

# The Road to Multimessenger Astronomy with Advanced LIGO

#### Leo Singer • LIGO Laboratory, Caltech

lsinger@caltech.edu = Document LIGO-G1300492-Vs

# The story so far

- Global network of 3 multi-km interferometric observatories: LIGO–Hanford, LIGO–Livingston, Virgo
- During joint LIGO-Virgo science run in Summer-Fall 2010, sent alerts to astronomers to point telescopes see Abadie et al. 2012, A&A 541, A155
- Detectors off-line while they are reconfigured as advanced detectors
   → eventually 10x greater range for binary neutron stars
- More detectors planned: KAGRA, LIGO–India



### Possible electromagnetic

### counterparts

- 2 neutron stars merge, form compact object and accretion disk
- Accretion feeds pair of jets
- Internal shocks in jet produce prompt γ-ray burst
- Shock between jet and ISM produces optical and radio afterglow



Figure 1 of Meztger & Berger 2012, ApJ, 746, 48

## GRBs



- High-energy sky is relatively clean; temporal coincidence with GW trigger is enough
- But what GRB satellites will be up in 2018?...
   IPN, Swift, Fermi, Lobster, SVOM, anything at all?

Number of BNS, NSBH sources per year at aLIGO/Virgo design sensitivity: All-sky CBC **BAT-like GRB** satellite search 61,18 **GRB-triggered CBC** search All-sky CBC 2.3, 0.6 triggers w/ GRB counterparts 1.2, 0.3

Outlook for detection of GW inspirals by GRB-triggered searches in the advanced detector era

#### Deitz, Fotopolous, **Singer**, and Cutler (2013, PRD 87:064033) http://dx.doi.org/10.1103/PhysRevD.87.064033

## Optical afterglows

- Often faint (16-22 mag)
- Fade rapidly (~several mag/night)
- Optical sky is crowded (rocks, quasars, variable stars, supernovae)
- Orphan afterglows! (PTFI lagg, http://arxiv.org/abs/ 1304.4236)



Fig. 15 of Guelbenzu et al. (2012) A&A 548,A101 (2012)

# How do we get there?

low-latency event detection

K. Cannon, C. Hanna, D. Keppel + many others + me

### rapid sky localization

L. Price + me + many others

### timely optical transient detection

Palomar Transient Factory + S. B. Cenko + D. Brown + M. Kasliwal+ myself

### Detection



signals

signal-to-noise ratio (SNR) at similar times in all detectors





online inspiral detection engine powered by



Built from "off the shelf" open-source DSP tools













my contributions

- handle data gaps efficiently (particularly resampling)
- computational budget
- first complete description of algorithm for literature
- improve accuracy of time, SNR of triggers



Toward early-warning detection of gravitational waves from compact binary coalescence **Cannon et al. (2012, ApJ 748:136)** http://dx.doi.org/10.1088/0004-637X/748/2/136







- Time delays & relative amplitudes ⇒inform sky location
- Triggers = point estimates
- Statistics of estimation error
- Very fast!





- Triggers = point estimates
- Statistics of estimation error
- Very fast!

### Bayesian Markov-chain Monte Carlo



Vivien Raymond, <a href="http://www.ligo.caltech.edu/~vraymond/">http://www.ligo.caltech.edu/~vraymond/</a>

- Input: strain time series from all detectors
- Stochastically sample from parameter space, compute overlap of signal with data in each detector
- Sample distribution converges to posterior
- Can be computationally expensive
- Takes hours to days, currently

### Bayesian Markov-chain Monte Carlo



Vivien Raymond, <a href="http://www.ligo.caltech.edu/~vraymond/">http://www.ligo.caltech.edu/~vraymond/</a>

- Input: strain time series from all detectors
- Stochastically sample from parameter space, compute overlap of signal with data in each detector
- Sample distribution converges to posterior
  Can be computationally expensive
  Takes hours to days, currently



