# **Applications of Artificial Intelligence** to Gravitational Wave Science

**Steven Schramm**, for the organisers

#### March 18, 2022 @ Université de Genève

# Welcome to the event - Artificial Intelligence (AI) / Machine Learning (ML)

At UniGe, we have people interested in both: - Gravitational Wave (GW) science

Today, our main objectives are to: - Help Al experts to understand GW challenges - Help GW experts to understand AI opportunities - Foster collaboration between AI and GW communities - Kick-stat cross-departmental activities at UniGe

There are more than 50 people registered to the event - We are very happy to see such broad interest!

#### The organisers

 Cross-departmental: astronomy, particle physics, theory
 Includes people with a background in GW science and artificial intelligence / machine learning
 Frequently in Einstein Telescope (future GW observatory)



Federico Sanchez, full professor
Department of particle & nuclear physics
T2k international spokesperson
Considering Einstein Telescope activity
Machine Learning for sample generation
Director of the UniGe DPNC







Georges Meynet, full professor
Department of astronomy
Stellar computational astrophysics
Modelling of massive star evolution
Head of UniGe Stellar Evolution group

- Considering Einstein Telescope activity



Michele Maggiore, full professor Department of theoretical physics - Gravitational wave physics

- Chair of the Einstein Telescope Observational Science Board (OSB)
- Einstein Telescope Steering Committee





Steven Schramm, assistant professor
Department of particle & nuclear physics
- Member of Einstein Telescope (OSB, eIB)

- Member of the ATLAS Collaboration
- Background in Machine Learning for data analysis and signal identification

Tobias Golling, associate professor
Department of particle & nuclear physics
Member of the ATLAS Collaboration
Machine Learning in various contexts
Recipient of a Sinergia grant on AI as applied to physical sciences

Anastasios Fragkos, assistant professor

Department of astronomy

- Member of Einstein Telescope (OSB, eIB)
- ET Board of Scientific Representatives
- Stellar & gravitational wave astrophysics
- Machine Learning for model simulation

#### Antonio Riotto, full professor

Department of theoretical physics

- Cosmology and astroparticle physics
- Convener of Einstein Telescope OSB
   Division 3: Population Studies
- Director of the UniGe DPT

## **Overview of the event**

We are very happy to welcome four external experts to our event
They will present three dedicated talks, with time for questions
There will then be a panel discussion, with all of the experts
You are very much encouraged to ask questions to the panel!

Talks are oriented around key subjects of AI as applied to GW science:
AI for GW data analysis

Elena Cuoco; EGO and Scuola Normale Superiore di Pisa

AI for GW simulation/emulation and parameter estimation

Jonathan Gair; Max Planck Institute for Gravitational Physics

AI for GW inference

Otto Hannuksela; Chinese University of Hong Kong
Kyungmin Kim; International Center for Astrophysics, KASI

## Our invited experts (speakers)













#### Kyungmin Kim

#### **Otto Hannuksela**

# **Gravitational Wave Science Centre GRAVITAT** WAVE SCIENCE CENTER

A new "centre facultaire" at UniGe - This event is part of the kickoff activities

Founding members from three departments at UniGe: - Department of Astronomy - Department of Particle and Nuclear Physics - Department of Theoretical Physics

Anyone interested in GW science is welcome to join the mailing list - Follow-up events will be announced here: gwsc-events@listes.unige.ch We will add those who indicated interest in follow-ups when registering - Others who want to join can contact gwsc-info@unige.ch

For more details, and other involvement types, please see the website: http://gwsc.unige.ch/

# **GW** science and UniGe

We are entering a new era of GW science - 2015: first detection of a GW signal - 2017: first multi-messenger detection involving a GW signal - Present: detections of dozens of GW events per year - 2030s: next generation GW observatories planned to come online; expect continuous signals, transient sources every second

UniGe is well-positioned to make world-leading contributions - Already a leader in multi-messenger (MM) astronomy - Participation in EM, cosmic ray, and neutrino MM activities - Leading role in supporting next generation GW observatories - In particular, critical and growing role in Einstein Telescope - Active in many areas related to GW modelling and interpretation

# AI/ML research and UniGe

#### We are similarly in a new era of AI/ML

- Enormous computational power (including dedicated hardware)
- Algorithmic developments that can exploit this power
- Advances in the understanding of how to exploit large datasets
- UniGe is actively involved in unifying AI/ML and astro/physics - SNSF Sinergia; Robust Deep Density Models for High-Energy Particle Physics and Solar Flare Analysis (RODEM) [Co-Is: Francois Fleuret, Tobias Golling, Slava Voloshynovskiy] - SNSF Sinergia; AstroSignals: A New Window on the Universe, with the New Generation of Large Radio-Astronomy Facilities [Co-I: Daniel Schaerer; partners: Miroslava Dessauges-Zavadsky, Slava Voloshynovskiy]

#### UniGe is well-positioned to discuss applying AI to GW research

## A very brief intro to GW science

## Creating GW signals

#### Interpreting GW signals

#### Detecting GW signals

## A very brief intro to GW science

## Simulating **GW** events

#### GW signal inference

## Following slides are indicative, not exhaustive

## GW data analysis

## Simulating GW events

Do initial conditions lead to a merger?

What are the parameters of interest?

#### Do not further simulate system

Classification

How do these propagate to the observer?



#### Regression Regression

## GW signal inference

Given observed parameters, what was the source?

 $p_1$ 

p<sub>2</sub>

 $P_3$ 

What is the likely origin of the source system?

#### Regression

Generative models

#### What does this imply about different astrophysical models?

#### Population studies: Model A vs B

Generative models

# GW data analysis **Observed time-series** Is there a glitch?

No

#### Noise suppression



# Various signal probes Yes

Extremely Loud

Blin



Helix



## Extracted GW signal

Is there a signal? — Waveform banks, etc

# Observed time-series

No

#### Noise suppression De-noising



#### Various signal probes

Extremely Loud

Helix

Is there a signal? — Waveform banks, etc Classification, anomalies

# GW data analysis

#### Is there a glitch? Classification, clustering



## 

# We hope that you enjoy the event!

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