

# BINARY BLACK HOLE SIMULATIONS FOR SURROGATE MODELING

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# GW150914: BINARY BLACK HOLE MERGER



Figure credit: SXS Lensing

GW150914 followup with the Spectral Einstein Code (SpEC):

- Targeted simulations  
*G. Lovelace, Tuesday 4:30pm*
- Phenomenological model calibration
- Surrogate model building  
*J. Blackman, Wednesday 2:00pm*

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# SURROGATE MODEL

**Motivation:** Estimate source parameters using only NR

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**Too expensive to be performed with NR**

**Solution:** Perform only the “most distinct” simulations and then interpolate to arbitrary parameters

$$\left[ \begin{array}{c} \text{blue waveform} \\ \text{blue source} \end{array} \right] = C_1 \left[ \begin{array}{c} \text{red waveform} \\ \text{red source} \end{array} \right] + C_2 \left[ \begin{array}{c} \text{green waveform} \\ \text{green source} \end{array} \right] + \dots$$

*See companion talk (J. Blackman, Wednesday 2pm)*

# CHOOSING SIMULATION PARAMETERS

How do we choose simulation parameters?

- Parameters for each simulation chosen by a greedy algorithm using a training space of approximate waveforms
- Parameter bounds informed by:
  - ① Estimated parameters of GW150914
  - ② Surrogate modeling limitations
  - ③ Computational limitations

# 1. ESTIMATED PARAMETERS OF GW150914

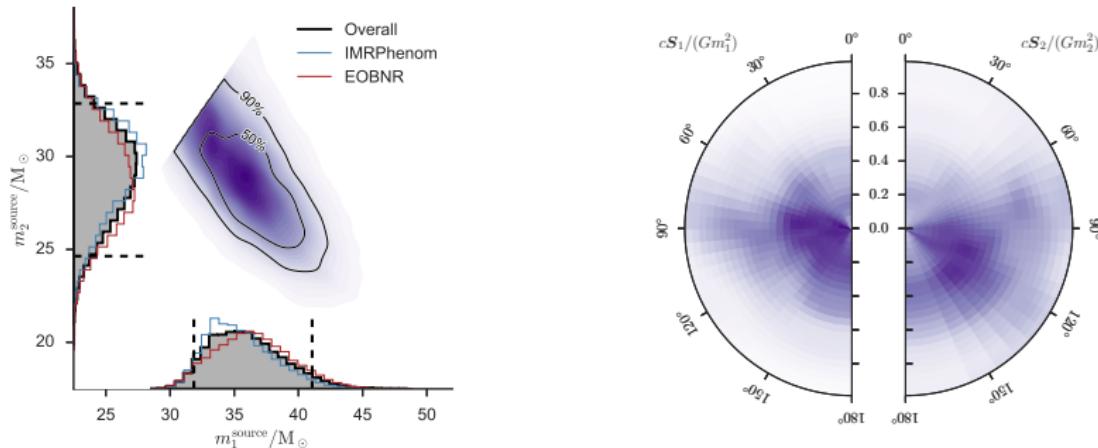


Figure credit: LVC 2016 (arXiv: 1602.03840)

Parameter estimation with phenomenological models:

- Mass ratio  $q \equiv m_1/m_2$  is near unity
- Total mass  $M_{\text{tot}} \equiv m_1 + m_2$  suggests few orbits
- Component spins  $\vec{S}_1, \vec{S}_2$  are poorly constrained

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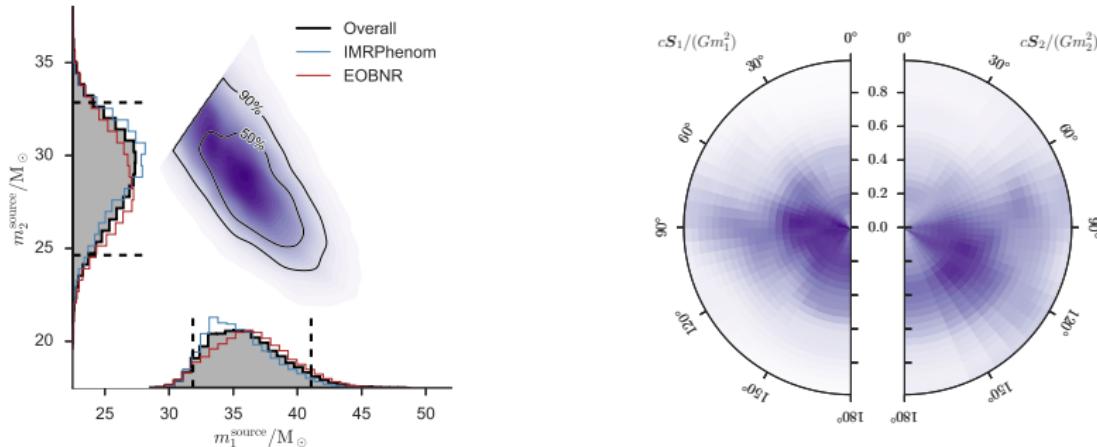


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⇒ **Nearly ideal for fast and efficient NR simulations!**

## 2. SURROGATE MODELING LIMITATIONS

- Not known how to build a (fast) 7d surrogate.
- Need  $\mathcal{O}(1000)$  simulations for 7d, but only  $\mathcal{O}(300)$  for 4d.

