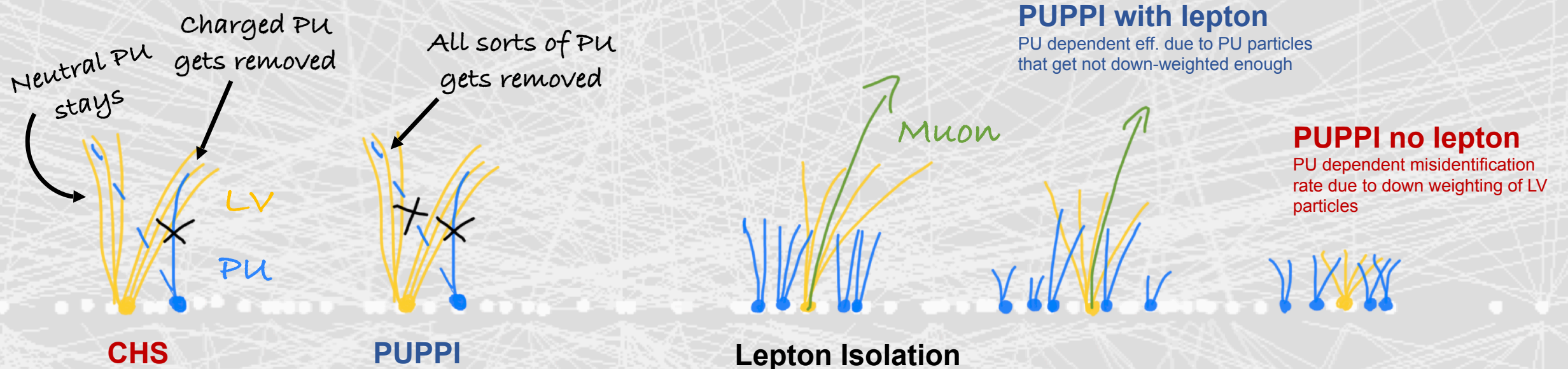


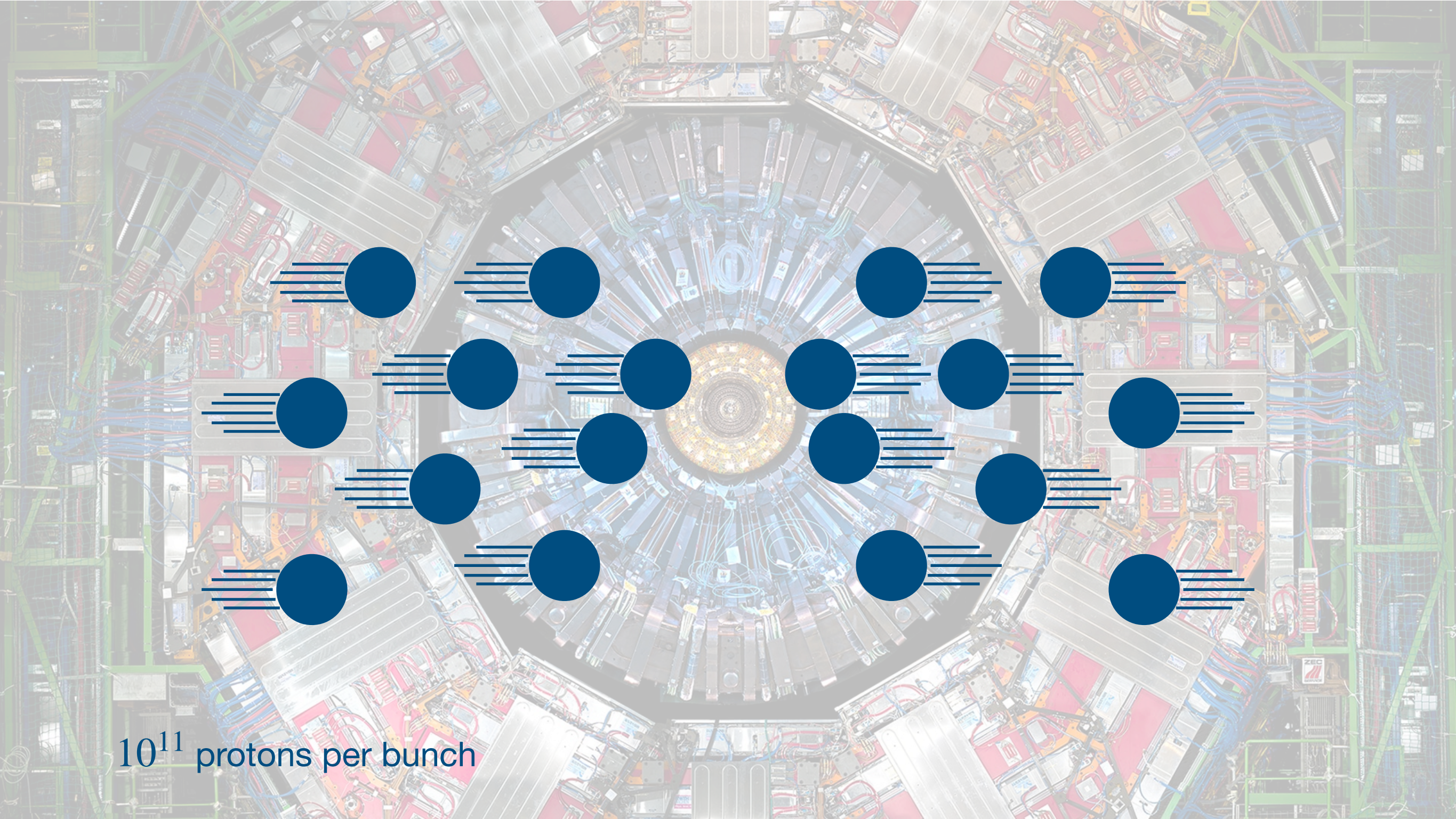


How CMS weeds out particles that pile up

Anna Benecke
UCLouvain

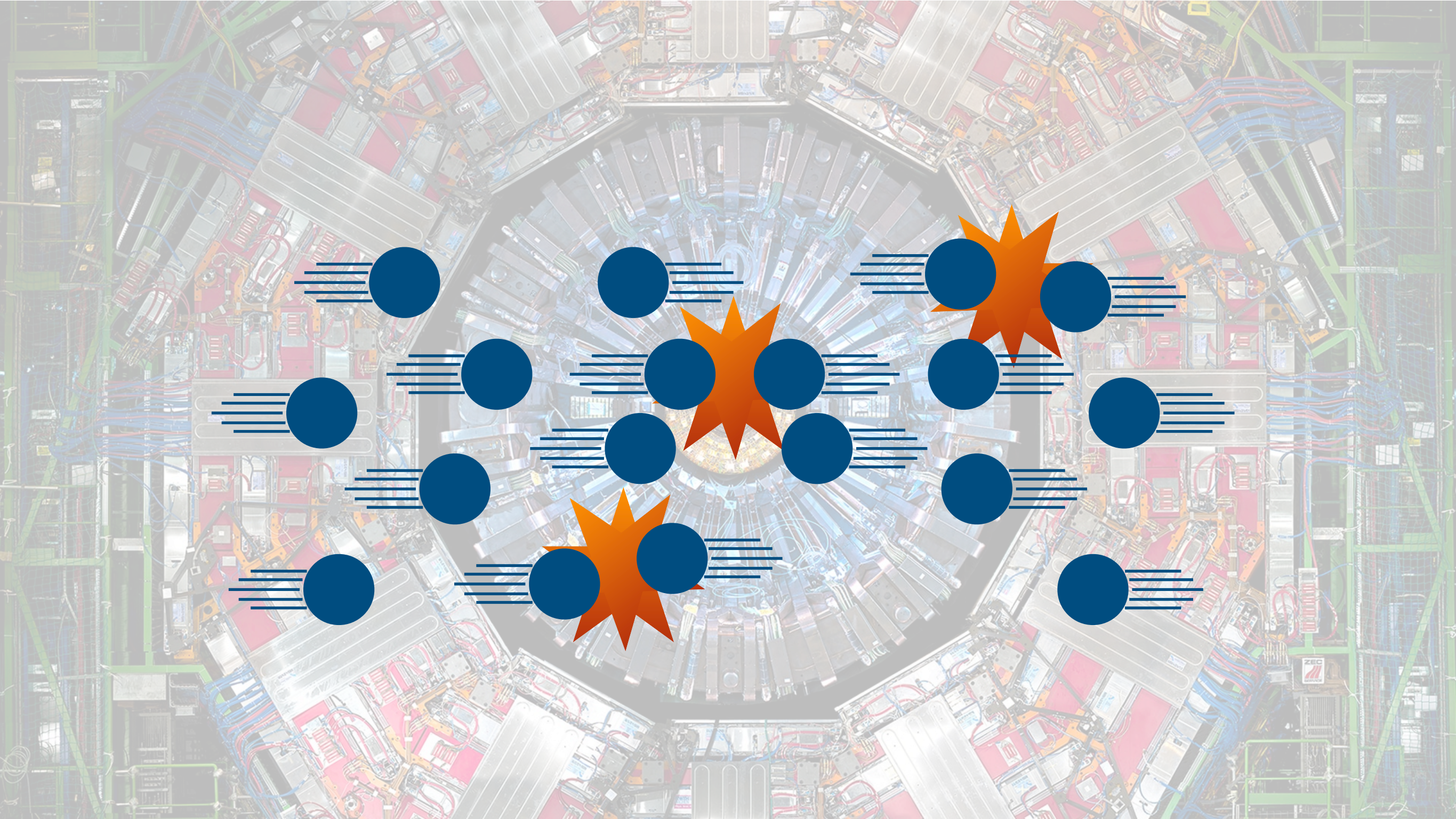


Proton-Proton collisions @ LHC

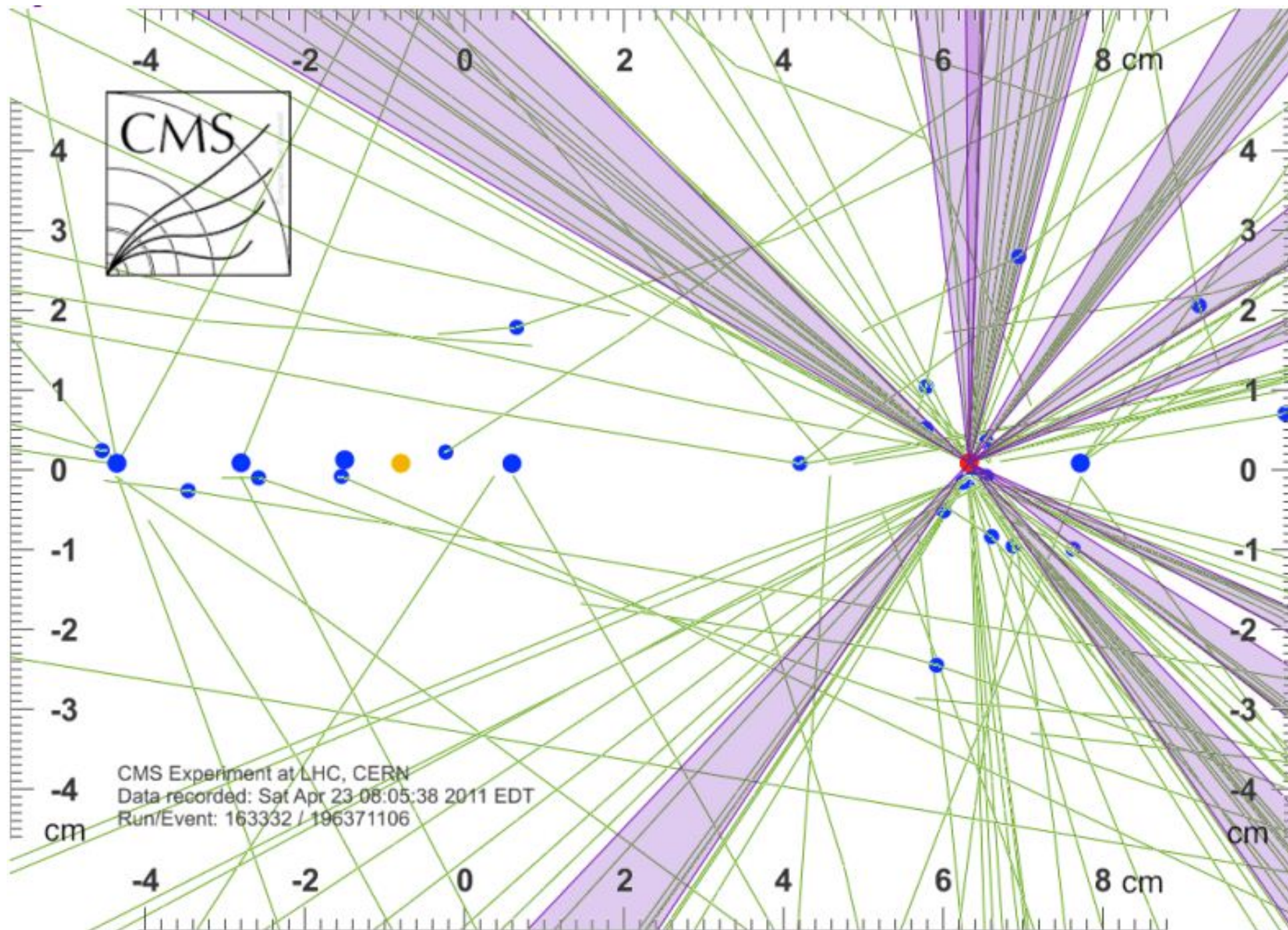


10^{11} protons per bunch

Proton-Proton collisions @ LHC



Proton-Proton collisions @ LHC



Pileup adds additional energy to the whole detector

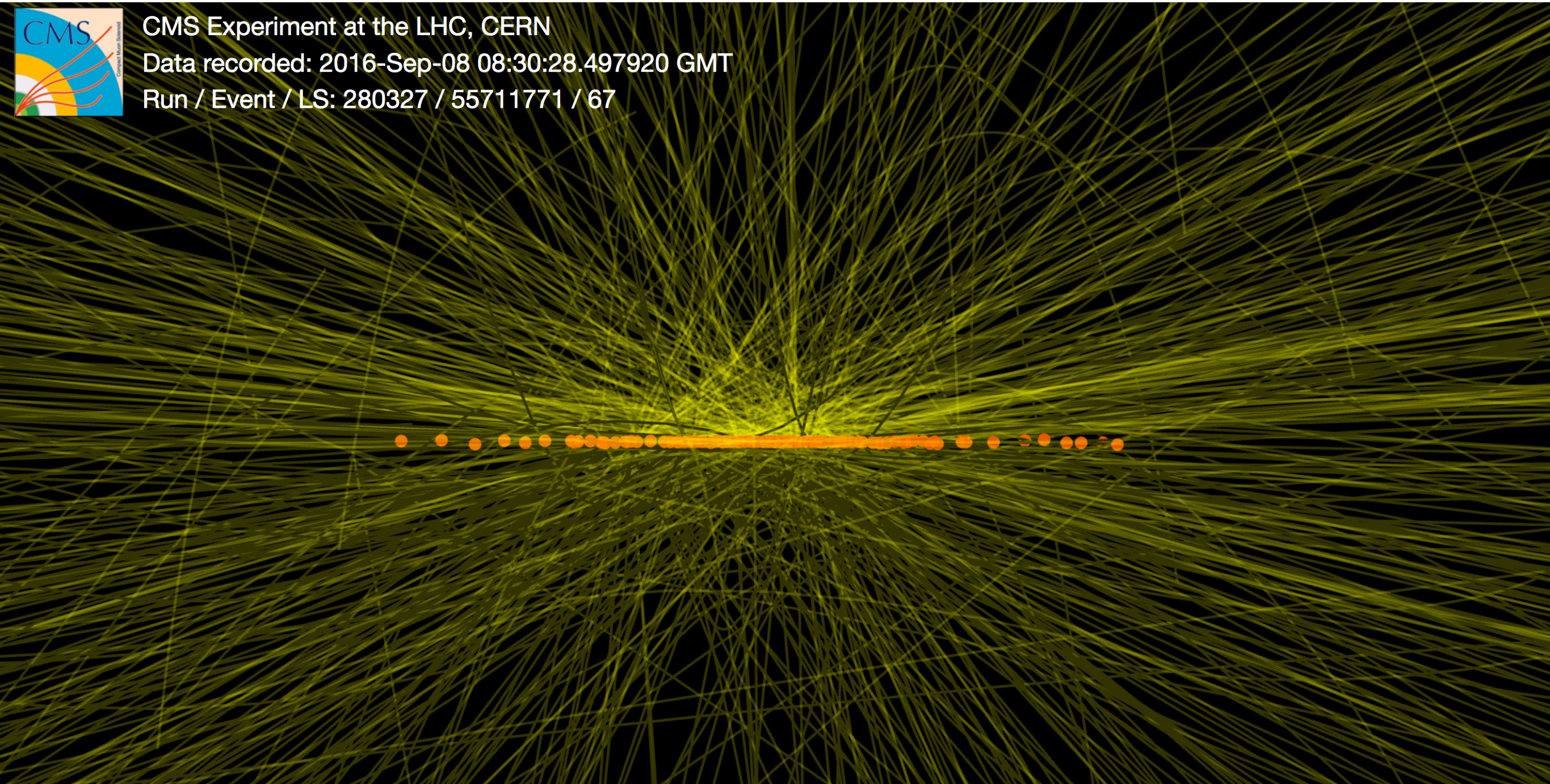
Proton-Proton collisions @ LHC



CMS Experiment at the LHC, CERN

Data recorded: 2016-Sep-08 08:30:28.497920 GMT

Run / Event / LS: 280327 / 55711771 / 67



Pileup adds additional energy to the whole detector

More data, more pileup

$$N_{\text{Events}} = \sigma \int L dt$$

frequency
40 MHz

Number of protons

$$L = \frac{f N_1 N_2}{4\pi\sigma_x\sigma_y}$$

Size of the beam

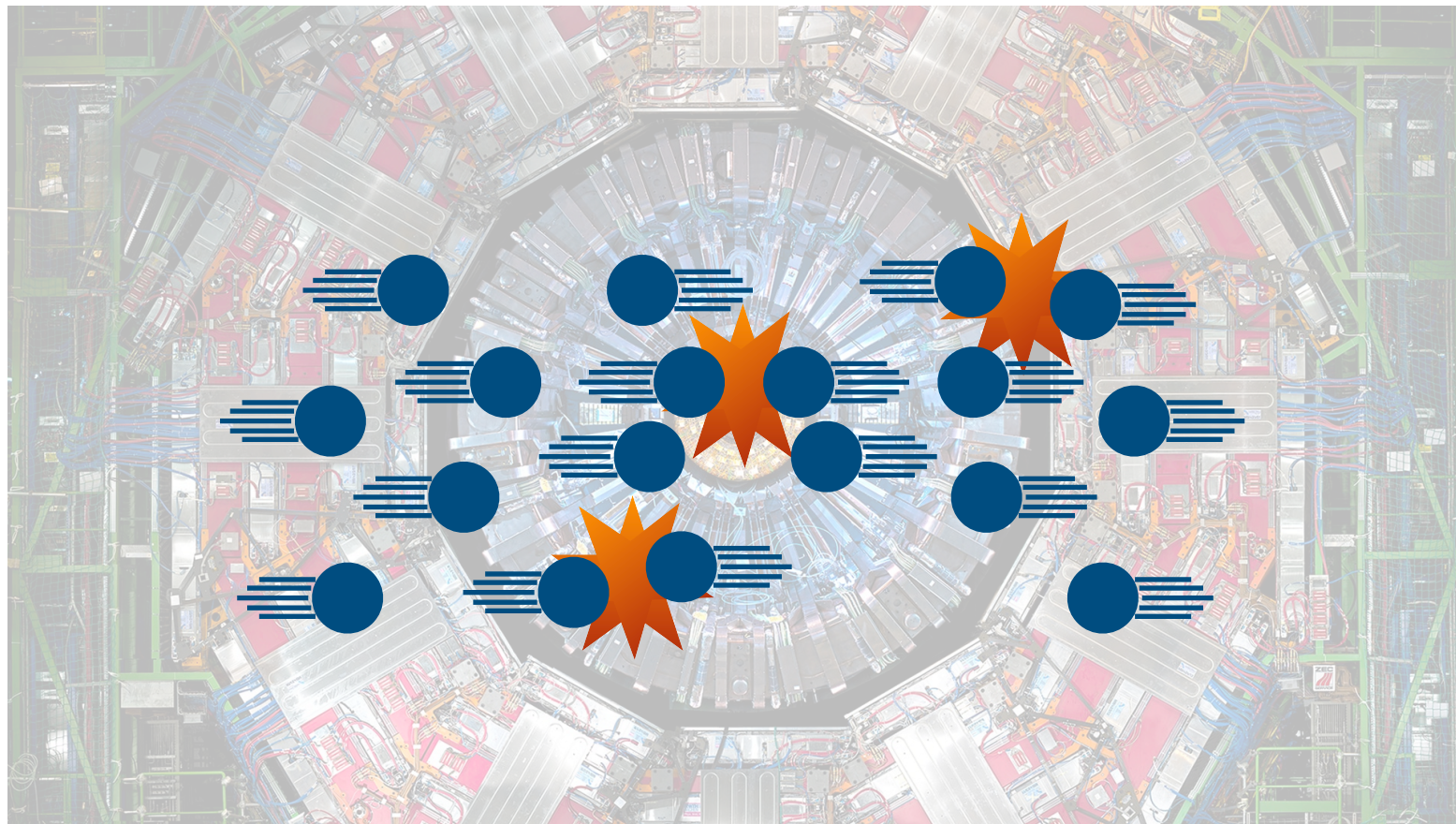
More data, more pileup

$$N_{\text{Events}} = \sigma \int L dt \quad L = \frac{f N_1 N_2}{4\pi\sigma_x\sigma_y}$$

