Gravitational-wave Posterior Postprocessing with Normalizing Flows

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Introduction

- **Bayesian inference** is a key tool for gravitational-wave data analysis
- It enables us to infer the **properties of** compact binaries such as their

Problem

• There are many cases where we **re**analyze data with e.g. a new waveform model that results in only slight changes to the posterior • Standard analyses ignore existing results and rerun inference from the prior • This is **computationally inefficient**

Standard analyses



- masses and spins
- Standard analyses using Nested Sampling to **estimate the posterior** distribution and evidence

AIM: To develop a framework to obtain results with new models by post-processing existing results

Method

We use a two step process:

- Approximate the initial posterior using a **normalizing flow**
- Sequential Monte Carlo (SMC): Evolve particles from the



approximate initial distribution to the new posterior We refer to this framework as **Posterior Post-Processing**

~. -+ $eta_t = 1$ $eta_t=0$ $p_t(heta|d,eta_t) \propto q(heta;\Lambda)^{1-eta_t} [p(d| heta)p(heta)]^{eta_t}$ $q(heta;\Lambda)$

Equivalent results at a fraction of the cost



0?

Results

- We demonstrate our method by post-processing posterior samples obtained with Model 1 (IMRPhenomXPHM) to obtain posterior samples for Model 2 (IMRPhenomXO4a).
- The results are consistent with those obtained using the **standard** approach.
- Our method took 3 hours, compared to 17 for the standard method.
- It required seven times fewer likelihood evaluations (10 million vs. 70 million), making it **seven times more efficient**.

Standard approach

processing

Conclusions



- Posterior post-processing combines normalizing flows and Sequential Monte Carlo to provide a novel means of reanalyzing data.
- It enables us to obtain results with a new model **without** repeating the full analysis.
- The method is **consistent with the standard approach** but is significantly **more efficient**.

OUTLOOK: This work is a proof-of-principle and has many possible applications, including: tests of General Relativity or gravitational-wave lensing analyses.