

# Jet Reconstruction Algorithms in HI Environment: Successes and Failures

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In collaboration with G. Salam and G. Soyez

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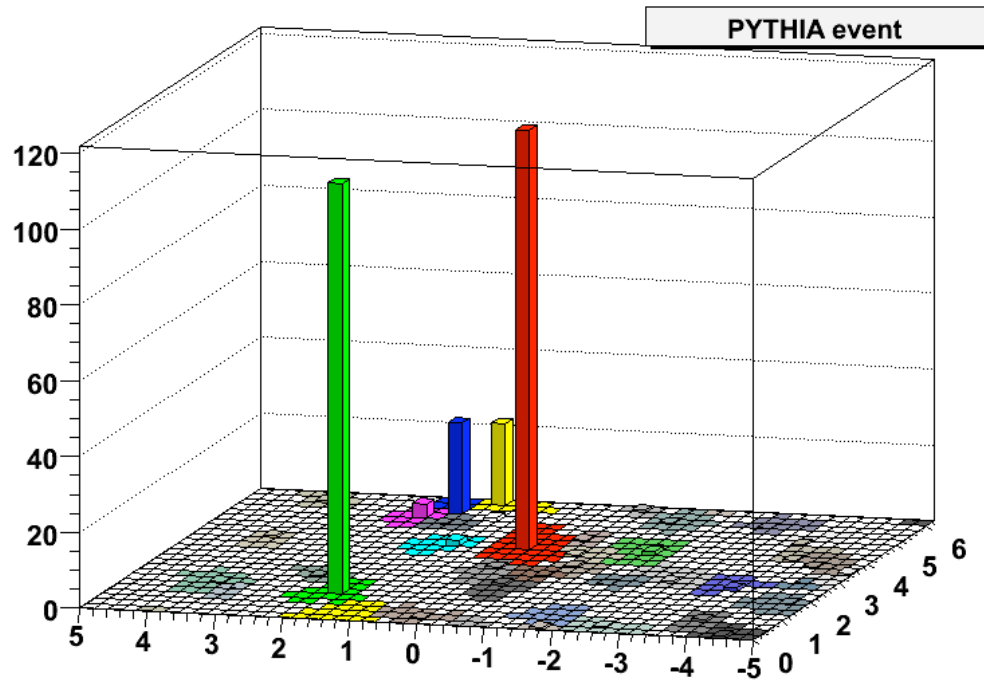
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# Jet Reconstruction Algorithms in HI Environment: Successes and ~~Failures~~ Limitations

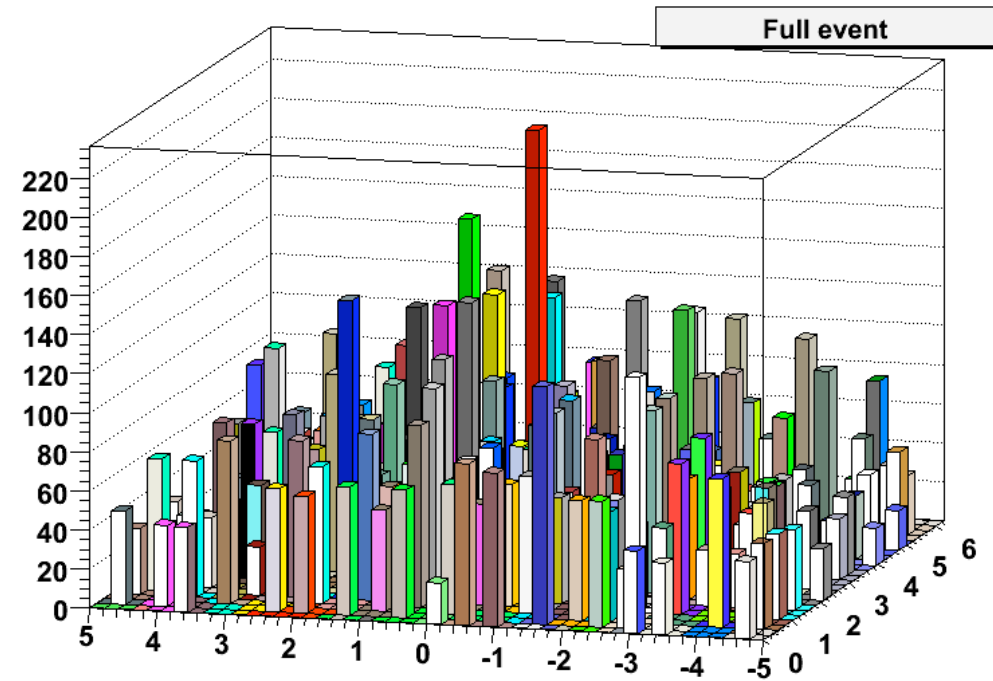
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# Hard jets and background



Hard jets  
(pp collisions)



Hard jets + background  
(AA collisions)

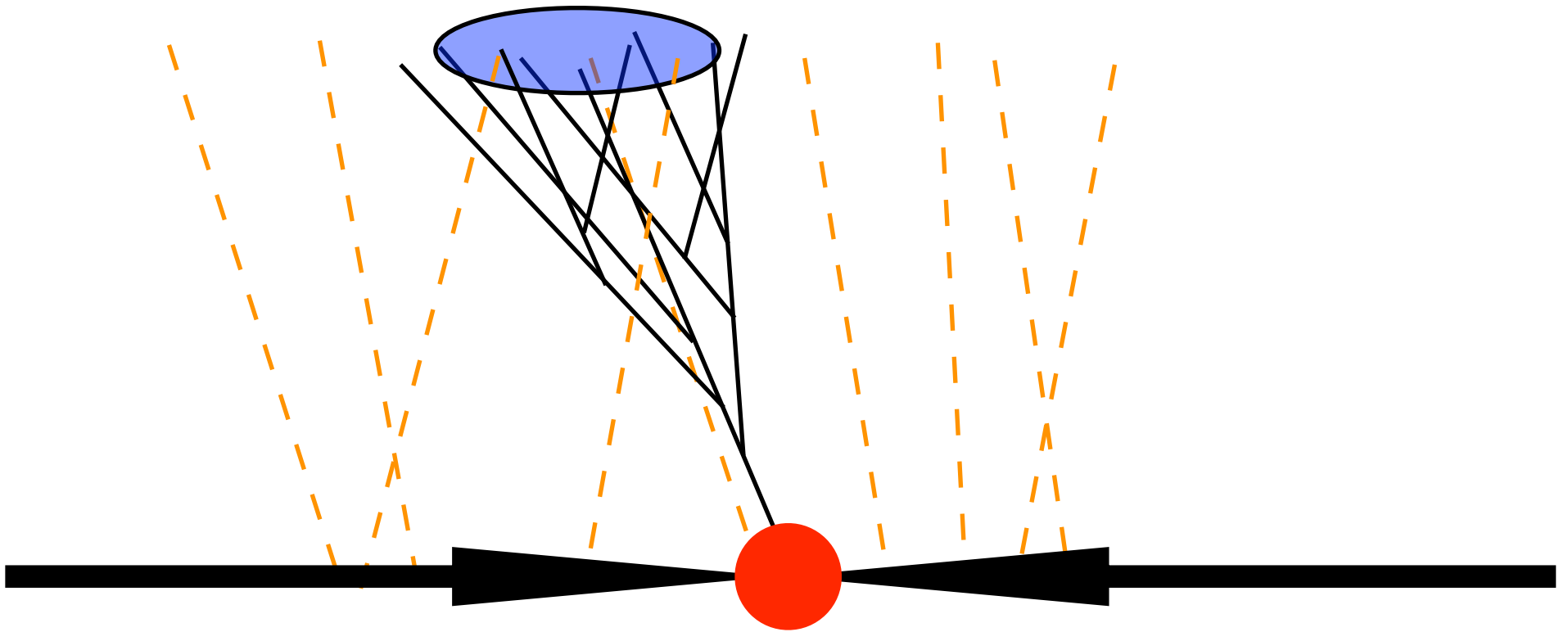
- ▶ To what extent can we 'reconstruct' the hard jets?
- ▶ How are specific observables affected by limitations in the reconstruction?

# Hard jets and background

**How are the hard jets  
modified by the background?**

**Susceptibility** (how much bkgd gets picked up)

**Resiliency** (how much the original jet changes)



The larger a jet is, the more it is contaminated by background radiation

If a jet algorithm does not return jets with a fixed area, this needs to be calculated on a jet-by-jet basis

# Susceptibility: jet area

MC, Salam, Soyez, arXiv:0802.1188

## Operational definition of **active jet area**:

Add many **ghost-particles** of infinitesimally small momentum to the hard event.

Cluster them together with the real particles, and count how many on average get clustered within a given jet.

$$A(J | \{g_i\}) = \frac{N_g(J)}{v_g}$$

Number of ghosts in jet  $J$

Active area of a single ghosts configuration

Ghost density

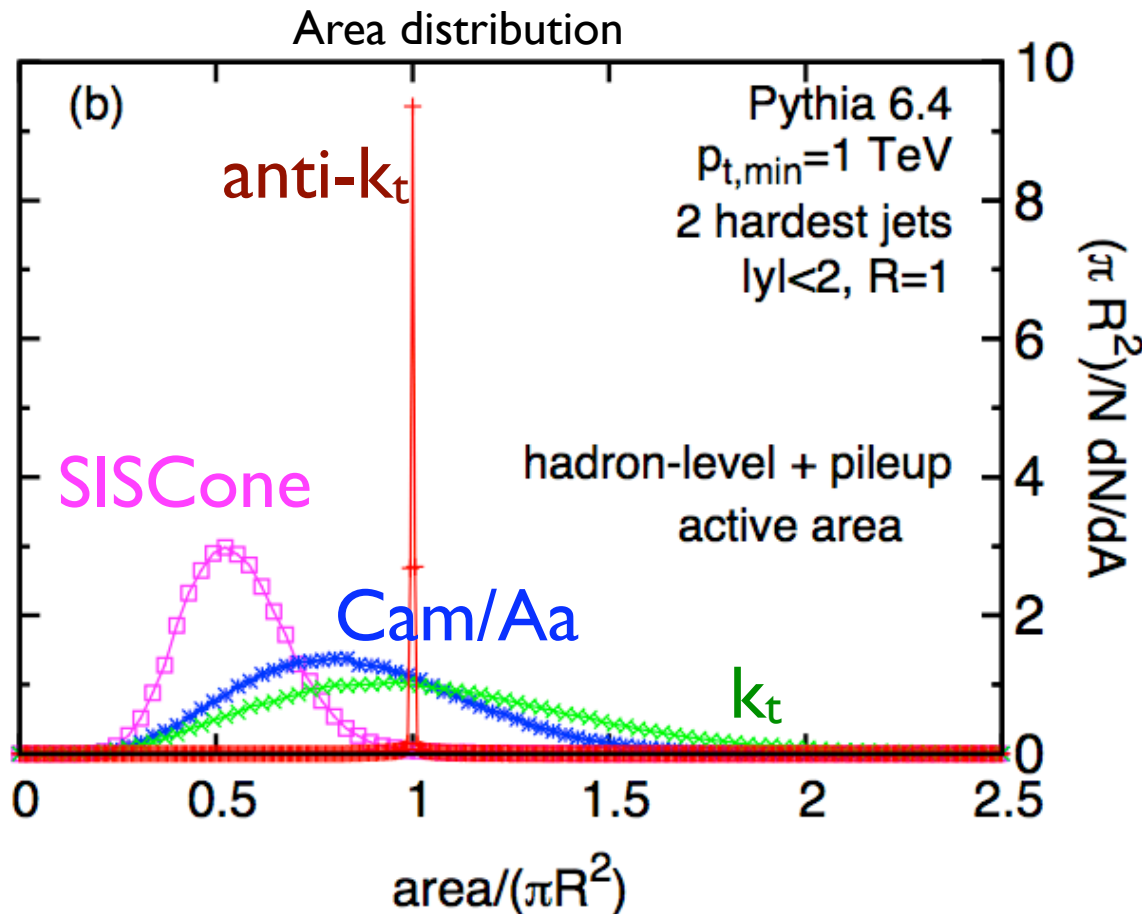
$$A(J) = \lim_{v_g \rightarrow \infty} \langle A(J | \{g_i\}) \rangle_g$$

Active area

# A jet is not (always) a cone

The typical area of a jet around a jet is **not** necessarily  $\pi R^2$

l-particle areas	$k_t$	Cam/Aa	SISCone	anti- $k_t$
$\langle A \rangle / \pi R^2$	0.81	0.81	1/4	1



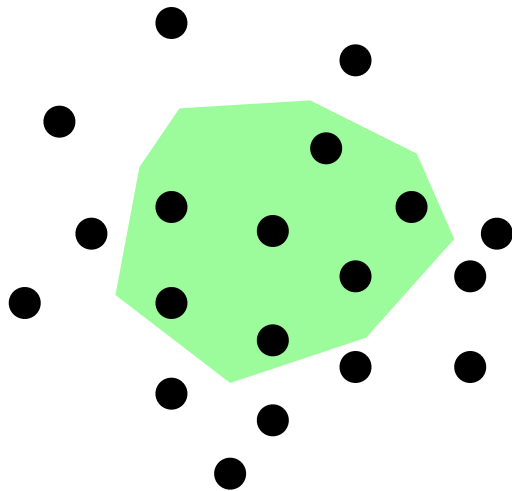
Only **anti- $k_t$**  has the behaviour one would naively expect

(Note also the small fluctuations of the anti- $k_t$  area. Actually irrelevant, though, if measured jet-by-jet)



“How (much) a jet changes when immersed in a background”

