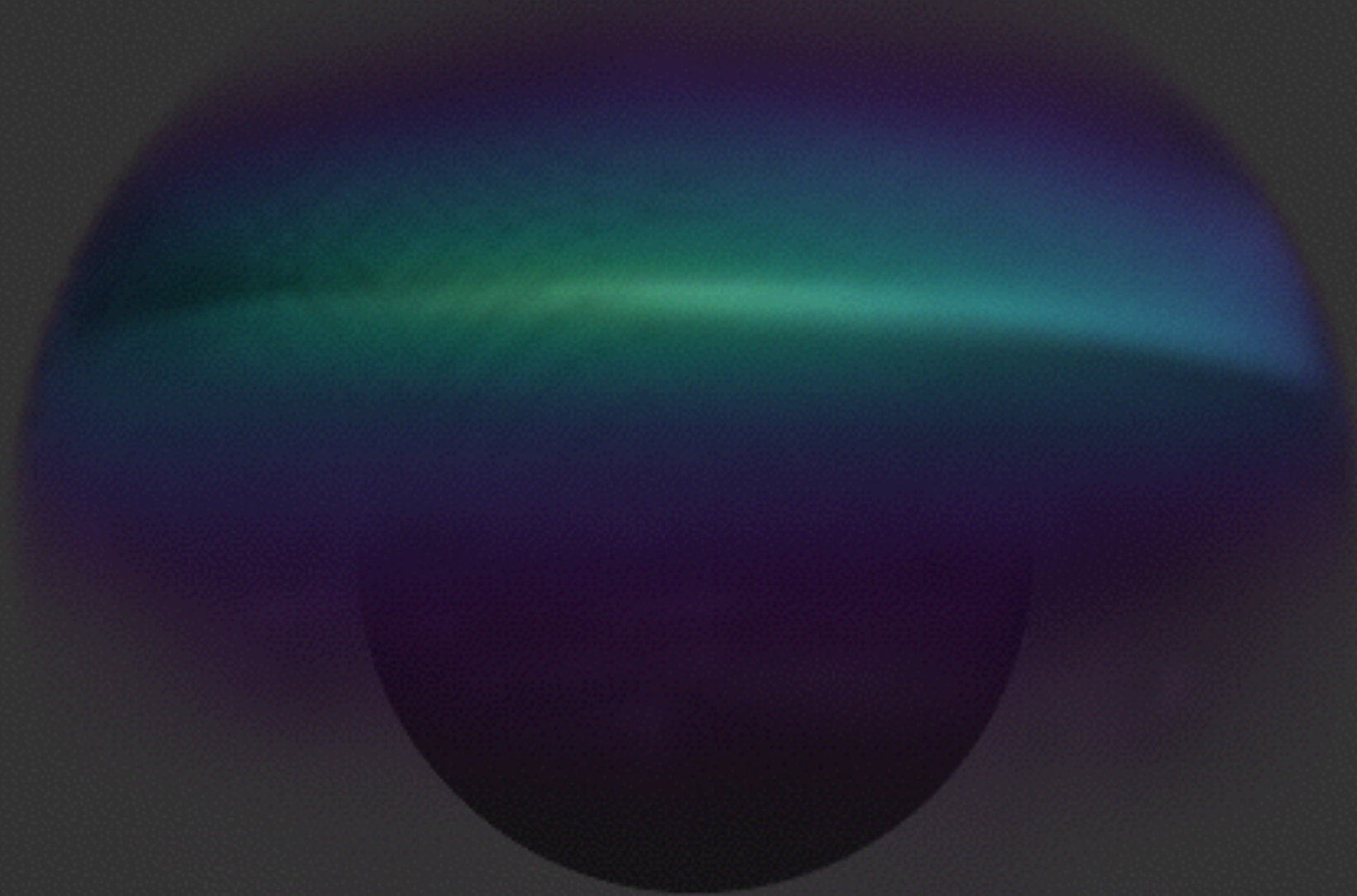


Measuring Spin with LIGO



Ben Farr

KITP: Massive Stars Workshop



THE UNIVERSITY OF
CHICAGO

15 Model Parameters

Intrinsic	Extrinsic
Masses (2) Spins (6)	Location (2) Distance (1) Inclination (1) Orientation (2) Merger Time (1)

Bayesian Inference

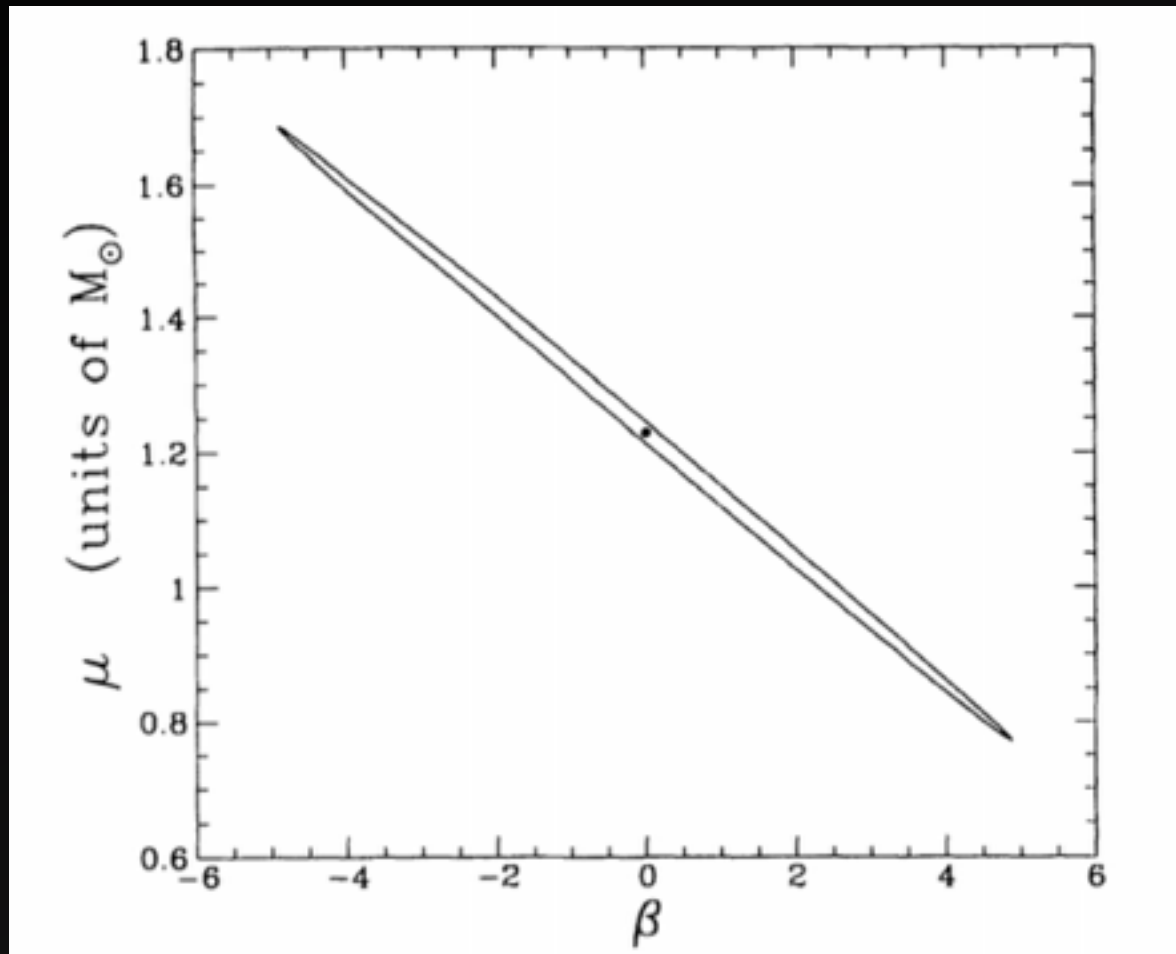
$$p(\vec{\theta} | d) \propto p(\vec{\theta}) p(d | \vec{\theta})$$