frequency
40 MHz

Number of protons

Size of the beam



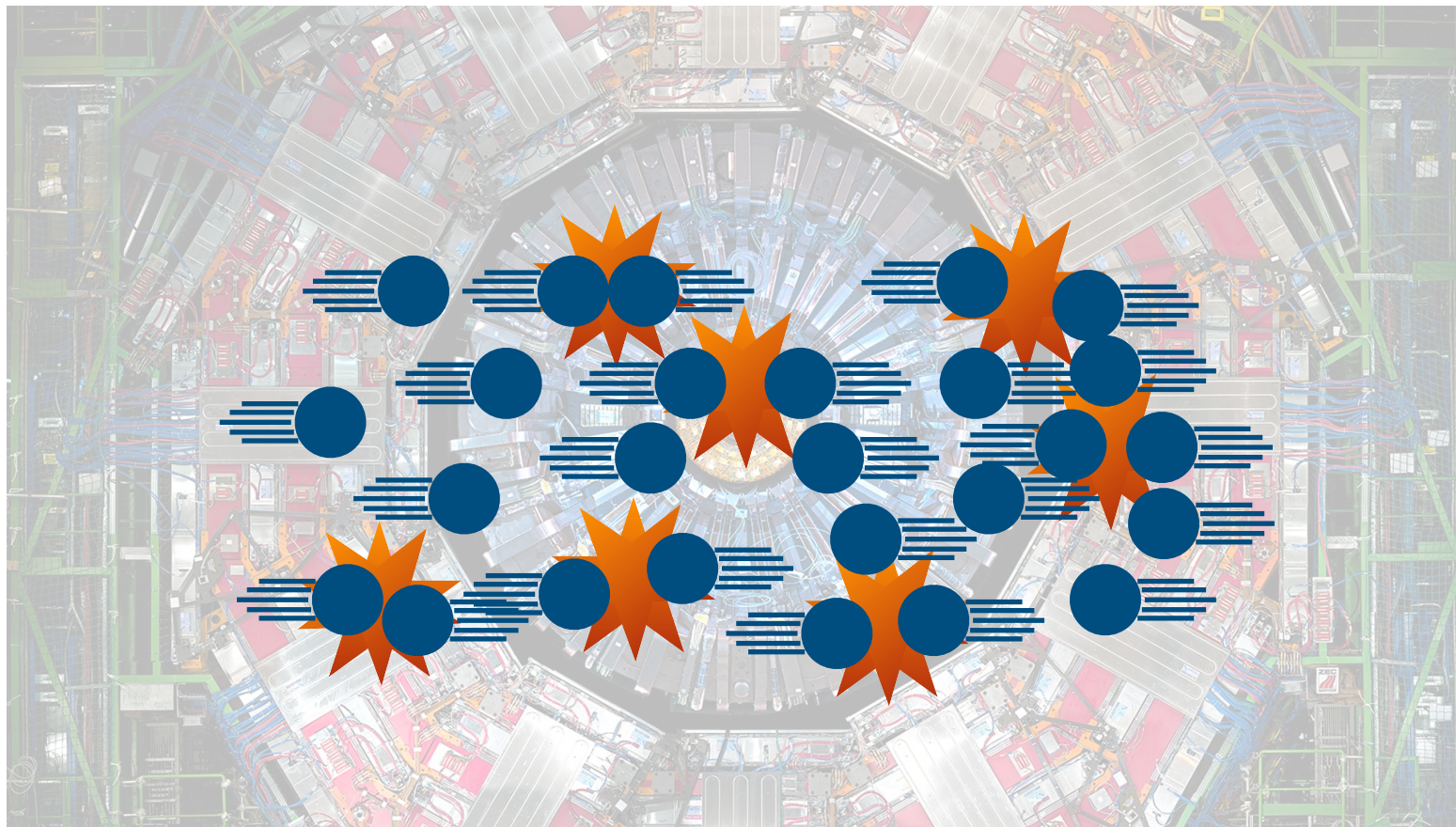
More data, more pileup

$$N_{\text{Events}} = \sigma \int L dt \quad L = \frac{f N_1 N_2}{4\pi \sigma_x \sigma_y}$$

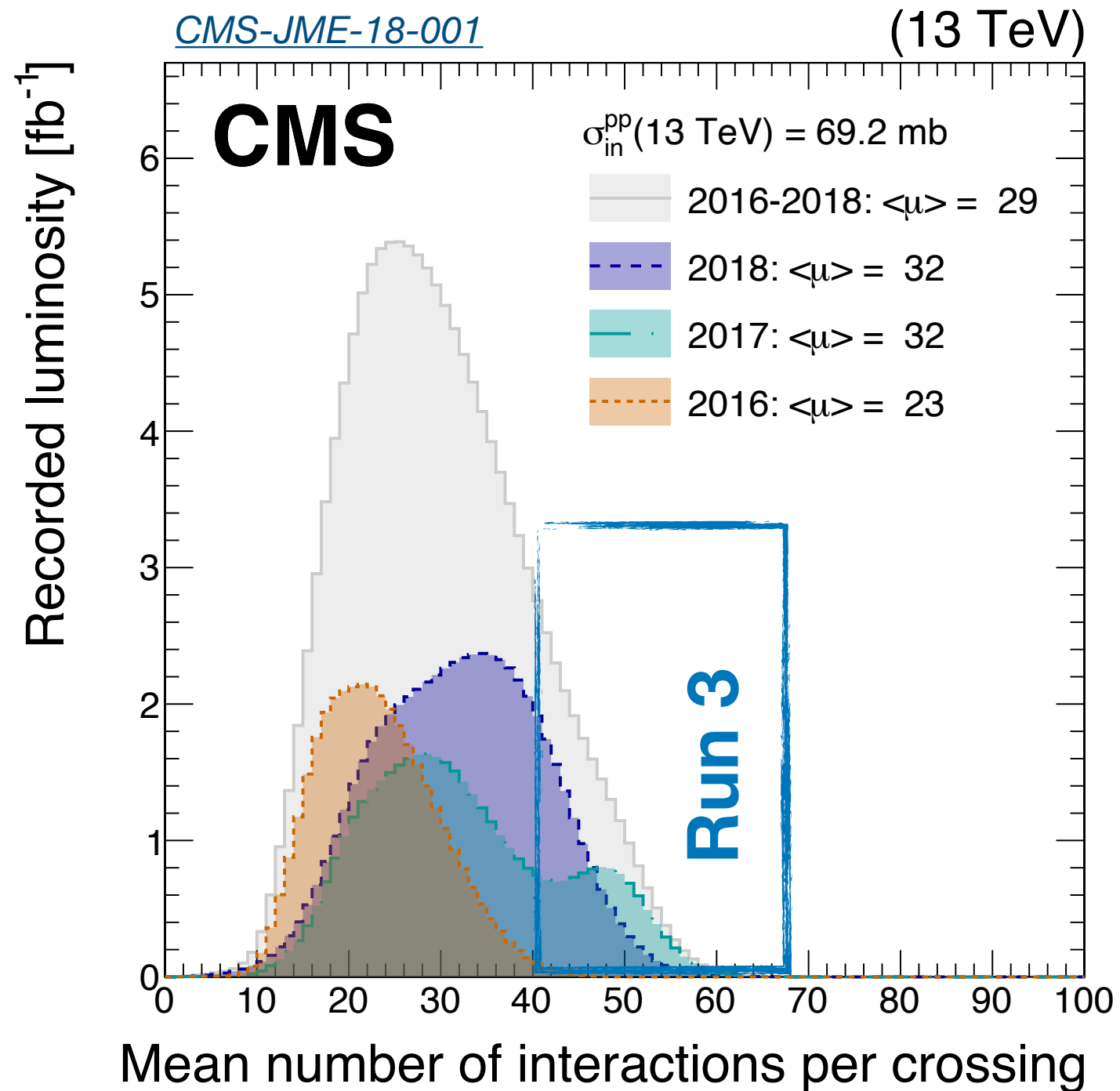
frequency
40 MHz

Number of protons

Size of the beam

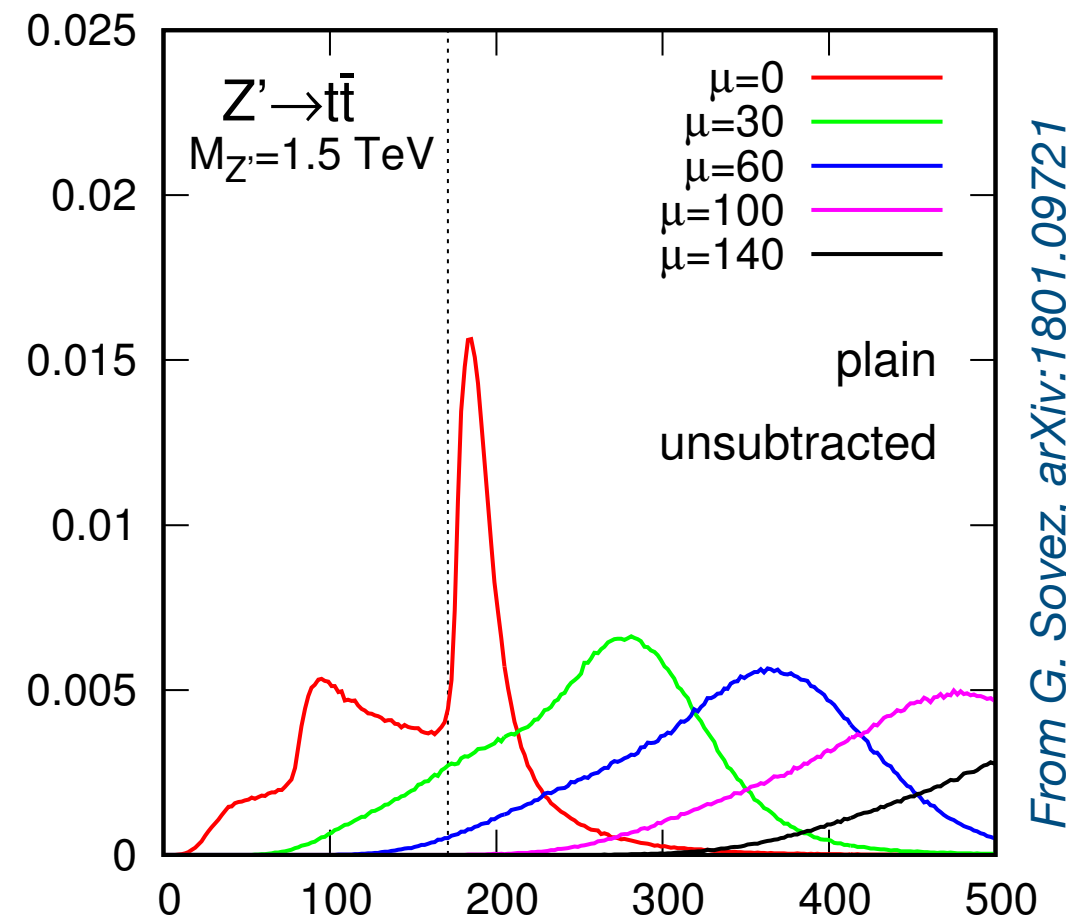
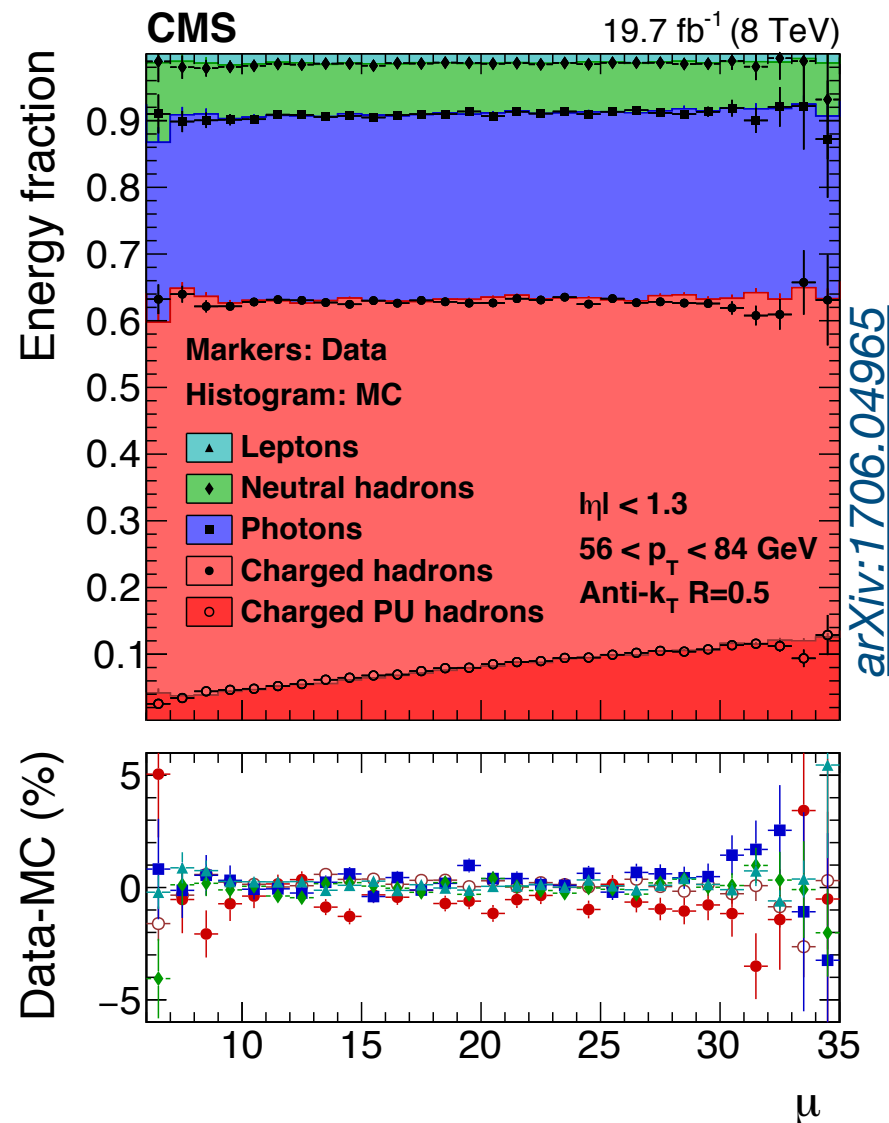


More data, more pileup



140-200

Challenges with pileup

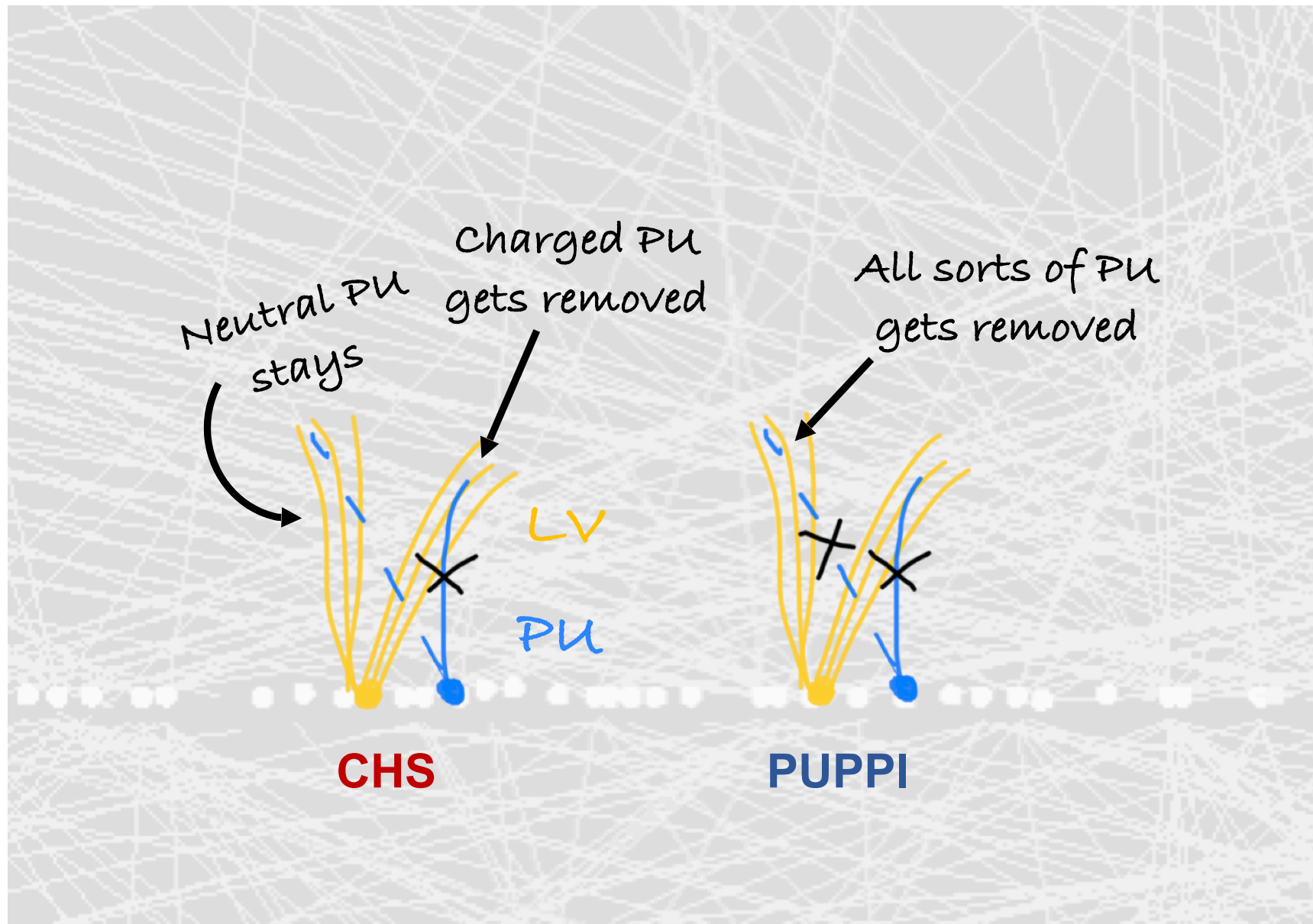


(a) raw, ungroomed jets

From G. Soyez, arXiv:1801.09721

PU affects jet substructure, jet counting, lepton isolation...

