



Facing the challenges of the reconstruction in High-Granularity Calorimeters

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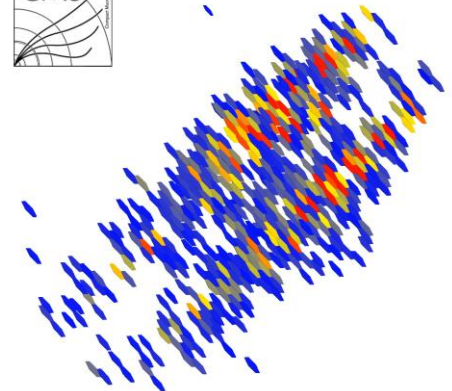
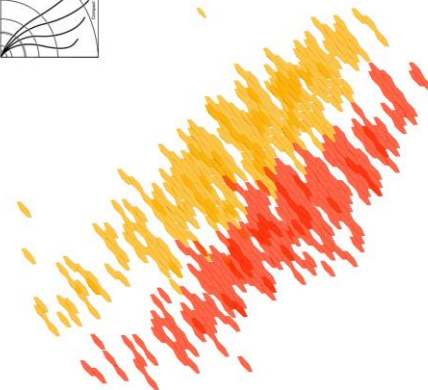
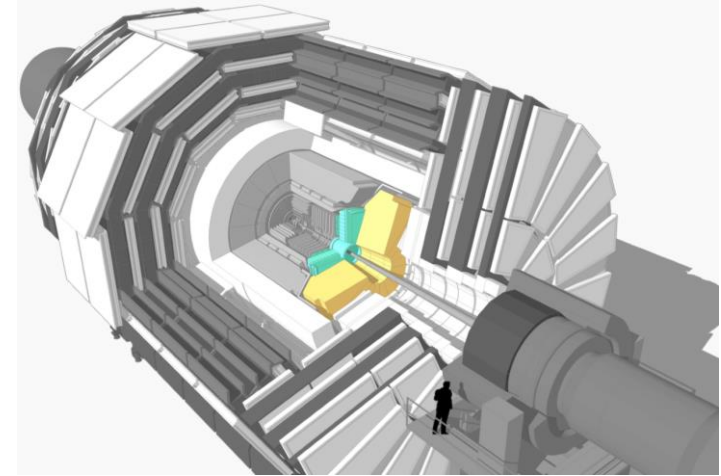
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Motivation

High Granularity Calorimeters candidate technology for detectors at future accelerators (CMS@HL-LHC, CLIC, FCC-hh)