Posterior

Prior

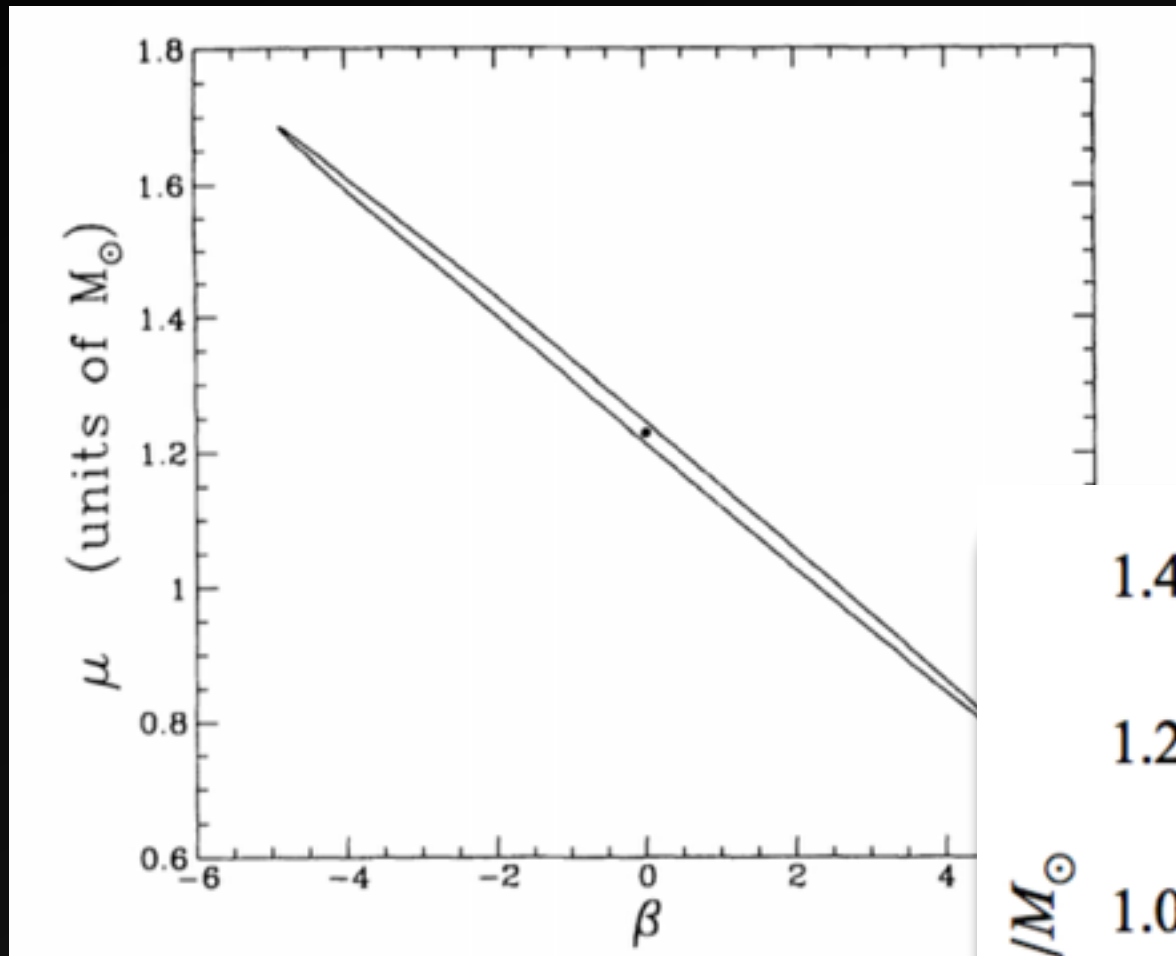
Likelihood

Mass-Spin Degeneracy

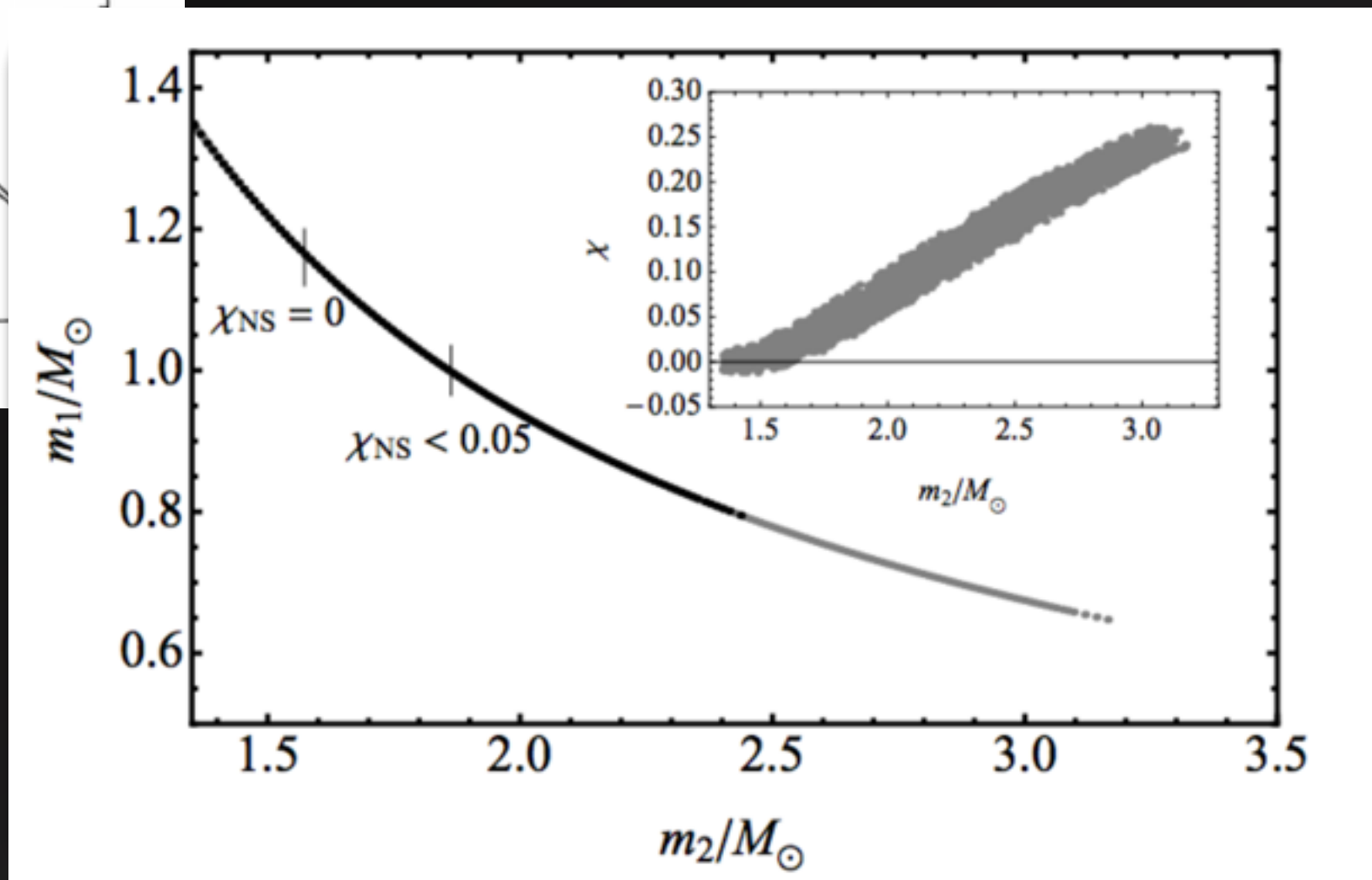


Cutler & Flanagan (1994)

Mass-Spin Degeneracy

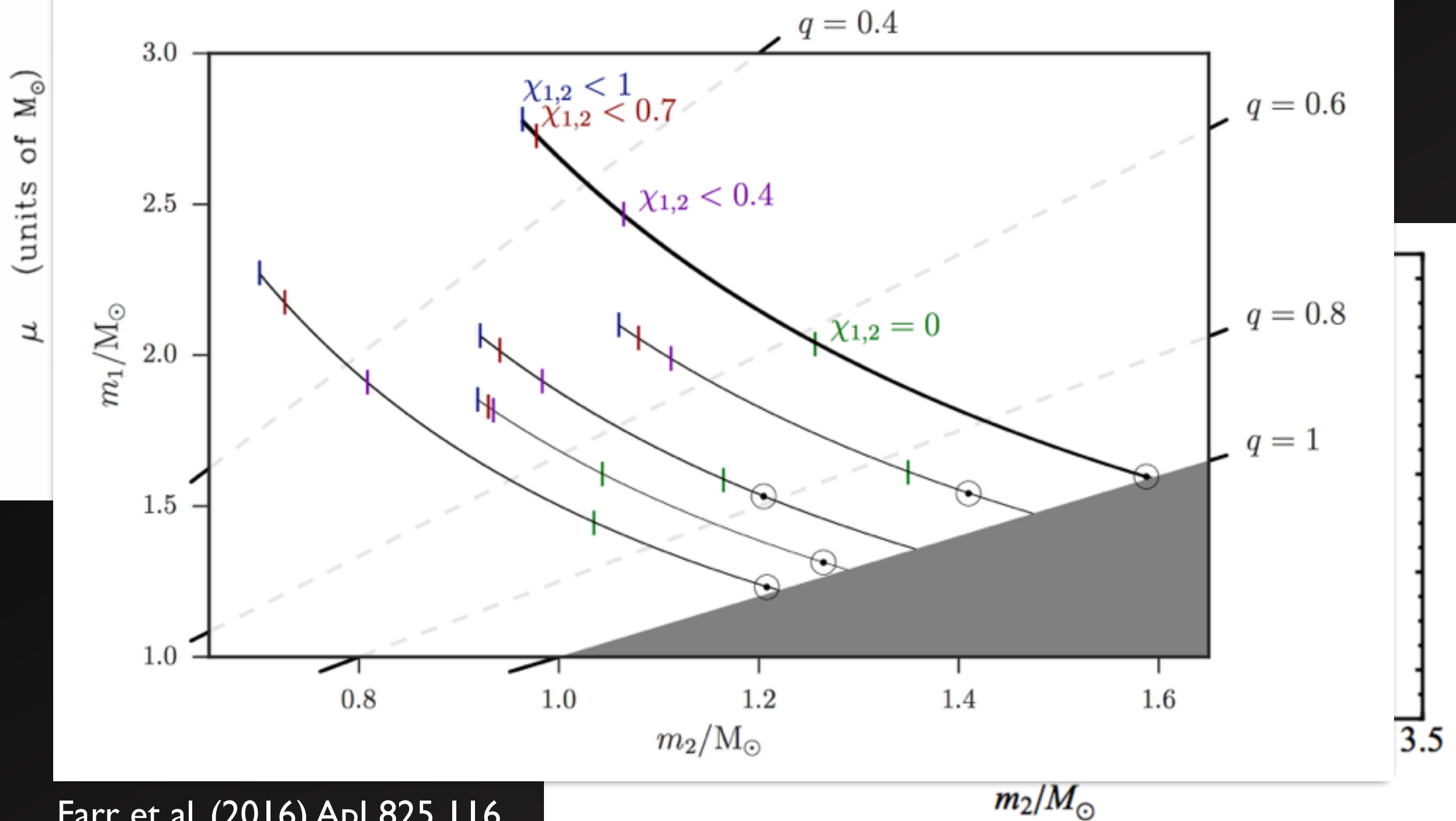


Cutler & Flanagan



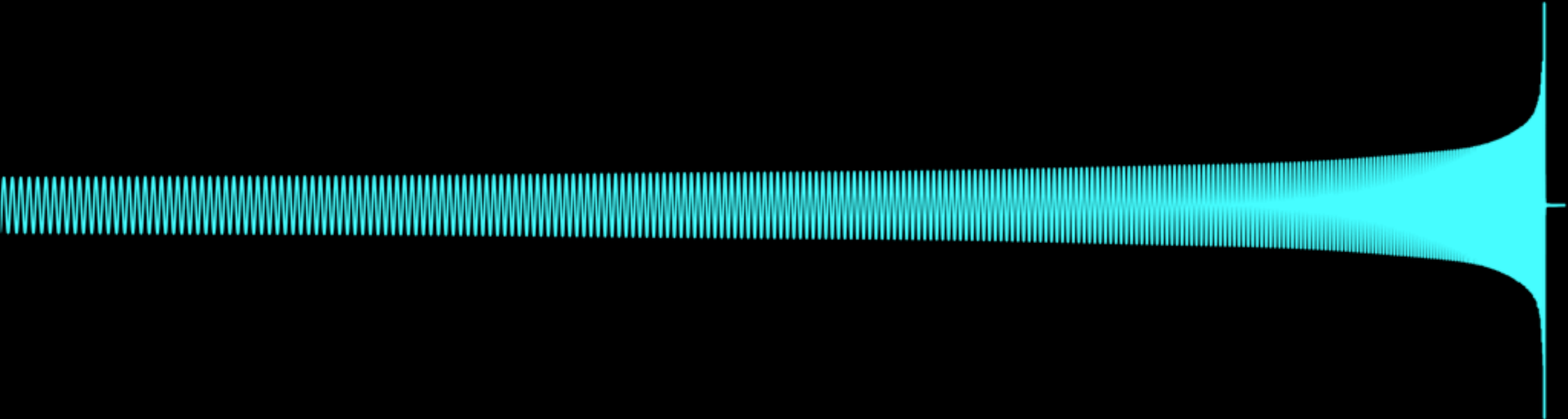
Hannam et al. (2013)

