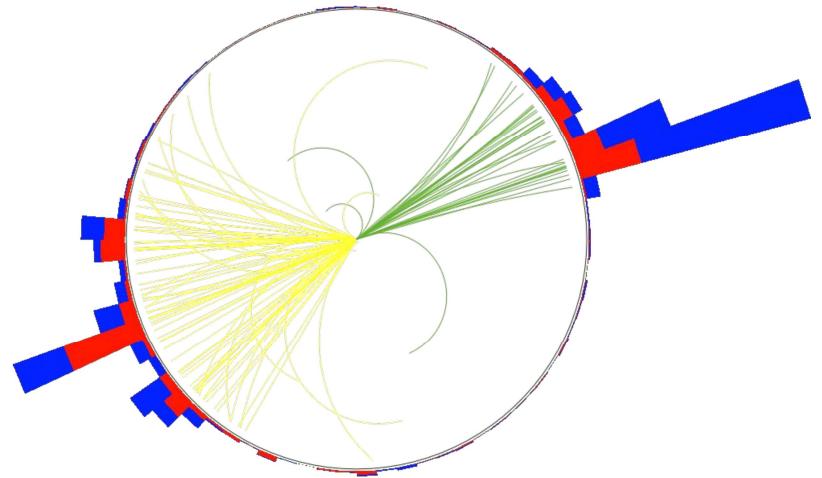


# Jets “Short Exercise”

## CMSvDAS June 2023



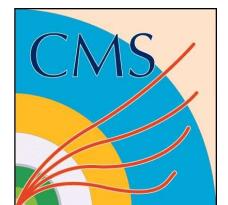
*Ashley Parker, Andris Potrebko, Mikael Myllymaki  
using slides from Cristina Ana Mantilla Suarez, Christine McLean, Henning Kirschenmann, Raffaele Gerosa, John Hakala*

*using previous slides from Kevin Pedro, Cristina Ana Mantilla Suarez, Chin Lung Tan, Caleb James Smith, Juska Pekkanen, Alexx Perloff, David Yu, Alejandro Gomez Espinosa*

*using previous slides from Alexx Perloff, Justin Pilot, Tongguang Cheng*

*using previous slides from Jim Dolen, Salvatore Rappoccio, et. al.*

<https://indico.cern.ch/event/1257234/>



# Exercise Plans

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- Introductions
- Setup computing environment and start running scripts
  - Start here: [JMEDAS github repository](#)
    - [Login to SWAN](#), checkout code, init (and copy) proxy from lxplus
- 4 blocks in total, 7 remote facilitators:
  - Section 1: Intro, Basics, Jet Types and Algorithms
  - Section 2: Pileup
  - Section 3: JEC and JER
  - Section 4: Jet Substructure
- A fuller version of the slides with the presentation recordings can be found at the twiki of the [2022 CMSDAS twiki page](#).