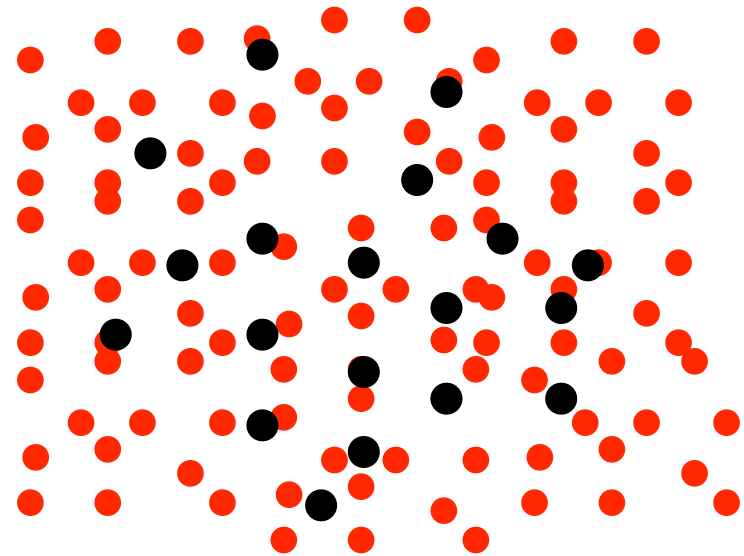
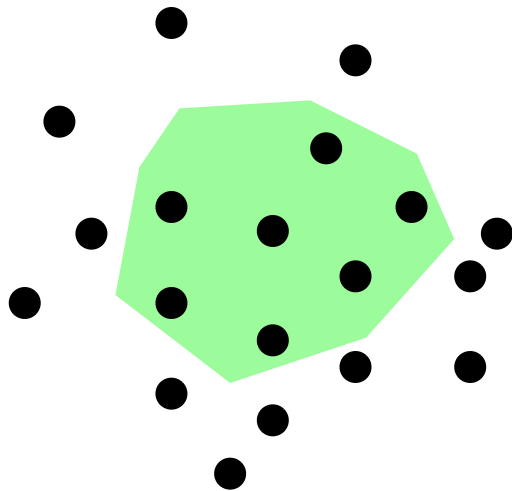
Without  
background



# Back-reaction

“How (much) a jet changes when immersed in a background”

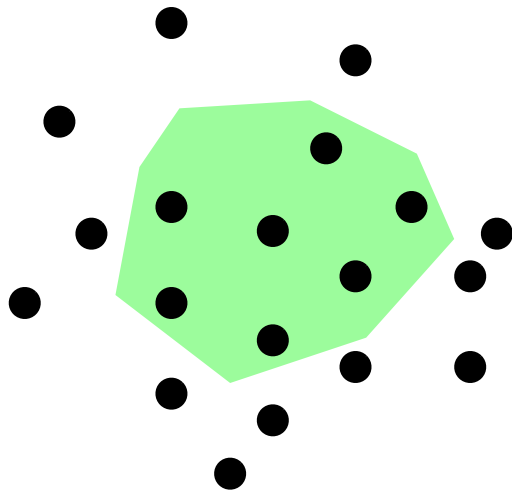
Without  
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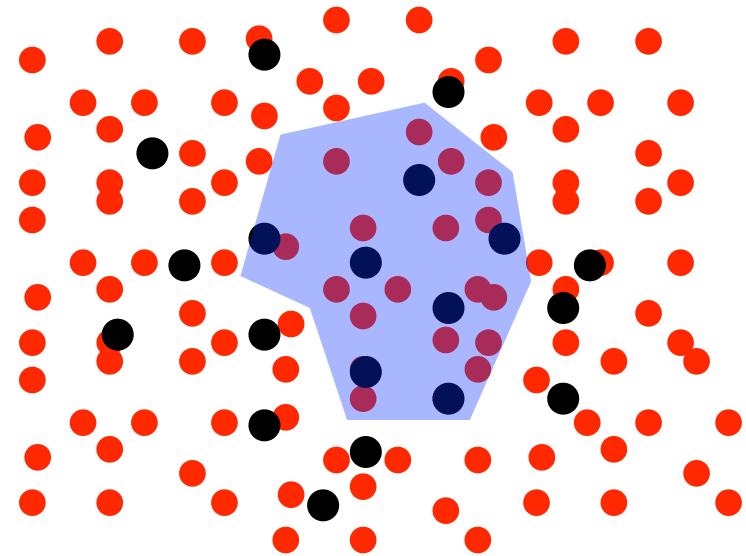
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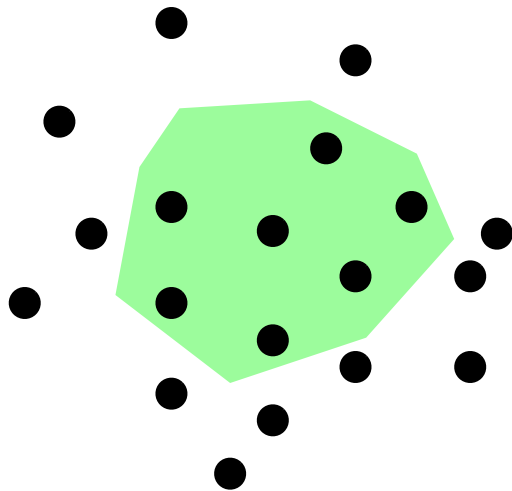
With  
background



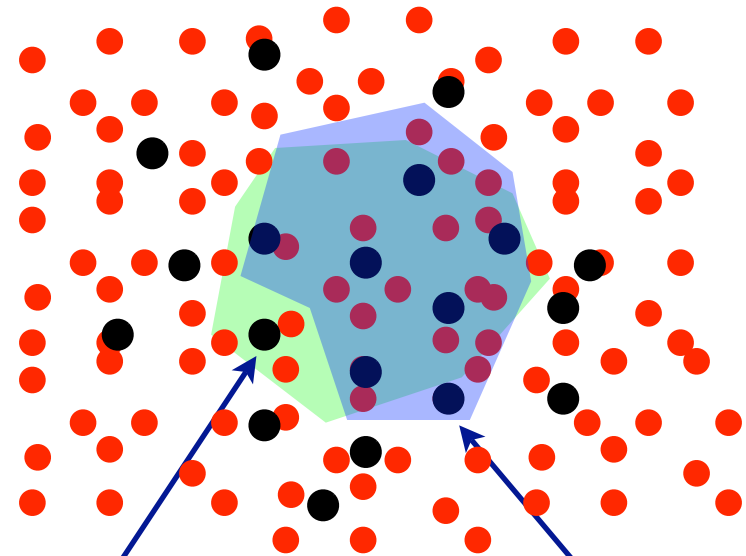
# Back-reaction

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Without  
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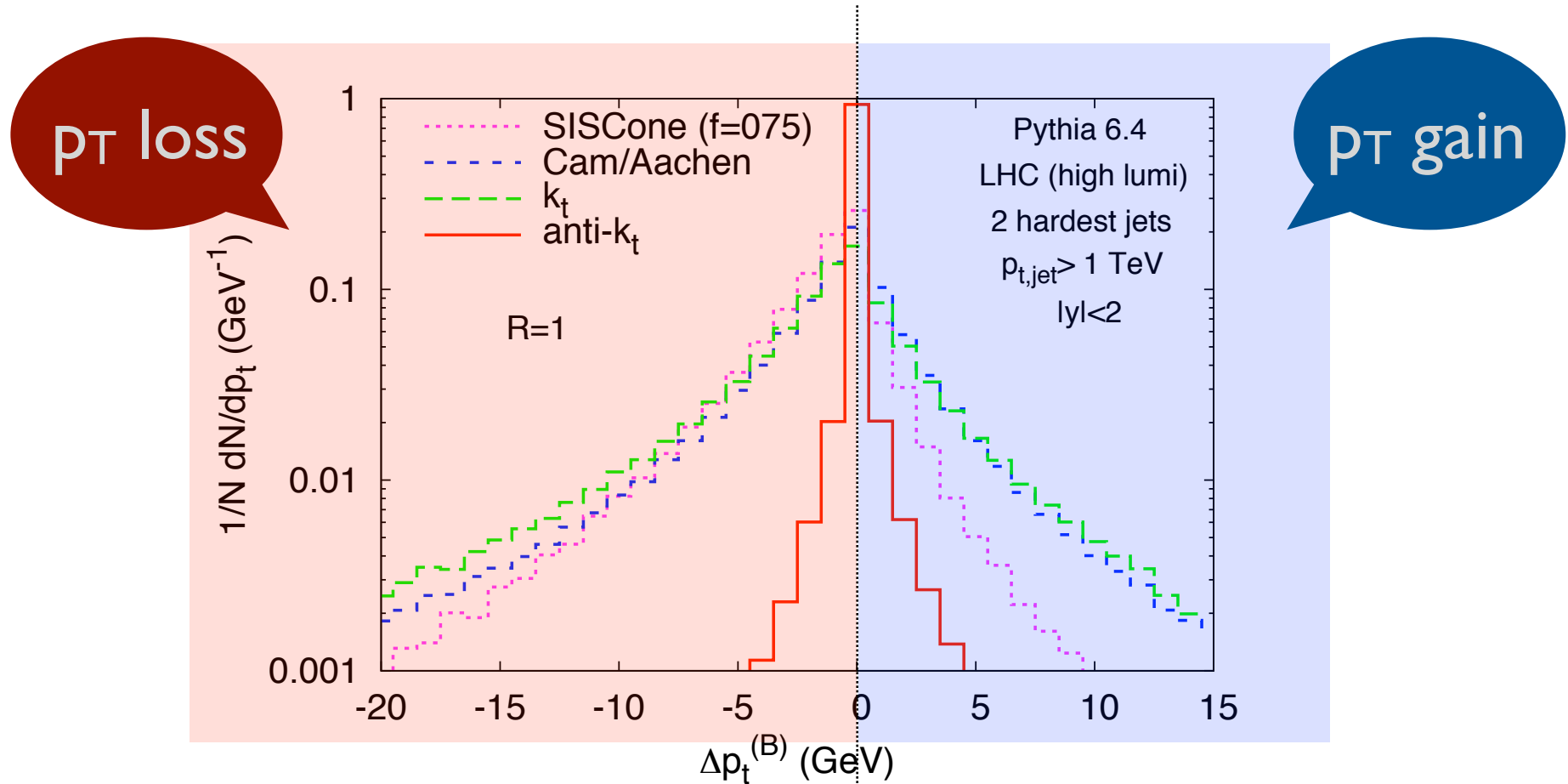


With  
background



Back-reaction **loss**

Back-reaction **gain**



Anti- $k_t$  jets are much more resilient to changes from background immersion

# The IRC safe jet algorithms

$k_t$	<p>SR</p> $d_{ij} = \min(k_{ti}^2, k_{tj}^2) \Delta R_{ij}^2 / R^2$ <p>hierarchical in rel <math>p_t</math></p>	<p>Catani et al '91 Ellis, Soper '93</p>	$N \ln N$
Cambridge/ Aachen	<p>SR</p> $d_{ij} = \Delta R_{ij}^2 / R^2$ <p>hierarchical in angle</p>	<p>Dokshitzer et al '97 Wengler, Wobish '98</p>	$N \ln N$
anti- $k_t$	<p>SR</p> $d_{ij} = \min(k_{ti}^{-2}, k_{tj}^{-2}) \Delta R_{ij}^2 / R^2$ <p>gives perfectly conical hard jets</p>	<p>MC, Salam, Soyez '08 (Delsart, Loch)</p>	$N^{3/2}$
SISCone	<p>Seedless iterative cone with split-merge gives 'economical' jets</p>	<p>Salam, Soyez '07</p>	$N^2 \ln N$

We call these algs 'second-generation' ones

All are available in FastJet, <http://fastjet.fr>

(As well as many IRC unsafe ones)

# Cambridge/Aachen with filtering

Butterworth, Davison, Rubin, Salam, arXiv:0802.2470

An example of a **third-generation** jet algorithm

- Cluster with C/A and a given  $R$
- Undo the clustering of each jet down to subjects with radius  $x_{\text{filt}}R$
- Retain only the  $n_{\text{filt}}$  hardest subjects

**Idea: filter out soft background, retain hard core**

(for this work we'll be using  $x_{\text{filt}} = 0.5$ ,  $n_{\text{filt}} = 2$ )

# The IRC safe algorithms

	Speed	Regularity	UE	Backreaction	Hierarchical substructure
$k_t$	😊😊😊	☂	☂☂	☁☁	😊😊
Cambridge /Aachen	😊😊😊	☂	☂	☁☁	😊😊😊
anti- $k_t$	😊😊😊	😊😊	☁/😊	😊😊	✗
SIScone	😊	☁	😊😊	☁	✗



# Hard jets and background

MC, Salam, arXiv:0707.1378

MC, Salam, Soyez, arXiv:0802.1188

## Modifications of the hard jet

$$p_{t,jet}^{AA} = p_{t,jet}^{pp} + \boxed{\rho A_{jet} \pm \sigma \sqrt{A_{jet}}} + \boxed{\Delta p_t^{BR}}$$

hard jet

background

back-reaction

'susceptibility'

'resiliency'

# Jet reconstruction quality

**Reconstruct the momentum the hard jet would have without the background:**

MC, Salam, arXiv:0707.1378

$$p_{\mu,jet}^{sub} \equiv p_{\mu,jet} - \rho A_{\mu,jet}$$

(subtracts background, fluctuations and back-reaction remain)

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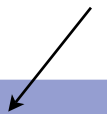
(subtracts background, fluctuations and back-reaction remain)

## Quality measures

**Offset**

$$\langle \Delta p_t \rangle \equiv \langle p_t^{AA,sub} - p_t^{pp,sub} \rangle$$

'probe'



**Dispersion**

$$\sigma_{\Delta p_t} \equiv \sqrt{\langle \Delta p_t^2 \rangle - \langle \Delta p_t \rangle^2}$$