Pileup mitigation in CMS

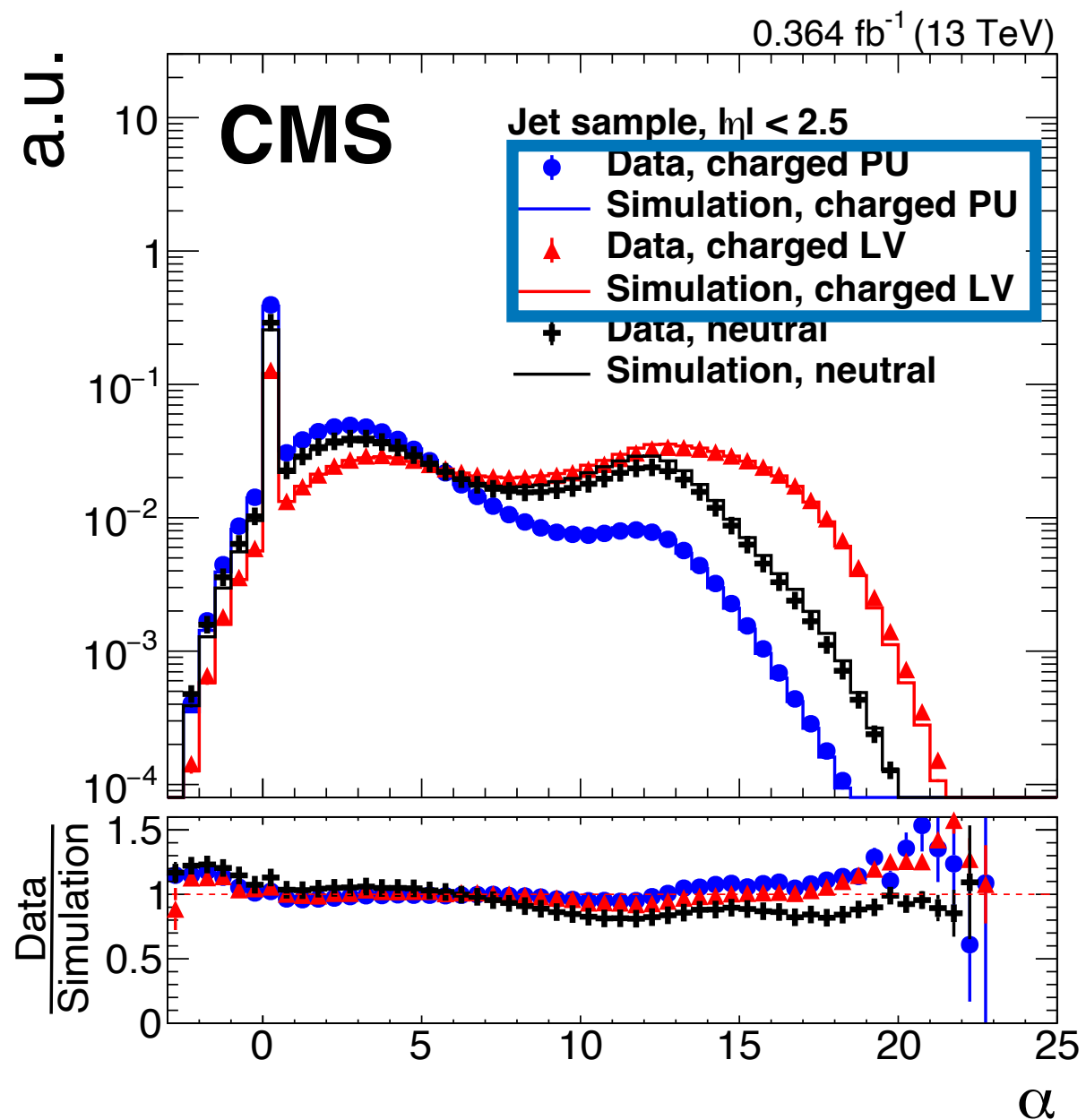


PUPPI in Detail

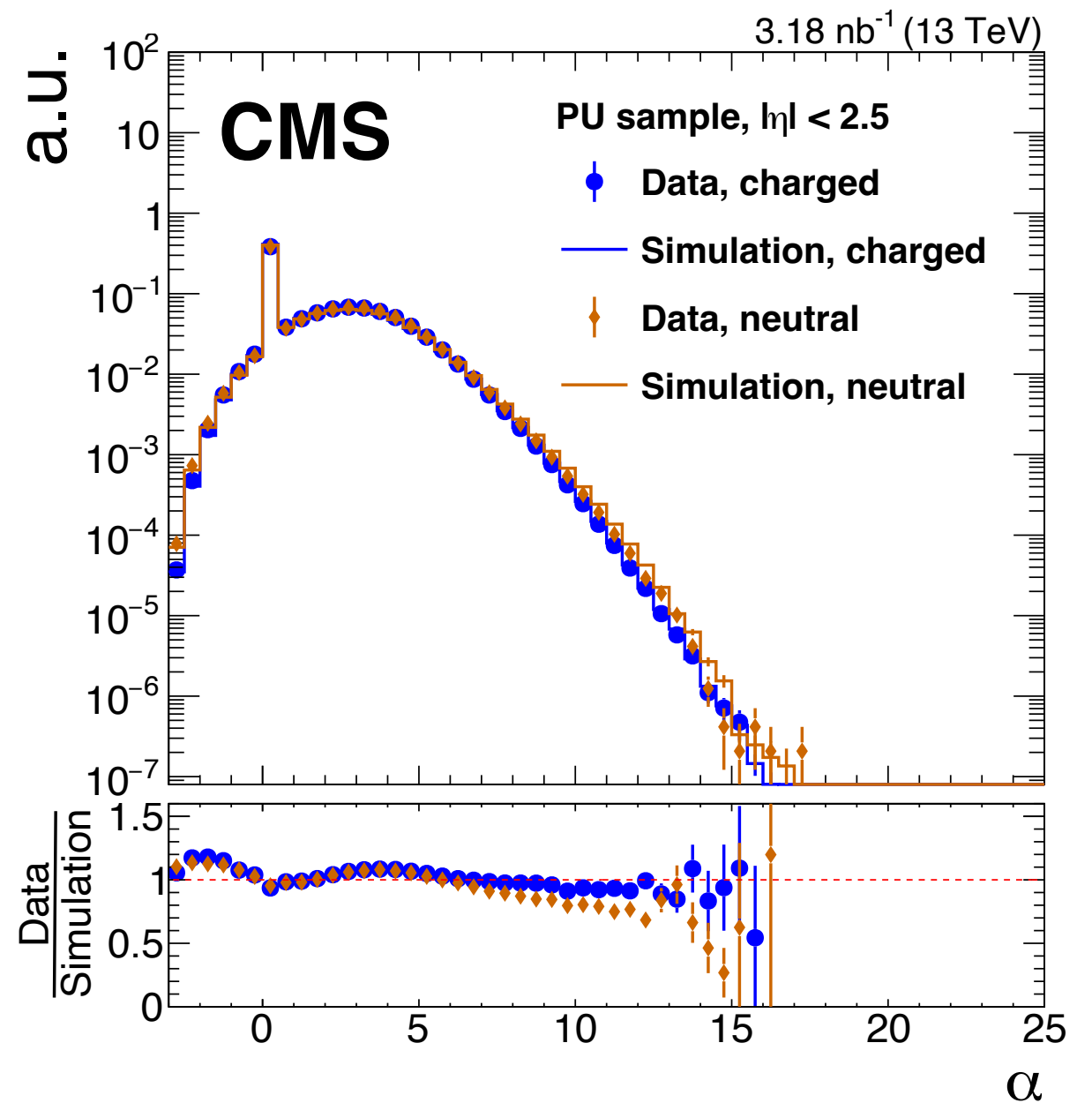


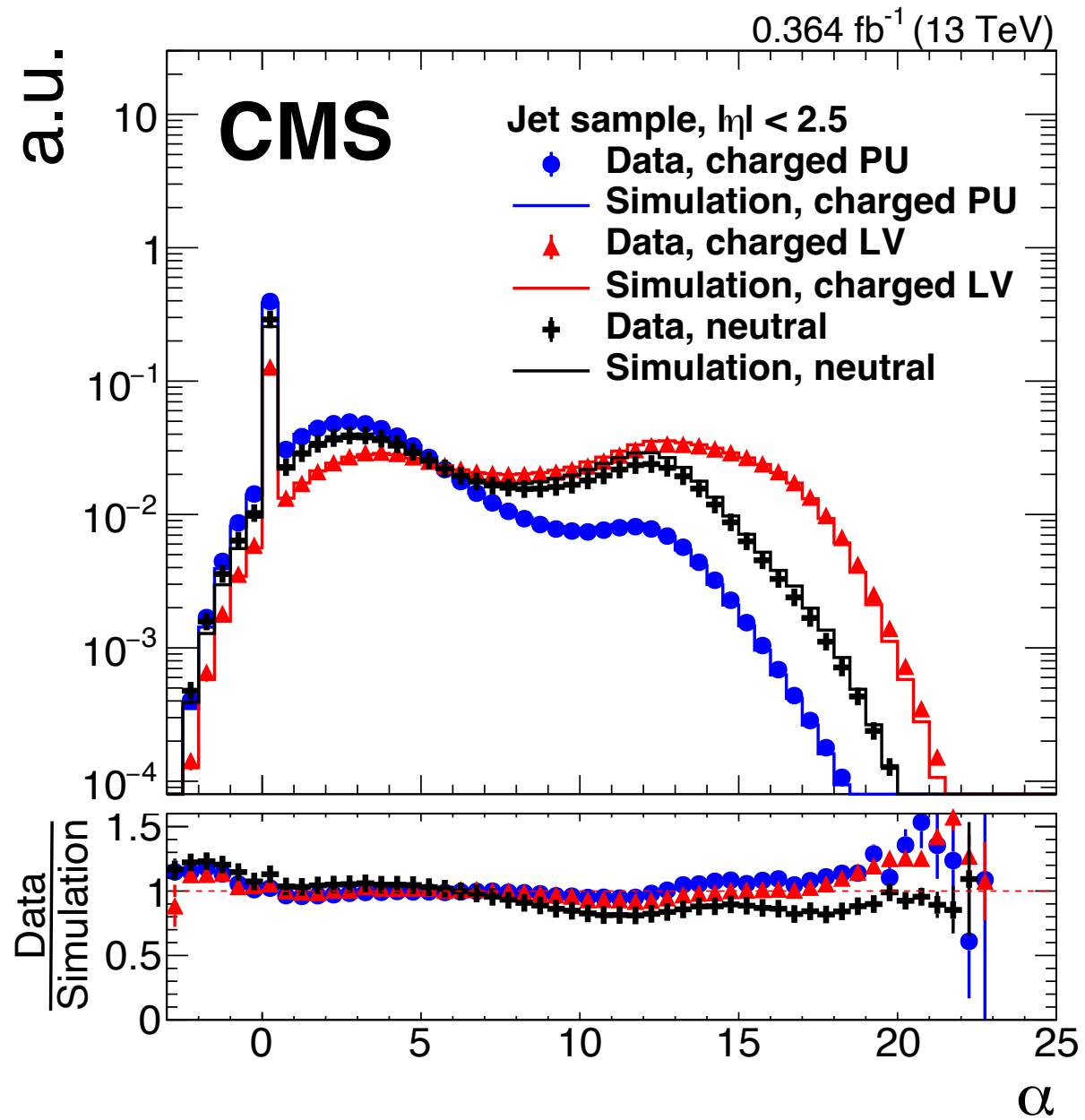


$$\alpha_i = \log \sum_{j \neq i, \Delta R_{ij} < R_0} \left(\frac{p_{Tj}}{\Delta R_{ij}} \right)^2 \begin{cases} \text{for } |\eta_i| < 2.5, & j \text{ are charged particles from leading vertex} \\ \text{for } |\eta_i| > 2.5, & j \text{ are all kinds of reconstructed particles} \end{cases}$$



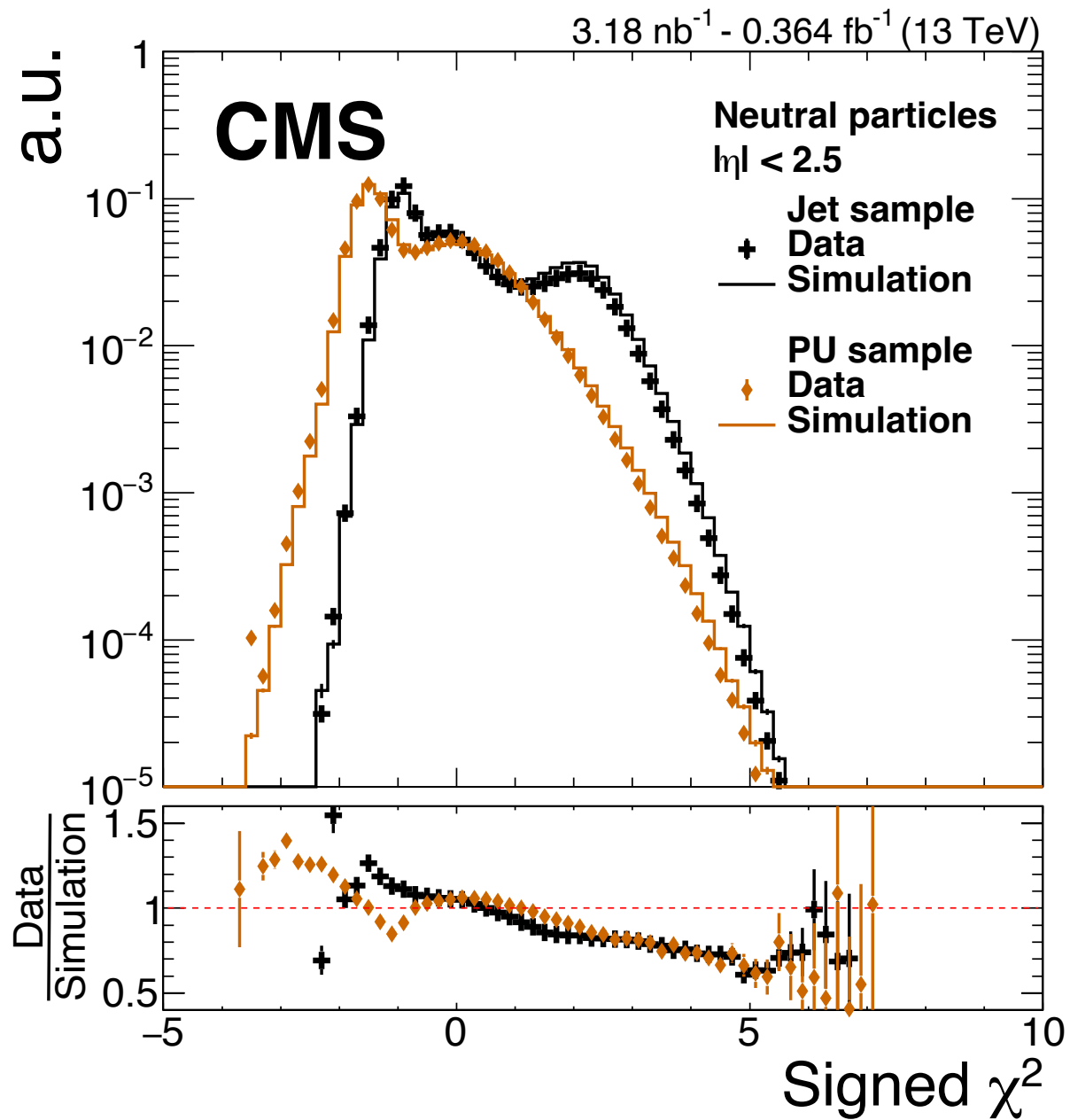
$$\alpha_i = \log \sum_{j \neq i, \Delta R_{ij} < R_0} \left(\frac{p_{Tj}}{\Delta R_{ij}} \right)^2 \begin{cases} \text{for } |\eta_i| < 2.5, & j \text{ are charged particles from leading vertex} \\ \text{for } |\eta_i| > 2.5, & j \text{ are all kinds of reconstructed particles} \end{cases}$$





1. Calculate Median and RMS of charged PU shape (blue)

$$\bar{\alpha}_{PU}, RMS_{PU}$$

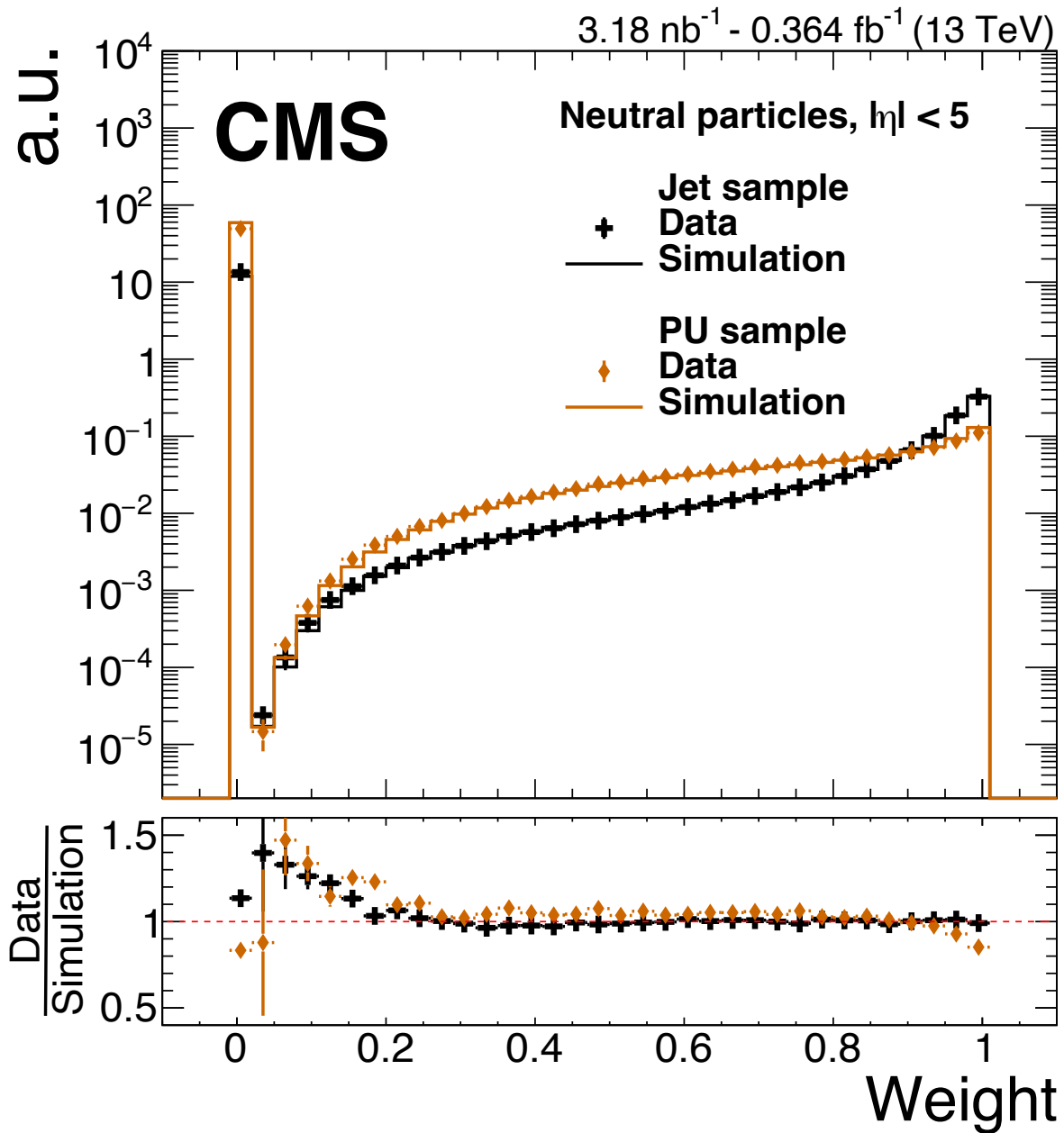


1. Calculate Median and RMS of charged PU shape

$$\bar{\alpha}_{PU}, RMS_{PU}$$

2. For each particle calculate

$$\chi_i^2 = \frac{(\alpha_i - \bar{\alpha}_{PU}) | \alpha_i - \bar{\alpha}_{PU} |}{RMS_{PU}^2}$$



