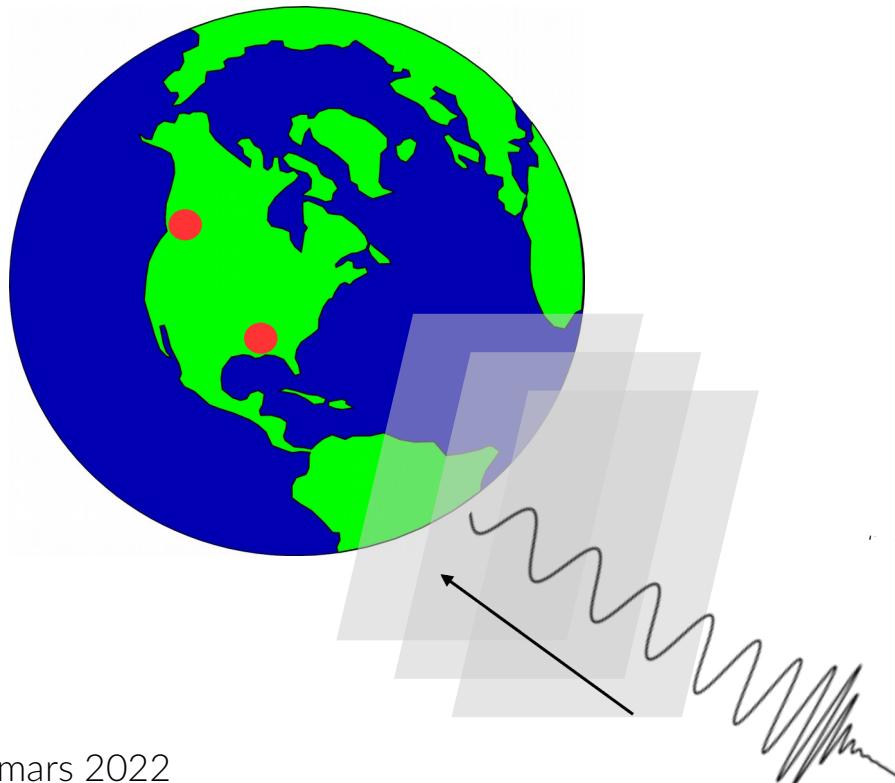
Terrestrial Network



Terrestrial Network

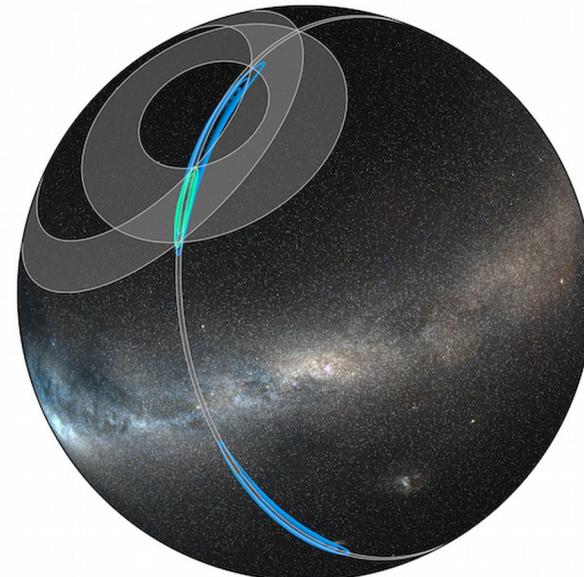
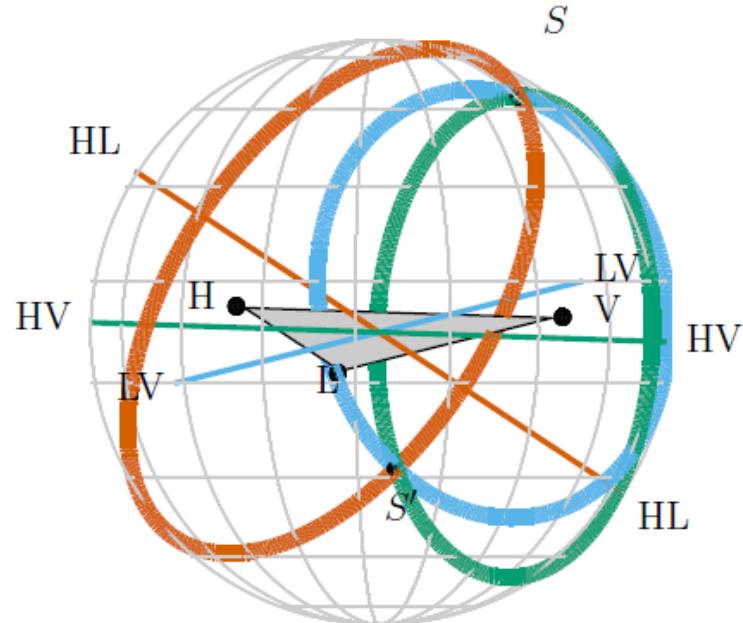


