



GWSkyNet

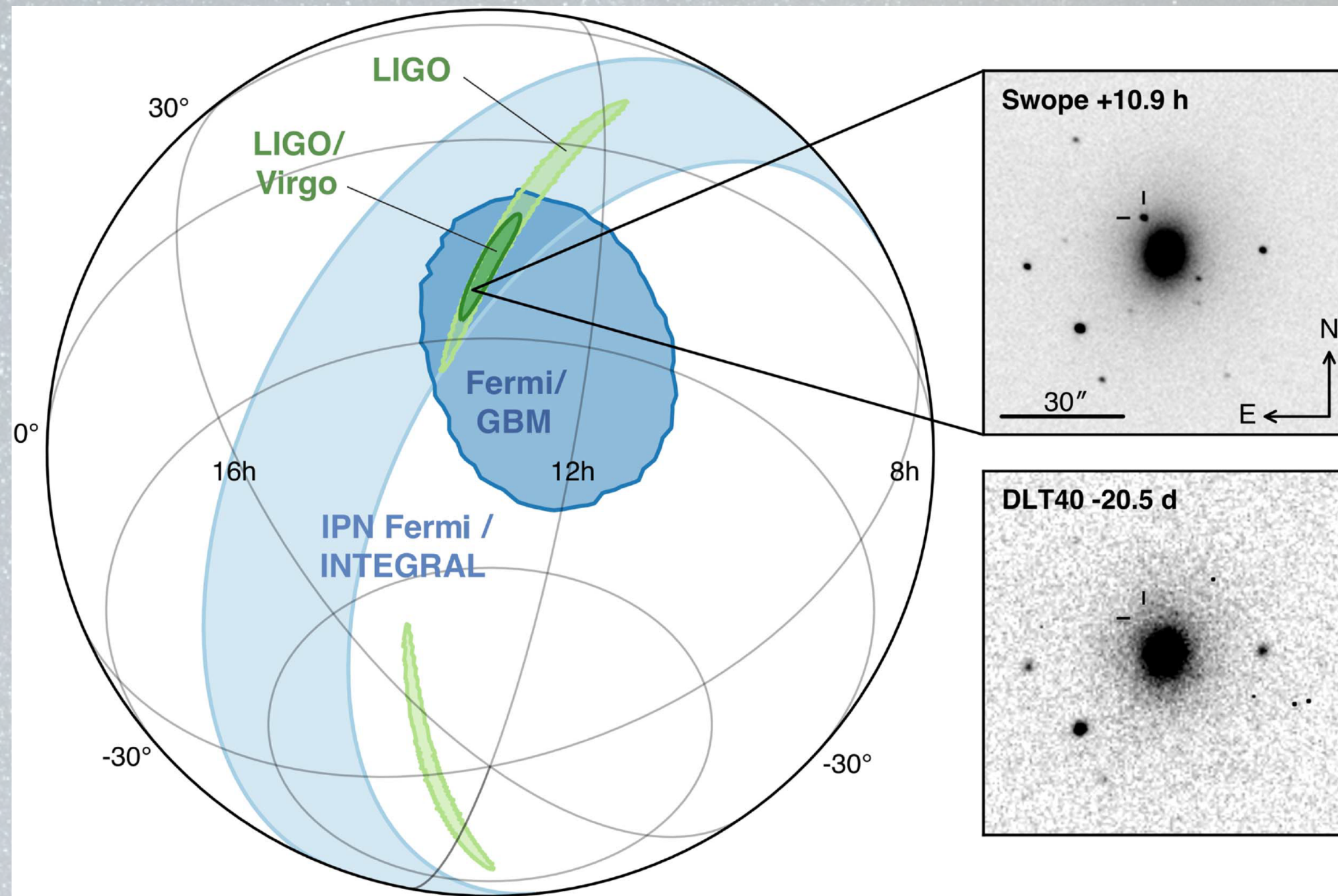
for multi-messenger astronomy

Miriam Cabero Müller
University of British Columbia

LISA Canada Workshop
27-29 April 2021

Multi-messenger astronomy

LIGO / Virgo example: GW170817



Two main ingredients for a successful followup campaign

- Accurate sky localization
- Release of candidate information

More precise sky localization expected for some LISA sources.

