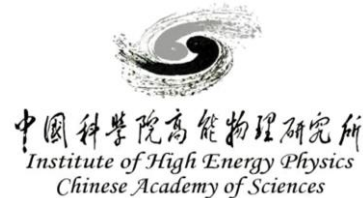


# PID Study for CEPC Drift Chamber

Xu Gao

Jilin university

For the DC-PID group of the CEPC 4<sup>th</sup> conceptual detector



The CEPC Workshop on Flavor Physics, New Physics and Detector Technologies  
Aug. 13-18, 2023, Shanghai

# Outline

- Introduction
- Waveform-based full simulation
- Fast simulation with Delphes
- Activities on prototype test
- Summary

# CEPC

- CEPC

- 240 GeV (Higgs factory),
- 91.2 GeV (Z factory or Z pole)
- 160 GeV (WW threshold scan)

$4 \times 10^{12}$  Z:  
provide diverse flavor  
measurements

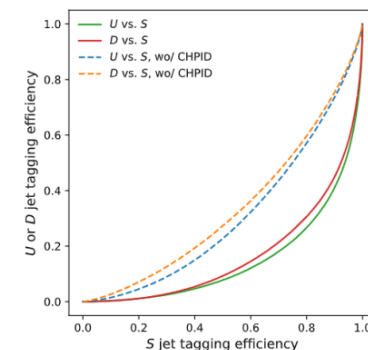
- Particle identification (PID) is essential for flavor physics and jet study

- Reduce combination background
- Improve mass resolution
- Benefit flavor tagging

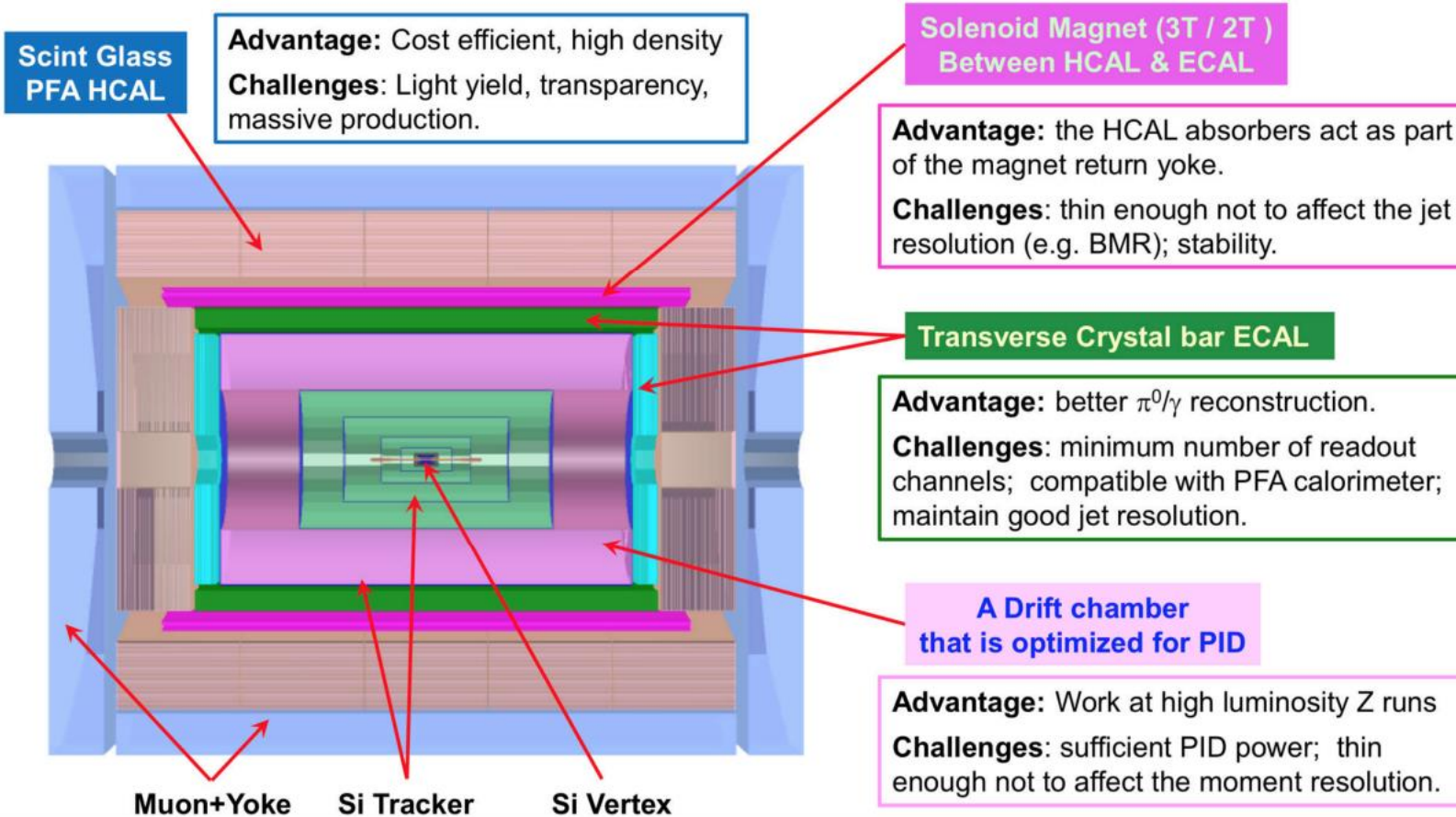
## Strange quark

- S ( $s + \bar{s}$ ) has discrimination between U ( $u + \bar{u}$ ) and D ( $d + \bar{d}$ )
  - Eff. for U and D < 5% at Eff. Of 50% for S
- PID for charged hadron (CHPID)

## From Hao Liang's talk 2023.8.14

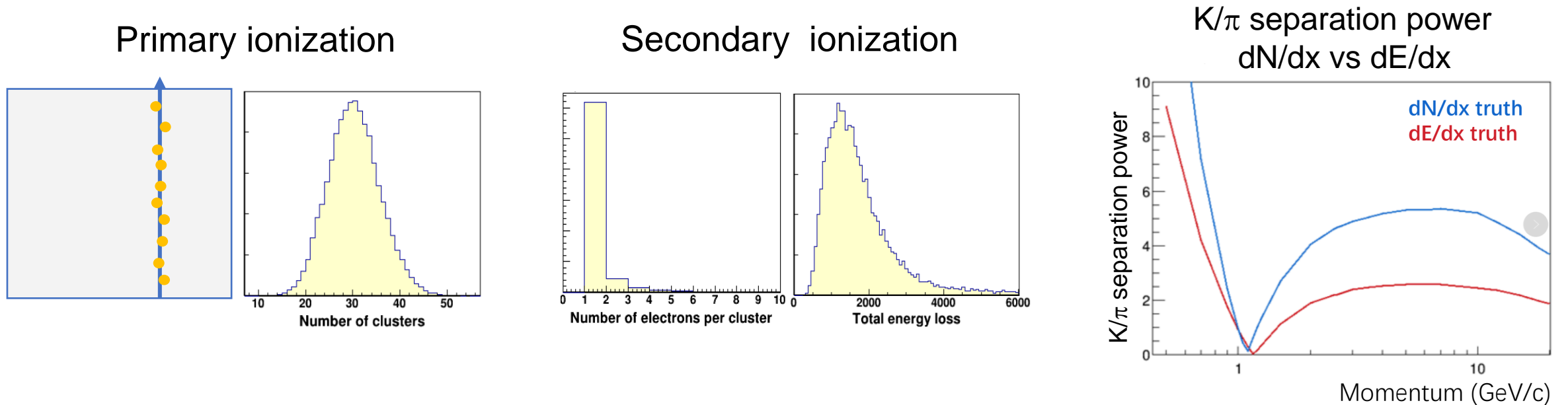


# CEPC the 4<sup>th</sup> conceptual detector



- Tracker with silicon tracker and a drift chamber
- The chamber optimized for PID with **cluster counting** technique
- Up to 20 GeV/c K/ $\pi$  separation power required

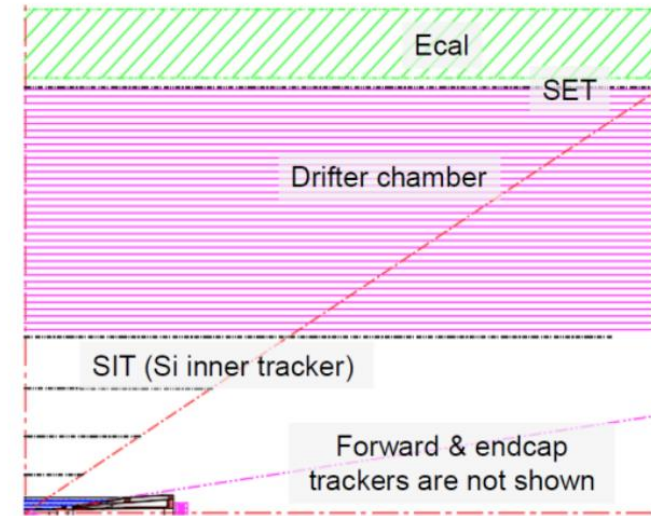
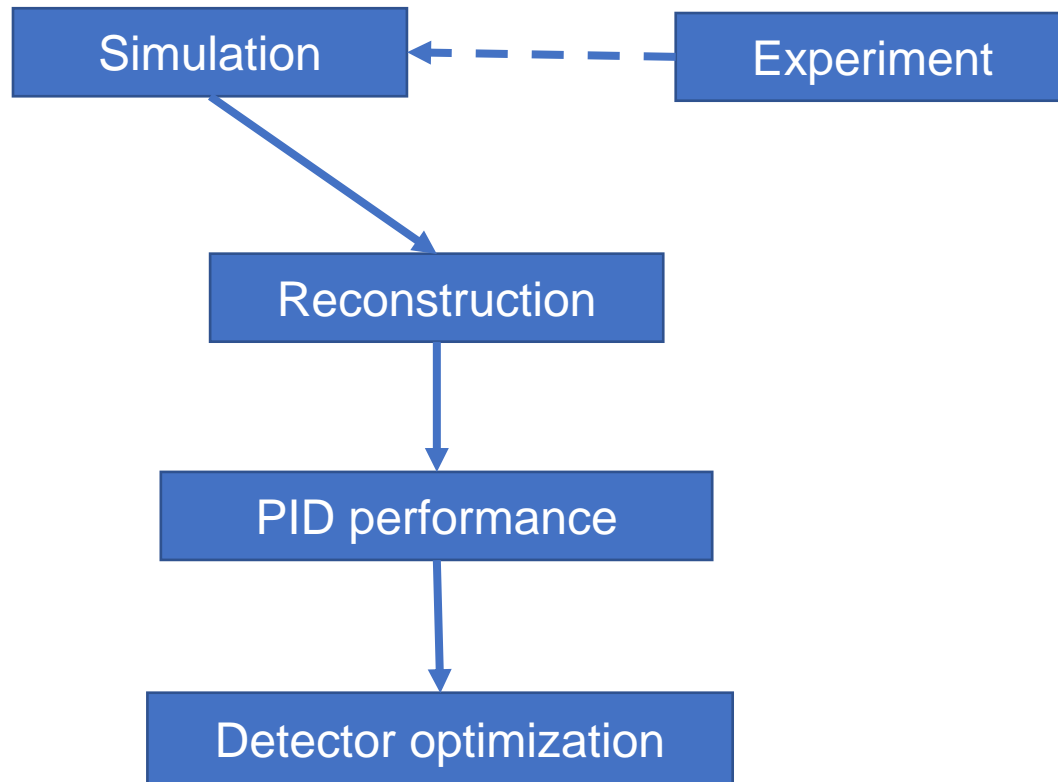
# $dE/dx$ vs $dN/dx$