1. Calculate Median and RMS of charged PU shape

$$\bar{\alpha}_{PU}, RMS_{PU}$$

2. For each particle calculate

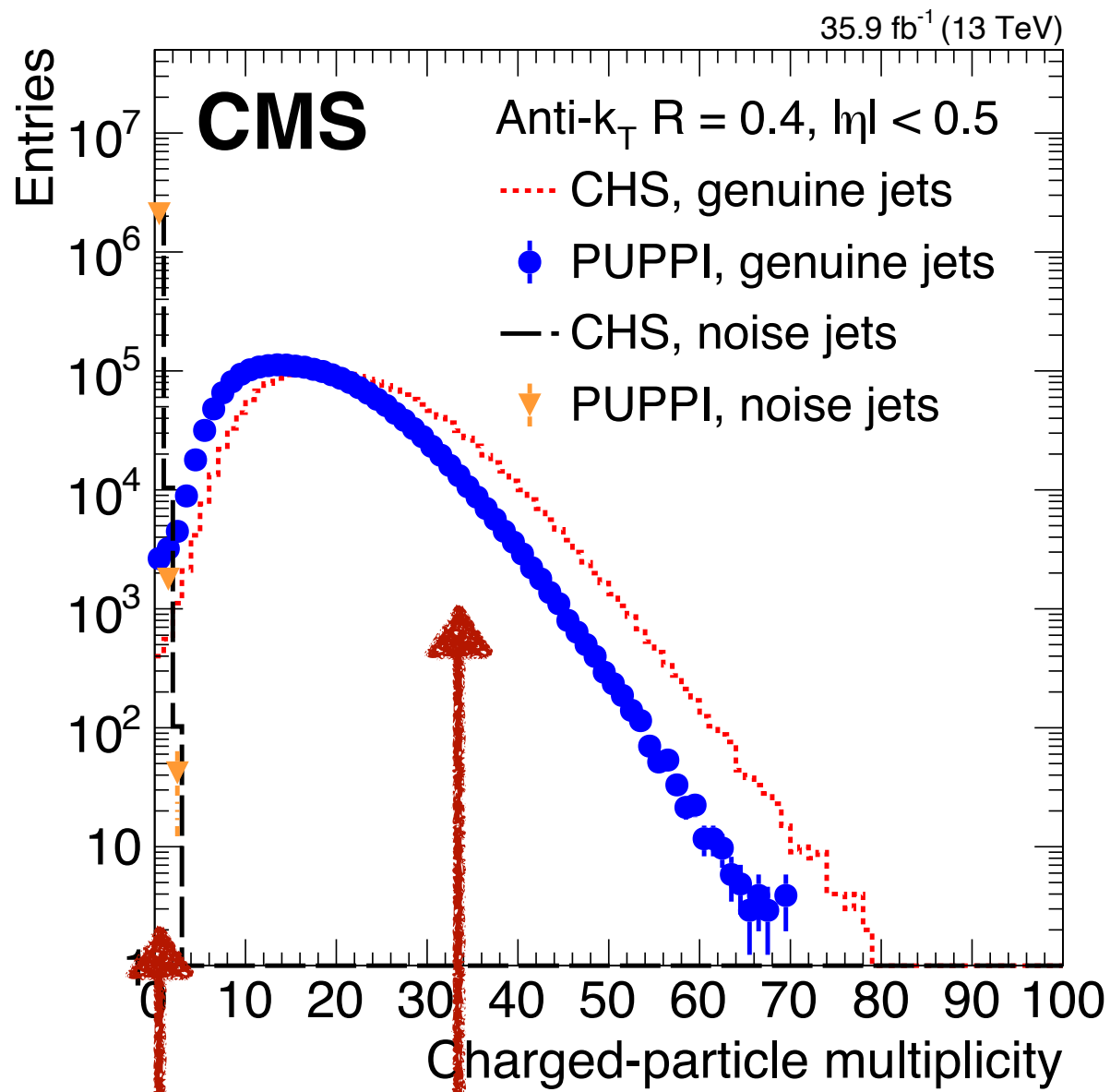
$$\chi_i^2 = \frac{(\alpha_i - \bar{\alpha}_{PU}) | \alpha_i - \bar{\alpha}_{PU} |}{RMS_{PU}^2}$$

3. Assign a weight to each particle

$$w_i = F_{\chi^2, NDF=1}(\chi_i^2)$$

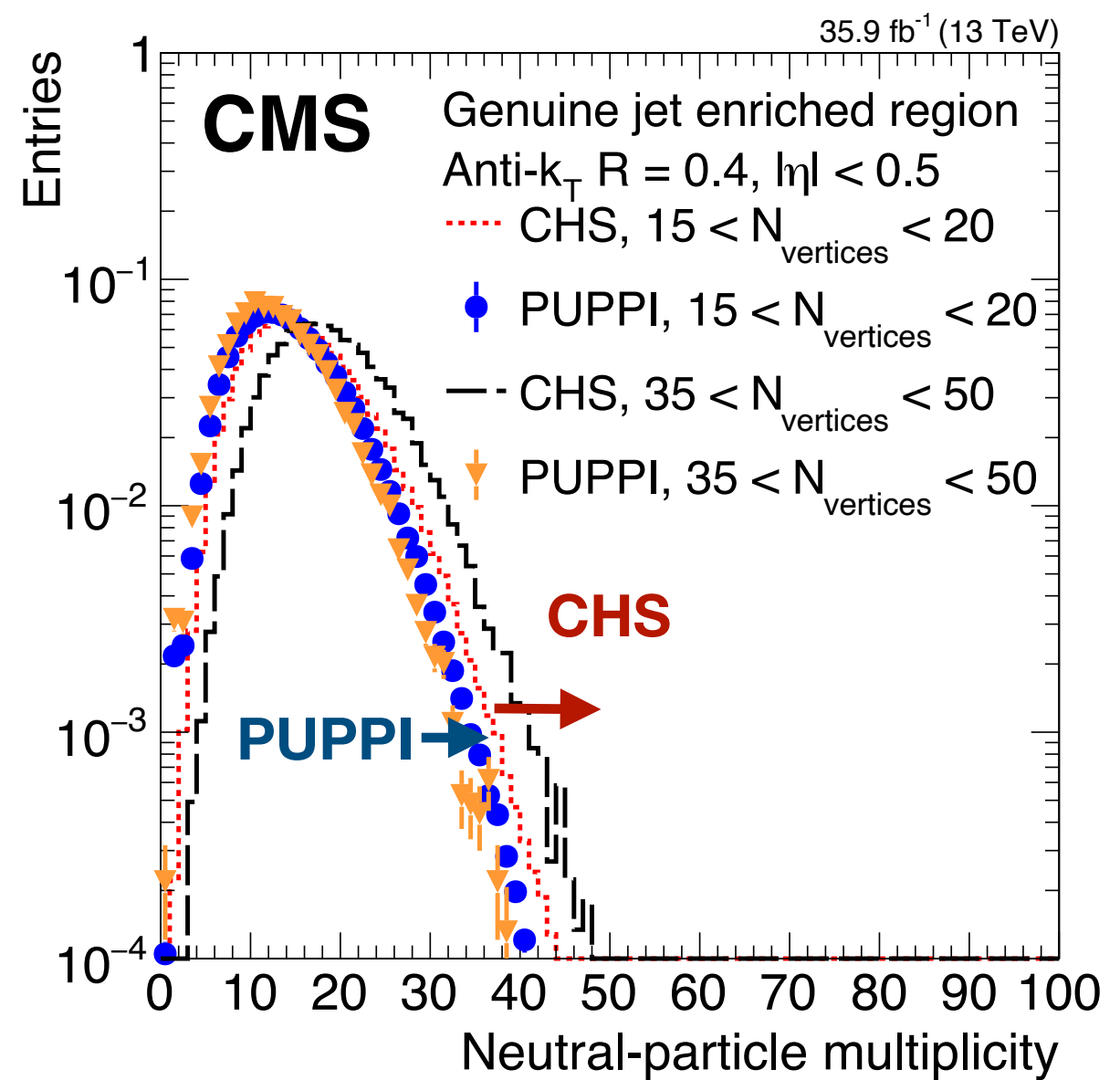
Pileup \longrightarrow Hard scattering

Noise Jet ID



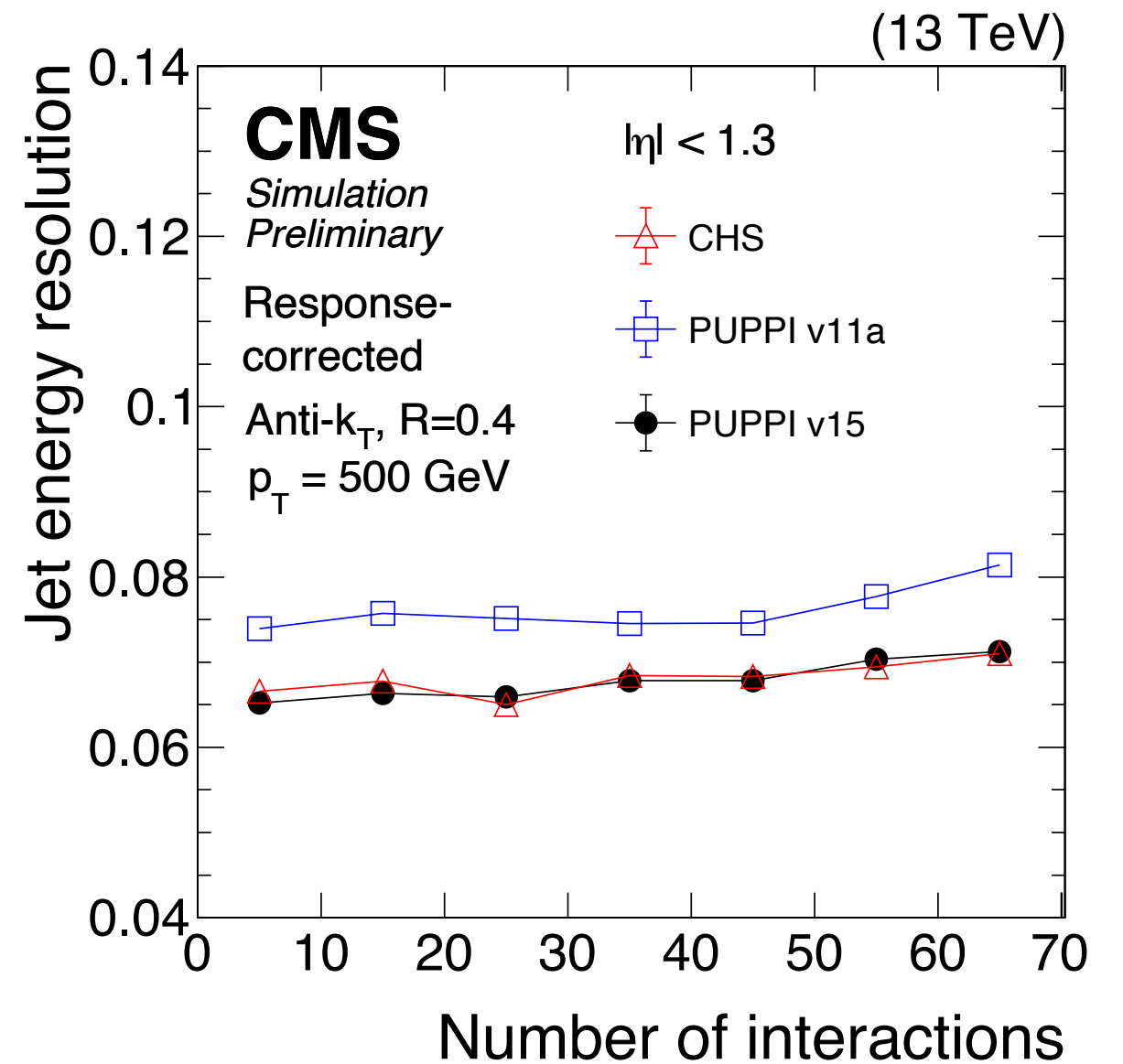
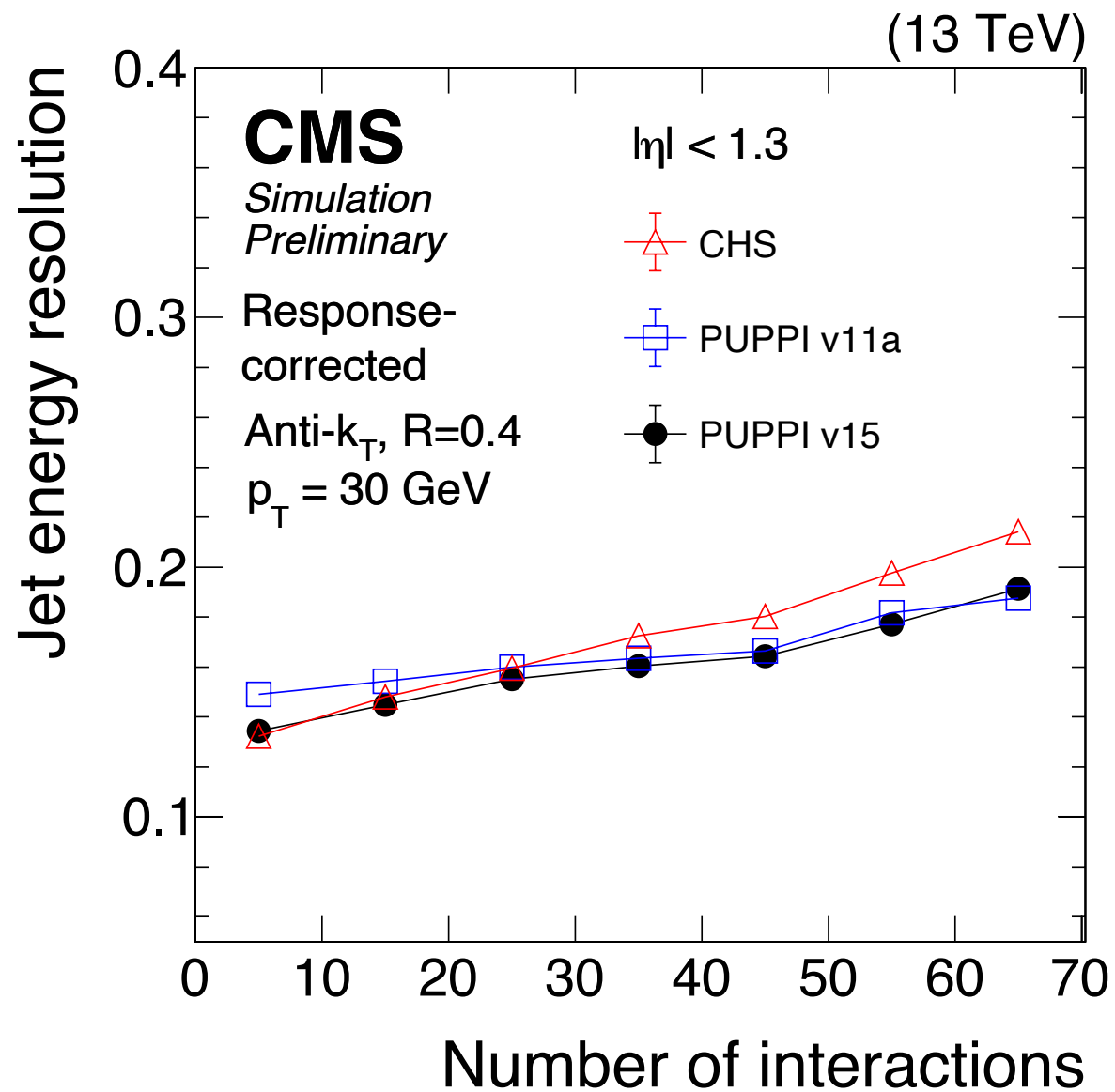
Real jets

Noise jets



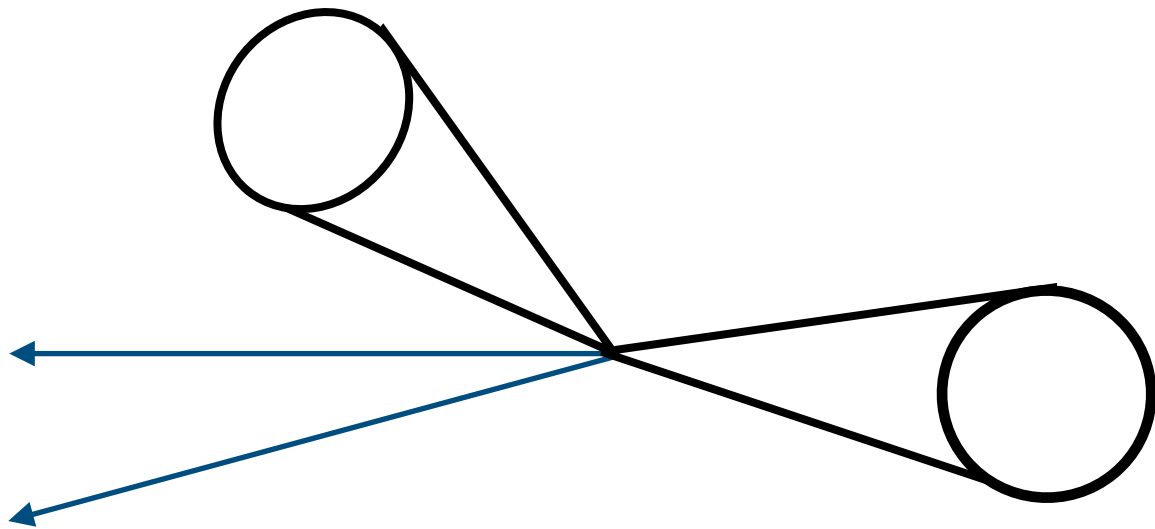
Purpose: remove noise from HCAL & ECAL by retaining ~98% of the real jets