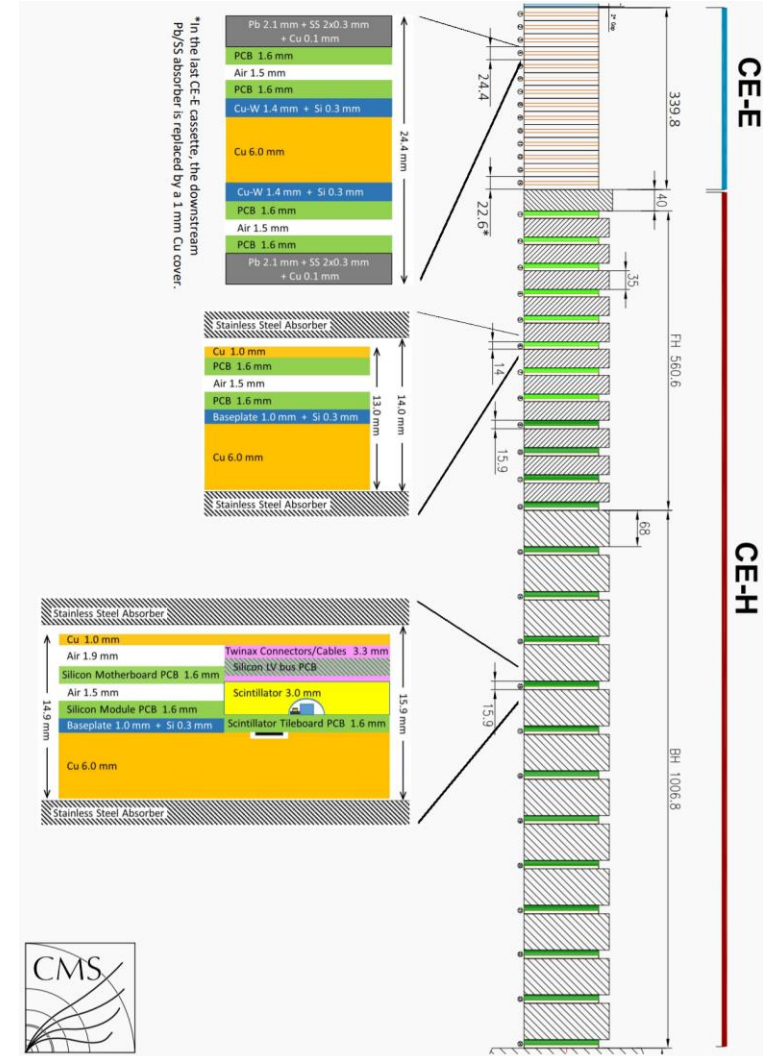
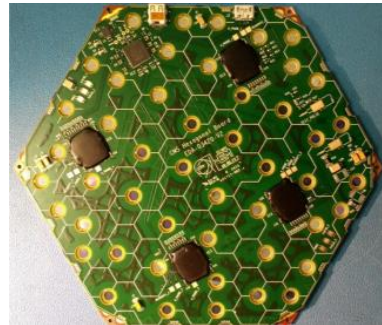
- Radiation hard detectors based on a mix of silicon and scintillator technologies
- High transverse/longitudinal granularity and timing allows for enhanced 5D pattern recognition, particle flow reconstruction, PID and pileup mitigation
- Preserve or even improve sensitivity in the interesting and busy forward region for VBF/VBS



Sampling

The longitudinal sampling of the layers follows physics principles of shower development with two groups of sampling (em and hadronic)

In the transverse plane, sensitive Silicon cells of $0.5\text{-}1\text{cm}^2$ contribute to disentangle two nearby showers or MIPs



Reconstruction in HGCal



- Reconstruction in High Granularity Calorimeters can be challenging in high PU environments as
 - overlapping showers are the norm
 - naive reconstruction algorithms exploring many combinations among all possible paths are expected to fail due to memory/timing explosion
 - Fertile ground for new techniques and algorithms: clustering, machine learning, graph theory, and modern computer architectures
 - Must be planned and designed, taking into account the information from the surrounding tracking and timing detectors.
 - The CMS HGCal is a good opportunity as its software reconstruction cannot be obtained by adapting any existing CMS sub-detector software

