# SciTinyML

Scientific Use of Machine Learning on Low Power Devices

# **Regional Workshop - Africa**

# Arduino Nano-33 BLE Sense El set-up and Getting Started with Edge Impulse

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# Arduino Nano-33 BLE Set up board and Arduino IDE



# Nano 33 BLE Sense (Development board)



# Installing the Hardware



## Installing the Arduino IDE





Close

## Installing the Main Libraries









# Set up connection between Arduino Nano and Edge Impulse



### EDGE IMPULSE

### Log in

	rovai@mjrobot.org			
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## 

Start building embedded machine learning models today.

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## **El/Arduino** CLI

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🔁 EDGE IMPULSE	Guides API Reference Forum Q Search
Getting Started API and SDK references	Arduino Nano 33 BLE Sense
What is embedded ML, anyway? Frequently asked questions DEVELOPMENT BOARDS	The Arduino Nano 33 BLE Sense is a tiny development board with a Cortex-M4 microcontroller, motion sensors, a microphone and BLE - and it's fully supported by Edge Impulse. You'll be able to sample raw data, build models, and deploy trained machine learning models directly from the studio. It's available for around 30 USD from Arduino and a wide range of distributors.
Overview ST B-L475E-IOT01A	You can also use the Arduino Tiny Machine Learning Kit to run image classification models on the edge with the Arduino Nano and attached OV7675 camera module (or connect the hardware together via jumper wire and a breadboard if purchased separately).
Arduino Nano 33 BLE Sense Arduino Portenta H7 + Vision Shield Open MV Cam H7 Plus Himax WE-I Plus Nordic Semi nRF52840 DK Nordic Semi nRF5340 DK	The Edge Impulse firmware for this development board is open source and hosted on GitHub: edgeimpulse/firmware-arduino-nano-33-ble-sense. (Note that the 1. Edge Impulse CLI is not necessary for Arduino Nano-33. We will use WebUSB insteady)
Nordic Semi nRF9160 DK Nordic Semi Thingy:91 SiLabs Thunderboard Sense 2 Sony's Spresense Syntiant Tiny ML Board TI CC1352P Launchpad	Go to 2. Arduino CLI
Raspberry Pi 4 Raspberry Pi RP2040	Installing dependencies
NVIDIA Jetson Nano Intel Based Macs	To set this device up in Edge Impulse, you will need to install the following software:
Linux x86_64	1. Edge Impulse CLI.       2. Arduino CLI.
Powered By GitBook	<ul> <li>Here's an instruction video for Windows.</li> <li>The Arduino website has instructions for macOS and Linux.</li> </ul>

## **Arduino CLI**



See this video for Windows installation: https://www.youtube.com/watch?v=1jMWsFER-Bc

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$\leftarrow$ $\rightarrow$ C ( docs.edgeimpulse.com/d	ocs/development-boards/arduino-nano-33-ble-sense	🖞 🖈 🗖 👼 🗄			
	Guides API Reference Forum	Q Search			
Getting Started API and SDK references What is embedded ML, anyway?	1. Connect the development board to your computer         Use a micro-USB cable to connect the development board to your computer. The launch into the bootloader. The on-board LED should start pulsating to indicate	Then press RESET twice to e this.			
Frequently asked questions		Name  arduino-nano-33-ble-sense			
Overview ST B-I 475E-IOT01A	A state of the sta	flash_mac.command			
Arduino Nano 33 BLE Sense		flash_linux.sh arduino-nano-33-ble-sense.ino.bin			
Arduino Portenta H7 + Vision Shield	Press RESET twice quickly to launch the bootloader on the Arduino Nano 33 BLE Sense.	I arduino-nano-33-ble-sense.zip			
Open MV Cam H7 Plus Himax WE-I Plus	2. Update the firmware				
Nordic Semi nRF52840 DK	The development board does not come with the right firmware yet. To update	the firmware:			
Nordic Semi nRF5340 DK	1. Download the latest Edge Impulse firmware, and unzip the file.				
Nordic Semi nRF9160 DK	<ol> <li>Open the flash script for your operating system (flash_windows.bat, flash_mac.command or flash linux.sh) to flash the firmware.</li> </ol>				
Nordic Semi Thingy:91	3. Wait until flashing is complete, and press the RESET button once to launch the new firmware.				
SiLabs Thunderboard Sense 2					
Sony's Spresense	3. Setting keys				
Syntiant Tiny ML Board	From a command prompt or terminal, run:				
Powered By GitBook					