- $dE/dx$ : Energy loss per unit length, Landau distribution, large fluctuation
- $dN/dx$ : Number of primary ionization clusters per unit length, Poisson distribution, small fluctuation  $\rightarrow$  **cluster counting** technique

In theory,  $dN/dx$  has a significant advantage over  $dE/dx$ .

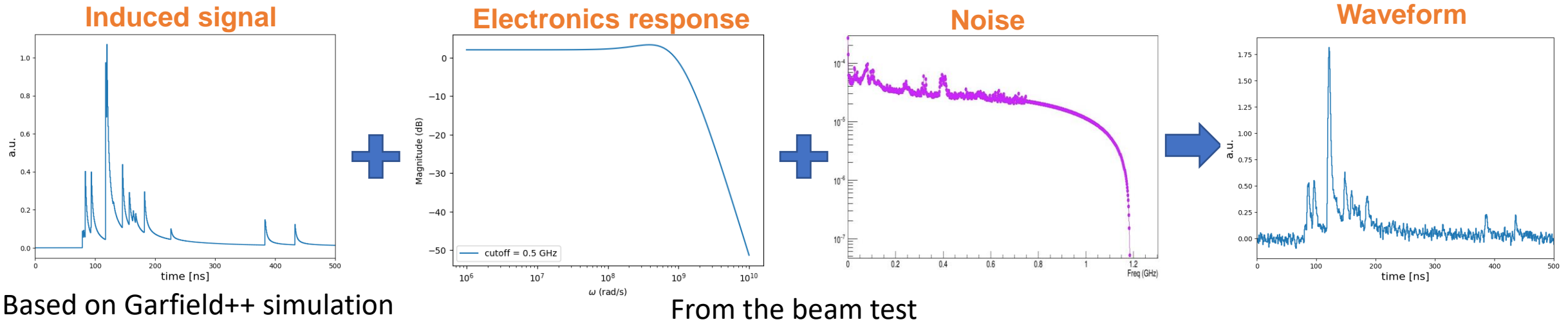
# workflow and DC preliminary design



Preliminary DC parameters	
Inner radius	800 mm
Outer radius	1800 mm
Cell size	18 mm × 18 mm
Gas mixture	He/iC <sub>4</sub> H <sub>10</sub> =90:10

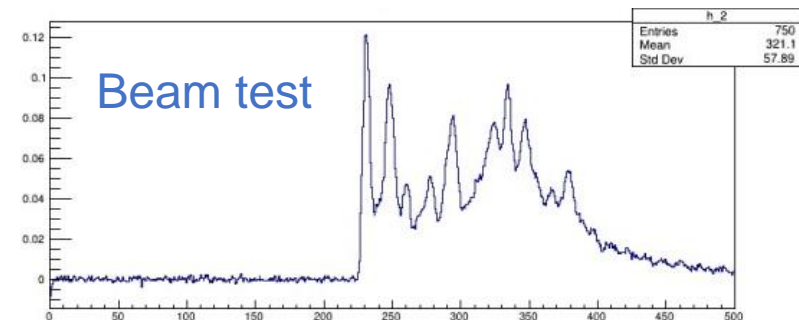
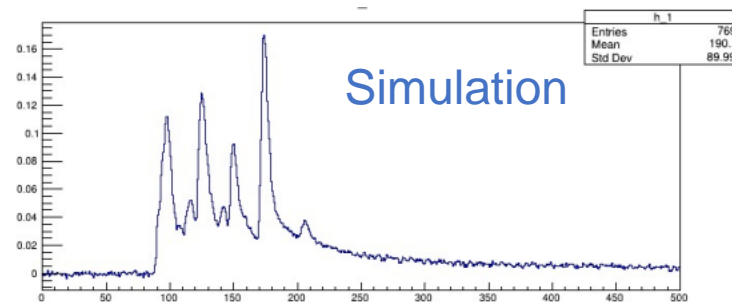
# Waveform-based full simulation

## Simulation process



a toolkit for simulation of detectors based on ionization measurement in gases and semiconductors.

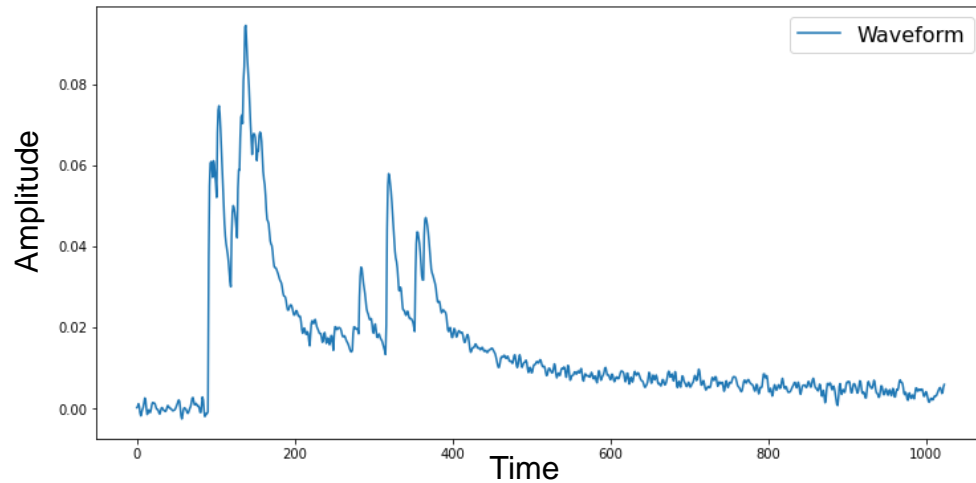
## Good consistency between simulation and data



# Reconstruction algorithm

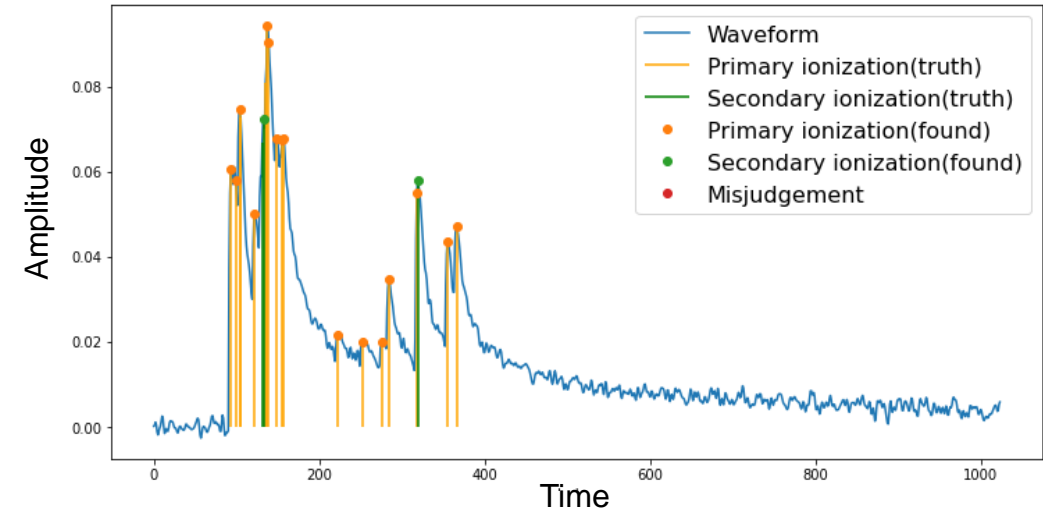
## Step1. Peak Finding

Discriminate peaks (both primary and secondary) from the noises



## Step2. Clusterization:

Determine the number of clusters ( $N_{cls}$ ) from the detected peaks



➤ Two methods under study

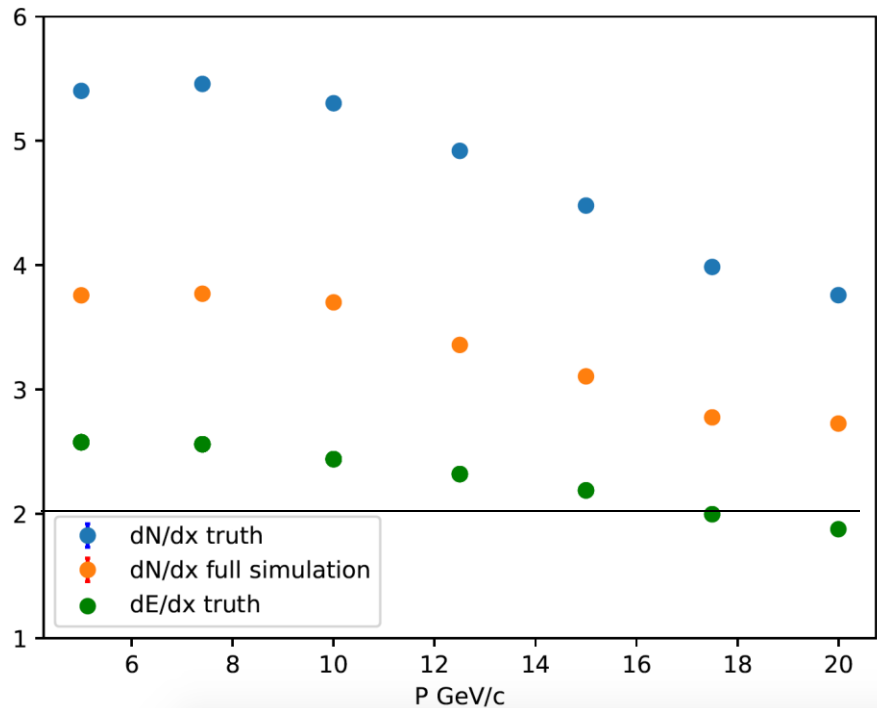
Classical method (developed): Derivative-based peak finding + clusterization with peak merge

