

# **Experiences using TinyML Tools in Teaching Biomedical Engineering**

Msc. Eng. Moises Meza



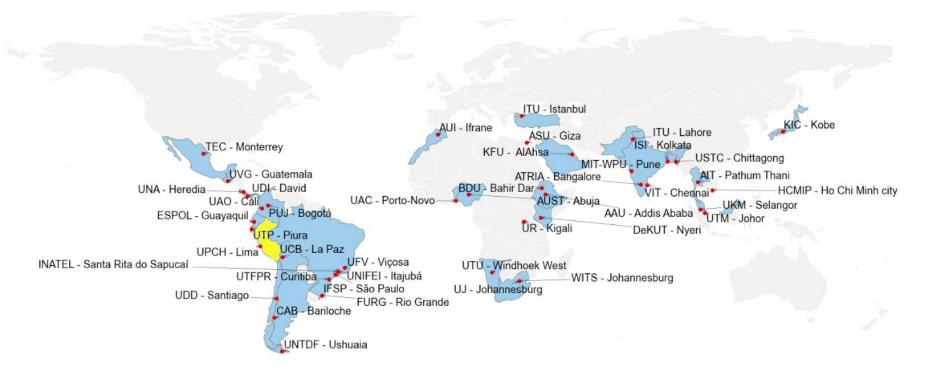








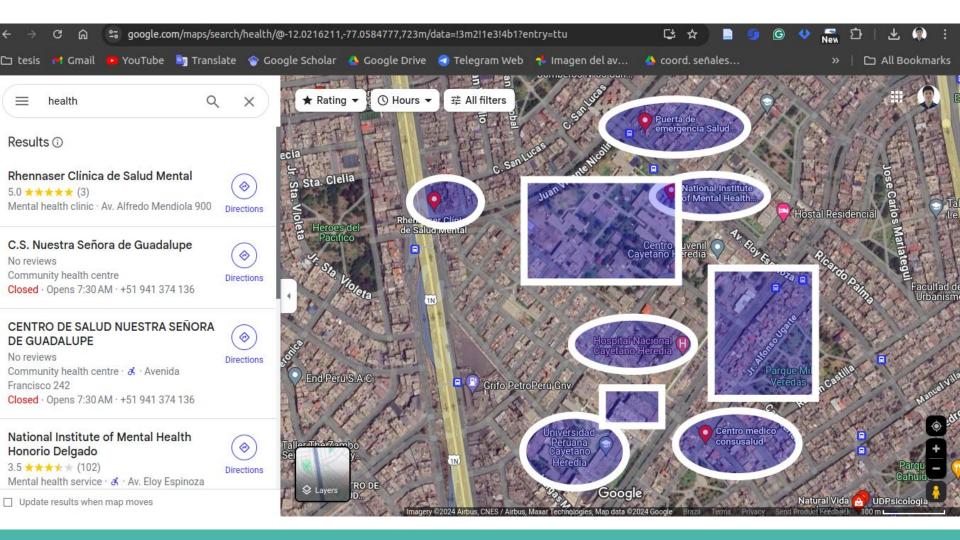












### Seven years ago

### **TRANSFORMANDO**



### LA SALUD EN EL PERÚ





# INGENIERÍA BIOMÉDICA







Ingeniería Industrial



Ingeniería Biomédica



Ingeniería Informática



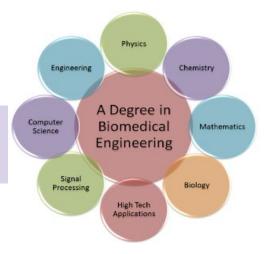
Ingeniería Ambiental

# **Biomedical Engineering**



Biomedical engineering is the branch of engineering that applies principles of engineering to the medical field. It can encompass a wide range of topics, from developing new medical devices to improving healthcare delivery systems.

Competencies required on each student's profile: Analytical skills, Communication skills, advanced mathematics techniques, creativity, programming, and problem-solving skills.

