



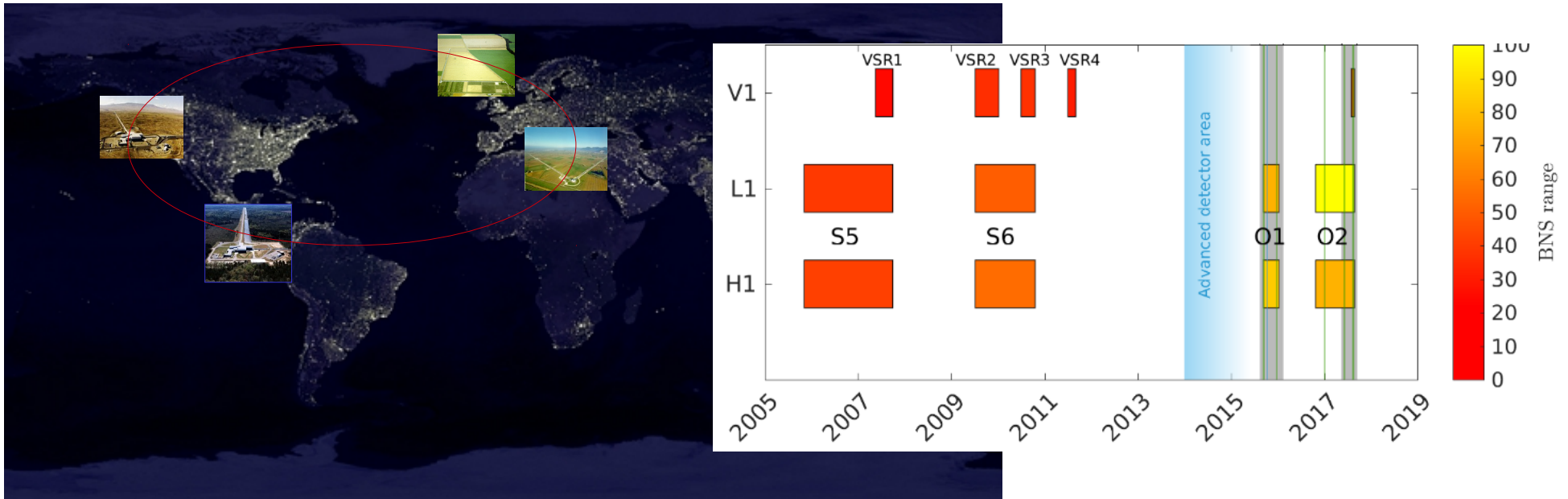
# Journées Advanced Virgo+

L'analyse des données,  
les partenaires,  
et le calcul.

Marie Anne Bizouard, LAL  
31 mai 2018, LKB ENS Paris

# Data analysis

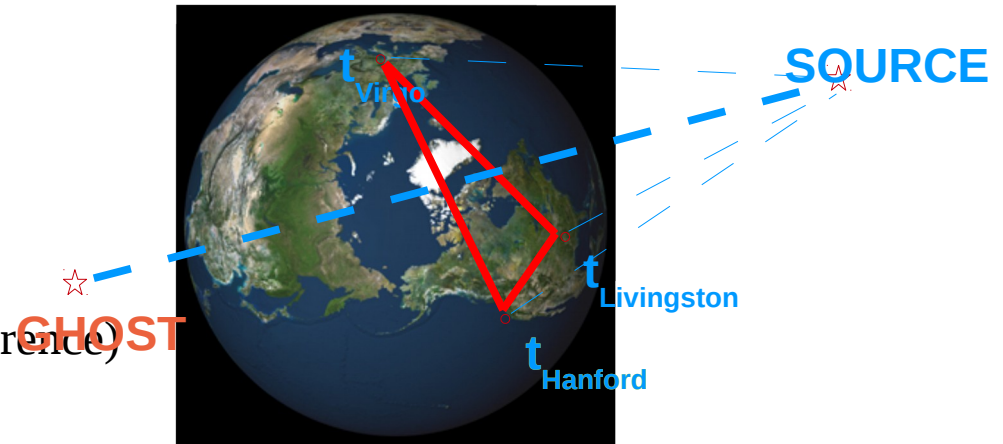
- The organisation: « the single machine »
  - Since 2007, LIGO, GEO and Virgo data analysis is a joint activity. Rules spelled out in the LIGO/Virgo MOU renewed each ~3 years.
    - Exchange of data, joint running planning, commissioning/shutdown.
    - Common data analysis groups + calibration groups and detector characterization (detchar) groups for each collaboration. LSC & Virgo co-chairs.
    - Common data analysis council (DAC).
    - Common publications (joint editorial boards).



# Data analysis

- **The single machine :**

- Increase the sky coverage
- Source reconstruction (localization)
- Reduce false alarm (coincidence/coherence)
- Assess discovery confidence