Jet energy resolution



Efficiency & purity in Z+jets

generator jets

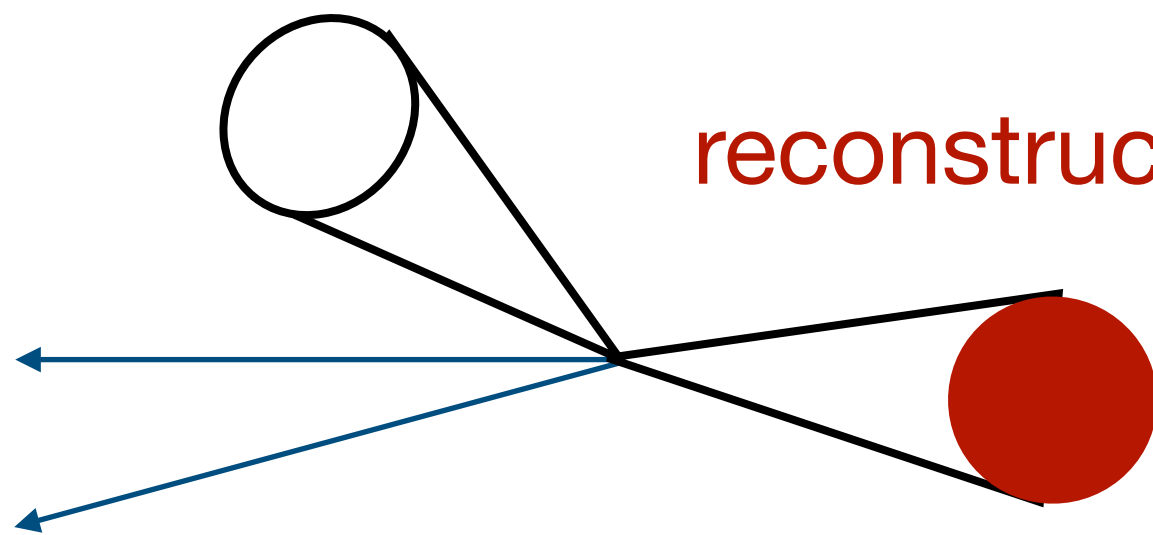


Efficiency

Simulation only study

Efficiency & purity in Z+jets

generator jets



reconstructed jets

Either not reconstructed or rejected:

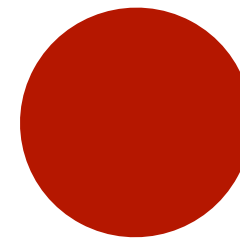
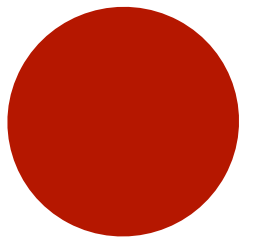
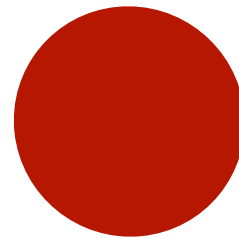
- Pileup Jet ID
- down weighted particles from PUPPI
- ...

Efficiency

Simulation only study

Efficiency & purity in Z+jets

reconstructed jets

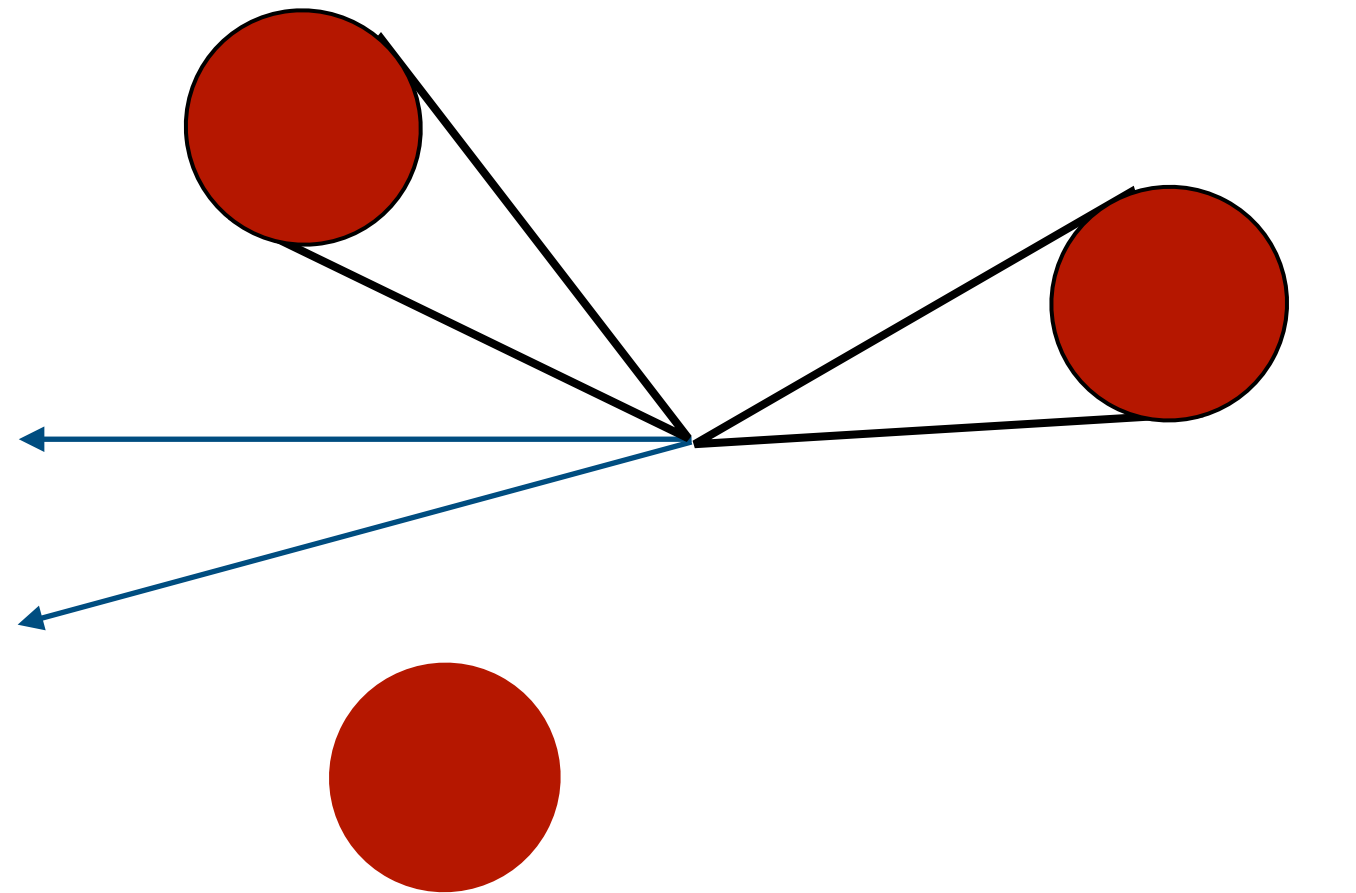


Simulation only study

Purity

Efficiency & purity in Z+jets

reconstructed jets



generator jets

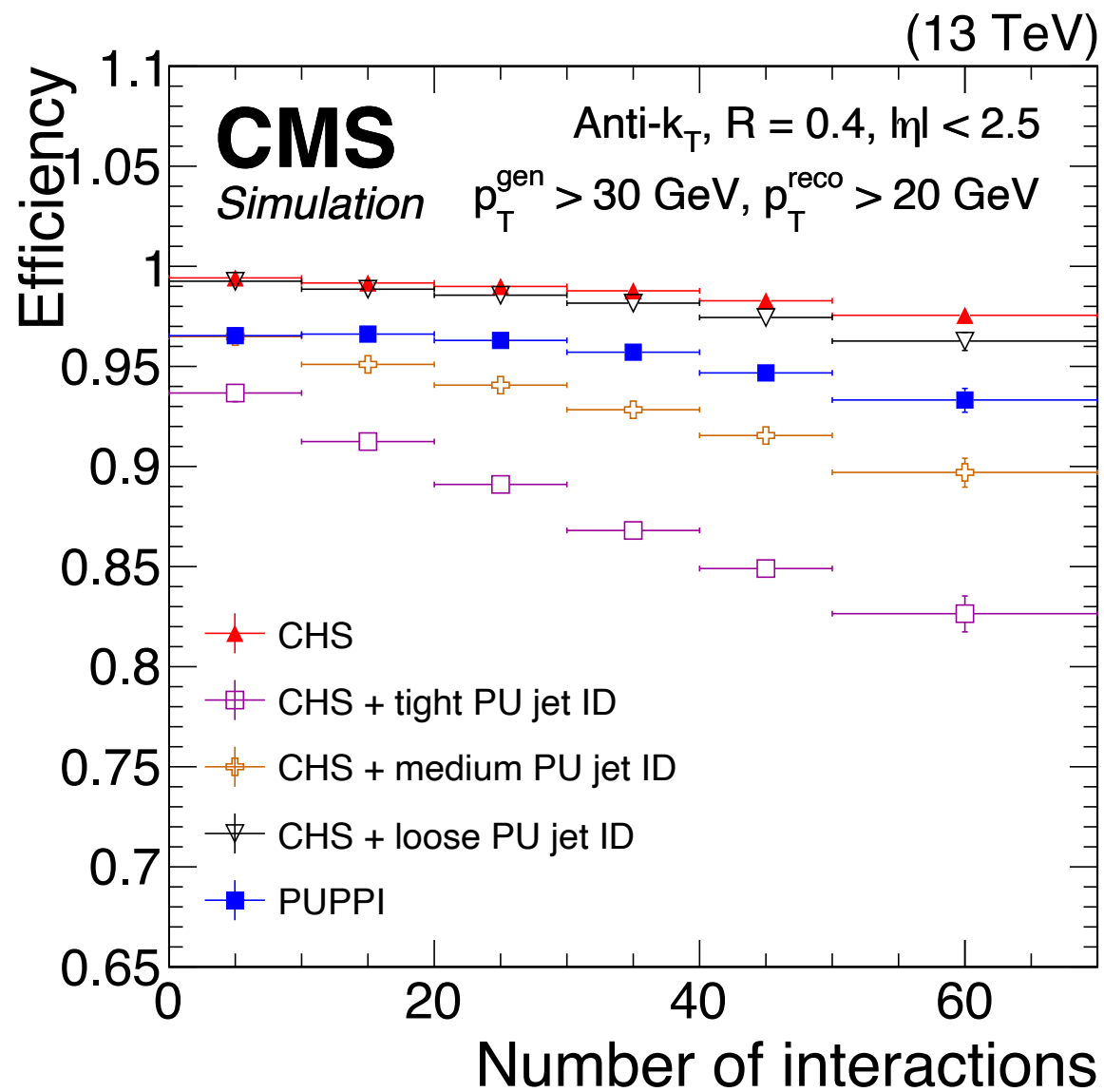
Most likely PU Jets did not get rejected:

- CHS does not remove enough jets
- PUPPI does not remove enough particles
- ...