Deep learning based algorithm (ongoing): Peak finding with LSTM + clusterization with DGCNN



# $K/\pi$ separation power with Classical method

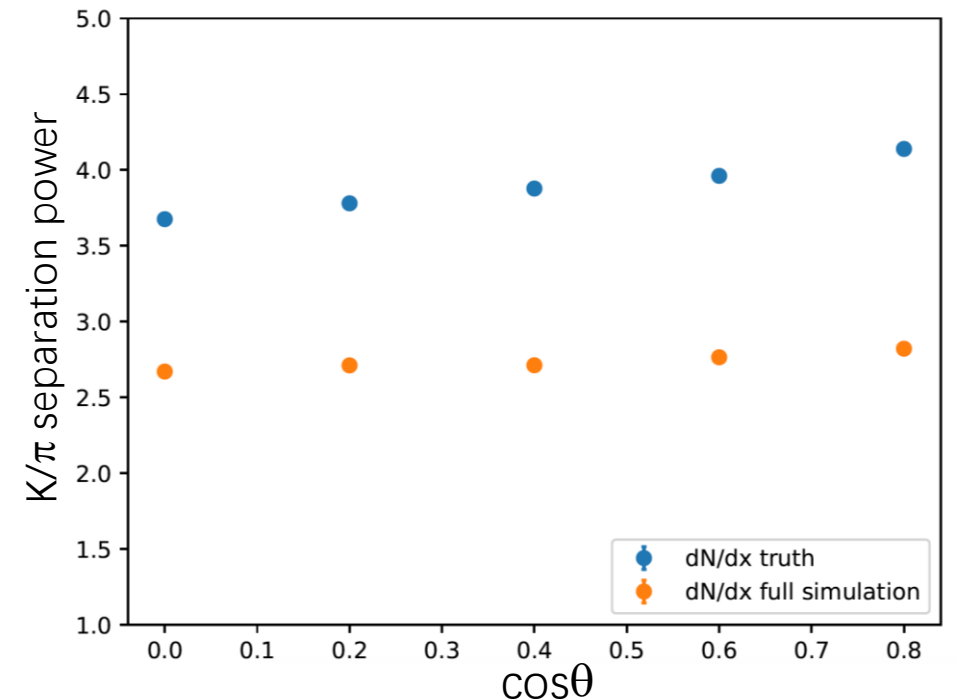
$K/\pi$  separation power vs  $P$  (1m track length,  $\cos\theta=0$ )



Separation power

$$S = \frac{\left| \left( \frac{dN}{dx} \right)_{\pi} - \left( \frac{dN}{dx} \right)_{K} \right|}{(\sigma_{\pi} + \sigma_K)/2}$$

$K/\pi$  separation power vs  $\cos(\theta)$

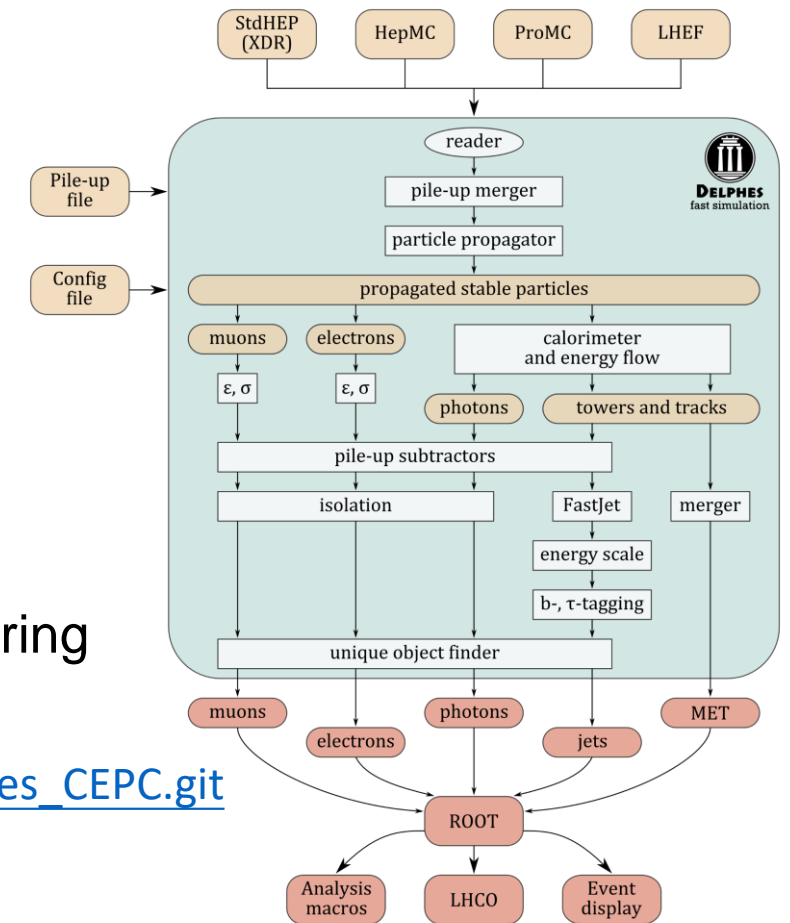


$2\sigma$   $K/\pi$  separation power is reached up to 20 GeV/c

Deep learning based algorithm (under development) is expected to provide better performance

# Fast simulation with Delphes

- Delphes is a modular framework that simulates the response of a multipurpose detector
  - $10^2 \sim 10^3$  faster than the fully GEANT based simulations
  - Sufficient and widely used for phenomenological studies
- For simulations of the CEPC 4<sup>th</sup> concept detector :
  - Detector layout based on preliminary optimization
  - A dedicated PID module (dN/dx and TOF) developed
  - Consistent workflow for lepton/photon isolation and jet-clustering
  - ...
- More details in github repository: [https://github.com/oiunun/Delphes\\_CEPC.git](https://github.com/oiunun/Delphes_CEPC.git)



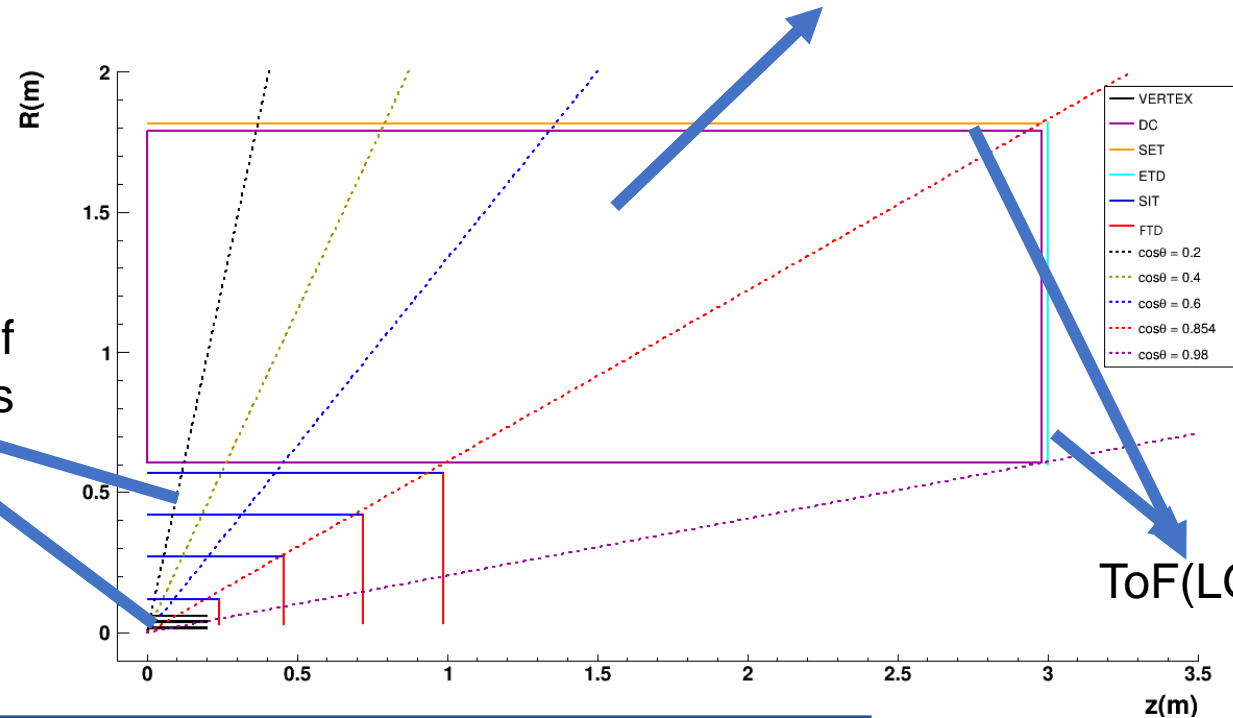
*J. High Energ. Phys.* **2014**, 57 (2014)