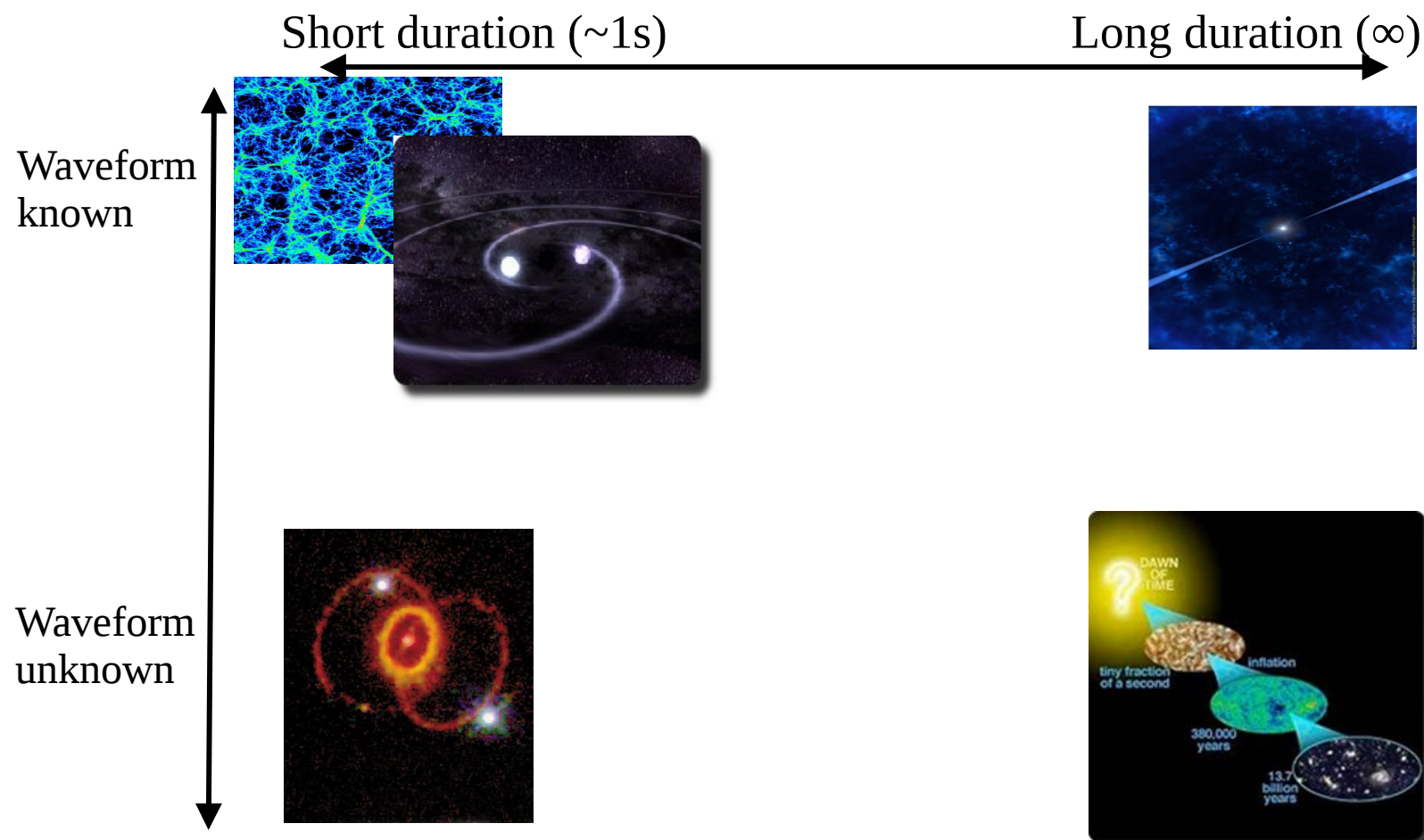


- **Missions:**

1. Find all GW sources in LIGO/Virgo/GEO detectors data.
2. Extract all possible physics results : Fundamental physics tests and measurements :  $H_0$ , graviton celerity, test of equivalence principle, constrain the nuclear matter EOS, ...
3. Provide alerts to the outside world and especially to « observers » (multi-messenger analysis).

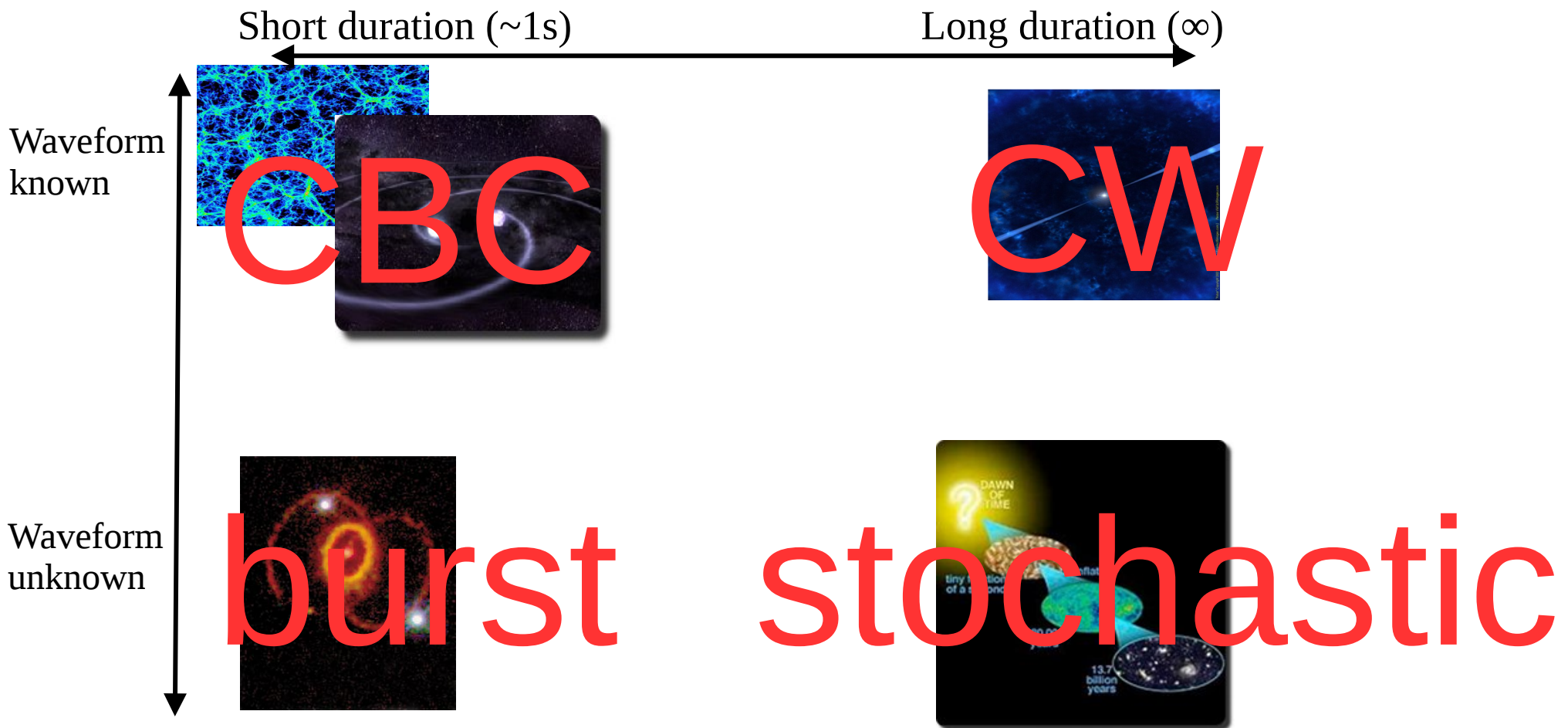
# Data analysis

- Physics groups:



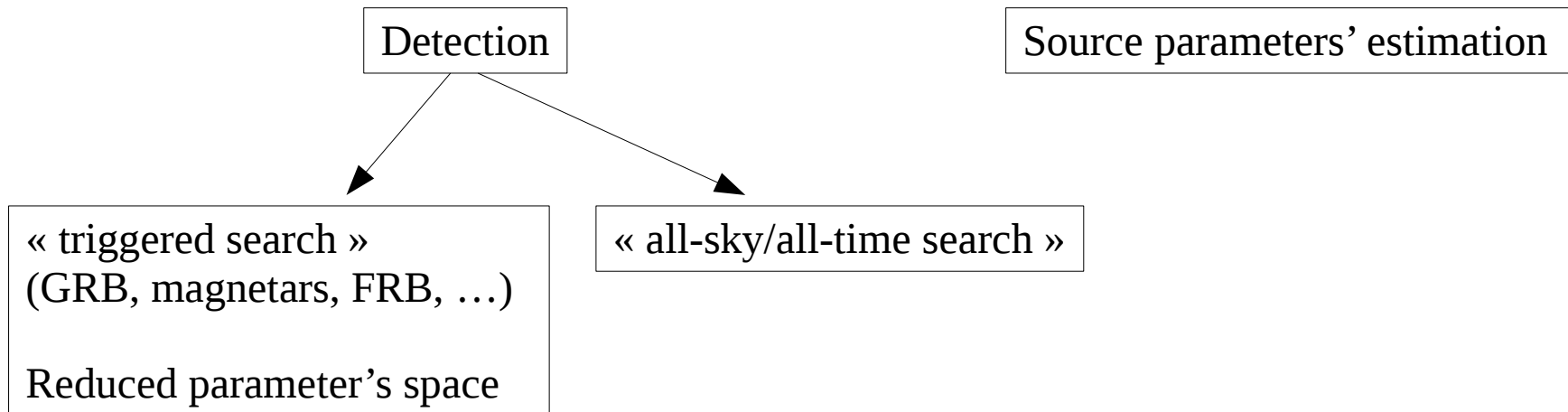
# Data analysis

- Physics groups:



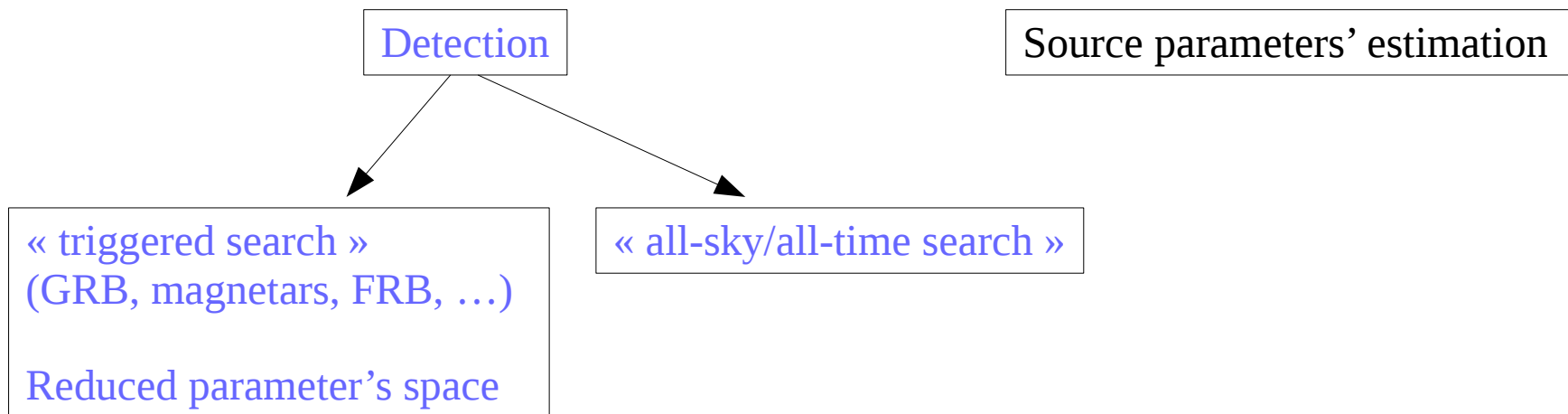
# Data analysis

- Signal processing for all sources :



# Data analysis

- Signal processing for all sources :



## Méthodes :

- Matched filtering quand la forme d'onde est paramétrisable.
- Cross-correlation entre 2  $h(t)$ /detectors quand on ne connaît pas la forme d'onde.
- Excess power/time-frequency decomposition : un signal transitoire est modélisable par la somme de fonctions de sinus-gaussiennes.
- Multi-resolution clustering (sources transitoires non modelises) & peak lines (sources continues)



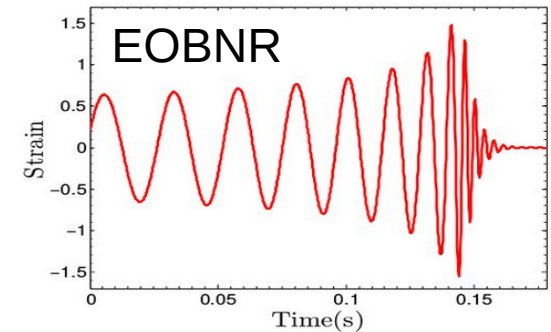
# Data analysis : matched filtering

FFT of data

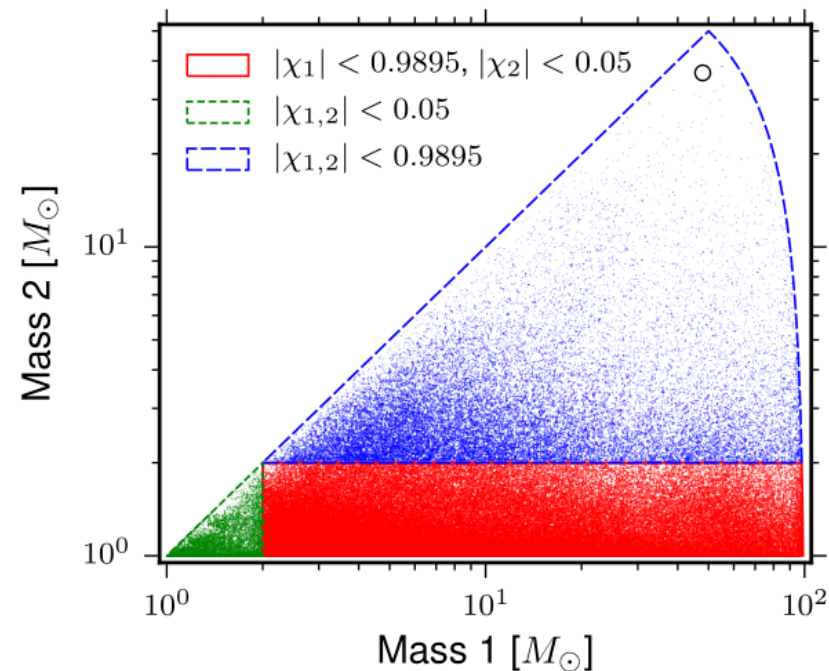
Template can be generated in frequency domain using stationary phase approximation

$$\mathcal{C}(t) = \int_{-\infty}^{\infty} \frac{\tilde{x}(f)\tilde{h}^*(f)}{S_n(f)} e^{2\pi i f t} df$$

Noise power spectral density  
(in this case this is the two-sided Power spectrum)



EOBNR-IHES waveform:  $m_1=36M_{\text{sun}}$ ,  $m_2=29M_{\text{sun}}$ , nonspinning black holes