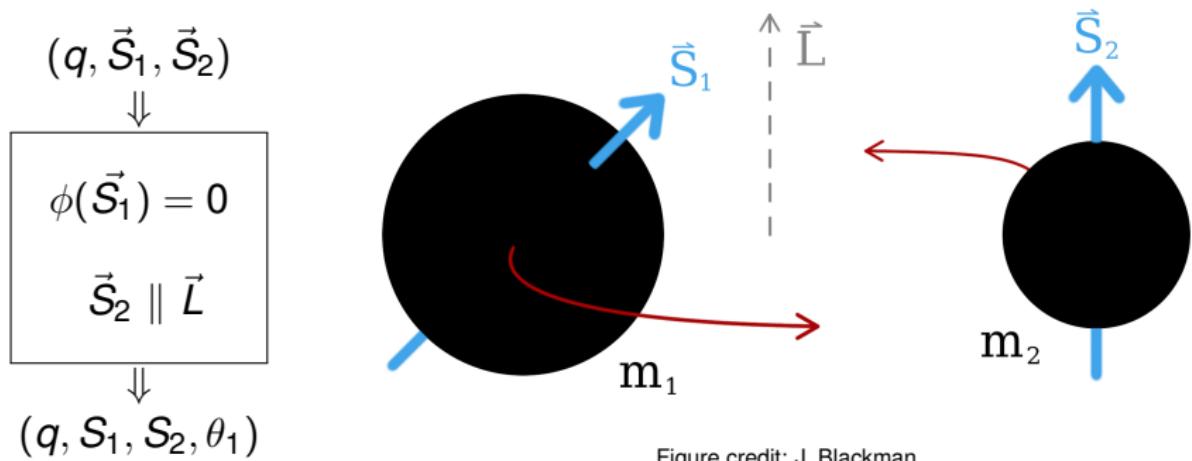


Figure credit: J. Blackman

### 3. COMPUTATIONAL LIMITATIONS

Parameters competing for limited computational resources:

- Higher **numerical resolution**
- Lower **eccentricity**
- Higher **mass ratio and spins**
- Longer **waveforms**
- More **simulations**