Host galaxy:
NGC 4993

Machine learning with sky maps

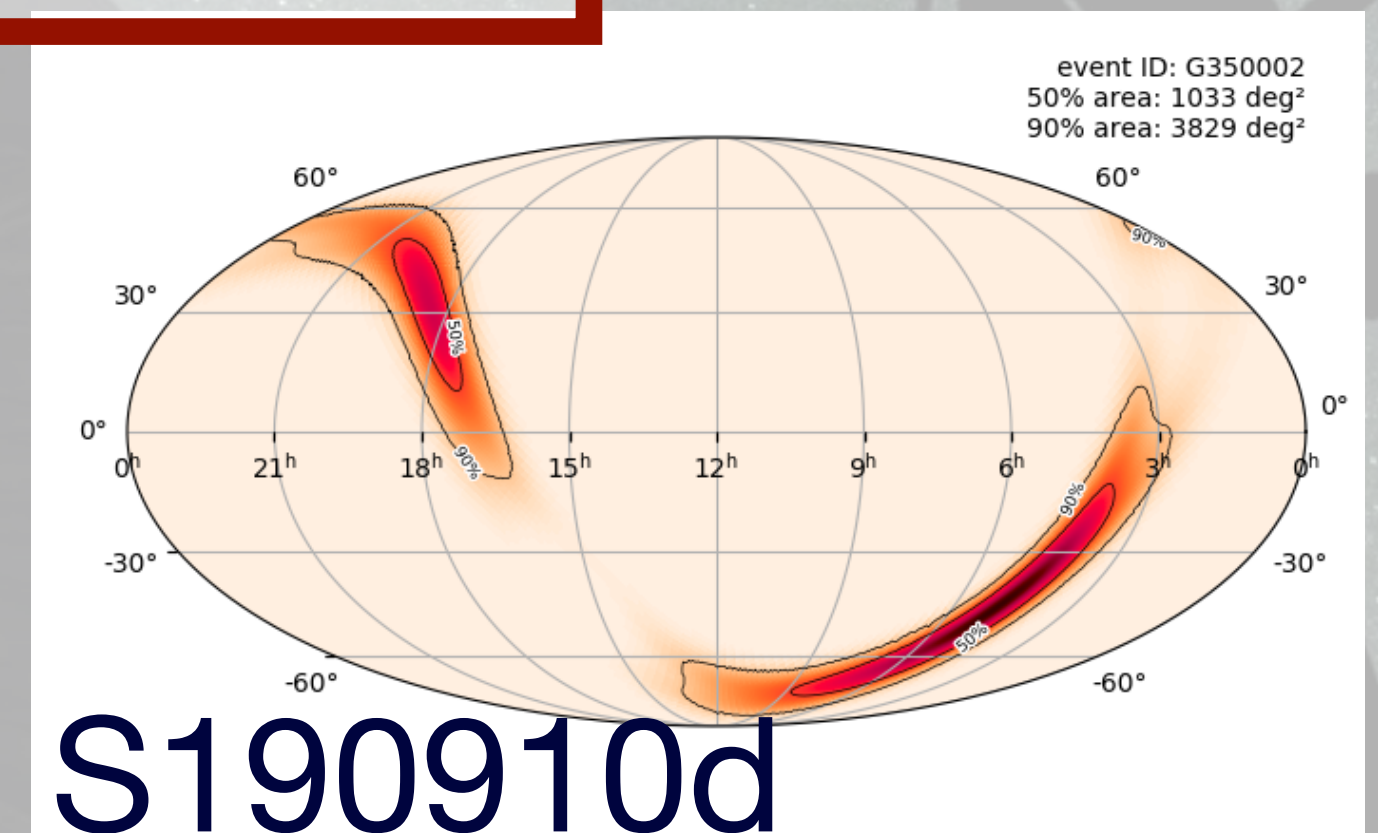
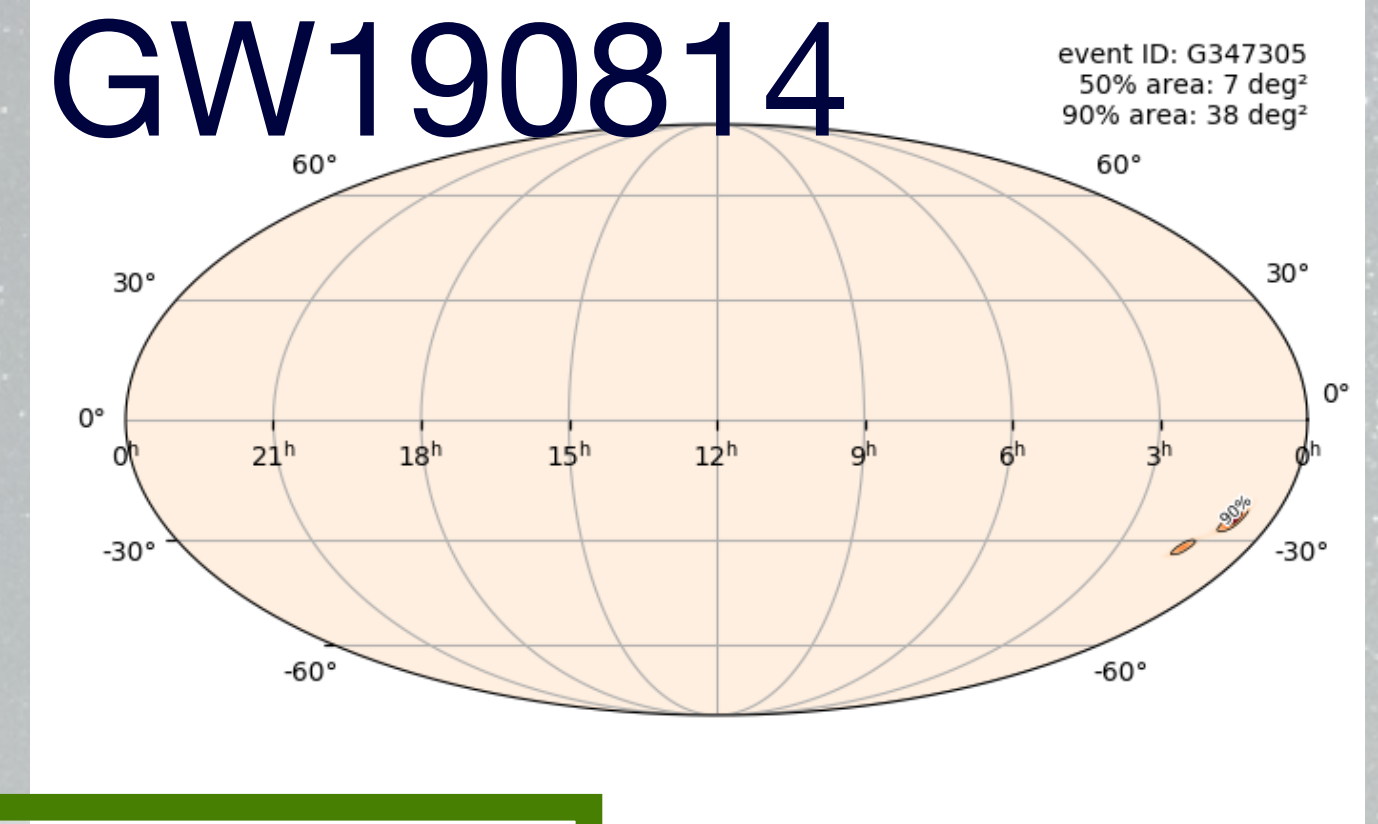
GWSkyNet

Convolutional neural network

- 2D sky map image
- 3D volume image
- Detector network
- Estimated distance

Astrophysical

Not astrophysical



Performance on GWTC-2

GWTC-2: GW discoveries between
1 April and 1 October 2019



29 non-retracted & unpublished
candidates in this period

	Astrophysical	Not astrophysical
Results (GWTC-2)	22	7
Prediction (GWSkyNet)	23	6

Correctly rejected most
non-astrophysical events
(except S190923y)

Accuracy: How often is the model correct?

$$A = \frac{\text{Correct predictions}}{\text{All predictions}} = 96.5\%$$

Recall: How many astrophysical events are
predicted correctly?