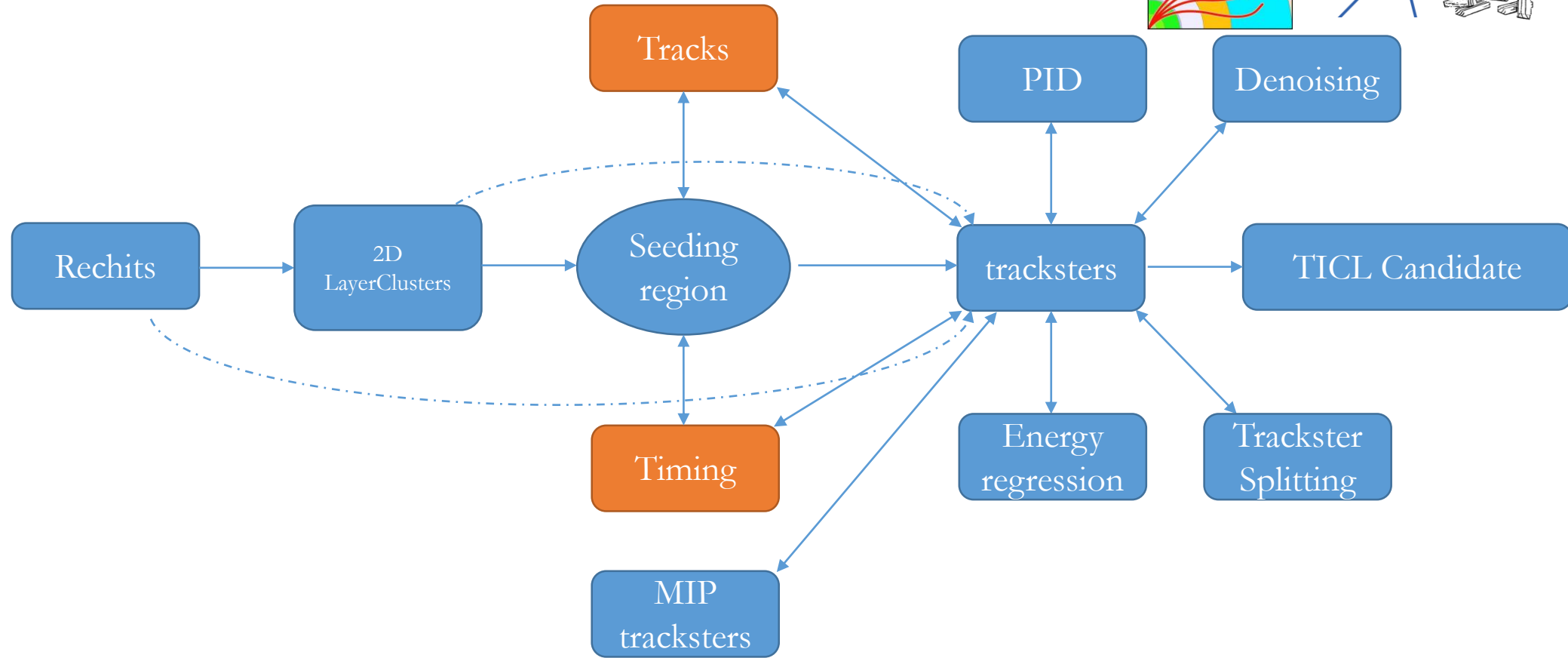


TICL - ['tikəl]: The Iterative Clustering

What is TICL?



- TICL is a modular framework integrated and under development in the CMS reconstruction
- Its final purpose is to process HGCal rechits (x, y, z, t, E) and return particle properties and probabilities
- Modules and interfaces are defined so that new developers don't have to know anything about the CMSSW core framework in order to contribute
- Geometry agnostic
- Algorithms implemented as plugins



Many of these chains can co-exists in “iterations” targeting different particles

An iteration in TICL



- hits on the same layer are clustered together in Layer Clusters (LC), in parallel
- LCs belonging to physics objects are masked-out and won't be available for the next iteration
- In CMS at PU200, $O(10^5)$ hits and $O(10^4)$ LCs per event
- Pattern Recognition algorithms are plugins
- Linking/cleaning/classification
- Make use of timing information in PR when available