### Rapid sky localization in last science run: S6/VSR3



#### G71031: ER3 gstlal event, **before**



#### G71031: ER3 gstlal event, *after*



#### G71031: ER3 gstlal event, *after*





image credit: http://www.scenicreflections.com/files/GRB %20Wallpaper\_\_yvt2.jpg



image credit: http://www.scenicreflections.com/files/GRB %20Wallpaper\_\_yvt2.jpg





image credit: http://www.scenicreflections.com/files/GRB %20Wallpaper\_\_yvt2.jpg





image credit: http://www.fanpop.com/clubs/battlestar-galactica/images/ 10655496/title/battlestar-galactica-cylon-centurion-photo



image credit: http://www.scenicreflections.com/files/GRB %20Wallpaper\_\_yvt2.jpg





image credit: http://www.fanpop.com/clubs/battlestar-galactica/images/ 10655496/title/battlestar-galactica-cylon-centurion-photo

#### thus was born...

BAYESTAR



## Bayes' Rule

• Take some data, X, and form a hypothesis,  $\Theta$ . How probable is your hypothesis, given the data?

"posterior"  $P(\Theta|X) = \frac{P(X|\Theta) \times P(\Theta)}{P(X)}$ "evidence"

 Marginalize to get rid of nuisance parameters

 $P(\Theta, \lambda | X) = \frac{\sum_{\lambda} P(X | \Theta, \lambda) P(\Theta, \lambda)}{P(X)}$ 

Or, if hypothesis is continuously parameterized,

$$p(\theta|x) = \frac{\int p(x|\theta, \lambda) p(\theta, \lambda) d\lambda}{p(x)}$$



REV. T. BAYES
### Problem setup: data, parameters

#### **Data/observation**



#### **Parameters of interest**

direction of source  ${f n}$ 

e.g., right ascension, declination  $lpha, \delta$ 

### Outline of calculation

**Likelihood**: factor into a time of arrival (TOA)-only contribution and an SNR-only contribution, both Gaussian

 $\mathcal{L} \propto \mathcal{L}_{\rm SNR} \times \mathcal{L}_{\rm TOA}$ 

Prior: uniform in 
$$au_\oplus, \phi_c, \psi, \cos \iota, {D_L}^3$$

**Posterior**: factor into an TOA-only contribution and an SNR-only contribution

$$p(\mathbf{n}|\hat{\tau}_1,\ldots,\hat{\tau}_N,\hat{\rho}_1,\ldots,\hat{\rho}_N) = f_{\text{TOA}}(\mathbf{n}|\hat{\tau}_1,\ldots,\hat{\tau}_N) \times f_{\text{SNR}}(\mathbf{n}|\hat{\rho}_1,\ldots,\hat{\rho}_N)$$

Evaluate **TOA** posterior **first**, then evaluate **SNR** posterior for those points that comprise the **99.99th percentile** of the TOA posterior.



image: http://healpix.jpl.nasa.gov



















### Distance marginalization

- Radial integrand peaks sharply at distance that is best supported by data
- Divide integration domain into 3 sub-domains that enclose maximum likelihood peak, small-distance tail, and large-distance tail
- Use adaptive Gaussian quadrature to discover which region dominates (gsl\_integration\_qagp)



# CBC Mock Data Challenge



	Estimated	$E_{\rm GW} = 10^{-2} M_{\odot} c^2$				Number	% BNS	Localized
	Run	Burst Range (Mpc)		BNS Range (Mpc)		of BNS within		$\operatorname{ithin}$
Epoch	Duration	LIGO	Virgo	LIGO	Virgo	Detections	$5  \mathrm{deg}^2$	$20  \mathrm{deg}^2$
2015	3 months	40 - 60	_	40 - 80	_	0.0004 - 3	_	—
2016–17	6 months	60 - 75	20 - 40	80 - 120	20 - 60	0.006 - 20	2	5 - 12
2017-18	9 months	75 - 90	40 - 50	120 - 170	60 - 85	0.04 - 100	1 - 2	10 - 12
2019+	(per year)	105	40 - 80	200	65 - 130	0.2 - 200	3 - 8	8 - 28
2022+ (India)	(per year)	105	80	200	130	0.4 - 400	17	48