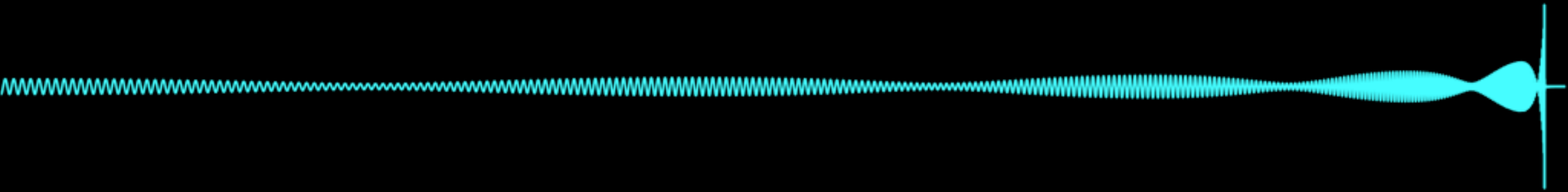
Mass-Spin Degeneracy

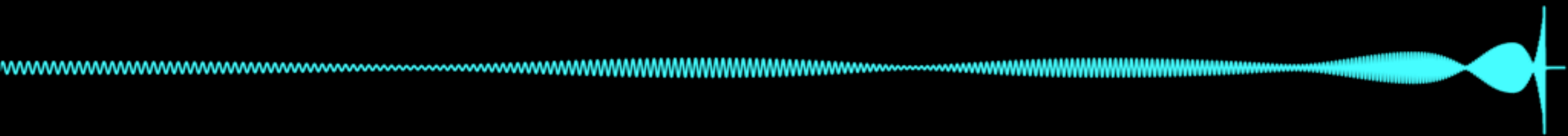
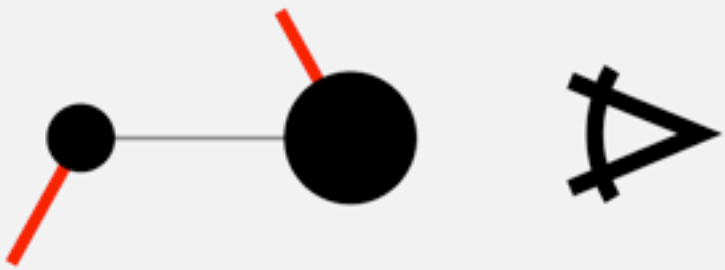


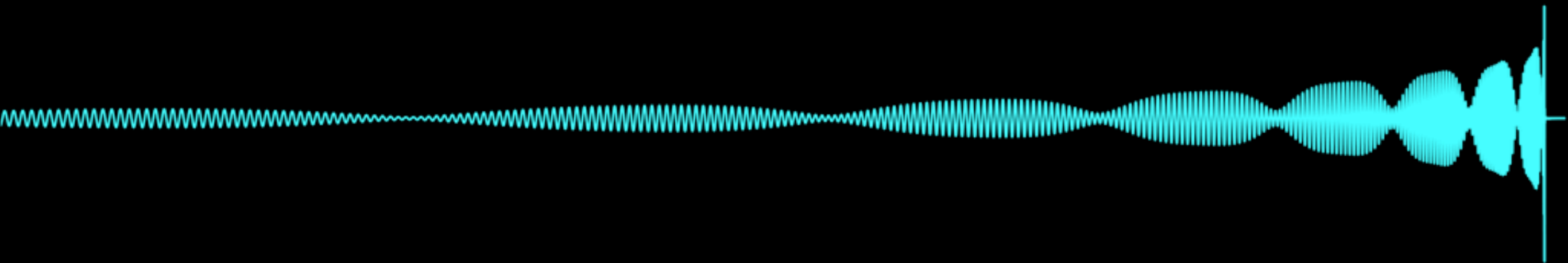
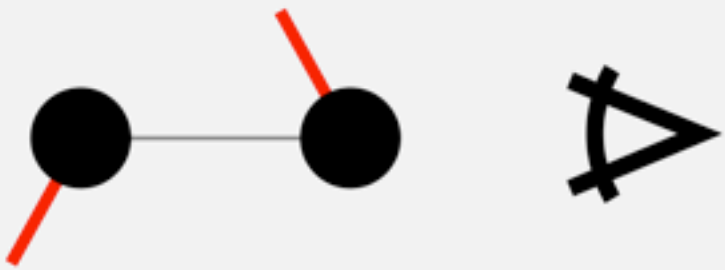
Farr et al. (2016) ApJ 825 116

Hannam et al. (2013)









O1 Models

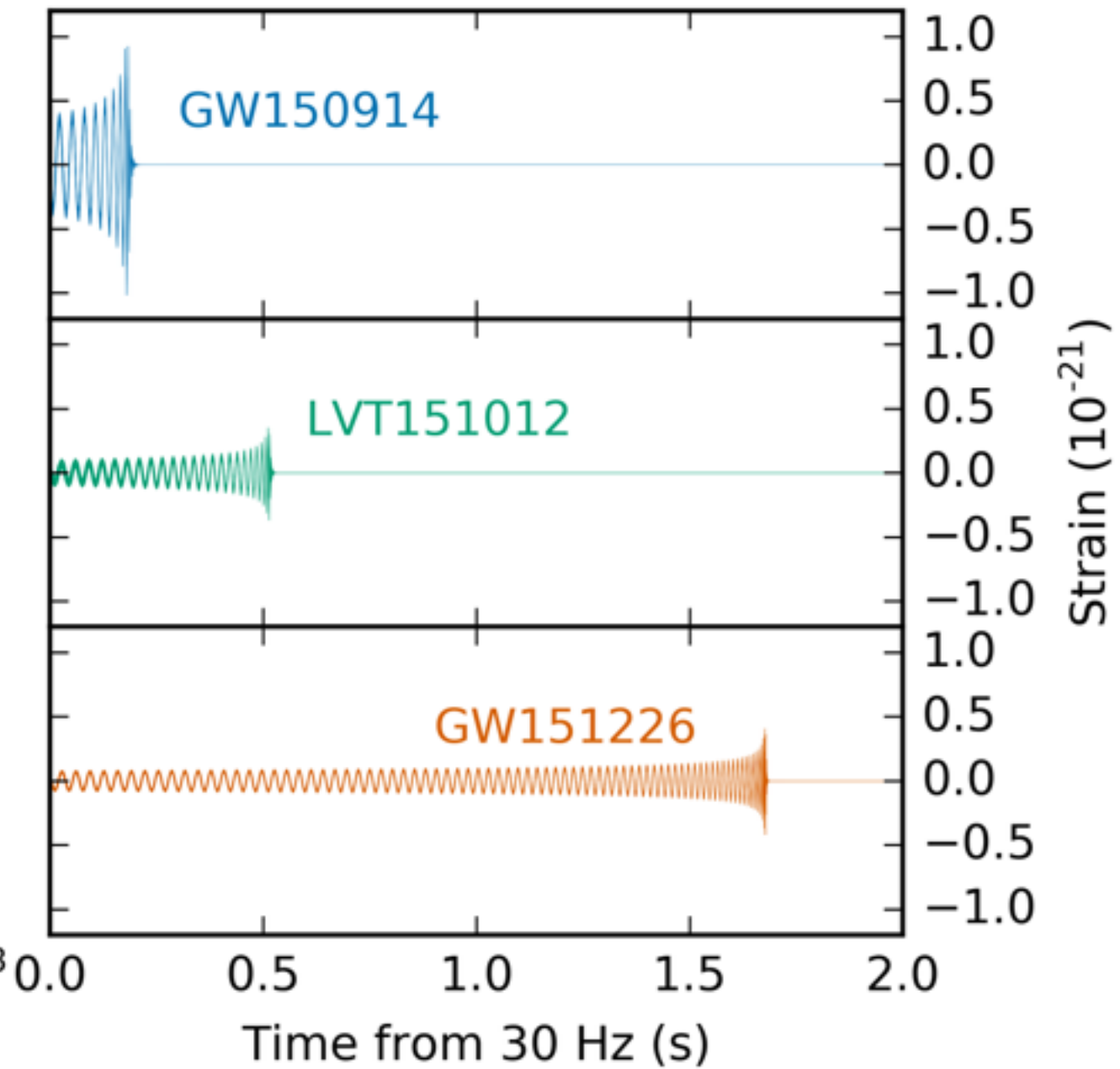
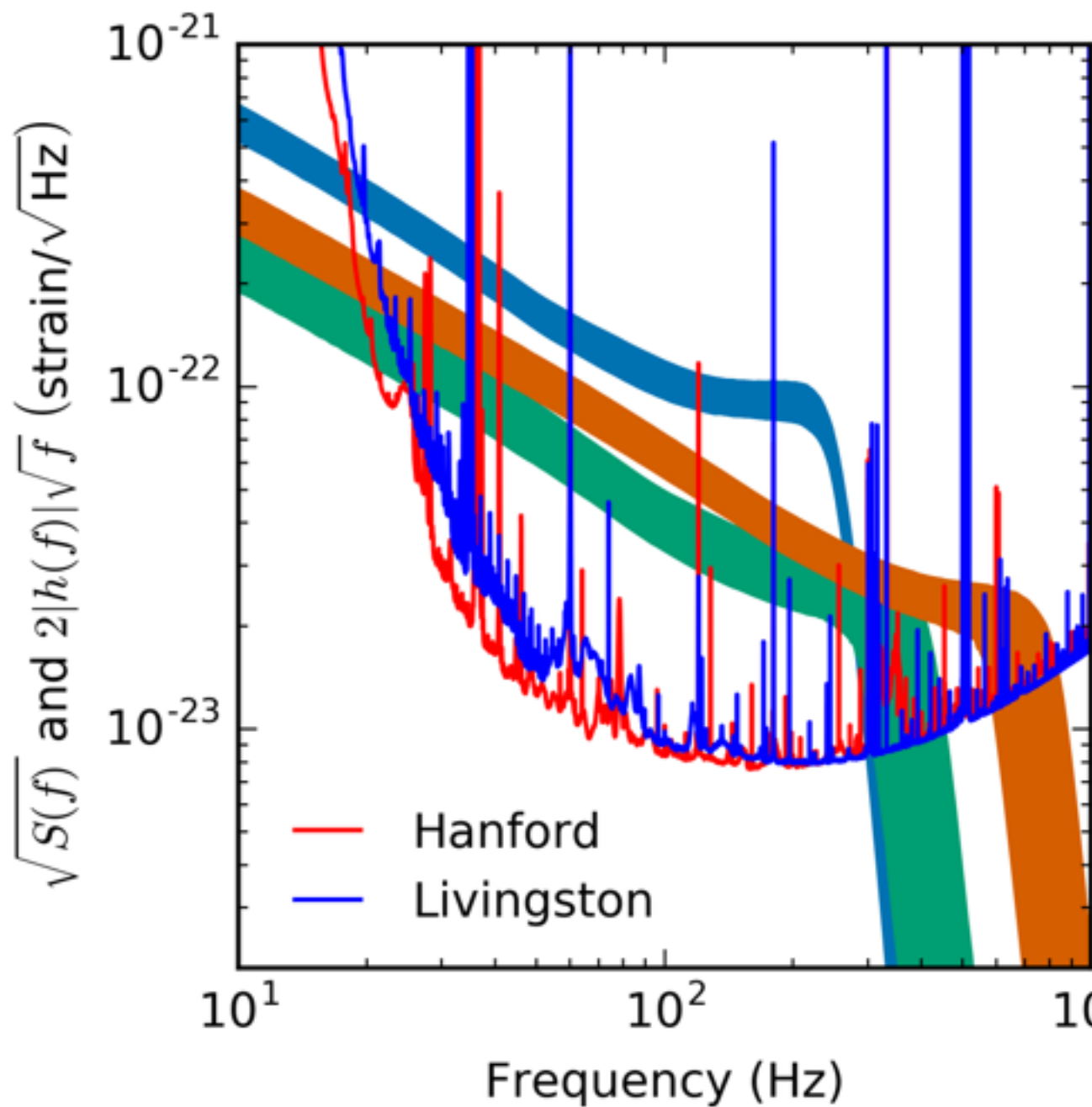
SEOBNR(v2): double-spin, non-precessing