Propagation time delays



Time delay ~ 7 ms
Phase shift ~ 2.9 rad

Time delays allows triangulation



Credit: LIGO/Virgo/NASA/Leo Singer (Milky Way image: Axel Mellinger)

Observation equation (signal part)

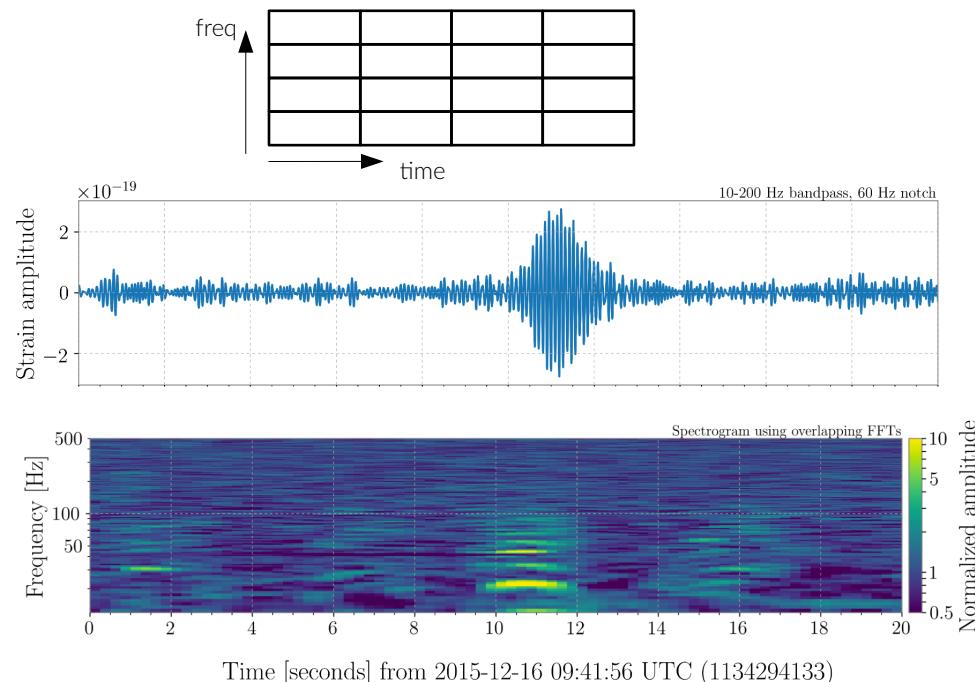
data = function(signal, noise)