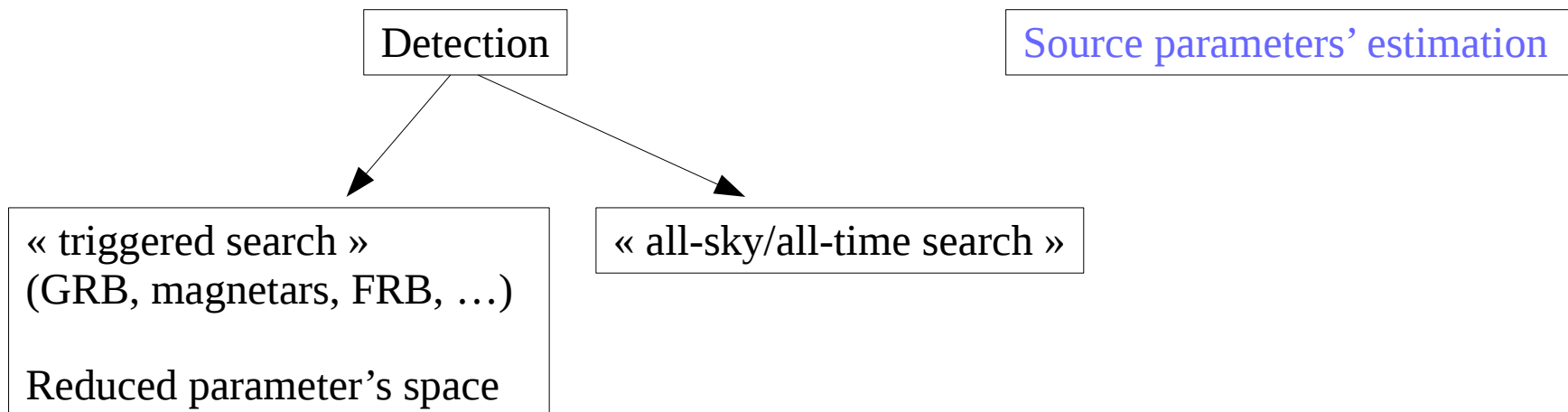


GW150914 search configuration:  
Waveform templates: EOBNR with aligned spins  
Online: low mass regime ( $<20 M_{\text{sun}}$ )  
Offline:  $1\text{-}100 M_{\text{sun}}$



# Data analysis

- Signal processing for all sources :



## Methods :

- [Bayesian inference when waveform is known.](#)

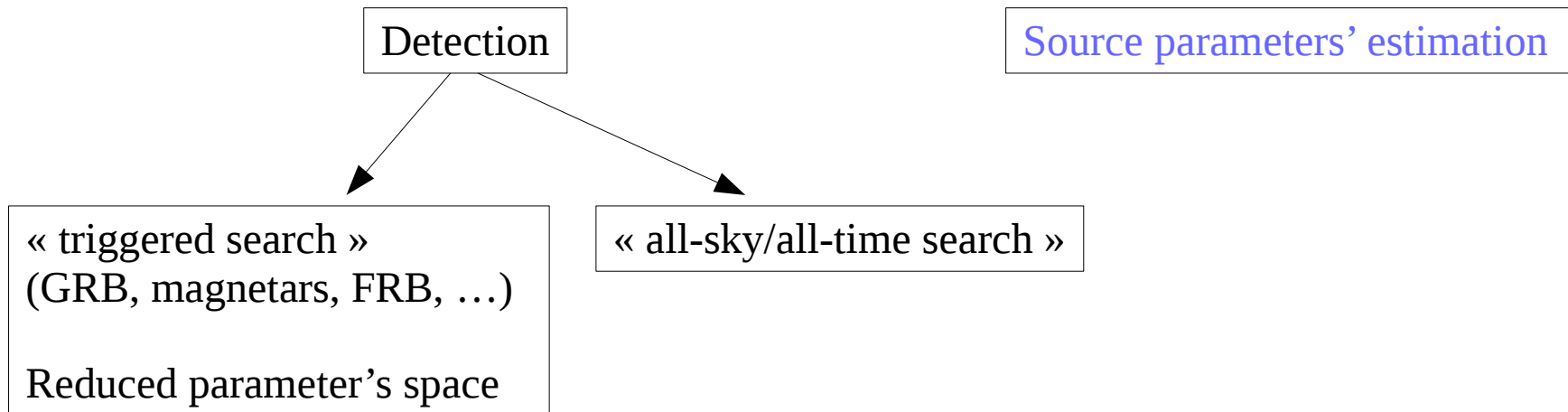
$$p(\vec{\theta}|\text{data}, \text{Model}) = \frac{p(\vec{\theta})p(\text{data}|\vec{\theta}, \text{Model})}{Z}$$

$$Z = \int_{\Theta} p(\vec{\theta})p(\text{data}|\vec{\theta}, \text{Model})d\vec{\theta}$$

- Hasting-metropolis MCMC to generate sample.
- Nested sampling to integrate posterior distributions.

# Data analysis

- Signal processing for all sources :



Methods :

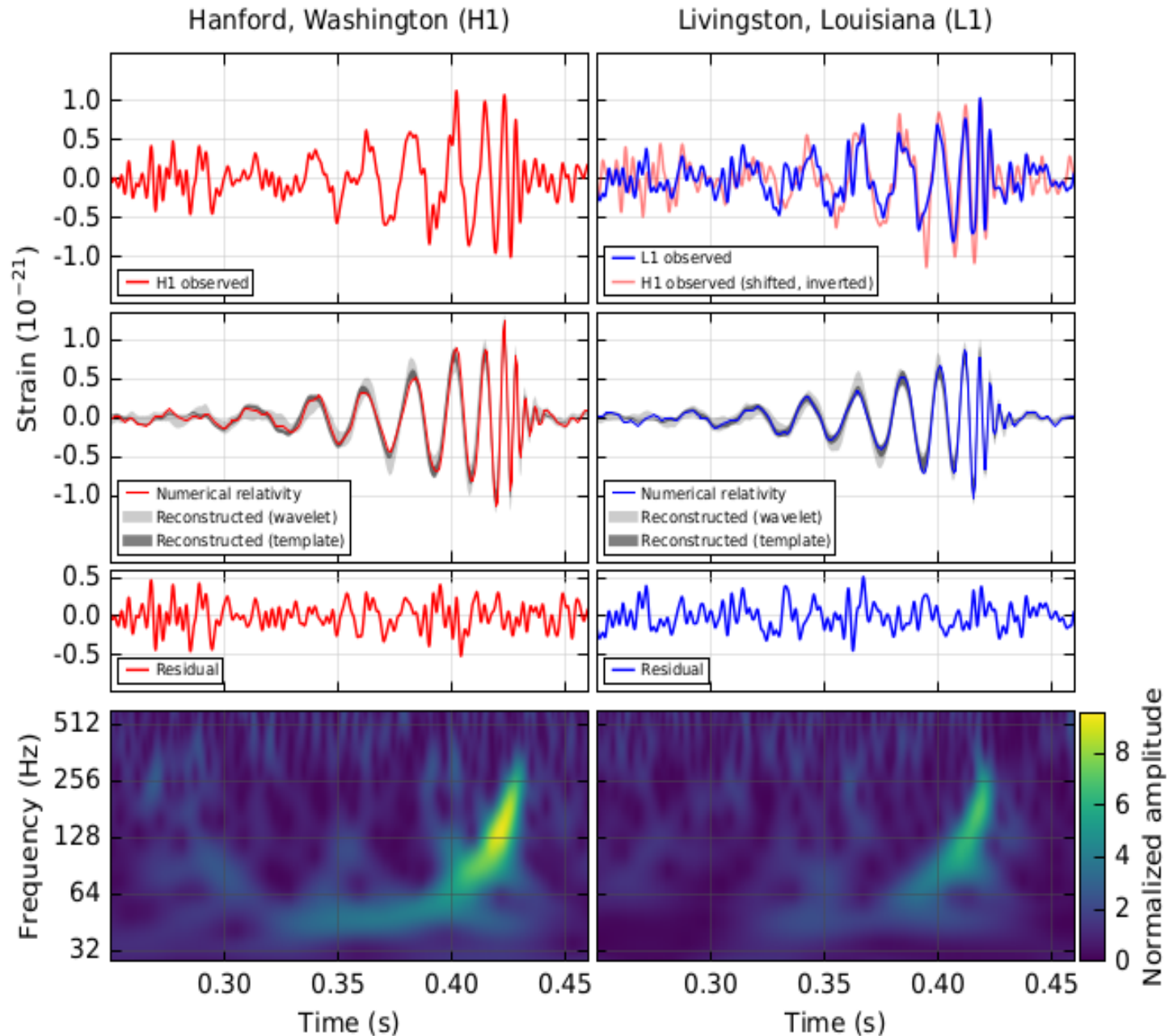
- [Bayesian inference when waveform is unknown.](#)