Small offset and dispersion will indicate a good reconstruction

# Background determination

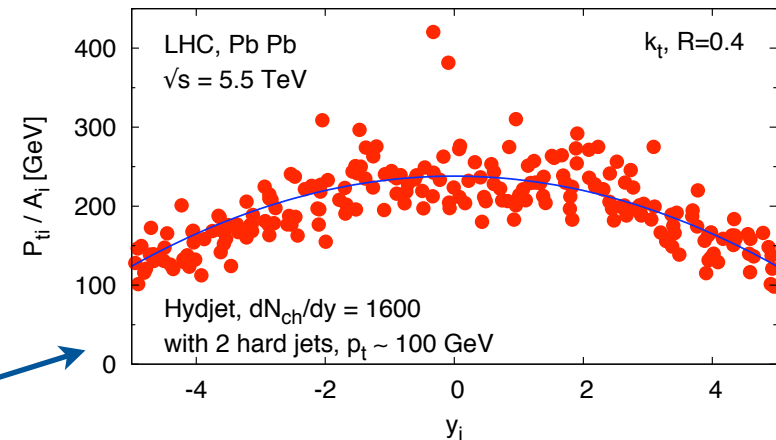
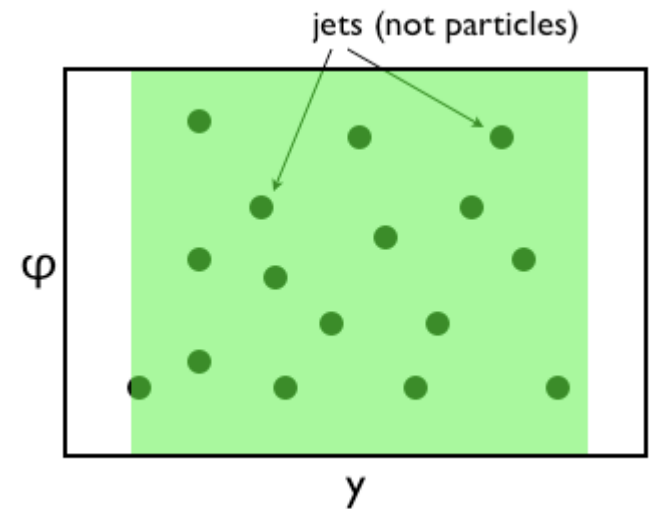
In order to subtract the background, one must first determine it

Proposal in 2007 paper (MC, Salam, arXiv:0707.1378)

- either, choose a region in rapidity-azimuth plane where the background is uniform
  - calculate  $\rho$  ( $p_t$  per unit area) as

$$\rho \equiv \text{median} \left[ \left\{ \frac{p_t^{jet}}{\text{Area}_{jet}} \right\} \right]$$

- or, account for rapidity dependence of background by fitting a quadratic function to  $p_{t,jet}/\text{Area}_{jet}$  distribution



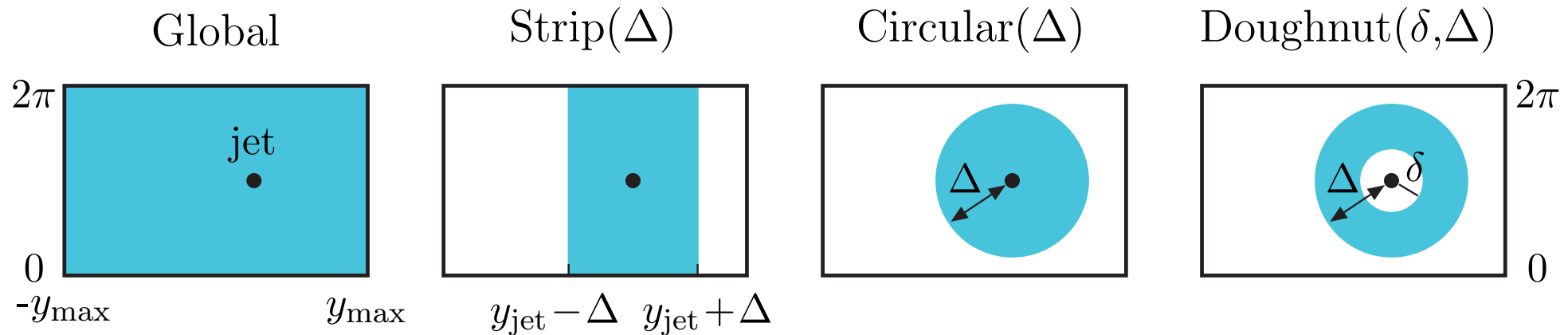
This way to account for rapidity dependence of background turns out to be insufficiently accurate



Adapt the median method to a varying background

# Background determination: the ranges

Ranges can now be *fixed*, or *local* (tied to a jet's position)



Choose a range **such that you expect the background to be uniform within it**, place it **where you need it**.

**Use median operation within each local range of interest**

A range should be **not too large** (to avoid non-uniformity of background) **nor too small** (to have sufficient statistics for the median operation).

We find  $\text{Area}_{\text{range}} \geq 25R^2$  to be a reasonable lower limit

# Background determination: the median

MC, Salam, arXiv:0707.1378

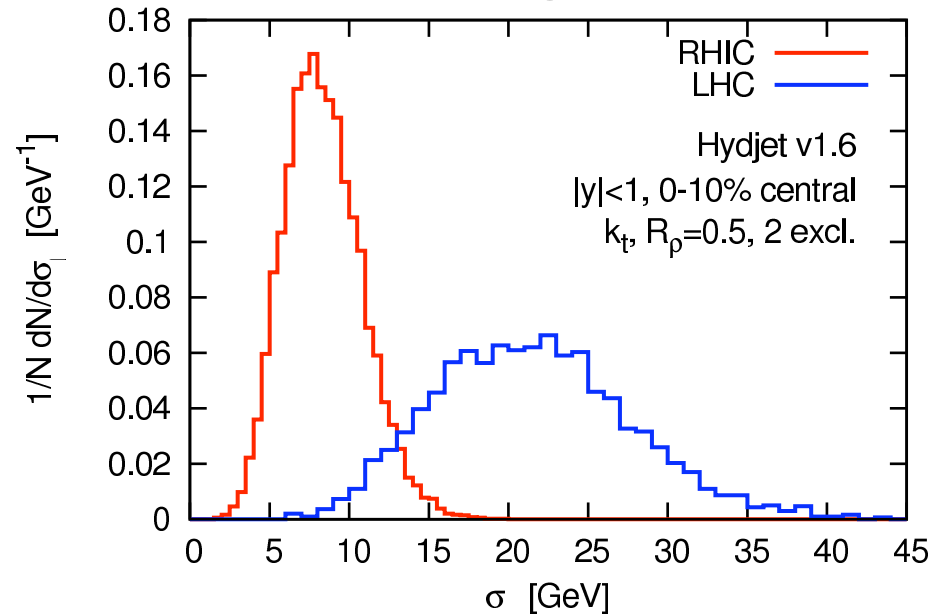
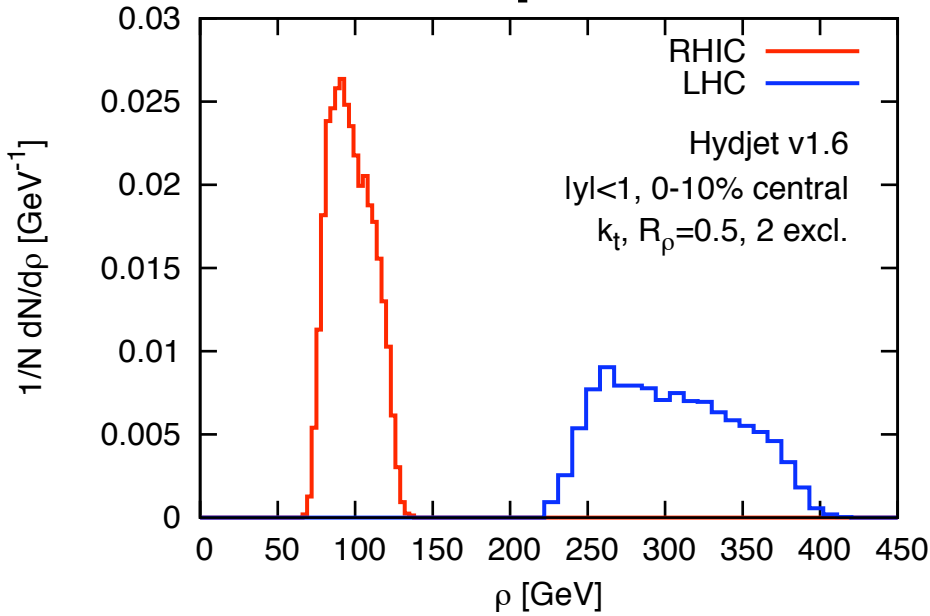
$$\rho \equiv \text{median}_{jet \in range} \left[ \left\{ \frac{p_t^{jet}}{Area_{jet}} \right\} \right]$$

- Should be used **only** with algorithms like  $k_t$  or Cambridge/Aachen (but the subtraction can then be performed on jets of any algorithm)
- Works on **an event-by-event basis** (this removes many fluctuations)
- One can also explicitly remove the hard(est) jet(s) before taking the median, to reduce a potential bias from the hard jets in the event

# The background

$\rho$

$\sigma$



Typical values (depend on model):

Hydjet v1.6	$dN_{ch}/d\eta _{\eta=0}$	$\rho$ (GeV) ( $y=0, 0-10\%$ )	$\sigma$ (GeV)
<b>RHIC</b>	<b>658</b> (0-6%)	<b>100</b>	<b>8</b>
<b>LHC</b> 5.5 TeV	<b>1570</b> (0-10%)	<b>310</b>	<b>21</b>
<b>LHC</b> 2.76 TeV	<b>1400</b> (0-10%)	<b>210</b>	<b>17</b>

How does the background affect the jet reconstruction?

How do the different algorithms fare?

**Offset**

$$\langle \Delta p_t \rangle \equiv \langle p_t^{AA,sub} - p_t^{pp,sub} \rangle$$

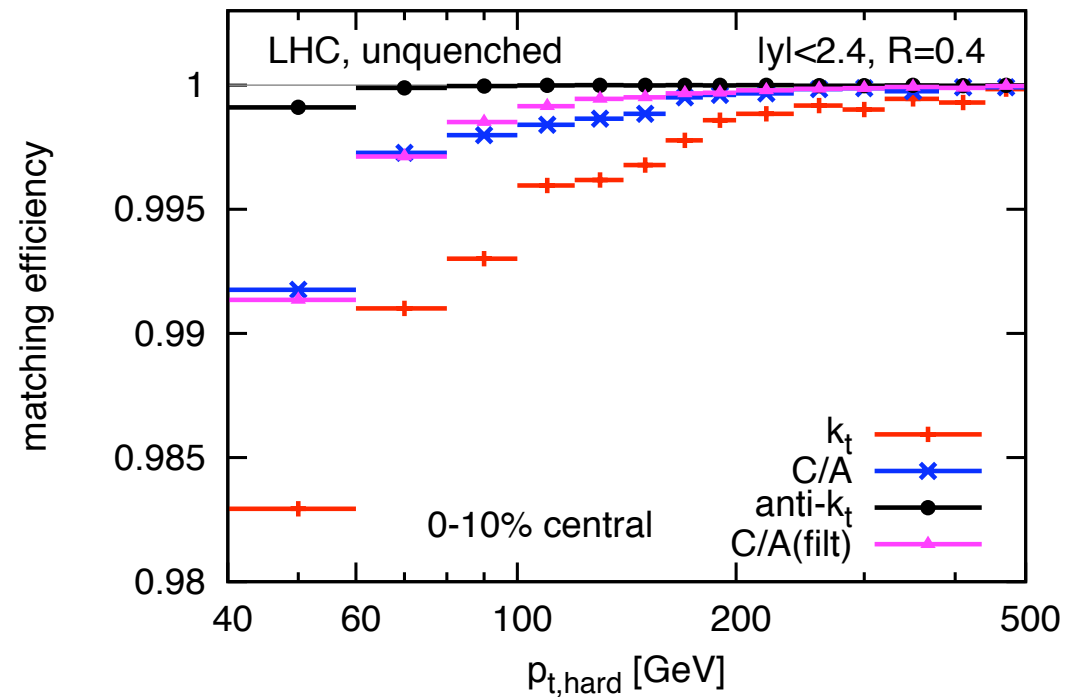
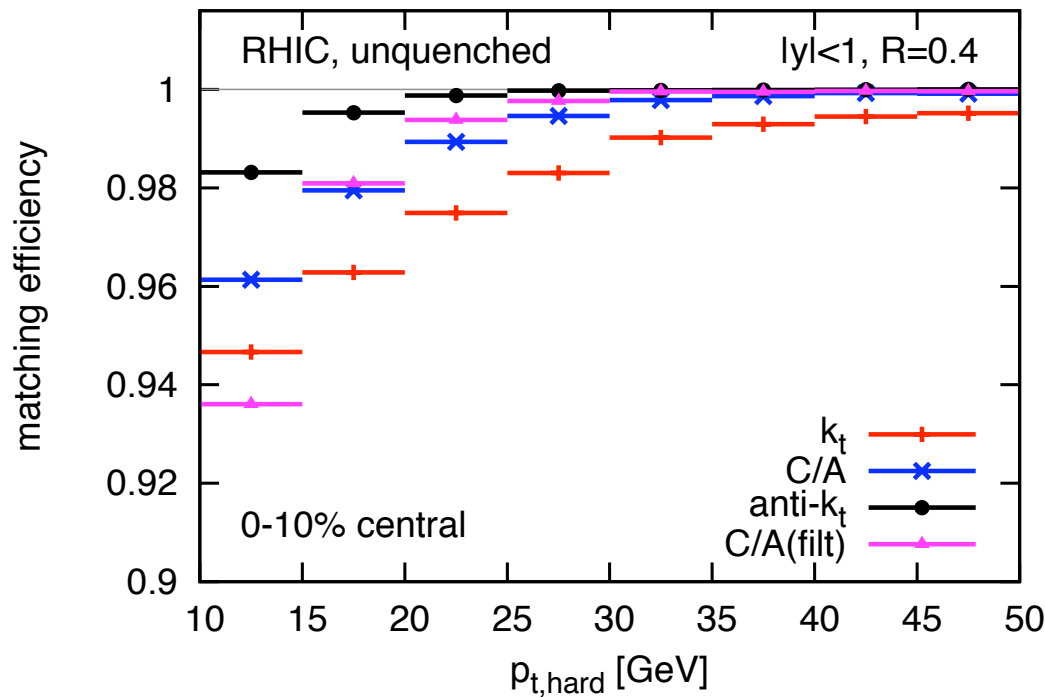
**Dispersion**

$$\sigma_{\Delta p_t} \equiv \sqrt{\langle \Delta p_t^2 \rangle - \langle \Delta p_t \rangle^2}$$

