# Parameter estimation and cosmology with gravitational waves

#### Archisman Ghosh International Centre for Theoretical Sciences

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TATA INSTITUTE OF FUNDAMENTAL RESEARCH

With contributions from: Walter Del Pozzo, Ajith Parameswaran Abhirup Ghosh, Siddharth Mohite

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Detection of gravitational waves round the corner!

- first data from Adv-LIGO upcoming from the O1 runs ....
- first detections expected soon after.

GW observations  $\Rightarrow$  physics / astrophysics.

Estimation of parameters is a crucial step in getting any physics output from gravitational-wave observations.

[Background: LIGO Hanford Observatory]

## Science with GW observations



#### Parameter estimation as a crucial step

#### Astrophysics:

"Where in the sky?"

"What masses / angular momenta?"

• Cosmology:

"What redshifts and distances?"

• Fundamental physics:

"E.o.s. of NS?", "Parameters of non-GR theories?"

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"Consistency between observed parameters?"

# This talk

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#### Basics

Detectors, sensitivity, sources

Parameter estimation

Parameter estimation as a challenge

Procedure, algorithms employed, some results

Cosmology

Cosmology motivation

Prospects of cosmology with GW

#### Future directions

#### Basics

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Detector network and baselines (*ms*) [Source: http://www.gw-indigo.org, Pic: B. S. Sathyaprakash]

LIGO detectors in Hanford, Livingston (U.S.A) and Virgo in Cascina (Italy).



KAGRA (Japan) and LIGO India ...

Detectors

# Sensitivity



♣ Ad-LIGO has 10 times more sensitivity than initial LIGO; one can survey 1000 times the volume of the sky.
Amplitude detectors!



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# Sources

#### Compact binary coalescences (CBCs):

Mergers of binary systems of NS / BH  $\Rightarrow$  well-modelled "chirp" waveform.

#### NS-NS:

Expected rates  $\sim$  40 (0.4 – 400) yr  $^{-1}$  ,

Horizon distance  $\sim 0.4 \textit{Gpc}.$ 

#### NS-BH:

Expected rates  $\sim$  20 (0.2 – 300) yr  $^{-1}$  ,

Horizon distance  $\sim 1 Gpc$ .

#### NS-NS:

Expected rates  $\sim$  40 (0.4 – 1000) yr<sup>-1</sup>, Horizon distance:  $\sim$  8*Gpc*.

[Abadie et al (2010)]

Bala's talk!



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#### Parameter estimation

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#### What parameters to estimate?

 $\{m_1, m_2, \vec{s}_1, \vec{s}_2\}$ : Intrinsic parameters.

 $\{\alpha, \delta, z, d_L, \iota, \psi, \phi_c, t_c\}$  : Extrinsic parameters.

The masses are completely degenerate with the redshift and it is only possible to measure the redshifted mass,  $m^z \equiv m(1 + z)$ .

phase  $\Rightarrow$  redshifted chirp mass,  $\mathcal{M}^z \equiv \frac{(m_1^2 m_2^2)^{3/5}}{(m_1^2 + m_2^2)^{1/5}}$ , very accurately  $\Rightarrow$  mass ratio,  $q \equiv \frac{m_2}{m_1}$ , to a reasonable degree

 $\begin{array}{ll} \mbox{amplitude} & \Rightarrow & \mbox{the combination, } \frac{\mathcal{M}^z \cos^2 \iota}{d_L}, \mbox{ very accurately} \\ & \Rightarrow & d_L \mbox{ to a reasonable degree} \end{array}$ 

#### The challenge!

$$\{\mathcal{M}, \boldsymbol{q}, \vec{\boldsymbol{s}}_1, \vec{\boldsymbol{s}}_2, \alpha, \delta, \boldsymbol{d}_L, \iota, \psi, \phi_c, t_c\}$$

9 parameters for non-spinning binaries.

15 parameters including spin.

Additional parameters (tidal, etc. terms) for NS.