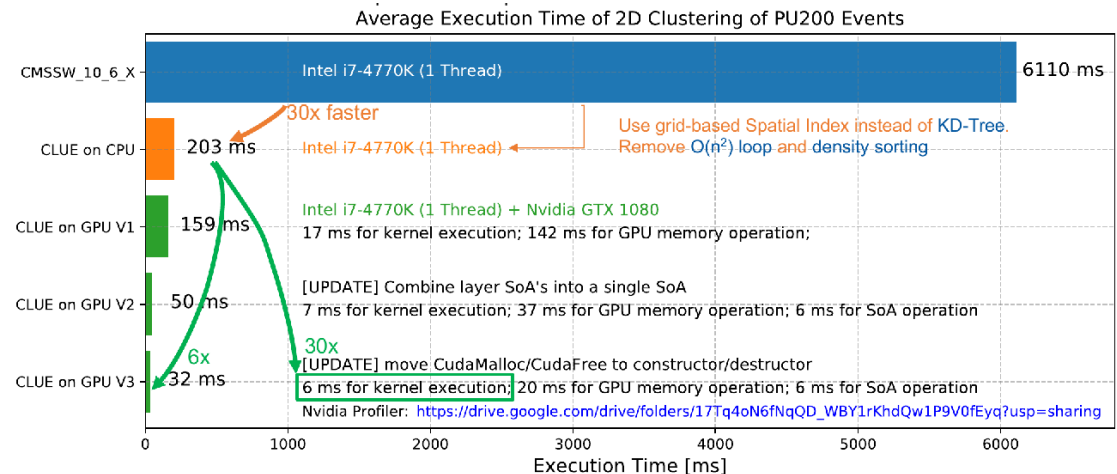
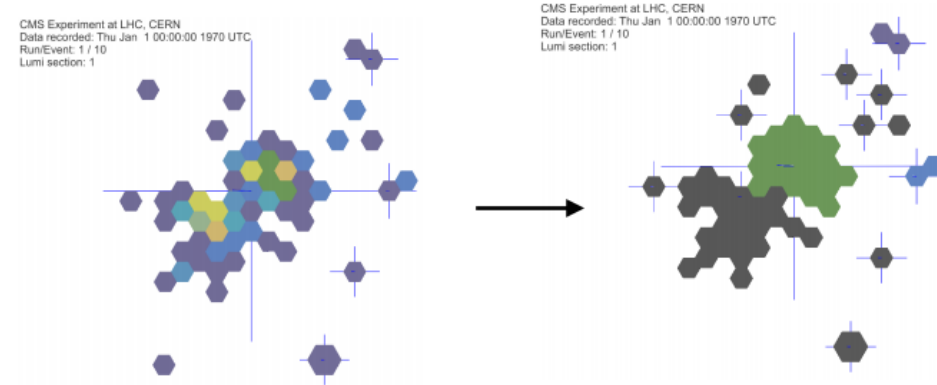
Layer Clusters



TICL's modularity starts with the Layer Clustering:

- Input rechits, output layer clusters
- Swappable plugins for 2d clustering algo
- CLUE default clustering algo:

<https://arxiv.org/abs/2001.09761>



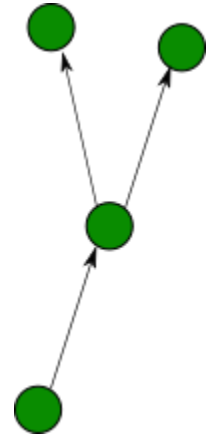
Pattern recognition: Tracksters



Tracksters are basically small DAGs whose vertices are layerClusters

Pattern recognition can be any algorithm that connects layer clusters together to produce a Trackster

- Cellular Automaton, Kalman Filter, 3d clustering algo, Final Armageddon algo
- Can be constrained in a seeding region
- Tracksters have to be pruned, linked to off-hgcal objects, and filled with:
 - regressed energy, probabilities for each particle-id class and fitted timing for the 3d-object



