## Post-bacc (Quarterly?) Update

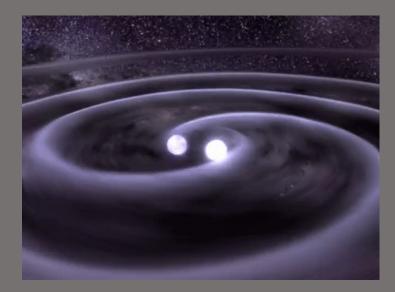
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PI: Michael Couphlin



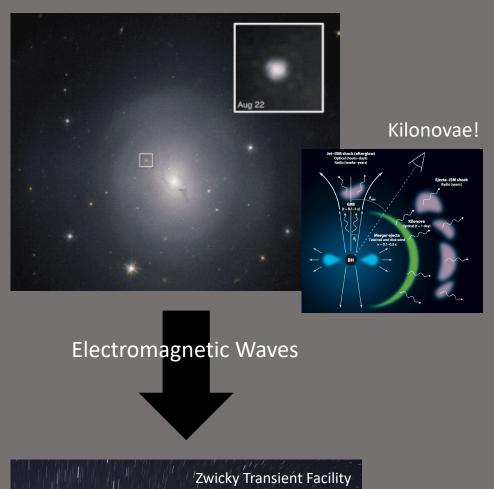
### Outline of talk

- Intro to Gravitational Waves and science questions
- Observing Scenarios project/efforts
- Training dataset data development for Kilonova classification
- Extracurriculars



# Gravitational Waves







### Multimessenger Astronomy rising

- Only one GW event with observed EM counterpart
- Fueled many efforts in support of gravitational wave (GW) follow-up campaigns (ZTF, LSST)
- KN science cases include

Neutron star equation of state constraints

- Hubble constant calculations
- r-process nucleosynthesis

What does the future hold??

In Collaboration with Weizmann Kiendrebeogo, Leo Singer, Michael Couphlin, and more.

### **Observing Scenarios**

• Goal

To maximize ToO observations during upcoming LIGO, Virgo, KAGRA observing runs (O4 mid-late May?!)

- We develop "observing scenarios" to support these efforts by simulating the detection (ZTF, LSST) and localization of GW events to provide accurate predictions and statistics for upcoming observing runs O4 and O5
- Distances, detection rates, sky localizations, KN lightcurves,  $H_o$  and EoS constraint

#### Population component masses

### Observing Scenarios

Nuclear Multimessenger Astronomy (NMMA) software framework, bilby Bayesian multi-messenger pipeline for GW+EM analyses

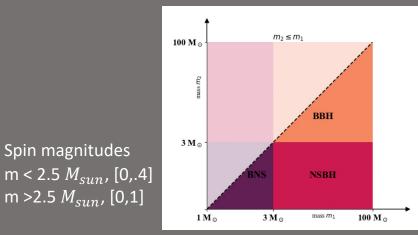
KN models

light curve fitting

- Property estimation (BNS, NSBH)
- GWTC-3 distribution

Drawn from model describing full population of CBC's and their component mass and spin distribution (10<sup>6</sup> total sample)

- Split populations based on mass and spin thresholds
- Maximum sensitive distances, assign sensitive co-moving volumes for each sample
- Draw distances and sky localizations (ligo.skymap code for LIGO, Virgo, KAGRA), and extrinsic parameters (lat, long, incl.)
- Apply SNR cuttoff (>8) to realize detected events (bayestar)
- Calculate Summary statistics



