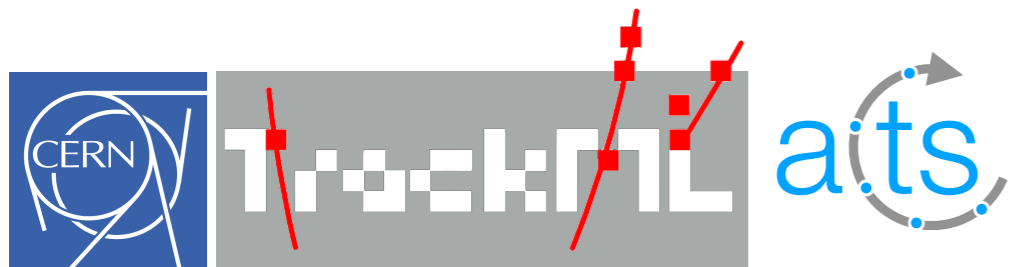


# Tracking Machine Learning Challenge

what's next ?



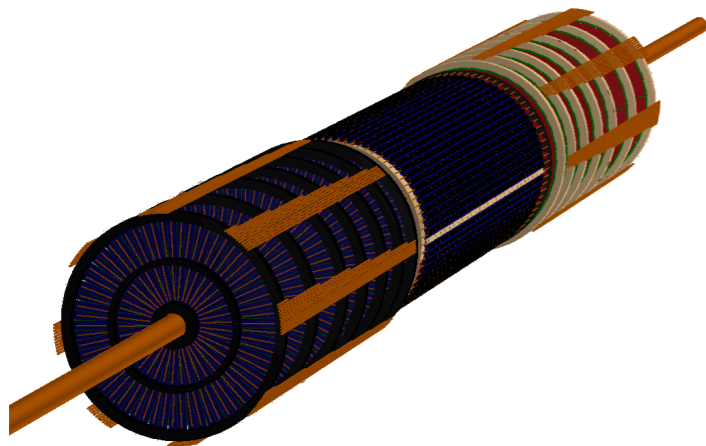
A. Salzburger (CERN) for the TrackML organisers

@SaltyBurger

# Release timeline

Tentative release timeline for OpenData detector

## Consolidation of detector & simulation



July/Aug 2019

## Dataset production:

Geant4 simulation  
(small statistics validation sample)

ACTS-Fatras simulation  
(large statistics sample)

