

# SMARTHEP

REAL-TIME ANALYSIS FOR  
SCIENCE AND INDUSTRY

## Mid-term Check

**ESR1: Machine learning and Real-Time Analysis for Higgs boson measurements and fleet safety**

CERN, 9 January 2023

Patin Inkaew



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# About me

**Name:** Patin Inkaew

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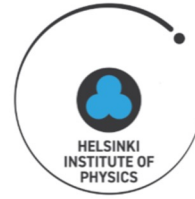
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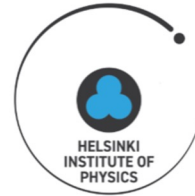
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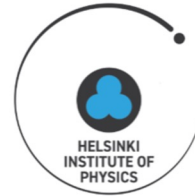
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but not much experience with particle physics analysis



# **ESR1: Machine learning and Real-Time Analysis for Higgs boson measurements and fleet safety**



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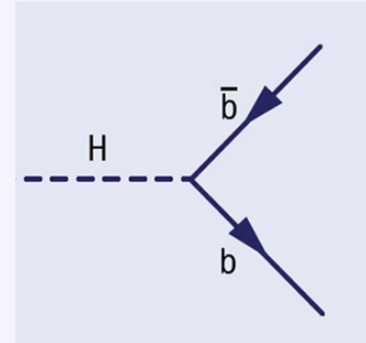


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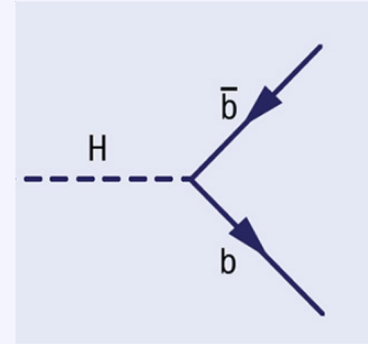
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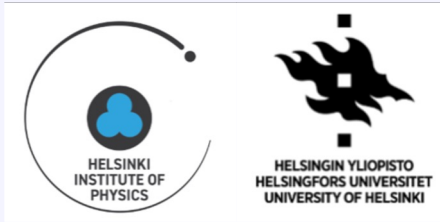


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  - Real-time analysis can improve data acquisition rate in trigger system
  - Validated with frequent and well-studied  $Z \rightarrow bb$



# ESR1: Machine learning and Real-Time Analysis for Higgs boson measurements and fleet safety



**PhD:**  
University of Helsinki (UH) &  
Helsinki Institute of Physics (HIP),  
Finland

**Secondment:**  
CERN, Switzerland

**Secondment:**  
Verizon Connect, Italy

**Supervisors:**  
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**Collaborators:**  
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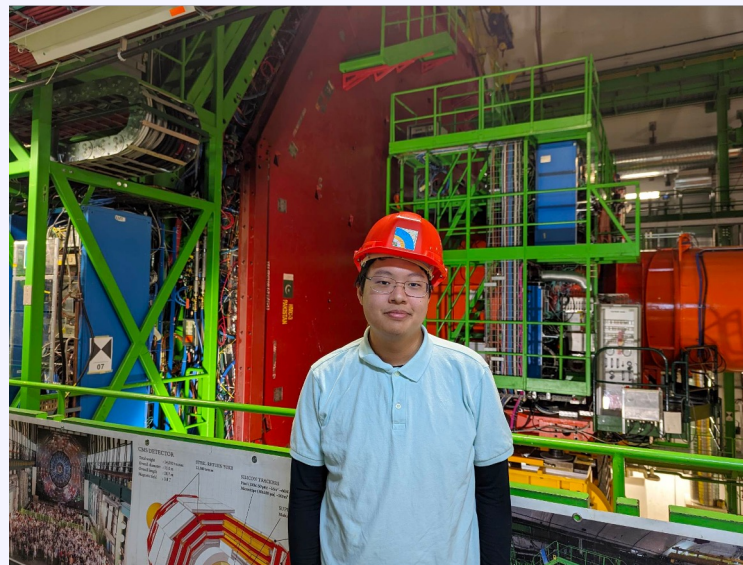


# The Compact Muon Solenoid Experiment (CMS)



CMS is a general-purpose detector,  
one of the four large experiments at LHC.

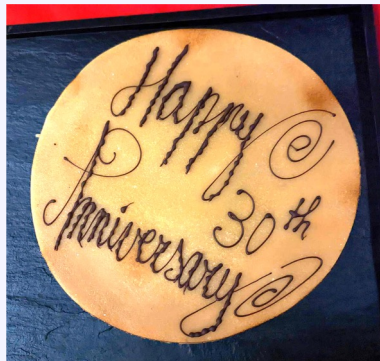
Focus: rare event search, precise  
measurement



CMS Experimental Cavern during  
current technical stop!