# Detector configuration

## Tracker system:

- DC: 0.6 m-1.8 m, larger DC, better PID

- Silicon vertex and silicon tracker: provide accurate measurement of charged particle track parameters



ToF(LGAD)  $(\sigma)_{tof} = 30 \text{ ps}$

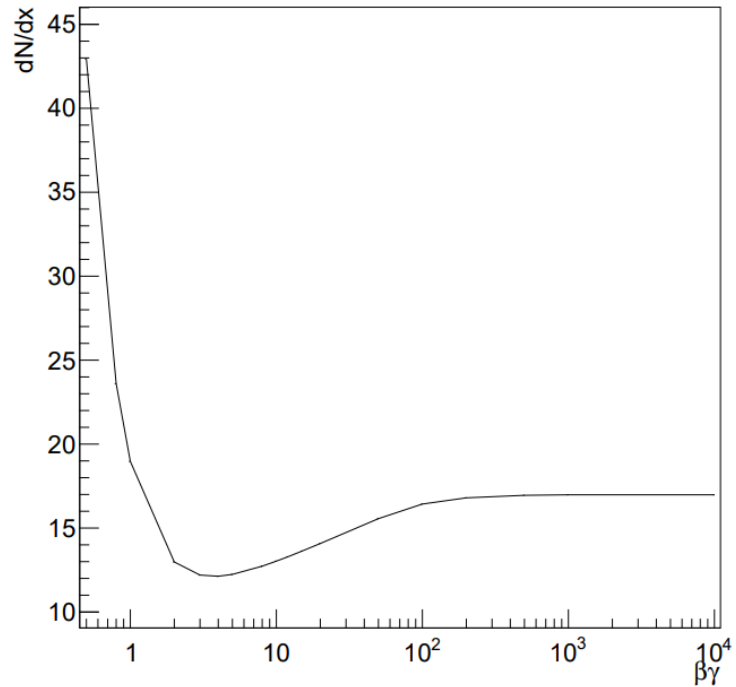
Pt resolution is consistent with full simulation

## Calorimeter system:

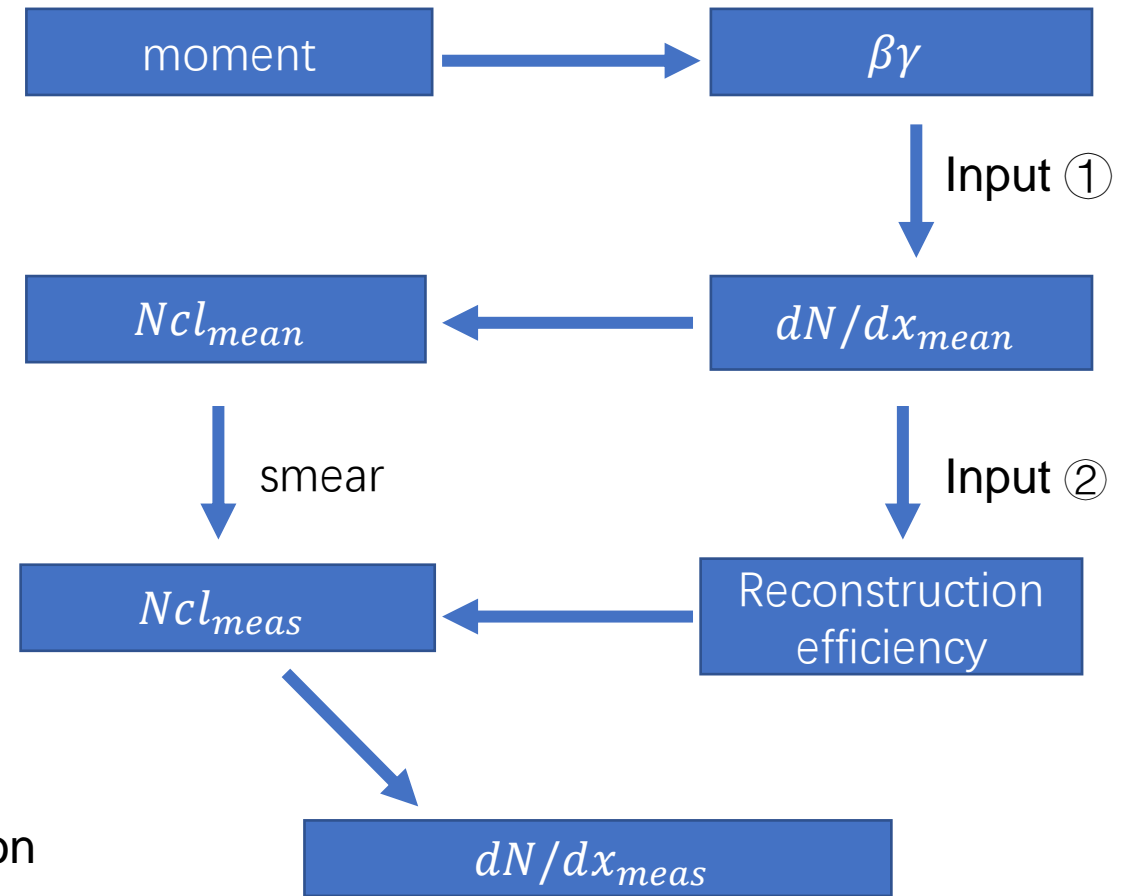
- Preliminary implementation, reasonable resolution achieved. Needs more tuning

# dN/dx model in Delphes

Input ①: mean of dN/dx with  $\beta\gamma$



Input ②: reconstruction efficiency from full simulation



Parameterized simulation of  $dN/dx_{meas}$

# The calculation of the probability

dN/dx + TOF combined chi-square:

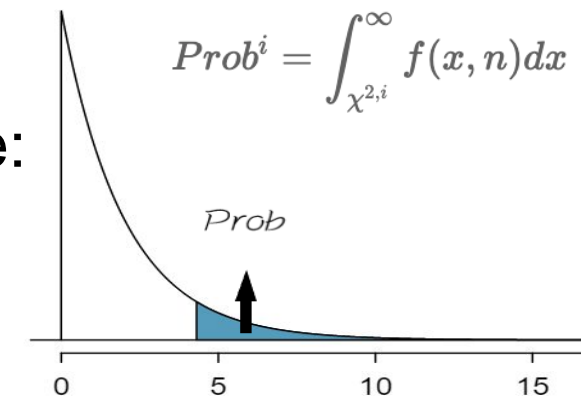
$(\chi^i)^2 = (\chi_1^i)^2 + (\chi_2^i)^2$  (It follows a Chi-square distribution of 2 degrees of freedom)

$$\chi_1^i = \frac{(dN/dx)_{meas} - (dN/dx)_{exp}^i}{(\sigma)_{dN/dx}^i}$$

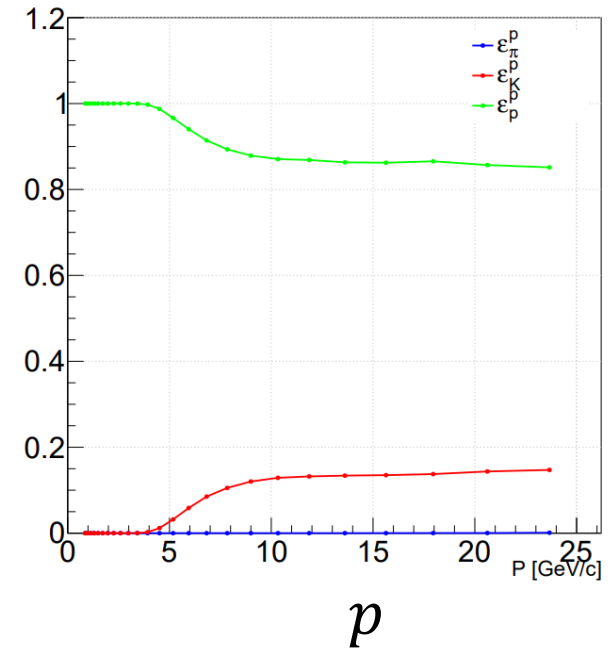
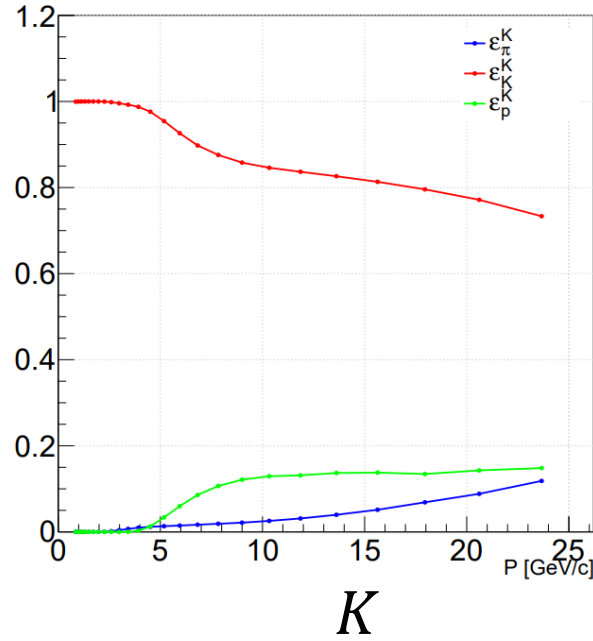
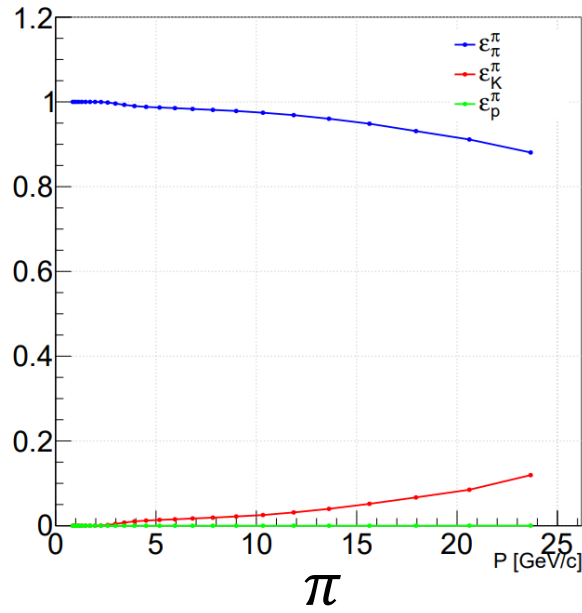
$$\chi_2^i = \frac{(tof)_{meas} - (tof)_{exp}^i}{(\sigma)_{tof}^i}$$