#### LSC & Virgo 2013, arXiv:1304.0670



	Estimated	$E_{\rm GW} = 10^{-2} M_{\odot} c^2$				Number	% BNS	Localized	
	Run	Burst Range (Mpc)		BNS Range (Mpc)		of BNS	within		
Epoch	Duration	LIGO	Virgo	LIGO	Virgo	Detections	$5\mathrm{deg}^2$	$20  \mathrm{deg}^2$	
2015	3 months	40 - 60.	and the second second	40 - 80		0.0004 = 3			
2016 - 17	6 months	60 - 75	20 - 40	80 - 120	20 - 60	0.006 - 20	2	5 - 12	
2017 - 18	9 months	75 - 90	40 - 50	120 - 170	60 - 85	0.04 - 100	1 - 2	10 - 12	
2019 +	(per year)	105	40 - 80	200	65 - 130	0.2 - 200	3 - 8	8 - 28	
2022+ (India)	(per year)	105	80	200	130	0.4 - 400	17	48	

#### LSC & Virgo 2013, arXiv:1304.0670

### BNS Mock Data Challenge

5k injections HI-LI network early aLIGO configuration Uniformly distributed component masses  $1.2 \text{ M}_{\odot} \leq m_{1,2} \leq 1.6 \text{ M}$ TaylorT4threePointFivePN waveforms Gaussian noise (recolored noise simulations exist too)







### Why the bump at 180°?



### Why the bump at 180°?



### Why the bump at 180°?





Crosshairs cluster at time delay=0 and maxima in HI, LI antenna pattern











Bump near 180° is inevitable, given H1,L1 configuration.





Bump near 180° is inevitable, given H1,L1 configuration. Worse: these degenerate points are almost 12h apart in RA.





Bump near 180° is inevitable, given H1,L1 configuration. Worse: these degenerate points are almost 12h apart in RA. Multiple **nights** and multiple **optical facilities required** to follow up many GW events!



	┌ / ⁻	Number % BNS Localized		
		of BNS	within	
Epoch		Detections	$5  \mathrm{deg}^2$	$20  \mathrm{deg}^2$
2015	└ <b>〉</b> └	0.0004 - 3	—	
2016-17		0.006 - 20	2	5 - 12
2017-18	Ι ζ	0.04 - 100	1 - 2	10 - 12
2019 +		0.2 - 200	3 - 8	8 - 28
2022+ (India)		0.4 - 400	17	48
		·		•

Observing scenarios document doesn't even bother to put a number for % localized in 2015 run...



Observing scenarios document doesn't even bother to put a number for % localized in 2015 run...

Statistical	ly, in "2015	% BNS localized within			
epoch" MDC:		within 5 deg <sup>2</sup>	within 20 deg <sup>2</sup>		
	with $\rho_{c} \ge 12$	2.2 ± 0.6%	9.8 ± 1.2%		

...for good reason, considering the sky maps for the HILI events in the MDC.



These numbers will be more interesting to fill in as MDCs progress through detector configurations...



Team assembled to produce MDCs for all of the observing scenarios: Chad Hanna, Chris Pankow, Branson Stephens, Alex Urban, Sarah Caudill, Ruslan Vaulin, Salvatore Vitale, Larry Price, Leo Singer



Which detector network is *likely* to produce the first well-localized CBCs?

Team assembled to produce MDCs for all of the observing scenarios: Chad Hanna, Chris Pankow, Branson Stephens, Alex Urban, Sarah Caudill, Ruslan Vaulin, Salvatore Vitale, Larry Price, Leo Singer
### Future work

- Feed rapid localization into full parameter estimation
- MCMC implementation of BAYESTAR developed w/ Ben Farr



see https://dcc.ligo.org/LIGO-G1300015-v3 Ben Farr, Northwestern U.



# Searching for optical counterparts of GBM events with PTF

TITLE: GCN CIRCULAR
NUMBER: 13489
SUBJECT: GRB 120716A: Candidate Optical Afterglow from PTF
DATE: 12/07/19 00:01:37 GMT
FROM: S. Bradley Cenko at Caltech <cenko@srl.caltech.edu>

S. B. Cenko (UC Berkeley), E. O. Ofek (Weizmann Institute of Science), and P. E. Nugent (Lawrence Berkeley National Laboratory / UC Berkeley) report on behalf of a larger collaboration:

We have imaged the location of the IPN GRB 120716A (Hurley et al., GCN 13487) with the Palomar 48 inch Oschin Schmidt telescope as part of the Palomar Transient Factory (PTF). Images were obtained in the r' filter beginning at 4:25 UT on 18 July 2012 (~ 1.5 d after the IPN trigger).