Ashley Parker

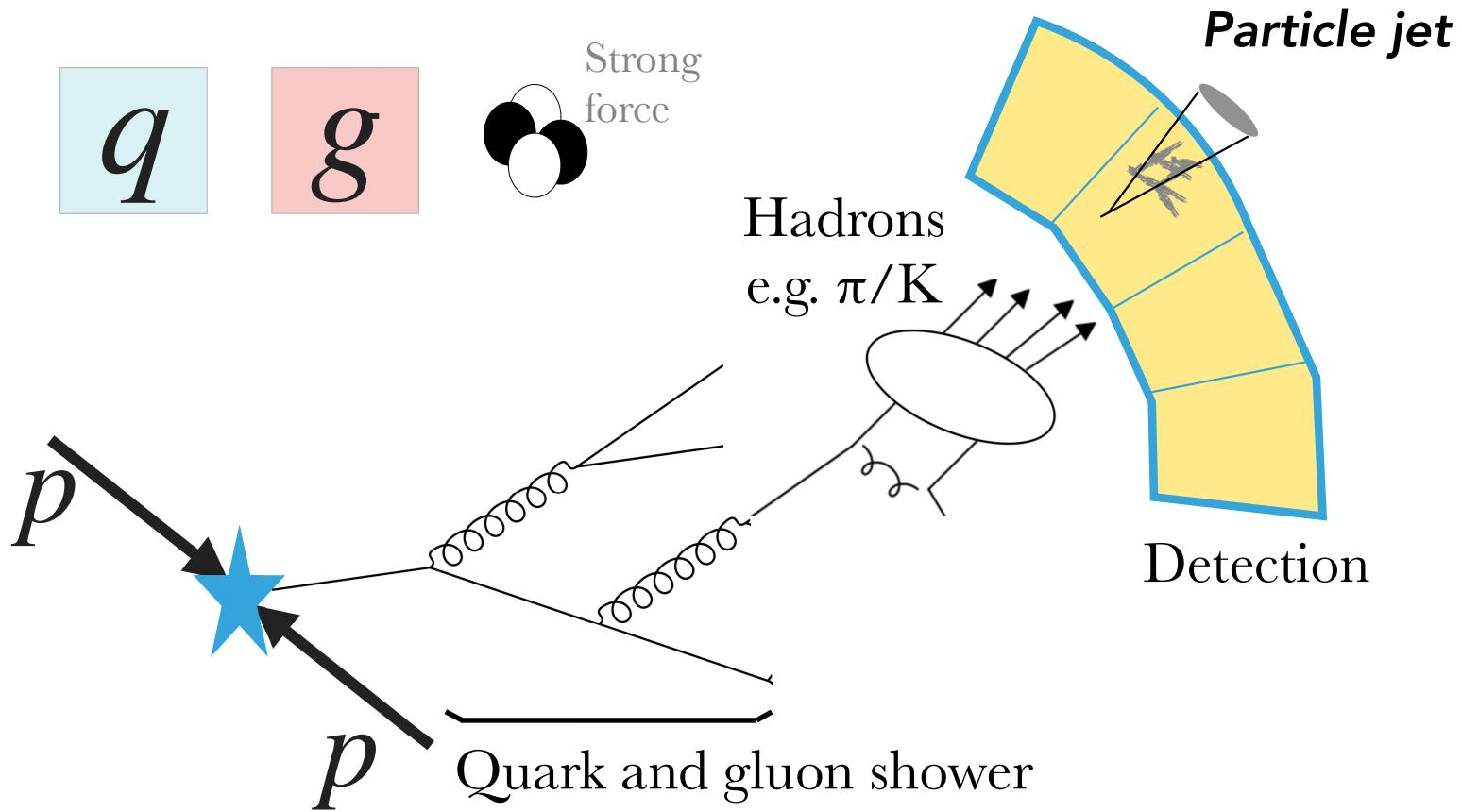


Andris Potrebko

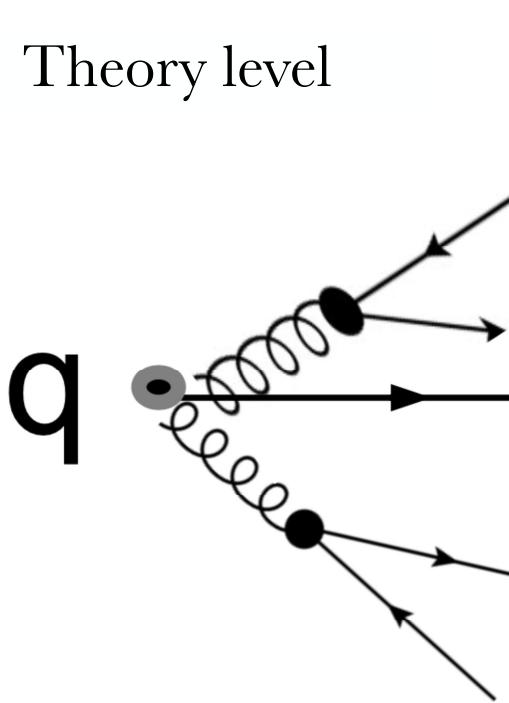
Mikael Myllymaki

# **Section 1: Jet algorithms**

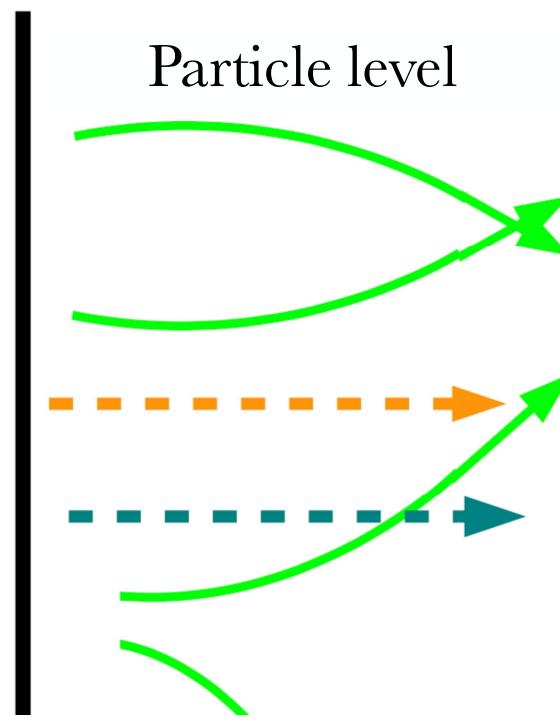
# Jets are signatures of quarks and gluons



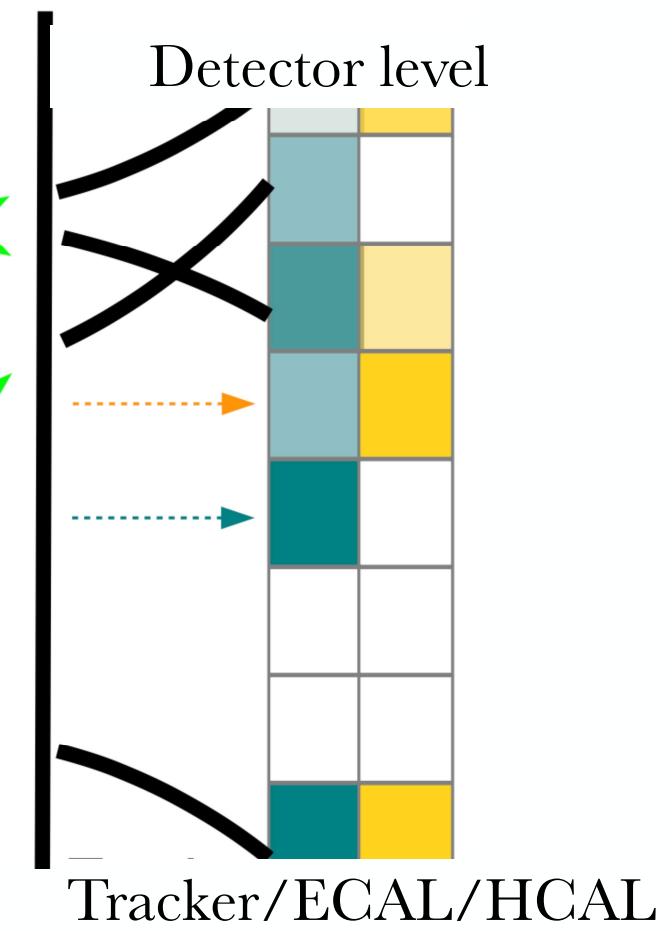
# We can define jets at different levels:



Theory level  
A composition of many particles originating from a quark or gluon

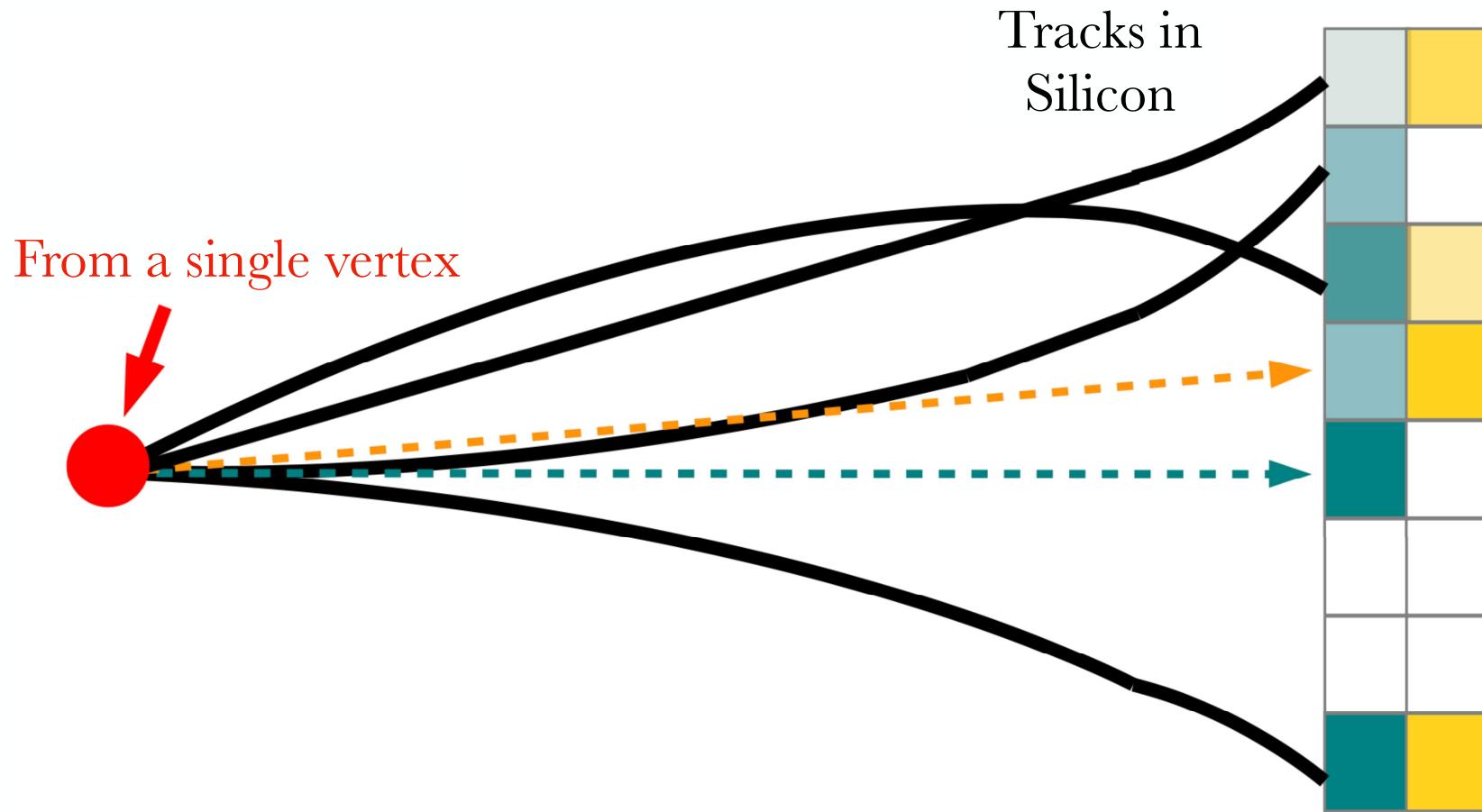


Particle level  
Charged Hadron  
Neutral Hadron  
Photon

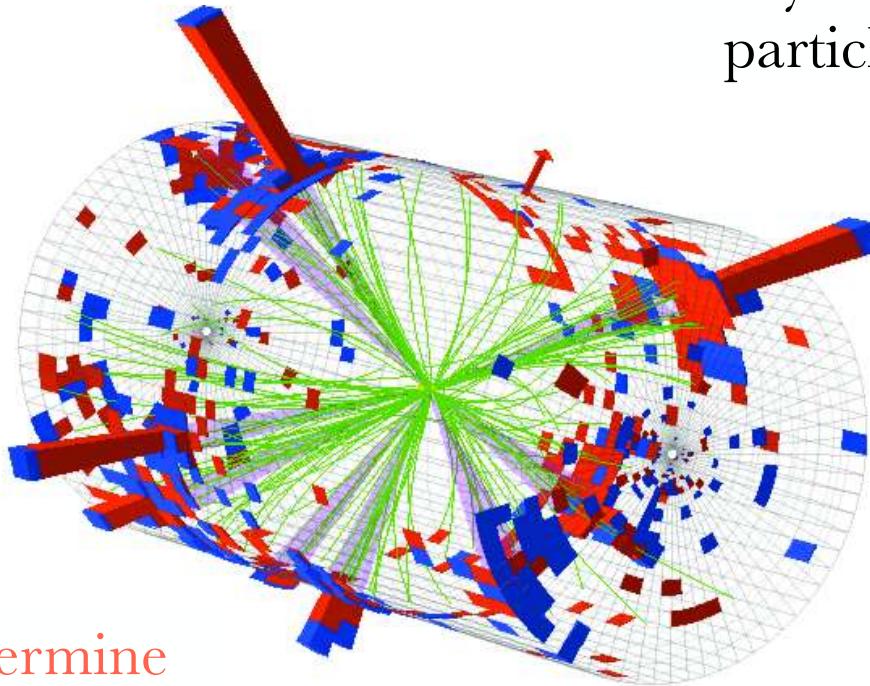


Detector level  
Tracker/ECAL/HCAL

# A jet inside the detector



# A jet inside the detector

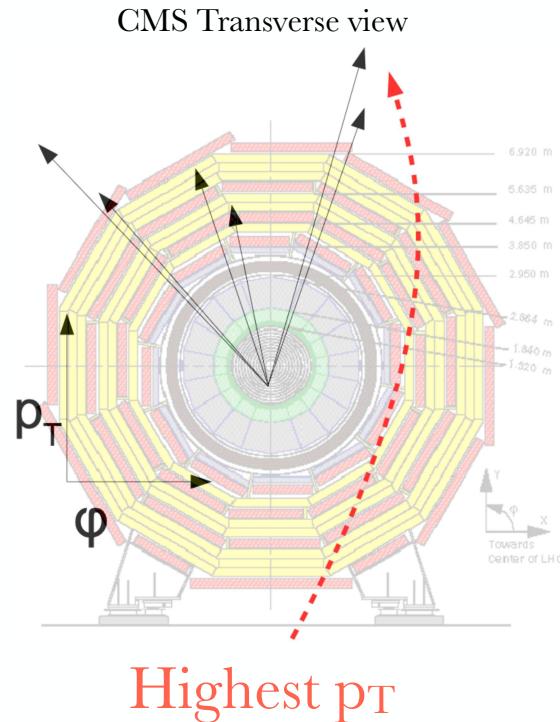


Why are there so many particles inside a jet?

How do you determine which particles should be included?

CMS Experiment at LHC, CERN  
Data recorded: Mon May 23 21:46:26 2011 EDT  
Run/Event: 165567 / 347495624  
Lumi section: 280  
Orbit/Crossing: 73255853 / 3161

# Jet reconstruction



- Start from a list of particles (each particle is known as constituent)
- Need a jet clustering algorithm:
  - Iteratively find two particles in the event that are closest in some distance measure

$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

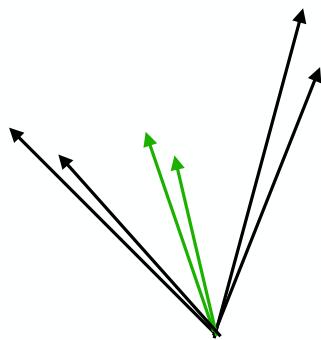
$\alpha = 1$ : kT algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti-kT algorithm

- New soft particle:  $p_T \rightarrow 0$  and new collinear particle  $\Delta R \rightarrow 0$

# Iterating over two



Start soft (small)

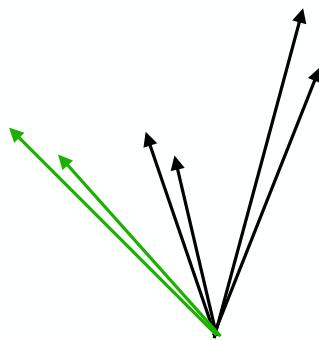
$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

$\alpha = 1$ : kT algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti-kT algorithm

# Iterating over two



Start close

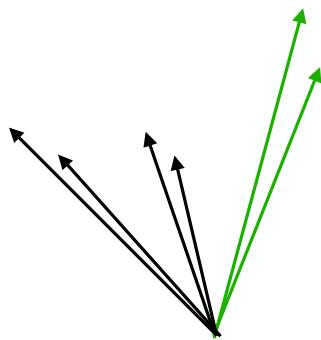
$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

$\alpha = 1$ : kT algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti-kT algorithm

# Iterating over two



Start hard (big)

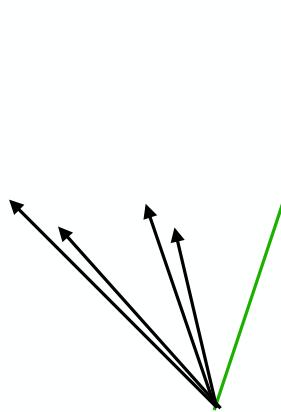
$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

$\alpha = 1$ : kT algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti-kT algorithm

## Now merge into a particle



Merge into a particle

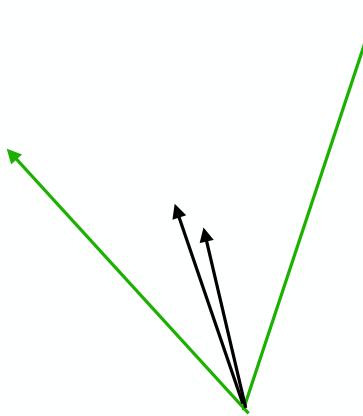
$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

$\alpha = 1$ : kT algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti-kT algorithm

## Merge next set



Merge next

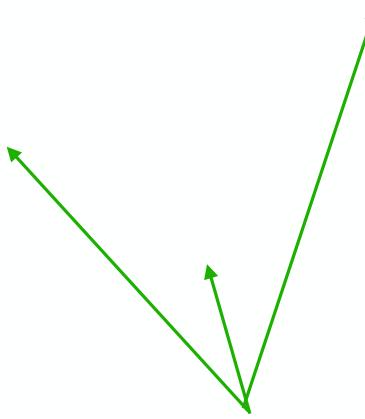
$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

$\alpha = 1$ : kT algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti-kT algorithm

## Merge next set



And next

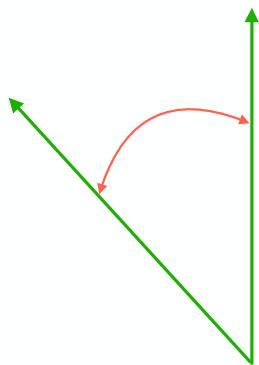
$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

$\alpha = 1$ : kT algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti-kT algorithm

## Merge next set



If distance > X  
(X=0.4,0.8 - stop)

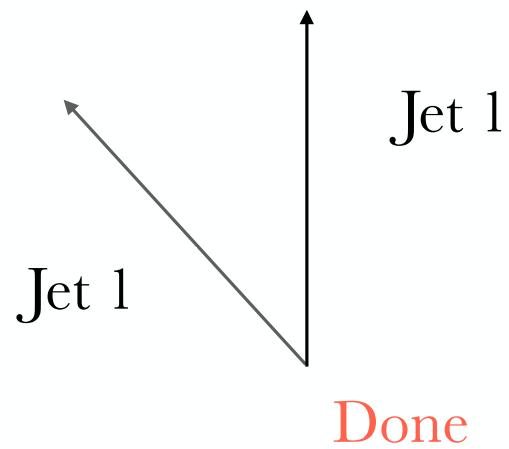
$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

$\alpha = 1$ : kT algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti-kT algorithm

# Done



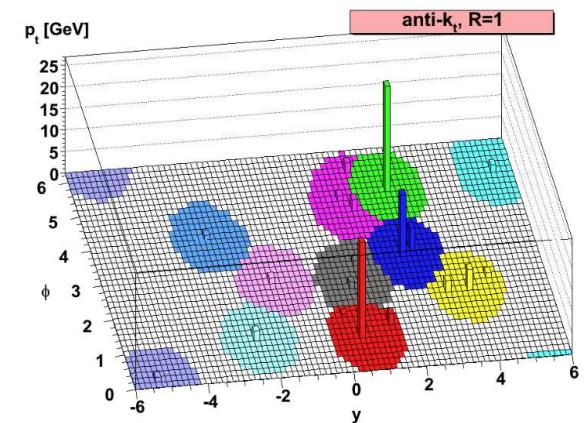
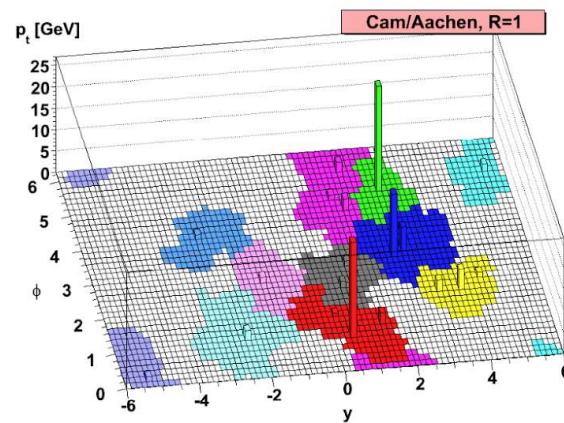
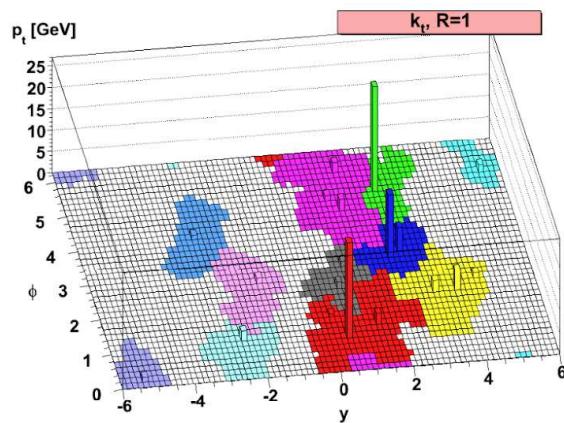
$$\Delta R \min(p_T^1, p_T^2)^\alpha$$

$\alpha = 1$ :  $k_T$  algorithm

$\alpha = 0$ : Cambridge-Aachen algorithm

$\alpha = -1$ : Anti- $k_T$  algorithm

# Comparison between jet algorithms



- How to do clustering by yourself?
  - Use FASTJET: <http://fastjet.fr/>

# Infrared and collinear safety

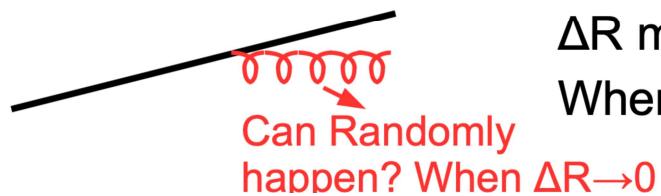
- To calculate anything with a jet we need to observe :
  - Infrared safety : invariance with random particle w/ $E \rightarrow 0$



$$\Delta R \min(p_T^1, p_T^2)^\alpha \rightarrow 0 \quad (p_T \rightarrow 0)$$



- Collinear safety : invariance with random split  $\Delta R \rightarrow 0$



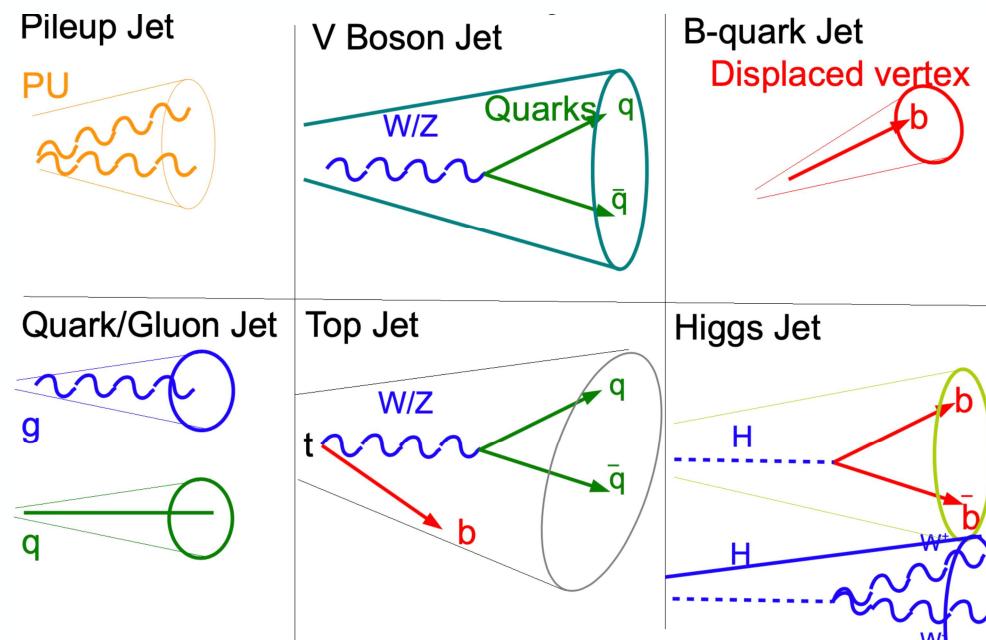
$$\Delta R \min(p_T^1, p_T^2)^\alpha \rightarrow 0$$

When  $\Delta R \rightarrow 0$

- The set of hard jets should be unchanged by soft emission and collinear splitting

# Different types of jets

- The size of the jet cone allows us to focus on a different object:



- Larger cone: top jet
- Smaller cone: W jet
- Much smaller: b-jet

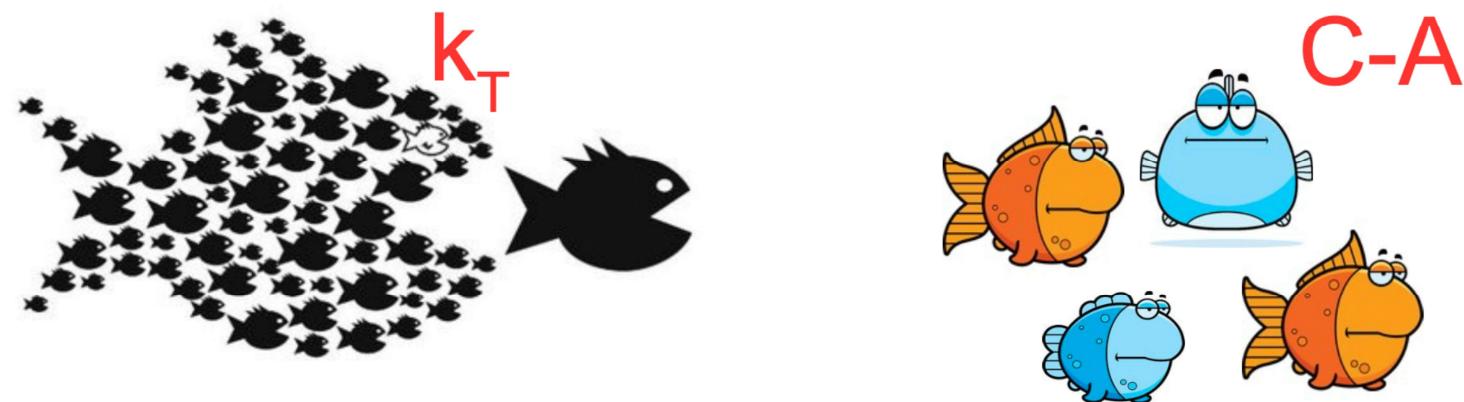
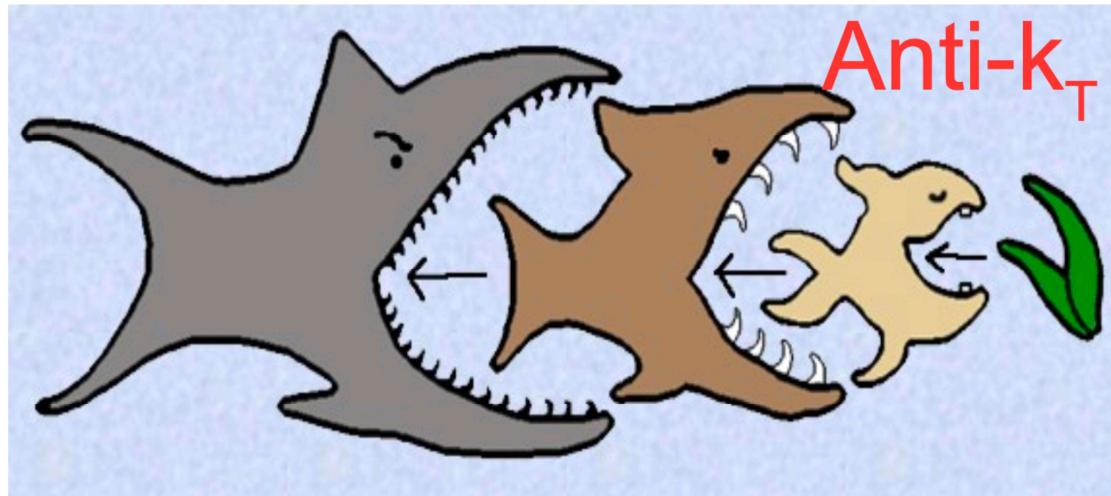
Master formula for heavy object:

$$\Delta R = \frac{2m}{p_T}$$

# Types of jets in CMS

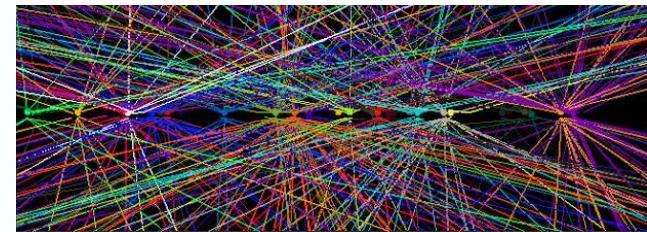
- We usually use **two types of cone-size: 0.4 and 0.8**
- Most often we **use the anti-kT algorithm : AK4 and AK8**
- In MINIAOD:
  - **slimmedJets = ak4PFJetsCHS**  
 $p_T > 10 \text{ GeV}$  (typically analysis cut will be at least  $p_T > 20$ )
  - **slimmedJetsPuppi = ak4PFJetsPUPPI**  
 $p_T > 170 \text{ GeV}$  with all information, including PF candidate links(typically analysis cut will be at least  $p > 200$ )
- In NanoAOD: [https://github.com/cms-nanoAOD/cmssw/blob/master-cmsswmaster/PhysicsTools/NanoAOD/python/jets\\_cff.py](https://github.com/cms-nanoAOD/cmssw/blob/master-cmsswmaster/PhysicsTools/NanoAOD/python/jets_cff.py)
  - Jet = **ak4PFJetsCHS**
  - FatJet = **ak8PFJetsPUPPI**
  - Also see: <https://twiki.cern.ch/twiki/bin/viewauth/CMS/JMECustomNanoAOD>

# Recap

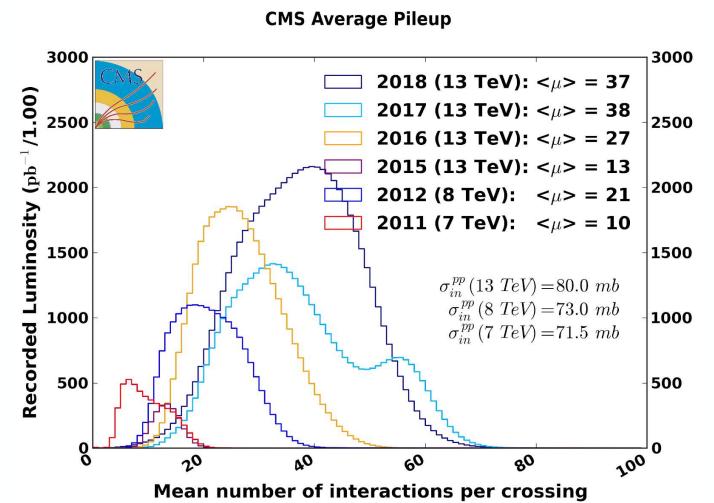


# **Section 2: Pileup**

# Pileup - PU

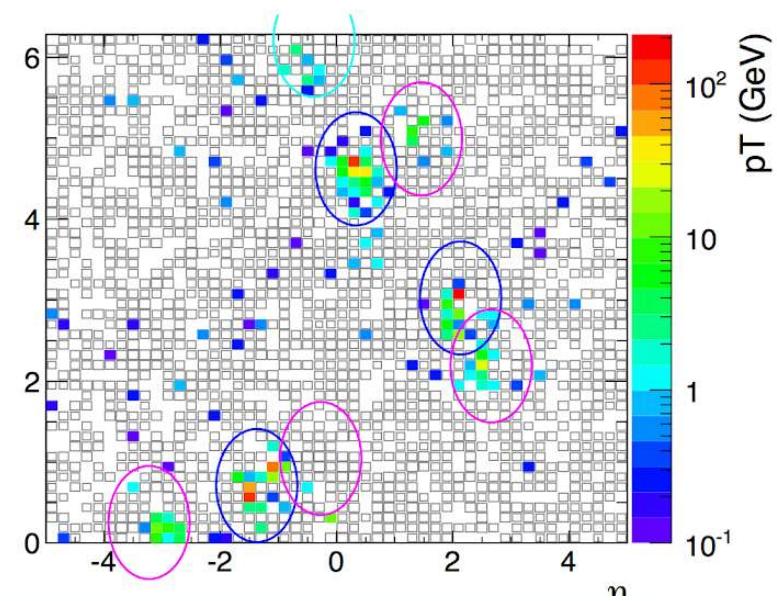
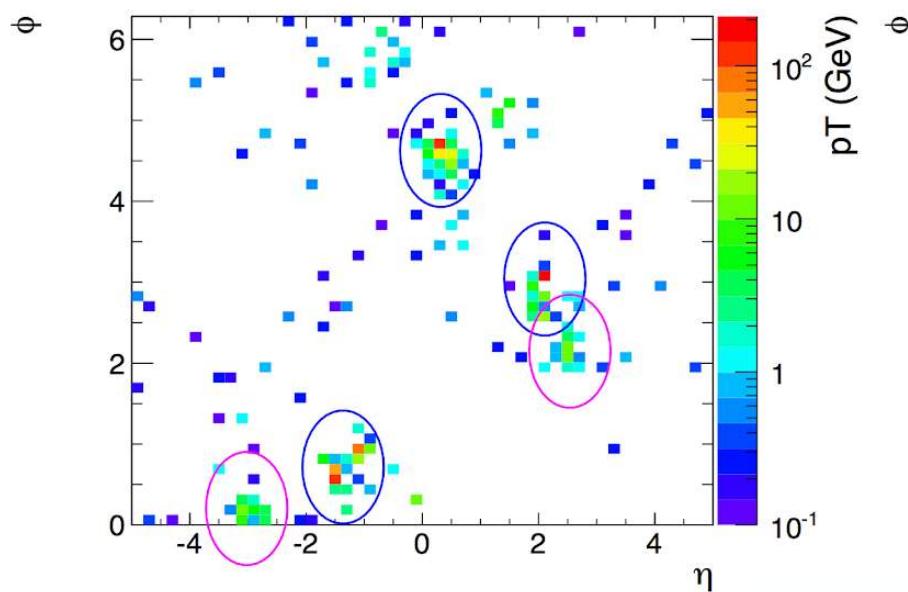


- What is pileup?
  - The **additional interactions** that occur in each bunch crossing because the instantaneous bunch-by-bunch luminosity is very high
    - “additional” implies that there is a hard-scatter interaction that has caused the event to fire the trigger
- Two things to know for your analysis:
  - Need to **know amount of pileup** - do PU reweighting
  - Need to **suppress pileup from jets**



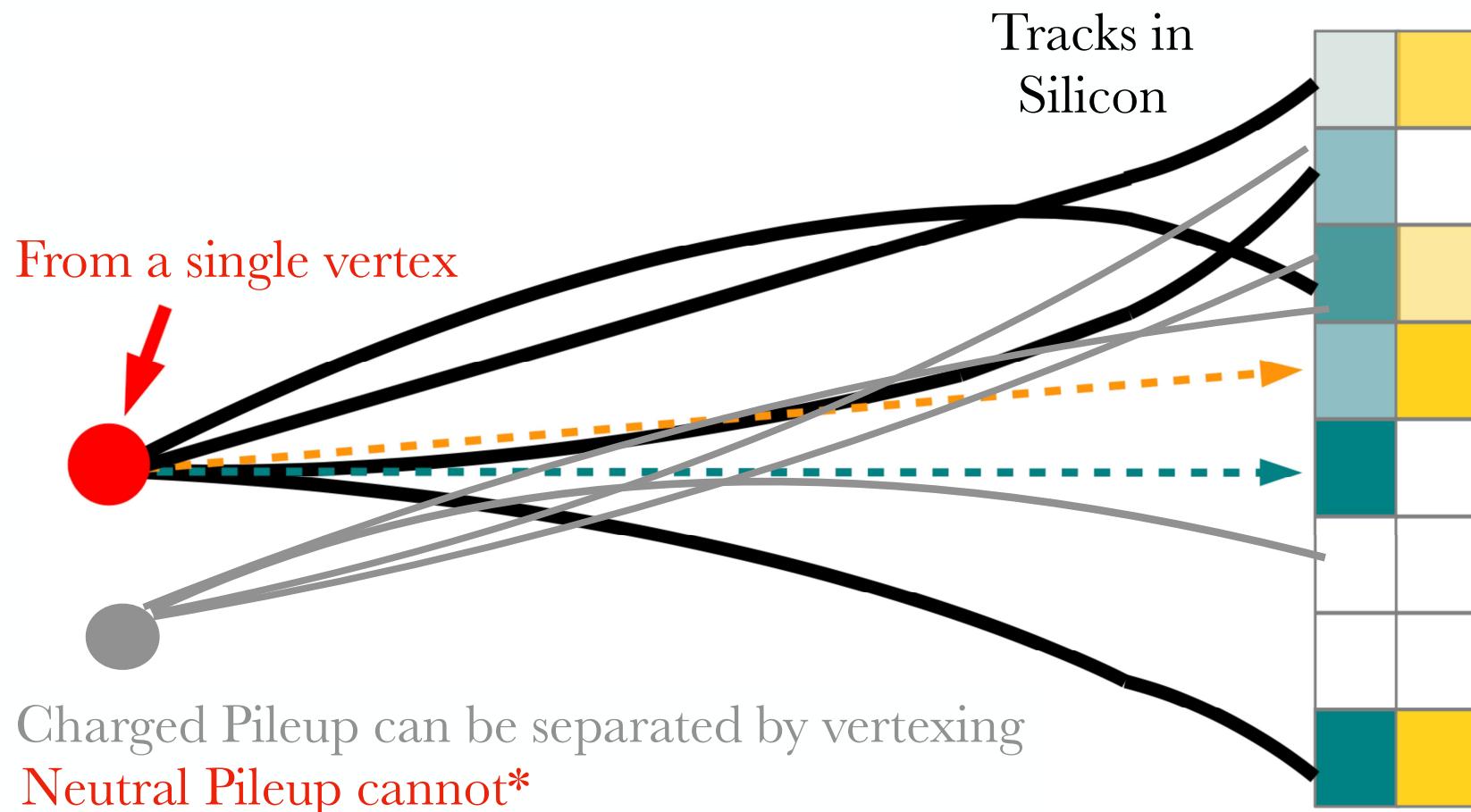
# Pileup in the detector

An LHC event at particle level



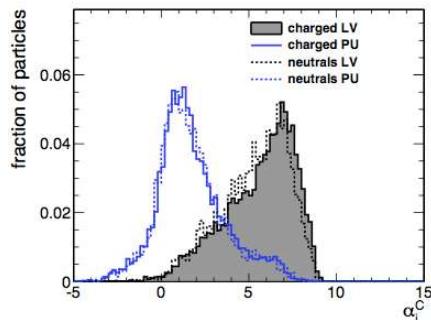
Now add pileup

# Pileup



# Pileup mitigation algorithms

- Different algorithms: Charged Hadron Subtraction,  $\Delta\beta$  correction, etc
- Focus on PUPPI: Pileup per Particle Identification
  - Removes charged particles from pileup
  - Assign weights to neutrals based on the likelihood that they originate from the leading vertex or pileup

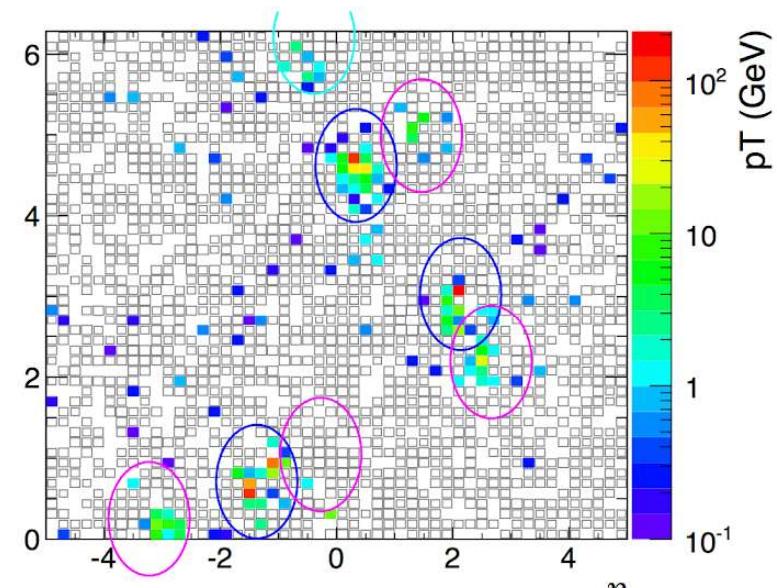
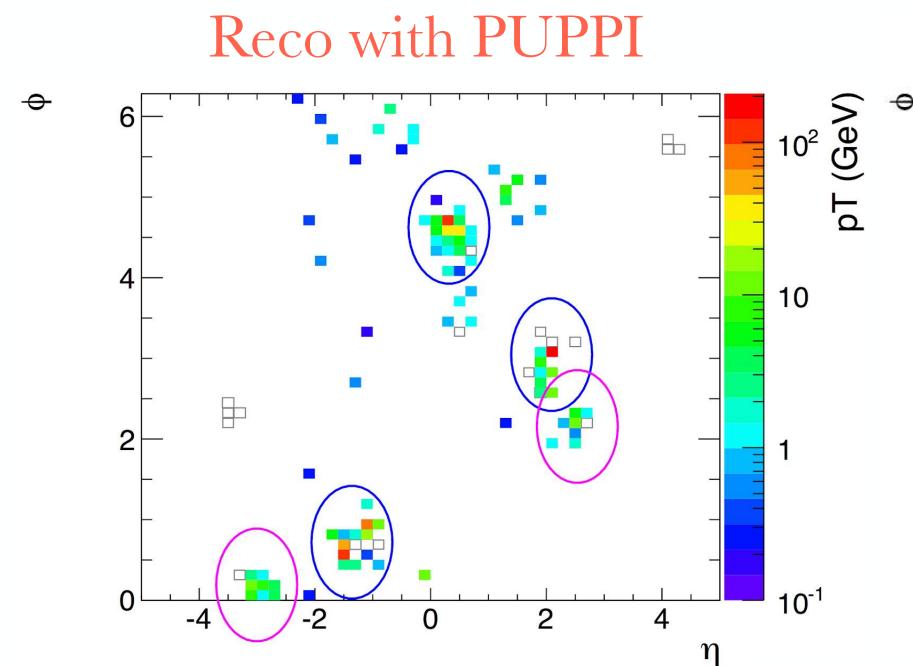


- This is done by defining a local metric that differs between pileup (PU) and the leading vertex (LV)

$$\alpha_i^C = \log \left[ \sum_{j \in \text{Ch}, \text{LV}} \frac{p_{T,j}}{\Delta R_{ij}} \Theta(R_0 - \Delta R_{ij}) \right]$$

↑ Hard collinear particles  
↓ Soft wide angle particles

# After PUPPI



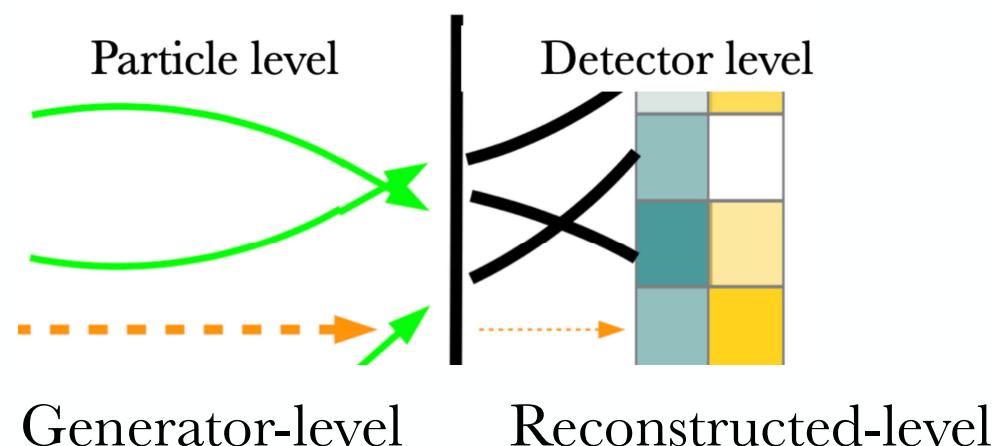
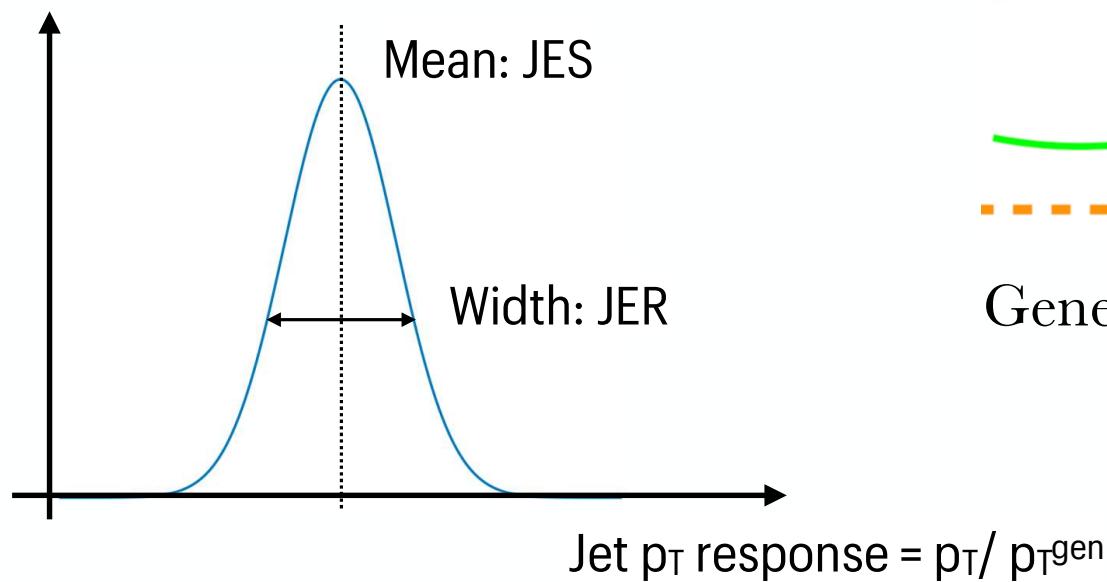
Now add pileup



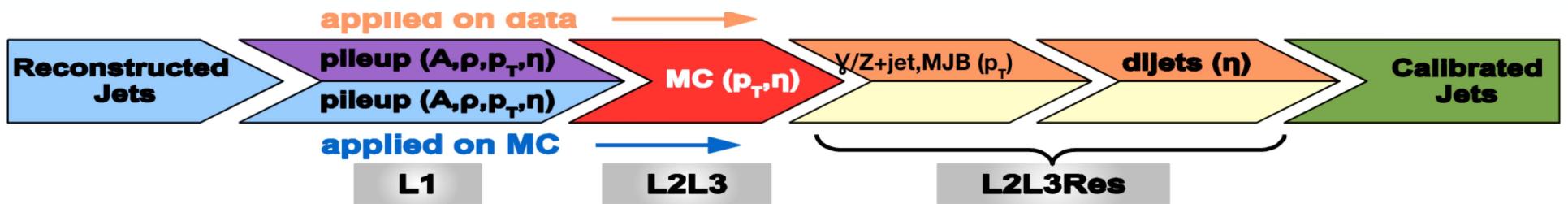
# **Section 3: Jet Energy Corrections**

# Jet energy corrections

- We expect average Jet  $p_T$  response to be different:
  - Pileup adding energy
  - Non-linear calorimeter response



# Jet energy corrections

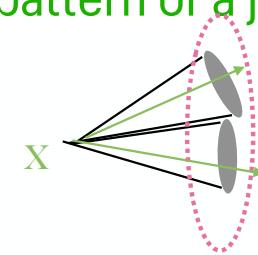


- We take factorized approach:
  - **Pileup corrections** to correct for offset energy
  - Correction to particle level jet vs.  $p_T$  and  $\eta$  from simulation
  - Only for data: Small residual corrections (**Pileup/relative and absolute**) to correct for differences between data and simulation

# **Section 4: Jet Substructure**

# Jet substructure

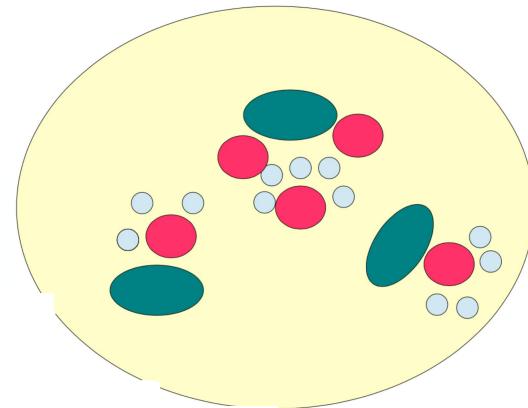
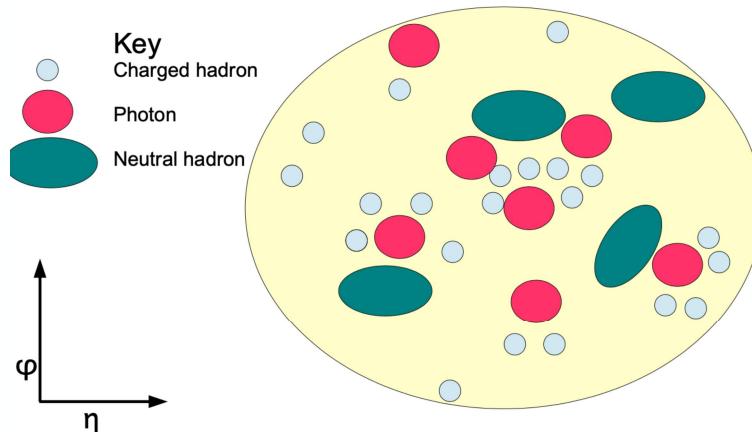
- A fancy name for an evolving field that studies the **internal radiation pattern of a jet**:
  - Becomes more interesting at **high-Lorentz boost: boosted jets**
- A couple of useful topics:
  - **Jet grooming and jet mass**
  - **Jet-tagging**
- Some great resources: (beyond CMS)
  - Looking inside jets: <https://arxiv.org/pdf/1901.10342.pdf>
  - Review in theory and machine learning: <https://arxiv.org/abs/1709.04464>
  - Experimental review: <https://arxiv.org/abs/1803.06991>
  - CMS's latest boosted jet paper: <https://arxiv.org/abs/2004.08262>





# Jet tagging

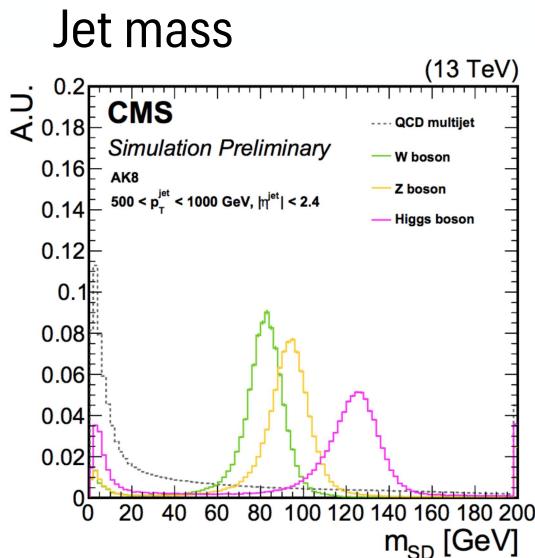
- Grooming **removes a jet's soft and wide-angle radiation**
- All algorithms need to re-cluster to start:    • Soft-drop is widely used in CMS:



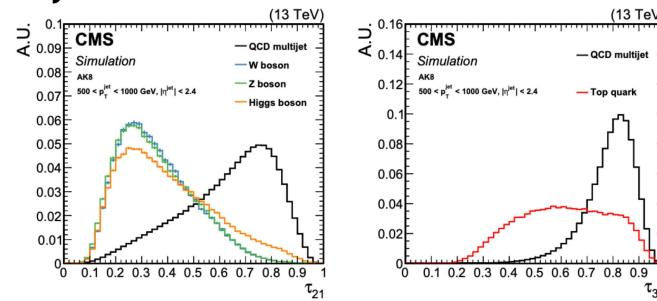
- Iteratively declusters jet removing lowest  $p_T$  subjet failing pairwise condition

$$z = \frac{\min(p_T^1, p_T^2)}{p_T^1 + p_T^2} \quad z > z_{cut} \left( \frac{\Delta R_{12}}{R} \right)^\beta$$

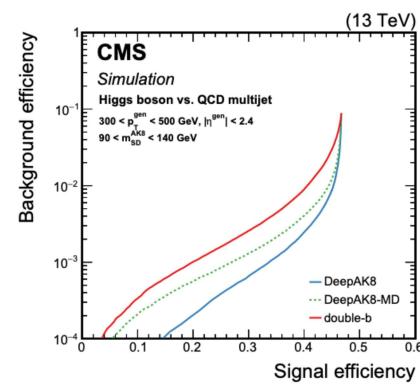
# Boosted Jet tagging



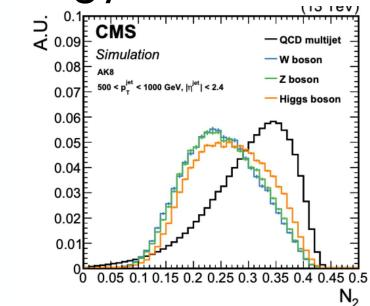
## N-subjettiness



## DeepAK8



## Energy-correlation-functions



## Particle-Net

