Application of the radio detection technique in neutrino astronomy

Christian Glaser













UPPSALA **Co-funded by** UNIVERSITET the European Union



Radio Detection of EeV Neutrinos in Dielectric Media using the Askaryan Effect*

Link to Book doi:10.3204/PUBDB-2021-03021

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*for Babies

Experimental Challenges

- Low interaction cross section of neutrinos
- Very low neutrino flux
- →Very large volumes needed for reasonable rates





Experimental Challenges

- Low interaction cross section of neutrinos
- Very low neutrino flux
- →Very large volumes needed for reasonable rates
- Solution: radio technique
 - Large volumes at no cost: Antarctic ice
 - Ice transparent to radio waves (L ~ 1km)
 - A single radio station has 1km³ effective volume (comparable to IceCube)





Expected event rate: a few per year but background free

- Askaryan effect: Time varying negative charge excess in the shower front
- Macroscopic: Longitudinal current



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- Macroscopic: Longitudinal current
- Microscopic: Acceleration and creation of charge





 Askaryan effect: Time varying negative charge excess in the shower front Macroscopic: Longitudinal current Microscopic: Acceleration and creation of charge ice n=1.78 neutrino

- Askaryan effect: Time varying negative charge excess in the shower front
- In ice: arccos(1/n) = 56 deg





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Askaryan Radiation Verified in the Lab and through Air-Shower Meausrements

Antennas



S. Barwick and C. Glaser, book chapter in the Encyclopedia of Cosmology II, World Scientific (2023) <u>arXiv:2208.04971</u>

 Askaryan effect: Negative charge excess in the shower front





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→ Synnergies with Gravitational Waves data analysis/Einstein Telescope

In-Ice Radio Neutrino Detection Experiment Landscape

ARIANNA test bed

• 12 shallow stations at Moore's Bay + South Pole

C. Glaser for the ARIANNA collaboration, ARENA2022

ARA

• 5x 200m deep stations at South Pole

Radio technology developed and verified; hardware proven reliable





In-Ice Radio Neutrino Detection Experiment Landscape

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Past

• 5x 200m deep stations at South Pole

Radio technology developed and verified; hardware proven reliable

RNO-G

- 35+ detector stations in Greenland
- first deployment summer 2021
- First UHE neutrino discovery likely









RNO-G collaboration, Penn State, Sept. 2023



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I'm organizing the next collaboration meeting in Fall 2024 in Uppsala

In-Ice Radio Neutrino Detection Experiment Landscape

ARIANNA test bed

• 12 shallow stations at Moore's Bay + South Pole

Calibration Pulse

-20m

C. Glaser for the ARIANNA collaboration, ARENA2022

now

ARA

p_{ast}

• 5x 200m deep stations at South Pole

Radio technology developed and verified; hardware proven reliable

-10m

RNO-G

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IceCube-Gen2

future

300+ detector stations at South Pole

IceCube-Gen2 radio







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Alternative concepts: Detection in Atmosphere









Alternative concepts: Air-Shower Detection



- Advantage: Better sub-degree angular resolution (because radio signal direction = neutrino direction)
- However:
 - Much larger background
 - Trigger efficiency and neutrino identification not yet demonstrated
 - Much larger instrumentation for same neutrino sensitivity

(only sensitive to nu_tau CC and few-degree aperture for Earth-skimming neutrinos)

- In-ice: 840 antennas (RNO-G)
- In-air: 30,000 antennas (Grand-10k)
- Can be partly mitigated by beamforming trigger: BEACON + TAROGE-M

<u>S. Wissel et al JCAP11(2020)065</u> <u>S.-H. Wang et al JCAP11(2022)022</u>





How to Reconstruct the Neutrino Direction and Energy?

 $\not int$

 \vec{v}_{ν}

- Direction important for source searches, multi-messenger alerts, ...
- The neutrino direction depends on the
 - signal arrival direction \vec{l}
 - signal polarization \vec{p}
 - viewing angle Θ

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- distance to neutrino interaction to correct for bending in firm
- knowledge of ice properties
 - $ec{v}_
 u = \sin heta ec{p} + \cos heta ec{l}$





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 $\vec{\hat{v}}_{
u} = \sin heta \hat{\hat{p}} + \cos heta \, \hat{\hat{l}}$





Tested in-situ with ARIANNA station at South Pole and with cosmic rays at Moore's Bay

ARIANNA collaboration, JCAP 11(2019)030 ARIANNA collaboration, JINST 15 (2020) P09039 ARIANNA collaboration, JCAP 04(2022)022. Glaser & Barwick, JINST 16 T05001 (2021) ARIANNA collaboration, JINST 17 P03007 (2022)

Deep-Learning Reconstruction using Normaling Flows (Simulation-Based Inference)

- Conditional normalizing flows offer an opportunity to predict arbitrarily shaped uncertainty contours
- Network predicts the parameters of a function instead of a single value
- Using open-source toolkit pytorch and jammy_flows: github.com/thoglu/jammy_flows

T Glüsenkamp, Eur. Phys. J. C 84, 163 (2024)



- First event-by-event uncertainty predictions
- The size/entropy can be used as a quality cut



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First event-by-event uncertainty predictions

• The size/entropy can be used as a quality cut





High-Quality Event



78.12

236.59

-

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true

0.0

18.21

Interested in Deep Learning?