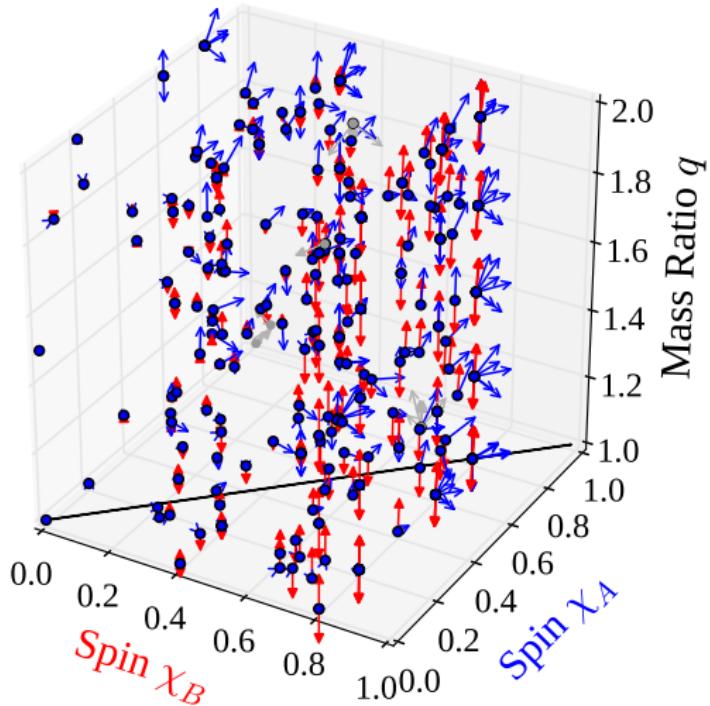


# NUMERICAL SIMULATIONS

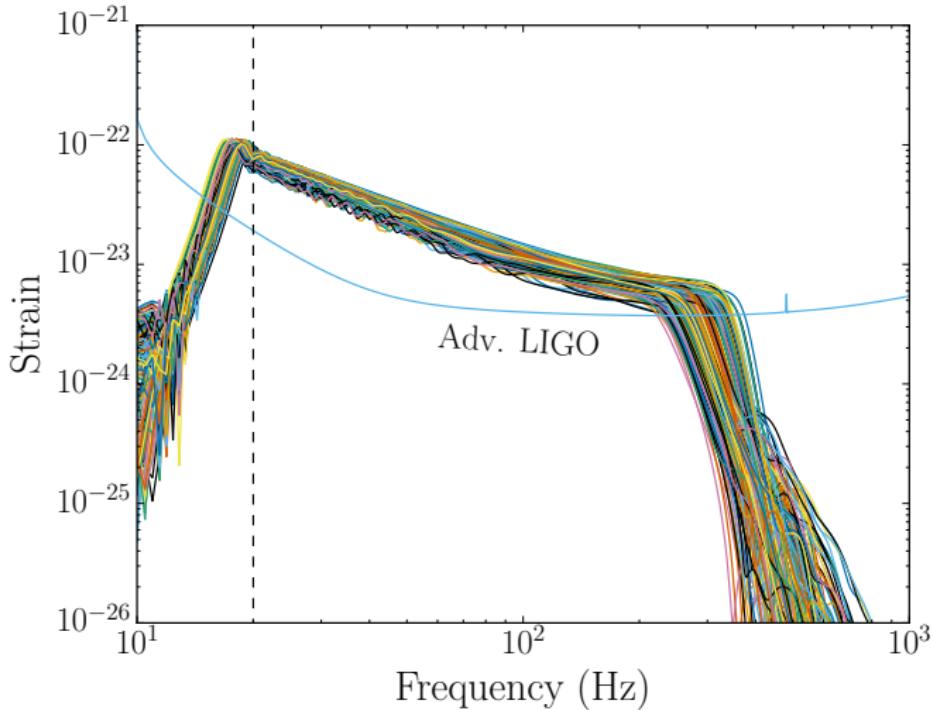
**286 simulations**

4d parameter space  
(9 for model verification)

- $1 \leq q \leq 2$
- $|\chi_{A,B}| \leq 0.8$
- $e \leq 7 \times 10^{-4}$
- $5000M$  ( $\sim 20$  orbits) + ringdown



# NUMERICAL SIMULATIONS

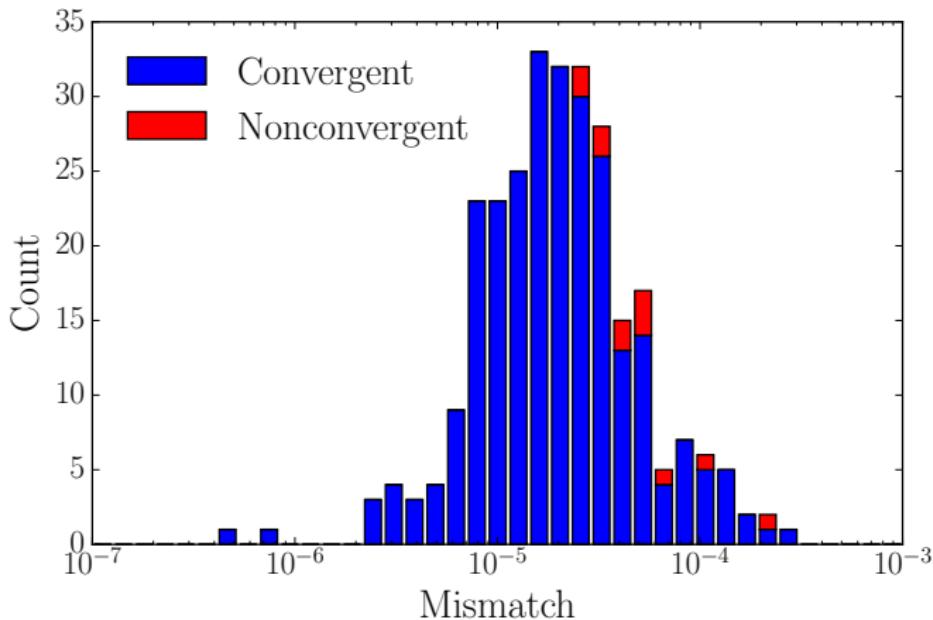


NR simulations valid  $\gtrsim 20$  Hz with  $M_{\text{tot}} = 65M_{\odot}$

# NUMERICAL ERRORS

Performed each configuration at three resolutions  
set by AMR truncation error tolerance  $e_{\text{AMR}}$