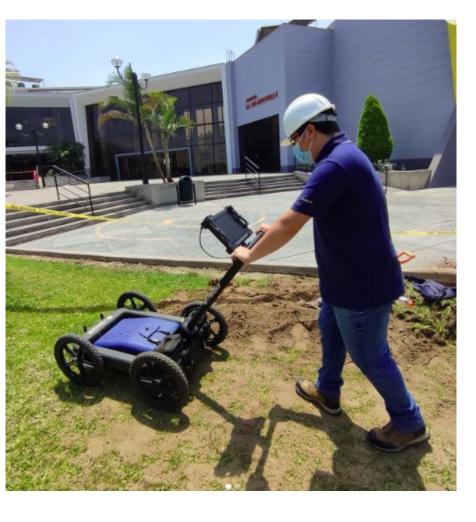


**University!** 

So, here is a little bit about me

before becoming part of Cayetano











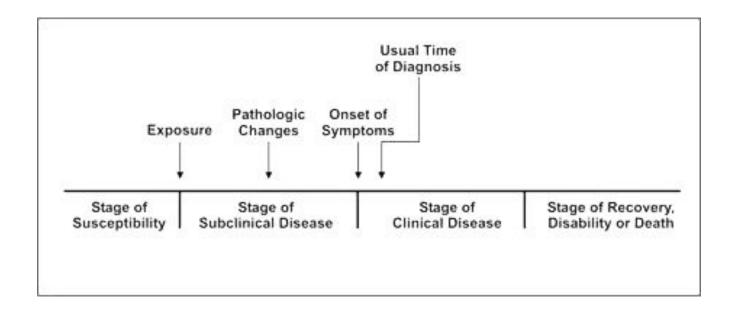


talk about the main topic!

well it was a lot of me, it's time to

#### 6.º CICLO: 1.er CICLO: - Electrónica Básica - Molecular Biology for Engineers Introduction to - Álgebra Matricial y Geometría Analítica - Microbiología y Cultivo Celular - Fundamentos de Mecánica de los Biomateriales - Fundamentos de Cálculo - Digital Signal Processing - Proyectos de Biodiseño I - Fundamentos de Física biomedical signal (ISB) - Introducción a la Ingeniería Biomédica - Comunicación y Redacción - Filosofía 7.º CICLO: - Fisiopatología - Instrumentación Biomédica - Introducción a Señales Biomédicas - Bioestadística - Proyectos de Biosideno II - Mecánica y Transporte de Fluidos 2.º CICLO: - Cálculo Diferencial 8.º CICLO: - Física I - Teoría de Control en Sistemas Biológicos - Laboratorio de Física I - Ingeniería Clínica I - Diseño Industrial - Introduction to Medical Imaging - Química General - Introducción a la Ingeniería de Tejidos - Procesos de Innovación en Bioingeniería - Biomecánica - Pensamiento Cristiano y Realidad Social - Antropología - Modelos de Negocios en Bioingeniería 3.er CICLO: - Cálculo Integral 9.º CICLO: - Física II - Desarrollo Profesional - Ética - Laboratorio de Física II - Ingeniería Clínica II en Bioingeniería II - Fundamentos de Programación - Electivo de Concentración I - Flectivo de Tesis I - Química Orgánica - Electivo de Concentración II - Biología - Desarrollo Profesional en Bioingeniería I 4.º CICLO: - Cálculo Vectorial - Física III - Laboratorio de Física III 10.º CICLO: - Fundamentos de Análisis Instrumental - Desarrollo Profesional en Bioingenieria III **Biodesign** Circuitos Eléctricos - Desarrollo Profesional en Bioingeniería IV - Fundamentos de Biodiseño - Normas y Regulaciones en Bioingeniería **fundamentals** - Electivo de Concentración III - Electivo de Concentración IV 5.º CICLO: - Electivo de Concentración V - Electivo de Concentración VI - Anatomía y Fisiología - Bioquímica - Electivo de Tesis II - Programación Avanzada - Pattern Recognition - Ciencia e Ingeniería de Materiales - Series y Transformadas - Circuitos y Sistemas Digitales **Pattern recognition**

# **Natural history of disease**



# Introduction to biomedical signals

UNIT 1: INTRODUCTION, ACQUISITION AND PHYSIOLOGICAL PRINCIPLES OF BIOMEDICAL SIGNALS

UNIT 2: ECG, EMG, AND EEG ANALYSIS

UNIT 3: INTRODUCTION TO DIGITAL SIGNAL PROCESSING

UNIT 4: BIOMEDICAL COMPUTING AND INTRODUCTION TO ARTIFICIAL INTELLIGENCE IN BIOMEDICAL SIGNALS





#### **METHODOLOGY**

#### TRADITIONAL CLASSROOM





#### **FLIPPED CLASSROOM**







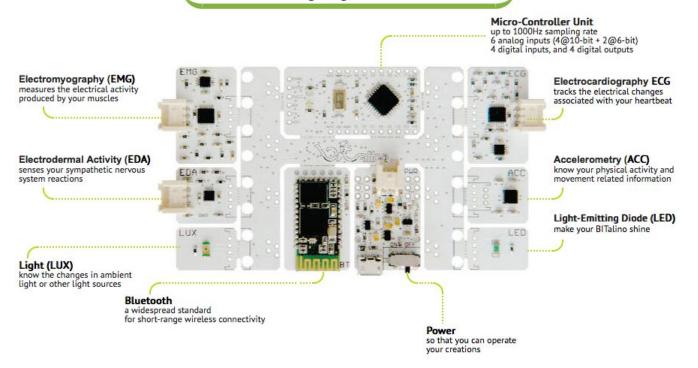
On flipped classrooms, students encounter information before class, freeing class time for activities that involve higher order thinking.