IMRPhenomP(v2): precessing, effective spins

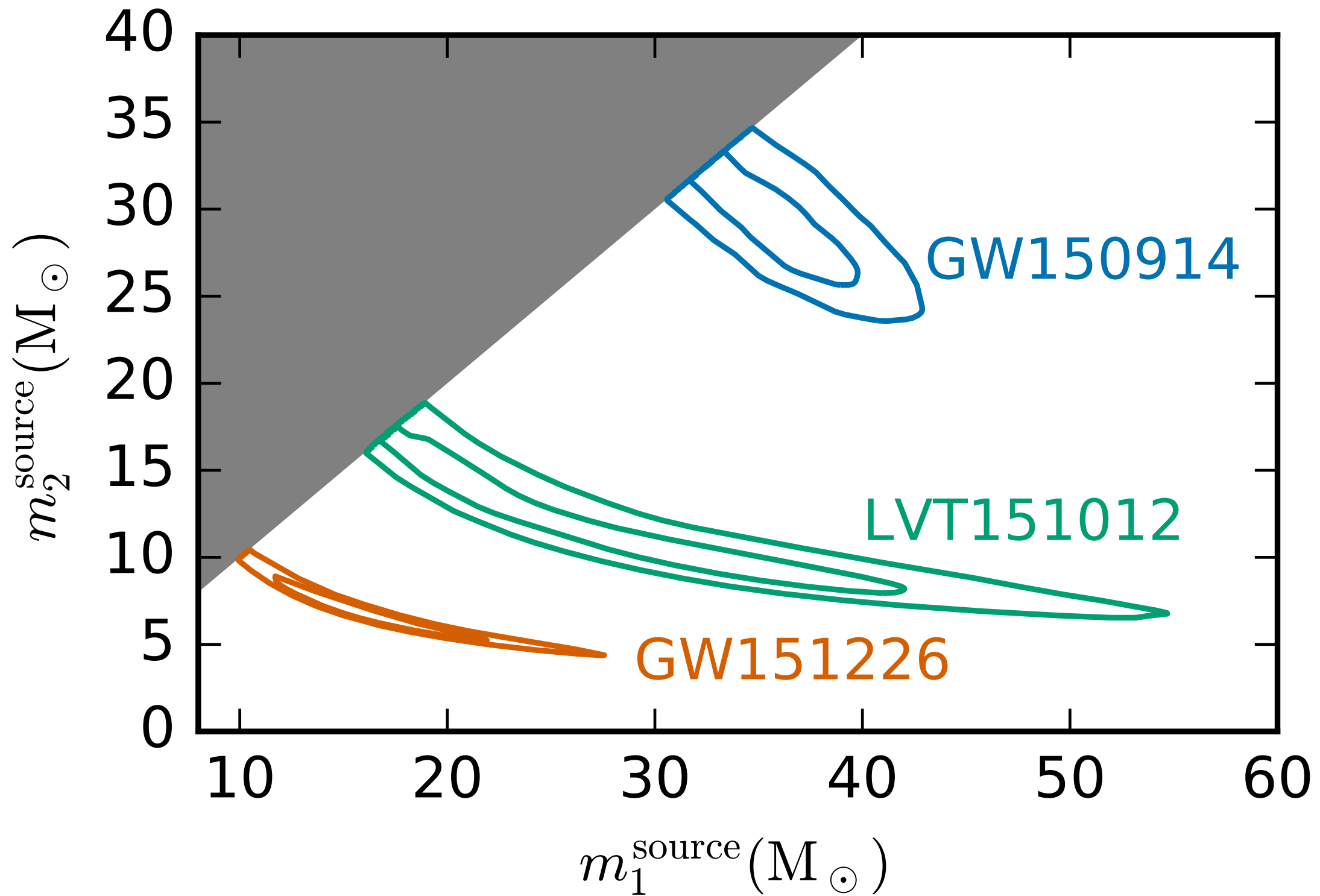
SEOBNR(v3): precessing, double-spin

BBHs in O1

non-precessing

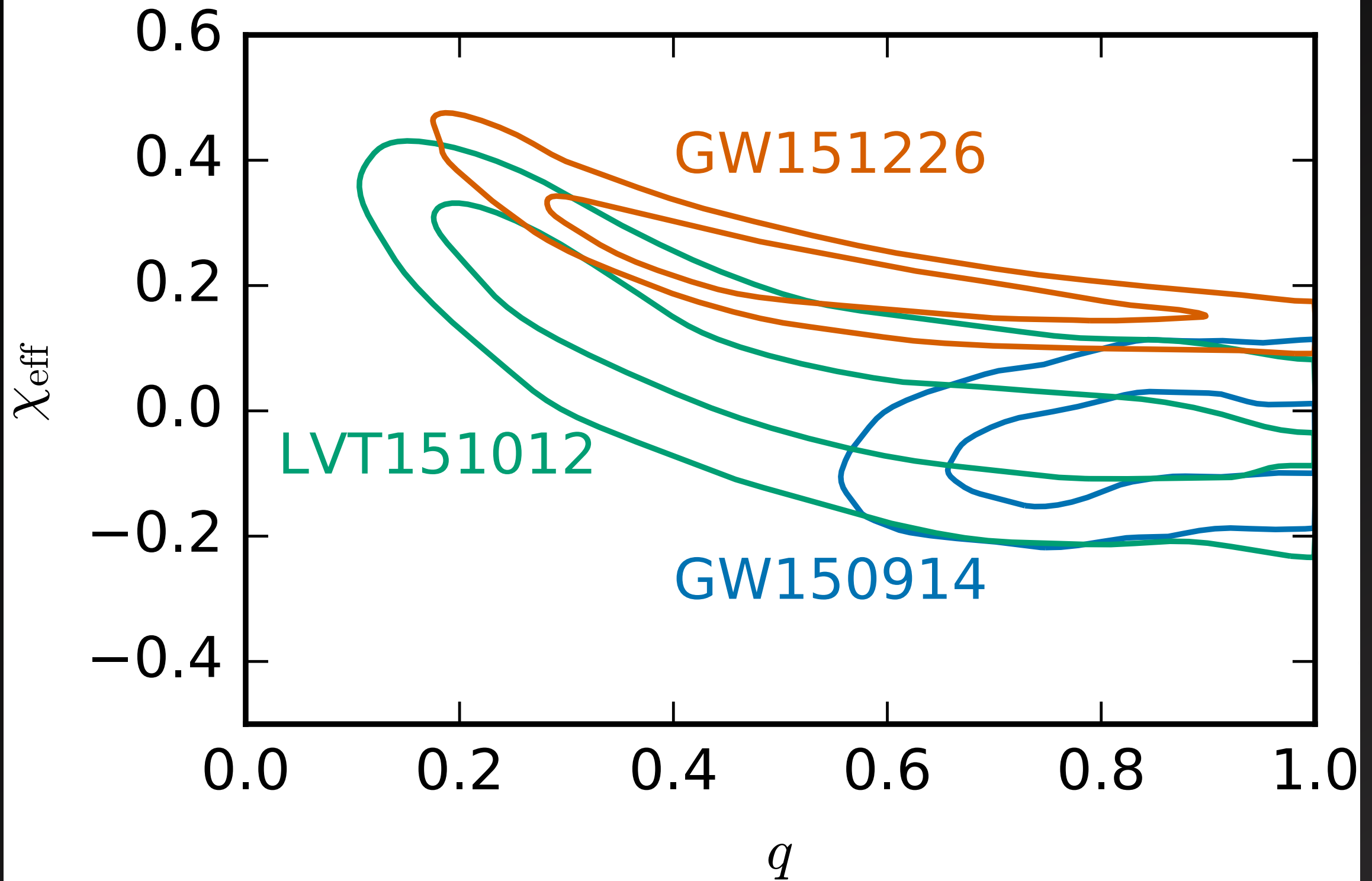


Black Hole Masses



Abbott et al. (2016):
PRX 6, 041015

Mass-Spin Degeneracy