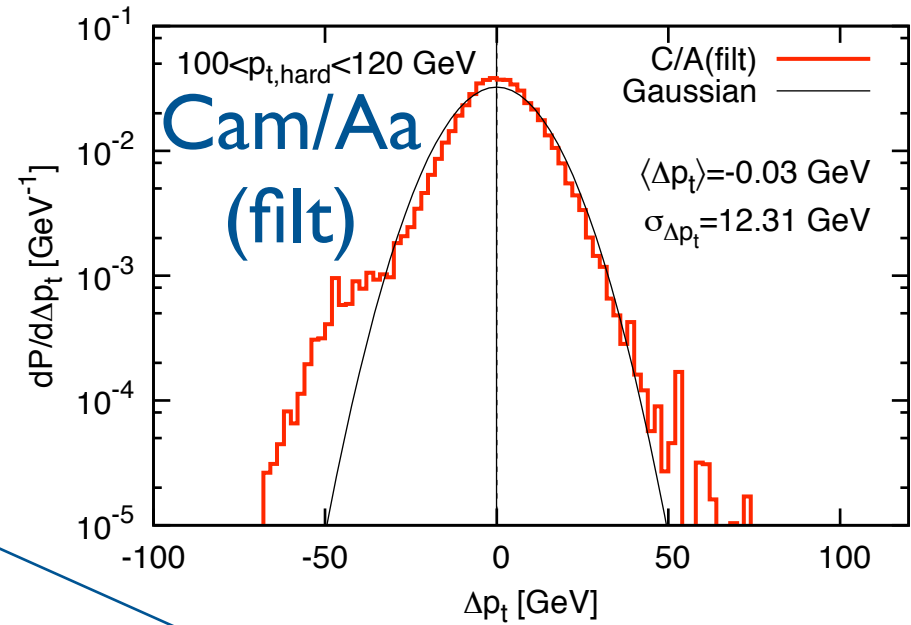
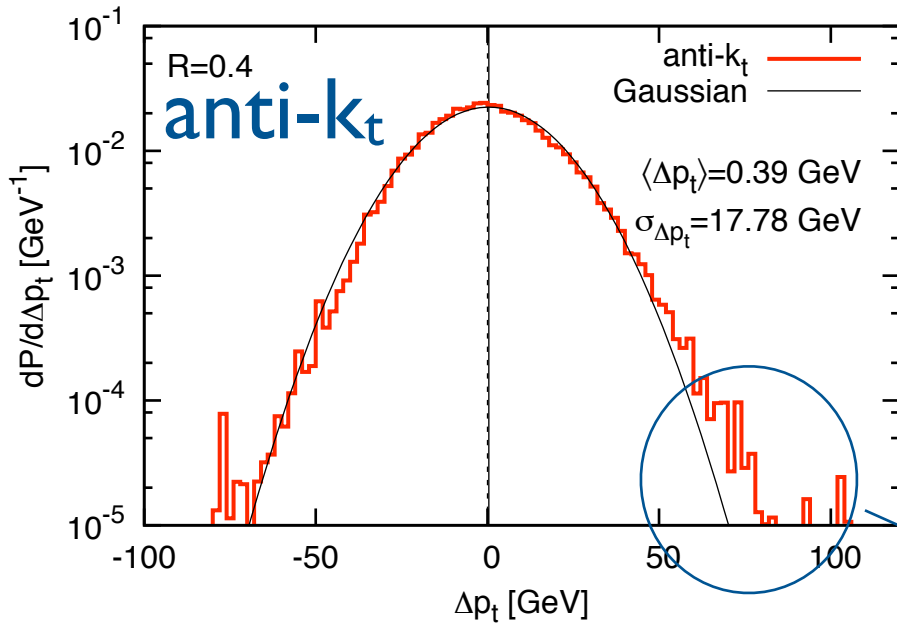
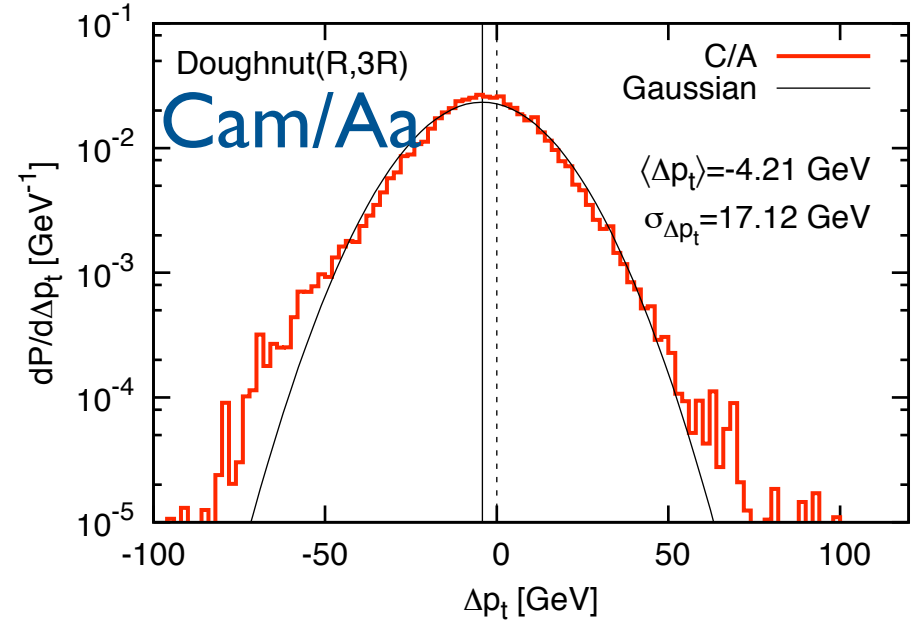
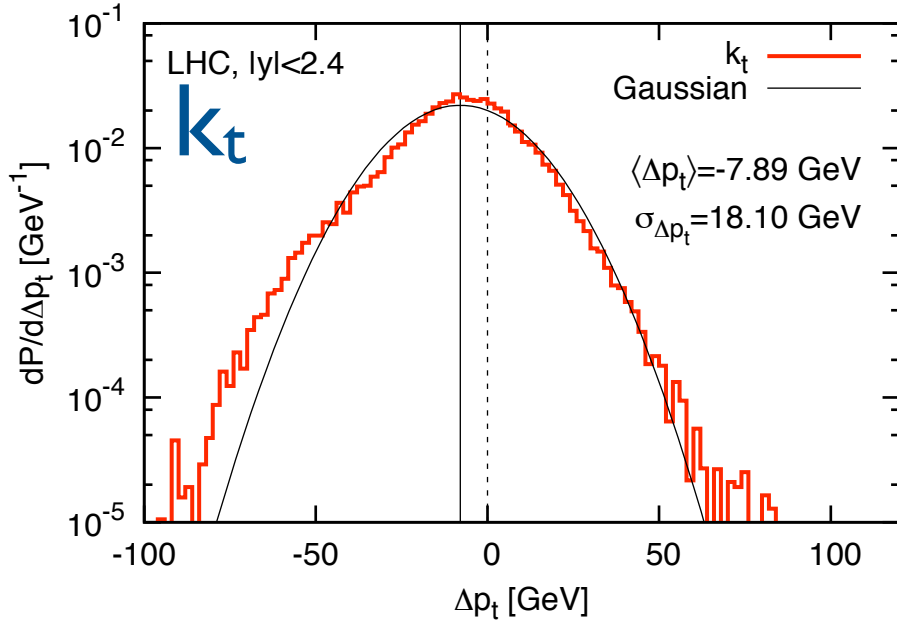


# Reconstruction efficiency

A jet reconstructed in the full event is considered **matched** to a hard jet if the constituents common to both the hard and the full jet make up at least 50% of the transverse momentum of the constituents of the hard jet



# $\Delta p_t$ distributions in PbPb at LHC

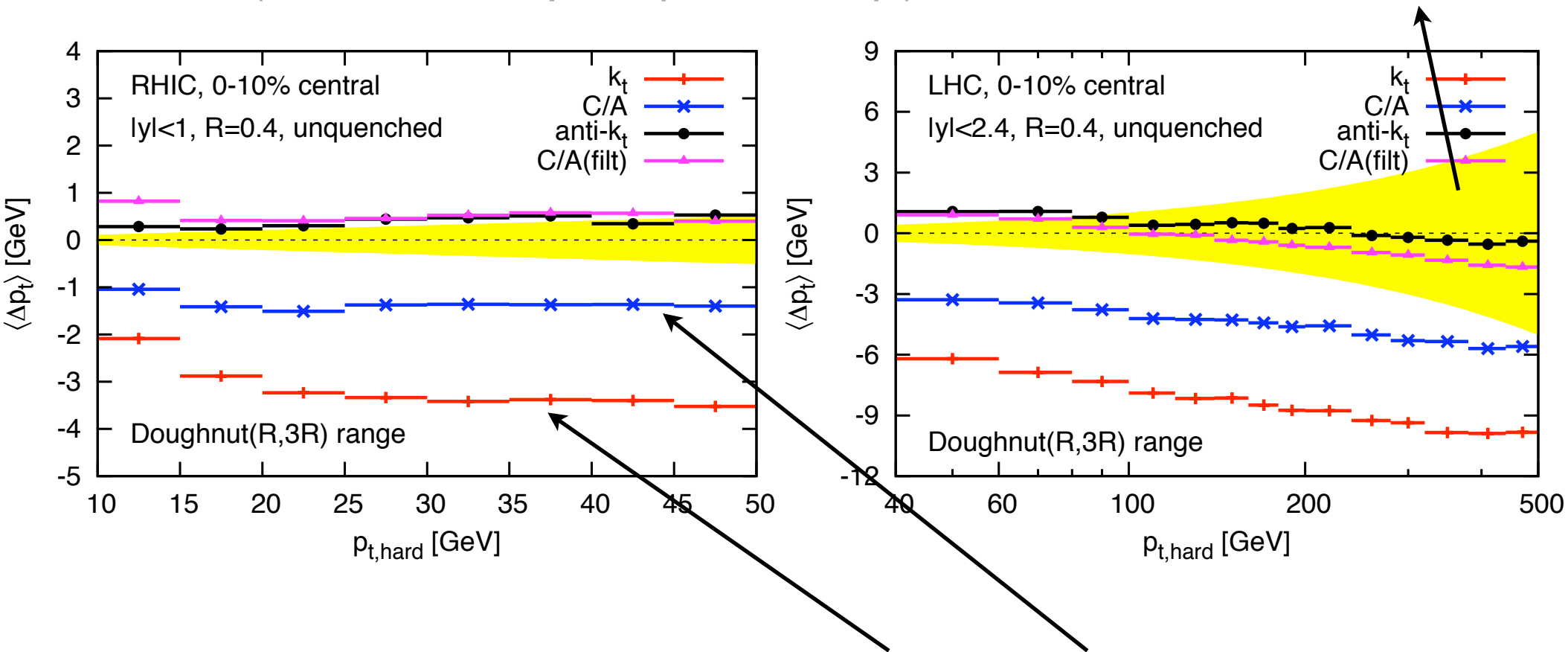


Non-Gaussian tails

# anti- $k_t$ and C/A(filt) fare best

(Results are fairly independent of  $p_t$ )

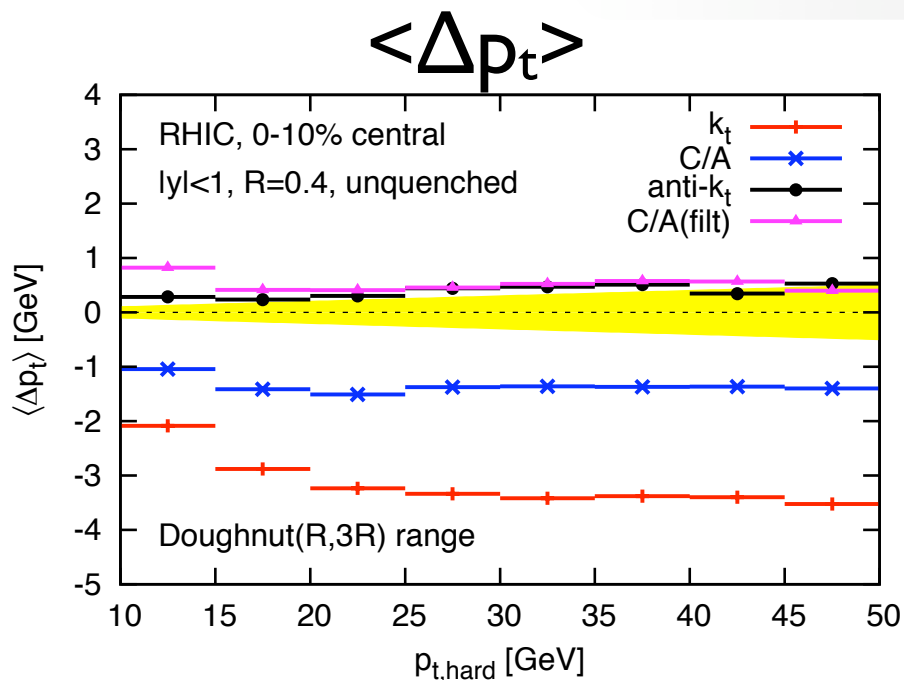
Yellow band:  
1% accuracy



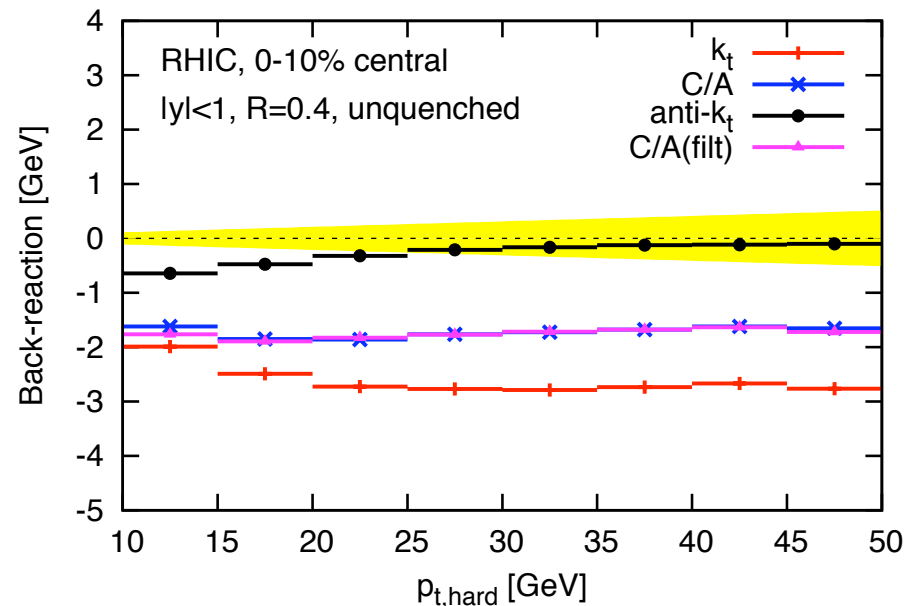
The residual offset of  $k_t$  and C/A can be interpreted as an effect of the **back-reaction**