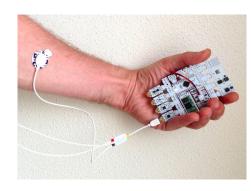
# 1 week before is sent these materials:

- laboratory guide.
- Scientific papers.
- Short videos.
- Manual of use from Bitalino/UltraCortex.



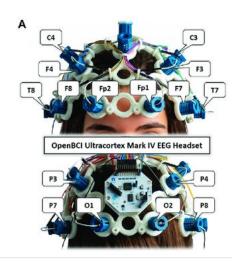
### Anatomy of a Bitalino

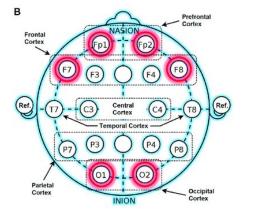










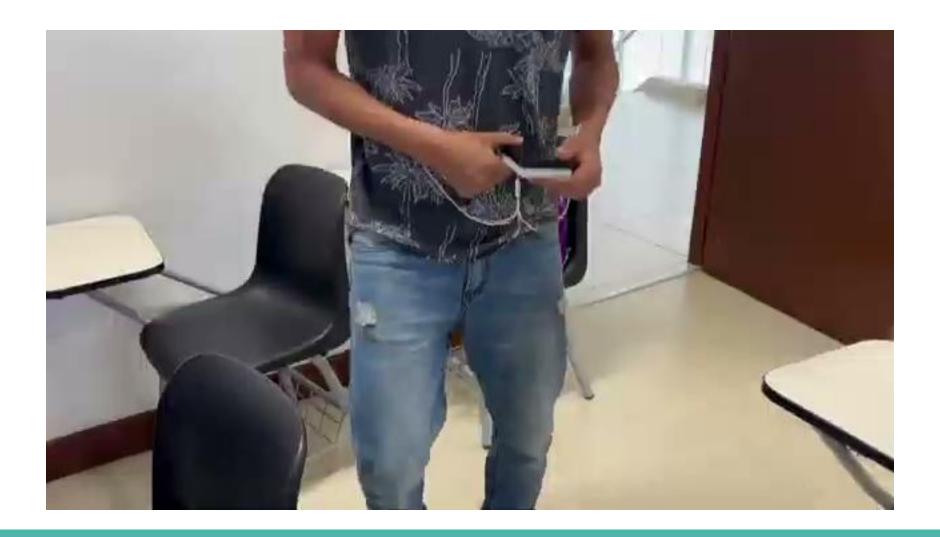




#### Tiny Machine Learning Kit

El Arduino Tiny Machine Learning Kit es una herramienta completa para principiantes interesados en aprender sobre el aprendizaje automático embebido, al incluir desde una placa Arduino hasta una cámara y varios sensores. Con este kit, los usuarios pueden desarrollar proyectos de aprendizaje automático embebido, como detectores de gestos, clasificadores de imágenes o monitores de temperatura.





### Link of courses

https://linktr.ee/csimbio

https://github.com/sofia-is-a-panda/ISB 2024 G3/tree/main/ISB/Laboratorios/Laboratorio%204

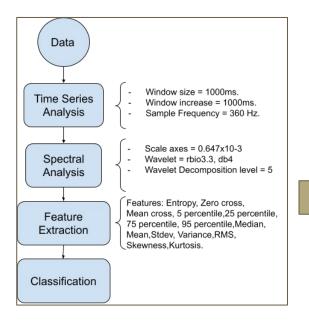
https://github.com/Melanyccb11/Intro\_senales/blob/main/ISB/Laboratorios/3. %20Adquisi%C3%B3n%20de%20Se%C3%B1ales%20EMG/3.%20Adquisi%C3%B3n%20de%20Se%C3%B1ales%20EMG.md