Within the IPN localization, we identify a new point source with coordinates:

RA: 20:52:12.10 Dec: +09:35:53.7 (J2000.0)

Using several nearby stars from the Sloan Digital Sky Survey for reference, we measure a magnitude of r' ~ 20.4 at this time.

Nothing is detected at this location in previous PTF imaging of this field, with images beginning in June 2011. Furthermore, no source is detected in archival SDSS imaging of this location (a faint nearby object in the SDSS database, SDSS J205212.01+093551.9, appears to be of very low significance). However, our most recent epoch of PTF imaging was obtained in March 2012, so we cannot currently rule out the chance alignment of an unassociated foreground or background transient.

Further observations of this candidate optical afterglow are planned.







Image credit: NASA/Jim Grossmann http://www.nasa.gov/mission\_pages/GLAST/news/vision-improve.html



#### Fermi GBM triggers: localization accuracy compared with Swift



#### Estimated radial profile of Fermi GBM localization errors







#### Photometric upper limits for UVOT event

aperture photometry using P48 calibration

TITLE: GCN CIRCULAR
NUMBER: 14192
SUBJECT: GRB 130122A: PTF P48 optical upper limits
DATE: 13/02/09 15:33:37 GMT
FROM: Leo Singer at CIT/PTF <lsinger@caltech.edu>

L. P. Singer (Caltech), S. B. Cenko (UC Berkeley), and D. A. Brown (Syracuse) report on behalf of a larger collaboration:

We have imaged the **3-sigma Swift UVOT error circle** (P. Evans, GCN 14143) of GRB130122A (Swift546731, S. Barthelmy, GCN 14140) with the Palomar 48 inch Oschin telescope (P48) as part of the Palomar Transient Factory (PTF). Images were obtained in the Mould R filter at 2013-01-23 at 06:27:39 and 07:11:25 UTC, 6.7 and 7.5 hours after the trigger.

With sporadic cloud cover and a bright moon, we find no point source, fading or otherwise, to 5-sigma limiting magnitudes of 19.1 and 18.4.



Content-Type: text/plain; charset="us-ascii" MIME-Version: 1.0 Content-Transfer-Encoding: 7bit Subject: GRB 130122A: PTF P48 optical upper limits

Dear humans,

Would you please review and submit this GCN circular?

#### Thanks, react@localhost

TITLE: GCN CIRCULAR
NUMBER: 14192
SUBJECT: GRB 130122A: PTF P48 optical upper limits
DATE: 13/02/09 15:33:37 GMT
FROM: Leo Singer at CIT/PTF <lsinger@caltech.edu>

L. P. Singer (Caltech), S. B. Cenko (UC Berkeley), and D. A. Brown (Syracuse) report on behalf of a larger collaboration:

We have imaged the 3-sigma Swift UVOT error circle (P. Evans, GCN 14143) of GRB130122A (Swift546731, S. Barthelmy, GCN 14140) with the Palomar 48 inch Oschin telescope (P48) as part of the Palomar Transient Factory (PTF). Images were obtained in the Mould R filter at 2013-01-23 at 06:27:39 and 07:11:25 UTC, 6.7 and 7.5 hours after the trigger.

With sporadic cloud cover and a bright moon, we find no point source, fading or otherwise, to 5-sigma limiting magnitudes of 19.1 and 18.4.

#### Pipeline composes GCN circulars

# Multiple detection of BAT event in catalog search

light curve power law index measured

TITLE: GCN CIRCULAR
NUMBER: 14244
SUBJECT: GRB 130215A: PTF P48 optical detection
DATE: 13/02/21 06:08:29 GMT
FROM: Leo Singer at CIT/PTF <lsinger@caltech.edu>

L. P. Singer (Caltech), S. B. Cenko (UC Berkeley), and D. A. Brown (Syracuse) report on behalf of a larger collaboration:

We have imaged the 3-sigma Swift BAT error circle (S. Barthelmy, GCN 14214) of GRB130215A (Swift548760, S. Barthelmy, GCN 14204) with the Palomar 48 inch Oschin telescope (P48) as part of the Palomar Transient Factory (PTF).