# Back-reaction contribution to $\langle \Delta p_t \rangle$

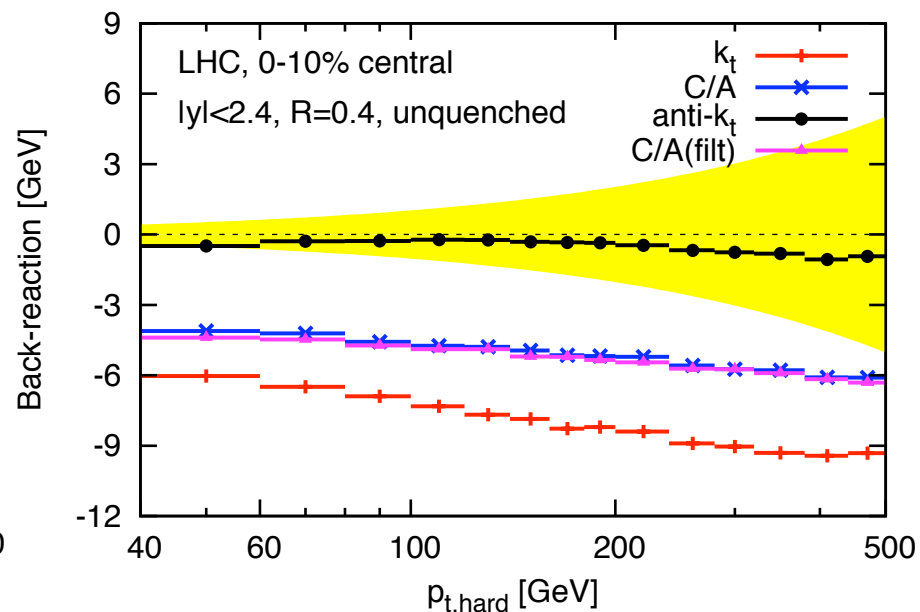
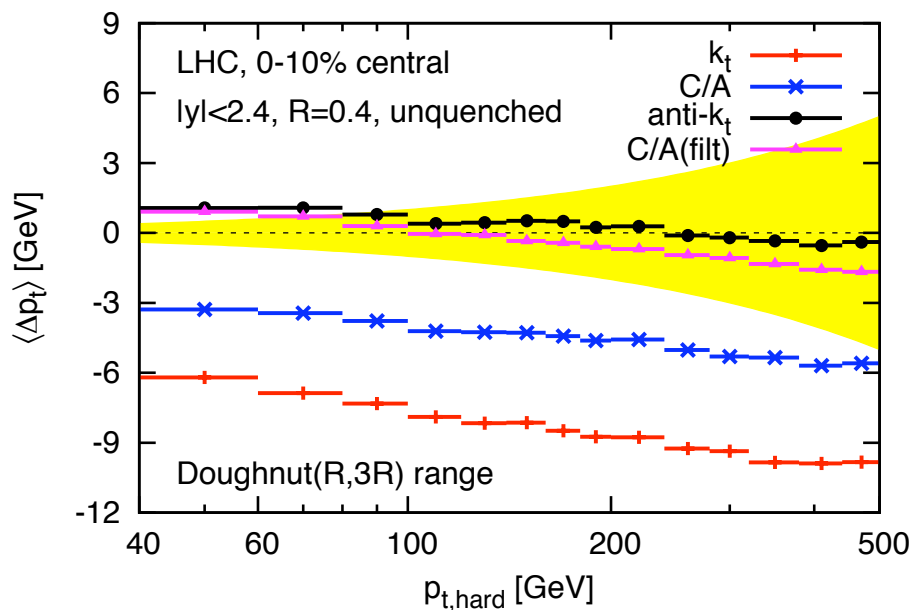
RHIC



Back-reaction

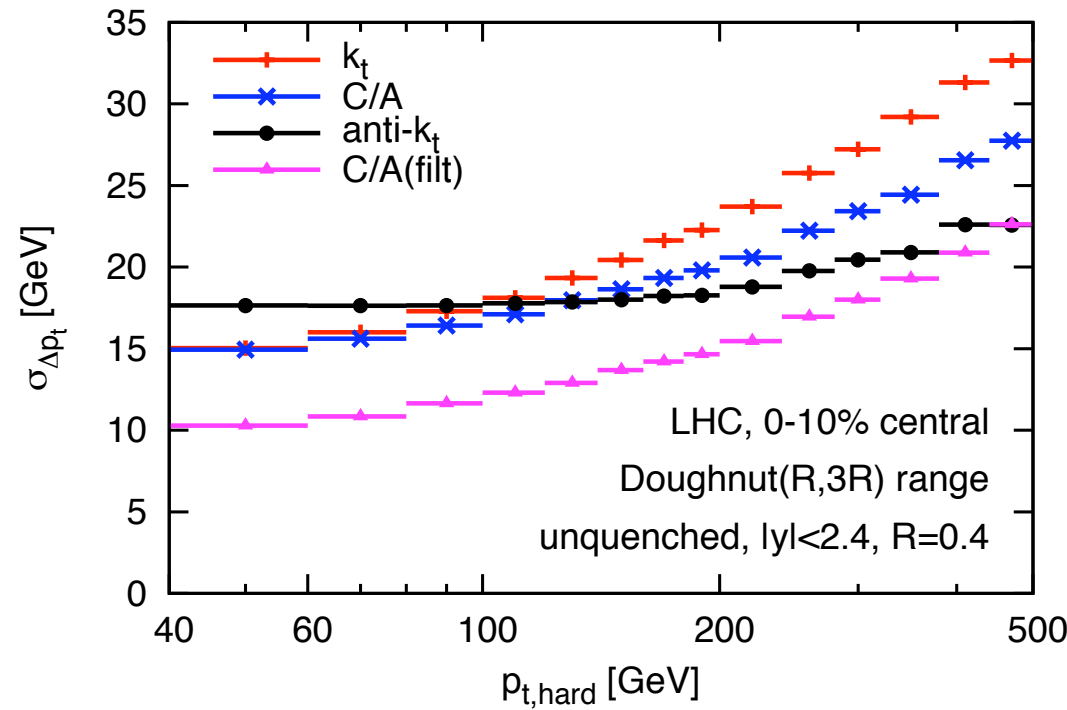
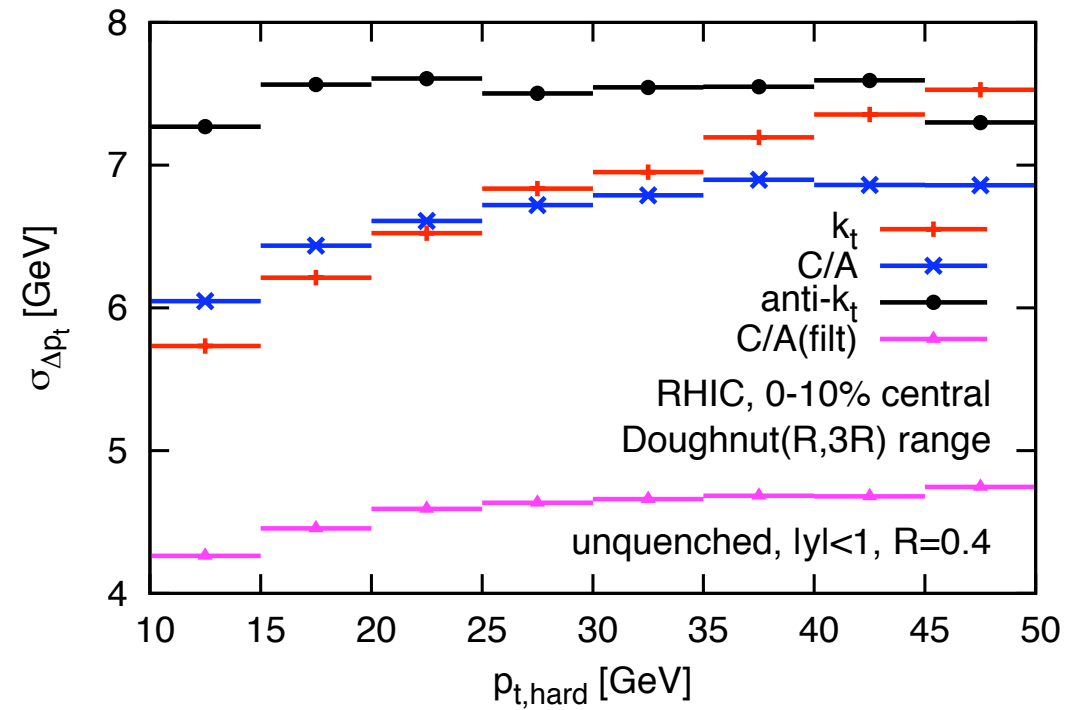


LHC



Back-reaction explains the residual offset, with the exception of C/A(filt)  
 (accidental compensation of back-reaction and positive offset)

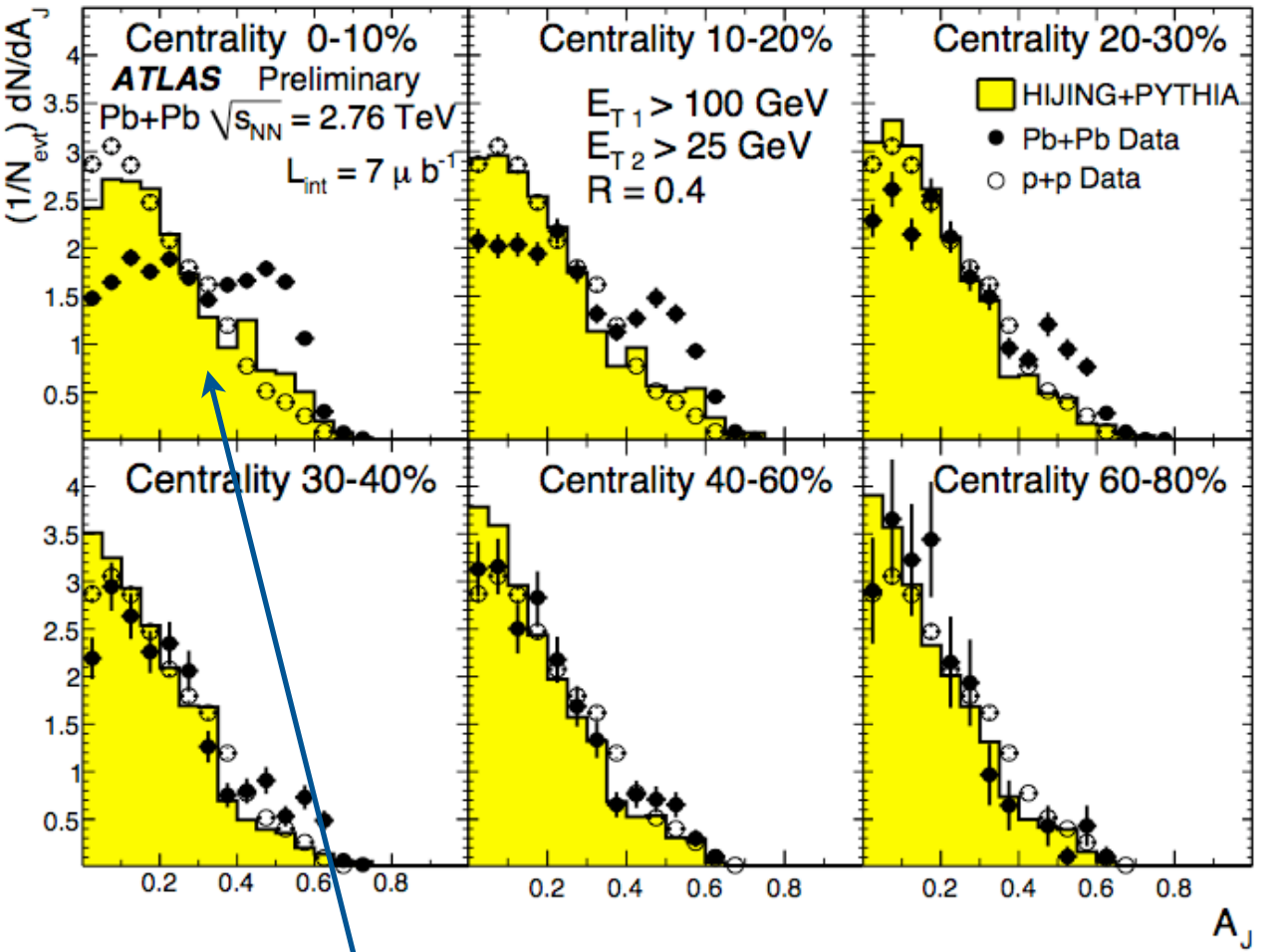
# Dispersion of $\Delta p_t = \sigma_{\Delta p_t}$