#### Summary statistics

	Med								
	Median 90% credible area ( $\deg^2$ )								
04	LRR	$2100^{+150}_{-220}$	$2090\substack{+130 \\ -130}$	$653^{+53}_{-36}$					
	GWTC-3	$1860^{+250}_{-170}$	$2140\substack{+480 \\ -530}$	$1428\substack{+60 \\ -55}$					
05	LRR	$2050^{+100}_{-160}$	$2110\substack{+100 \\ -100}$	$682^{+25}_{-30}$					
	GWTC-3	$2050^{+120}_{-120}$	$2000\substack{+350 \\ -220}$	$1256\substack{+48 \\ -53}$					
Median 90% credible Comoving Volume $(10^3 \text{ Mpc}^3)$									
04	LRR	$46.5\substack{+6.6 \\ -7.0}$	$159^{+26}_{-16}$	$207^{+21}_{-20}$					
04	GWTC-3	$67.9^{+11.3}_{-9.9}$	$232\substack{+101 \\ -50}$	$3400\substack{+310\\-240}$					
<b>O</b> 5	LRR	$240^{+29}_{-26}$	$785^{+68}_{-62}$	$857^{+63}_{-60}$					
	GWTC-3	$376^{+36}_{-40}$	$1350\substack{+290 \\ -300}$	$8580\substack{+600 \\ -550}$					
Median Luminosity Distance (Mpc)									
04	LRR	$349^{+12}_{-14}$	$564^{+15}_{-13}$	$1102\substack{+33 \\ -32}$					
04	GWTC-3	$398^{+15}_{-14}$	$770^{+67}_{-70}$	$2685\substack{+53 \\ -40}$					
05	LRR	$619^{+15}_{-19}$	$1007^{+20}_{-22}$	$1948\substack{+34\\-24}$					
05	GWTC-3	$738^{+30}_{-25}$	$1318\substack{+71 \\ -100}$	$4607^{+77}_{-82}$					
Sensitive volume : detection rate / merger rate: $(Gpc^3)$									
04	LRR	$0.1011\substack{+0.0066\\-0.0064}$	$0.403\substack{+0.021\\-0.020}$	$1.861\substack{+0.077\\-0.074}$					
	GWTC-3	$0.172\substack{+0.013\\-0.012}$	$0.78\substack{+0.14 \\ -0.13}$	$15.15\substack{+0.42 \\ -0.41}$					
05	LRR	$0.507\substack{+0.027\\-0.026}$	$1.809\substack{+0.070\\-0.068}$	$7.62\substack{+0.19 \\ -0.19}$					
	GWTC-3	$0.827\substack{+0.044\\-0.042}$	$3.65\substack{+0.47 \\ -0.43}$	$50.7^{+1.2}_{-1.2}$					

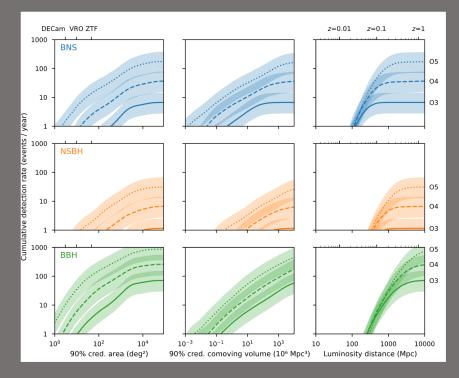
#### Detection/data overload approaching!!

- More detections than reasonable to handle by follow-up capabilities
- Detector sensitivity increasing! Localization not so much...

#### Annual detection rates

Run	Distribution	BNS	NSBH	BBH			
Annual number of detections							
04	LRR	$17^{+35}_{-13}$	$10^{+18}_{-8}$	$46^{+23}_{-17}$			
	GWTC-3	$36^{+49}_{-22}$	$6^{+11}_{-5}$	$260^{+330}_{-150}$			
05	LRR	$86^{+171}_{-59}$	$48^{+71}_{-30}$	$190\substack{+80 \\ -58}$			
	GWTC-3	$180^{+220}_{-100}$	$31^{+42}_{-20}$	$870\substack{+1100 \\ -480}$			

#### Cumulative Histogram, Public Alert Rate

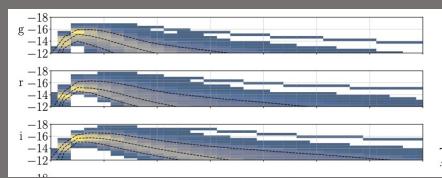


Run	Dist.	BNS		NSBH		
		Telescopes				
		ZTF	LSST	ZTF	LSST	
04	GWTC-3	10.06~%	90.34~%	2.72~%	60.87 %	
<b>O</b> 5	GWTC-3	2.6~%	69.4~%	0.28~%	30.62~%	

### KN identification

• Bottlenecks/motivations

KNe are faint and transient (<1week in optical)



Localization regions are very big and include tens of contaminating transients

Real-time classification is crucial to maximize observational resources and scientific return, especially given the large detection rates for O4 and O5 paired with little to no localization improvement!

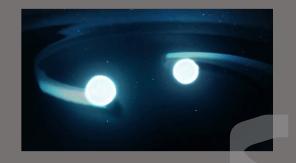
Past observing runs have relied on humans for classification – not reasonable.

Solutions/ML

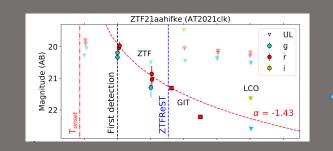
Need for accurate autonomous, real-time classification algorithms!