$$R = \frac{\text{Predicted astro}}{\text{Actual astro}} = 100\%$$

GWSkyNet

for multi-messenger astronomy

PHYSICS  UBC DEPARTMENT OF
ASTRONOMY



GWSkyNet is a classifier that uses GW sky maps to identify non-astrophysical events

Results look promising: GWSkyNet can help astronomers decide which candidates to follow up

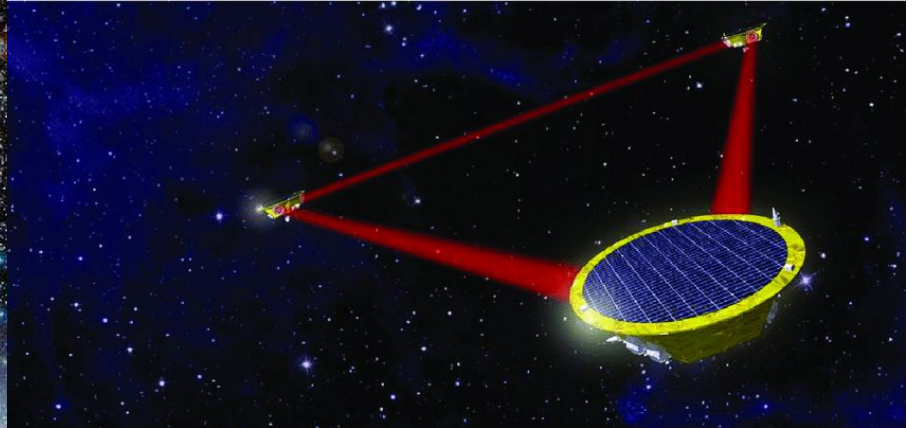
Can be applied to LISA sources once a training set with LISA data has been constructed

Thank you

The hunt for ultra-compact X-ray binaries in extragalactic globular clusters: lessons for LISA

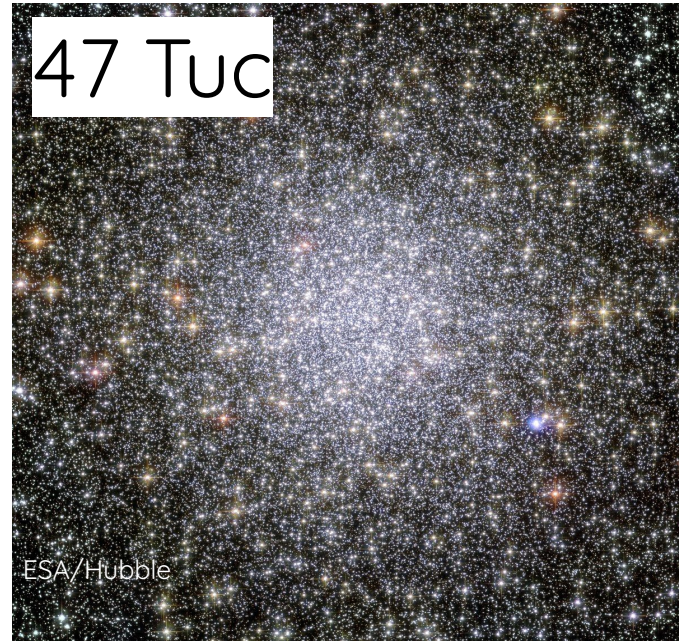


Kristen Dage
McGill University
April 28, 2021



Ultra-compact X-ray binaries in globular clusters?

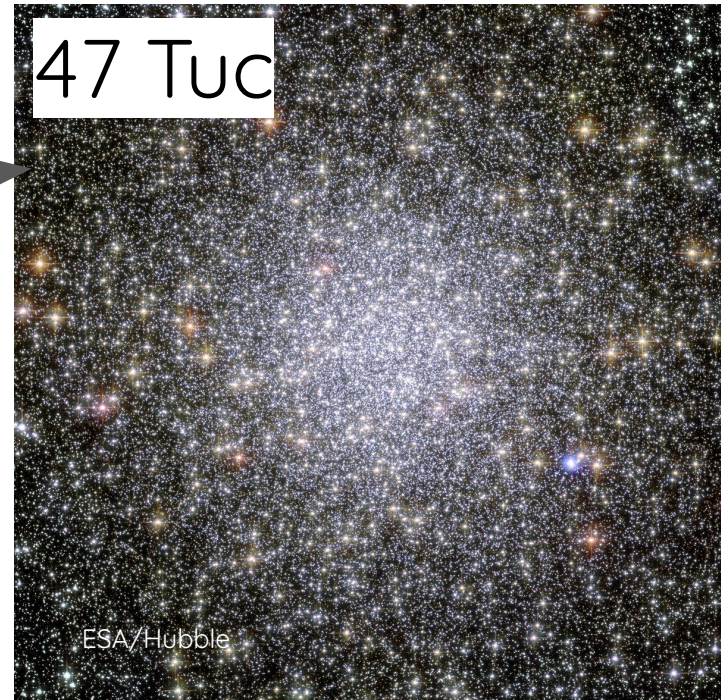
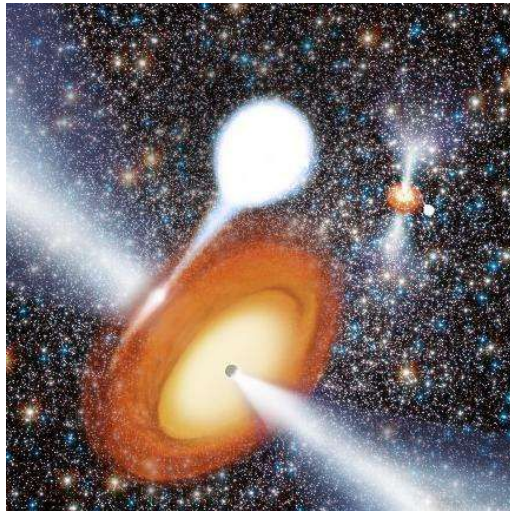
The globular cluster environment is dynamic and crowded, and because of this, all kinds of exotic X-ray binaries form...including ultra-compact X-ray binaries (UCXBs)



Ultra-compact X-ray binaries in globular clusters?

Some Galactic globular clusters are home to UCXBs, but unfortunately, our Galaxy is home to only ~150 globular clusters making it difficult to find observational evidence to test against theoretical predictions of GC UCXB formation rates for LISA.

Luckily, there are tens of thousands of clusters outside our Galaxy!