$$h_{\text{signal}}(t) = F_+ h_+(t - \tau) + F_\times h_\times(t - \tau)$$

F_+, F_\times, τ depends on sky position θ, ϕ and polarization angle ψ

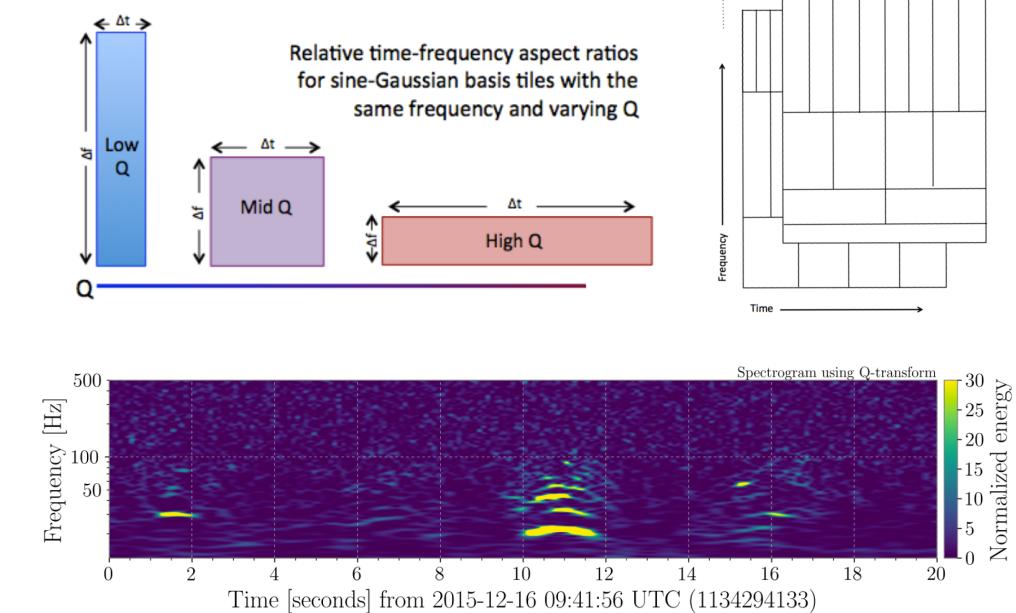
Time-frequency maps

Spectrogram or
short-time Fourier transform



Q transform

S. Chatterji et al. CQG (2010)



Coherent WaveBurst (1)

$$\mathcal{L}(h) \equiv -\log \Lambda = \langle d|h \rangle - \frac{1}{2} \langle h|h \rangle$$

Using a vector-based formalism:

$$\mathcal{L}(h) = d^T h - \frac{1}{2} h^T h$$

Write $h = F\mathfrak{h}$ with

$$F = [F_+ \quad F_\times] \quad \mathfrak{h} = \begin{bmatrix} h_+ \\ h_\times \end{bmatrix}$$

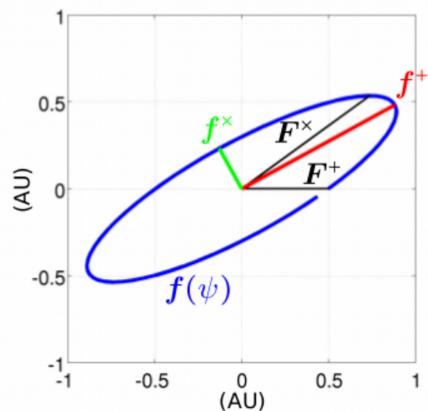
Maximize $\frac{d\mathcal{L}}{d\mathfrak{h}}$ = 0 and find

$$\mathfrak{h}^* = (FF^T)^{-1}F^T d$$

- Generalized likelihood ratio test – Maximize over h
- Regularized when antenna pattern F is degenerate