$$\begin{bmatrix} x_1 \\ \vdots \\ x_N \end{bmatrix} = \begin{bmatrix} F_i^+ / \sigma_i \\ \vdots \\ F_N^+ / \sigma_N \end{bmatrix} h_+ + \begin{bmatrix} F_i^x / \sigma_i \\ \vdots \\ F_N^x / \sigma_N \end{bmatrix} h_x + \begin{bmatrix} n_1 \\ \vdots \\ n_N \end{bmatrix} \rightarrow \mathbf{x} = \mathbf{F}_+^w h_+ + \mathbf{F}_x^w h_x + \mathbf{n}$$

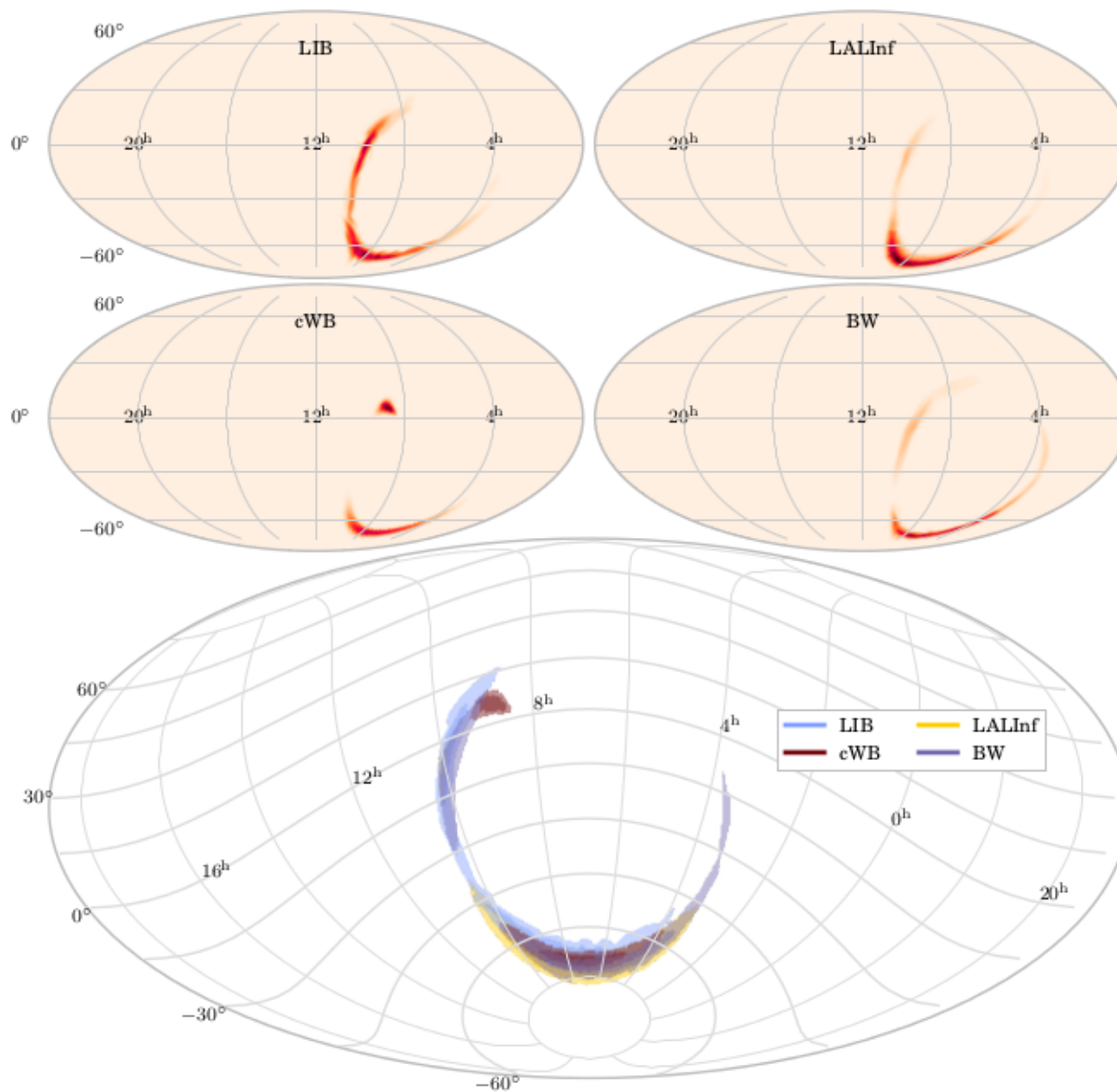
Solution :