<sup>[</sup>Plot by: Siddharth Mohite]



#### **Bayesian Inference**

Bayesian parameter estimation: stochastic technique to sample the posterior probability on the parameters given the data and a prior.

$$Posterior(\vec{\Omega}|data, I) = \frac{Prior(\vec{\Omega}|I) \mathcal{L}(data|\vec{\Omega}, I)}{Evidence(data, I)}$$

$$\vec{\Omega} = \{\mathcal{M}, \boldsymbol{q}, \vec{\boldsymbol{s}}_1, \vec{\boldsymbol{s}}_2, \alpha, \delta, \boldsymbol{d}_L, \iota, \psi, \phi_c, \boldsymbol{t}_c\}$$

# Algorithms and software

Documented in: Veitch et al (2014)

The parameter estimation algorithms are implemented LIGO Algorithms Library (LAL) as LALInference.

- LALInferenceMCMC: Parallel tempering
- LALInferenceNest: Nested sampling
- LALInferenceBambi: Multinest

♣ pyPE: Ensemble samplers, etc. [Siddharth Mohite, AG, Walter Del Pozzo]

#### Estimated parameters ...



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#### Parameter estimation of high-mass BBH

AG, Walter Del Pozzo, P. Ajith

- Uniform distribution of  $m_{1,2} \in [20, 50] M_{\odot}$ .
- **♣** *z* ≲ 0.5.
- A SNR  $\geq$  8.

LALInference  $\Rightarrow$  Usual (redshifted) quantities,  $\{\mathcal{M}^z, q, m_{1,2}^z, d_L\}$ Compute: Physical (non-redshifted) quantities,  $\{\mathcal{M}, m_{1,2}\}$ NR fit formulae to compute mass and spin of final BH:

$$\begin{split} M_f &= M \left[ 1 + \left( \sqrt{8/9} - 1 \right) \eta - 0.4333 \, \eta^2 - 0.4392 \, \eta^3 \right] \,, \\ \frac{a_f}{M_f} &= \sqrt{12} \, \eta - 3.87 \, \eta^2 + 4.028 \, \eta^3 \,. \end{split}$$
 [Pan et al (2011)]



AG, Walter Del Pozzo, P. Ajith (in preparation)

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Parameter	3 detector	5 detector
Component masses $m_{1,2}$	13.9%	12.9%
Total mass M	11.4%	7.5%
Chirp mass $\mathcal{M}$	11.0%	6.5%
Final mass M <sub>f</sub>	11.7%	7.6%
Mass ratio q	31.6%	29.2%
Symmetric mass ratio $\eta$	3.7%	3.1%
Final spin $a_f / M_f$	3.1%	2.6%
Luminosity distance d <sub>l</sub>	47.1%	30.0%
Sky location $\Omega$ (sq. deg.)	12.50	2.39





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# Cosmology

#### Measuring cosmological parameters

Which cosmological parameters?

- H<sub>0</sub> : Hubble parameter
- $\Omega_m$ : Matter fraction
- $\Omega_{\mathcal{K}}$  : Curvature fraction
- $\Omega_{\Lambda}$  : Dark energy fraction

 $\Omega_r + \Omega_m + \Omega_k + \Omega_\Lambda = 1$ 

$$rac{\dot{a}}{a} \equiv H_0; \qquad \qquad rac{\ddot{a}}{a} = H_0^2 \left\{ -\Omega_r^{lpha \ 0} - rac{1}{2}\Omega_m + \Omega_\Lambda 
ight\}$$

Expansion and acceleration of the universe.

Measurable is redshift  $\Rightarrow$  Redshift-distance relation:

$$d_L = c(1+z) \int^z rac{dz'}{H(z')} \,, \,\, H(z) = H_0 \sqrt{\Omega_m (1+z)^3 + \Omega_K (1+z)^2 + \Omega_\Lambda}$$

#### Standard candles



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# Necessity of new input

• Calibration relies on multiple steps in the cosmic distance ladder and a large amount of systematics can creep in.

• There is a large variability in the light-curves of SNIa and their physics is not fully understood.

• Even the Hubble parameter is not measured to a great accuracy!

• Tension between supernova and Planck results! Sriram's talk.

An independent measurement will be of prime significance.