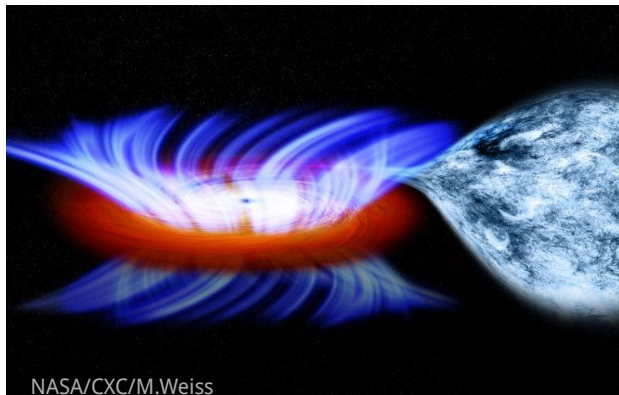
47 Tuc X-9 & extragalactic friend RZ2109

47 Tuc X-9

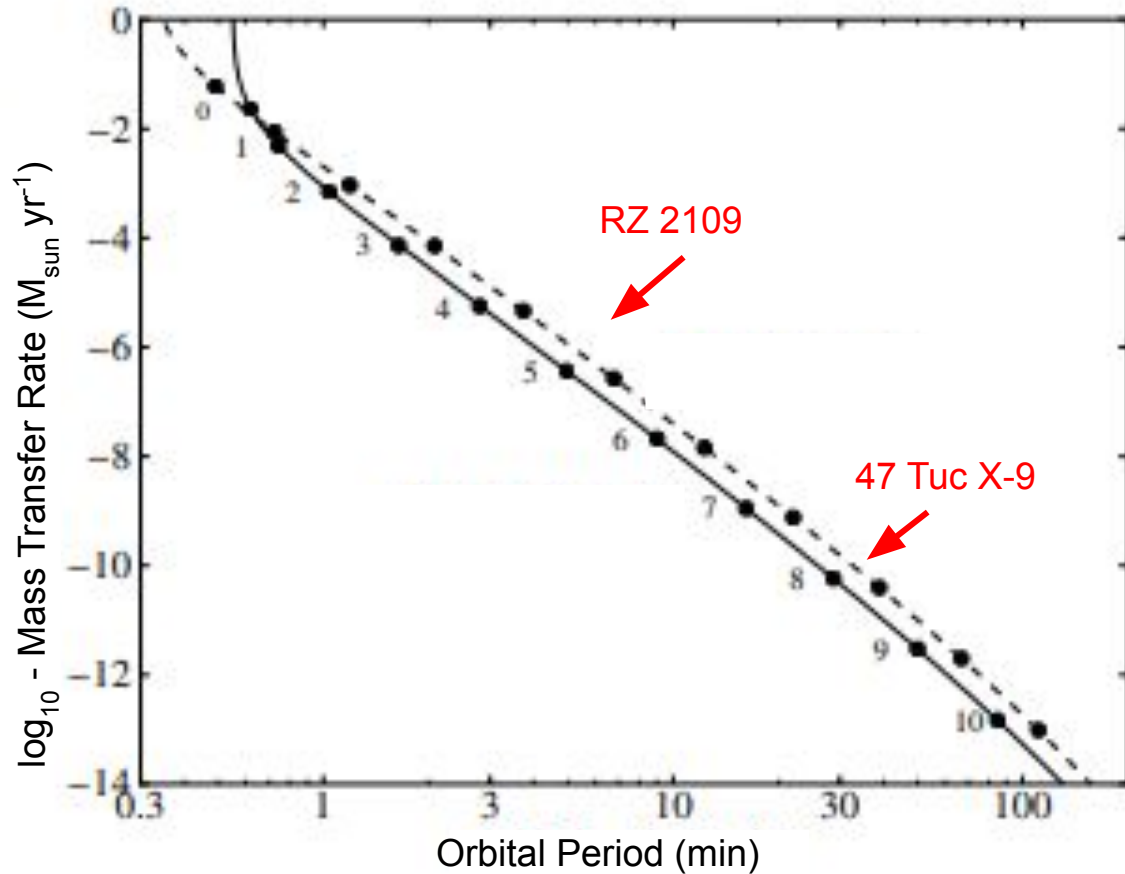
- BH? (*Miller-Jones+2015*)
- O_{VII} and O_{VIII} emission (*Bahramian+2017*)
- No H emission (*Tudor+2018*)
- Variability on ~days (*Bahramian+2017*)
- Unusually FUV bright (*Knigge +2007*)
- $L_x \sim 10^{33}$ erg/s (*Grindlay+2001*)

RZ2109

- BH? (*Maccarone+2007*)
- O[III] emission (*Zepf+2007*)
- No H emission (*Steele+2011*)
- Variability on ~days (in prep)
- Unusually NUV bright (in prep)
- $L_x \sim 10^{39}$ erg/s (*Maccarone+2007*)