## Windows 10

### Prompt de Comando Microsoft Windows [versão 10.0.19041.1052] (c) Microsoft Corporation. Todos os direitos reservados. C:\Users\GUILH>arduino-cli Arduino Command Line Interface (arduino-cli). Usage: arduino-cli [command] 1. Press Nano-33 Reset button Twice 2. With Nano-33 LED Flashing: Examples: arduino-cli <command> [flags...] Name Available Commands: board Arduino board commands. burn-bootloader Upload the bootloader. Arduino cache commands. cache compile Compiles Arduino sketches. completion Generates completion scripts config Arduino configuration commands. Arduino core operations. core Run as a daemon on port 50051 daemon debug Debug Arduino sketches. help Help about any command lib Arduino commands about libraries. Lists cores and libraries that can be upgraded outdated sketch Arduino CLI sketch commands. Updates the index of cores and libraries update upgrade Upgrades installed cores and libraries. upload Upload Arduino sketches. Shows version number of Arduino CLI. version

X

### arduino-nano-33-ble-sense flash mac.command flash windows.bat 🖽 Hash Ilhux.sh arduino-nano-33-ble-sense.ino.bin arduino-nano-33-ble-sense.zip

### Windows 10

C:\WINDOWS\system32\cmd.exe	<u> 1997</u>		X	
		770.45		
Finding Arduino Mbed core			$\sim$	
arduino:mbed_nano 2.0.0 2.0.0 Arduino Mbed OS Nano Boards				
Finding Arduino Mbed core OK				
Finding Arduino Nano 33 BLE				
Finding Arduino Nano 33 BLE OK at COM11				
arduino:mbed_nano 2.0.0 2.0.0 Arduino Mbed OS Nano Boards				
Device : nRF52840-QIAA				
Version : Arduino Bootloader (SAM-BA extended) 2.0 [Arduino:IKXYZ]				
Address : 0x0				
Pages : 256				
Page Size : 4096 bytes				
Total Size : 1024KB				
Planes : 1				
Lock Regions : 0				
Locked : none				
Security : false				
'Erase flash				
Dono in 0.002 cocondo				
Unite F3F440 butes to flash (120 pages)				
White 525440 bytes to flash (129 pages)				
$\square$ Nano-33 LED Stop Flashing				
Done in 22.290 Seconds				
Flashed your Arduino Nano 33 BLE development board				
To set up your development with Edge Impulse, run edge-impulse-daemon				
no run your impulse on your development board, run edge-impulse-run-impulse				
Pressione qualquer tecla para continuar				

# Thanks







# Addendum: Using Edge Impulse CLI

### EDGE IMPULSE Home API Reference

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Q Search

DOCUMENTATION

Getting Started API and SDK references What is embedded ML, anyway? Frequently asked questions

#### **DEVELOPMENT BOARDS**

Overview ST B-L475E-IOT01A Arduino Nano 33 BLE Sense Eta Compute ECM3532 Al Sensor Eta Compute ECM3532 AI Vision OpenMV Cam H7 Plus Himax WE-I Plus Nordic Semi nRF52840 DK Nordic Semi nRF5340 DK SiLabs Thunderboard Sense 2 Sony's Spresense Arduino Portenta H7 + Vision shield (preview) Raspberry Pi 4 **NVIDIA Jetson Nano** Mobile phone Porting guide

### COMMUNITY BOARDS

Seeed Wio Terminal Agora Product Development Kit

EDGE IMPULSE FOR LINUX

### Installation

### Edge Impulse CLI optional Installation

This Edge Impulse CLI is used to control local devices, act as a proxy to synchronise data for devices that don't have an internet connection, and to upload and convert local files. The CLI consists of seven tools:

- edge-impulse-daemon configures devices over serial, and acts as a proxy for devices that do not have an IP connection.
- edge-impulse-uploader allows uploading and signing local files.
- <u>edge-impulse-data-forwarder</u> a very easy way to collect data from any device over a serial connection, and forward the data to Edge Impulse.
- edge-impulse-run-impulse show the impulse running on your device.
- edge-impulse-blocks create organizational transformation blocks.
- <u>eta-flash-tool</u> to flash the Eta Compute ECM3532 AI Sensor.
- <u>himax-flash-tool</u> to flash the Himax WE-I Plus.