Sep 2019



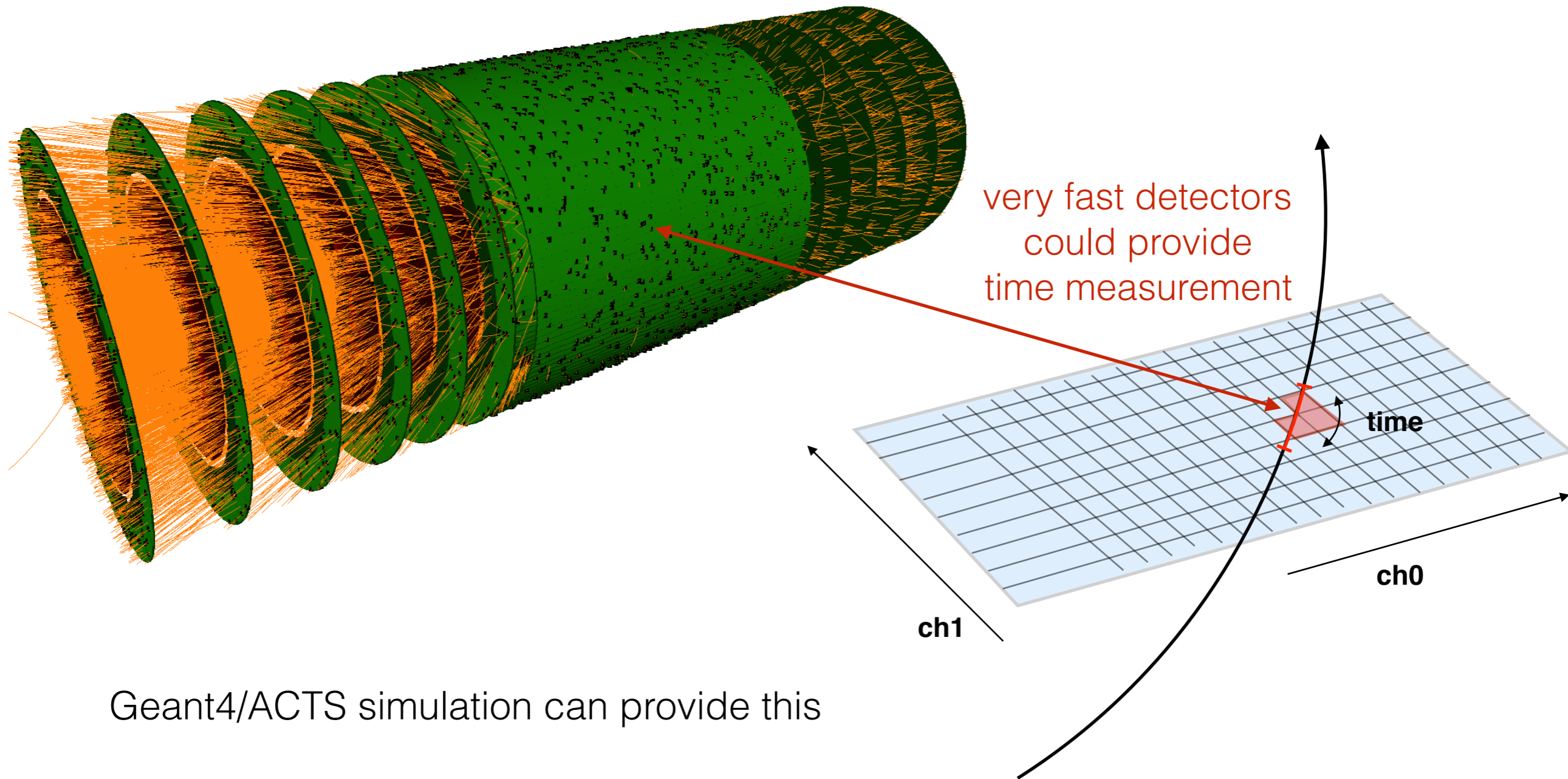
Let's assume we are here

# Part 1 Expanding the experimental scope

# Evolving the Tracking detector

## Future tracking detector technologies

- a full timing tracking detector to deal with higher pile-up



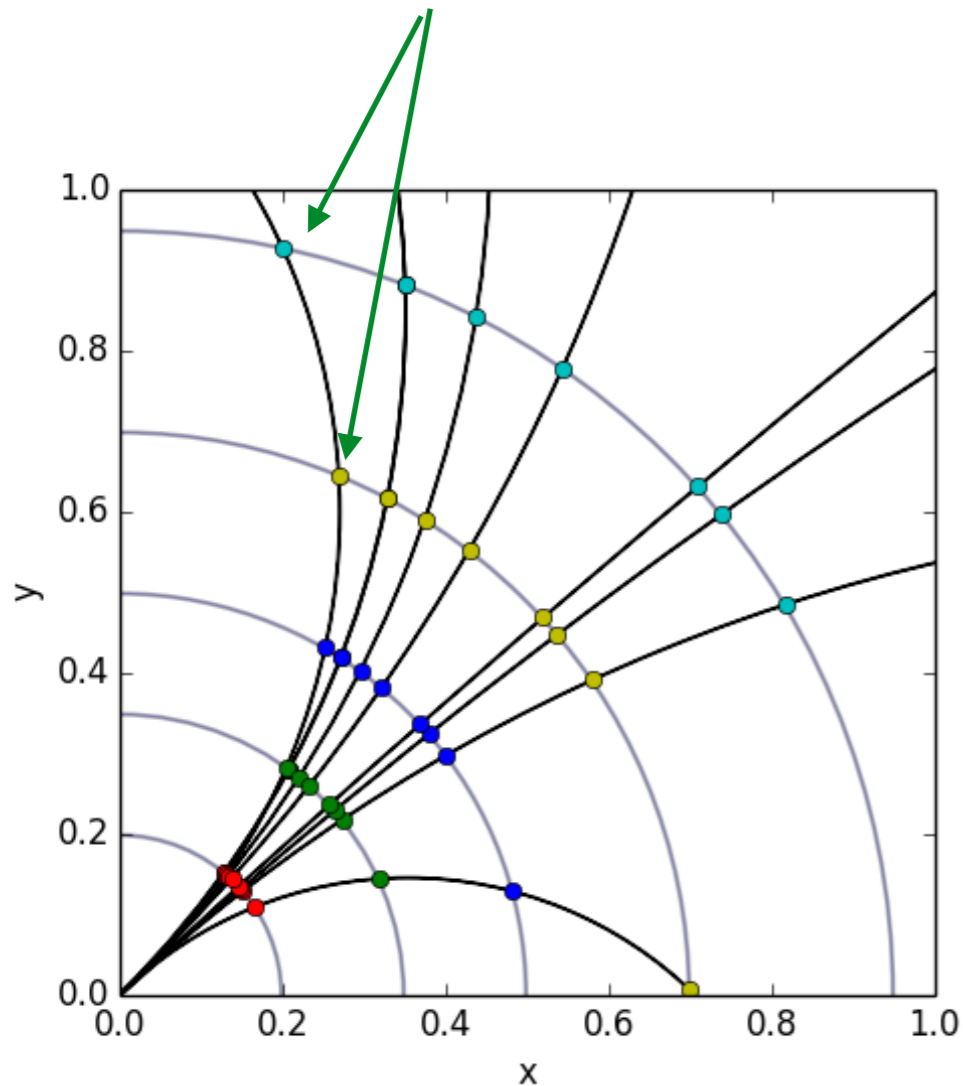
Geant4/ACTS simulation can provide this

# Evolving the Tracking detector

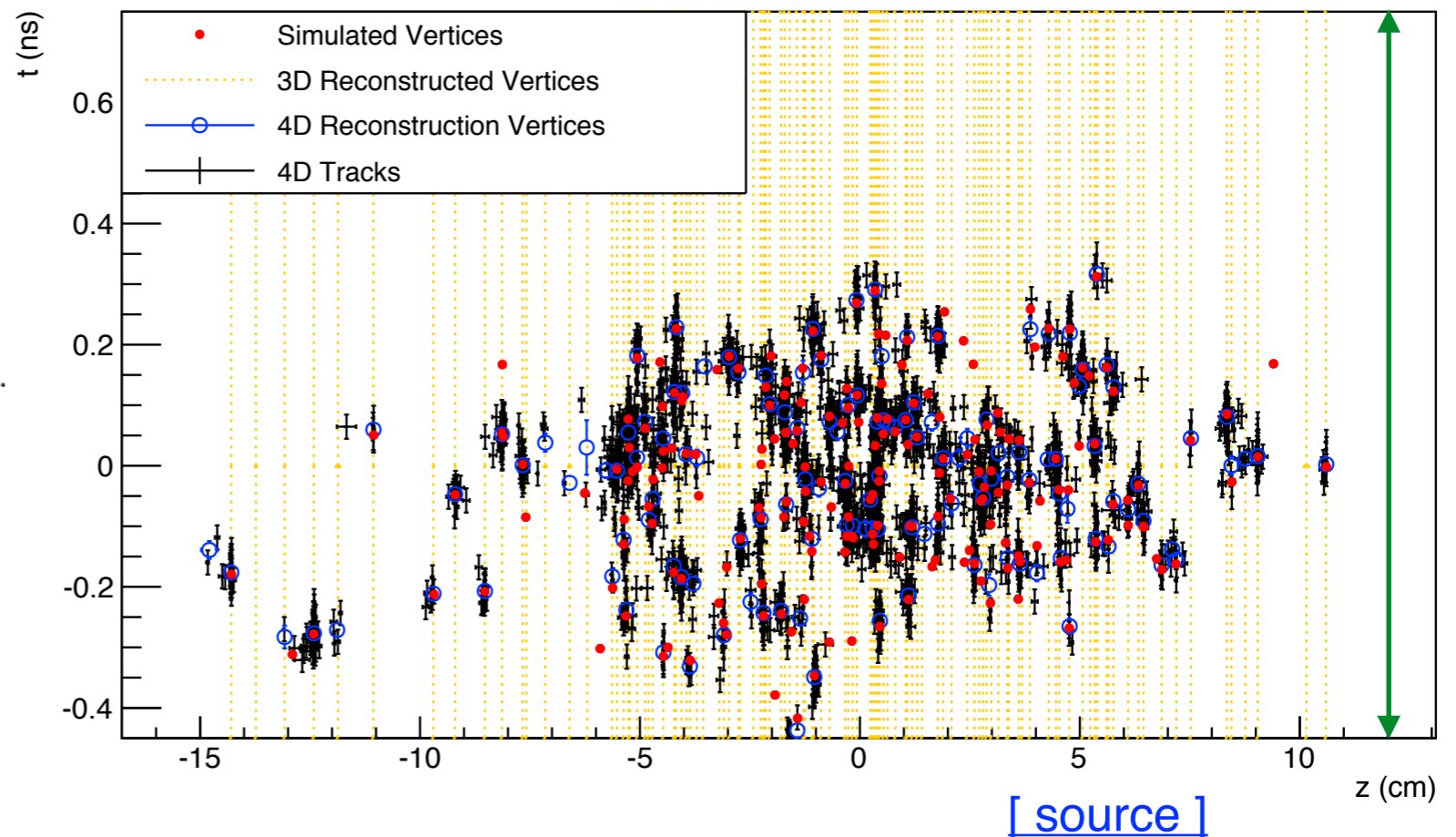
## Future tracking detector technologies