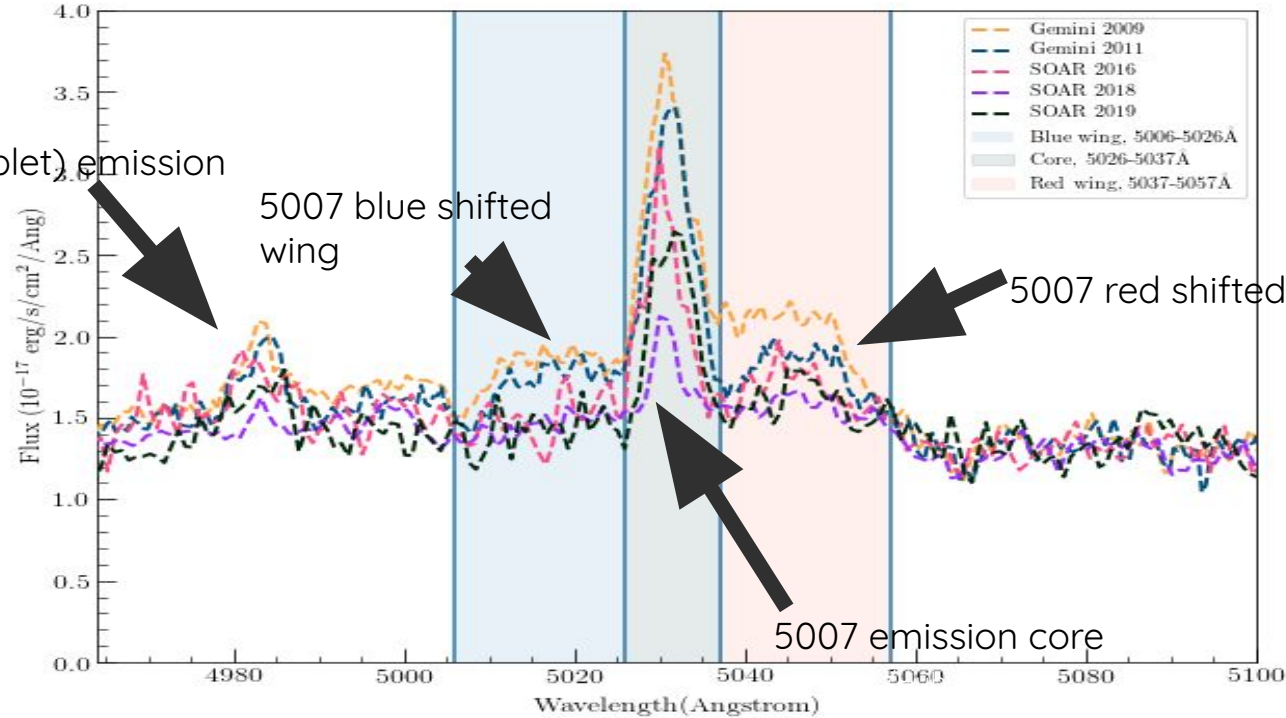


Higher mass transfer rate sources (visible in X-ray) produce optical emission lines which we can search for with optical telescopes.



Adapted from van Haaften+ 2012

super Eddington outflows

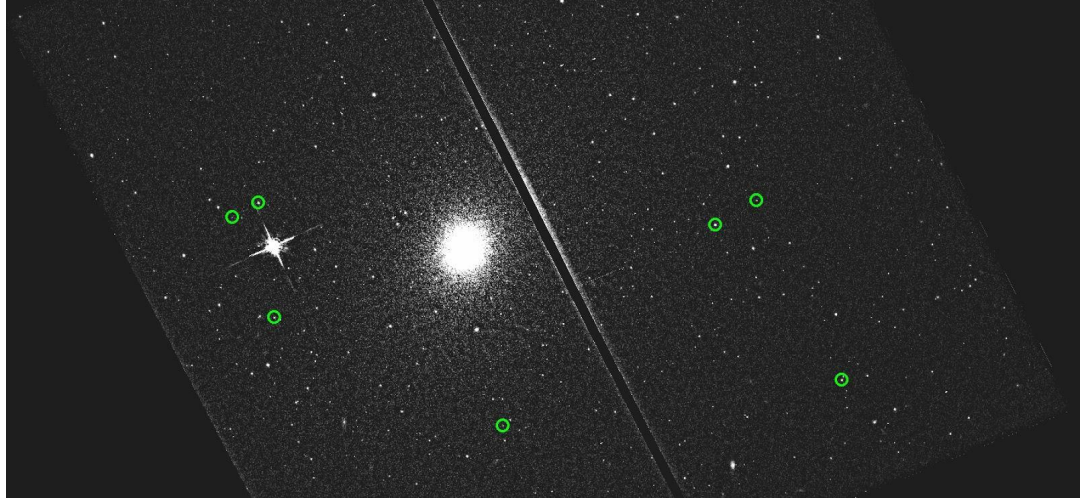


(Dage et al, 2019b)

How can we find more?

We can find GC ULX sources by matching optically known GCs to sources with high X-ray luminosity.

Follow-up optical spectroscopy will reveal emission lines caused by super-Eddington outflows.





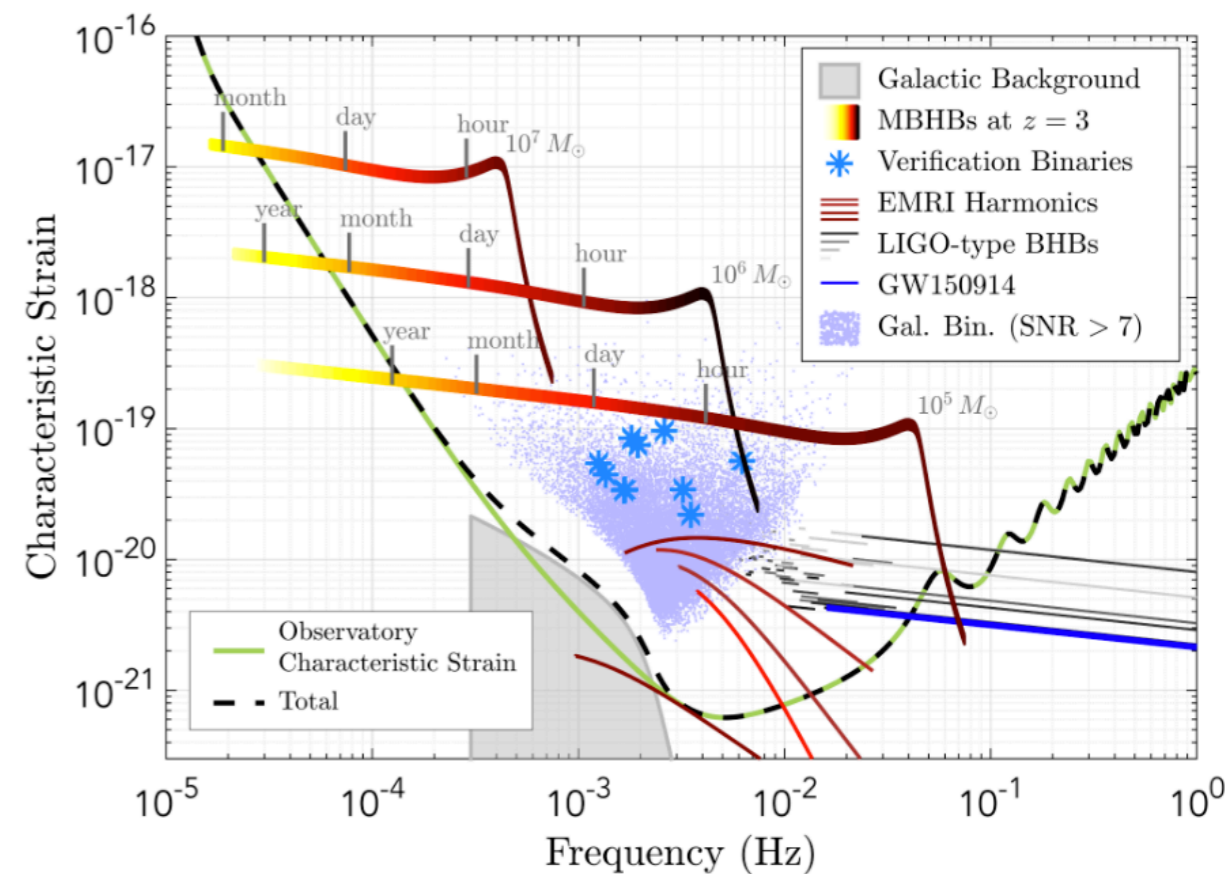
Applying LIGO-Virgo continuous gravitational wave analysis methods to LISA data