Remote PhD course at Uppsala University

<u>https://www.uu.se/en/staff/faculty/science-and-</u> <u>technology/education-and-teaching/doctoral-</u> <u>studies/doctoral-student/courses/faculty-courses/applied-</u> <u>deep-learning-5-credits</u>



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NuRadioOpt:

Optimization of Radio Detectors of Ultra-High Energy Neutrinos through Deep Learning and Differential Programming

NuRadioOpt will improve both key factors that impact the science output

detection rate of UHE neutrinos

→ objective 1: Deep-Learning-Based Trigger

precision to determine the neutrino's direction and energy

> → objective 2: End-to-End Optimization + Deep Learning Reconstruction



European Research Council Established by the European Commission

Objective 1: Deep-Learning-Based Trigger

Huge potential of improvement:

- offline analysis: thermal noise can be rejected with high efficiency
- Neural networks are very good at classification tasks
- Proof-of-concept study: ARIANNA collab. (... C. Glaser, ...), JINST 2022
- Projected improvements:
 - doubling neutrino detection rate in IceCube-Gen2



New DAQ Development

- New ADC generation (JESD204B interface)
 - High speed and low power (~1GHz, 12bit at 0.5W/channel)
 - Simpler compared to custom ASICS of previous hardware
 - Better data quality and opportunities for advanced triggers
- Also looking into Neuromorphic Computing (with Tommaso Dorigo + Fredrik Sandin)



FPGA Developers' Forum

an open space to discuss FPGA design

1st meeting CERN, 11-13 June 2024

Organising Committee:

00

00

Nicolò Vladi Biesuz - INFN, IT Filiberto Bonini - CERN, CH Andrea Borga - Oliscience, NL Davide Cieri (co-chair) - Max-Planck-Institute for Physics, DE Christian Glaser - Uppsala University, SE Francesco Gonnella (co-chair) - University of Birmingham, UK Evangelia Gousiou - CERN, CH Christian Krieg - TU Wien, AT Mathieu Saccani - CERN, CH Paschalis Vichoudis - CERN, CH Tom Williams - RAL, UK Rui Zou - Cornell University, US



fdf@cern.ch

Objective 2: End-To-End Optimization

Current status: Station layout has not been thoroughly optimized

- because MC tools and reco algorithms were not available -> changed with NuRadioMC/Reco
- because turnaround times are too large
- scaling relations are insufficient



Objective 2: End-To-End Optimization

Deep learning and differential programming can build an 20m end-to-end optimization pipeline Direct optimization of science objective -10m science output, e.g., detector parameters, e.g., -20m - neutrino-nucleon cross-section - antenna positions - source discovery - antenna orientation - flux measurement automatic differentiation -2 String Helper String Power String f(Θ) MC simulation reconstruction analysis Θ X Х Helper costs, \rightarrow Expected improvements: up to three times more precise engineering constraints measurement of neutrino direction and energy -150m

Main science objectives of UHE neutrino astronomy:

Neutrino-Nucleon

Cross Section

Impact of NuRadioOpt

 \rightarrow 3x more precise measurement

V. Valera, M. Bustamente, C. Glaser, JHEP 06 105 (2022)

Diffuse Flux

→ expedite the detection of UHE neutrino fluxes
V. Valera, M. Bustamente, C. Glaser, PRD 107, 043019 (2023)

Point Sources

→ identify sources from deeper in our Universe, increasing the observable volume by a factor of three

D. F. G. Fiorillo, V. Valera, M. Bustamente, JCAP03(2023)026

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D. F. G. Fiorillo, V. Valera, M. Bustamente, JCAP03(2023)026

- Improvements equivalent to building a more than three times larger detector at essentially no additional costs
- NuRadioOpt timeline perfect for influencing IceCube-Gen2
- because we are already at the limit of logistical resources at the South Pole,
 NuRadioOpt is the only option to accelerate UHE neutrino science in the next decade



Fourth MODE Workshop on Differentiable Programming for Experiment Design

23-25 Sept 2024
Valencia (Spain)
Europe/Madrid timezone

Accommodation Vonue and tra

Q

Overview

Scientific Programme Call for Abstracts

MODE (for Machine-learning Optimized Design of Experiments) is a collaboration of physicists and computer scientists who target the use of differentiable programming in design optimization of detectors for particle physics applications, extending from fundamental research at accelerators, in space, and in nuclear physics and neutrino facilities, to industrial applications employing the technology of radiation detection.

Abstract submission open until June 1st https://indico.cern.ch/event/1380163/

MODE collaboration https://mode-collaboration.github.io/



Fourth MODE Workshop on Differentiable Programming for Experimental Design 23-25 9

23-25 September 2024 Valencia

The workshop aims at bringing together computer scientists and physicists from the HEP, astro-HEP, nuclear, and neutrino physics communities to develop optimized solutions to detector design and experimental measurements

Sessions

Nuclear applications Muography applications Particle Physics applications Medical physics applications Astroparticle physics applications **Computer Science developments** **Scientific Advisory Committee** Atilim Gunes Baydin (University of Oxford) Kyle Cranmer (University of Wisconsin) ulien Donini (Université Clermont Auvergne) Piero Giubilato (Università di Padova) Gian Michele Innocenti (CERN) Michael Kagan (SLAC) Riccardo Rando (Università di Padova) Kazuhiro Terao (SLAC) Andrey Ustyuzhanin (SIT, HSE Univ., NUS) Christoph Weniger (University of Amsterdam)

Keynote Speakers Danilo Rezende DeepMind) Andrea Walther umboldt Universität zu Berlin)

cardo Zecchina versità Bocconi)

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Summary

- Sensitivity to UHE neutrinos can be obtained with in-ice radio detection
- Frequency band: 80-500 MHz
- Mature technology, discovery scale experiment under construction
 - RNO-G (construction 2021 2026)
- Angular resolution:
 - Average ~a few degrees
 - High quality neutrinos can have sub-degree resolution
- Best way forward?: Multimessenger astronomy
 - Spatial and temporal correlation with other messengers (Gravitational Waves, Gamma Rays, Optical/Radio observations)