Tracksters can then be fed to PF

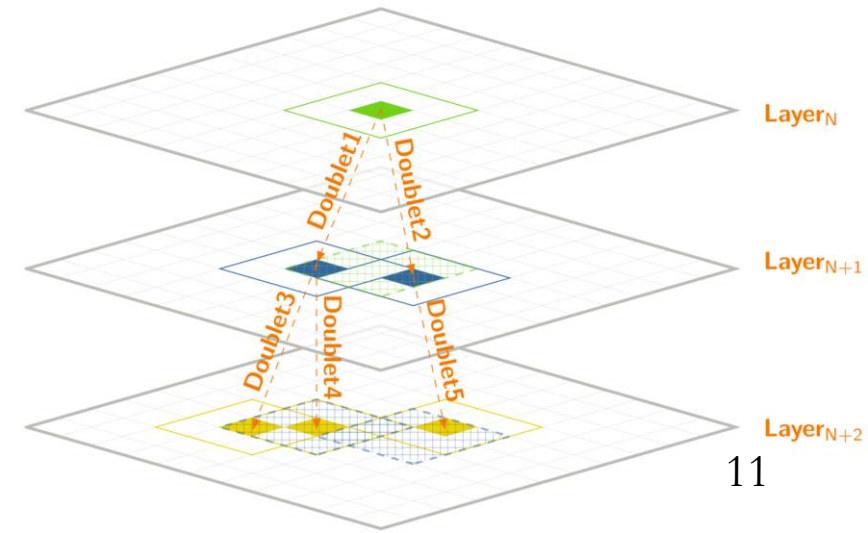
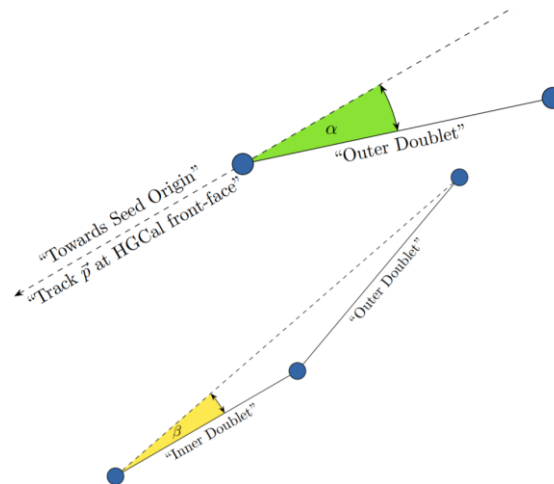
Pattern Recognition by CA



For each 2D layer cluster in a Layer N , open a search window in Layer $N+1$

- Search uses a 2D tiling data structure in η , ϕ
- A layer cluster in this search window will make a doublet with the original layer cluster
 - Requirement on the compatibility of the timings of the two LCs
- Doublets are linked if two angular requirements are satisfied:
 - A requirement on the direction (α) of each doublet wrt the vertex (or wrt a track direction if this is a track seeded iteration)
 - A requirement on the angle (β) between the doublet

Designed with parallelism in mind



TICL Iterations

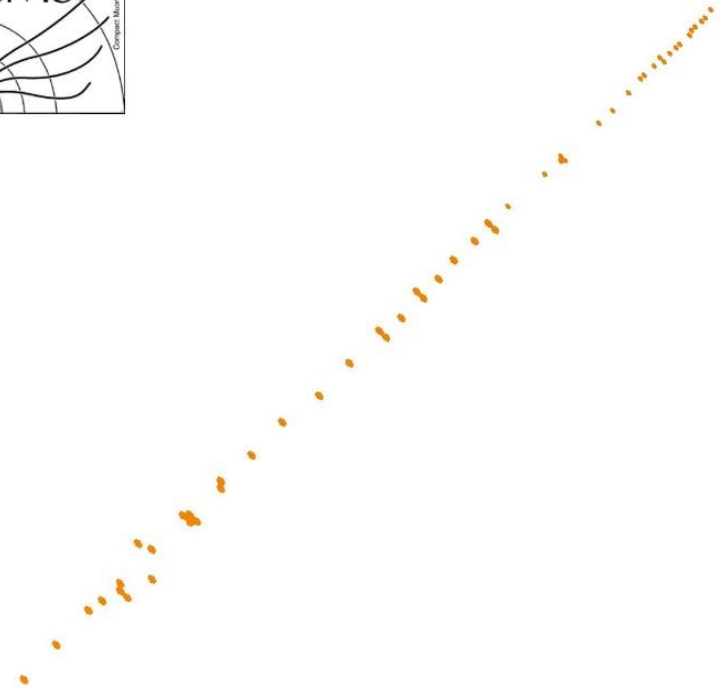


Current prototype iterations:

- track-seeded (e.g., electrons, charged hadrons)
- electromagnetic (e.g., photons)
- hadronic (e.g., neutral hadrons)
- MIP (e.g., muons)

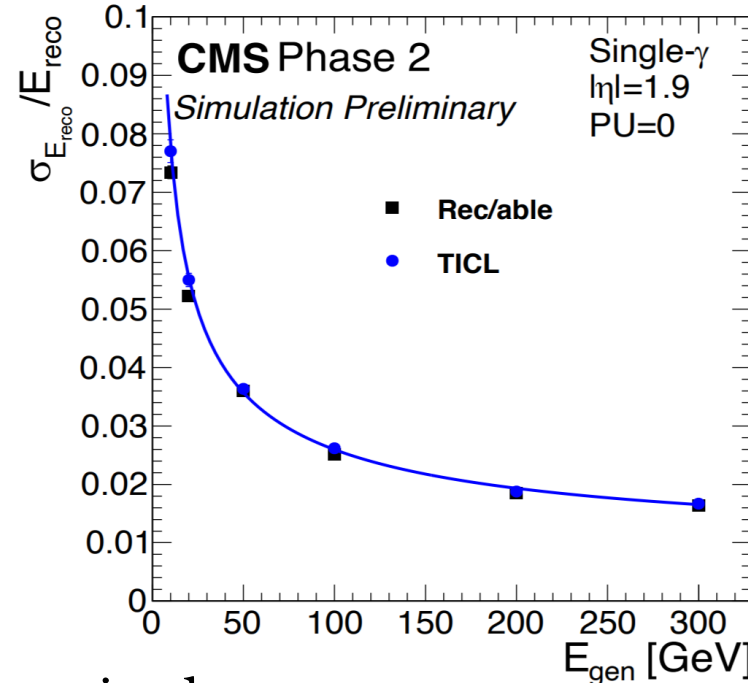
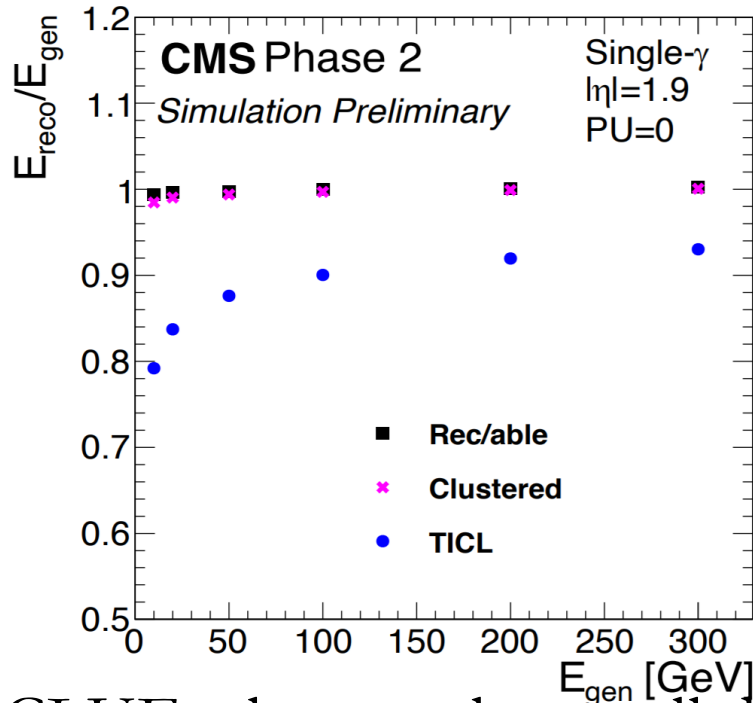
MIPs