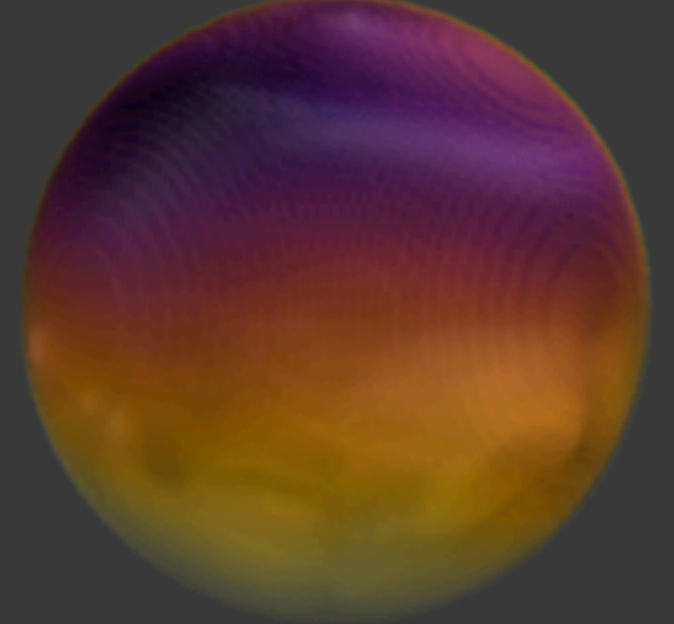
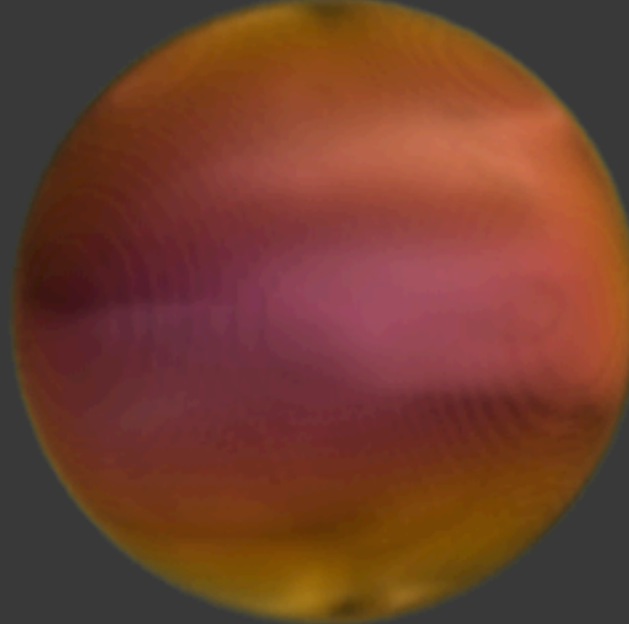
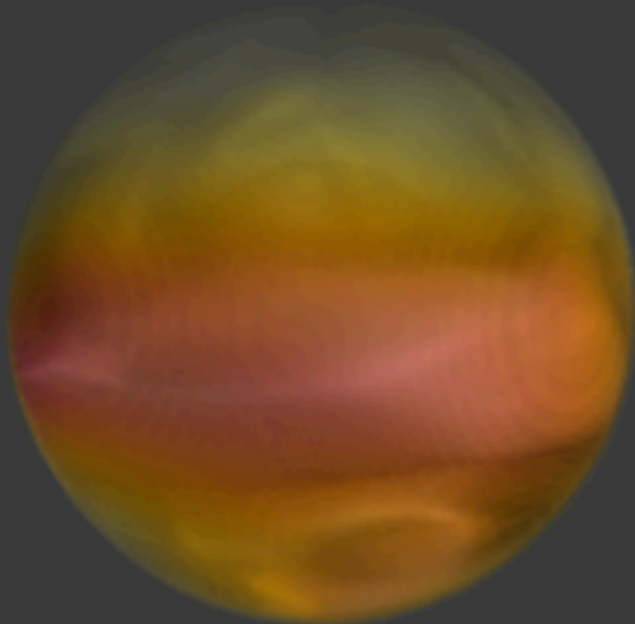
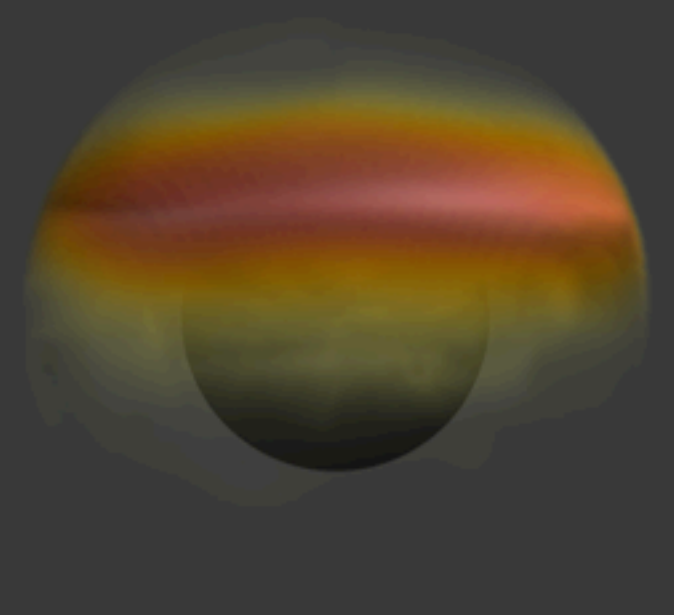
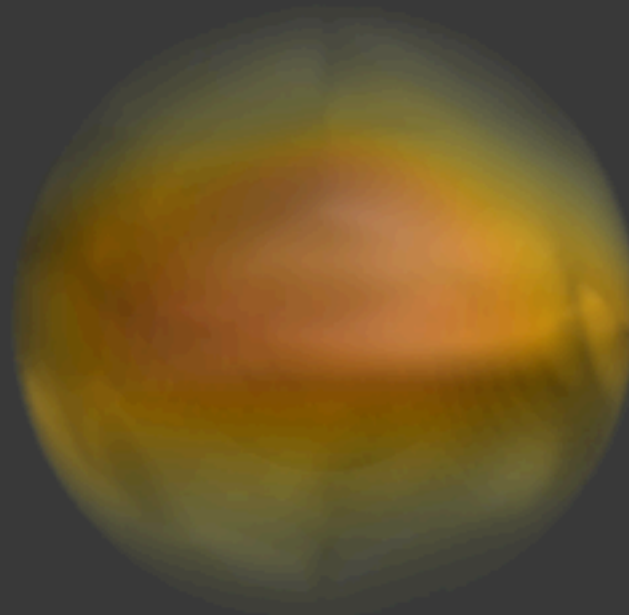
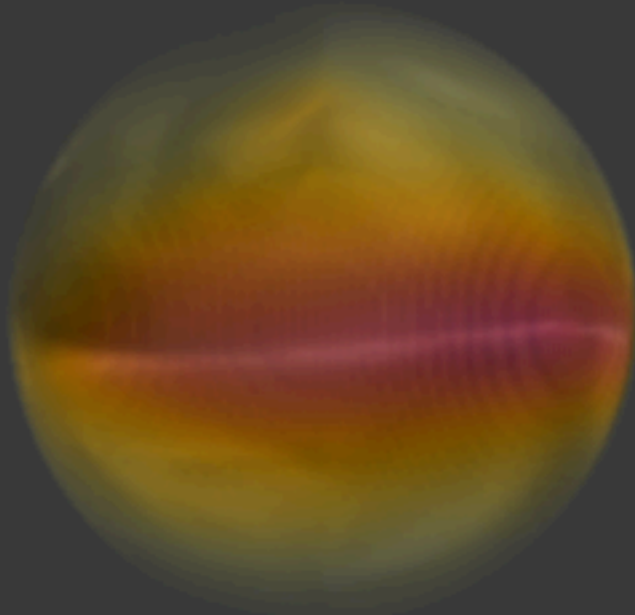
Abbott et al. (2016):
PRX 6, 041015