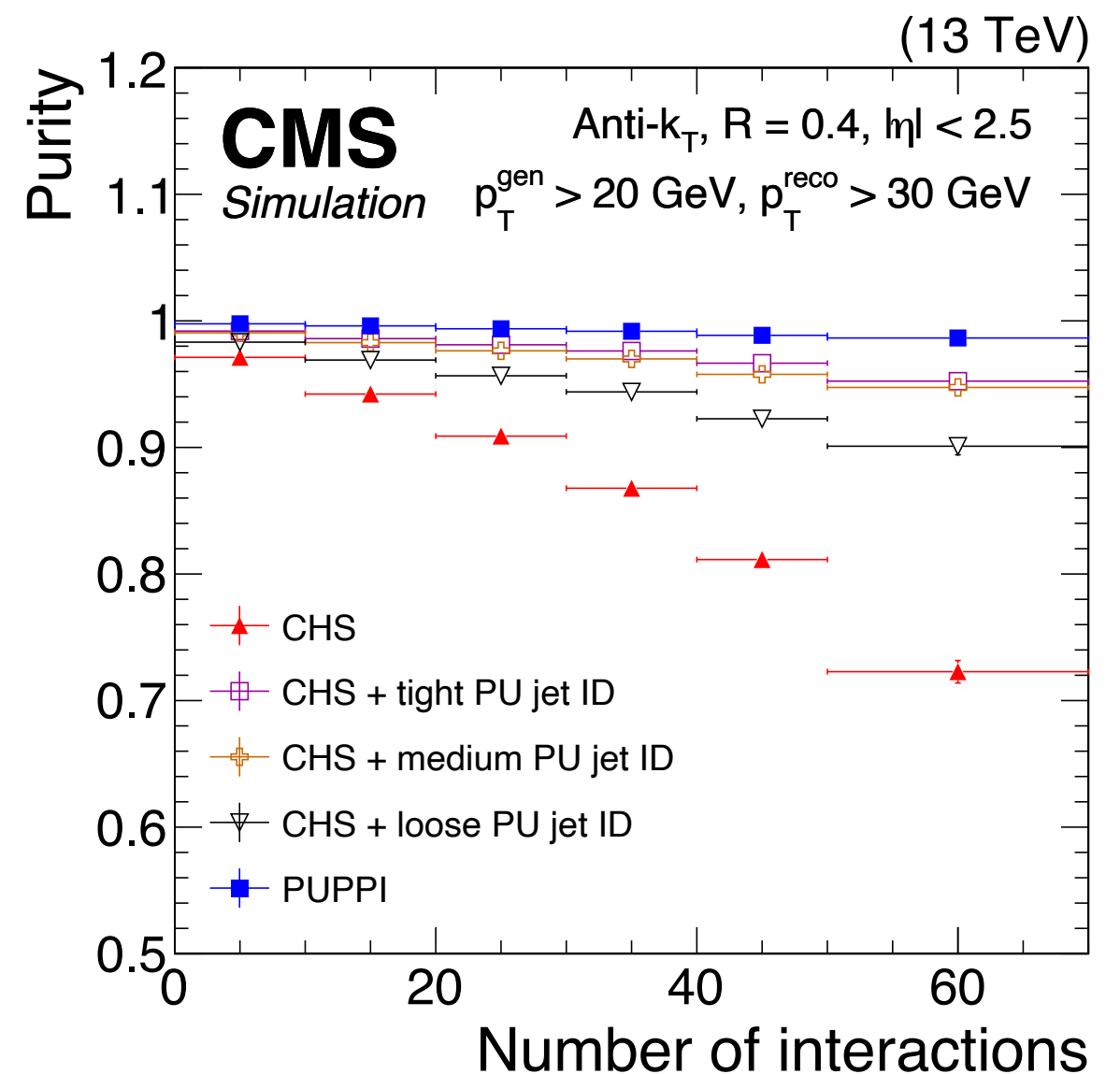
Simulation only study

Purity

Efficiency and purity

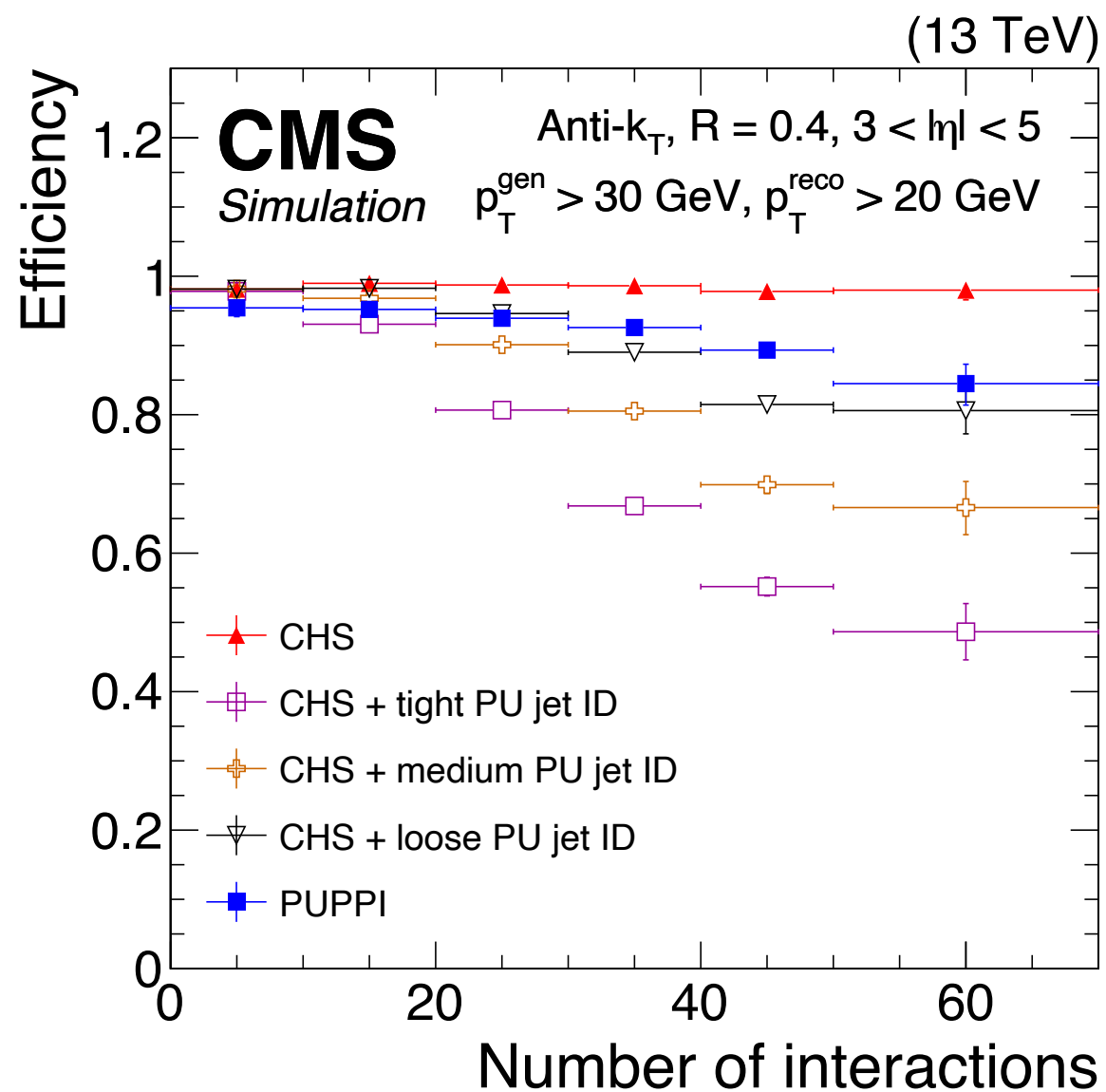


↑
better

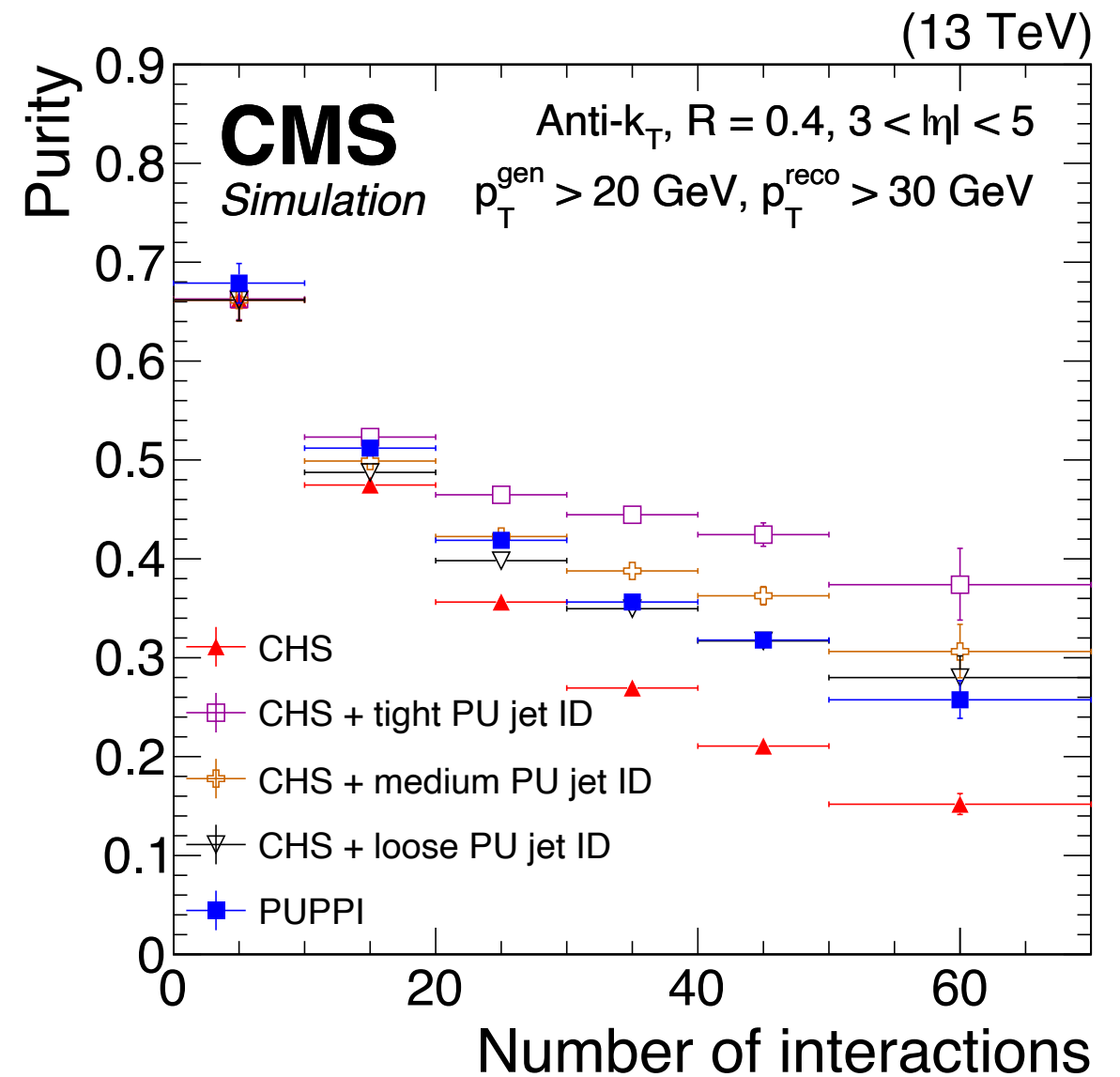


PUPPI better than **CHS+loose/medium** pileup jet ID

Efficiency and purity



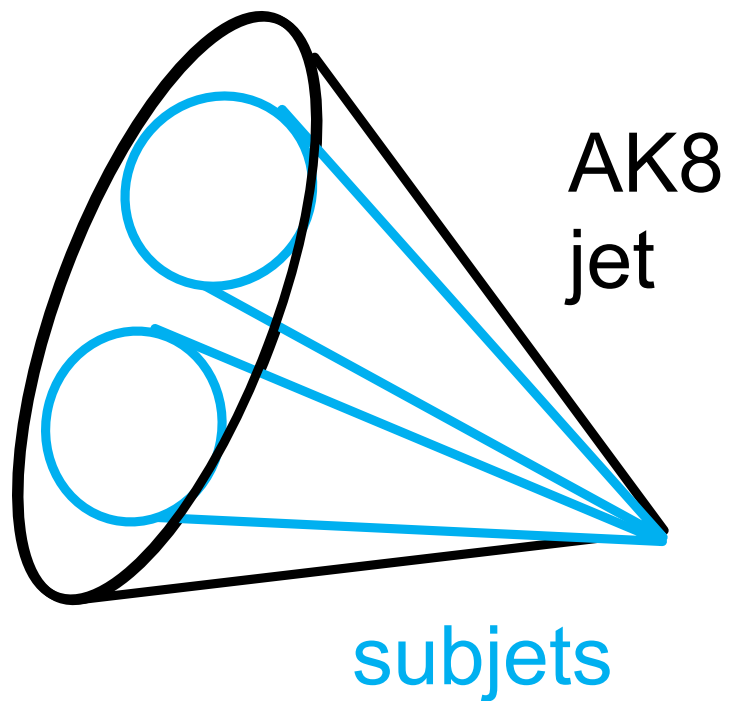
better



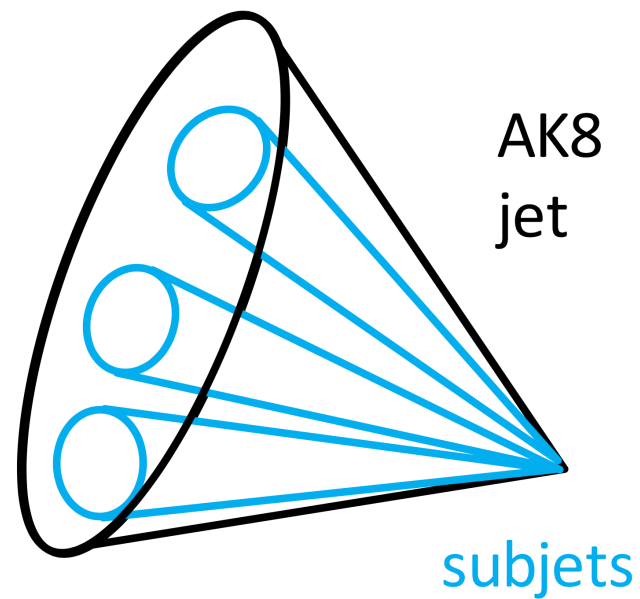
PUPPI better than **CHS+loose/medium** pileup jet ID

Identifying W bosons

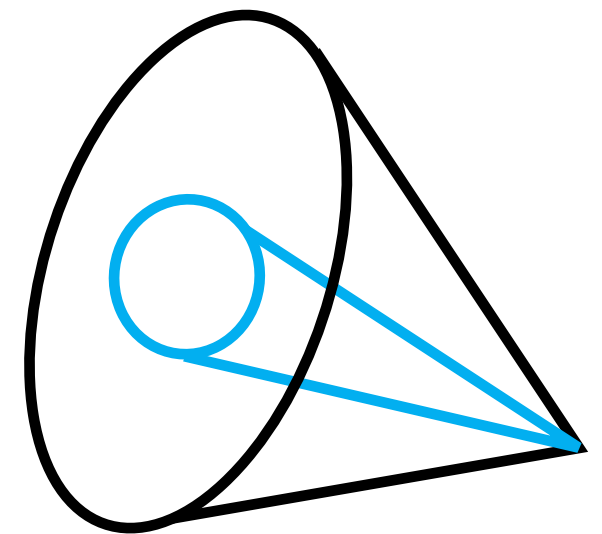
Z/W candidate



top candidate

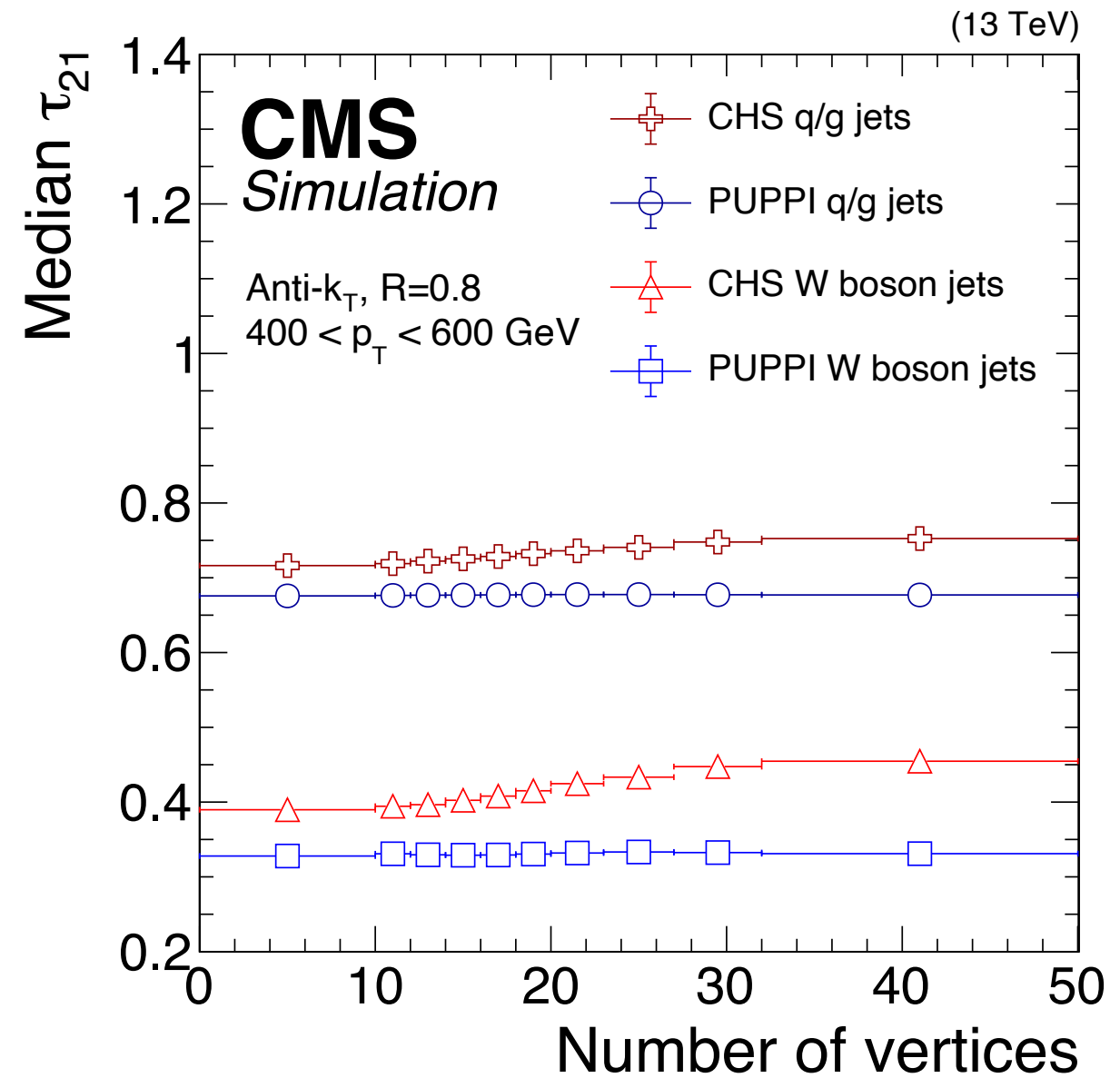
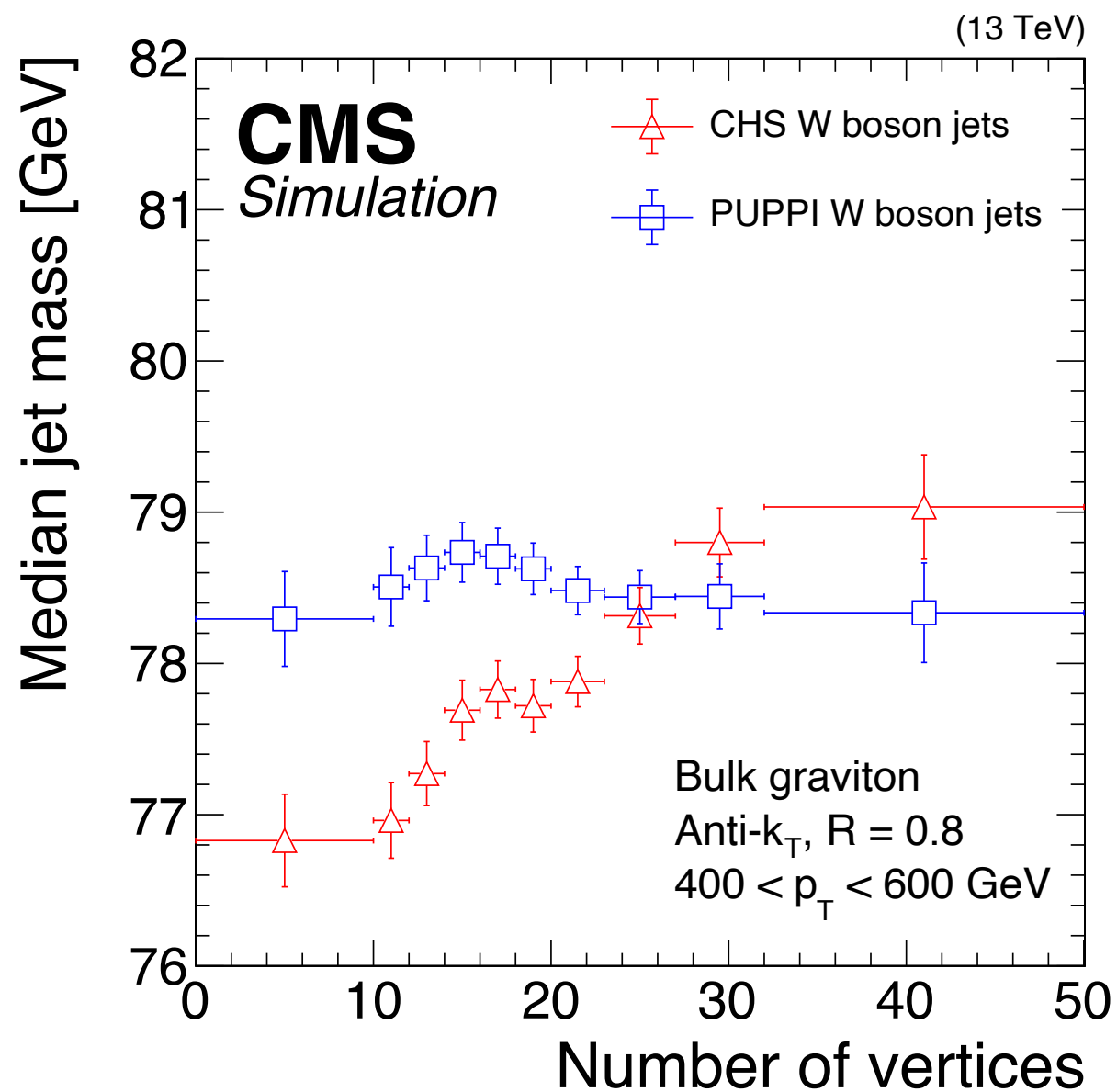


q/g candidate

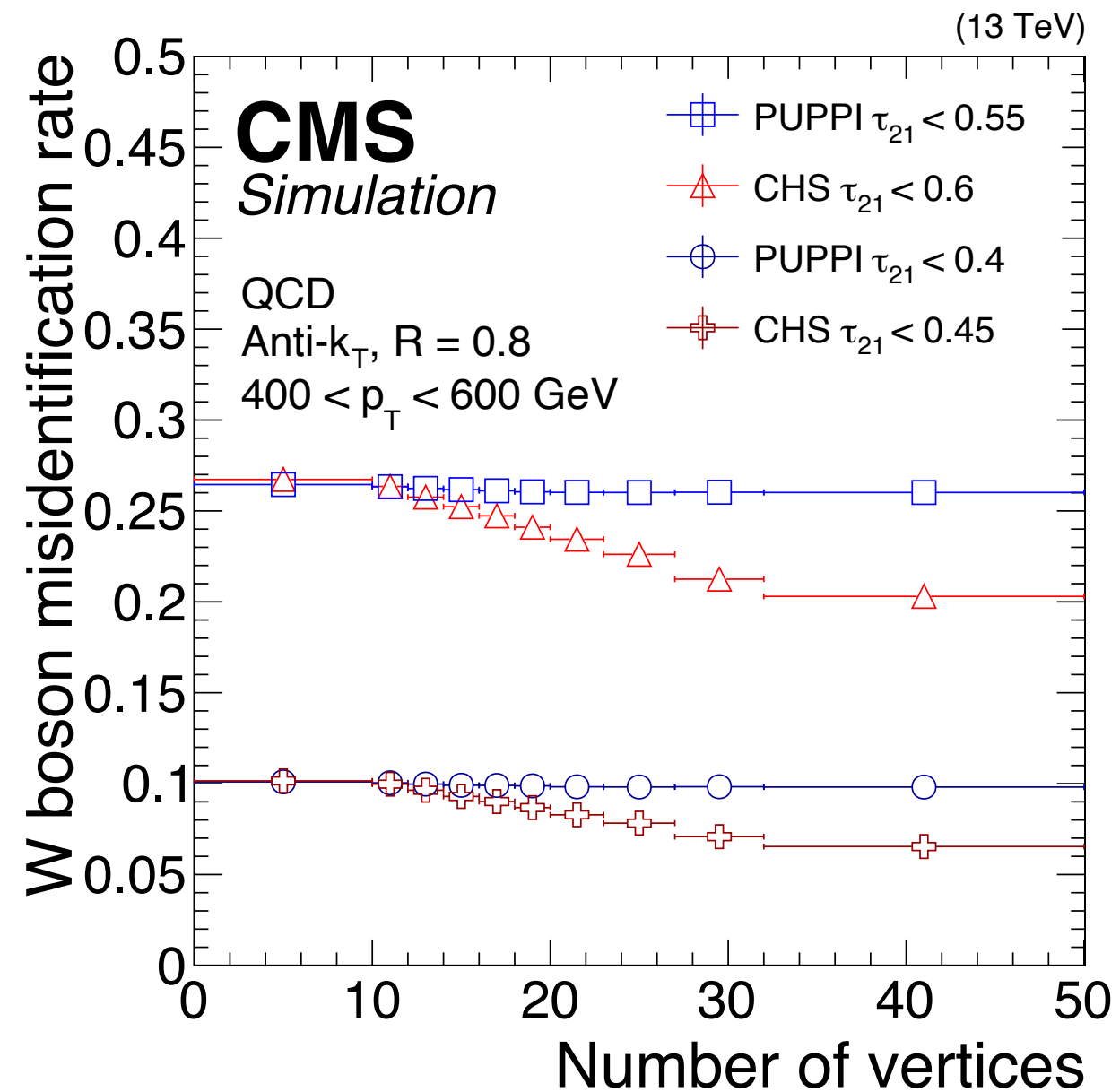
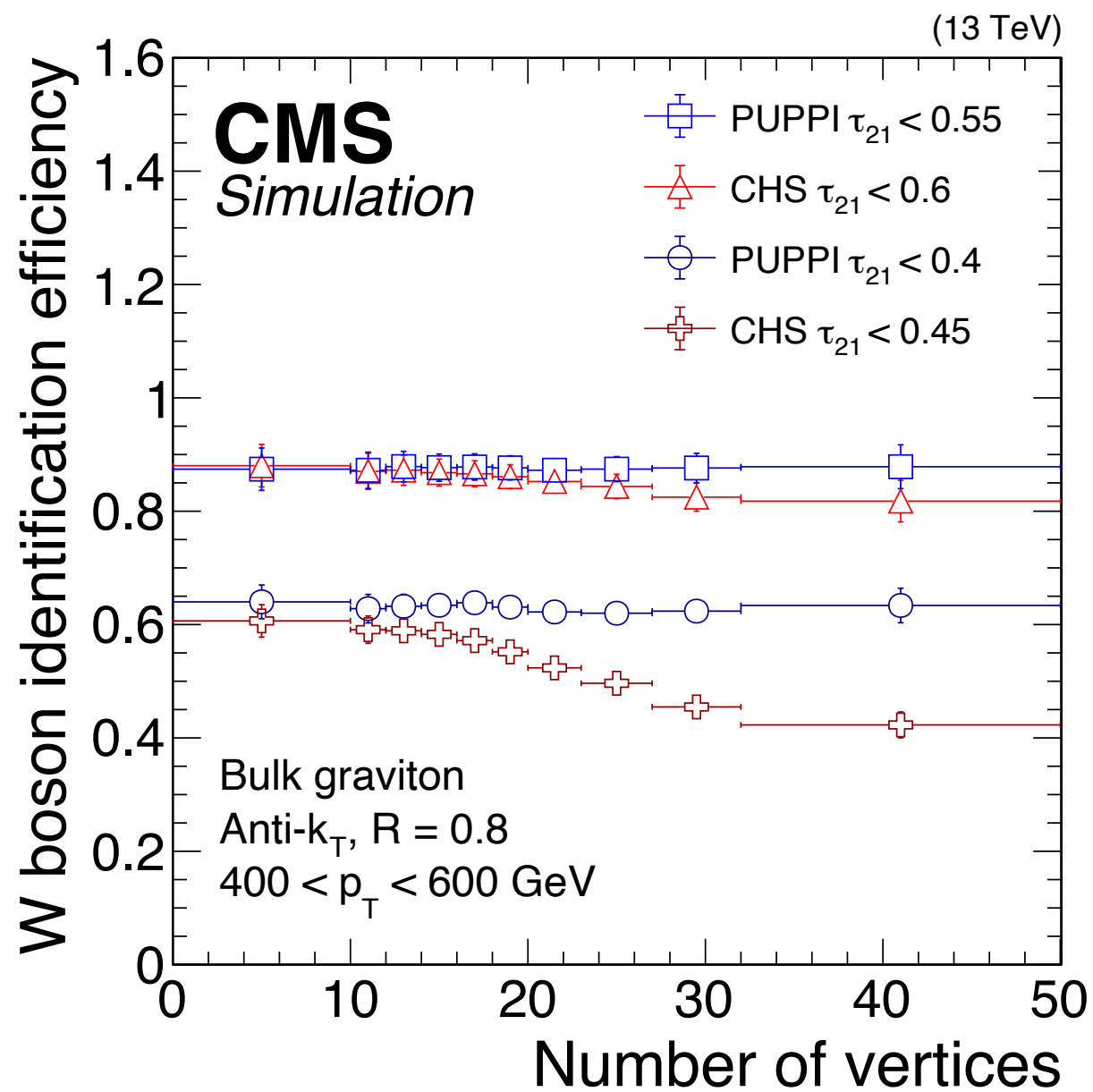


