Workshop on Scientific Use of Machine Learning on Low-Power Devices:

# **Applications and Advanced Topics**

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### Thanks!



Marco Zennaro **ICTP** 

Brian Plancher



Vijay Janapa Reddi Harvard University



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15 Great Speakers!

### **Organizers**

Barnard

College,

Columbia

University

### Thanks!





Harvard John A. Paulson School of Engineering and Applied Sciences







# Opportunities

- 1) Join the TinyML Academic Network: edu@tinyml.org
- 2) Join the Edge Impulse University program:

https://edgeimpulse.com/university

3) Participate in the AI for Good Challenge:

https://aiforgood.itu.int

## Networking

Please use the "ictp-workshop" Discord channel!

Please join Discord by following this link: <u>https://discord.gg/zKWgwhSAEY</u> if you haven't already done so!

We will post news, opportunities, workshops only on Discord.

## Learning and Teaching

If you want to learn more about TinyML: <u>https://tinyMLedu.org/learn</u>



If you want to teach a course on TinyML: <u>https://tinyMLedu.org/teach</u>

ed X	edX tinyML Specialization	Launched 2020- 2022	Everyone	English	English	Course 1-3 Website Course 4 Website All Materials All Colabs Arduino Library
۲	UNIFELIESTI01 TinyML - Machine Learning for Embedding Devices	Jan 2021 - Present	Undergraduate Students	Portuguese	English	2022.1 Website and Materials 2021.2 Website and Materials 2021.1 Website and Materials

### Research

### View Our Research

Explore our Academic Publications.

Lead Organizations	Title	Author(s)	Publication	Date	Links
\$ ₩ (B)	Machine Learning Sensors: A Design Paradigm for the Future of Intelligent Sensors	Pete Warden, Matthew Stewart, Brian Plancher, Sachin Katti, Vijay Janapa Reddi	Communications of the ACM (CACM)	Coming 2023	Webpage Technica Report
<b>(</b>	Coffee Disease Classification at the Edge using Deep Learning	João Vitor Yukio Bordin Yamashita, João Paulo R.R. Leite	Smart Agricultural Technology	August 2023	DOI
in and a second	A TinyML Deep Learning Approach for Indoor Tracking of Assets	Diego Avellaneda, Diego Mendez, Giancarlo Fortino	Sensors	January 2023	DOI
() () ()	On-Device IoT-Based Predictive Maintenance Analytics Model: Comparing TinyLSTM and TinyModel from Edge Impulse	Irene Niyonambaza Mihigo, Marco Zennaro, Alfred Uwitonze, James Rwigema, Marcelo Rovai	Sensors	June 2022	DOI
	Widening Access to Applied Machine Learning with TinyML	Vijay Janapa Reddi, Brian Plancher, Susan Kennedy, Laurence Moroney, Pate Warden, Anart Agarwal, Colby Banbury, Massimo Banzi, Matthew Bennett, Benjamin Brown, Sharad Chitlangia, Radhika Ghosal, Sarah Grafman, Rupert Jaeger, Srivatsan Krishman, Makumilian Lam, Daniel Leiker, Cara Mann, Mark Mazumder, Domine Palak, Dhilan Ramaprasad, J. Evan Smith, Matthew Stewart, Dustin Tindley	Harvard Data Science Review	January 2022	DOI

### https://tinyMLedu.org/research/

### Research

- [DeepPicarMicro]: Applying TinyML to Autonomous Cyber Physical Systems | [pdf]
- Incremental Online Learning Algorithms Comparison for Gesture and Visual Smart Sensors [ [pdf [Protean]: An Energy-Efficient and Heterogeneous Platform for Adaptive and Hardware-Accelerated Battery-free Computing [ [pdf - ]]
- IN-SENSOR & NEUROMORPHIC COMPUTING ARE ALL YOU NEED FOR ENERGY EFFICIENT COMPUTER VISION | [pdf]
- Energy Efficient Hardware Acceleration of Neural Networks with Power-of-Two Quantisation | [pdf]
- Enabling ISP-less Low-Power Computer Vision | [pdf]
- Rethinking Vision Transformers for MobileNet Size and Speed | [pdf]
- Neuromorphic Computing and Sensing in Space | [pdf]
- Joint Data Deepening-and-Prefetching for Energy-Efficient Edge Learning | [pdf]
- PreMa: Predictive Maintenance of Solenoid Valve in Real-Time at Embedded Edge-Level | pdf]

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### 2023

- Exploring Automatic Gym Workouts Recognition Locally On Wearable Resource-Constrained Devices | [pdf]
- [MetaLDC]: Meta Learning of Low-Dimensional Computing Classifiers for Fast On-Device Adaption | [pdf]
- Faster Attention Is What You Need: A Fast Self-Attention Neural Network Backbone Architecture for the Edge
   via Double-Condensing Attention Condensers | [pdf]

https://github.com/gigwegbe/tinyml-papers-and-projects

### Research

≡	Google Scholar	tinyml	
٠	Articles	About 2,050 results (0.03 sec)	
	Any time Since 2023 Since 2022 Since 2019 Custom range	Introduct         <	[HTML] sciencedirect.com
	Sort by relevance Sort by date Any type Review articles	Tinyml-enabled frugal smart objects: Challenges and opportunities         R Sanchez-Iborra, <u>AF Skarmeta</u> - IEEE Circuits and Systems, 2020 - ieeexplore ieee.org         In this work, a comprehensive review of the novel TinyML survey of the available TinyML frameworks for integrating ML To this end, several TinyML frameworks are evaluated and         ☆ Save       勁 Cite       Cited by 139       Related articles	[PDF] ieee.org ACNP Full Text
	<ul> <li>☐ include patents</li> <li>✓ include citations</li> <li>✓ Create alert</li> </ul>	[HTML] TinymI meets iot: A comprehensive survey L Dutta, S Bharali - Internet of Things, 2021 - Elsevier In this article, we introduce the definition of TinyML and provide background information on in TinyML-IoT scenario. Furthermore, it touches on the recent progress in TinyML research in ☆ Save 99 Cite Cited by 60 Related articles All 2 versions	[HTML] sciencedirect.com ACNP Full Text
		Benchmarking tinyml systems: Challenges and direction <u>CR Banbury</u> , VJ Reddi, <u>M Lam</u> , W Fu, A Fazel arXiv preprint arXiv, 2020 - arXiv.org power machine learning (TinyML) hardware promises to unlock TinyML and discuss the challenges and direction towards developing a fair and useful hardware benchmark for TinyML ☆ Save 99 Cite Cited by 174 Related articles All 7 versions ≫	[PDF] arxiv.org

### Certificates

ICTP attendance certificates will be sent as soon as we analyze the Zoom logs.

Participants that have attended >80% of lectures according to Zoom logs.

Contact the workshop secretariat for info/clarifications.



### Breakout rooms

Beginner TinyML and Edge Impulse questions Teaching TinyML Research in TinyML Applications of TinyML

Jeremy and Diego

Brian and Marco