O I Spin Constraints

GW150914

LVT151012

GW151226

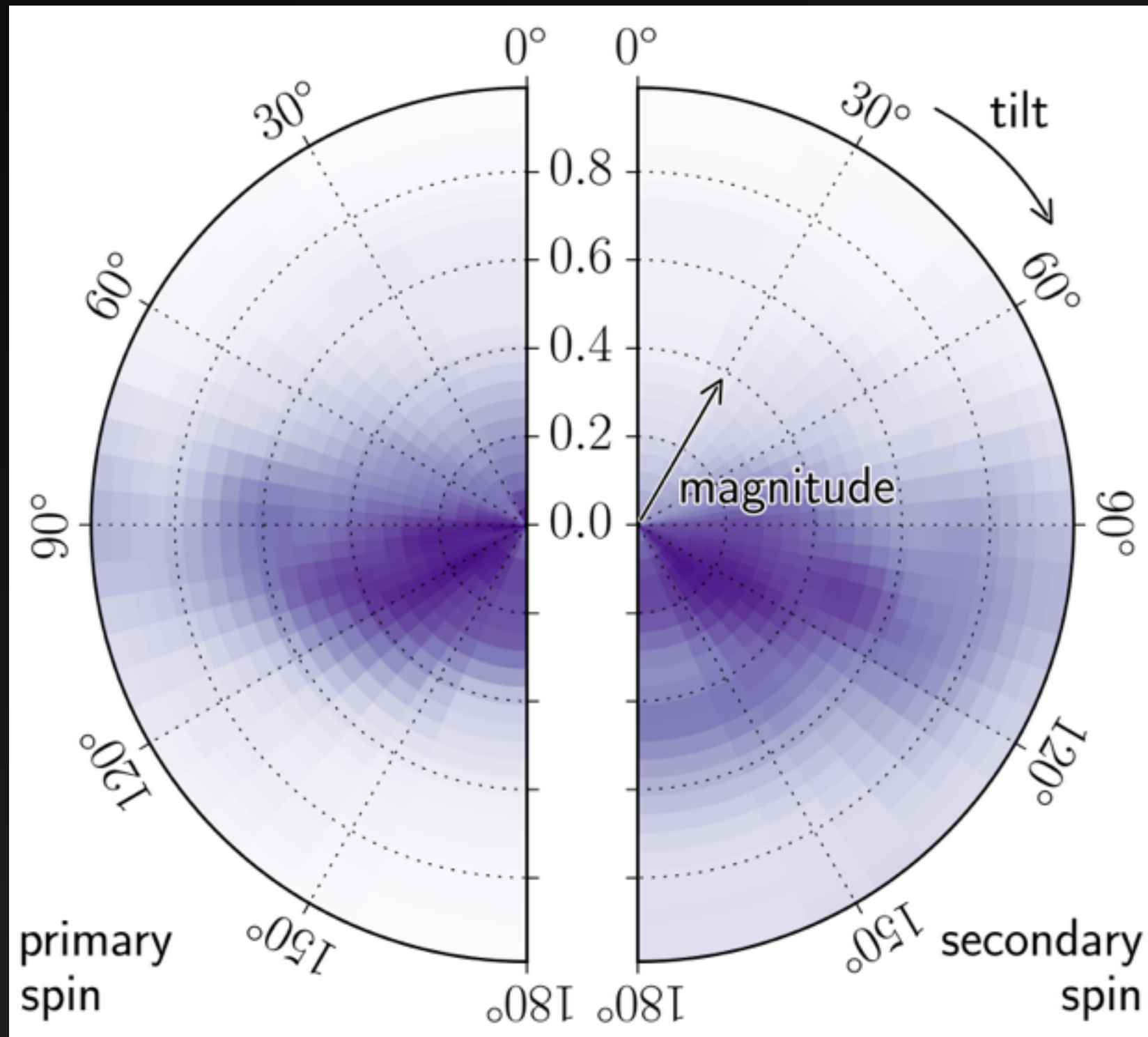


Black Hole Spins

Abbott et al. (2016):
PRX 6, 041015

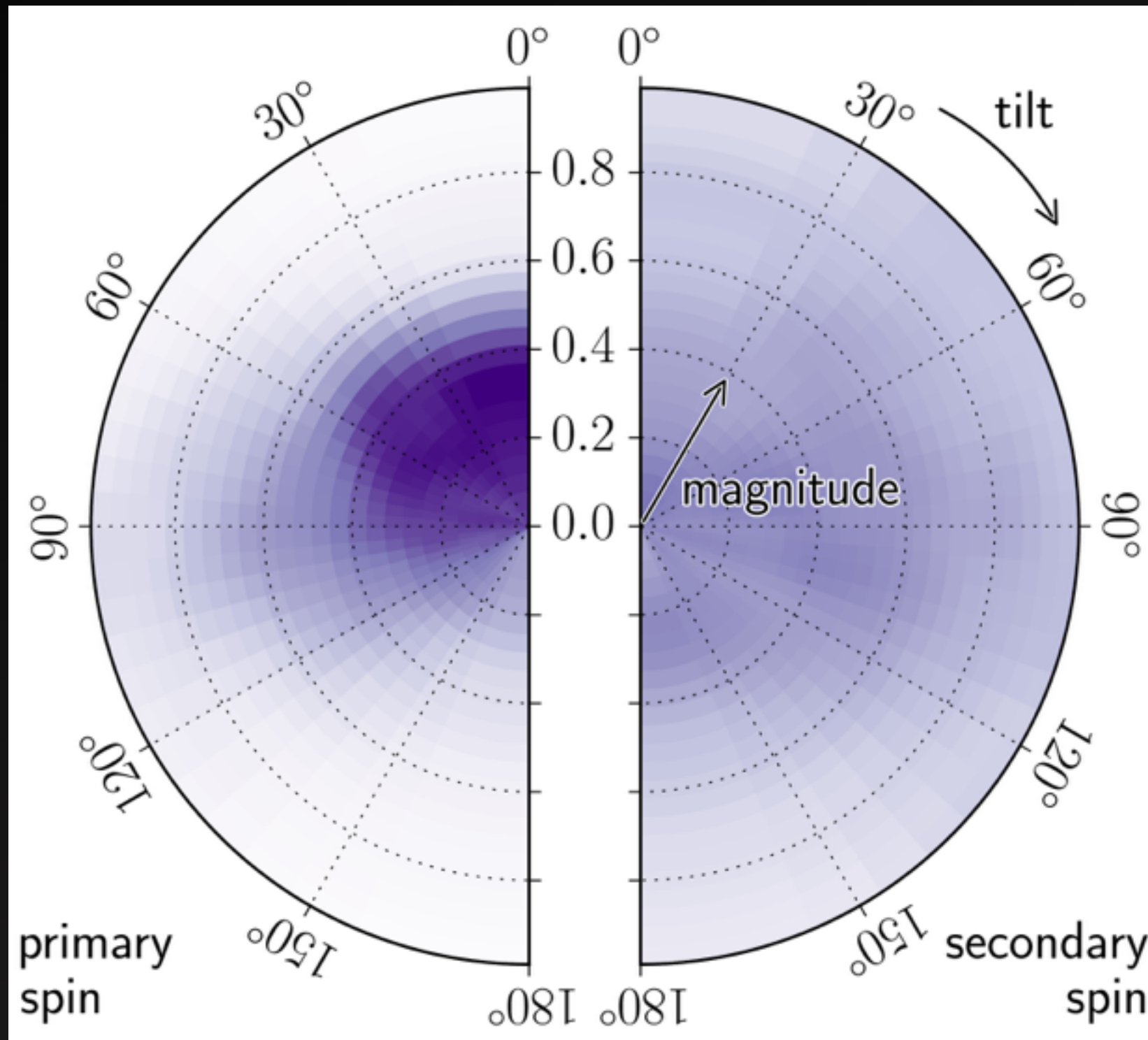
GW150914

BH spin
not extremal



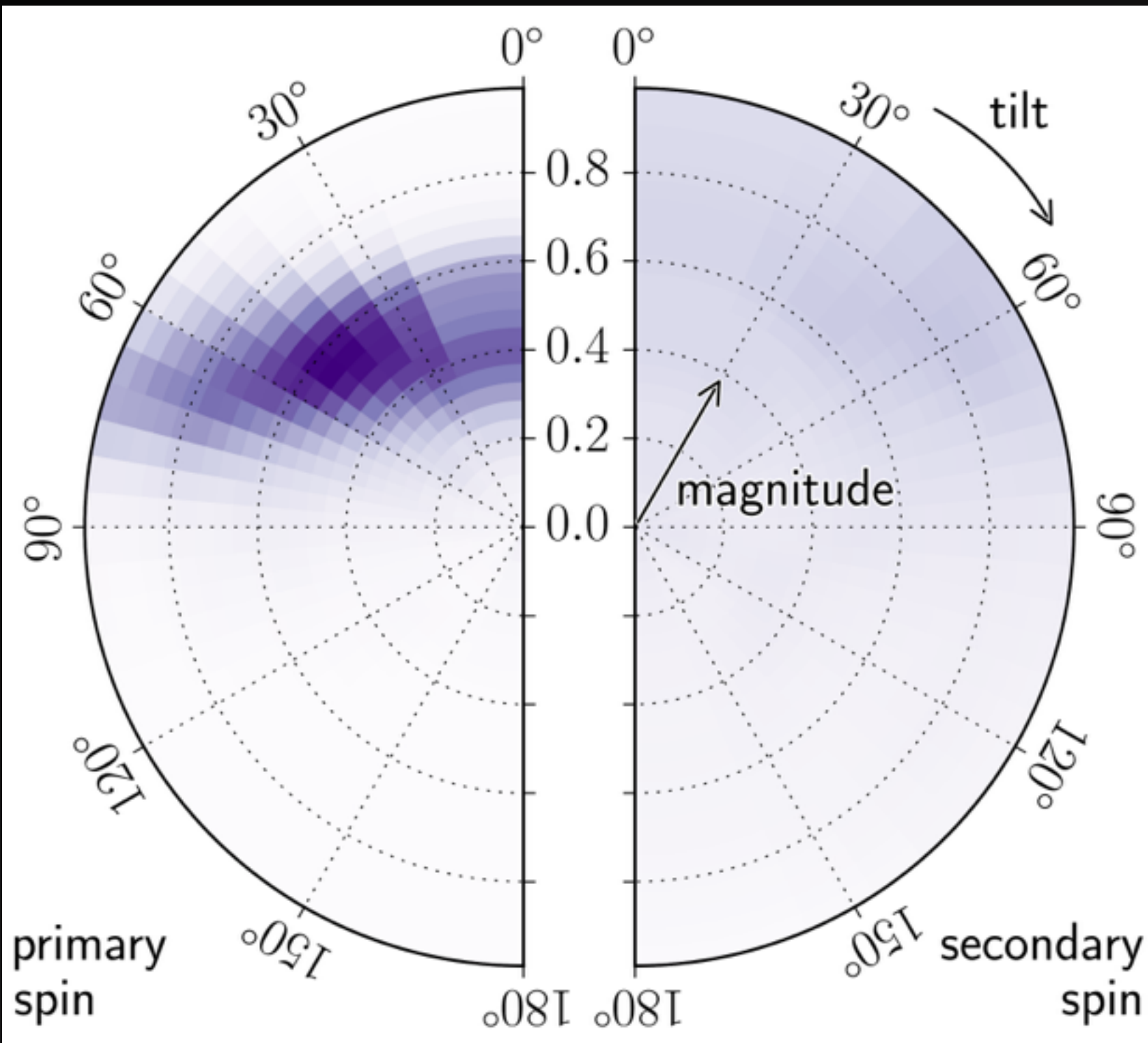
Black Hole Spins

LVT151012



Black Hole Spins

GW151226



At least one
spinning BH

Next Step: Population Inference

Goal: Use multiple detections to infer population characteristics

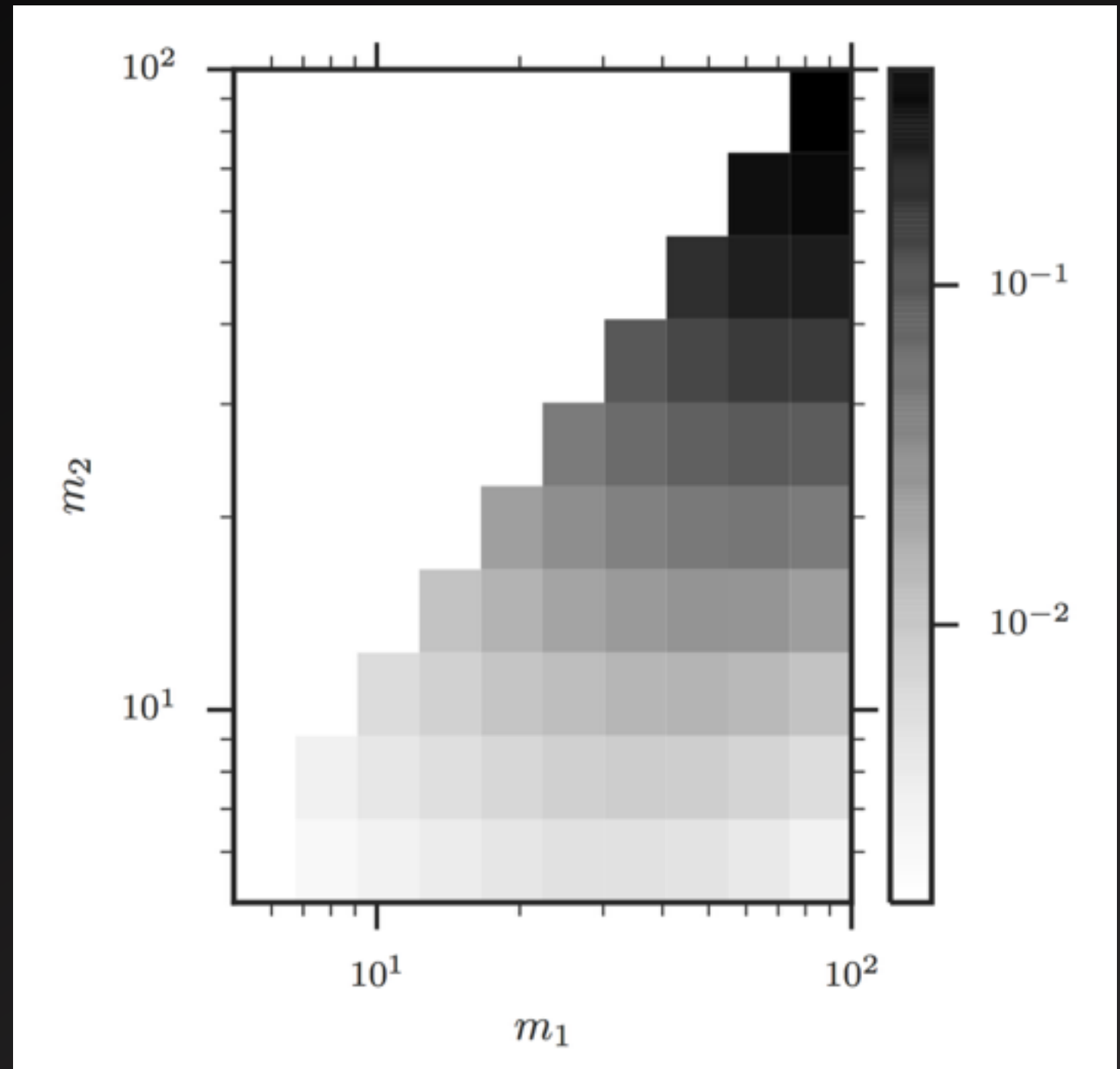
Challenges:

- We never precisely characterize sources
- Detections may sparsely cover parameters space

Population Inference

Parameterized Model:

$$\Gamma_{\alpha}(\theta) \begin{cases} \exp(\alpha_1) & \theta \in \Delta_1 \\ \exp(\alpha_2) & \theta \in \Delta_2 \\ \dots \\ \exp(\alpha_K) & \theta \in \Delta_K \\ 0 & \text{otherwise} \end{cases}$$



Gaussian Process Prior