### My data set

- Comprehensive (GW+EM, O4 and O5) training set considering full low-latency EM follow-up capabilities (ZTF) based on LIGO, Virgo, KAGRA detectors.
- Useful to a wide range of folks to train on/incorporate in prep for next observing runs
- Autonomous Real-Time Decision-Making with Ari
- Implement on agent used to strategize follow-up, identify, and characterize KN



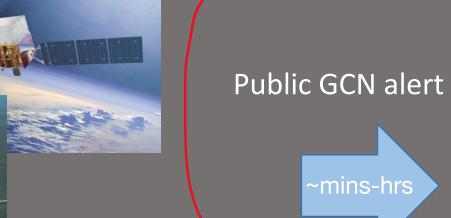
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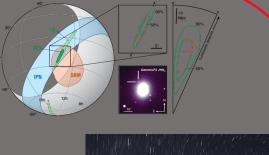


Before KN fades!

- Automated vetting
- ML classifier's
- Evolution rate

mins







#### Localization

### Data Generation

Observing scenario simulated injections/realistic populations to produce foundation

#### GCN Alert content training data

- Observation ID
- Event Significance: estimated FAR
- CBC Sky localization
- BAYESTAR algorithm --> Healpix projection
- CBC Inference: source classification and properties
  P-Astro: BNS, NSBH, BBH
  TAD delta block like Deceeded

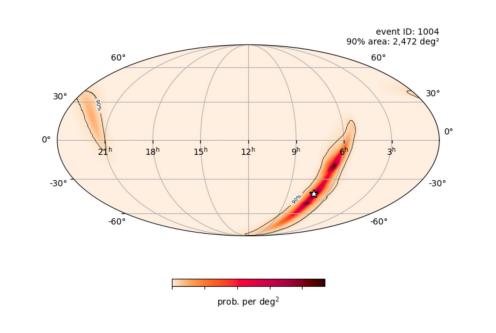
EMBright: HasNS, HasRemnant

+

KN light curves

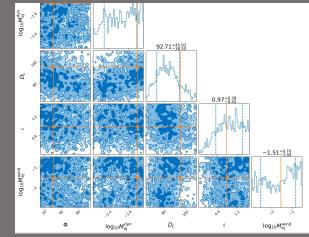
#### KN ejecta properties

Bulla Kilonova model (dynamical and disk wind ejecta, opening angle, observation angle)



#### r 22 g 18 g 22 0 2 2 4 6 8 10 12 14

#### Lightcurve posteriors

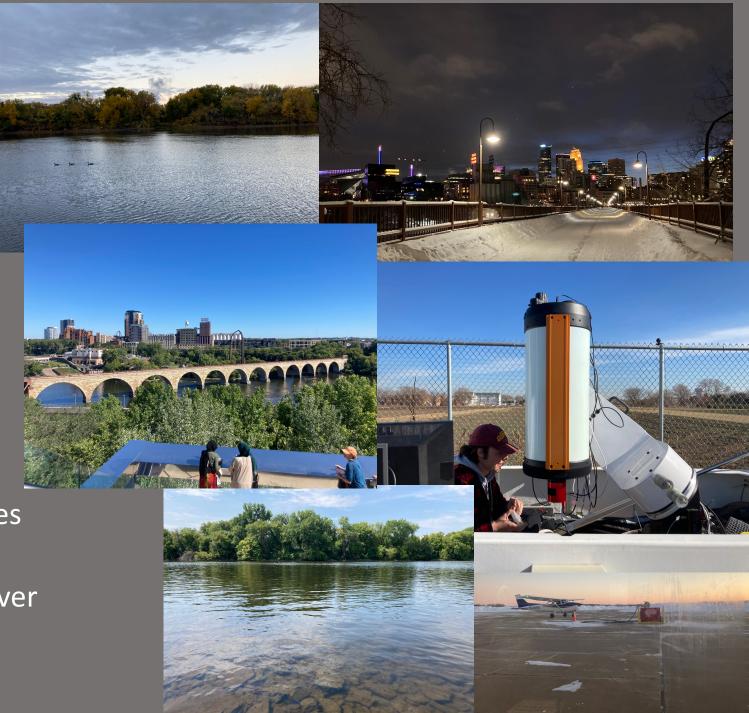


### Challenges and Looking Forward...

- Scaling challenges (20,000 skyamps per population for reasonable training), condor jobs, sanity checks
- Spectra
- Host galaxy image stamps
- Ari to incorporate skymaps and lightcurves narrow agent ~May
- Others to use on classifyers
- Wrapping up observing scenario paper. Data is released.

### Extracurriculars

- Not really, but...
  - Science talks given at Mifa! Helping with telescope night
- Some real ones
  - Surviving Minnesota winters Swimming and running a lot Hanging out with cool office mates Jumping into lakes Exploring the city (music!) and River



### Thank you!