- a full timing tracking detector to deal with higher pile-up

time information could help  
essentially for pattern recognition



can be used to resolve  
dense vertex populations

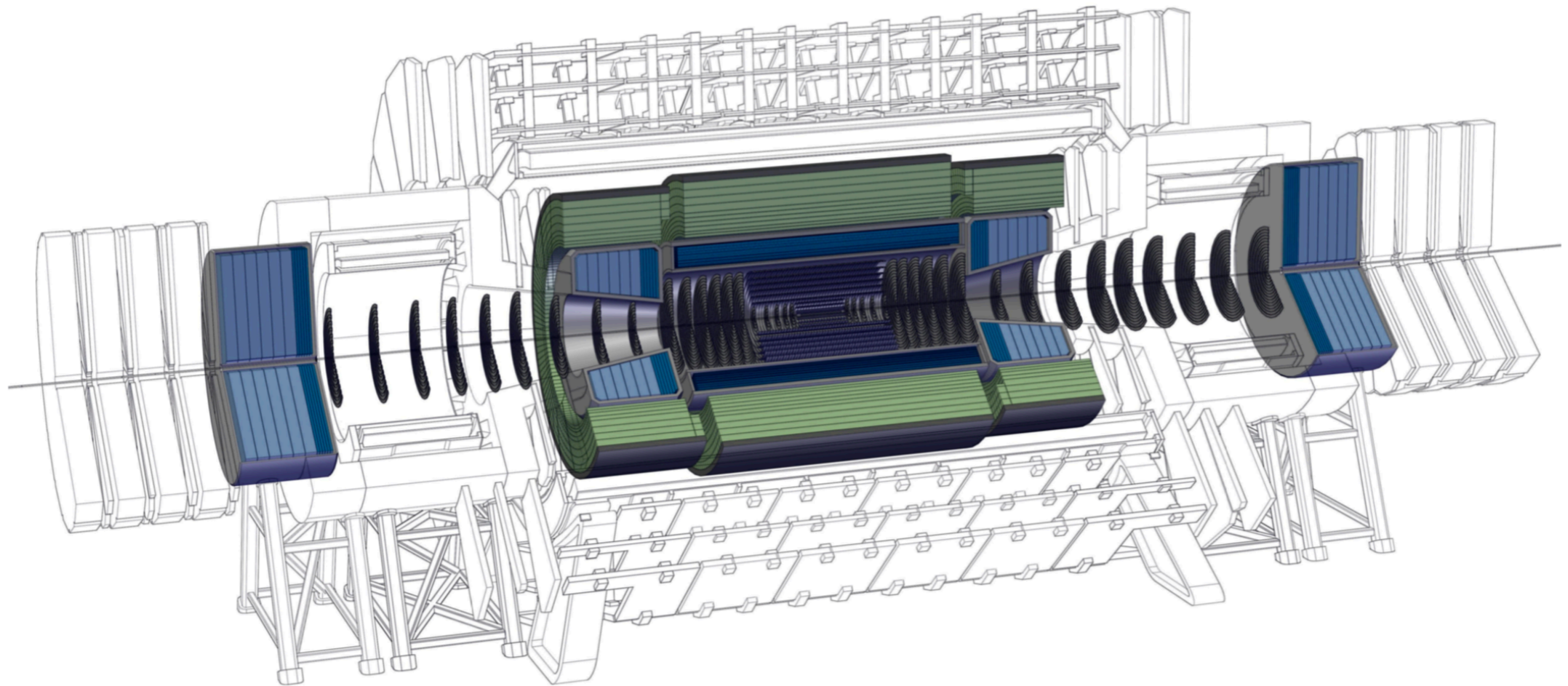


# Evolving towards a full template HEP detector?

Several parties have expressed interest in a full detector

- Full event reconstruction will need a Calorimeter & Muon System

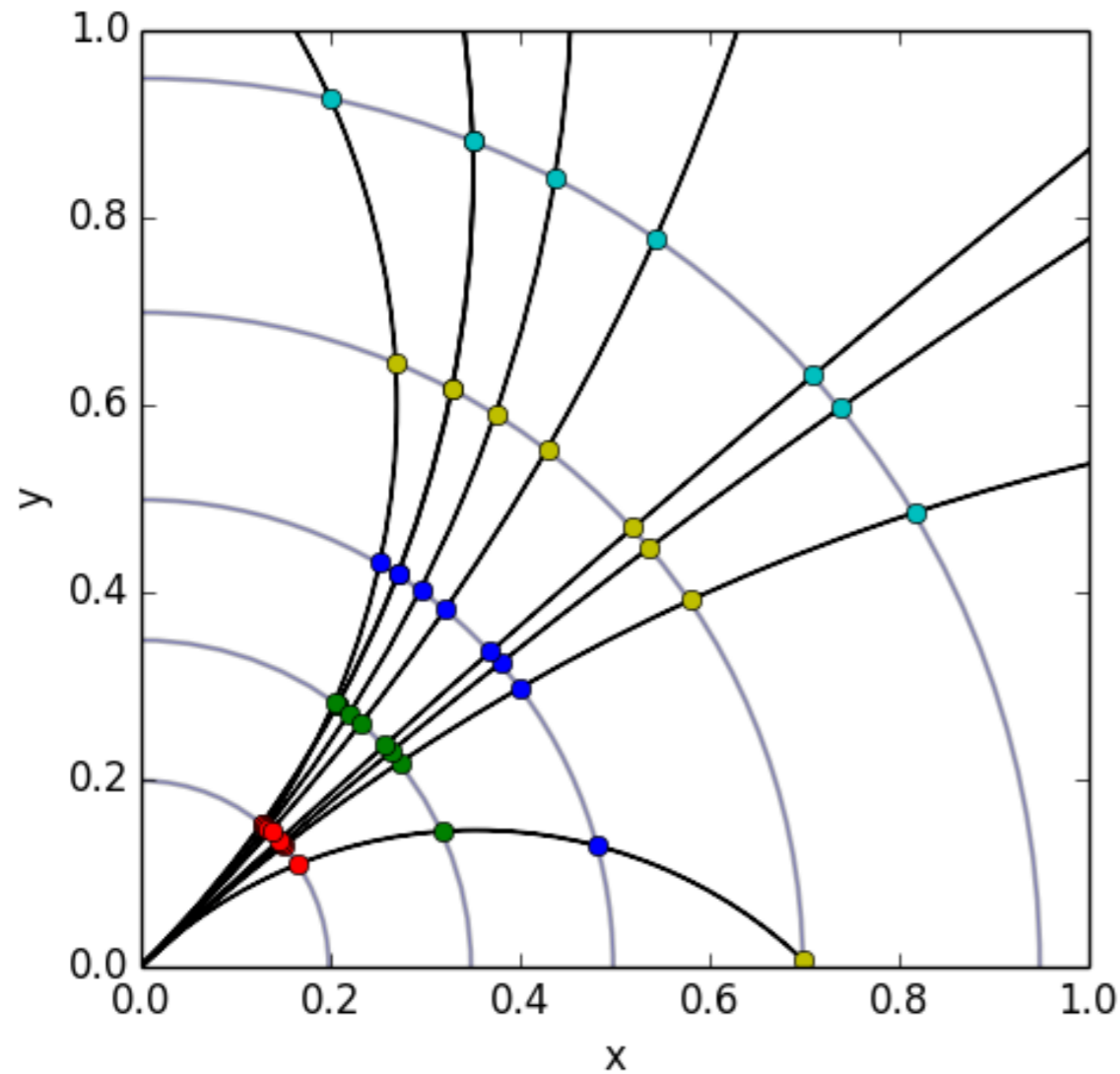
Calorimeter description of FCC-hh  
available in DD4hep, could adapt it  
to OpenData detector