Gaussian process to regularize the histogram

$$\begin{aligned} p(\boldsymbol{\alpha}) &= p(\boldsymbol{\alpha} | \boldsymbol{\mu}, \boldsymbol{\lambda}) \\ &= \mathcal{N}[\boldsymbol{\alpha}; \boldsymbol{\mu}, K(\{\Delta_j\}, \boldsymbol{\lambda})] \end{aligned}$$

$\boldsymbol{\mu}, \boldsymbol{\lambda}$: hyperparameters for the mean and length scales of the GP,

Hierarchical Bayesian Inference

Population posterior density:

$$p(\vec{\alpha}|\{d_i\}) \propto p(\vec{\alpha}) \int p(\{d_i\}|\{\theta_i\}) p(\{\theta_i\}|\vec{\alpha}) d\{\theta_i\}$$

Gaussian process prior

Single-event likelihood

Single-event (population-based) prior

$$p(\{\theta_i\}|\alpha) = \exp\left(-\int \hat{\Gamma}_\alpha(\theta) d\theta\right) \prod_i \hat{\Gamma}_\alpha(\theta_i)$$

Hogg et al. (2010)

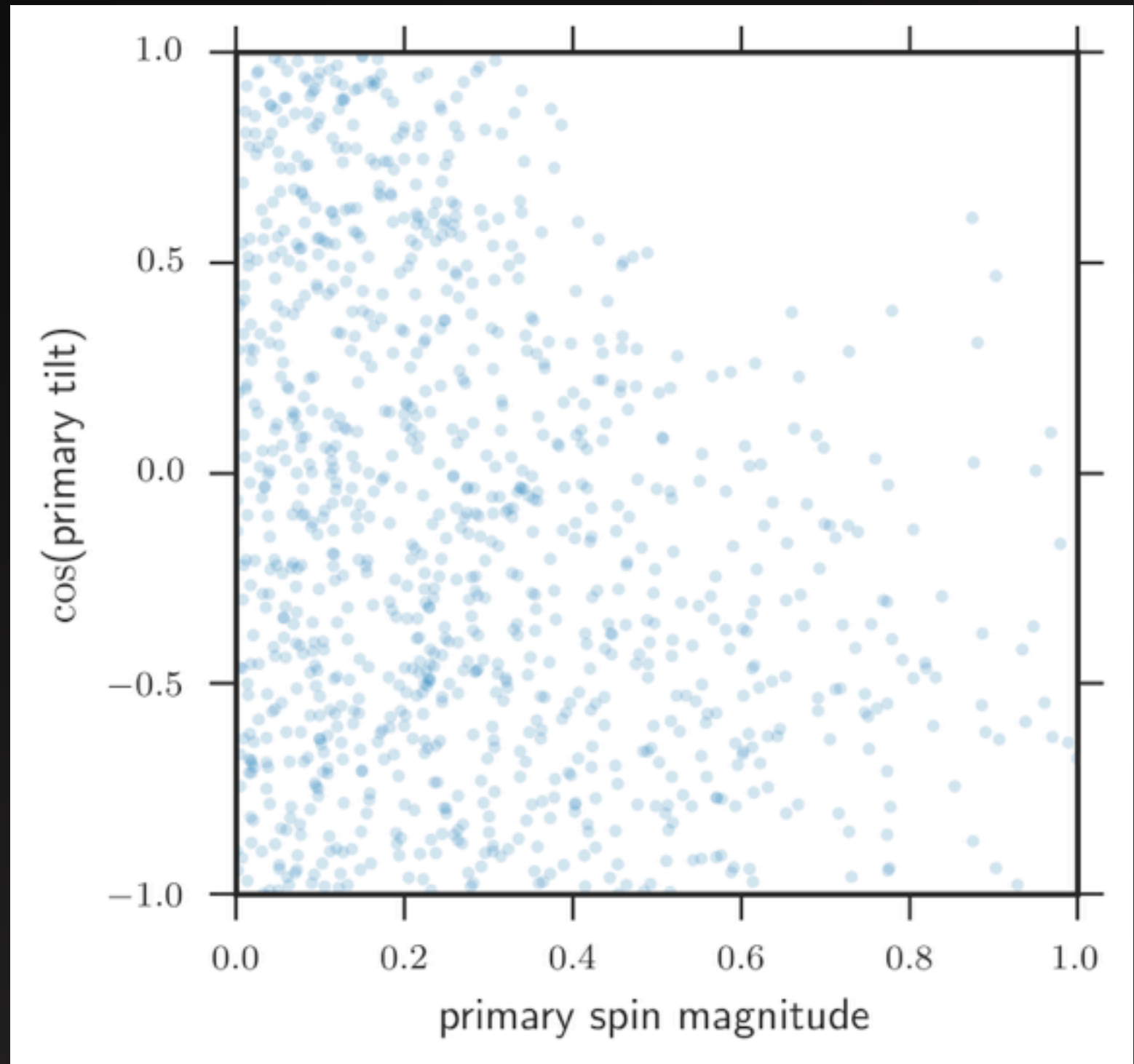
Spin Distribution

Simulated distribution:

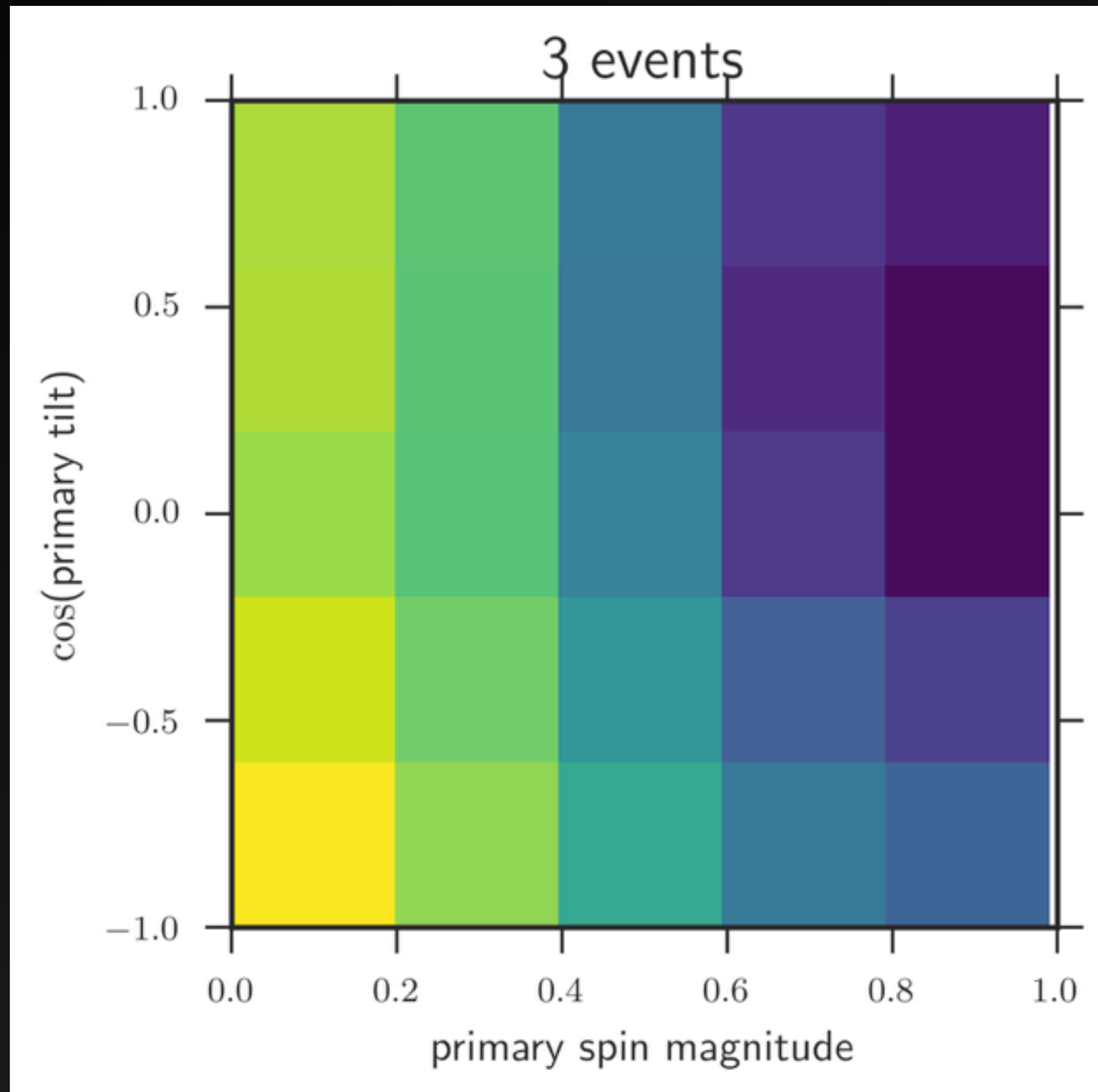
primary spin < 0.5

primary tilt $< 45^\circ$

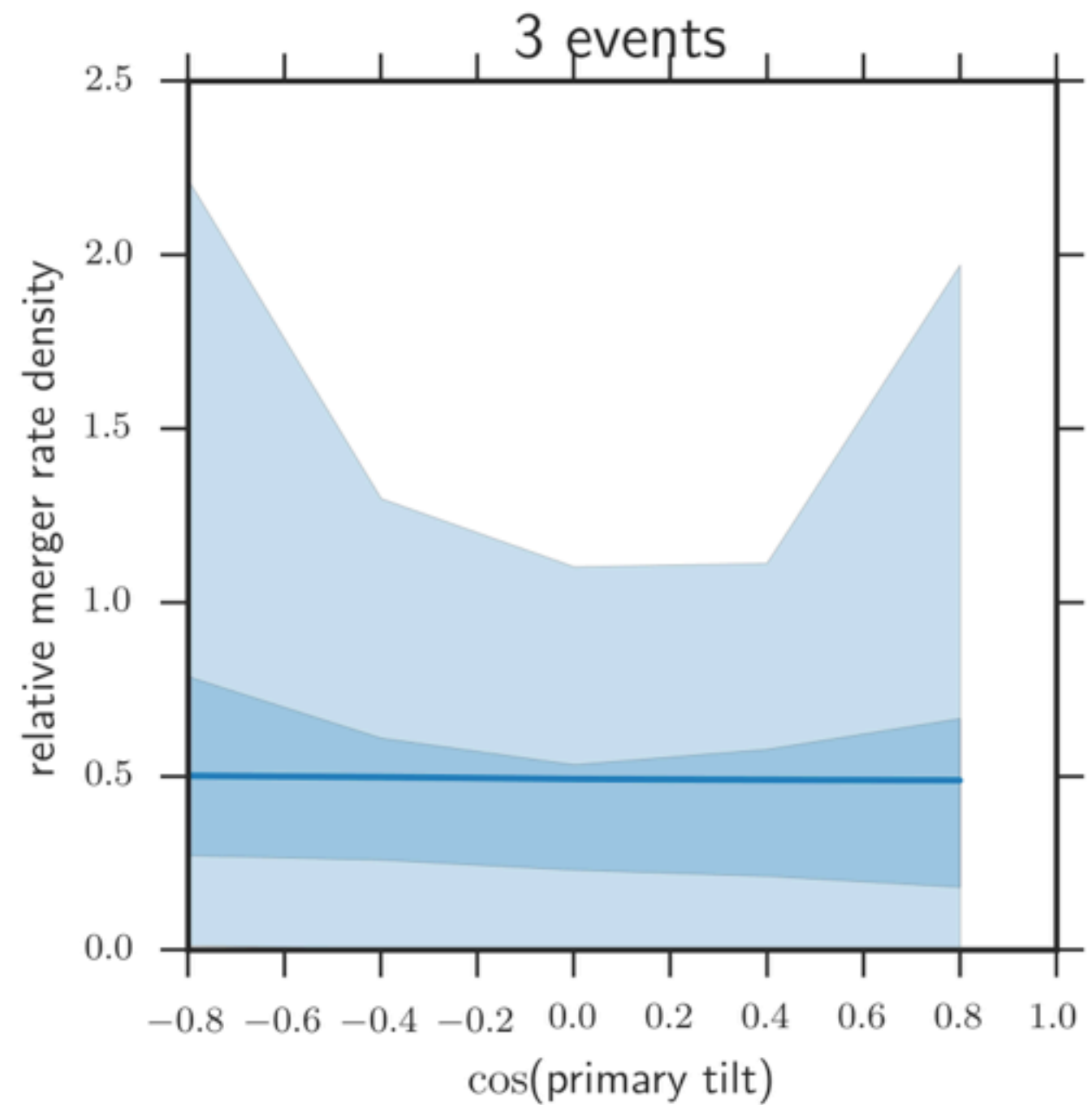
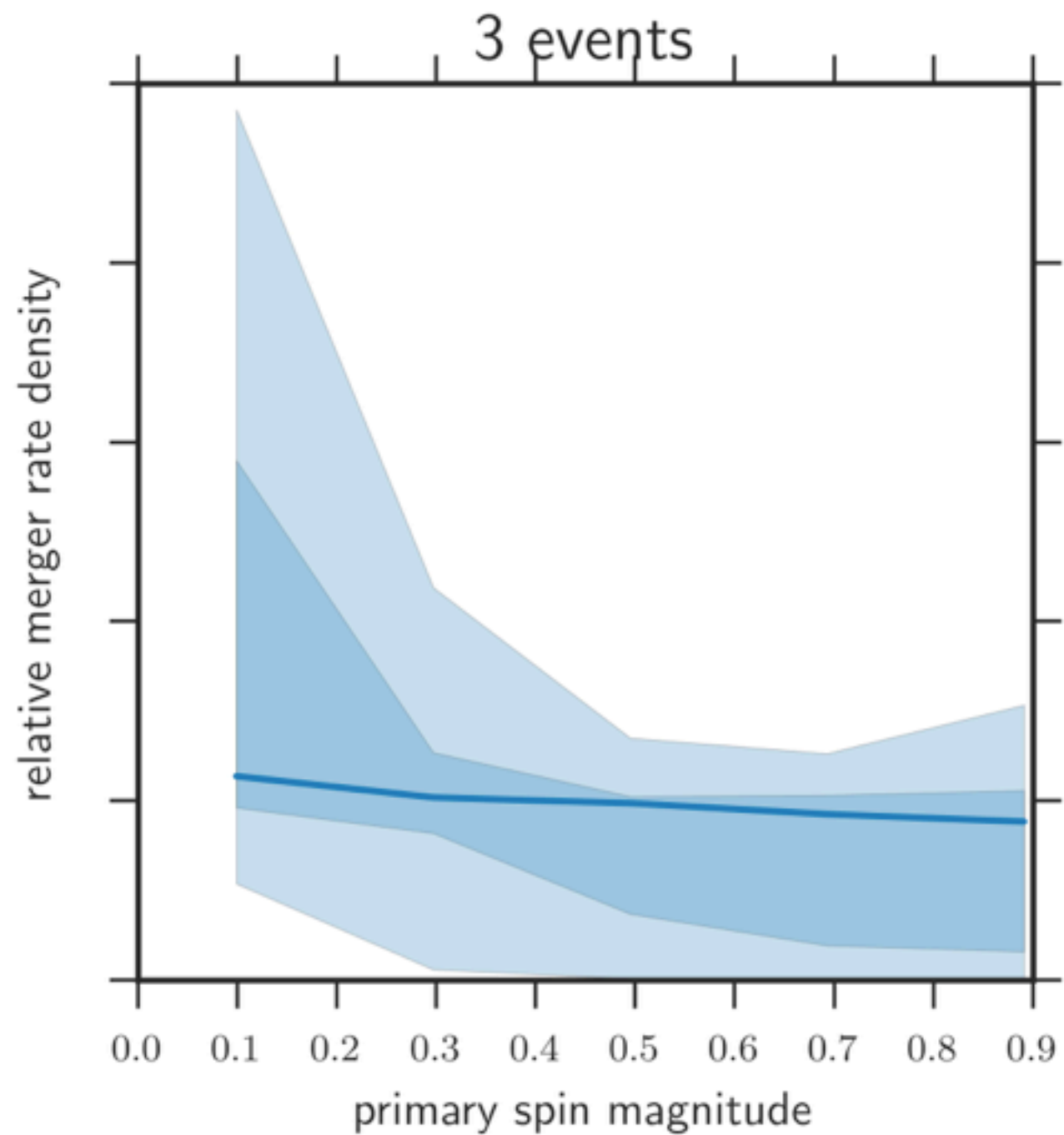
Individual Event Posteriors:



Spin Distribution



Spin Distribution



Spin Distribution

Support for non-uniform distribution of spin magnitudes after ~ 10 events.

Rule out isotropic spin distribution after ~ 20 events.

Conclusions

Interesting population characteristics may be found after only ~ 10 events.

After 10's of events, strong features in the population begin to be constrained.

Possibly by the end of O2, likely by the end of O3, things should get interesting.

Questions?