# Extracting the Distribution of Black-hole Parameters from Gravitational-wave Observations 


(Image: MPI for Gravitational Physics / W.Benger-ZIB)
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Formation and Evolution of Black Holes, Aspen


## Jantar Mantar, Delhi



## $C \underbrace{I} A$

## Gravitational-wave observatories



LIGO:
Laser
Interferometer
Gravitational-wave Observatory


LISA:
Laser
Interferometer
Space
Antenna

## Gravitational Waves

- Ripples in spacetime
- Caused by time-varying mass quadrupole moment; GW frequency is twice the orbital frequency for a circular, nonspinning binary

- Indirectly detected by Hulse \& Taylor [binary pulsar]
- Huge amounts of energy released: 5\% of mass-energy of a supermassive black hole binary is comparable to the electromagnetic radiation emitted from an entire galaxy over the age of the universe!
- GWs carry a lot of energy, but interact weakly: can pass through everything, including detectors!


## $C \quad I \quad E \quad A$ <br> Opportunity and Challenge



Michelson-type interferometers

## LISA Binary Sources

- LIGO sensitive @ a few hundred Hz
" NS-NS, NS-BH, BH-BH binaries
- LISA sensitive @ a few mHz
" massive black-hole binaries
- merger tree models to describe history of Galactic mergers
- could be detected anywhere in Universe, SNR up to thousands
- a few to tens of detections [e.g., Sesana et al., 2005]
" extreme-mass-ratio inspirals of WDs/NSs/BHs into SMBHs
- complicated modeling of dynamics in Galactic centers: loss cone problem, resonant scattering, etc.
- could detect tens to hundreds to z~1 [e.g., Gair et al., 2004]
» galactic white dwarf (and compact object) binaries
- 30 million in Galaxy, create noise foreground [Farmer \& Phinney, 2003]
- 20,000 resolvable


## Embarrassment of riches



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[Arnaud et al., 2007, CQG 24 S551]


## LISA Data Analysis

$$
h(t)=h\left(M_{1}, M_{2}, \overrightarrow{S_{1}}, \overrightarrow{S_{2}}, \theta, \phi, D_{L}, e, \ldots ; t\right) \quad 17 \text { parameters }
$$

## What has already been accomplished?

|  | MLDC 1 | MLDC 2 | MLCD 1B | MLDC 3 |
| :---: | :---: | :---: | :---: | :---: |
| © | - Verification <br> - Unknown, isolated <br> - Unknown, interfering | - Galaxy of $3 \times 10^{6}$ | - Verification <br> - Unknown, isolated <br> - Unknown, confused | - Galaxy of $6 \times 10^{7}$ chirping |
| $\stackrel{I}{\infty}$ | - Isolated $\checkmark$ | -4-6x, over Galaxy and EMRIs | - Isolated $\checkmark$ | - Over Galaxy spinning, precessing |
| $\sum_{\Psi}^{\widetilde{\sim}}$ |  | - Isolated <br> - 4-6x, over Galaxy and SMBHs | - Isolated $\checkmark$ | $\cdot 5$ <br> together, weaker |
| $\begin{aligned} & 3 \\ & 2 \\ & Z \end{aligned}$ |  |  |  | - Cosmic string $\checkmark$ cusp bursts <br> - Cosmological background |

Table by M. Vallisneri

## Mock LISA Data Challenges

Need innovative search techniques to separate many overlapping signals: MarkovChain Monte Carlo, MultiNest, genetic algorithms

[Gair, IM, Wen, 2008, CQG 25 184031]

## $C \quad A R A$ <br> Markov Chain Monte Carlo

$\mu\left(M_{\odot}\right)$

Signal: 2.994

Animation by Marc van der Sluys

Iteration: $0.008+00$
Dota points: $0.00 \mathrm{E}+00$



## SMBH binaries




| Model | $N$ | $N_{\text {det }}$ | $N_{10 \% D_{L}}$ | $N_{10 \operatorname{deg}^{2}}$ | $N_{10 \operatorname{deg}^{2}, 10 \% D_{L}}$ | $N_{1 \operatorname{deg}^{2}}$ | $N_{1 \operatorname{deg}^{2}, 1 \% D_{L}}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| SE | 80 | $33(25)$ | $21(8.0)$ | $8.2(1.5)$ | $7.9(1.1)$ | $2.2(0.6)$ | $1.7(0.1)$ |
| SC | 75 | $34(27)$ | $17(4.4)$ | $6.1(0.4)$ | $5.5(0.4)$ | $1.3(0.1)$ | $1.3(0.1)$ |
| LE | 24 | $23(22)$ | $21(7.7)$ | $10(0.8)$ | $10(0.7)$ | $2.2(0.1)$ | $1.2(0.05)$ |
| LC | 22 | $21(19)$ | $14(4.3)$ | $6.5(0.5)$ | $5.4(0.5)$ | $1.8(0.04)$ | $1.0(0.1)$ |