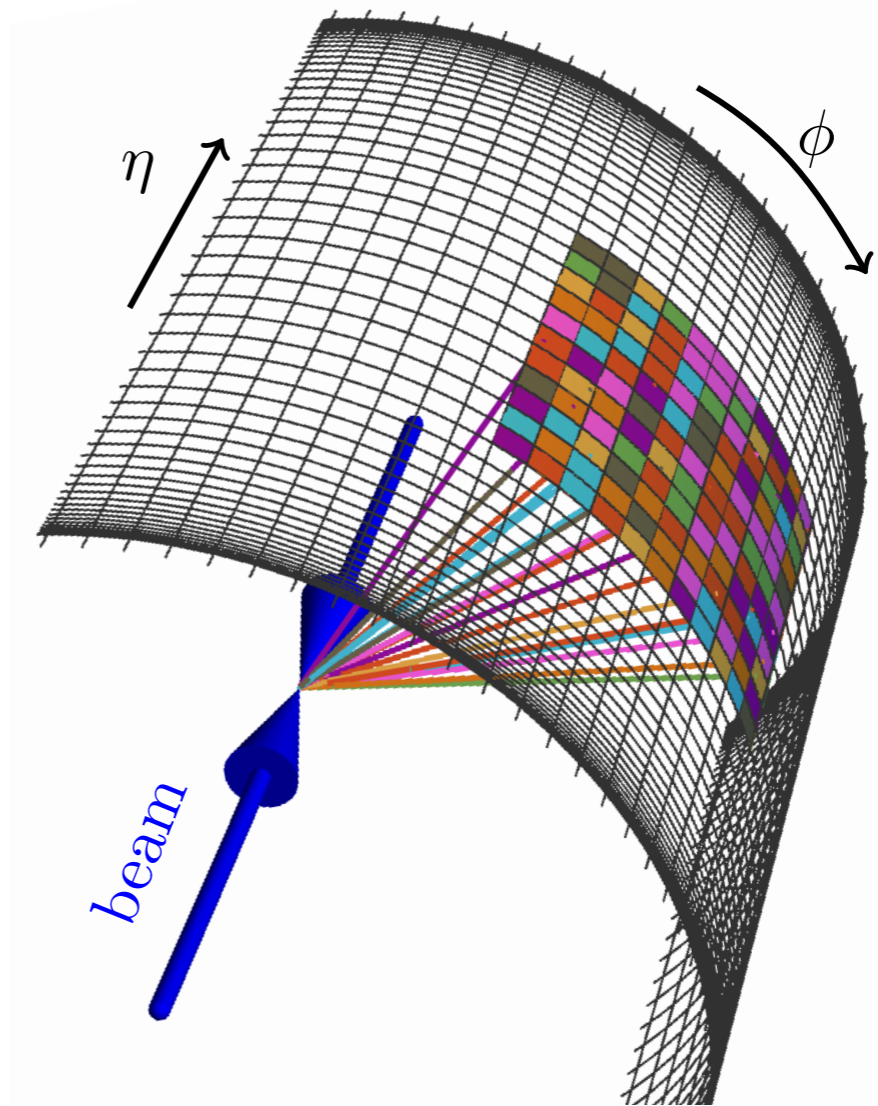
→ No ad-hoc fast simulation exists  
**Join forces with GAN/VAE calorimeter fast simulation developments?**

# Calorimeter Reconstruction

Charged and neutral particles deposit energies in calorimeter cells



Tracking view



Calorimeter view

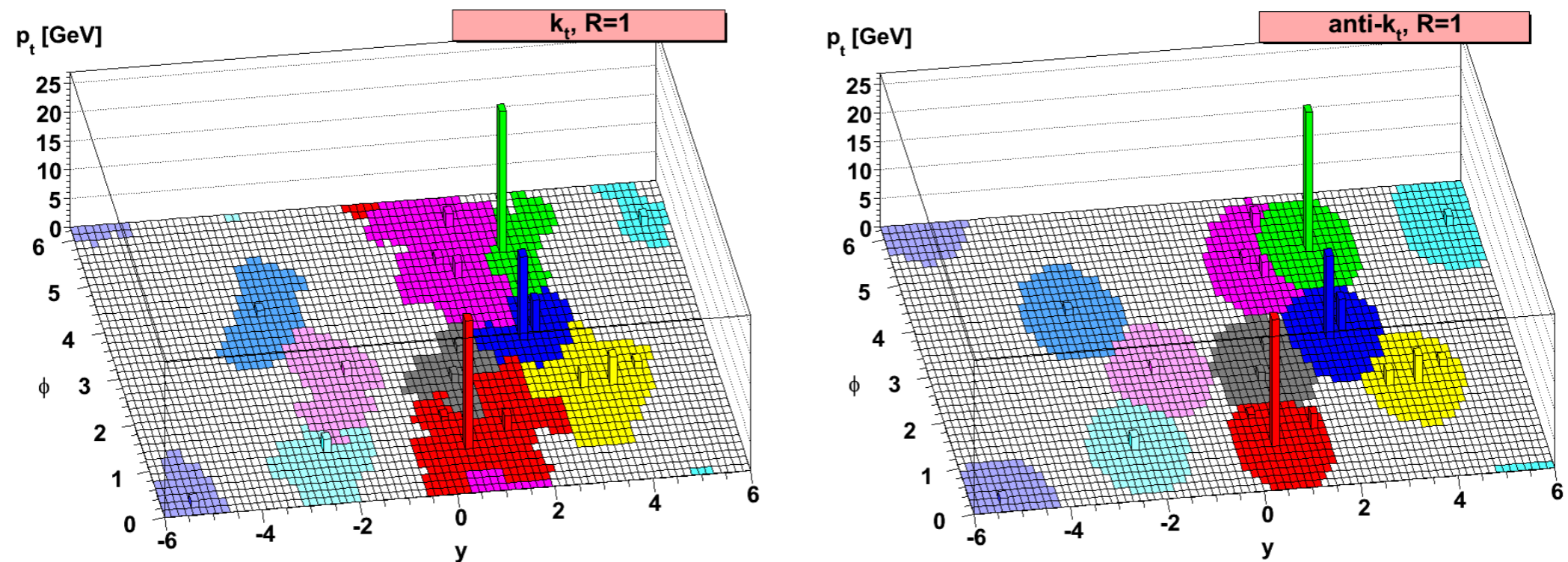
# Calorimeter Reconstruction

First build “clusters of cells” representing one particle

- quite a lot of calibration, noise reduction, pile-up suppression
- in general though a connected component analysis with constraints

Run an interactive algorithm to cluster “particles” together into jets

- this is done in 2D space (rapidity  $y$ , azimuthal angle  $\phi$ )





# Jet Identification

 quark/gluon jet tagging with CNNs

Jets from quarks and gluons have different morphologies

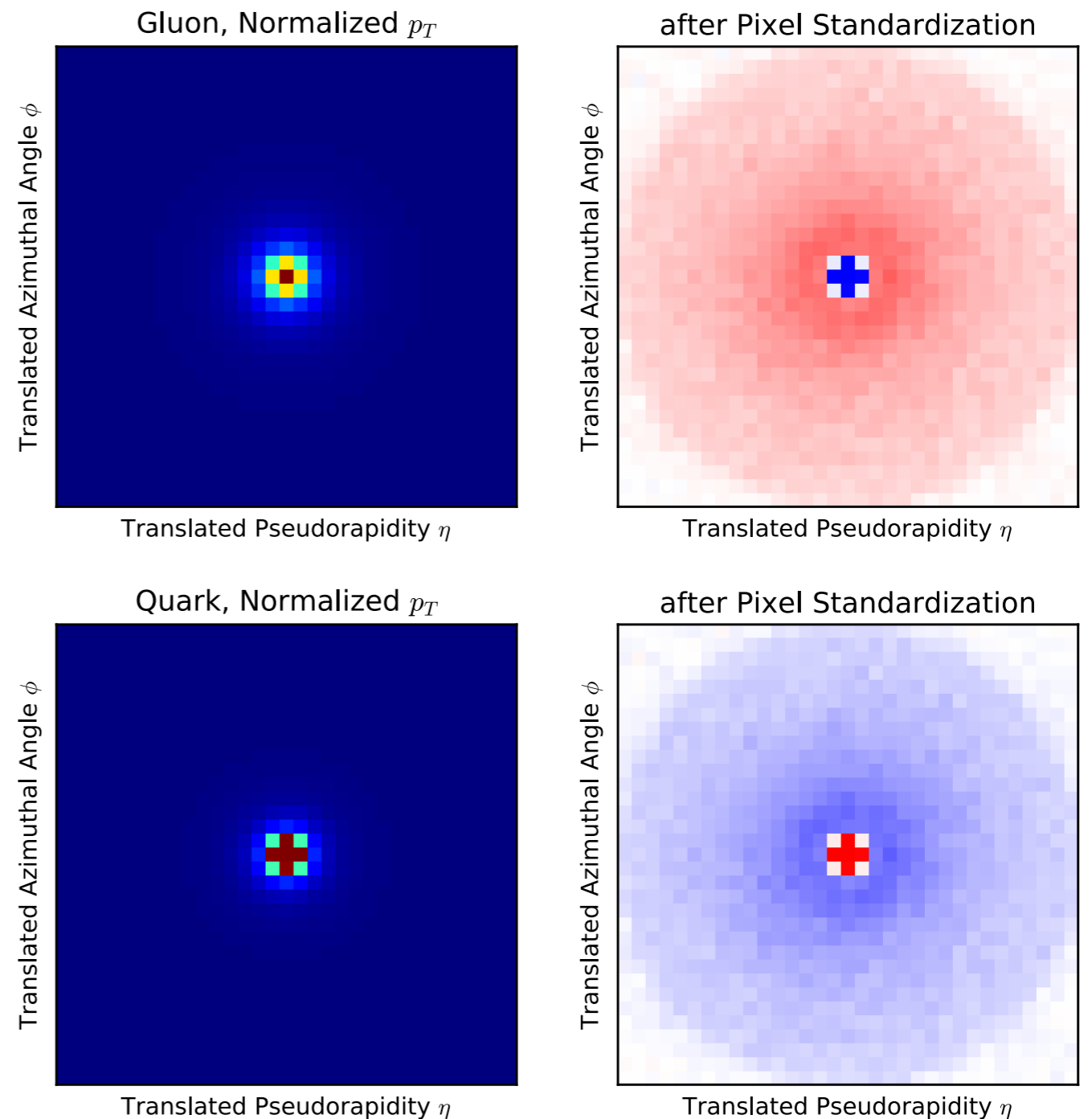
- identification helps to clear the macroscopic from the microscopic view