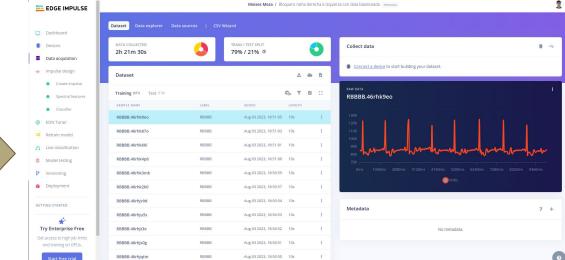
# The Future of ML is Tiny and Bright



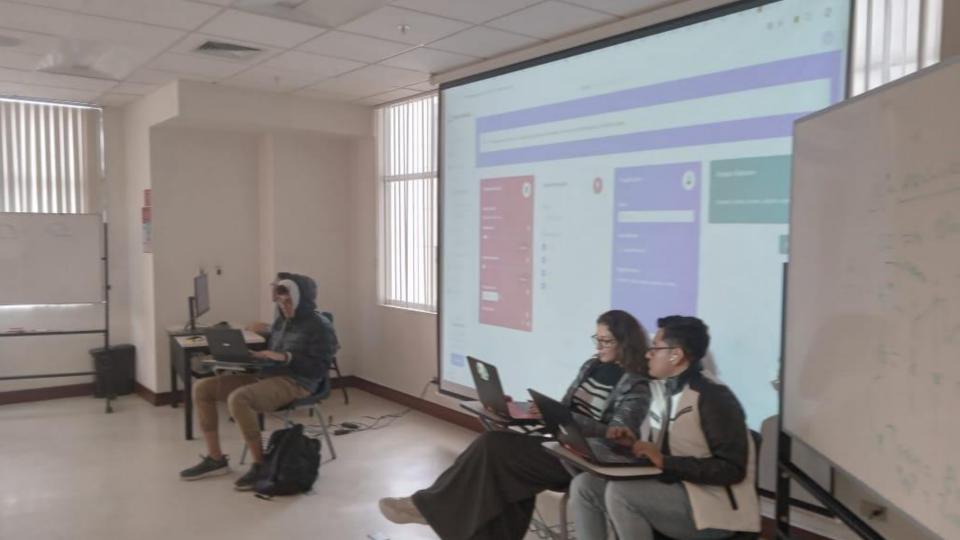


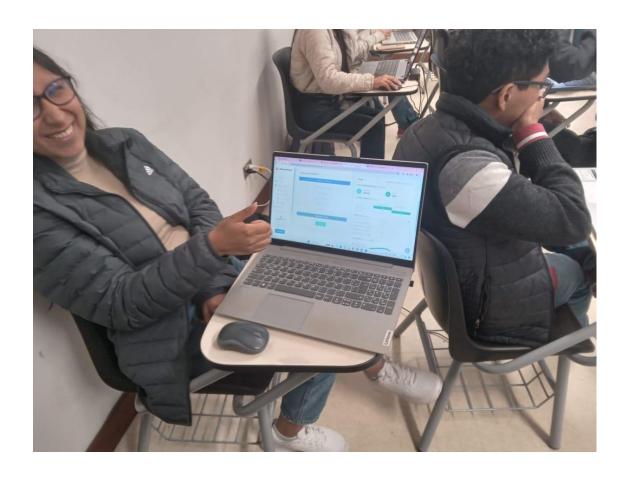
### **Edge impulse**

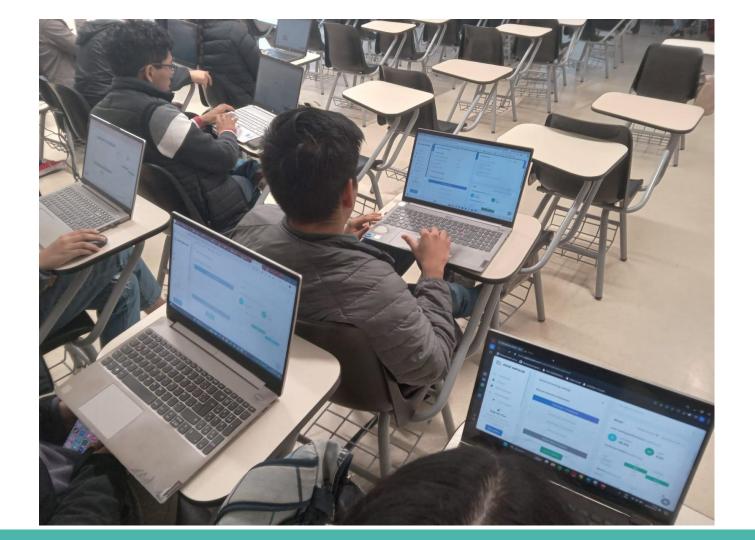




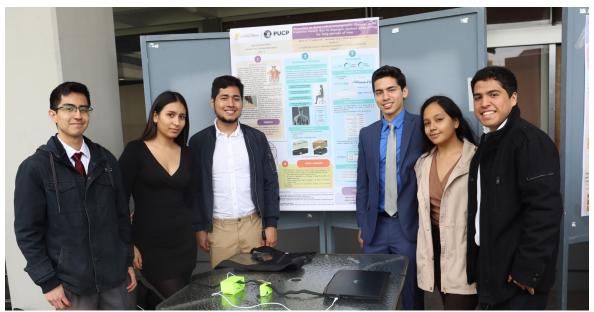




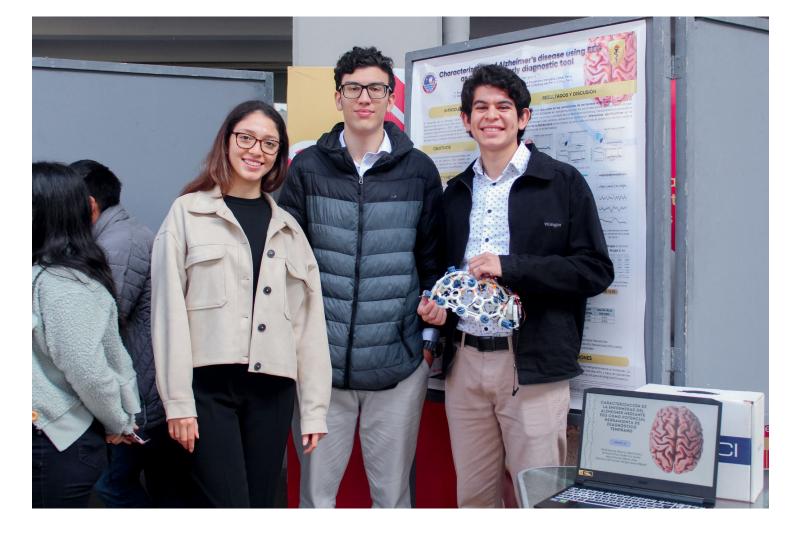


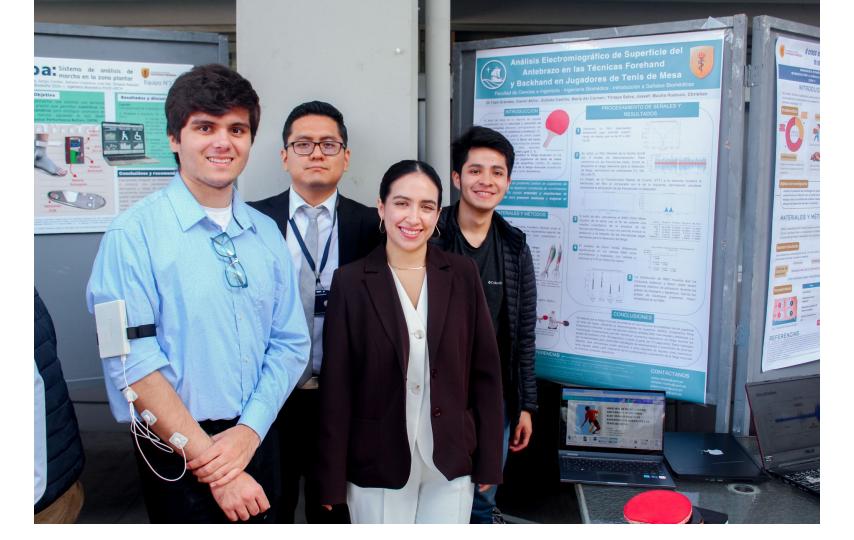












### The didactic experience in a biomedical engineering course at a Peruvian university

Publisher: IEEE

Cite This



Lewis De La Cruz; Moises Meza-Rodriguez; José Alonso Cáceres-DelAguila; Paulo Vela-Anton All Authors

22

Full

**Text Views** 















#### Abstract

I. Introduction

#### **Document Sections**

- II. About the Course "Introduction to Biomedical Signals"
- III. Methodology
- IV. Results
- V. Discussions

Authors

**Figures** 

Keywords

References

▶ ISBN Information:

#### Abstract:

The systematization of the didactic experience, delivered in a university course on the processing of biosignals, becomes relevant for continuous improvement in its subsequent editions. This applies both at the structural level and for enhancing the content of the course, not only in the theoretical aspect but also in practical aspects. The following study describes the experiences under a flipped learning approach obtained from guestionnaires related to the student's perception of the delivery of the course "Introduction to Biomedical Signals", which is part of the biomedical engineering program offered by a Peruvian University during the 2023-I semester from March to July 2023. The course showed an overall evaluation over the average, demonstrating its adequate implementation and satisfaction of students. Qualitative questions captured the perception of students regarding how to improve the course experience as well.

Published in: 2023 IEEE 3rd International Conference on Advanced Learning Technologies on Education & Research

(ICALTER)

I. Introduction

Date of Conference: 13-15 December 2023 DOI: 10.1109/ICALTER61411.2023.10372910

Date Added to IEEE Xplore: 29 December 2023 Publisher: IEEE

Conference Location: Chiclayo, Peru

More Like This

Machine Learning in Nano-Scale

Biomedical Engineering

IEEE Transactions on Molecular, Biological, and Multi-Scale Communications

Published: 2021

Gendered Interests in Electrical.