- C/A(filt) markedly better, as a consequence of its smaller effective area
- Dispersions increase at large  $p_t$ , probably as a consequence of a larger dispersion of back-reaction
- anti- $k_t$  remains fairly constant ('resiliency'), and eventually becomes better at large  $p_t$

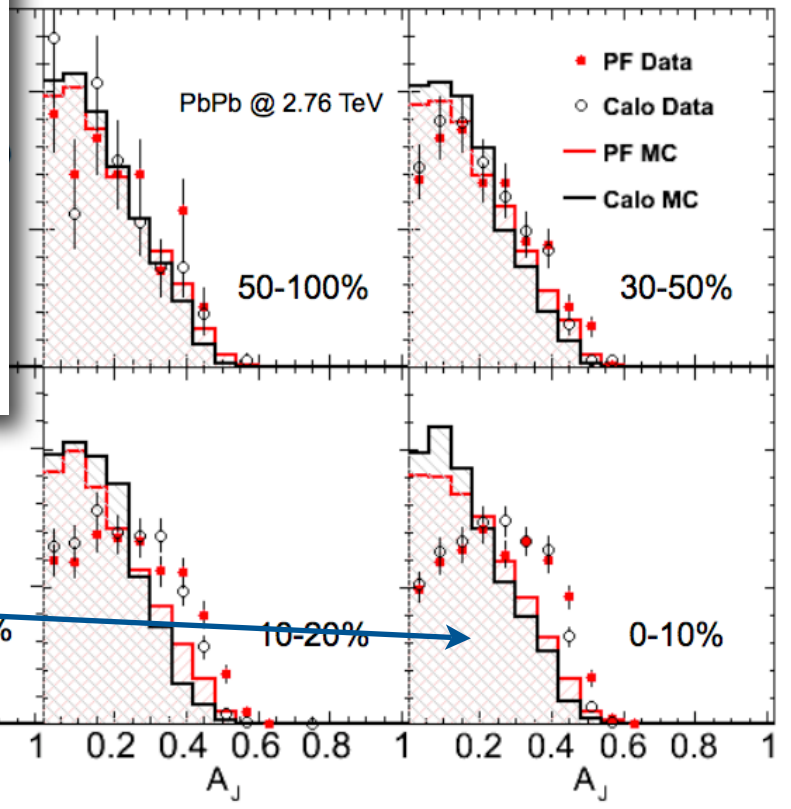
- Jet area/median method for background determination and subtraction validated in simulated collisions at RHIC and LHC: **high efficiency, small or almost zero  $\langle \Delta p_t \rangle$  offset** (though each different jet algorithm has characteristics which affect the subtraction in specific ways (e.g. back-reaction))
- Irreducible dispersions are left, and may of course play an important role in measurements like the inclusive cross section (fakes rate). Their size also depends on the algorithm used.
- **anti- $k_t$**  turns out to have the safest **smallest offset**, **filtering algorithms** have the **smallest dispersion** (but may be more affected by quenching)

**What do we do with this tool?**



$$A_J = \frac{E_{T1} - E_{T2}}{E_{T1} + E_{T2}}$$

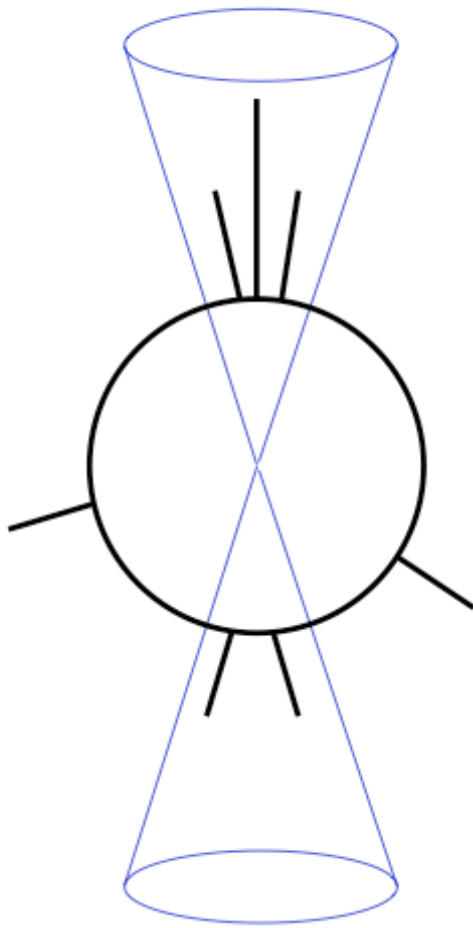
CMS



Evidence of more asymmetry than in pp in bins with most central collisions: quenching?

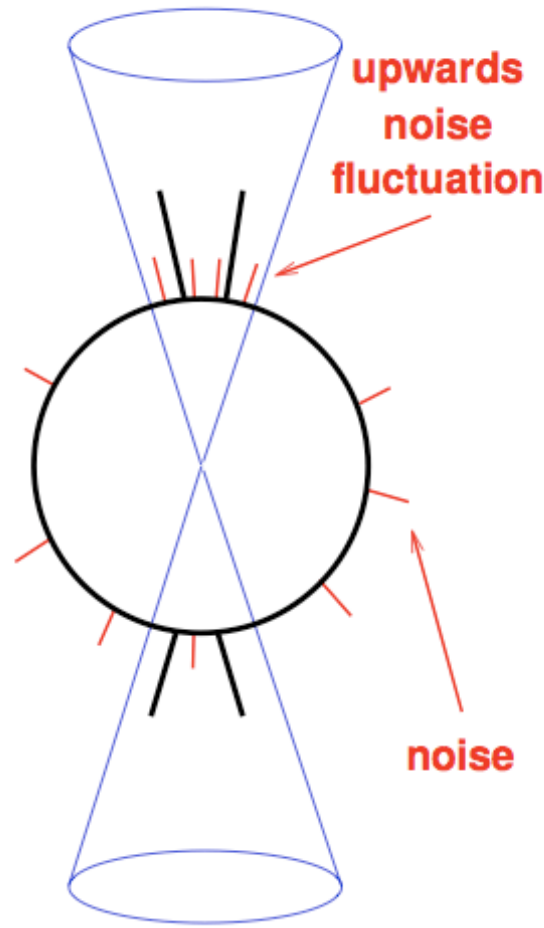
# Quenching v. fluctuations

High  $p_t$  event



**QUENCHED JET  
THAT HAS LOST ENERGY**

Moderate  $p_t$  event



**NO QUENCHING,  
NOISE-INDUCED  
ASYMMETRY**

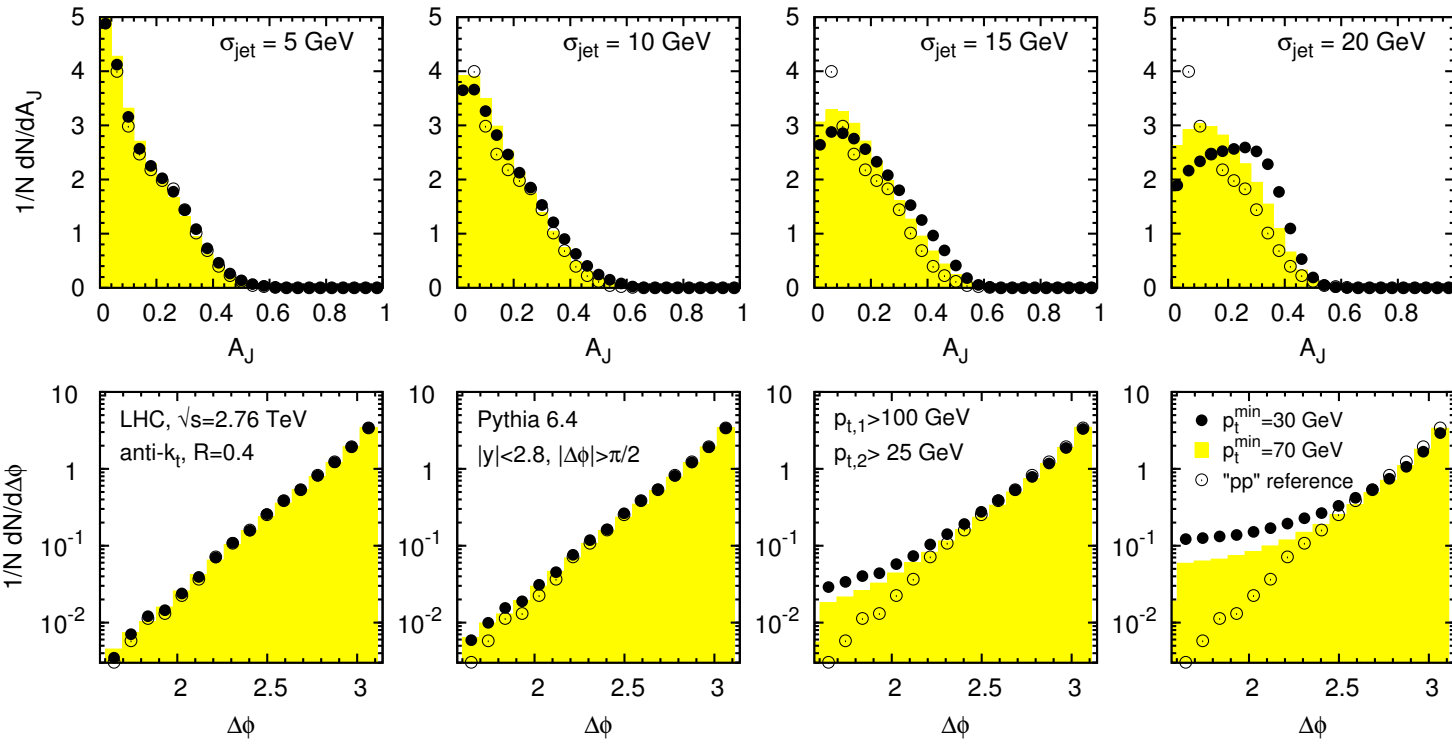
Due to the **steeply falling**  $p_t$  spectrum, a **rare upwards fluctuation** at moderate  $p_t$  can **contribute significantly** to events at larger  $p_t$

We have seen that residual fluctuations for the anti- $k_t$  algorithm ( $R=0.4$ ) can be of order 15-20 GeV at the LHC



# Origin of asymmetry?

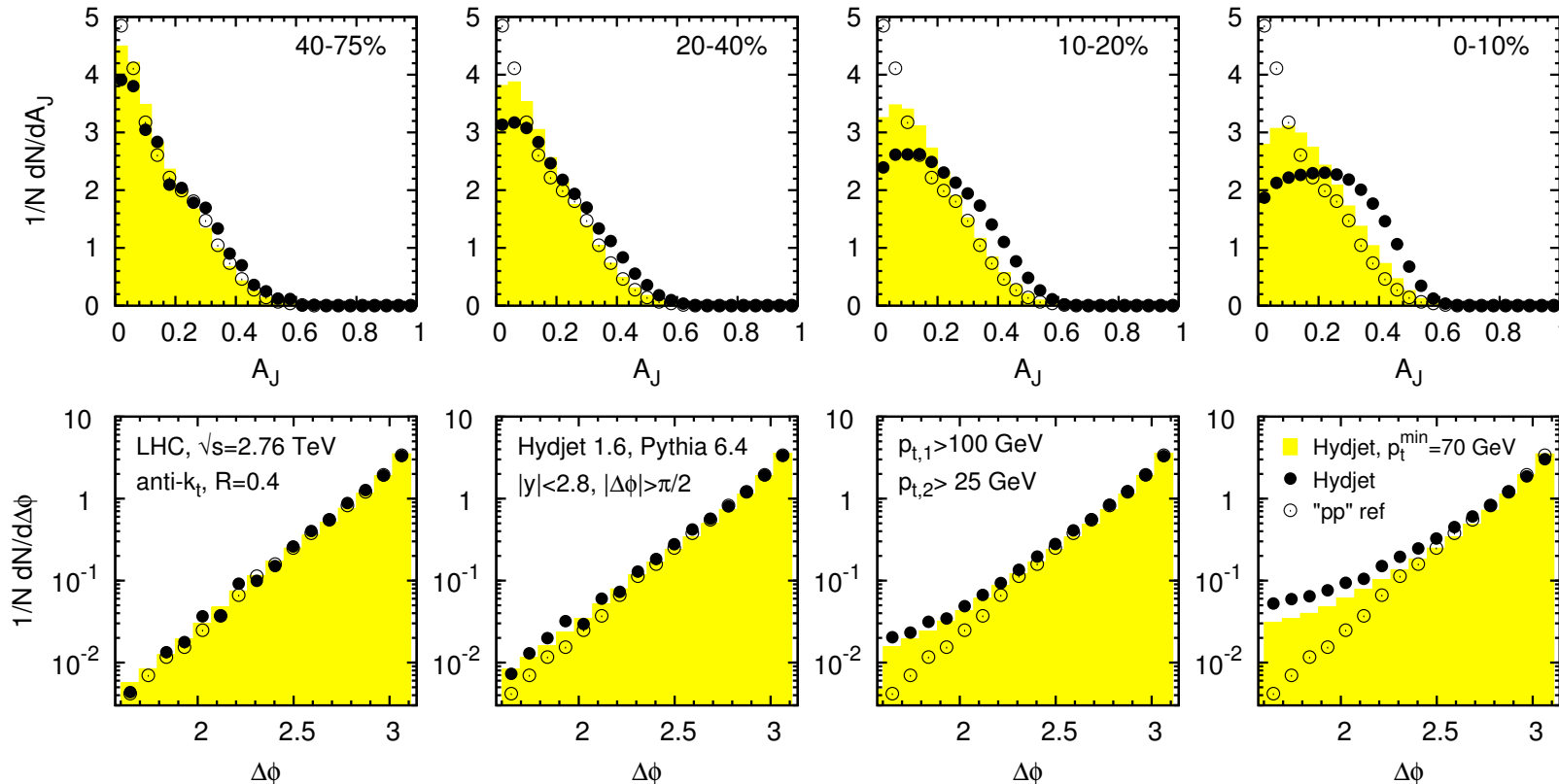
Add a gaussian smearing to PYTHIA  
pp jets:  
simulates residual fluctuations after subtraction