**Evan Goetz
University of British Columbia**

LISA Canada 2021 Workshop, April 2021

Analyses for GW signals in LIGO-Virgo and LISA

- LIGO-Virgo data is noise dominated
- LIGO-Virgo compact binary coalescence analyses
=> matched filtering for transient signal
- Continuous wave analyses of signals from rapidly rotating neutron stars
=> matched filtering* for quasi-monochromatic signal
- Certain classes of LISA sources are quasi-monochromatic on timescale of months to years



LISA mission proposal for ESA L3 mission

* CW searches are often more complicated than matched-filtering ²

CW analysis parameter estimation

- Parameters for an isolated neutron star emitting monochromatic gravitational wave signal

$$\vec{\lambda}_{\text{NS}} = \{\alpha, \delta, f, \dot{f}, h_0, \cos \iota, \psi, \phi_0\}$$

- Long integration times required (expected signal is noise-dominated)
- Matched-filter analysis only practical for pulsars with timing solution
- MCMC techniques to perform parameter estimation
- With less knowledge, unknown parameters have to be searched over, often with suboptimal methods due to computing constraints

Application to LISA sources

- Certain qualitative overlap LIGO-Virgo CW signal/analyses and LISA signal/analyses
- Natural extension of LIGO-Virgo CW parameter estimation techniques

$$\vec{\lambda}_{\text{CB}} = \{\alpha, \delta, h_0, m_1, m_2, \cos \iota, \psi, \phi_0, \vec{s}_1, \vec{s}_2, e, \dots\}$$

- CW Search techniques potentially useful for low-SNR or “obscured” signals
- Useful to search the “confusion limited” regime...?

Next steps

- Investigate utility of LIGO-Virgo continuous wave search methods
- Extending CW parameter estimation method/software to LISA sources
- Understanding under what conditions these are most beneficial/useful (e.g., CW searches the low-SNR LISA regime?)
- Thanks for your attention!

Extra slides

Possible sources of interest

- CW methods most useful for slow phase evolution, e.g., compact binary well-before merger
- Compact binaries; NS-NS, NS-BH, BH-BH
- Extreme mass ratio (before the merger)
- BH binaries + SMBH (triple system)
- Other exotic systems?

Laura Sberna

BSc/MSc
Sapienza U. Rome

2016



PI
2021

PhD

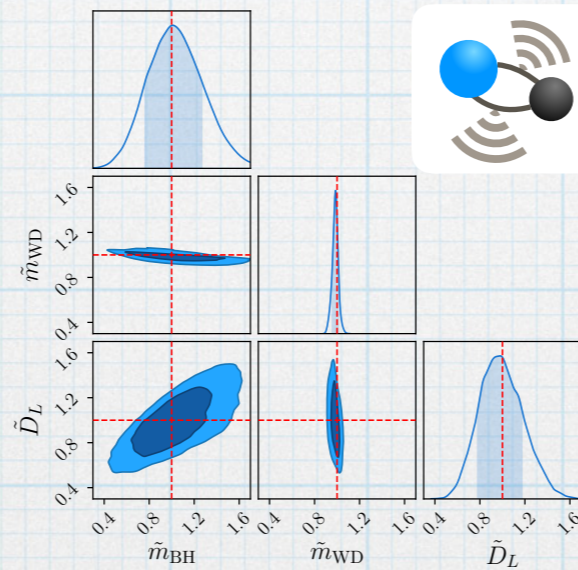
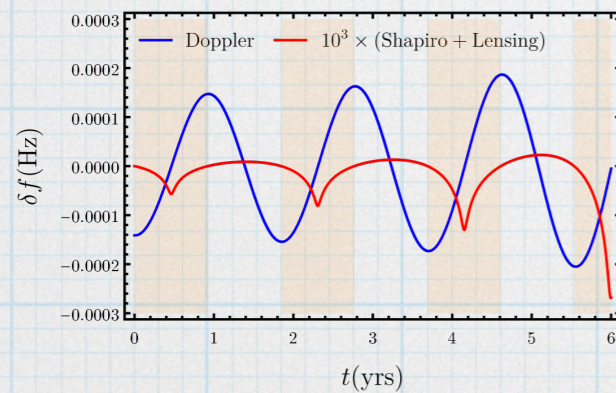
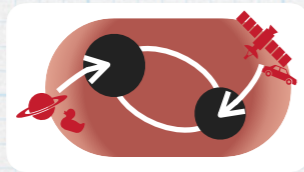
Perimeter Institute/ U. Waterloo