$$\hat{h} = (\mathbf{F}\mathbf{F}^T)^{-1} \mathbf{F}^T \mathbf{x}$$

# Data analysis : parameters' estimation

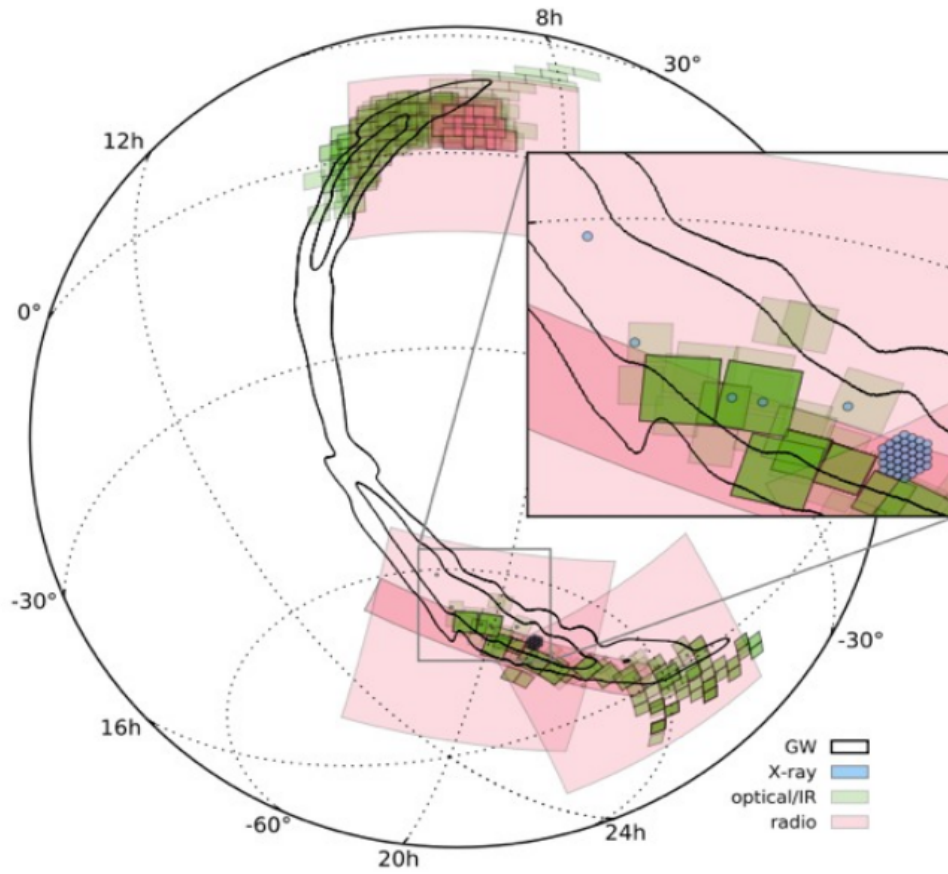


# Data analysis : sky localization



# O1-O2 electro-magnetic / neutrino follow-up

- ~95 MOUs (radio, optical, IR, X-ray and  $\gamma$ -ray)  
+ neutrinos.

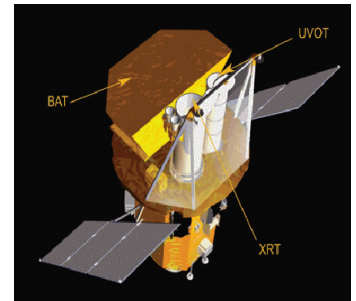
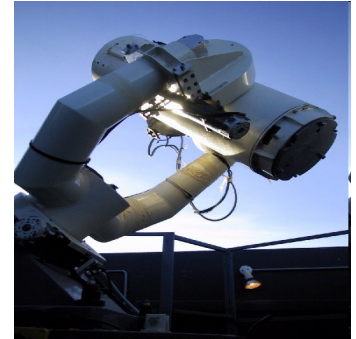