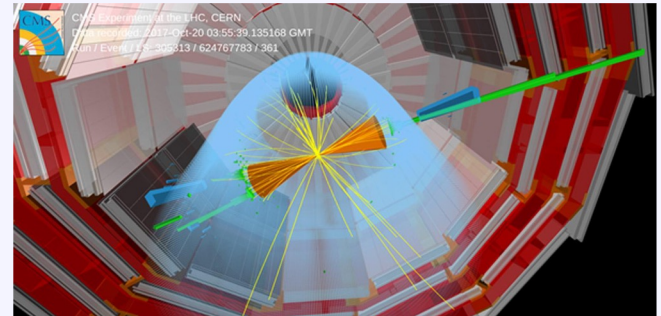
# CMS 30th anniversary!





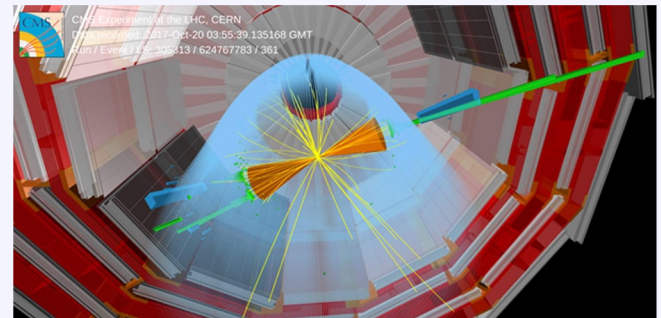
# Project Goals

- Understand the resource cost of ML architectures and adapt them for real-time analysis and resource-constrained environments



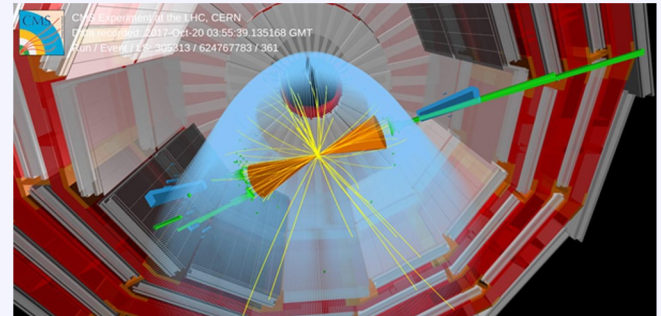
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- Develop general purpose RTA stream processing ML-based algorithms for Run 3 and extend the capabilities for HL-LHC
- Develop real-time image processing in resource-constrained environment from embedded devices on vehicle at VERIZON



# ESR1: Project Updates

## Studies on online (HLT) vs. offline jet energy correction at the CMS

### Background

- **Jets** are signatures of quarks (incl.  $b$ ) and gluons, but generally, anything can become jets (incl.  $t$ ,  $H$ ) → want to study more interesting physics!



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- Jet reconstruction is still challenging task during triggering. Many upgrades are planned, e.g. tracking and pileup mitigation at trigger



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- Jet reconstruction is still challenging task during triggering. Many upgrades are planned, e.g. tracking and pileup mitigation at trigger
- How can we transfer knowledge / information between online (HLT) and offline jet reconstruction?

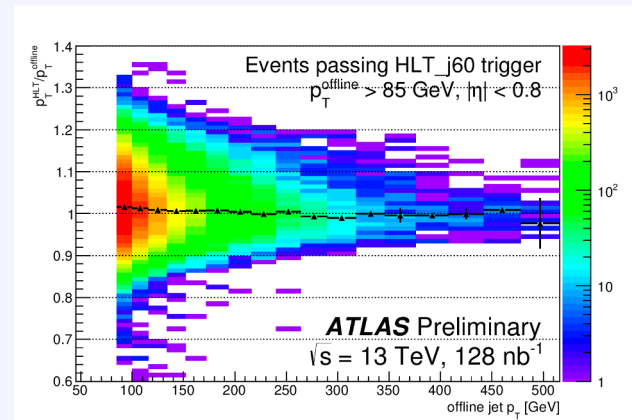


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## Studies on online (HLT) vs. offline jet energy correction at the CMS

### Methods and Results

- Starting project to get used to analysis environment
- Analysis code in python: scikit-hep (e.g. uproot, awkward) and coffea
- Study effects of
  - trigger cut
  - tag and probe
  - different levels of Jet Energy Correction (JEC)
- Run 3 data (currently private...)
- Example plot and fit:
  - HLT pt vs offline pt correlation
  - HLT/offline response vs offline pt





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## Conferences

- CMS Week (5-9 Dec 2022)
- Spåtind 27th Nordic Conference on Particle Physics (3-8 Jan 2023): [link](#)
  - see my talk on the current project



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## Workshops / Trainings

- LPC HATs: Hand-on Advanced Training, LHC Physics Center (FermiLab)
- CMS Data Analysis School (following last year)
- CMS Open Data Workshop → CMSSW
- Other CMS-related workshops: PPD workshop, HLT workshop
- CMS shift: Technical Shifter (plan to take shifts in summer 2023)



# Career expectation

## Academia

- Particle physics + Computer science: develop computational tools for particle physics research
- Collaboration: CMS group in Finland and Thailand
- University Professor: love teaching
- Or scientist in scientific institutions, e.g. CERN

## Industry

- Software engineer? Machine Learning? Computer Vision? Computer Graphics?
- Quant?