Postdoc
AEI Potsdam

2021



LISA



Other

Black hole ringdown



Electromagnetic superradiance



1. Black hole binaries & EMRIs
in accretion disks

2. Black hole-white dwarfs

3. Massive binaries (population modelling and inference)

Canadian Multi-messenger Astronomy: a CFHT + GW190814 Case Study

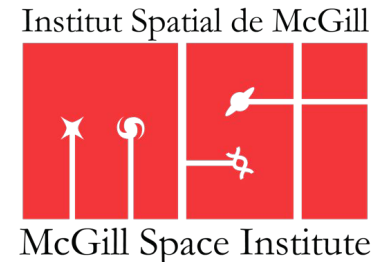
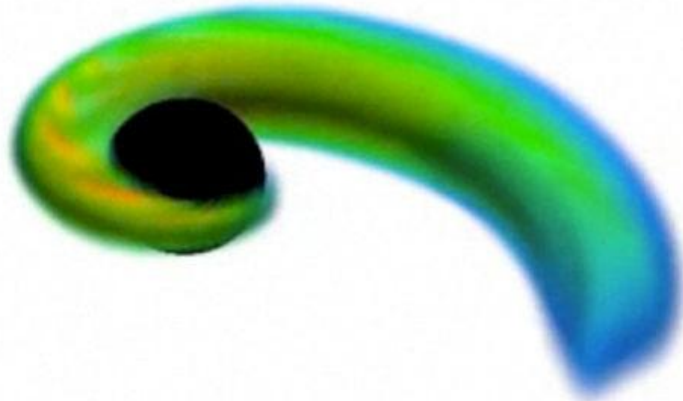
Nicholas Vieira

McGill Space Institute

Supervisors: Daryl Haggard & John Ruan
















McGill Extreme Gravity & Accretion



GW190814

- GW190814: the first strong candidate **neutron star + black hole** (NSBH) merger with **excellent** sky localization
- Are NSBH kilonovae (UV/optical/IR transient) “redder” than binary NS?
- Implications for *r*-process synthesis of heavy elements?
- NS equation of state

A Deep CFHT Optical Search for a Counterpart to the Possible Neutron Star–Black Hole Merger GW190814

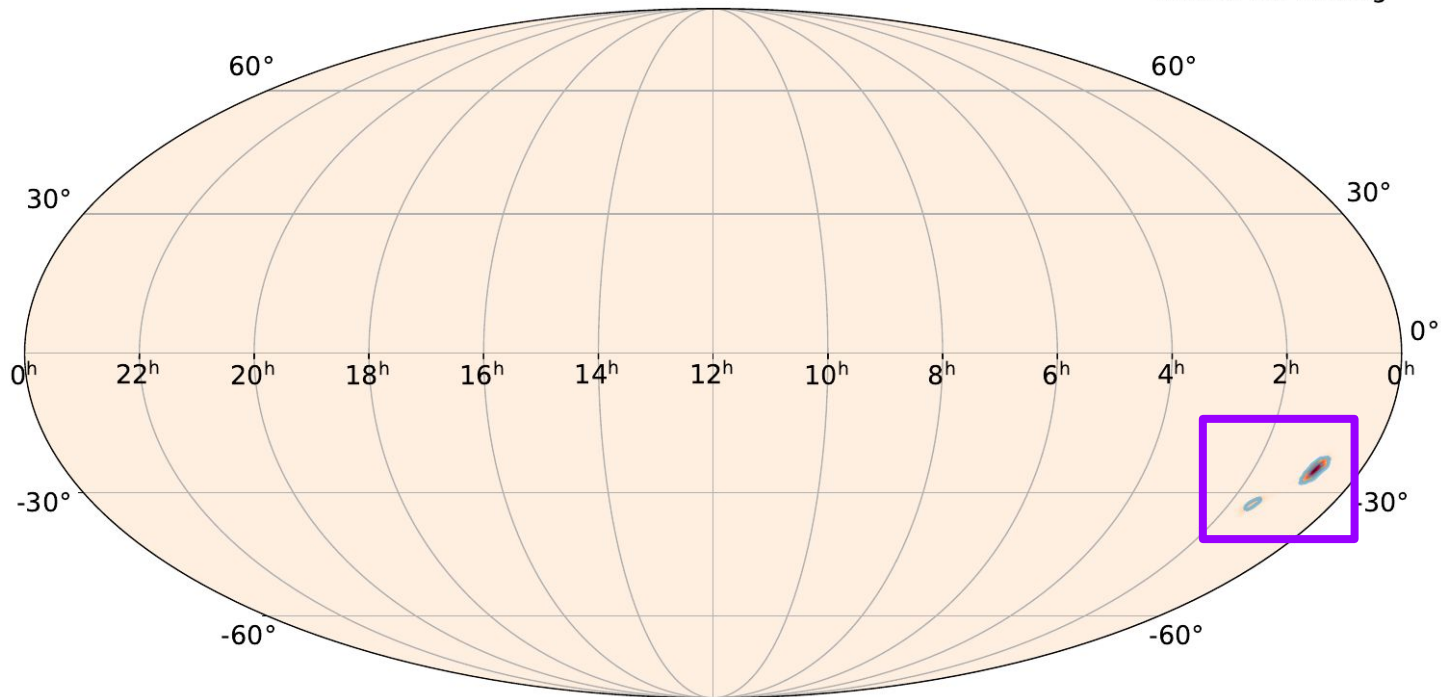
Nicholas Vieira¹ , John J. Ruan¹ , Daryl Haggard^{1,2} , Maria R. Drout³ , Melania C. Nynka⁴ , Hope Boyce¹ ,
Kristine Spekkens⁵ , Samar Safi-Harb⁶ , Raymond G. Carlberg³ , Rodrigo Fernández⁷ , Anthony L. Piro⁸ ,
Niloufar Afsariardchi³ , and Dae-Sik Moon³ 