Identified through SD mass, n-subjettiness, subjet b-tagging, ...

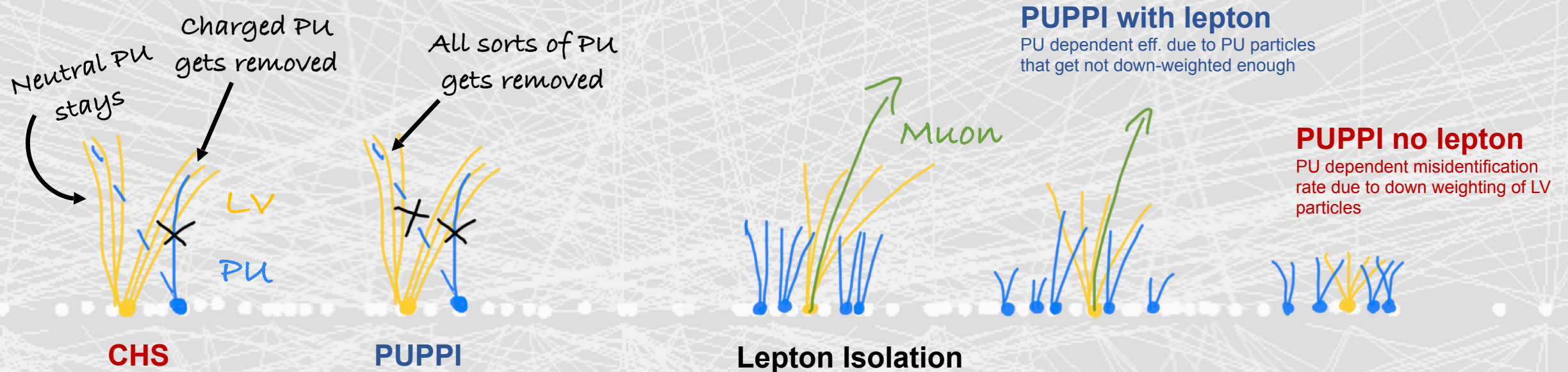
Identifying W bosons



Identifying W bosons



Pileup Mitigation Techniques in CMS



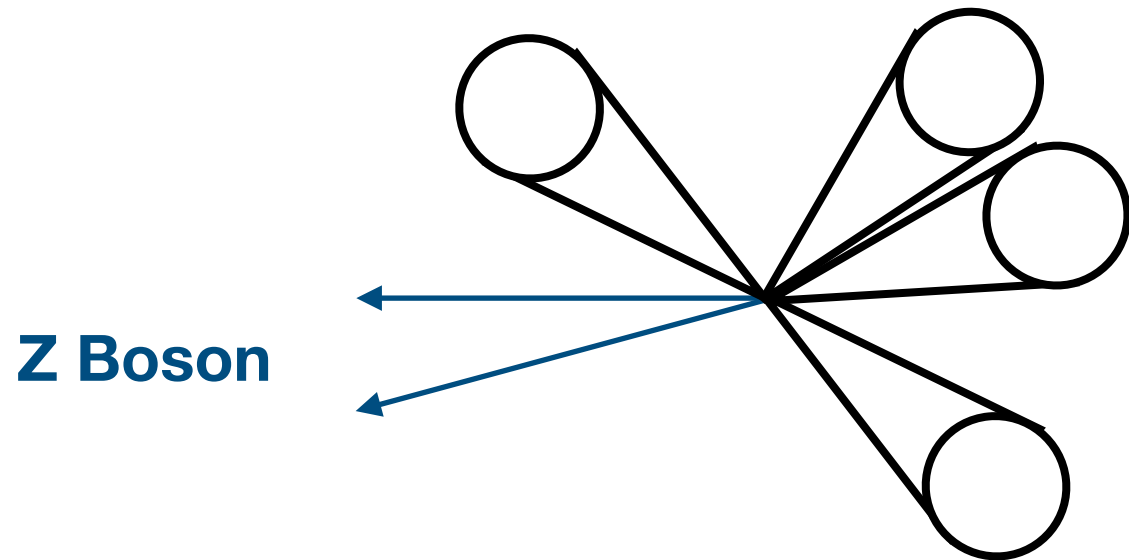
- full validation of PUPPI shows a good performance, especially at high PU
[CMS-JME-18-001](#)
- PUPPI is the standard pileup mitigation technique for CMS in Run 3
[CMS-DP-21-001](#)

Backup

PU Jet ID variables

Input variable	Definition
LV $\sum p_T$ fraction	Fraction of p_T of charged particles associated with the LV, defined as $\sum_{i \in \text{LV}} p_{T,i} / \sum_i p_{T,i}$ where i iterates over all charged PF particles in the jet
N_{vertices}	Number of vertices in the event
$\langle \Delta R^2 \rangle$	Square distance from the jet axis scaled by p_T^2 average of jet constituents: $\sum_i \Delta R^2 p_{T,i}^2 / \sum_i p_{T,i}^2$
$f_{\text{ring}X}$, $X = 1, 2, 3, \text{ and } 4$	Fraction of p_T of the constituents ($\sum p_{T,i} / p_T^{\text{jet}}$) in the region $R_i < \Delta R < R_{i+1}$ around the jet axis, where $R_i = 0, 0.1, 0.2,$ and 0.3 for $X = 1, 2, 3,$ and 4
$p_T^{\text{lead}} / p_T^{\text{jet}}$	p_T fraction carried by the leading PF candidate
$p_T^{\text{l.ch.}} / p_T^{\text{jet}}$	p_T fraction carried by the leading charged PF candidate
$ \vec{m} $	Pull magnitude, defined as $ (\sum_i p_T^i r_i \vec{r}_i) / p_T^{\text{jet}}$ where \vec{r}_i is the direction of the particle i from the direction of the jet
N_{total}	Number of PF candidates
N_{charged}	Number of charged PF candidates
σ_1	Major axis of the jet ellipsoid in the η - ϕ space
σ_2	Minor axis of the jet ellipsoid in the η - ϕ space
p_T^{D}	Jet fragmentation distribution, defined as $\sqrt{\sum_i p_{T,i}^2} / \sum_i p_{T,i}$

Hadronic recoil performance

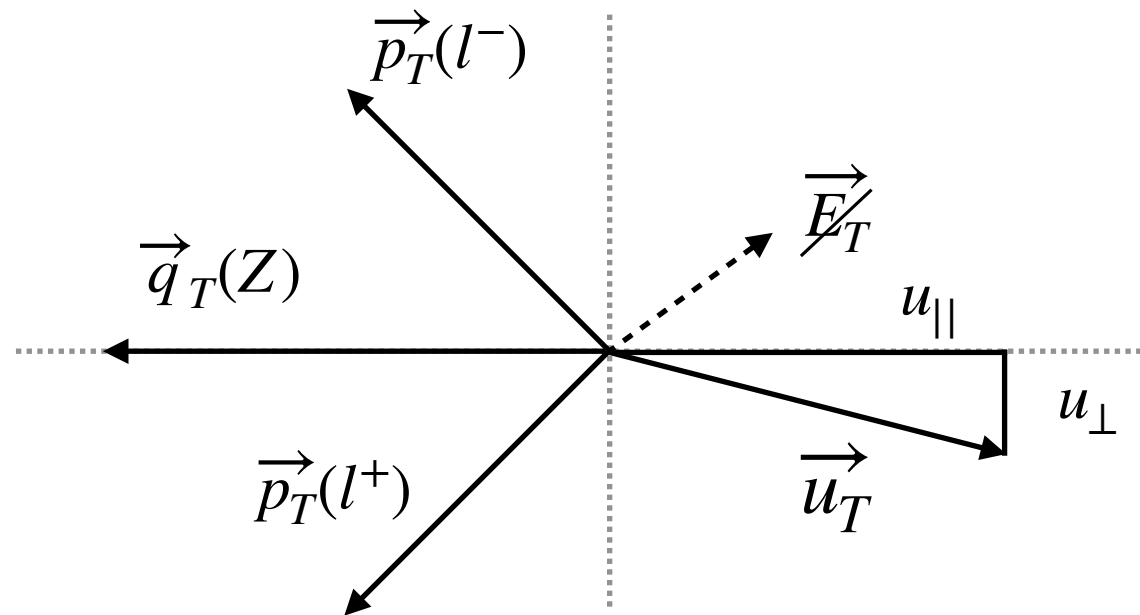


1. Sum up the AK4 jets in an event = hadronic recoil to the Z boson
2. In the ideal case:

$$p_T^Z - \sum p_T^{\text{jets}} = 0$$

Response:

$$\frac{u_{||}}{\vec{q}_T(Z)}$$

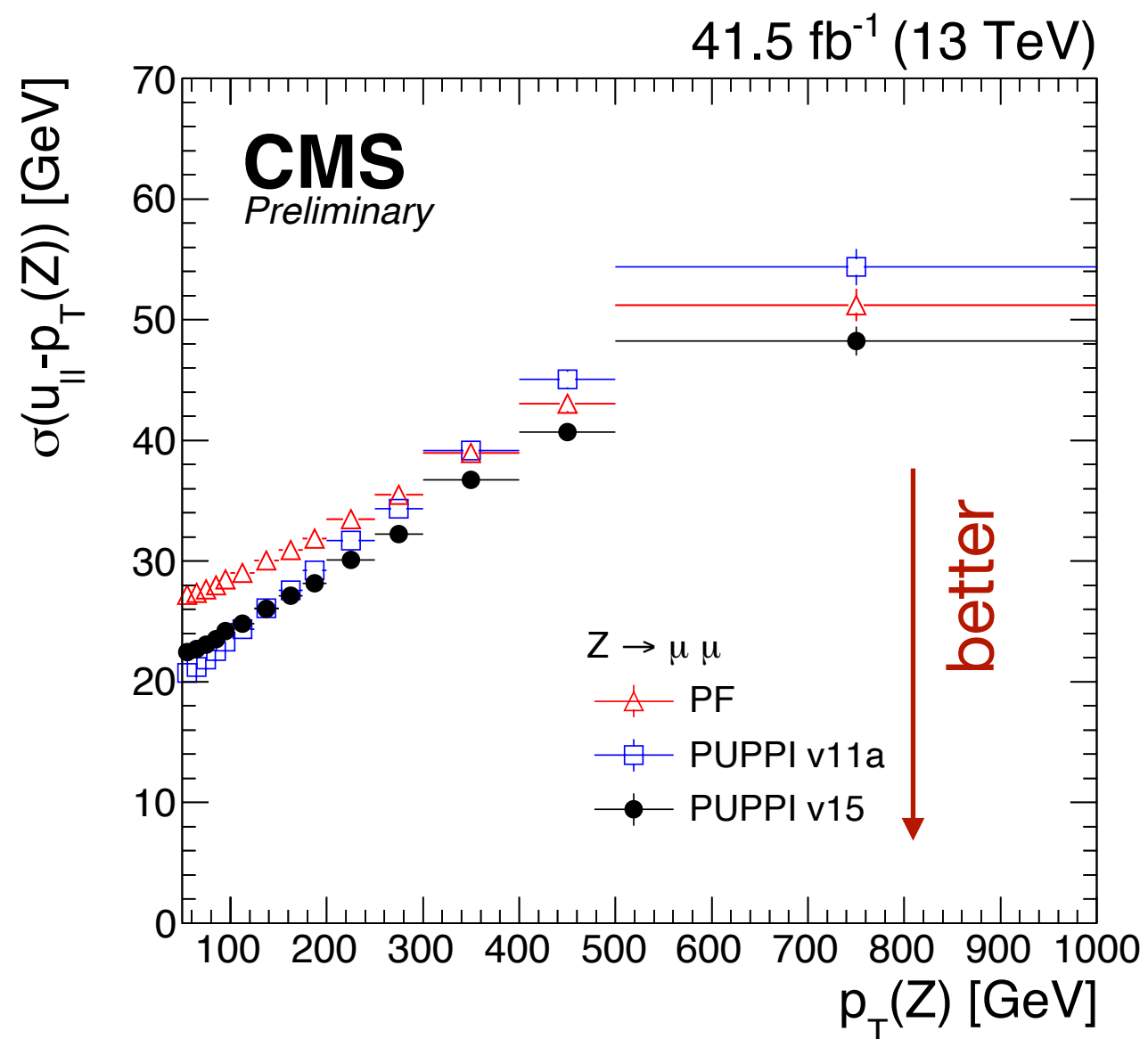
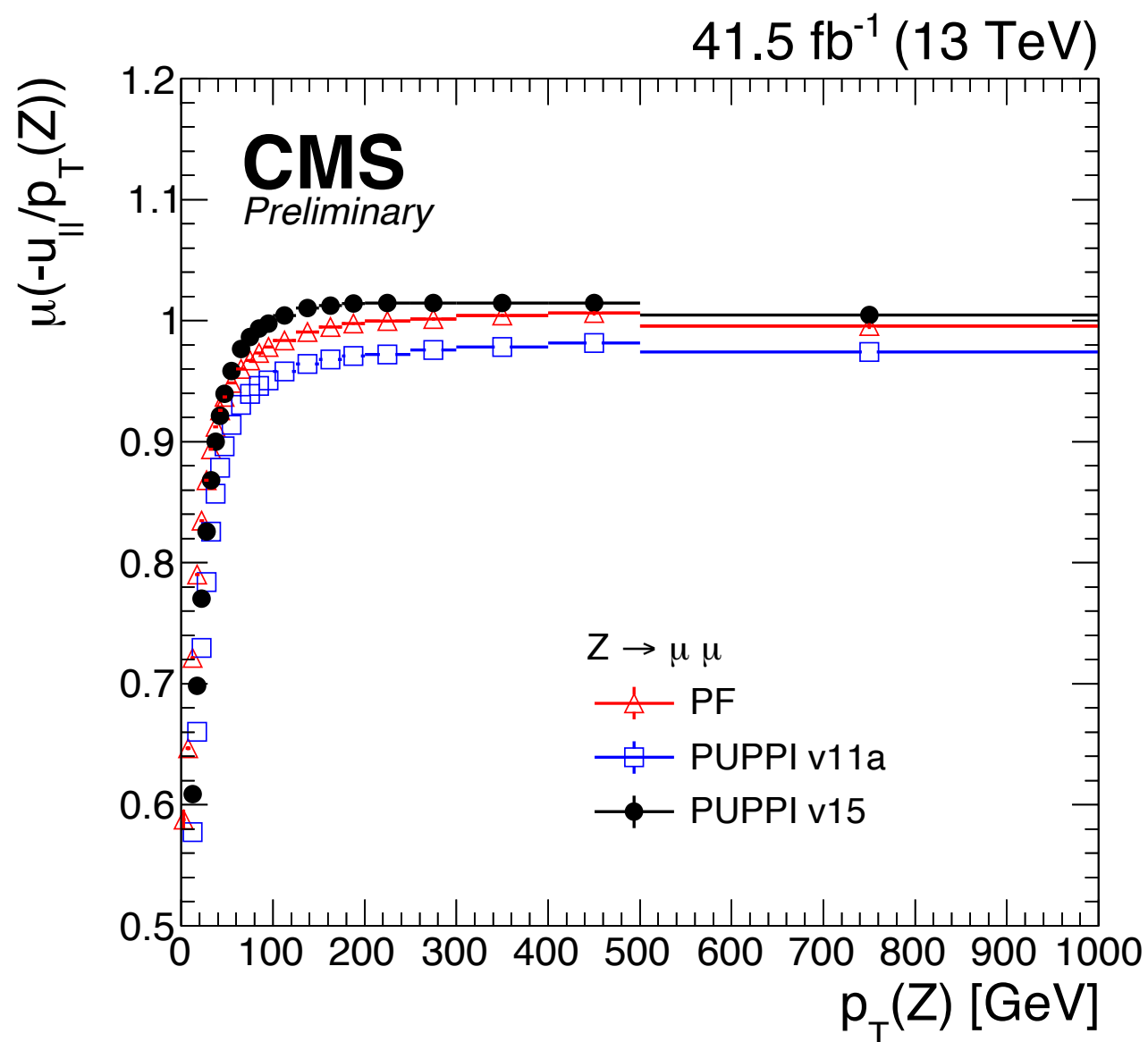