Supplement this adding color to the images:

red = transverse momenta of charged particles

green = the transverse momenta of neutral particles

blue = charged particle multiplicity



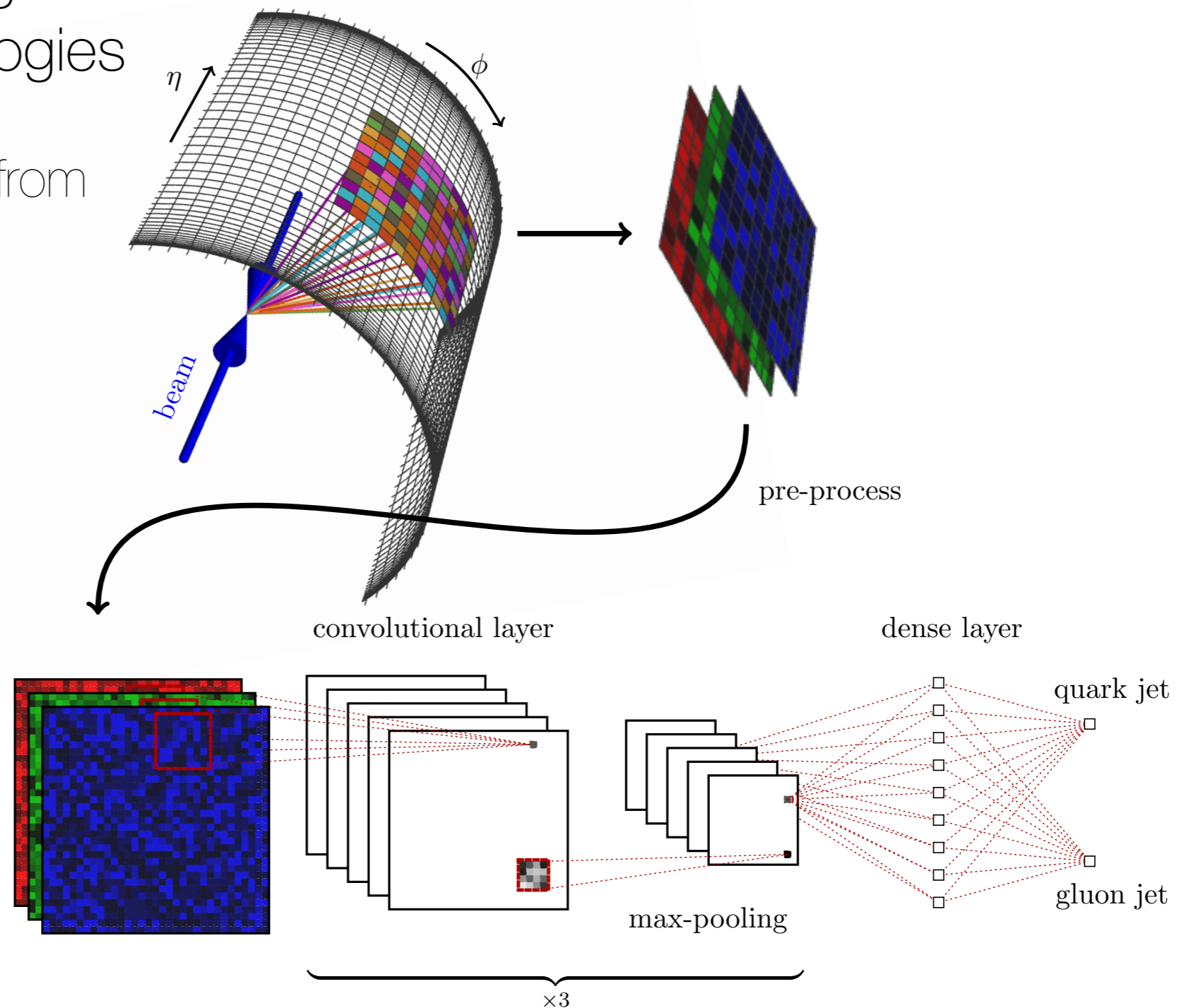
# Jet Identification quark/gluon jet tagging with CNNs