Asymmetry is similar to the one observed by ATLAS and CMS, but no quenching whatsoever is present here

Obviously, the value of  $\sigma_{jet}$  is critical

Instead of gaussian smearing, full simulation of PbPb events + background subtraction (area/median) + simple calorimeter simulation



Same conclusions:

Asymmetry is similar to the one observed by ATLAS and CMS,  
but no quenching whatsoever is present here

Note that HYDJET for 0-10% gives  $\sigma_{\text{jet}} \approx \mathbf{17 \text{ GeV}}$ , but the effects on the asymmetry can be as large as the Gaussian 20 GeV because of non-gaussianities

$\sigma_{\text{jet}}$  parametrises the uncertainty left in the knowledge of the  $p_t$  of a jet after the background has been subtracted

Its value encompasses both the **physical characteristics of the HI background** and the **procedure used to subtract it**

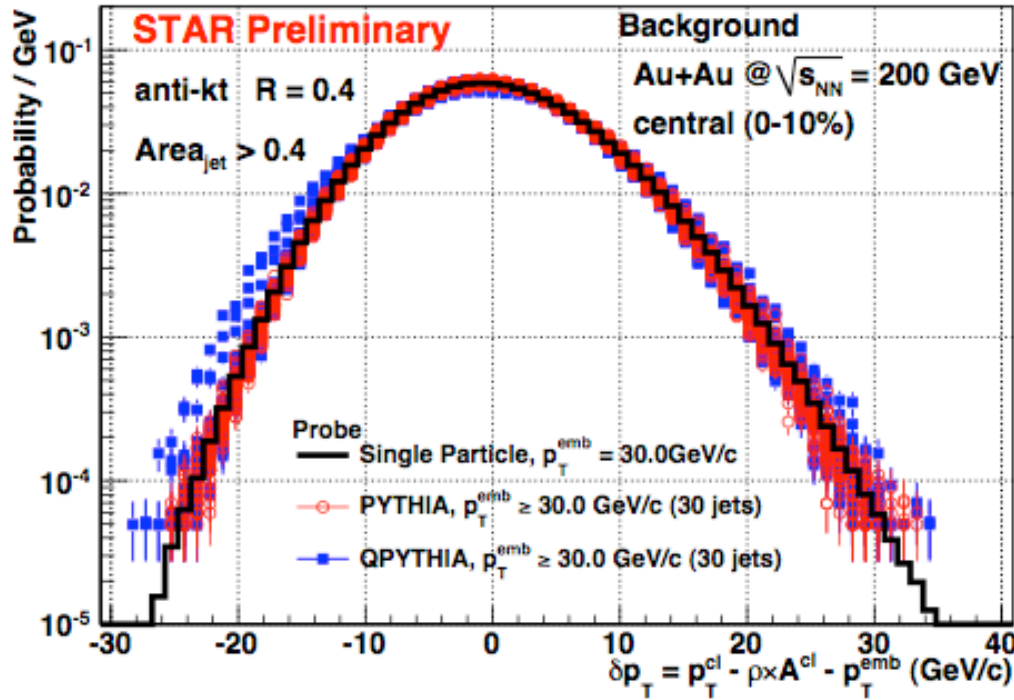
It tells you - quantitatively - how well you are doing

$\sigma_{\text{jet}}$  should probably be the one of the first things one looks at, before any physics analysis is attempted with the reconstructed jets

# $\sigma_{\text{jet}}$ from STAR and ALICE

Distribution of  $\Delta p_T = p_T^{\text{AA}} - \text{bkgd} - p_T^{\text{PP}}$

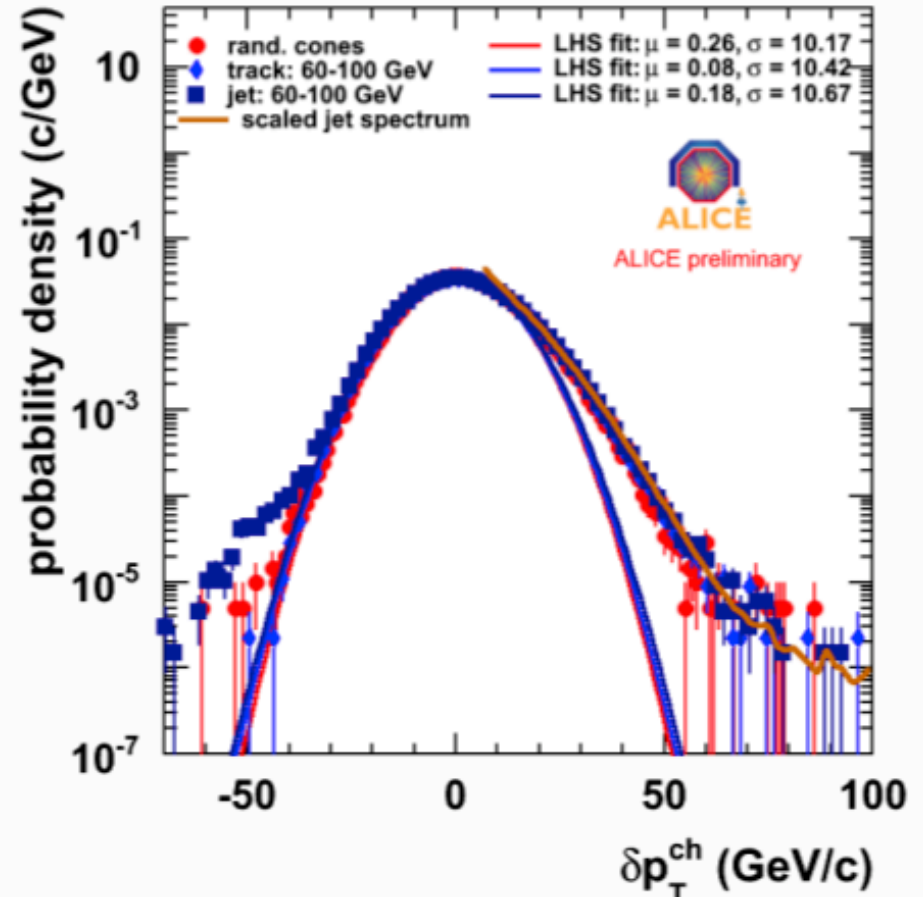
H. Caines, QM2011



$\sigma_{\text{jet}} \approx 6-7 \text{ GeV}$

LHC2010 Pb-Pb 0-10%  $R = 0.4$  (B2)

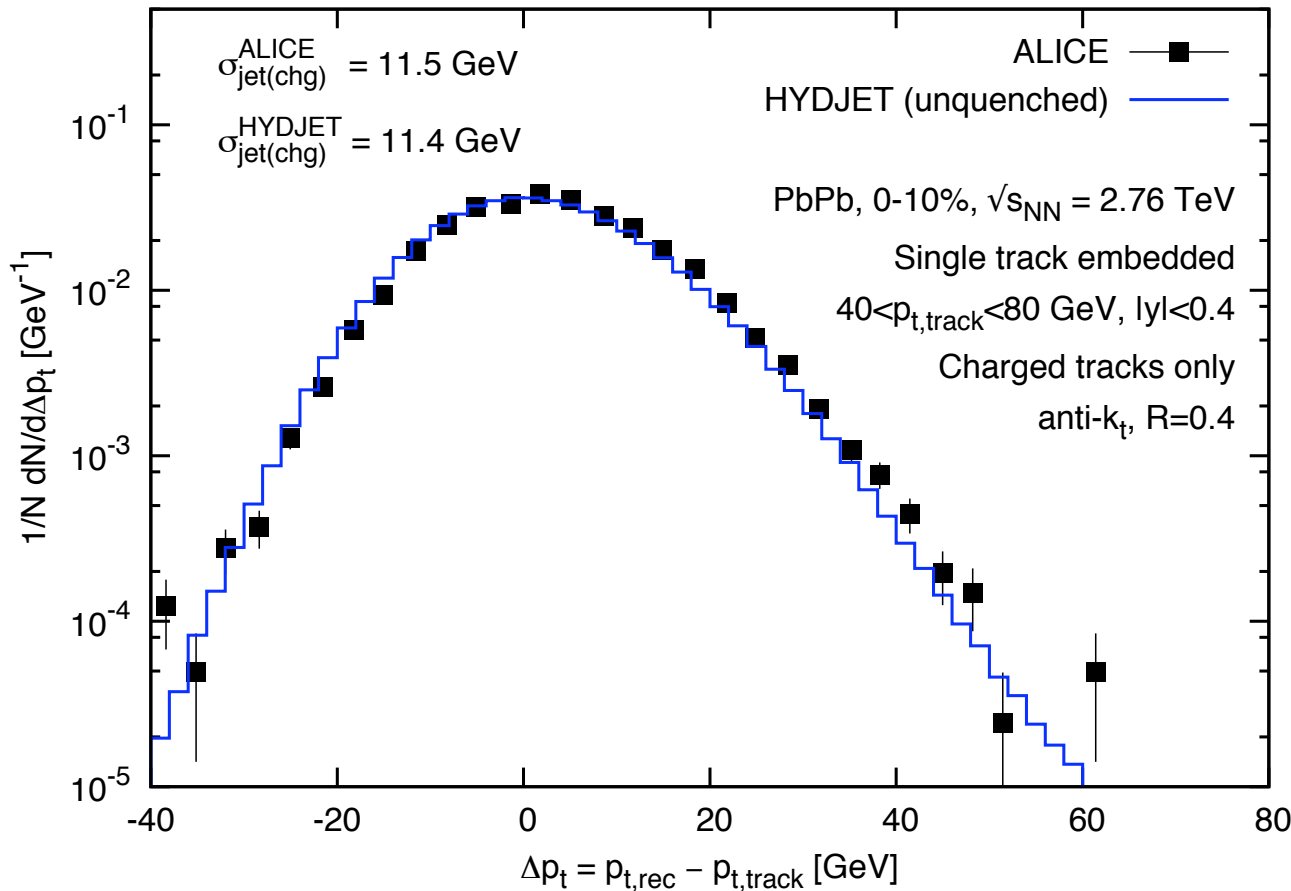
C. Klein-Boesing, QM2011



$\sigma_{\text{jet}} \approx 11 \text{ GeV}$  (charged only)

# HYDJET v. ALICE charged tracks jets

MC, Salam, Soyez, 1101.2878



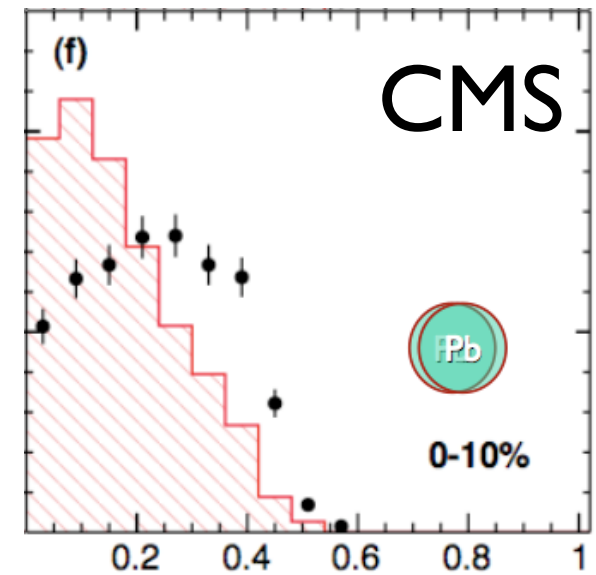
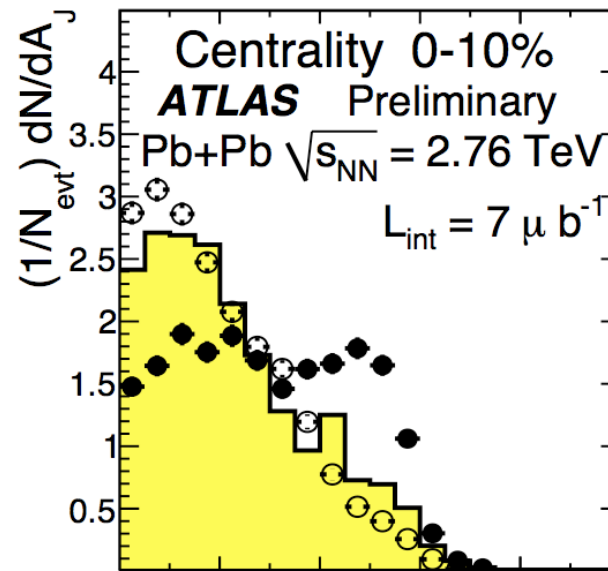
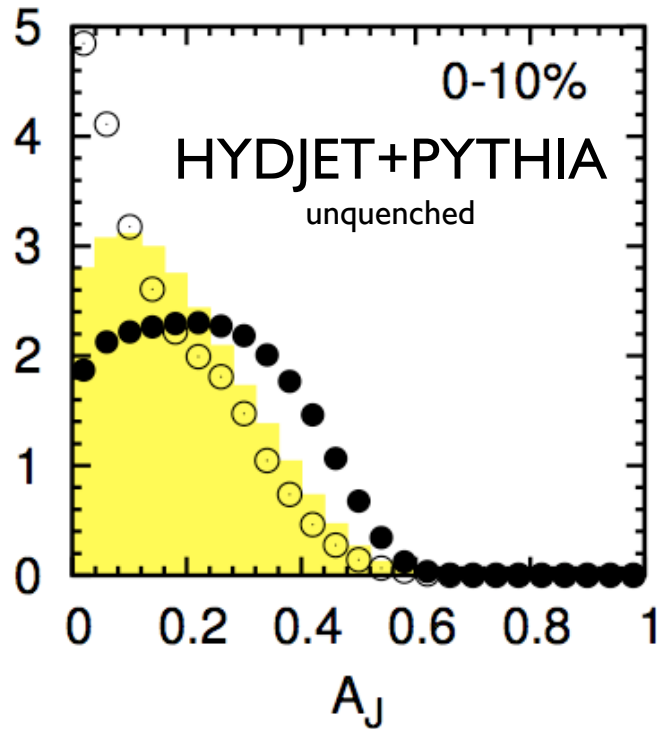
Striking agreement, and  
 $\sigma_{\text{jet(chg)}} \approx 11.5 \text{ GeV}$

Translates to a full  
 $\sigma_{\text{jet}} \approx 17 \text{ GeV}$

These are **real data**.