Resolution:

$$\sigma(u_{||})$$

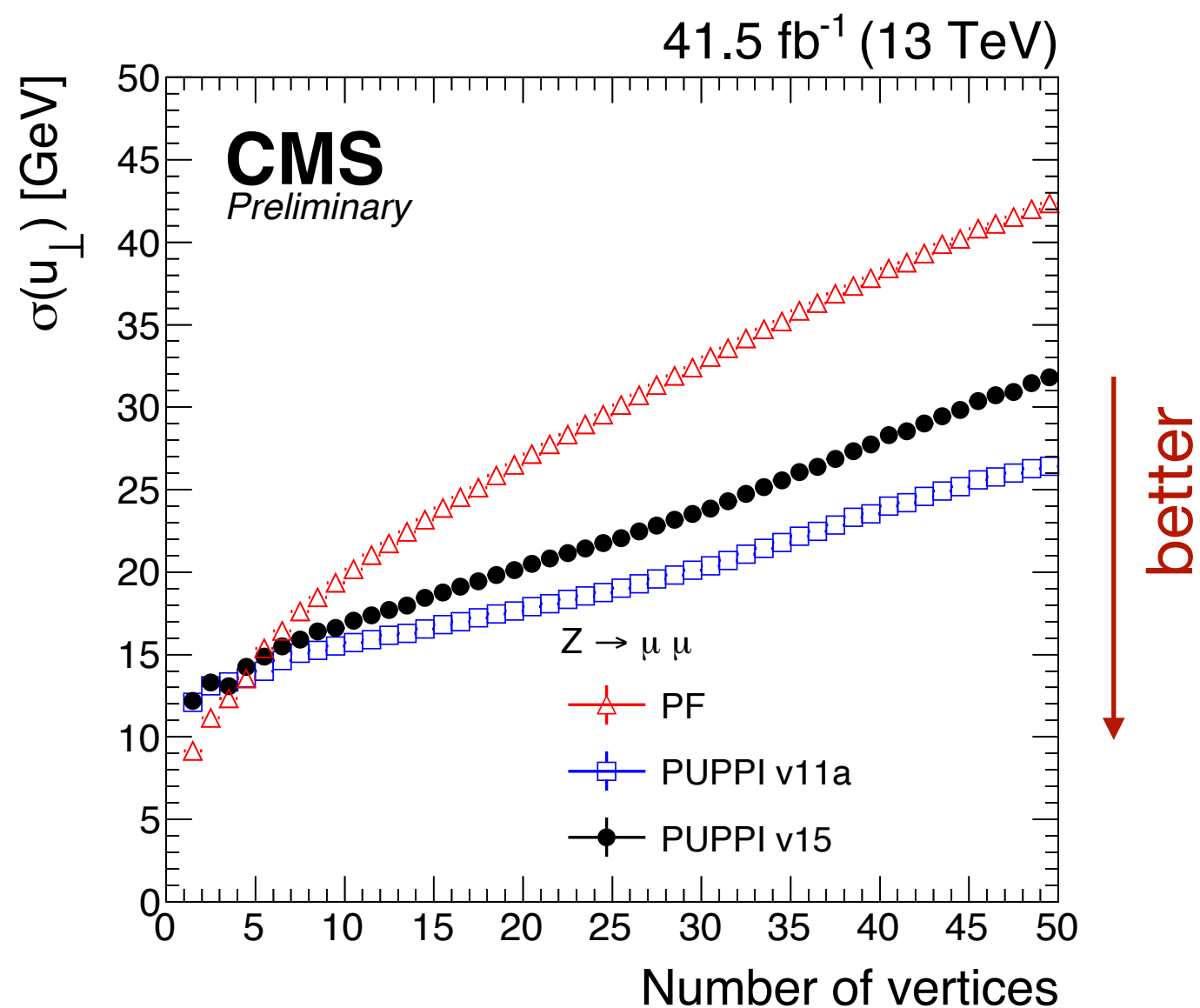
$$\sigma(u_{\perp})$$

Hadronic recoil performance



Response (left) and resolution (right) both improved with **PUPPI v15** compared to **PUPPI v11a** and is better than **PF**

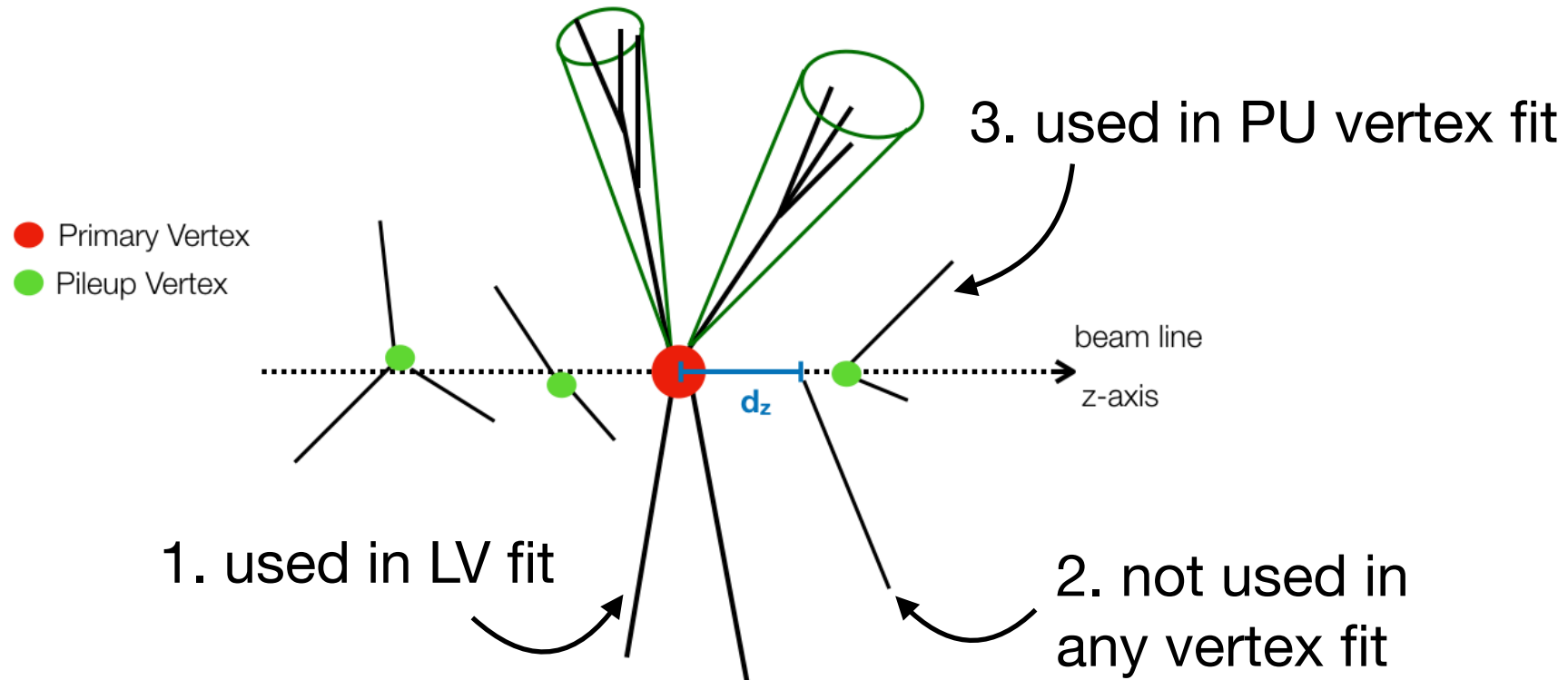
Hadronic recoil performance



Resolution of u_{\perp} slightly worse with **PUPPI v15** compared to **PUPPI v11a** but still better than **PF**

PUPPI v15

Track-vertex association



CHS

PUPPI v11

PUPPI v15

used in LV fit

keep

keep

keep

used in PU vertex fit

reject

reject

if 1st or 2nd PU vertex
&& $|d_z| < 0.2$ cm keep
else reject

not used in any vertex fit

keep

keep if $d_z < 0.3$ cm

* η -dependent
see next slide

PUPPI v15

	$p_T > 20 \text{ GeV}$	$p_T < 20 \text{ GeV}$
$ \eta < 2.4$	keep	calculate a weight
$ \eta > 2.4$	keep	if $ d_Z < 0.3 \text{ cm}$ keep else reject

Tab. 2: Categories for charged particles that are not used in the fit of the LV or a PU vertex.

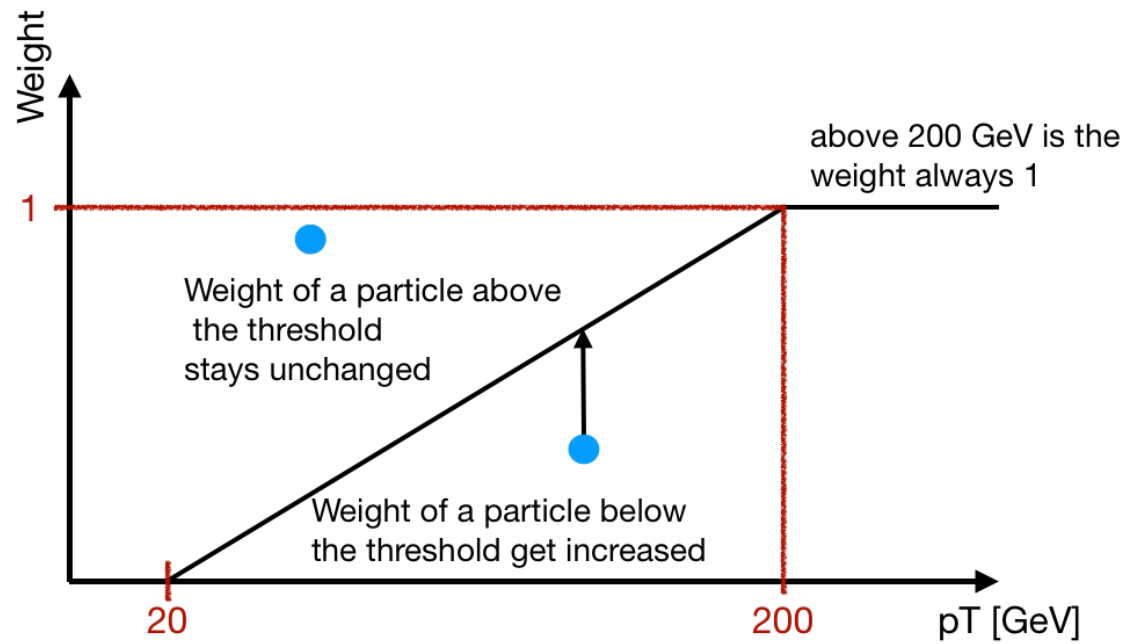
If a charged particle is not used in any fit PUPPI keeps the charged particle only if $|d_Z| < 0.3 \text{ cm}$, while CHS keeps all charged particles. However, the track-vertex assignment, especially $|d_Z|$ is not working for high- p_T particles and therefore rejects too many LV particles. In the new tune we therefore implemented a protection for this.

In $|\eta| < 2.4$: Charge particles with $p_T > 20 \text{ GeV}$ are kept, while the ones with $p_T < 20 \text{ GeV}$ are treated as neutral. These particles get a weight and are excluded from the α calculation in $|\eta| < 2.5$ (see Tab. 2).

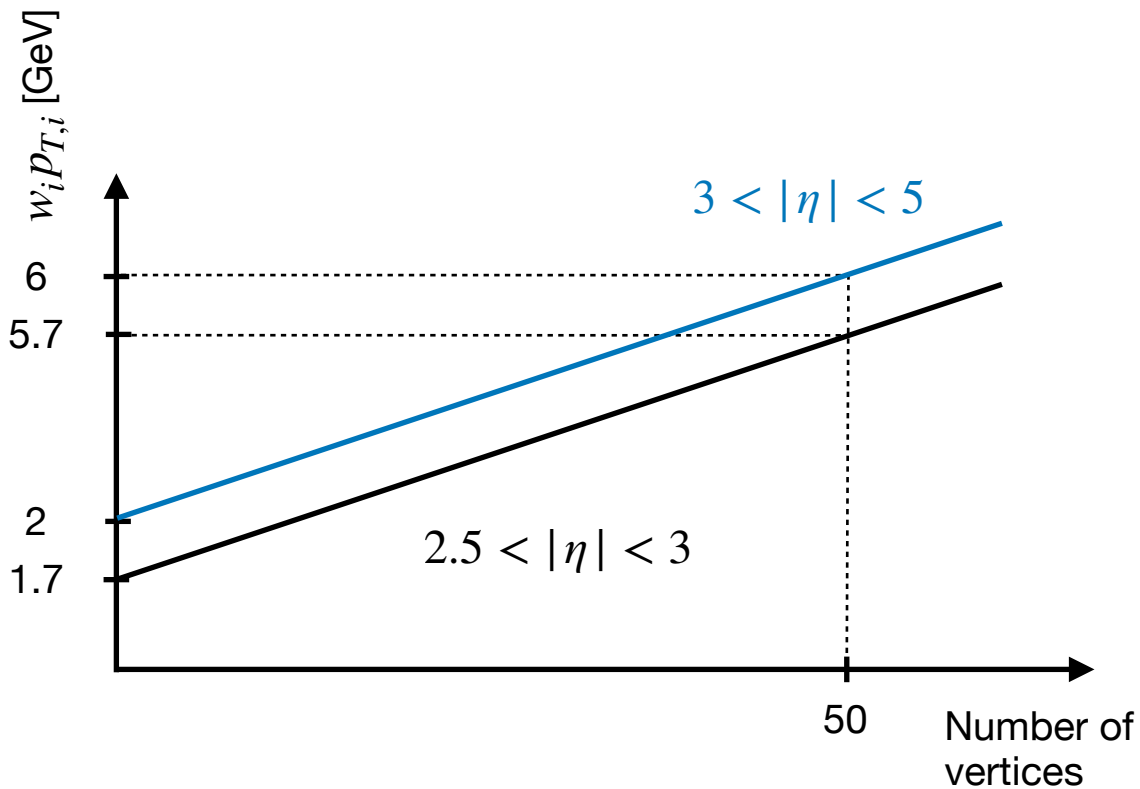
In $|\eta| > 2.4$: Charged particles with $p_T > 20 \text{ GeV}$ are kept. Charged particles with a $p_T < 20 \text{ GeV}$ are kept if $|d_Z| < 0.3 \text{ cm}$ (see Tab. 2).

The motivation behind the $|\eta| < 2.4$ condition comes from the fact that only tracks satisfying this condition are used for vertex fitting. PUPPI internally is split into $|\eta| < 2.5$ and $|\eta| > 2.5$ since $|\eta| = 2.5$ is the boundary of our Phase-0 tracking system. The tracking system was extended to $|\eta| < 3.0$ with the Phase-1 upgrade.

PUPPI v15



In addition, neutral particles receive a protection based on their p_T . If the weight of a neutral particle is less than $w_i < p_T \cdot \frac{1}{200 - 20} - \frac{20}{200 - 20}$ (black line shown in the bottom left plot) than the weight gets increased to be equal.



The weight is multiplied to the four-momentum of the corresponding particle. Each particle has to pass a certain p_T threshold to be considered in the clustering. The p_T threshold varies between 1.7 GeV and 6 GeV depending on the number of vertices in the event and the η of the particle (plot on the bottom left).

Efficiency and purity

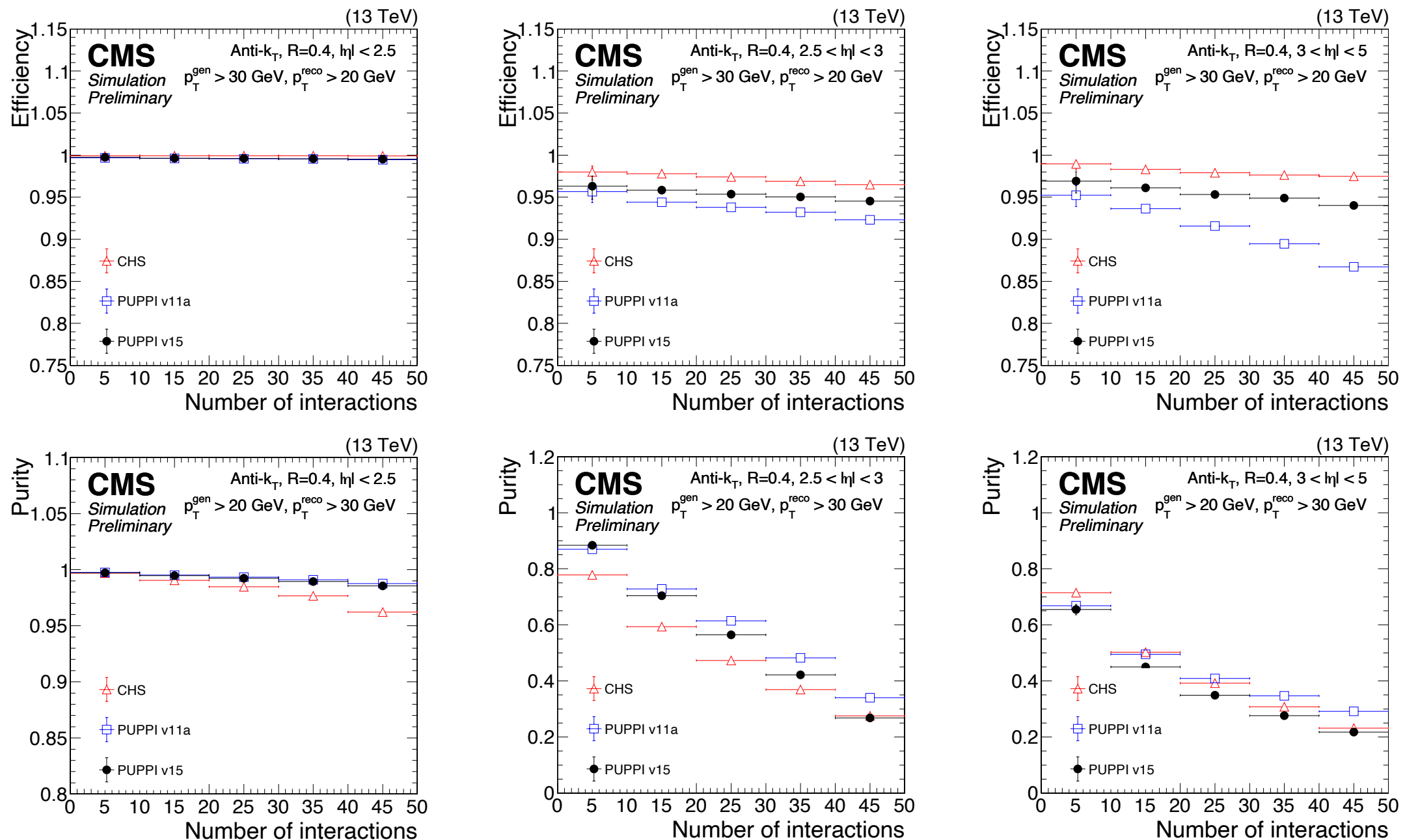


Figure 4: The LV jet efficiency (upper) and purity (lower) in Z+jets simulation as a function of the number of interactions for PUPPI v11a (blue open squares), CHS (red open triangles), and the new tune of PUPPI v15 (black filled circles). Plots are shown for AK4 jets with $p_T > 20$ GeV, and with (left) $|\eta| < 2.5$, (central) $2.5 < |\eta| < 3$ and (right) $|\eta| > 3$.