Jets from quarks and gluons have different morphologies

- identification helps to clear the macroscopic from the microscopic view

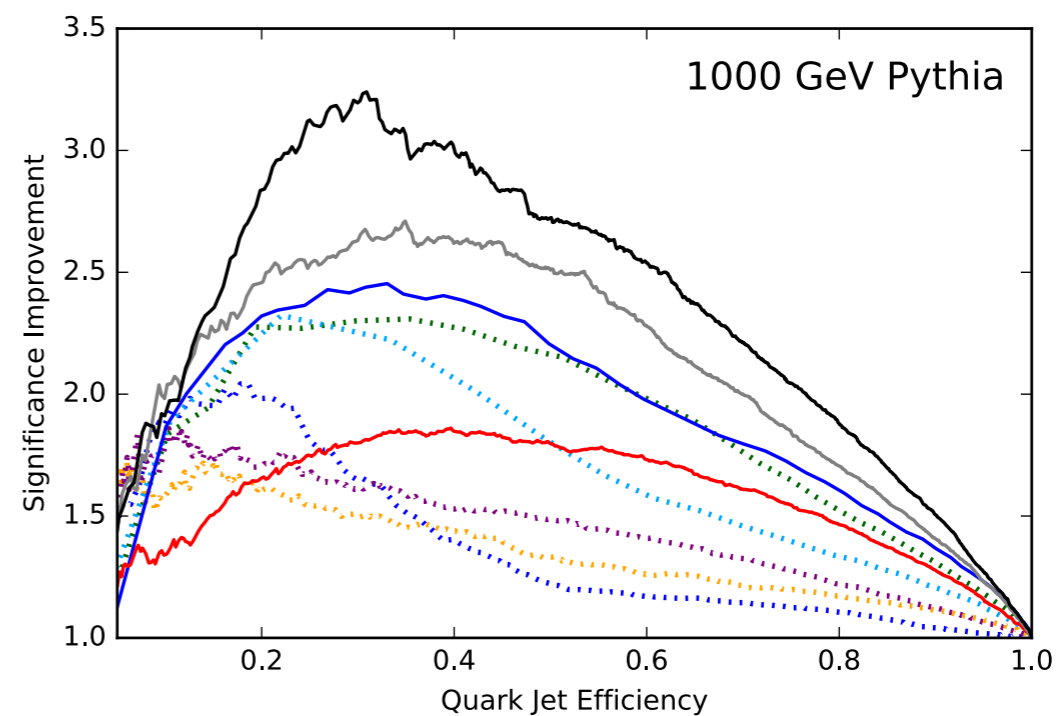
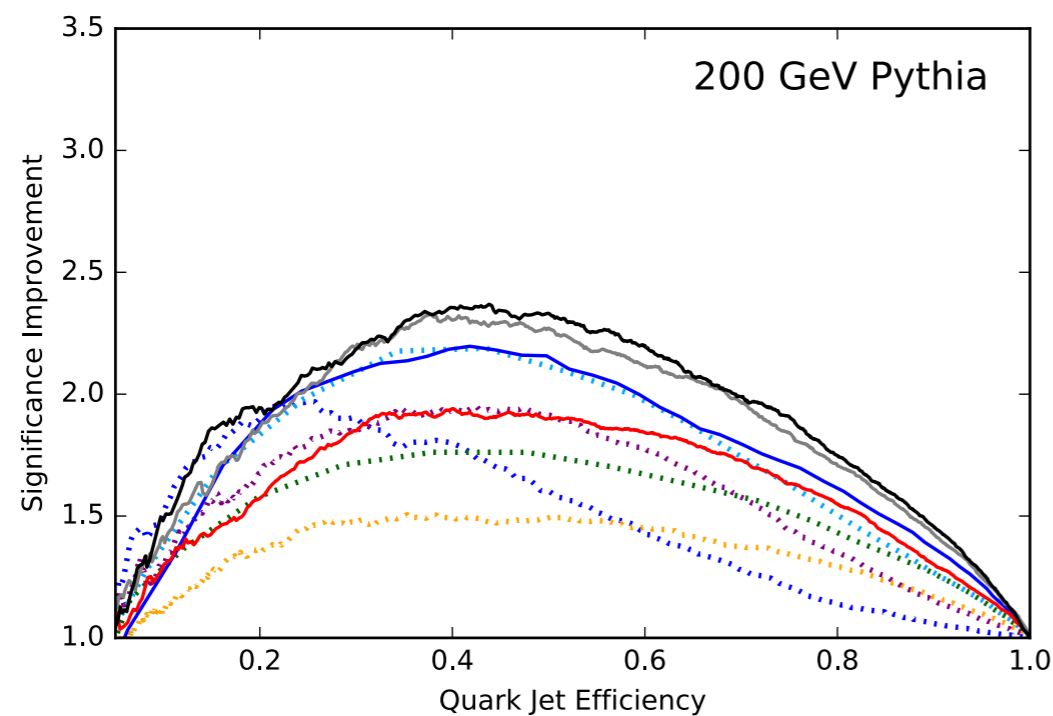
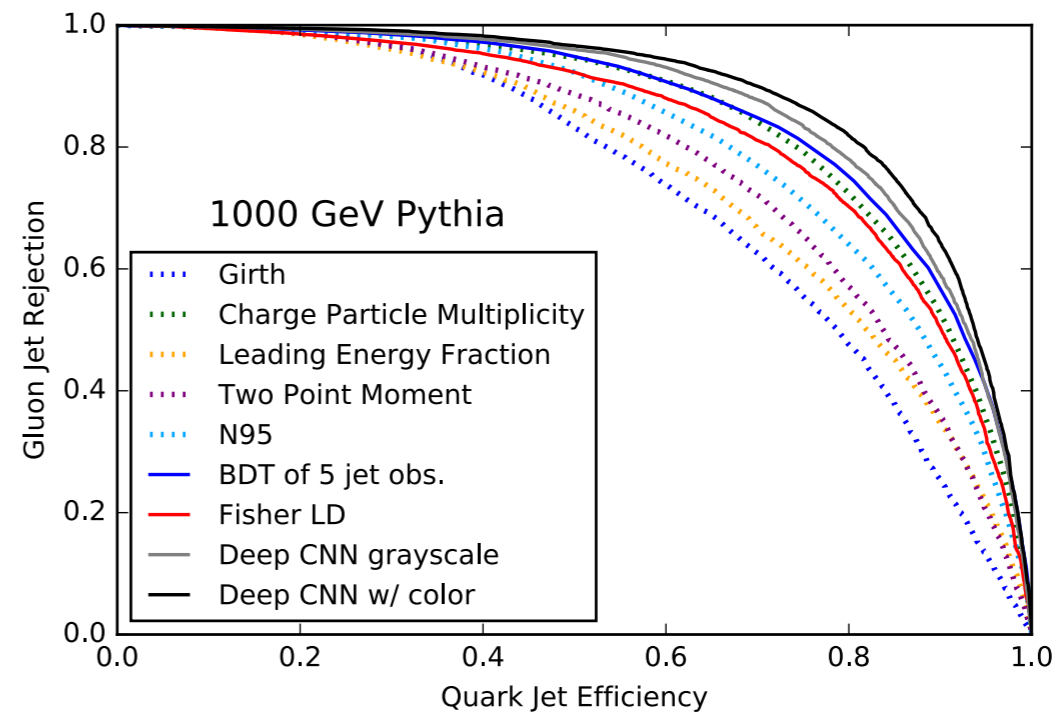
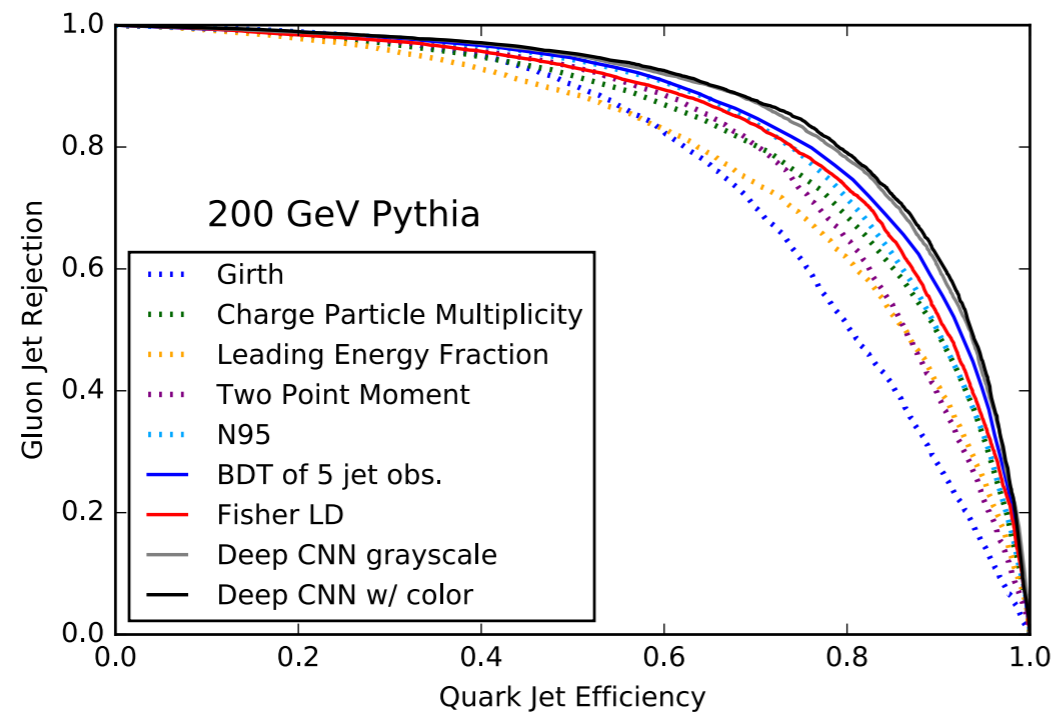
Preprocessed images fed into a CNN