PID selection with probability calculated by chi-square:

- e.g. identified as  $\pi$ :  $\text{Prob}(\pi) > \text{Prob}(K)$  &  $\text{Prob}(\pi) > \text{Prob}(p)$



# PID efficiency



**efficiency** :  $\epsilon_j^i = \frac{n_j^i}{n_{tot}^j}$

- $n_j^i$ : number of j being identified as i.
- $n_{tot}^j$ : number of j

Good PID performance up to 20 GeV/c

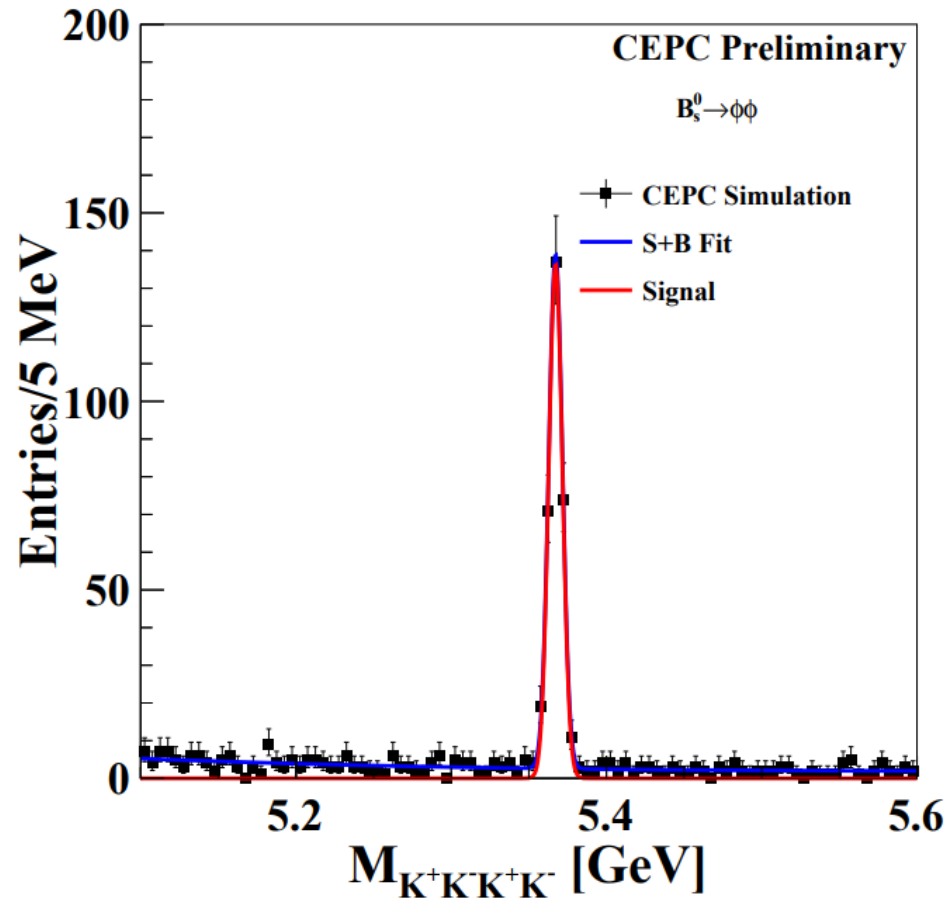
# PID performance with $B_S^0/B^0$ decays

- $B_S^0 \rightarrow \phi\phi, \phi \rightarrow K^+K^-$
- $B^0/B_S^0 \rightarrow hh, h = \pi, K$
- Background:  $Z \rightarrow b\bar{b}$  ( $7 \times 10^8$ )

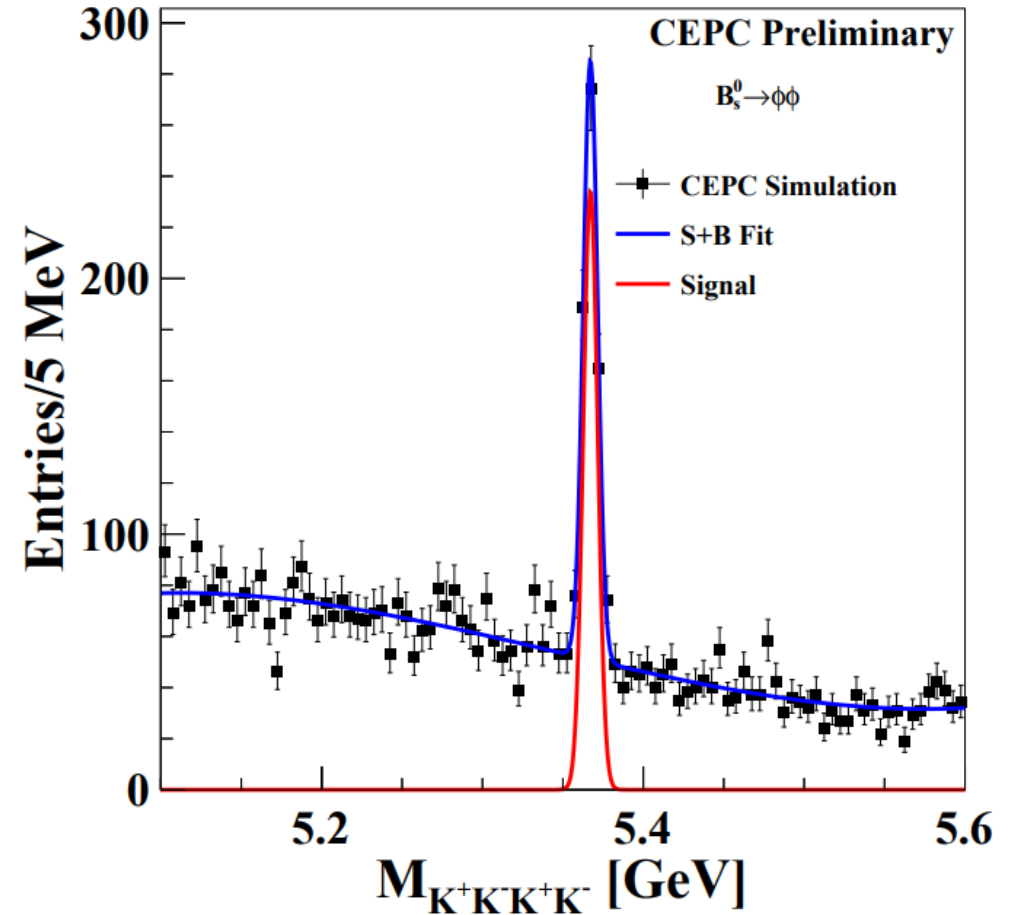
channel	Sample size	Tera-Z yield
$B_S^0 \rightarrow \phi\phi, \phi \rightarrow K^+K^-$	630	561,600
$B^0 \rightarrow \pi^+\pi^-$	2,900	2,585,142
$B^0 \rightarrow K^+K^-$	44	39,222
$B_S^0 \rightarrow \pi^+\pi^-$	98	87,360
$B_S^0 \rightarrow K^+K^-$	3,739	3,333,051