- Aims at reconstructing track-like objects within HGCal
- The inputs are small LCs
- Cellular Automaton-based pattern recognition
- Useful to link tracksters together or to find the MIP at the beginning of an hadronic shower



A muon traversing one endcap of the HGCal detector

Electromagnetic Iteration



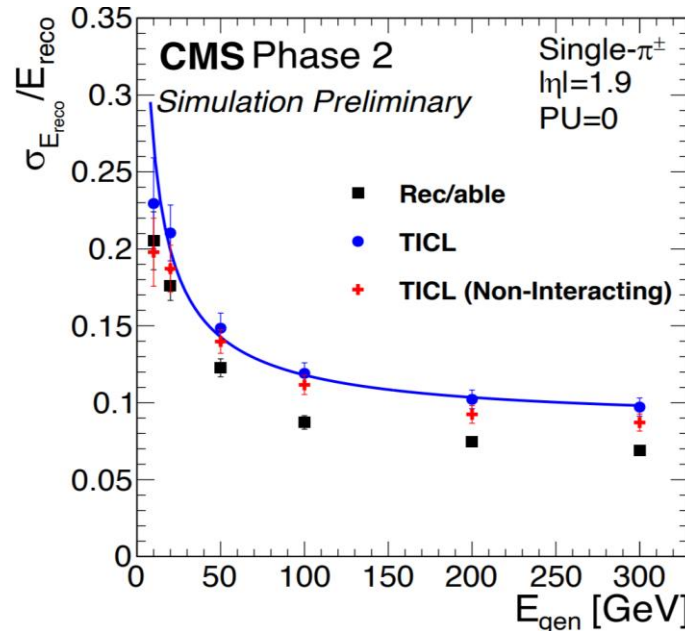
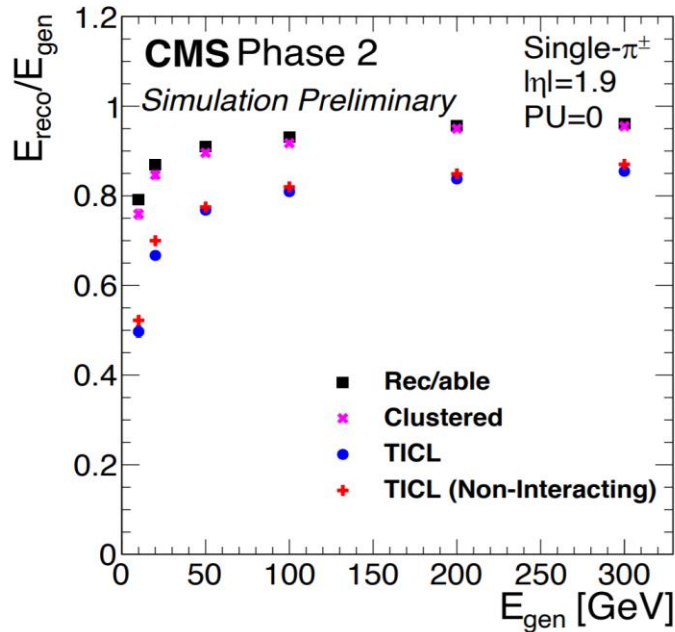
CLUE: clusters almost all deposited energy

TICL showers: contain a large fraction of it

Energy resolution: similar resolution between TICL & Rec/able

	Stochastic	Constant
Rec/able	23%	0.9 %
TICL	25%	0.9 %

Hadronic Iteration



Hadronic showers can have different shapes and topologies, going from single blob to many linked blobs of energy

CLUE reconstructs almost all of the Rec/able energy, TICL a large fraction of it

	Stochastic	Constant
Rec/able	72%	5.5 %
TICL	80%	8.7 %
TICL (Non-int/ing)	72%	8.0 %