- max-pooling
- dense layer
- finally 2 output nodes for quark/gluon classification



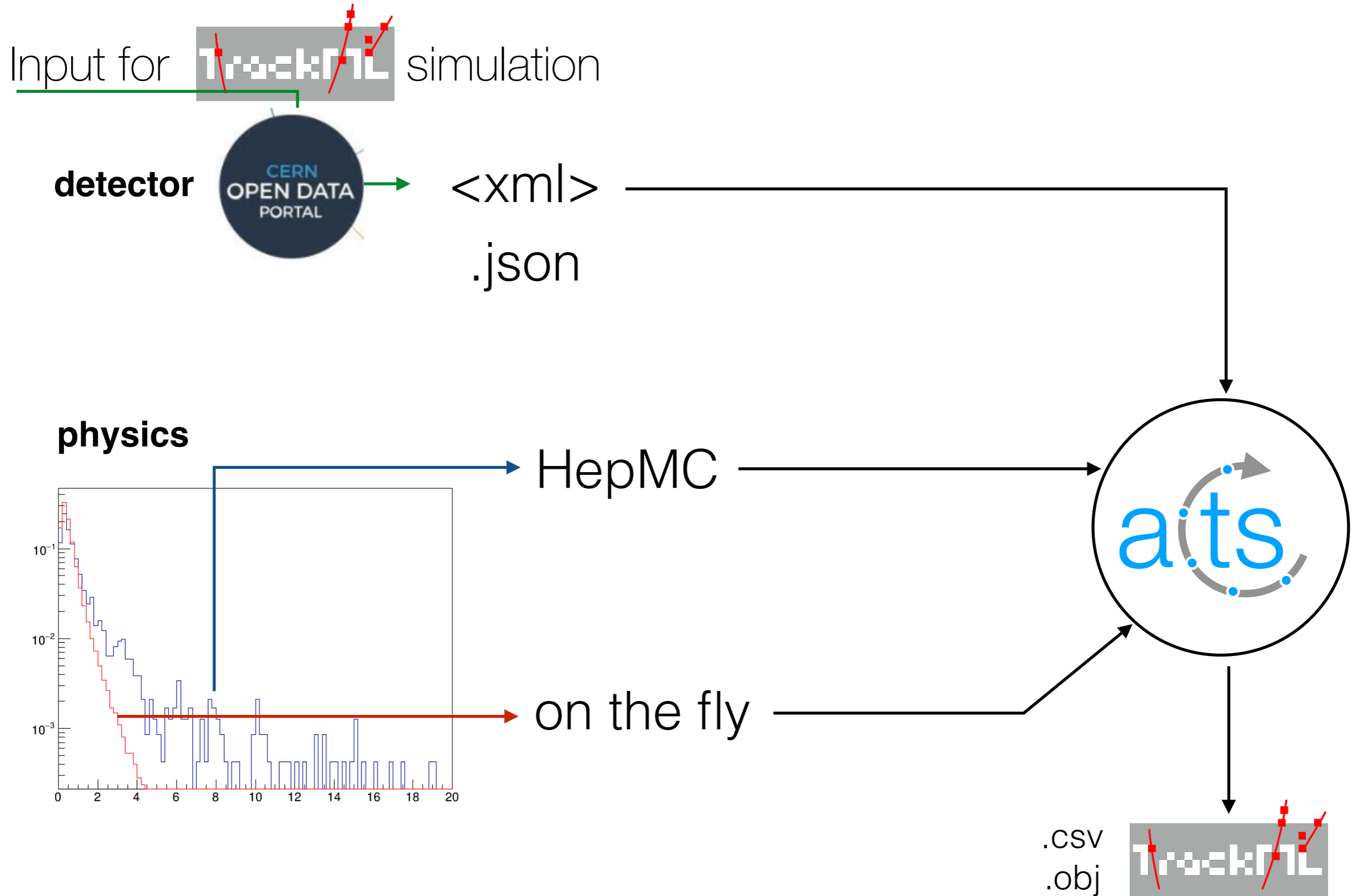
# Jet Identification quark/gluon jet tagging with CNNs

Some performance checks:



Source:  
[arxiv.org:612.01551](https://arxiv.org/abs/1612.01551)

# Provide simulator instead of dataset ?



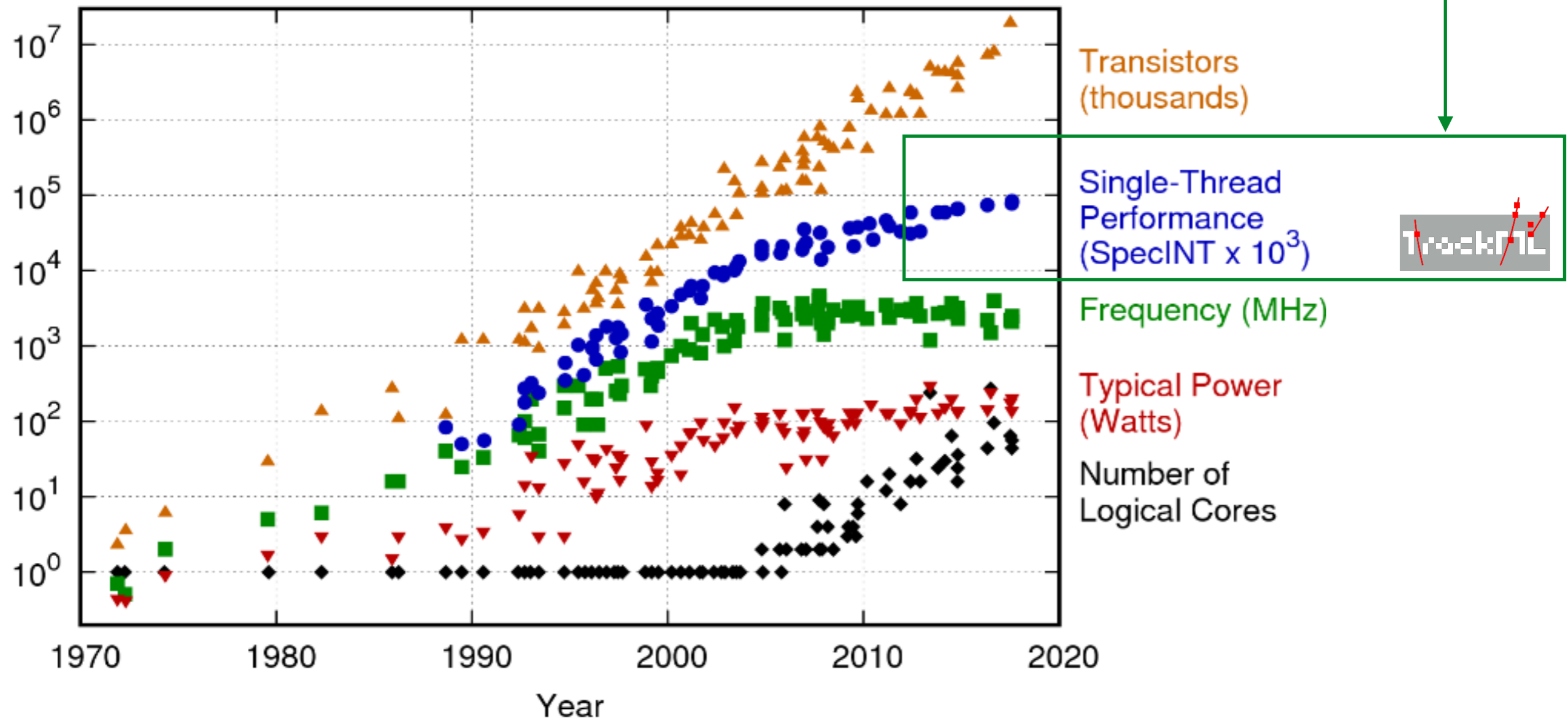
# Part 2 Expanding the technological scope

# Trends in Computing

End of Moore's law ...