from [Arun et al. (LISA Parameter Estimation Taskforce), 2008, CQG 26, 094027]

## $C \underbrace{C} A$

## Mock LISA Data Challenge Results

## Challenge 3.2 : Massive Black Holes



30 days before merger
Monte Carlo by Neil Cornish

Challenge 3.2 : Massive Black Holes


1 day before merger
Monte Carlo by Neil Cornish

| source $\left(\mathrm{SNR}_{\text {true }}\right)$ | group | $\begin{array}{\|r} \Delta M_{c} / M_{c} \\ \times 10^{-5} \end{array}$ | $\begin{array}{r} \Delta \eta / \eta \\ \times 10^{-4} \end{array}$ | $\begin{gathered} \Delta t_{c} \\ (\mathrm{sec}) \end{gathered}$ | $\Delta$ sky <br> (deg) | $\begin{array}{r} \Delta a_{1} \\ \times 10^{-3} \end{array}$ | $\begin{array}{r} \Delta a_{2} \\ \times 10^{-3} \end{array}$ | $\begin{gathered} D / D \\ 10^{-2} \end{gathered}$ | SNR | $\mathrm{FF}_{A}$ | $\mathrm{FF}_{E}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| MBH-1 <br> (1670.58) | AEI | 2.4 | 6.1 | 62.9 | 11.6 | 7.6 | 47.4 | 8.0 | 1657.71 | 0.9936 | 0.9914 |
|  | CambAEI | 3.4 | 40.7 | 24.8 | 2.0 | 8.5 | 79.6 | 0.7 | 1657.19 | 0.9925 | 0.9917 |
|  | MTAPC | 24.8 | 41.2 | 619.2 | 171.0 | 13.3 | 28.7 | 4.0 | 1669.97 | 0.9996 | 0.9997 |
|  | JPL | 40.5 | 186.6 | 23.0 | 26.9 | 39.4 | 66.1 | 6.9 | 1664.87 | 0.9972 | 0.9981 |
|  | GSFC | 1904.0 | 593.2 | 183.9 | 82.5 | 5.7 | 124.3 | 94.9 | 267.04 | 0.1827 | 0.1426 |

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## $C \xrightarrow{C} A$ <br> Extreme Mass Ratio Inspirals





Sound from Scott Hughes

Animation from Jon Gair

## $C \underbrace{I \quad E-R} A$

## Exploring íne spacetisoe...



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## $C \underbrace{I} A$

## ... taking lots of pictures



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## $C \underbrace{C E R} A$

## Testing the no-hair theorem



## Testing the no-hair theorem?



Stationary, vacuum, asymptotically flat spacetimes in which the singularity is fully enclosed by a horizon with no closed timelike curves outside the horizon are described by the Kerr metric

Do black holes have hair?


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$M_{n}+i S_{n} \neq M(i a)^{n}$

[Gair, Li, IM, 2009, PRD 77:024035]

## $C \underbrace{I} A$ <br> Third-generation detectors

- The Einstein Telescope:
» Underground, sensitive to 1 Hz
" Exciting science example: mergers of light seeds of massive black holes at high redshifts [Sesana, Gair, IM, Vecchio, 2009]
- ALIA/DECIGO/BBO
" Space-based LISAs on steroids
" Exciting science example: using 300,000 merging binaries as standard candles for precision cosmology: Hubble constant to $0.1 \%$, w to 0.01 [Cutler \& Holz, 2009]

from [Gair, IM, Sesana, Vecchio, 2009]
- Pulsar timing [see next talk!]
" Sensitive to SMBHBs @ $10^{-8} \mathrm{~Hz}$


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## yield a set of individual marginalized posterior probability density functions





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See IM, 20I0, arXiv:09I2.553I for the answer.:-)