Connect to devices without the CLI? Recent versions of Google Chrome and Microsoft Edge can connect directly to fullysupported development boards, without the CLI. See this blog post for more information.



Installation - Linux/Ubuntu and Raspbian OS

### EDGE IMPULSE Home API Reference

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Installation - macOS and Windows

1. Install Python 3 on your host computer.

2. Install Node.js v14 or higher on your host computer.

 For Windows users, install the Additional Node.js tools when prompted. You may skip this setup if you have Visual Studio 2015 or more.

Install the CLI tools via:

npm install -g edge-impulse-cli --force

You should now have the tools available in your PATH.

Installation - Linux/Ubuntu and Raspbian OS

## Alternative Data Capture using El CLI: \$ edge-impulse-data-forwarder

	Capture_Ardu33_Sense_IMU_Acc   Arduino 1.8.16							
00								
Cap	Capture_Ardu33_Sense_IMU_Acc							
1	1 #include <arduino lsm9ds1.h=""></arduino>							
2	2							
3	3 #define CONVERT G TO MS2 9.80665f							
4	4 #define FREQUENCY HZ 100							
5	5 #define INTERVAL MS (1000 / (FREQUENCY HZ + 1))							
6								
7⊡	void setup() {							
8	Serial.begin(9600):							
9	while (!Serial):							
10	<pre>Serial.println("Started");</pre>							
11								
12 🗉	if (!IMU.begin()) {							
13	<pre>Serial.println("Failed to initialize IMU!");</pre>							
14	while (1);							
15	a constant of the second se							
16	}							
17								
18	void loop() {							
19	<pre>static unsigned long last_interval_ms = 0;</pre>							
20	float x, y, z;							
21								
22 🗉	if (millis() > last_interval_ms + INTERVAL_MS) {							
23	<pre>last_interval_ms = millis();</pre>							
24								
25	IMU.readAcceleration(x, y, z);							
26								
27	<pre>Serial.print(x * CONVERT_G_TO_MS2);</pre>							
28	<pre>Serial.print(',');</pre>							
29	<pre>Serial.print(y * CONVERT_G_TO_MS2);</pre>							
30	<pre>Serial.print(',');</pre>							
31	<pre>Serial.println(z * CONVERT_G_TO_MS2);</pre>							
32	} III III III III IIII IIII							
33	}							
	0							

Arduino Nano 33 BLE on /dev/cu.usbmodem145101

### 🖲 😑 👕 mirovai — node /usr/local/bin/edge-impulse-data-forwarder — 72×42 Last login: Thu Nov 4 19:04:50 on ttys000 You have new mail. The default interactive shell is now zsh. To update your account to use zsh, please run `chsh -s /bin/zsh`. For more details, please visit https://support.apple.com/kb/HT208050. [(base) MacBook-Pro-de-Marcelo:~ mjrovai\$ edge-impulse-data-forwarde Edge Impulse data forwarder VI.13.16 Endpoints: Websocket: wss://remote-mgmt.edgeimpulse.com API: https://studio.edgeimpulse.com/v1 Ingestion: https://ingestion.edgeimpulse.com [SER] Connecting to /dev/tty.usbmodem145101 [SER] Serial is connected (4A:5A:36:17:55:F9:70:F7) [WS ] Connecting to wss://remote-mgmt.edgeimpulse.com [WS ] Connected to wss://remote-mgmt.edgeimpulse.com To which project do you want to connect this device? MJRoBot (Marcelo Rovai) / IESTI01 - Covid-19: Detection by Cough MJRoBot (Marcelo Rovai) / TinyML Kit Camera test MJRoBot (Marcelo Rovai) / Harvard - Person Detection MJRoBot (Marcelo Rovai) / Wio - Gesture Recognition MJRoBot (Marcelo Rovai) / Cifar10 Image Classification MJRoBot (Marcelo Rovai) / Bean Disease Classifier MJRoBot (Marcelo Rovai) / SciTinyML-Motion-Anomaly-Project MJRoBot (Marcelo Rovai) / 1-Hands-On-SciTinyML-Motion-Project MJRoBot (Marcelo Rovai) / ESP32-Motion-Classification MIRoBot (Marcelo Rovai) / ESP32\_KWS\_Project > MJRoBot (Marcelo Rovai) / IESTI01 - Nano Motion Classification MJRoBot (Marcelo Rovai) / Motion-Project MJRoBot (Marcelo Rovai) / Blender - Motion Detection MJRoBot (Marcelo Rovai) / Key Word Spotting MJRoBot (Marcelo Rovai) / Oi Rovis Key Word Spotting MJRoBot (Marcelo Rovai) / Sound-Classification-Blender-Faucet MJRoBot (Marcelo Rovai) / oi rovis kws MJRoBot (Marcelo Rovai) / Eggs AI MJRoBot (Marcelo Rovai) / Accelerometer-Nano-Ble-IoT MJRoBot (Marcelo Rovai) / video tinyml raw