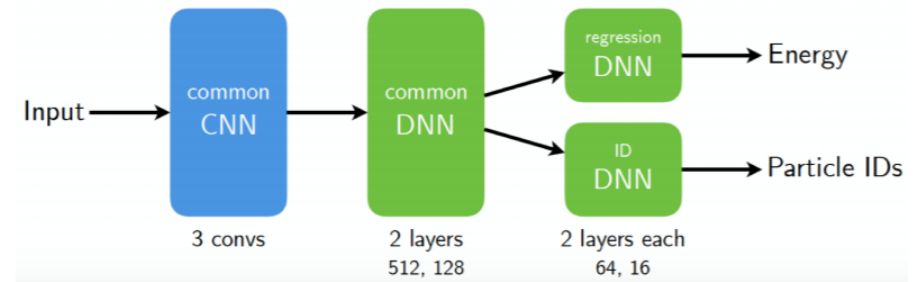
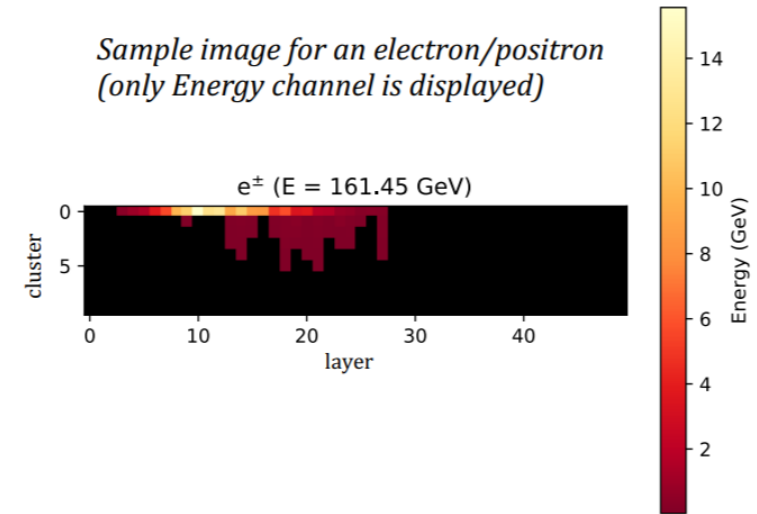
PID and Energy regression



Particle ID and Energy regression can be applied on Tracksters with a single CNN

PID probabilities and energy value as output

Sample image for an electron/positron (only Energy channel is displayed)



Validation and Testing



As TICL has been integrated in the CMS reconstruction, tests are performed automatically on daily basis and for each PR.

A validation has been developed to monitor the physics performance of 2D layer clustering and Pattern recognition

TICL as a library



Repo: <https://gitlab.cern.ch/kalos>

Very loose coupling with the CMSSW framework and Geometry

- templated design allowed its usage out-of-the-box for another endcap calorimeter with different geometry in half a day of work

Assumption on highly granularity in the transverse plane and in the longitudinal sampling (closeby layers)

Started by making CLUE standalone

- Made it easy to use it on test beam data
- <https://gitlab.cern.ch/kalos/clue>
- Ramp up work starting from end of August/September with Thursday biweekly meetings with the rest of the TICL team

Summary



- The reconstruction in High Granularity Calorimeters at future colliders has many unprecedented challenges:
 - A “tracking” device with high hit multiplicity and precise time information
- TICL is being designed with throughput and modern sw techniques
 - A unique opportunity since it is impossible to reuse software
 - Fertile ground for the exploitation of neural networks
 - Integrated in CMSSW but loosely coupled to it
 - Allows to exercise the code frequently, validate it and profit from the CMS software development infrastructure
 - TICL is being developed with parallelism in mind
 - many parts have been/are being ported to GPUs
- Making it a common library would benefit experiments at future colliders and contribute to TICL’s improvement by using it with different topologies/geometries
- Increase the interaction with groups developing similar PF-like reconstruction
 - e.g. fruitful discussion after our presentation at CLIC workshop