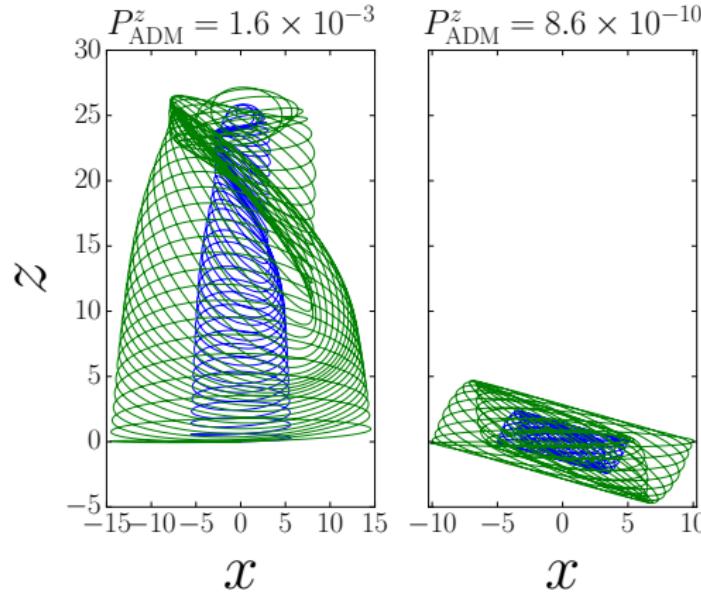
$$e_{\text{AMR}} \sim 4^{-k}, \quad k = 1, 2, 3$$



# NUMERICAL ERRORS

Drift of the center of mass:

- Causes undesirable mode mixing in waveforms
- Procedure to clean modes in post-processing not an ideal solution (*cf.* arXiv: 1509.00862)



## CONCLUSIONS

- Rapidly produced a large number of high-accuracy BBH simulations in the vicinity of GW150914
- Enhancements to SpEC have improved waveform quality
- Simulations were used to construct a surrogate model for fast waveform evaluation
- Will be available at [black-holes.org/waveforms](http://black-holes.org/waveforms)

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## *Acknowledgments*

**Model:** J. Blackman, S. Field, C. Galley, P. Schmidt, R. Smith

**Simulations:** J. Blackman, A. Bohn, N. Demos, A. Garcia, M. Giesler, M. Okounkova, M. Scheel, P. Schmidt, V. Varma

**Code:** SpEC, GWFrames (SXS Collaboration)



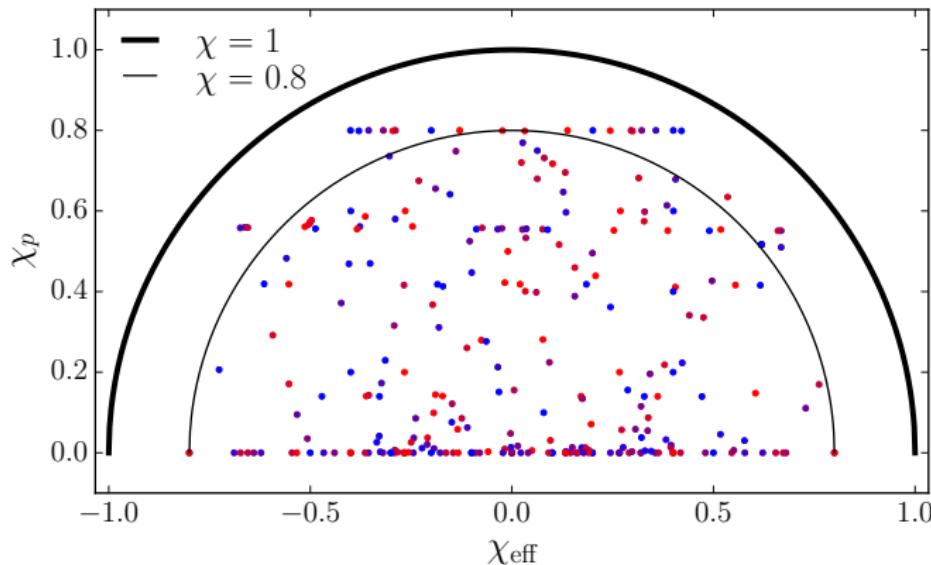
SIMULATING EXTREME SPACETIMES  
*Black holes, neutron stars, and beyond...*

# SUPPLEMENTAL FIGURES

# PHENOMENOLOGICAL MAPPING

Coverage of the phenomenological spin parameter space  
(cf. arXiv: 1408.1810)

$$\begin{aligned}\vec{S}_1 &\mapsto \vec{S}_{\text{eff}} + \vec{S}_p \\ \vec{S}_2 &\mapsto 0\end{aligned}$$



# PHENOMENOLOGICAL MAPPING