# Demonstration of the significance of PID: $B_s^0 \rightarrow \phi\phi$

With PID



Without PID

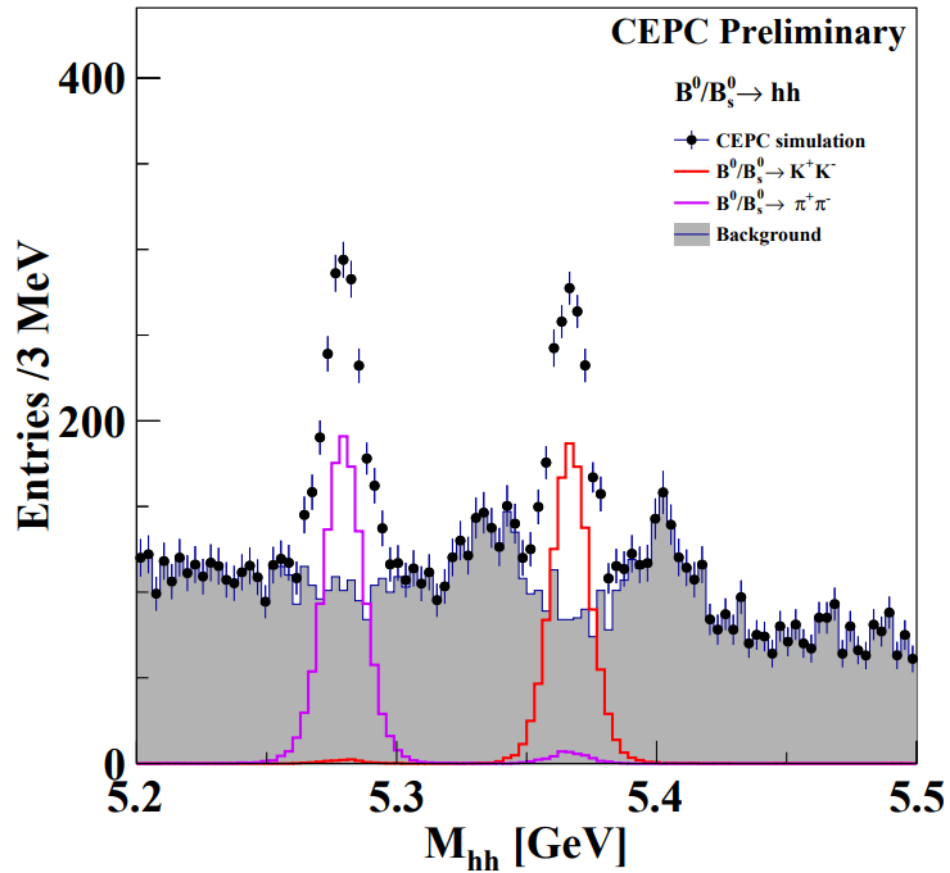


Improved signal sensitivity with PID

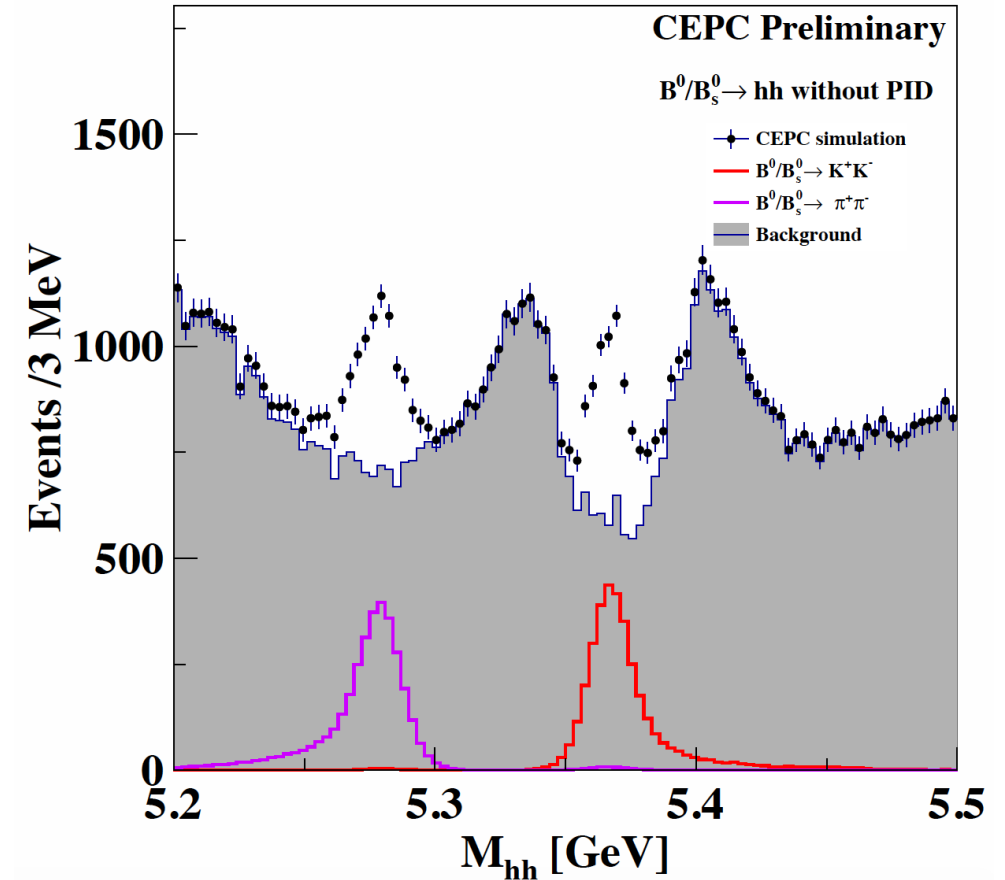


# Demonstration of the significance of PID: $B^0/B_s^0 \rightarrow hh$

With PID



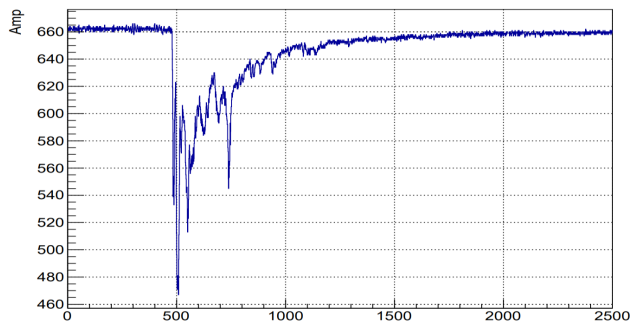
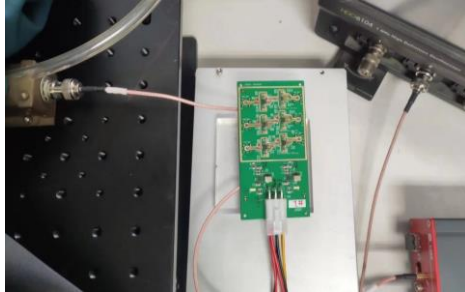
Without PID



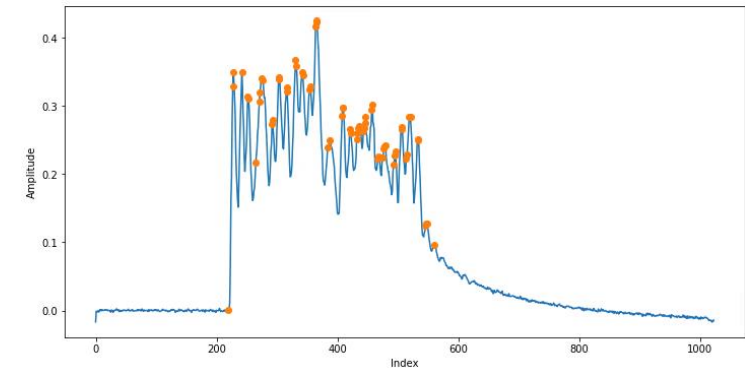
Improved signal sensitivity with PID

# Activities on prototype test

- Prototype test at IHEP
  - A preamplifier is designed and tested with a drift tube using Sr-90 source
  - Preliminary tests show a promising future
- Further tests and optimization are on going



- Beam test organized by INFN group
- Cooperation between IHEP and INFN
  - Data taking
  - Data analysis
  - Optimizing DC simulation
  - Plan to apply ML algorithm on online FPGA



# Summary

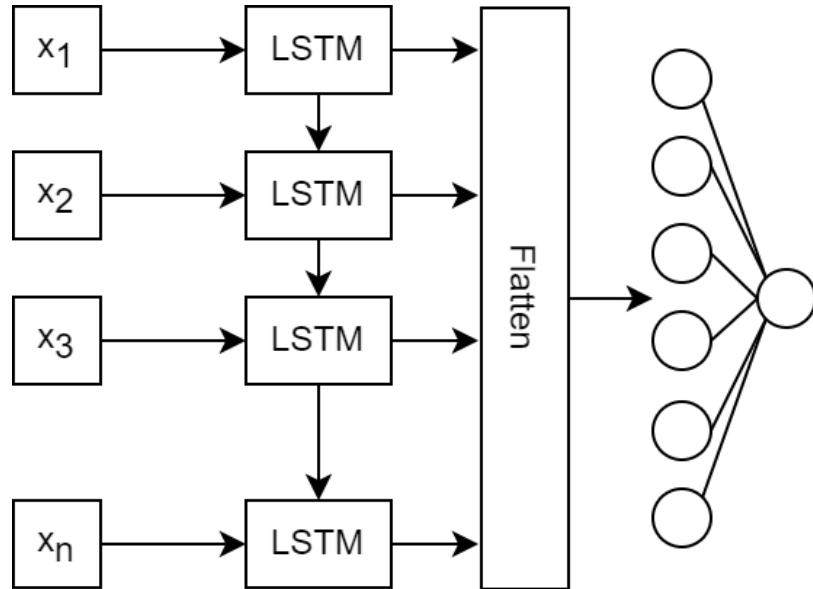
- A drift chamber with cluster counting technique for PID is proposed for CEPC the 4<sup>th</sup> conceptual detector
- $2\sigma$   $K/\pi$  separation power is reached up to 20 GeV/c with waveform-based full simulation
- Physics sensitivity is improved significantly with PID in flavor physics with Delphes fast simulation
- Prototype test is ongoing

Thanks!

# Backup

# Deep learning based algorithm

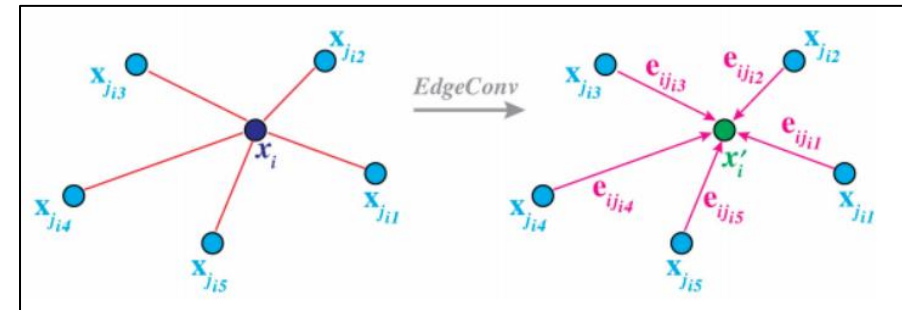
## Peak finding with LSTM



- With Long short-term memory (LSTM) model
- Labels: Signal or Noise.
- Features: Slide windows of peak candidates, with a shape of (15, 1)