Computer, and Biomedical

**Engineering: Intersections With** 

Career Outcome Expectations

IEEE Transactions on Education Published: 2018

Show More

NATIONAL ELECTRICAL SAFETY CODE\*(NESC\*)

#### Proceedings of the 2023 IEEE 30th International Conference on Electronics, Electrical Engineering and Computing,

INTERCON 2023 • 2023 • 30th IEEE International Conference on Electronics, Electrical Engineering and Computing,
INTERCON 2023 • Lima • 2 November 2023through 4 November 2023 • Code 194797

# Document type Conference Paper Source type

Conference Proceedings

ISBN

979-835031557-8

DOI

10.1109/INTERCON59652.2023.10326046

View more V

#### Development of an electrocardiographic signal classifier for bundle branch blocks, applying Tiny Machine Learning

Meza-Rodriguez, Moises; De La Cruz, Lewis;

Caceres-Delaguila, Jose Alonso

Save all to author list

<sup>a</sup> Universidad Peruana Cayetano Heredia, Laboratorio de Ingenieria Biomédica, Lima, Peru

Full text options ✓ Export ✓

#### Abstract

Author keywords

Indexed keywords

Sustainable Development Goals 2023

SciVal Topics

Metrics

#### Abstract

cardiovascular diseases are still the pathologies that generate the highest mortality and economic costs globally. In Latin America, low-income populations are the most vulnerable. Singularly, this population has an incidence of endemic diseases that can lead to blocks of the bundle branch of His. The following study seeks to develop a cardiac abnormality detection system using machine learning techniques and microcontrollers with limited resources to benefit populations with limited access to health environments. The Arduino Nano 33 BLE Sense is employed as the hardware platform due to its ARM Cortex M4 processor and support for TensorFlow Lite. An electrocardiogram (ECG) database is processed using oversampling and under-sampling techniques to address class imbalance. Spectral features are extracted using wavelet transforms, and a multilayer neural network is implemented for classification. Two class balancing approaches are compared: oversampling and undersampling. Results indicate notable improvements in the model's ability to identify instances of minority classes with the oversampling approach, while undersampling may lead to information loss. The system's performance is evaluated using key metrics such as precision, recall, and F1-Score. Additionally, computational resources required to implement the model on the Arduino Nano 33 BLE Sense are estimated, with an assessment of Flash and RAM consumption. This analysis is essential to ensure the feasibility of implementation on resource-constrained devices. This work contributes to the advancement of early detection of cardiac anomalies in resource-limited settings, with significant

implications for healthcare in underserved communities and rural areas. © 2023 IEEE.

Scopus:

Set citation alert >

#### Related documents

Embedded Machine Learning: Towards a Low-Cost Intelligent IoT edge

Shumba, A.-T., Montanaro, T., Sergi, I. (2022) 2022 7th International Conference on Smart and Sustainable Technologies, SpliTech 2022

ECG-based identification and classification of myocardial infarction | 基于心电图的心肌梗死识别分类研究

Wang, X., Qi, M., Xu, H. (2022) Chinese Journal of Medical Physics

Inter-patient congestive heart failure automatic recognition using attentionbased multi-scale convolutional neural network

Sun, M., Si, Y., Yang, W.
(2023) Measurement: Journal of the
International Measurement Confederation

View all related documents based on references

Find more related documents in Scopus based on:

Authors > Keywords >

#### UNIVERSIDAD PERUANA CAYETANO HEREDIA FACULTAD DE CIENCIAS E INGENIERÍA



MANUAL DE USUARIO DEL SOFTWARE "BitaConnectino"

#### Fabricante:

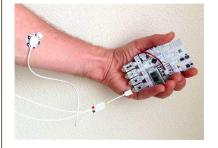
Roberto Edu Joao Marin Vera Moises Stevend Meza Rodriguez

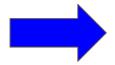
Fecha de revisión del manual del usuario:

10/04/2024

Lima - Perú

2024

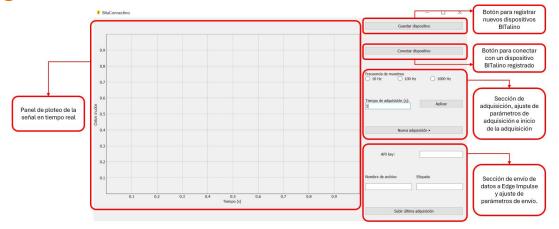




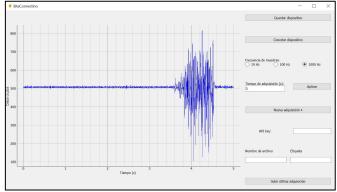


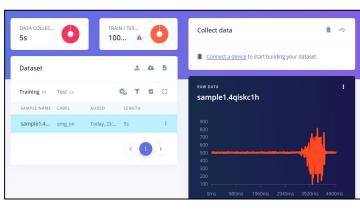
BitaConnectino

# **BitaConnectino**









# What's more?



Estudiantes de la carrera de Ingeniería Biomédica PUCP-UPCH expusieron su proyecto de curso en evento del TinyML4D, red académica internacional a la cual Cayetano pertenece