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#### Standard sirens

• Gravitational wave give direct access to the luminosity distance to the event without relying on any distance ladder.

They can be used as "standard sirens" analogous to supernovae as standard candles.

• Unfortunately the redshift is totally degenerate with mass and cannot be independently estimated.



## $\mathsf{Cosmology} \rightleftharpoons \mathsf{Redshift}$

Use cosmology: distance  $\rightarrow$  redshift  $\Rightarrow$  physical masses. Use redshift information from coincident electromagnetic event: redshift + distance  $\Rightarrow$  cosmology.

Opens up the possibility of an independent measurement of the cosmological parameters with an entirely different systematics.

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#### NS mergers $\Leftrightarrow$ Sh-GRBs

- A CBC involving a NS is believed to be associated with a Sh-GRB. Resmi's talk.
- . Redshift of the coincident e.m. event.





#### [Nissanke et al (2010), Nissanke et al (2013)]

#### Drawbacks . . .

- $\clubsuit$  Horizon distance for even NS-BH  $\lesssim 1 \mbox{Gpc} \Rightarrow$  only limited cosmology can be probed.
- Probability of coincident observation is low ( $\sim 1$  event per year).

[Metzger & Berger (2009)]

Varun's talk.



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#### • Can one use BBH instead?

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# Cosmology with BBH

No electromagnetic counterpart. Only information can come from identification of potential host galaxies.

Q: Which part of the galaxy catalog should we look in?

A: The entire range of redshifts allowed by the prior on cosmology.

#### Cosmology with BBH

Walter Del Pozzo (2011)

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Too many galaxies even within the allowed range ....

Use all possible galaxies!

Stack information from independent observations.



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Figure : Evolution of  $H_0$  with number of events.

#### Animation by: Walter Del Pozzo

#### Results of Del Pozzo (2011)



 $z \lesssim 0.1$ , SDSS catalogue  $\Rightarrow$  Hubble parameter to  $\sim 5\%$ .

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## Merits . . .

- No immediate e.m. follow-up necessary.
   Varun's talk!
- Much greater horizon distance  $\Rightarrow$  higher redshifts.
- ♣ Some recent pop. synth. models predict more BBH than NS-BH mergers.

... Take advantage of these and see what more can be done ....

# IMR waveforms

▲ Inspiral-merger-ringdown waveforms
 ⇒ Improvement in sky localization.







Inspiral-Merger-Ringdown

Inspiral only

# Higher redshifts

- Higher redshifts,  $z \lesssim 0.5$ .
- . Galaxy catalogues are incomplete.



Large Synoptic Survey Telescope

- extraordinarily wide and deep!
- reasonably complete to  $z\sim 1.$
- start bringing in data by 2020.

Coincides with time-scale for reasonable obs. from LIGO.

- . Until then, do optical follow-up on GW error box.
- Currently we simulate the optical follow-up.

#### Simulating the optical follow-up

Galaxy distribution – uniform in comoving volume.

$$n(z, \alpha, \delta) \propto \frac{dV}{dz d\alpha d\delta}$$

Luminosity distribution – Schecter function.

$$\Phi(M) = 0.4 * \log(10.0)\phi_* 10^{-0.4(\alpha+1)(M-M_*)} e^{-10^{-0.4(M-M_*)}}$$

Selection function – step function.

$$S(m) = \theta(m - m_{th})$$

#### Cosmology from high-redshift BBH

AG, Walter Del Pozzo, P. Ajith

- Uniform distribution of  $m_{1,2} \in [20, 50] M_{\odot}$ .
- **\***  $z \lesssim 0.5$ .
- $\clubsuit$  SNR  $\geq$  8.



#### Cosmology results



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#### Cosmology results



#### Summary of cosmology results



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#### Further work and outlook

GW oriented:

- . Systematics, sensitivity to calibration uncertainties.
- . Inclusion of waveforms with higher harmonics.

Cosmology / astronomy oriented:

- Use e.m. results as a prior.
- Combine with GW results from a Sh-GRB.
- . Weight galaxies with probabilities of hostings CBCs.

• Study dependence on completeness of catalogues.

# THANK YOU!

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