Phase-2 of TrackML offered VMs with 2 cores  
(not really targeting where industry moves to)

42 Years of Microprocessor Trend Data



Original data up to the year 2010 collected and plotted by M. Horowitz, F. Labonte, O. Shacham, K. Olukotun, L. Hammond, and C. Batten  
New plot and data collected for 2010-2017 by K. Rupp

# Trends in Computing HPCs

Rank	System	Cores	Rmax (TFlop/s)	Rpeak (TFlop/s)	Power (kW)
1	<b>Summit</b> - IBM Power System AC922, IBM POWER9 22C 3.07GHz, NVIDIA Volta GV100, Dual-rail Mellanox EDR Infiniband , IBM DOE/SC/Oak Ridge National Laboratory United States	2,414,592	148,600.0	200,794.9	10,096
2	<b>Sierra</b> - IBM Power System S922LC, IBM POWER9 22C 3.1GHz, NVIDIA Volta GV100, Dual-rail Mellanox EDR Infiniband , IBM / NVIDIA / Mellanox DOE/NNSA/LLNL United States	1,572,480	94,640.0	125,712.0	7,438
3	<b>Sunway TaihuLight</b> - Sunway MPP, Sunway SW26010 260C 1.45GHz, Sunway , NRCPC National Supercomputing Center in Wuxi China	10,649,600	93,014.6	125,435.9	15,371
4	<b>Tianhe-2A</b> - TH-IVB-FEP Cluster, Intel Xeon E5-2692v2 12C 2.2GHz, TH Express-2, Matrix-2000 , NUDT National Super Computer Center in Guangzhou China	4,981,760	61,444.5	100,678.7	18,482
5	<b>Frontera</b> - Dell C6420, Xeon Platinum 8280 2 InfiniBand HDR , Dell EMC Texas Advanced Computing Center/Univ. of T United States				

Trends towards HPCs requires action for HEP



## HPC cross-experiment discussion


 Friday 10 May 2019, 13:00 → 20:40 Europe/Zurich  
 513/1-024 (CERN)

**Description** Live notes

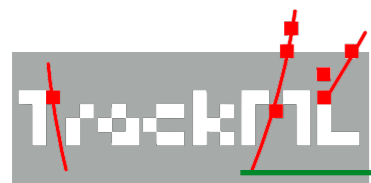
[Live notes](#)

  HPC@LHCC.docx....

**Registration**  Participants [Register](#)

**Videoconference Rooms**  HPC\_cross-experiment\_discussion [Join](#)  513/1-024

[ source ]



# on GPUs?

many ML packages have GPU support!

Running a GPU based TrackML challenge natural next step

HEP*iX*

## GPUs - Programmability

- NVIDIA CUDA:
  - C++ based (supports C++14), **de-facto standard**
  - New hardware features available with no delay in the API
- OpenCL:
  - Can execute on CPUs, AMD GPUs and recently Intel FPGAs
  - Overpromised in the past, with **scarce popularity**
- Compiler directives: OpenMP/OpenACC
  - Latest GCC and LLVM include support for CUDA backend
- AMD HIP:
  - Interfaces to both CUDA and AMD MIOpen, still supports only a subset of the CUDA features
- GPU-enabled frameworks to hide complexity (Tensorflow)
- **Issue is performance portability and code duplication**

24

[\[ source \]](#)



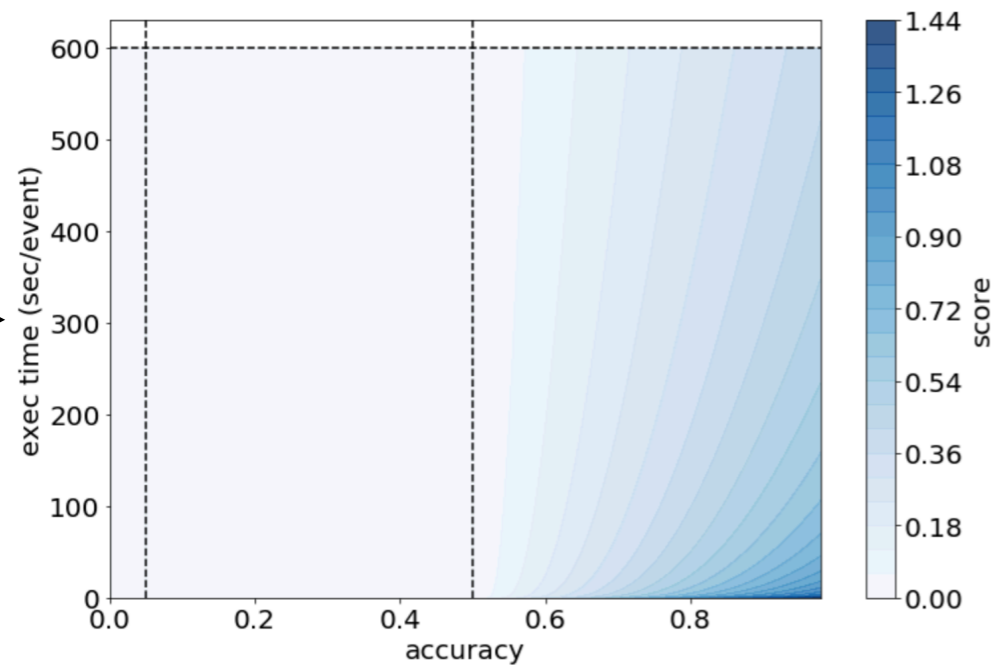


# on GPUs?

Running a GPU based TrackML challenge natural next step

If we want to run a combined accuracy/speed score

- need a similar environment as Phase-2 with GPU backend
- need hardware resources



## Phase 2 Control of timing environment

CodaLab

	hit_id	x	y	z	volume_id	layer_id	module_id
0	1	-64.409897	-7.163700	-1502.5	7	2	1
1	2	-55.336102	0.635342	-1502.5	7	2	1
2	3	-83.830498	-1.143010	-1502.5	7	2	1
3	4	-96.109100	-8.241030	-1502.5	7	2	1

event(s) are loaded in memory



VM2 cores, 4 Gb memory

# Final comments

I hope you had fun in the challenges,  
and you stick around !

## Background knowledge

- [Very good slides for beginners](#)
- [Lecture of particles tracking](#)
- [Full helix equations for ATLAS](#) - All equations you need!
- [Diplom thesis of Andreas Salzburger](#) (Wow, he started in this field as a CERN student already in 2001 :p )
- [Doctor thesis of Andreas Salzburger](#)
- [CERN tracking software Acts](#) - Sadly, we didn't have time to explore it :)



**Andreas Salzburger** Competition Host · just now · Options · Edit · Reply



Oh - you made me feel old now ... :-)

Thanks for participating and I hope you had fun in the challenge!!