🖲 🔘 🕐 mjrovai — node /usr/local/bin/edge-impulse-data-forwarder — 117×26	
(base) MacBook-Pro-de-Marcelo:~ mjrovai\$	
base) MacBook-Pro-de-Marcelo:~ mjrovai\$	
base) MacBook-Pro-de-Marcelo:~ mjrovai\$ edge-impulse-data-forwarder	16
dge Impulse data forwarder v1.13.16	1
indpoints:	1
Websocket: wss://remote-mgmt.edgeimpulse.com	1
API: https://studio.edgeimpulse.com/v1	
Ingestion: https://ingestion.edgeimpulse.com	
[SER] Connecting to /dev/tty.usbmodem145101	
SER] Serial is connected (4A:5A:36:17:55:F9:70:F7)	
WS ] Connecting to wss://remote-mgmt.edgeimpulse.com	
WS ] Connected to wss://remote-mgmt.edgeimpulse.com	
To which project do you want to connect this device? MJRoBot (Marcelo	
kovai) / IESTI01 - Nano Motion Classification	
SER] Detecting data frequency	
SER] Detected data frequency: 100Hz 🥄	
3 sensor axes detected (example values: [-θ.13,-θ.34,9.81]). What do y	
w want to call them? Separate the names with ', '; accX, accY, accZ	
What name do you want to give this device? Nano	
WS J Device "Nano" is now connected to project TESTIOL - Nano Motion Llassification"	
as j oo to nitps://studio.eugeimpulse.com/studio/61545/acquisition/training to build your machine learning model	
	1000

Devices - IESTI01 - Nano Motic × +							
$\leftarrow \rightarrow C$ $\triangleq$ studio.ed	lgeimpulse.com/studio/61345/devices					९ 🕁 👼 :	
🚬 EDGE IMPULSE	DEVICES (IESTI01 - NANO MOTION CLASSIFICATION)					MJRoBot (Marcelo Rovai)	
Dashboard	Your devices					+ Connect a new device	
Devices	These are devices that are connected to the Edge Im	npulse remote management API, or have posted da	ta to the ingestion SDK.				
Data acquisition	NAME	a	түре	SENSORS	REMOTE M LAST SEEN		
<ul> <li>Create impulse</li> </ul>	Nano C	4A:5A:36:17:55:F9:70:F7	DATA_FORWARDER	Sensor with 3 axes (accX, accY, accZ)	• Today, 12:42:15	I	
<ul> <li>EON Tuner</li> <li>Retrain model</li> </ul>	36:17:55:F9:70:F7	36:17:55:F9:70:F7	ARDUINO_NANO33BLE	Built-in accelerometer, Built-in microph	• Today, 12:26:49	Ť,	
<ul> <li>Live classification</li> <li>Model testing</li> </ul>	© 2021 EdgeImpulse Inc. All rights reserved						
2 Versioning							
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GETTING STARTED							
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