**#SOYCAYETANO** 



Shout out to one of the latest additions to our University Program, @cayetanoheredia! Excited to get @arduino TinyML Kits and Edge Impulse tools in front of more students as they embark on their embedded ML journeys.

Show more













# TinyML4D Show and Tell

The TinymML4D Academic Network Show and Tell is an opportunity for students from around the globe to share all of your exciting TinyML projects!

Date	Topics	
March 28th, 2024	Enhancing poultry health management through Tiny machine learning-based analysis of bird sounds by Abdul Moshen, Abdul Aziz, Saleh Jabe, Abdul Rahman, Ramasamy of King Faisal University, Saudi Arabia     Advancing TinyMLOps: Robust Model Updates in the Internet of Intelligent Vehicles by Thommas Kevin Sales Flores of Federal University of Rio Grande do Norte Brazil	1
Feb 29th, 2024	Revolutionizing Bee Keeping by Rahul Mangharam of University of Pennsylvania, USA     Artficial Visual Aid for the Blind by Collins Bett of Multimedia University of Kenya     TinyML and lung sound disease detection by Abadade Youssef of IBN Totail University Morocco	
October 26th, 2023	ML self driving RC car by William, Andrew of <u>GearbotsBC STEM Academy</u> Spiking Perception and processing for Intelligent Detection of Pedestrians on urban Roads by Cristian Axenie of Nuremberg Institute of Technology, Germany	
September 28th, 2023	LoRa interactions with the SeedStudio LoRa module Grove-Wio-E5 ready for ML Data Transfer by Andres Oliva Trevisan of Argentina, Instituto Balseiro and ICTP     TinyML model for fault classification of solar photovoltaic modules by Adel Mellit of University of Jijel, Algeria	2
August 31th, 2023	Innovative Waste Classification through Tiny Machine Learning Recognition Approach by Juan Manuel Mena Carrillo of Universidad Peruana Cayetano Heredia, Peru     An Al powered device that detects seizures and alerts caretakers in real time by Nickson Kiprotich of Dedan Kimathi University of Technology, Kenya     Deploying a fetal heart rate classification model on RP2040 Microcontroller by Shahzaib Ali of National Universit of Science and Technology, Pakistan	1
May 25, 2023	Inference With TinyML On Ghana Radio Astronomy Observatory (GRAO) 32-m Antenna: Track Level Profile Anomaly for Predictive Maintenance by Joseph Akubire Kojo of Ghana     A Multiply-And-Max/min Neuron Paradigm for Aggressively Prunable Deep Neural Networks by Philippe BICH of Italy	,
March 30, 2023	Automation of Coloring Process in Fashion Design Using Arduino Color Sensor by Fatmaliza Zaki Abdad, Syafiga Arinda of Sampoerna University, Indonesia     Anomaly detection for faulty motor using the arduino board Nano 33 BLE sense by Hilal Al-Libawy of University of Babylon, Iraq     Babylon, Iraq     First Time TinyML Experience by Edwin Marte of Universidad Tecnologica de Santiage, Dominican Republic     Voice Activated LED Voice control lighting by Muhammad Annas Zahid of Usman Institute of Technology University, Pakistan	7
February 23, 2023	Artificial Intelligence in Point-of-Care Medical Equipment by Hellen Cristina Ancelmo of Instituto Carlos Chagas & Universidade Tecnológica Federal do Paraná. Brazil     Weep Scope: Recognizing the Unique Cries of Infants by Gohel Amit Chandrakantbhai of Gujarat Technological University, India     Crops Disease Detection with TinyML by James Adeola of Université d'Abomey Calavi, Benin     Implementation of Deep Learning on a Chick Counter by Muhammad Suzaki Zahran of Universitas Raharja, Indonesia     Identification of Cashew Nut Diseases using TinyML by Dr. Bala Murugan MS of Vellore Institute of Technology, India	2
January 26,	Personal Trainer by Ricardo Magno do Carmo Junior of <u>Universidade Federal de Itajubá (UNIFEI). Brazil</u> Irrigation prediction for crops using machine learning at the edge by Carlos Rodríguez of <u>Pontificia Universidad Javeriana</u> , <u>Colombia</u>	,