Canada-France-Hawaii Telescope (CFHT) follow-up

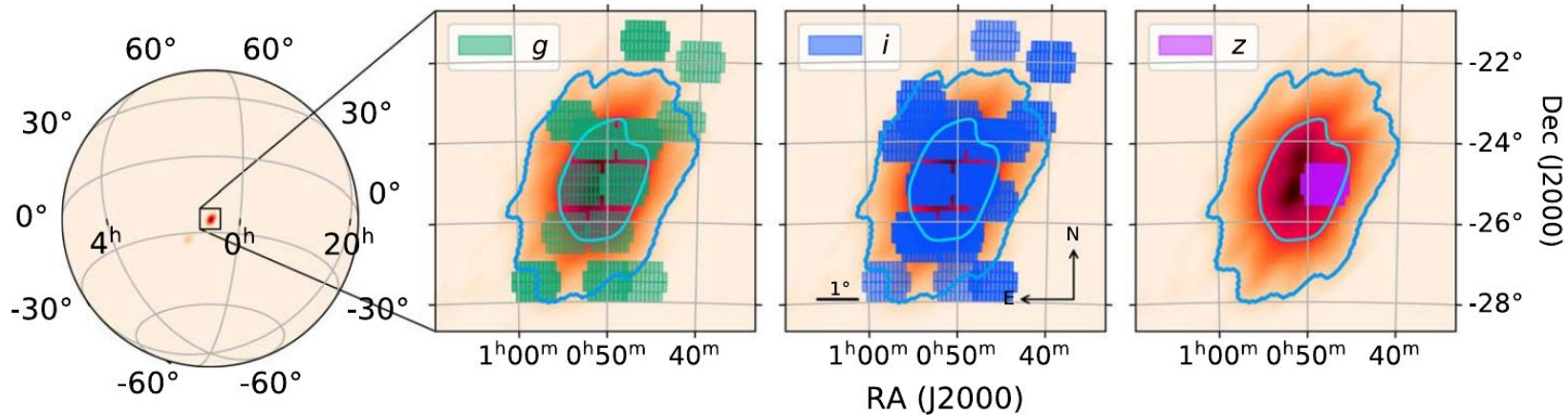
event: GW190814

50% area: 5 deg²

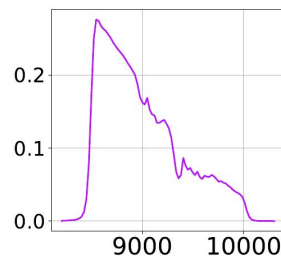
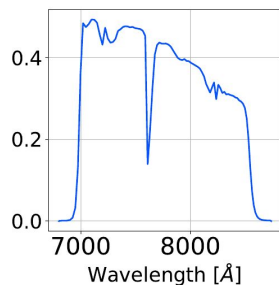
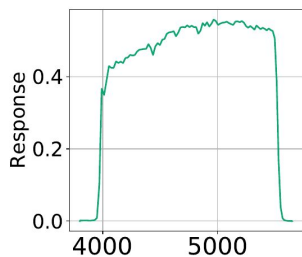
90% area: 23 deg²



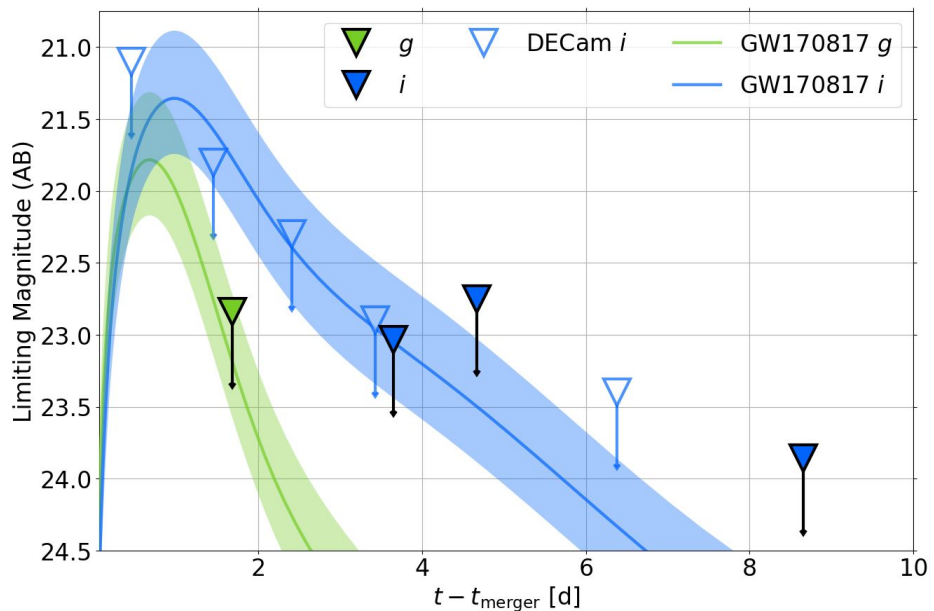
Canada-France-Hawaii Telescope (CFHT) follow-up



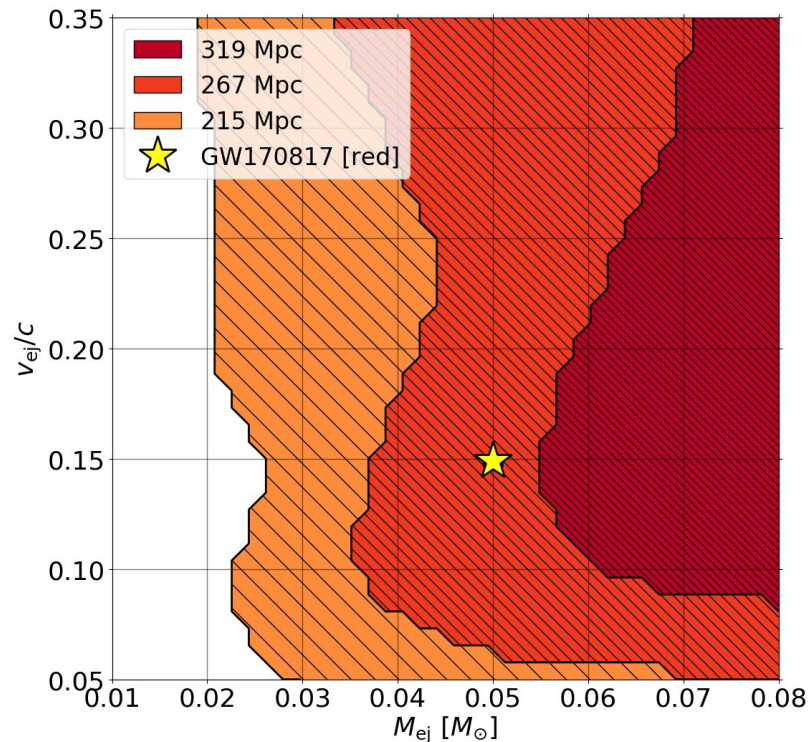
Vieira+20



Constraining the source



Vieira+20



Looking to the future

- GW190814 follow-up with CFHT: example of competitive, constraining multi-messenger astronomy led by Canadians
- Canadian expertise in multi-messenger astronomy is building!
- Excited for LISA!

Looking to the future

What will LISA data products look like?

When will they be released?

How can we ensure that we maximize science returns of
LISA + EM observations?

Which existing and upcoming Canadian and
Canadian-affiliated EM facilities will be most useful?