⇒ **A binary classification problem**

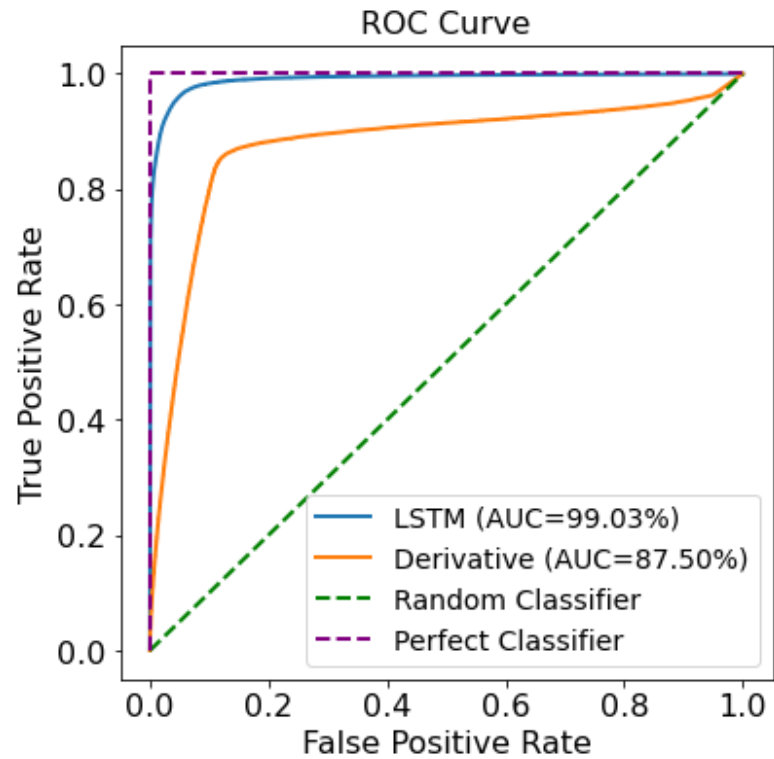
## Clusterization with DGCNN



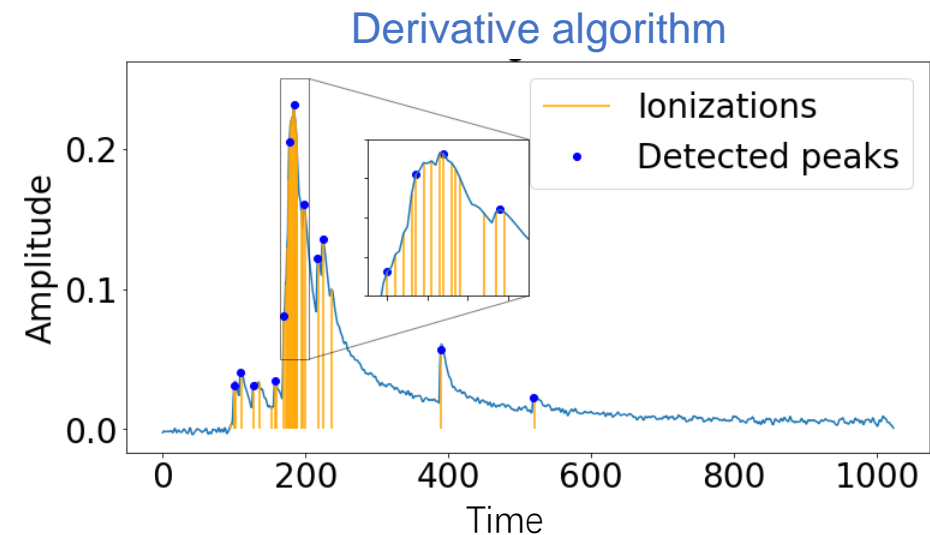
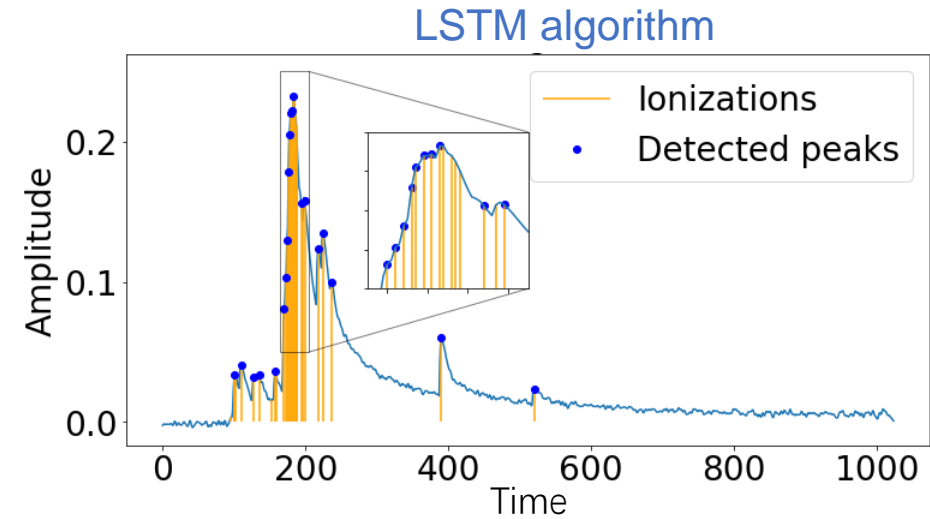
arXiv: 1801.07829

- GNN-based architecture: DGCNN
- Message passing through neighbor nodes  $\Leftrightarrow$  Clusterization of electron timings from the same primary cluster

# Comparison between LSTM and derivative model

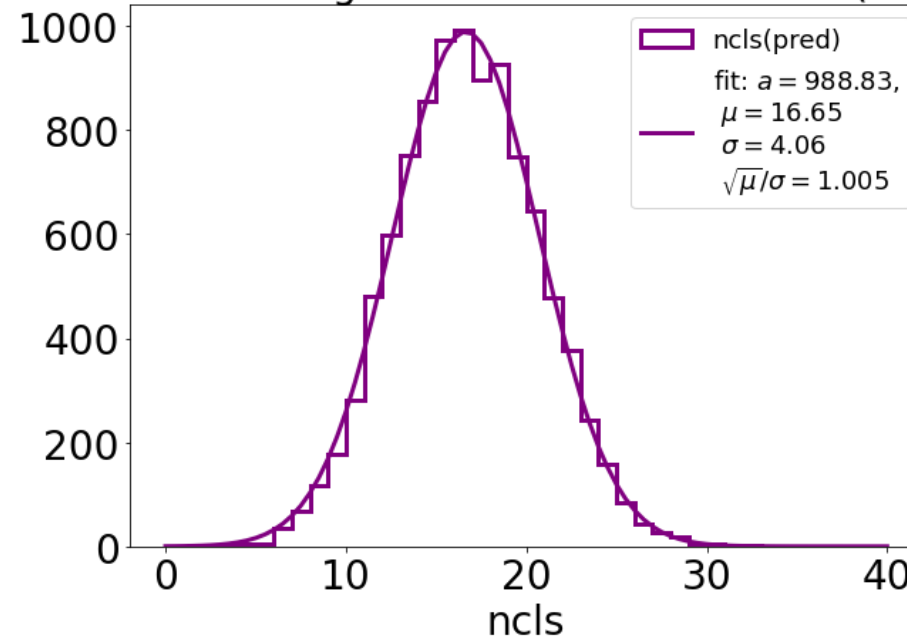


Better AUC for LSTM, due to the better pile-up recovery ability of the LSTM model



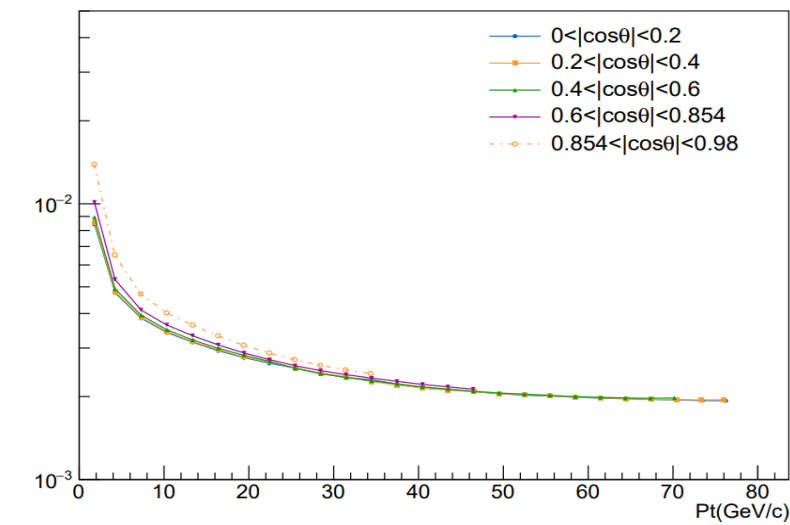
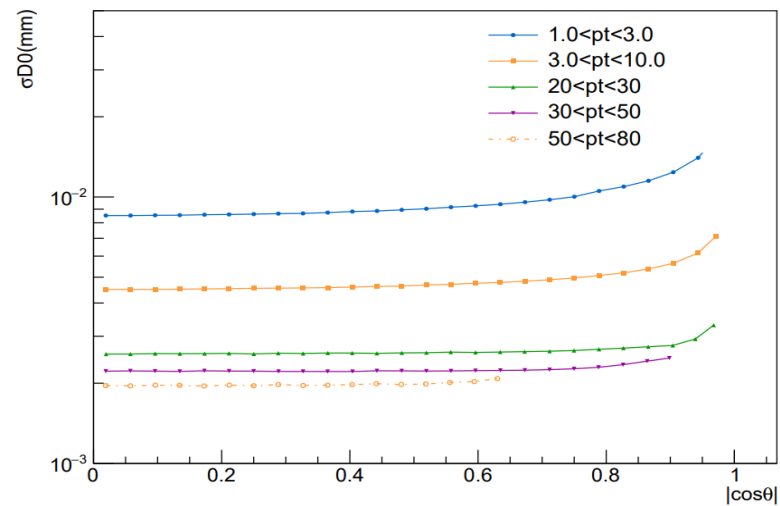
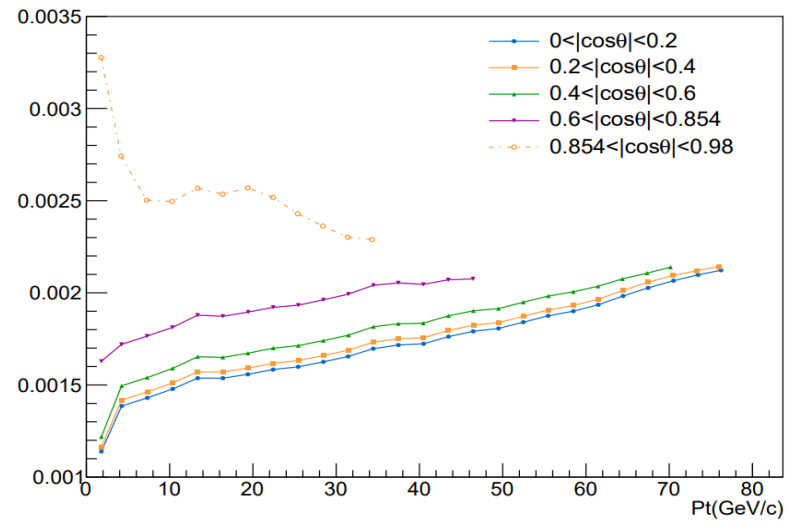
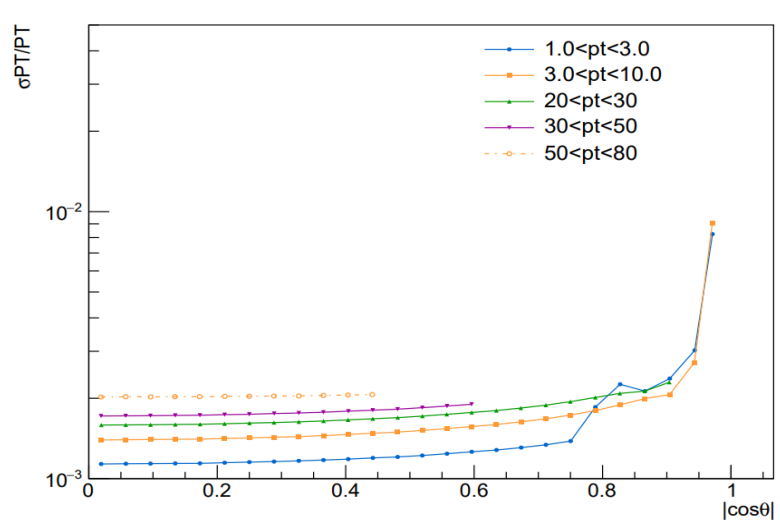
# Performance with deep learning based algorithm