Images were obtained in the Mould R filter on 2013-02-15 at 02:35:05
and 04:05:52 UTC, 1.1 and 2.6 hours after the trigger. We detect a
fading point source that is absent in the USNO B-1 catalog at
magnitudes of 16.38 and 17.59 at
 RA(J2000) = 2h 54m 00.73s
 DEC(J2000) = +13d 23' 43.0"
, matching the ROTSE-IIIb position (GCN 14205, Zheng & Flewelling).

Assuming a power-law decay, these two P48 observations give us an index alpha=-1.25, consistent with the index of alpha=-1.24 reported by ROTSE analysis (GCN 14208, Zheng et al.).



# Multiple detection of BAT event in catalog search

light curve power law index measured



# Deeper photometric limit in good observing conditions

aperture photometry using P48 calibration

TITLE: GCN CIRCULAR
NUMBER: 14313
SUBJECT: GRB 130305A: PTF P48 optical upper limits
DATE: 13/03/15 19:28:32 GMT
FROM: Leo Singer at CIT/PTF <lsinger@caltech.edu>

L. P. Singer (Caltech), S. B. Cenko (UC Berkeley), and D. A. Brown (Syracuse) report on behalf of a larger collaboration:

We have imaged the 3-sigma Swift XRT error circle (D. Malesani, GCN 14263) of GRB130305A (Fermi384176354, J. R. Cummings, GCN 14257) with the Palomar 48 inch Oschin telescope (P48) as part of the Palomar Transient Factory (PTF). Images were obtained in the Mould R filter at 2013-03-06 at 05:13:35 and 05:56:17 UTC, 17.6 and 18.3 hours after the trigger.

We find no point source, fading or otherwise, to 5-sigma limiting magnitudes of 20.8 and 20.8.



#### Fermi trigger from Friday, result so far:

dozens of variable stars some image subtraction muck two likely background supernovae, awaiting classification



#### Fermi trigger from last night

more follow-up observations tonight



#### low-latency event detection

seems to be in hand



#### low-latency event detection

seems to be in hand

#### rapid sky localization





as shown by engineering runs and mock data challenges, demonstrably ready now, but can be improved a little bit

#### low-latency event detection

seems to be in hand

#### rapid sky localization





as shown by engineering runs and mock data challenges, demonstrably ready now, but can be improved a little bit

#### optical follow-up

the hard part: largely uncharted territory, *hic sunt dracones...* 



# Acknowledgements





Larry Price, Chad Hanna, Brad Cenko, Duncan Brown, Ben Farr, and many other collaborators...

LIGO Laboratory

Palomar Transient Factory



NSF Graduate Research Fellowship



# Acknowledgements





Larry Price, Chad Hanna, Brad Cenko, Duncan Brown, Ben Farr, and many other collaborators...

LIGO Laboratory

Palomar Transient Factory



astropy

NSF Graduate Research Fellowship



### Extra slides

### ER3: Injections Found

4 low-mass triggers, all reported by gstlal





#### **note:** "freak" event, with VI in an artificially G71627 sensitive state



FAR: 1.367e-10



# Orientation integral

• Newton-Cotes quadrature in  $\psi, \cos \iota$ 



# The devil is in the details...

- $\sigma_t$  veers from  $1/\rho$ dependence at  $\rho \sim 10$
- Proper relation of σ<sub>t</sub> vs. ρ
   critical for self-consistency
- Lots of ideas: Nicholson & Vecchio 1998, PRD 57, 4588

'beyond Fisher information' series
expansions
Zanolin et al. 2010, PRD, 81,
124048
Vitale & Zanolin 2010, PRD 82,
124065

'effective Fisher information' Cho e al. 2013, PRD, 87, 024004



crosses: measurement of timing uncertainty by numerical experimentdashed line: Cramér-Rao bound heavy line: Barankin bound E.W. Barankin, Ann. Math. Stat., 20, 477 w/fudge factor of  $\pi$  (!?)

### The devil is in the details...





### Enhancement: fold phase measurement into likelihood

- CRB $\Rightarrow$ time & phase errors are correlated
- Likelihood looks like Gaussian wrapped on cylinder
- At least two ways to do this:



