

Jet Cleansing: Pileup Mitigation at High Luminosity

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[arxiv:1308.soon](#)

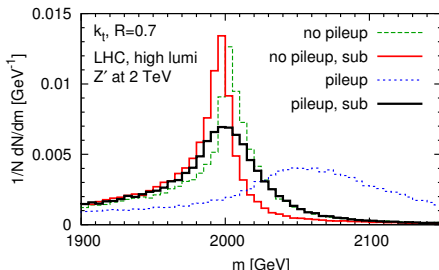
Outline

- ▶ Current Methods for Pileup
- ▶ Jet Cleansing Technique
- ▶ Demonstration of Jet Cleansing
- ▶ Conclusions

Current Pileup Techniques

- ▶ Subtraction [Cacciari, Salam; [arxiv:0707.1378](#)]

$$p_T^{(\text{sub})} = p_T - \rho A$$
$$\rho = \text{median} \left[\left\{ \frac{p_{Tj}}{A_j} \right\} \right]$$



- ▶ Grooming
 - ▶ Filtering (+ Mass Drop) [Butterworth, Davison, Rubin, Salam: [arxiv:0802.2470](#)]
 - ▶ Pruning [Ellis, Vermilion, Walsh; [arxiv:0903.5081](#), [arxiv:0912.0033](#)]
 - ▶ Trimming [Krohn, Thaler, Wang; [arxiv:0912.1342](#)]

Current Pileup Techniques

Current techniques work very well!

- ▶ Subtraction used in 100+ ATLAS/CMS papers (including Higgs).
- ▶ Grooming successively removes pileup effects.

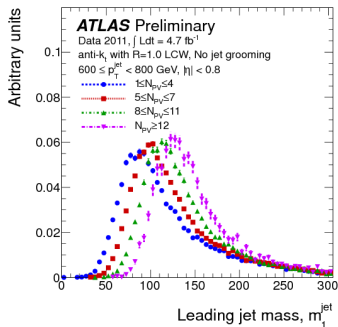


Figure: Pre-grooming

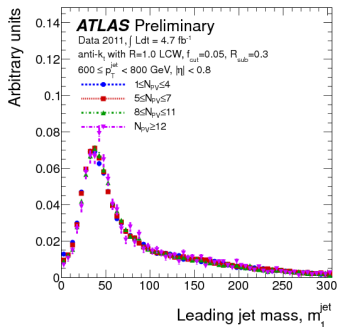
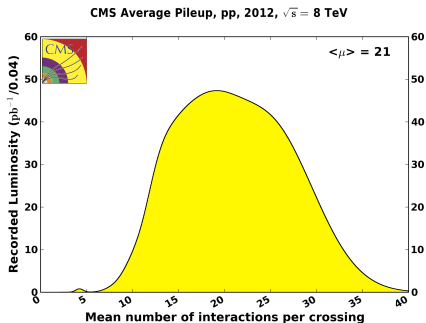
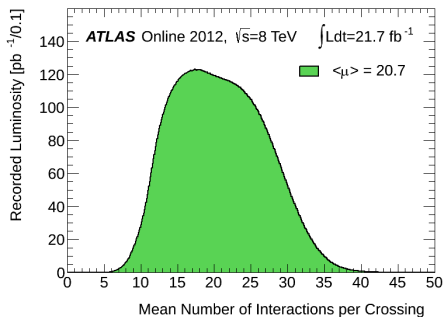


Figure: Post-grooming

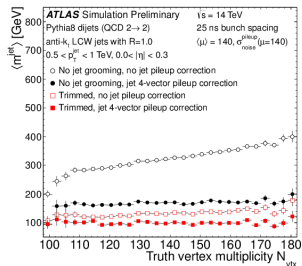
Current Pileup Techniques

Current pileup levels have been $\langle\mu\rangle = 21$.



We may need to be able to do physics at $\langle\mu\rangle = 140!$

Future Pileup



- ▶ Current plots mostly show restored *mean* of distributions.
- ▶ We can go further and look event-by-event (at high pileup).

- ▶ Look at correlations between truth (FSR/ISR/MI) and corrected jets.

$$\rho_{12} = \frac{E[(m_1 - \mu_1)(m_2 - \mu_2)]}{\sigma_1 \sigma_2}$$

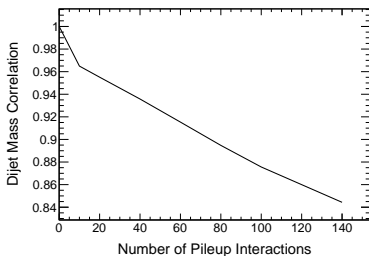
$$-1 \leq \rho_{12} \leq 1$$

Future Grooming

- ▶ Grooming is not invariant with respect to pileup.
- ▶ Example: Dijet mass resonance to light quarks (color singlet scalar with $m = 500$ GeV).
- ▶ Details: 13 TeV, Pythia 8: default tune, jets clustered with anti- k_T ($R = 1.0$), subjets clustered with k_T ($R = 0.3$).

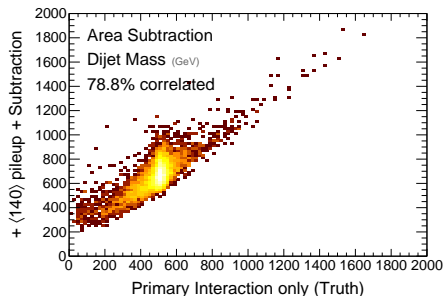
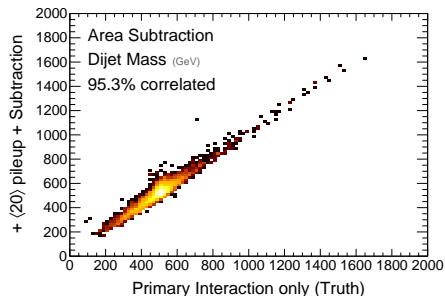
- ▶ Look at correlations between truth (FSR/ISR/MI) and corrected jets.

$$\rho_{12} = \frac{E[(m_1 - \mu_1)(m_2 - \mu_2)]}{\sigma_1 \sigma_2}$$



Future Subtraction

- ▶ Subtraction will be challenged at high pileup. Shown are 20 pileup events (left) and 140 pileup events (right).



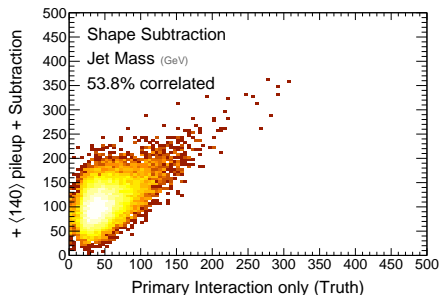
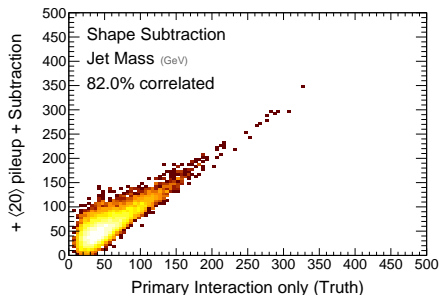
- ▶ Subtraction approximates pileup with uniform density.
- ▶ Depends on properties of event.
- ▶ Is a kinematic correction.

Future Shape Subtraction

- ▶ Jet shapes can also be subtracted [Soyez, Salam, Kim, Duta, Cacciari; [arxiv:1211.280110](https://arxiv.org/abs/1211.280110)]

$$V_{\text{jet,sub}} = V_{\text{jet}} - \rho V_{\text{jet}}^{[1]} + \frac{1}{2} \rho^2 V_{\text{jet}}^{[2]} + \dots$$

- ▶ Computed separately for each observable. Shown are 20 pileup events (left) and 140 pileup events (right).



Future Pileup Conditions

Would be nice to have a pileup technique that

- ▶ is observable independent.
- ▶ does not degrade with amount of pileup.

There is additional information we can use.

- ▶ Subtraction cleverly uses the rest of the event.
- ▶ Information from tracker can be used to identify charged particles.
- ▶ Tracking can distinguish pileup from the leading primary vertex (PV).

Jet Cleansing – Algorithm

- ▶ Cluster cells into jets (only jets with $|\eta| < 2.5$).
- ▶ Recluster cells into subjets. Convert tracks (with $p_T > 0.5$ GeV) into ghosts and include in clustering.
- ▶ Rescale *constituents* in subjets $p^\mu \rightarrow \lambda p^\mu$, where $\lambda = \lambda(\text{calo cells, PV tracks, pileup tracks})$.
- ▶ Reassemble subjets into cleansed jet.

What should the scaling factor be?

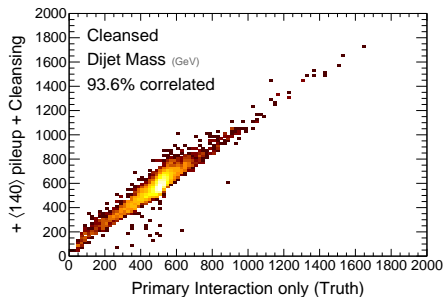
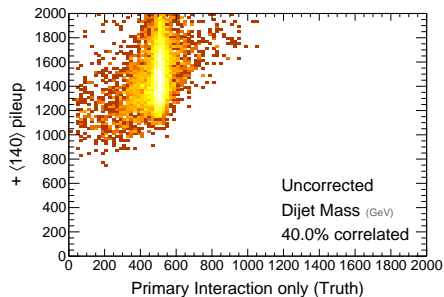
- ▶ Calorimeter measures $p_T(\text{PV}) + p_T(\text{pileup})$, but we want $p_T(\text{PV})$.
- ▶ Simplest scaling factor would be

$$p^\mu \rightarrow p^\mu \times \left(\frac{p_T^C(\text{PV})}{p_T^C(\text{PV}) + p_T^C(\text{pileup})} \right)$$

- ▶ This approximates charge-to-all ratio as constant for primary vertex and pileup.

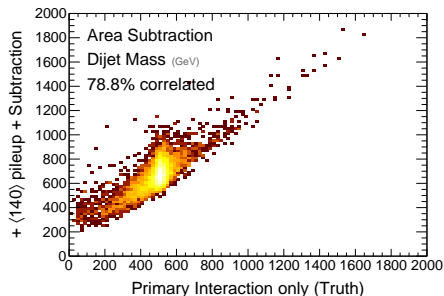
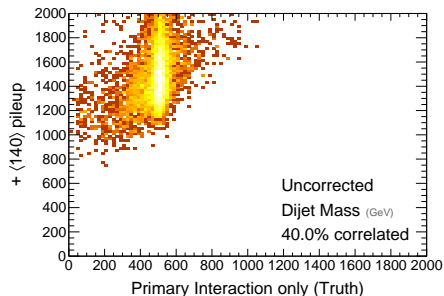
Jet Cleansing – Demonstration

- ▶ Look at correlations between truth and corrected jets.
- ▶ Shown below with 140 pileup events.
- ▶ Cleansing returns jet very close to uncontaminated state.



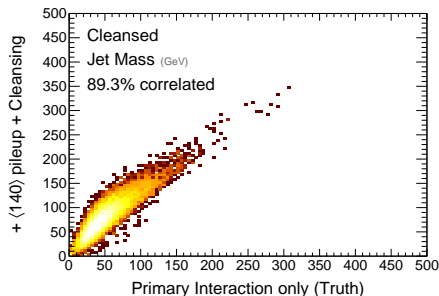
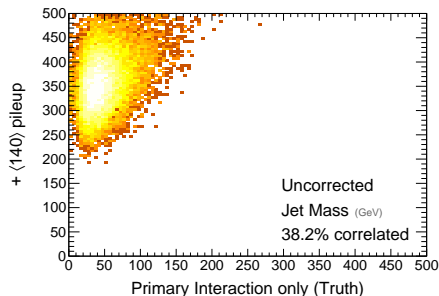
Jet Cleansing – Demonstration

- ▶ Look at correlations between truth and corrected jets.
- ▶ Shown below with 140 pileup events.
- ▶ Subtraction *alone* does not perform as well.



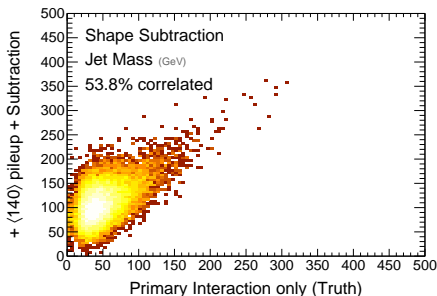
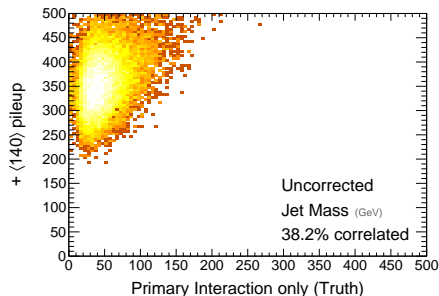
Jet Cleansing – Demonstration

- ▶ Look at correlations between truth and corrected jets.
- ▶ Shown below with 140 pileup events.
- ▶ Cleansing can also do jet mass.



Jet Cleansing – Demonstration

- ▶ Look at correlations between truth and corrected jets.
- ▶ Shown below with 140 pileup events.
- ▶ Shape subtraction does not perform as well on QCD jet mass.



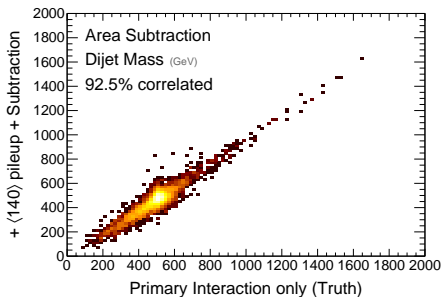
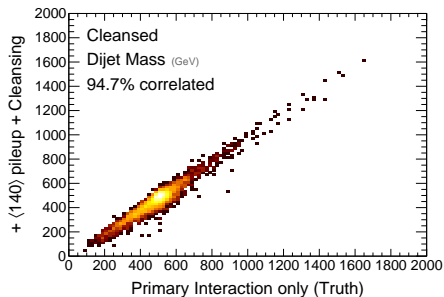
Jet Cleansing with Groomers

Cleansing (and subtraction) can be naturally applied with groomers (e.g. *trimming*).

- ▶ Cluster cells into jets.
- ▶ Recluster cells into subjects. Convert tracks into ghosts and include in clustering.
- ▶ Rescale *constituents* in subjects $p^\mu \rightarrow \lambda p^\mu$, where $\lambda = \lambda(\text{calo cells, PV tracks, pileup tracks})$.
- ▶ Only keep subjects with $p_{T,\text{sub}} > f_{\text{cut}} p_{T,\text{jet}}$.
- ▶ Reassemble subjects into cleansed jet.

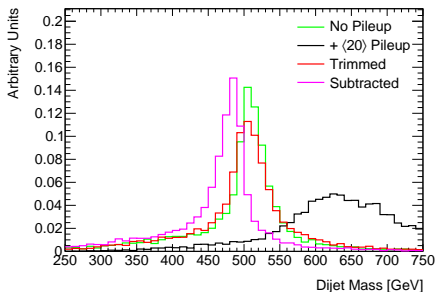
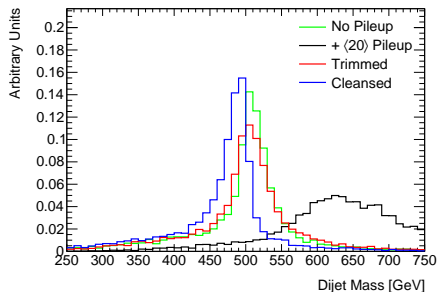
Jet Cleansing + Trimming ($f_{\text{cut}} = 0.05$)

- ▶ Look at correlations between truth and corrected jets.
- ▶ Shown below with 140 pileup events.
- ▶ Pileup correction *and* grooming is very effective.



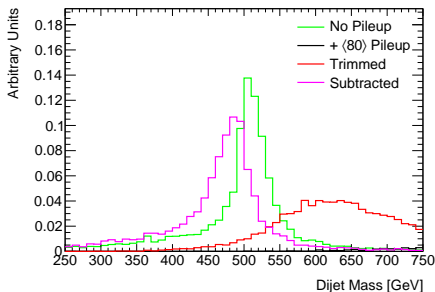
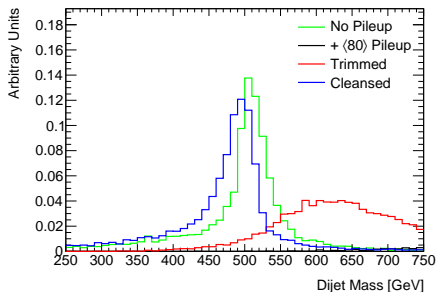
Jet Cleansing – Demonstration

- ▶ Example: Dijet mass resonance to light quarks (color singlet scalar with $m = 500$ GeV).
- ▶ Shown below with 20 pileup events and $f_{\text{cut}} = 0.05$.



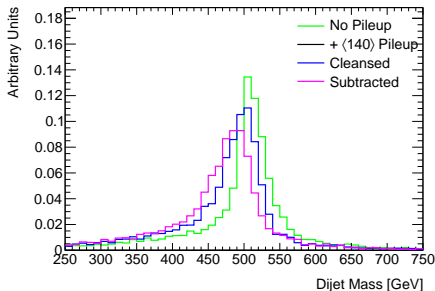
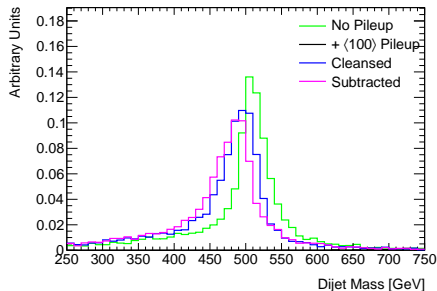
Jet Cleansing – Demonstration

- ▶ Example: Dijet mass resonance to light quarks (color singlet scalar with $m = 500$ GeV).
- ▶ Shown below with 80 pileup events and $f_{\text{cut}} = 0.05$.



Jet Cleansing – Demonstration

- ▶ Example: Dijet mass resonance to light quarks (color singlet scalar with $m = 500$ GeV).
- ▶ Shown below with 100 (left) and 140 (right) pileup events and $f_{\text{cut}} = 0.05$.



Data-Driven Jet Cleansing

- ▶ Let the charge-to-all ratio be

$$\gamma = \frac{p_T^C}{p_T}$$

- ▶ We can let PV and pileup have independent charge-to-all ratios

$$p^\mu \rightarrow p^\mu \times \left(\frac{\gamma_{pv}^{-1} p_T^C(\text{PV})}{\gamma_{pv}^{-1} p_T^C(\text{PV}) + \gamma_{pu}^{-1} p_T^C(\text{pileup})} \right)$$

$$p^\mu \rightarrow p^\mu \times \left(1 - \frac{\gamma_{pu}^{-1} p_T^C(\text{pileup})}{\gamma_{pv}^{-1} p_T^C(\text{PV}) + \gamma_{pu}^{-1} p_T^C(\text{pileup})} \right)$$

Data-Driven Jet Cleansing



$$p^\mu \rightarrow p^\mu \times \left(1 - \frac{\gamma_{pu}^{-1} p_T^C(\text{pileup})}{\gamma_{pv}^{-1} p_T^C(\text{PV}) + \gamma_{pu}^{-1} p_T^C(\text{pileup})} \right)$$

$$p^\mu \rightarrow p^\mu \times \left(1 - \frac{p_T^C(\text{pileup})}{\gamma_{pu} p_T(\text{calo})} \right) \Rightarrow \boxed{p_T \rightarrow p_T - \frac{p_T^C(\text{pileup})}{\gamma_{pu}}}$$

- ▶ We take γ_{pu} as a constant ($\gamma_{pu} = 0.55$), but it can in principle be taken from data.
- ▶ All results shown in this talk with cleansing use this (the difference is a few percent).

Conclusions

- ▶ Current pileup mitigation techniques will be challenged at high pileup.
- ▶ By incorporating charged track information we can maintain performance at high luminosities → jet cleansing.
- ▶ Cleansing can be used in conjunction with trimming.
- ▶ Can use input from data for improvements to charged-to-all ratio value.