3. EYE TO EYE: non-invasive anemia detector using machine learning by Kimberly Cristel Soto Concha of Universidad

4. Estimating the shelf life of date palm fruit using TinyML by Abdulrahman Fayez of King Faisal University Saudi Arabia

**Recordings of Past Show and Tells** 

2023







No objects detected

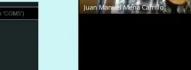


#### Message (Enter to send message to 'Al Thinker ESP32-CAM' on 'COM5')

> BBox of label bottle at (8, 16), size 8 x 16

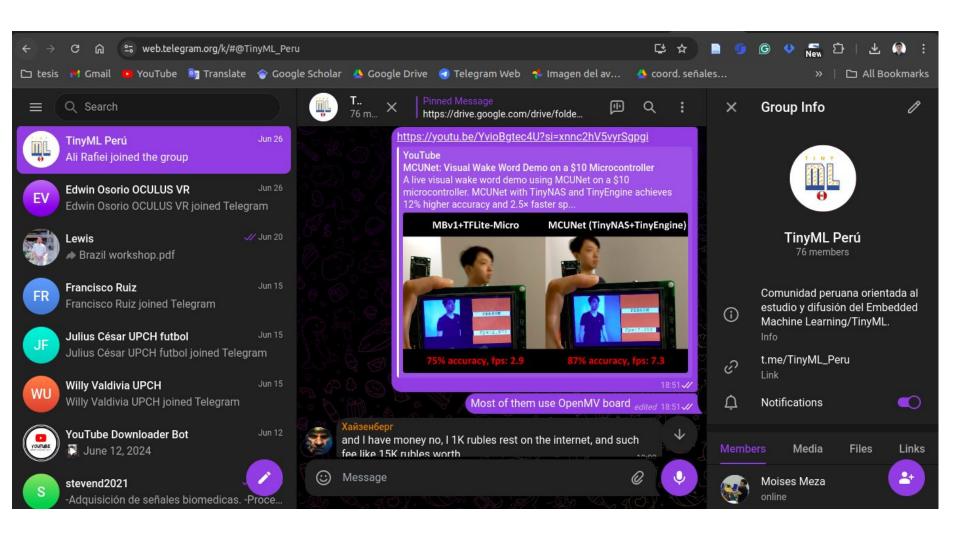
> BBox of label bottle at (8, 16), size 8 x 16 Found 1 objects in 188 millis

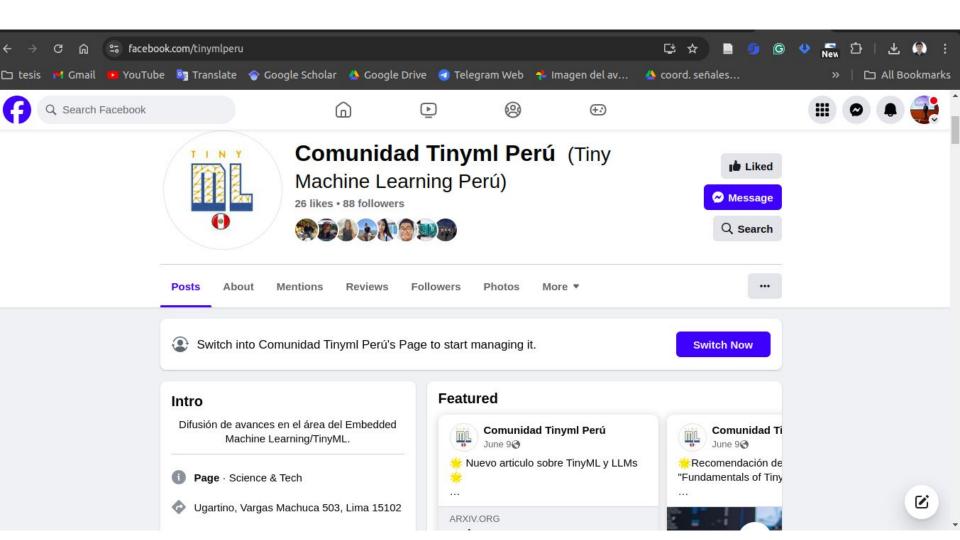
> BBox of label bottle at (8, 16), size 8 x 16







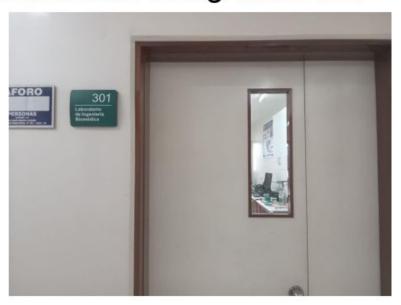




# **SPECIAL THANKS**



## Laboratorio de ing. Biomédica







# THANKS