$$\mathcal{L}(F\mathfrak{h}^*) = (d^T f_+)^2 + (d^T f_\times)^2$$

Left-singular vectors of F



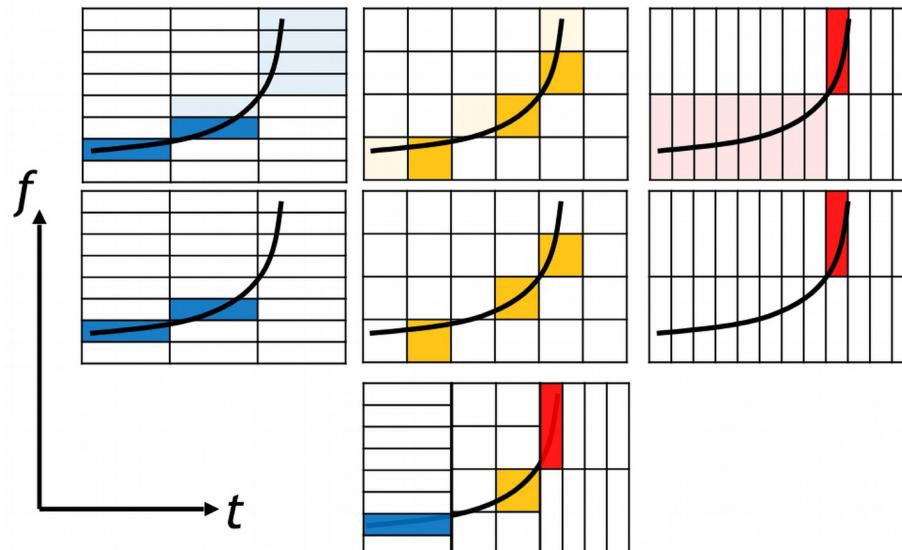
Set to 0 or
downweighted
when F is singular

- Compute \mathcal{L} over the full sky and obtain a likelihood map

Coherent WaveBurst (2)

$$\mathcal{L}(F\mathfrak{h}^*) = (d^T f_+)^2 + (d^T f_\times)^2$$

First project d onto a set of time-frequency bases and select bright pixels



<https://gwburst.gitlab.io/>

Time frequency transform of the data

Data Conditioning

Regression
(removes lines)

Whitening

Pixel selection

Select TF pixels based on a
defined rule for energy threshold

Cluster pixels which pass
threshold for each resolution

Super cluster

Cluster pixels from multiple
resolutions

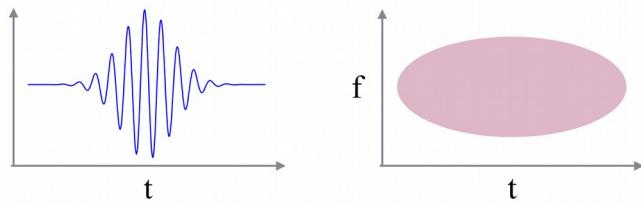
Reject sub-threshold clusters in
multi resolution

Likelihood

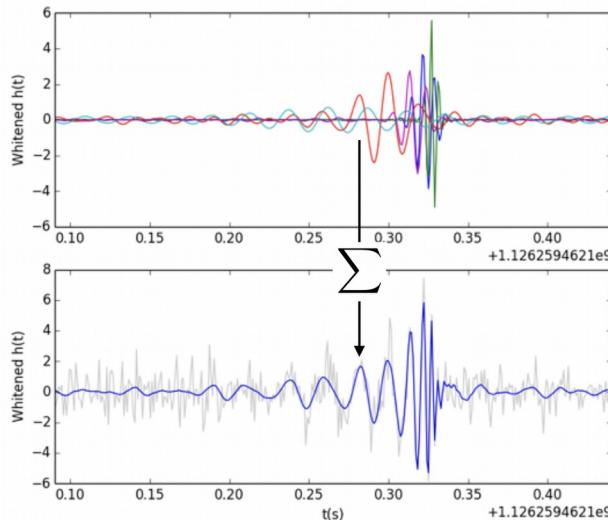
Likelihood computation on
selected pixels

Computation of detection statistics,
sky location, waveform etc

Bayeswave



$$\Psi(t) = Ae^{-(t-t_0)^2/\tau^2} \cos(2\pi f_0(t-t_0) + \phi_0)$$



- Three hypotheses
 - (1) signal + noise
 - (2) glitch + noise
 - (3) noise only
- Signal and glitch waveform models
 - Sum of Gabor wavelets $h = \sum_a^N \Psi(t; \theta_a)$
 - Signal: coherent model for all detectors
 - Glitch: incoherent (different wavelets for each detector)
- Posterior on parameters obtained using a rever
- Hypothesis testing using Bayes factor

<https://git.ligo.org/lscsoft/bayeswave>