cWB sky map

$\gamma$  / X-ray  
observations

Optical  
observations

Radio Observations





# Multi-messenger analysis : « triggered » & sub-threshold analyses



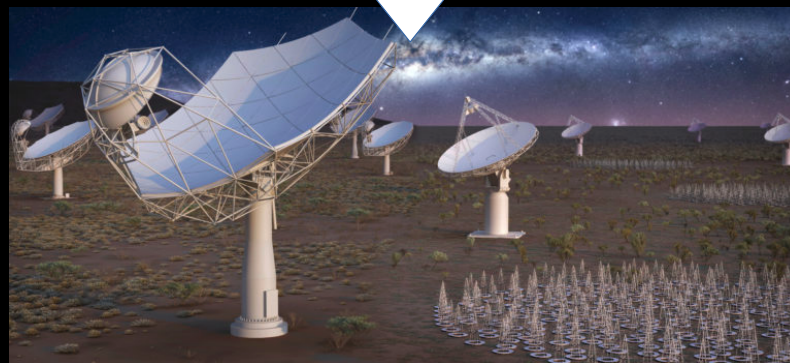
Gravitational waves



X and gamma



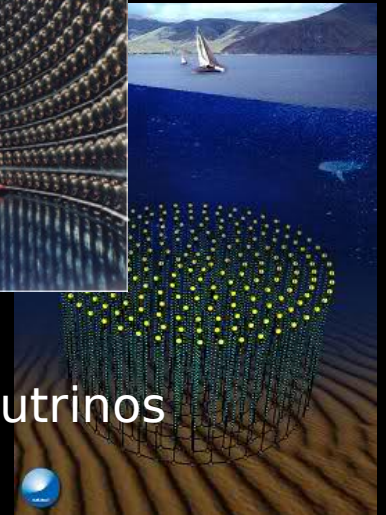
Optical/UV



Radio

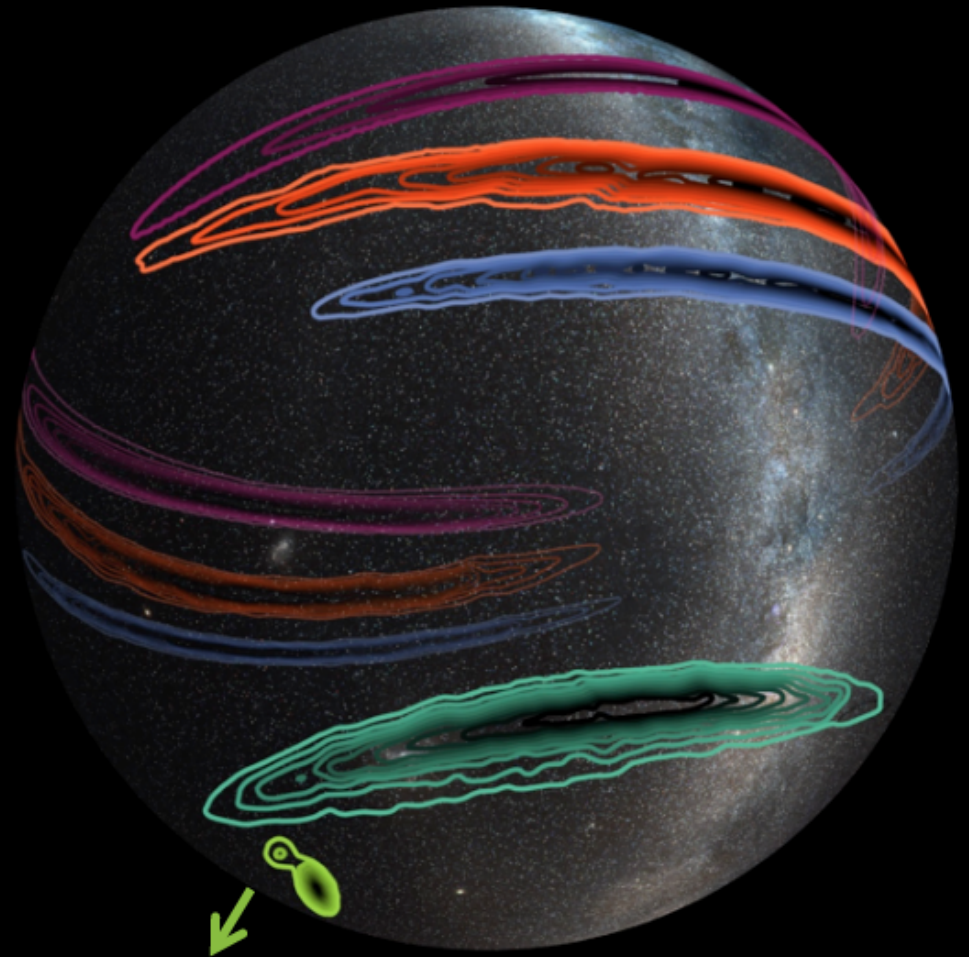
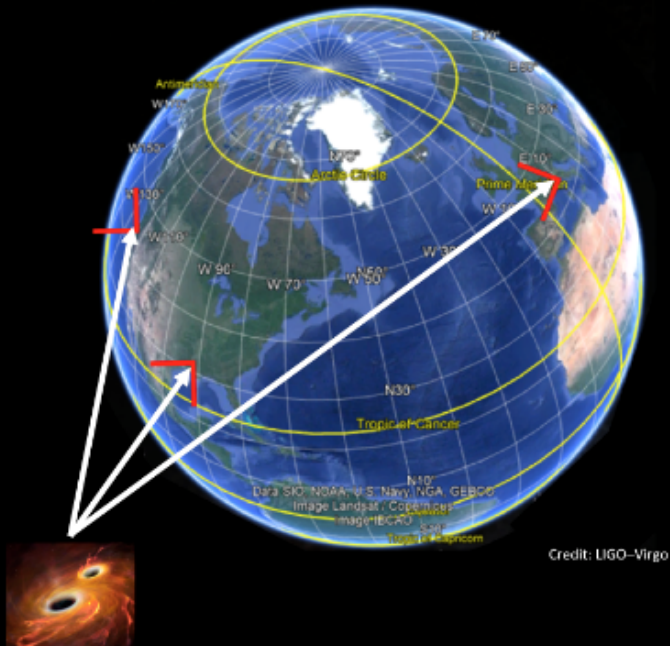


Neutrinos



# Data analysis : network role

2017 August 14



GW170814

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



# Transient sources: low latency & GW alerts

## All-sky / all-time transient searches during O1/O2

- low latency (<5 min)
  - submit **private** GCN notices & circulars the “most significant” triggers
  - ~90 MOU currently active
  - all triggers kept in a private LVC data base
  - LIGO data public release 18 months after data taking.
- Not yet any release fo Virgo data.

## Targeted searches (external triggers)

- GRB, SGR, AXP, magnetars
- medium latency (GRB only)

## Multi-messenger searches

- neutrinos (HEN & LEN), FRB, GRB, ...
- sub-threshold triggers

Latest — as of 20 June 2017 16:22 CDT

Query:

Get neighbors: ☐

UID	Labels	Group	Pipeline	Search	Instruments
<a href="#">G250089</a>		CBC	gstlal	HighMass	H1,L1
<a href="#">G250088</a>		CBC	gstlal	HighMass	H1,L1
<a href="#">G250087</a>		CBC	gstlal	HighMass	H1,L1
<a href="#">G250086</a>		CBC	gstlal	HighMass	H1,L1
<a href="#">G250085</a>		CBC	gstlal	HighMass	H1,L1
<a href="#">G250078</a>		CBC	MBTAOnline		H1,V1
<a href="#">G250077</a>		CBC	MBTAOnline		H1,V1
<a href="#">G250076</a>		CBC	gstlal	HighMass	H1,L1
<a href="#">G250075</a>		CBC	MBTAOnline		H1,V1



# Low latency during O3 & GW alerts

- LIGO/Virgo will release public alerts for event candidates that we are confident about and can stand behind. They will look a lot like events in O1 and O2, except they will be instantly public.

## O3 alerts == public alerts

- For **compact binary coalescences** (CBCs), we aim at an overall astrophysical purity of 90% (e.g. at most 1 in 10 compact binary candidates on average will have instrumental or environmental rather than astrophysical origin). Threshold sets at FAR  $\sim$  1/month – 1/year
- More restrictive threshold for **unmodelled burst** sources : FAR  $\sim$  1/year - 1/100 years.
- Which information will be in the public domain ?
  - **Content :**
    - Alerts should contain all of the information that is useful for searching for a counterpart (if there is one).
    - Details : significance, time, GW signal classification, 3D sky position and distance.
  - **How to get them ?**
    - Preliminary GCN notice within 5 minutes, without human vetting.
    - Initial GCN notice and circulars within  $\sim$ 4 hours with skymaps and classification.
    - Update GCN circulars, especially if better skymaps available.
- Collaborations with external groups : Science driven MOU



# Science driven MOU : policy fundamentals



1. Objectives must be part of the **science program** of the LIGO-Virgo Collaborations.
2. Agreements/collaborations with non-LIGO-Virgo partners should not be “exclusive” for any of the science topics pursued.
3. Data/information/results privacy to be maintained at all times.
4. Joint publications of results upon mutual agreement and with the whole LIGO-Virgo author group.



# Data flow models

- GW transient **triggers below the detection standard** that may improve a specific science/source search when analyzed jointly with the EM/neutrino sectors.
- Several MOUs with similar scope exercised in recent times/still in place:
  - High Energy Neutrinos (Antares, Icecube).
  - Gamma-Ray/X-ray transients sources (Fermi-GBM).
  - Core-collapse Supernova low energy neutrinos (Borexino, Icecube, KamLAND, LVD).
- Generally, not low-latency critical (until now) and with low opportunity cost.

# Data flow models

- **EM transient/neutrino triggers not in the public domain** that may improve a specific science/source search when analyzed jointly in GWs.
- Several MOUs with similar scope exercised in recent times/still in place:
  - High Energy Neutrinos (Antares, Icecube).
  - Gamma-Ray/X-ray transients sources (Fermi-GBM).
  - Fast Radio Bursts (Green Bank Observatory, Parkes Radio telescopes).
  - Core-collapse Supernova low energy neutrinos (Borexino, Icecube, KamLAND, LVD).
- Generally, not low-latency critical (until now) and with low opportunity cost .

# Data flow models

- **EM transient information** not in the public domain that may improve a specific GW search/detection potential.
- Several MOUs with similar scope exercised in recent times/still in place:
  - CCSN light curves, progenitor information (ASAS-SN, DLT40).
- Generally, not low-latency critical.