LSTM Peak Finding + DGCNN Classification (thr=0.61)

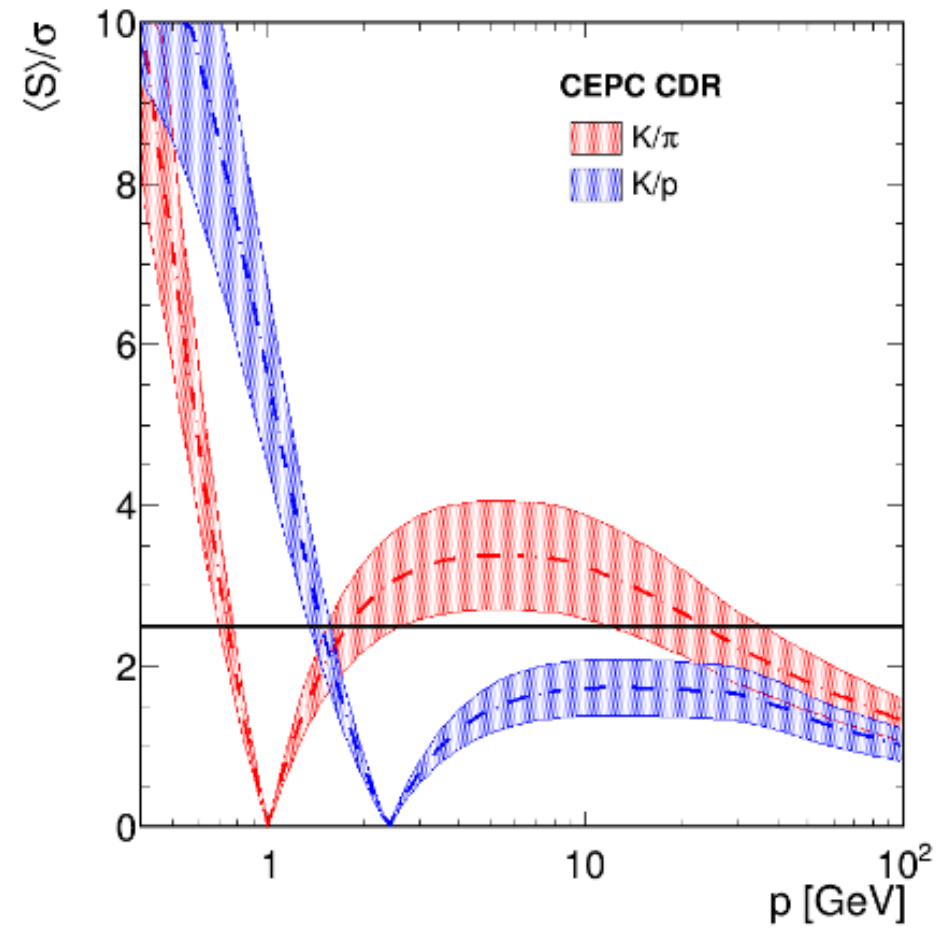


Method		$\mu$	$\sigma$	$\sigma/\mu$
Input		16.53	3.93	23.8%
Output	Classical algorithm	18.67	4.60	24.6%
	ML	16.65	4.06	24.4%

# Tracking resolution

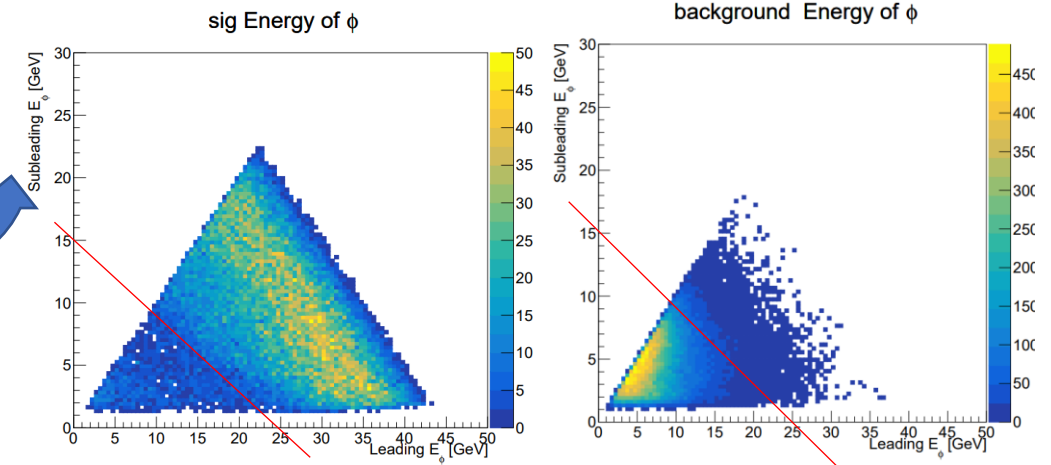
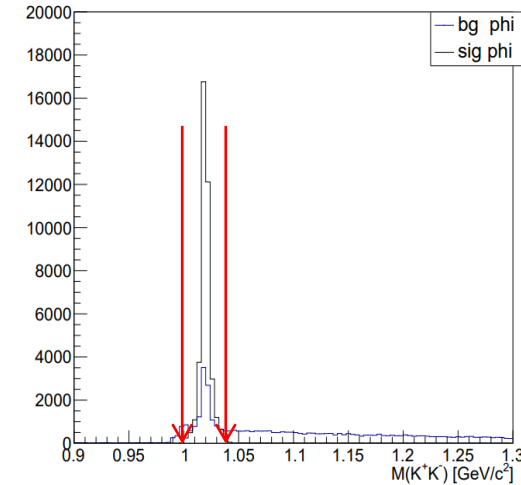






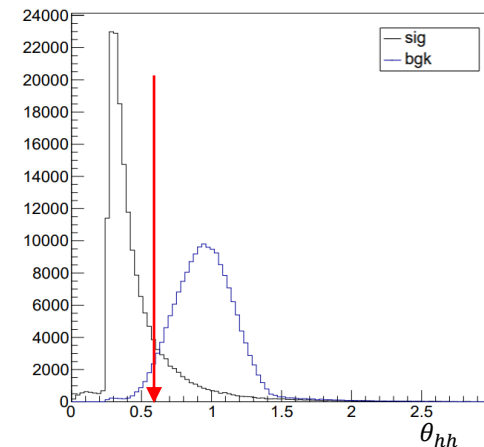
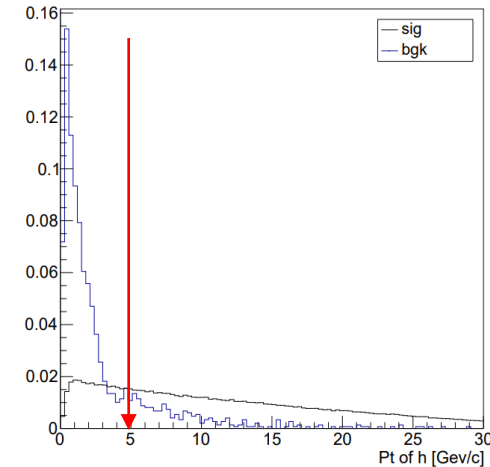
# Event selection for $B_S^0 \rightarrow \phi\phi$

- $Z \rightarrow b\bar{b} \rightarrow di - jet$ , so the following selections is done in each jet
- And the  $M_{\phi\phi}$  in  $[5.1, 5.6]$  is retained.
- **Final state:  $K^+K^-K^+K^-$**
- Kaon PID(dN/dx +TOF)
  - $Prob_K > Prob_\pi$  &&  $Prob_K > Prob_p$
- $\phi$  reconstruction
  - $|M_{K^+K^-} - m_\phi| < 0.02 \text{ GeV}/c^2$
  - $0.6 \times \text{leading } E_\phi + \text{subleading } E_\phi > 15 \text{ GeV}$



# Event selection for $B_S^0/B^0 \rightarrow hh$

- $Z \rightarrow b\bar{b} \rightarrow di - jet$ , so the following selections is done in each jet
- And the  $M_{hh}$  in  $[5.2,5.5]$  is retained.
- **Final state:**  $K^+K^-/\pi^+\pi^-$
- PID(dN/dx +TOF)
  - K:  $Prob_K > Prob_\pi$  &&  $Prob_K > Prob_p$
  - $\pi$ :  $Prob_\pi > Prob_K$  &&  $Prob_\pi > Prob_p$
- K/ $\pi$  criteria
  - $Pt > 5 GeV$
- Reconstruct  $B^0$  &  $B_S^0$  in  $M_{hh} \in [5.2,5.5] GeV$ 
  - $\theta_{hh} < 0.6$



# Signal samples

Tested with Sr-90 source