One specific case : [the Hubble constant measurement](#)

- Host galaxy redshift and peculiar velocity
  - « Complete » galaxy catalogues until several hundred Mpc
- Open calls for collaboration



# Data flow models

- Information on GW transient detection from LIGO-Virgo not in the public domain (OPA) that can be used in analyzing EM data jointly and for specific science targets:
  - Inclination, individual masses and spins, tidal parameters for binary mergers.
  - 3-D localization information including full error budget post-EM counterpart identification.
  - Waveform details on GW transient alert when not a binary merger.

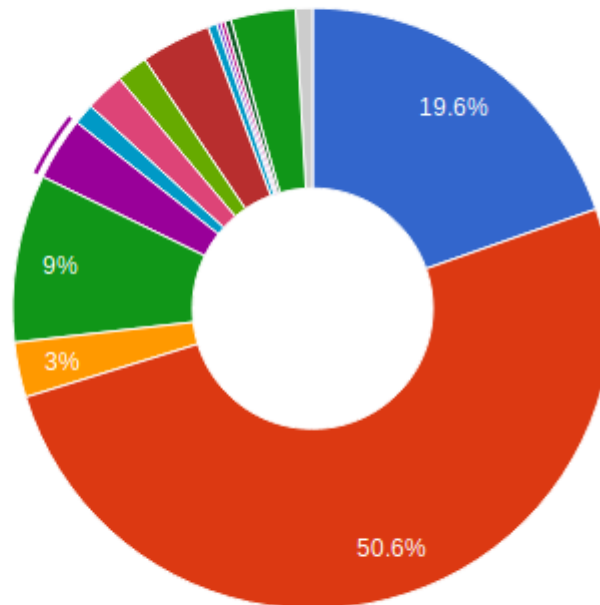


# Data analysis & computing means

- Each collaboration has its own organization :
  - Historically :
    - LSC : « owned centers ». homogenous workloads (condor)
    - Virgo : national computing centers (CC IN2P3, CNAF, NIKHEF, ...). European grid (LCG). non homegenous workloads.
    - Virgo : no manpower/budget/organization for offline computing workload developments.
  - LSC is now using OSG to access different « external » centers including CNAF, CCIN2P3 and NIKHEF.
  - Virgo is lacking manpower for an ambitious DA computing model.
  - Current O2 computing usage :

# LVC computing accounting :

- LIGO-CIT
- ATLAS-AEI
- SUGAR-SU
- NEMO-UWM
- VIRGO.CNAF
- IUCAA
- LIGO-LHO
- LIGO-LLO
- ARCCA-CDF
- OSG-LIGO-CIT-->  
OSG.Unknown
- OSG-SUGAR-SU-->  
OSG.CCIN2P3
- OSG-SUGAR-SU-->  
OSG.Comet
- OSG-SUGAR-SU-->  
OSG.NIKHEF
- OSG-SUGAR-SU-->  
OSG.SURFsara
- OSG-SUGAR-SU-->  
OSG.Unknown
- Other



Sept2016-Sept2017

Virgo 7.4 %

# LVC computing accounting :

- O2 computing usage :

	DAC Estimate (SUs)	Actual Use (SUs)	% of Estimate
<b>CW</b>	145,113,600	1,710,793	1%
<b>CBC</b>	112,643,185	134,364,413	119%
<b>Burst</b>	27,276,670	20,278,027	74%
<b>Detchar</b>	3,048,903	3,781,855	124%
<b>SGWB</b>	894,520	2,348,540	263%
<b>Grand Total</b>	<b>288,976,878</b>	<b>162,483,628</b>	<b>56%</b>

in aLIGO Service Units (SUs)

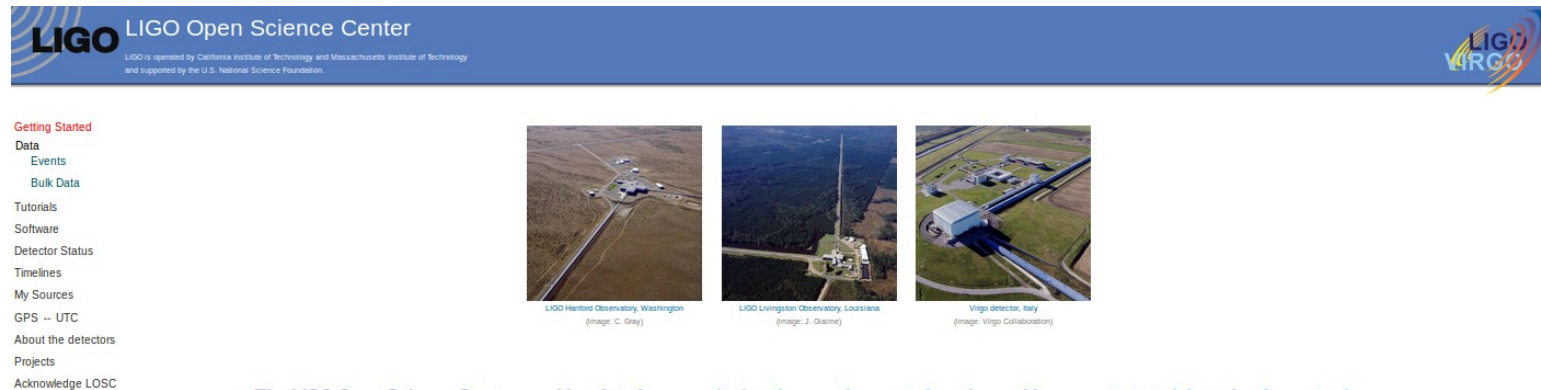
1 SU = 1 Xeon E5-2670 CPU-core-hour






# Virgo computing

- Several activities :
  - Cascina : federate logins, storage upgrade, low latency computing upgrade, ...
  - Data transfer, data access and file catalogues.
  - CCs : DIRAC for data transfer to Ccs and workload Virgo general infrastructure ?
  - /cvmfs to export software and

# AdV+ in the open science era

- LIGO has adopted a LIGO data management plan which specifies that LIGO data become public after XXX months of a run completion. The XXX months period getting reduced as time goes by (right now 18 months, then 12 months → 6 months after O4).
- LIGO has developed the LIGO Open Science Center where :
  - past run LIGO data set are available (S5 & S6 & O1). <https://losc.ligo.org/about/>
  - GW events data snapshot (including Virgo data) are available when GW events are announced/published.
  - Software & tutorials to analyse the data + workshops (next one in Europe in 2019).



-  [Download O1 data release](#)
-  [Get started!](#)
-  [See LIGO and Virgo discoveries](#)
-  [Join the email list](#)
-  [Explore the open data web course](#)

# Conclusion

1. AdV+ data analysis : lots of good physics to do !
2. Multi-messenger analysis : open public alerts is our new model. But collaboration with partners on specific science subject will continue.
3. Computing for AdV+: still understaffed and lacking of a good organization.