It seems that HYDJET does a good job in describing  
the PbPb background characteristics

(as a side note, HYDJET was not even tuned to LHC data)



If this is a legitimate effect of fluctuations without quenching...

...what is the contribution of quenching to these measurements?

Effect of residual fluctuations of a non-noise reduction subtraction seems capable of inducing an asymmetry which mimics the one observed by ATLAS and CMS

Does this mean that there is no quenching? **No**

However, it likely means that in order to make **quantitative statements** about quenching one needs to have better control of background subtraction effects (residual fluctuations and/or biases)

# Extra material



While jet clustering is a deterministic procedure (though one must still choose a jet definition), background subtraction is less well-determined

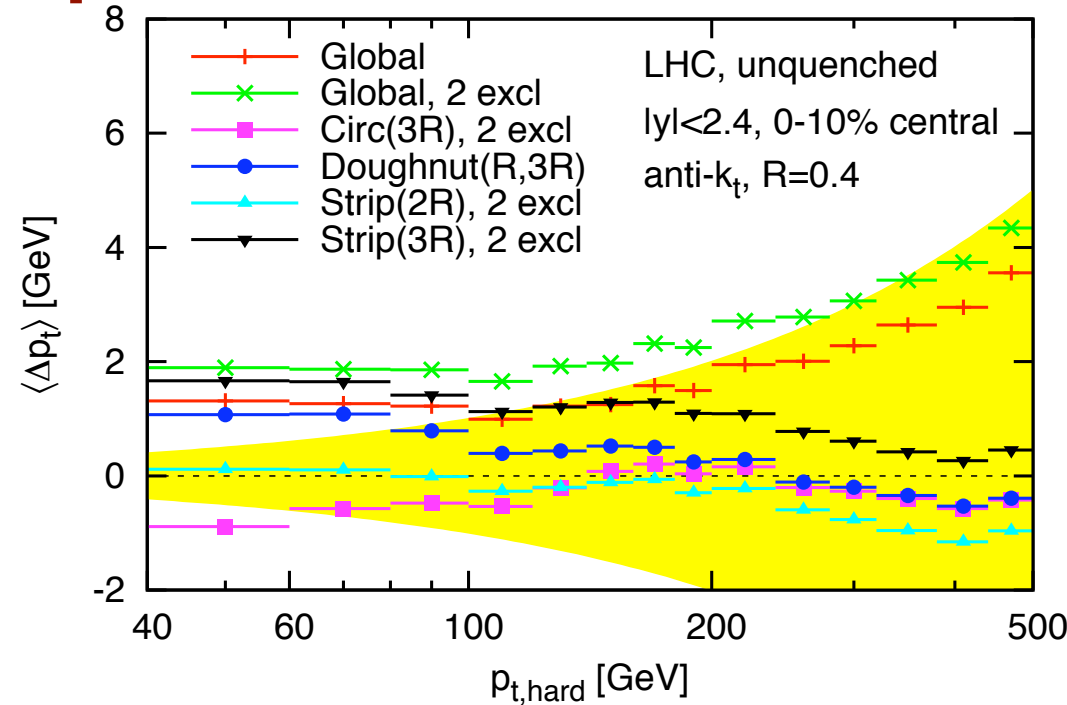
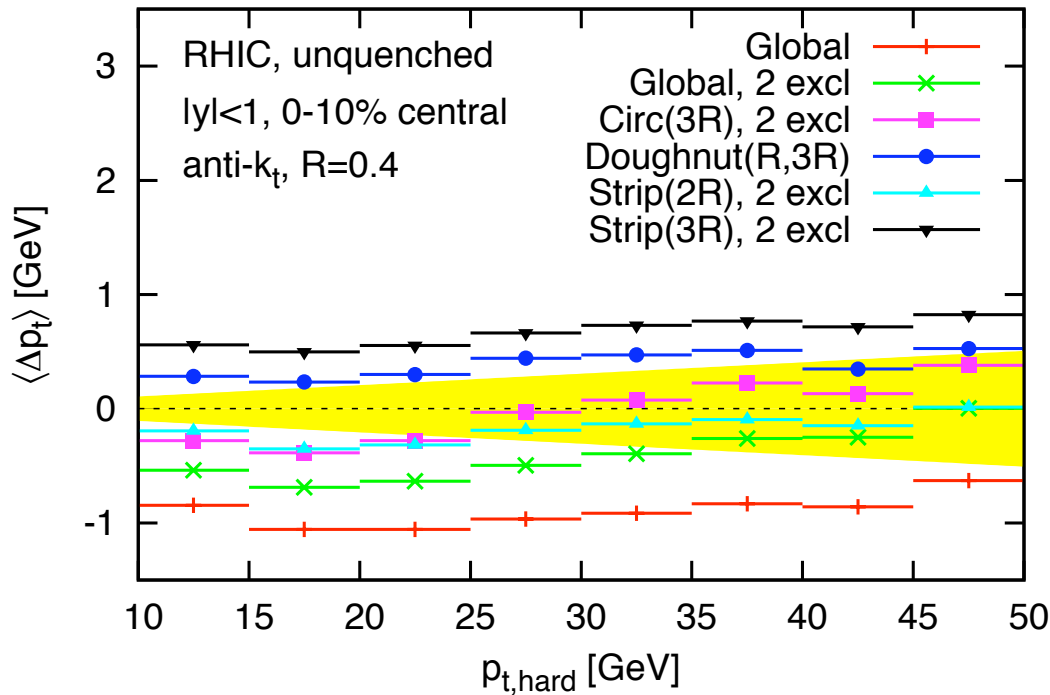
A number of not fully clear-cut choices must be made:

- **Where** to estimate the background (i.e. which range)
- **How** to estimate it (for instance, subtract hard jets?)
- **Which jet algorithm** to use (privilege small bias or small dispersion?)

Making the “proper” choice is as much a matter of art (i.e. experience) as of science, and depends on what you want to do

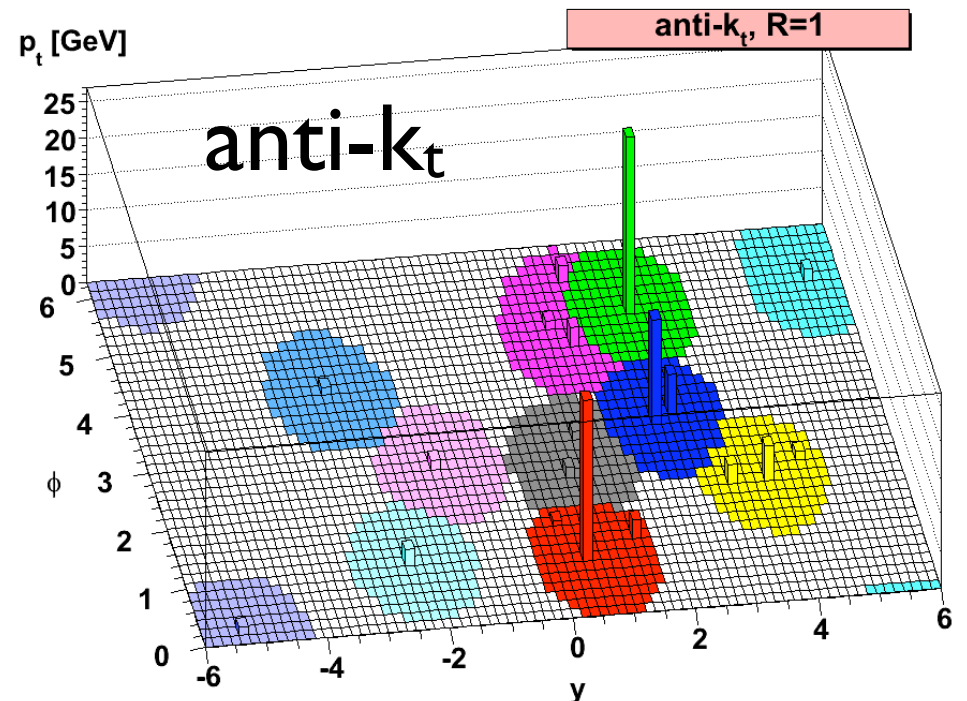
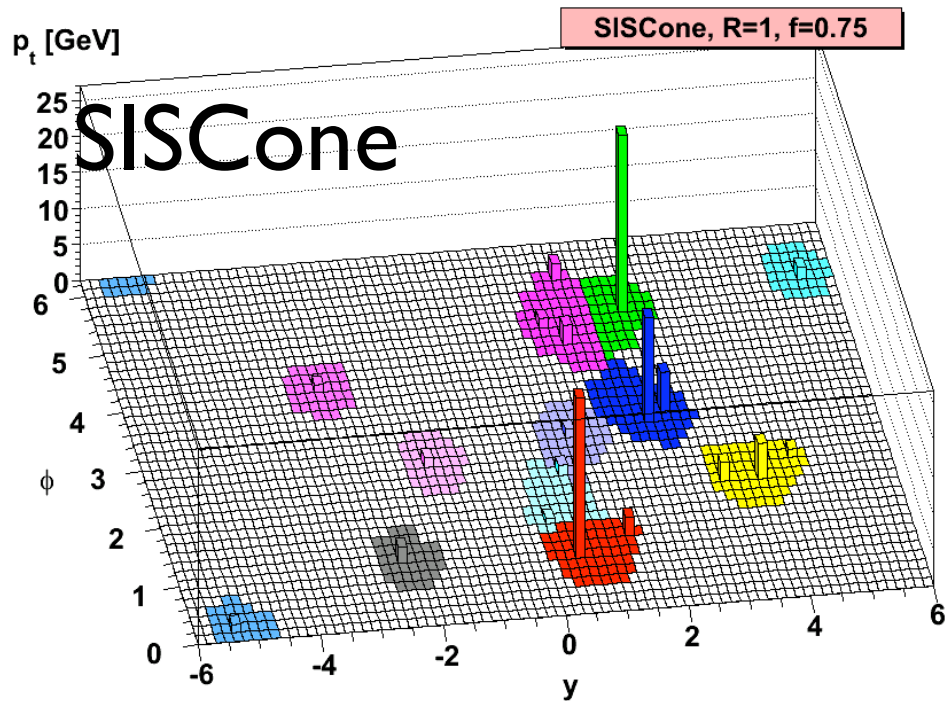
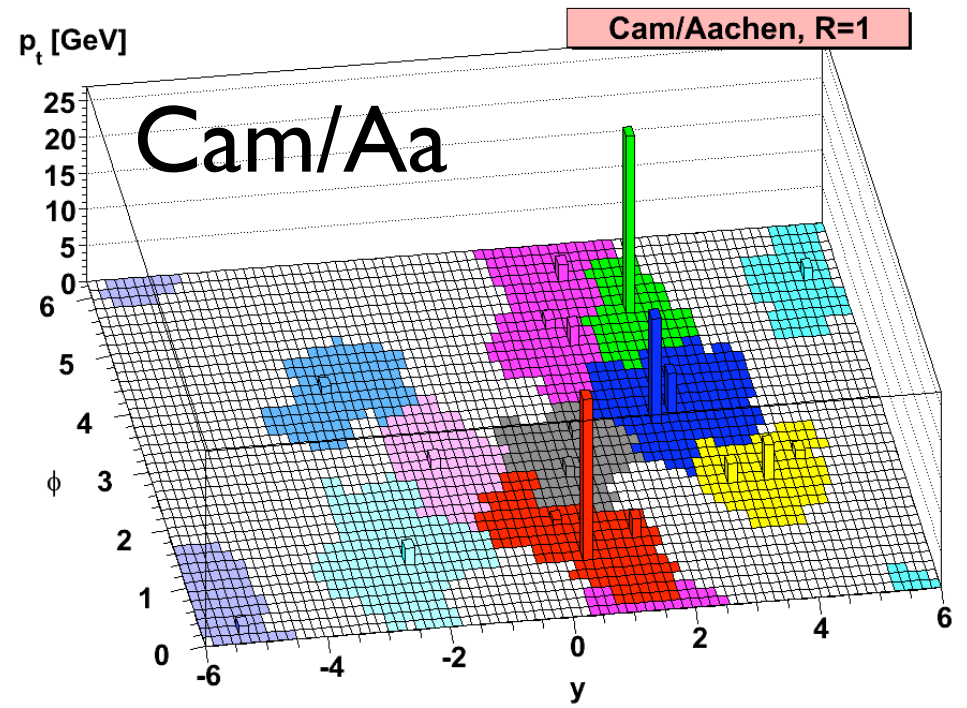
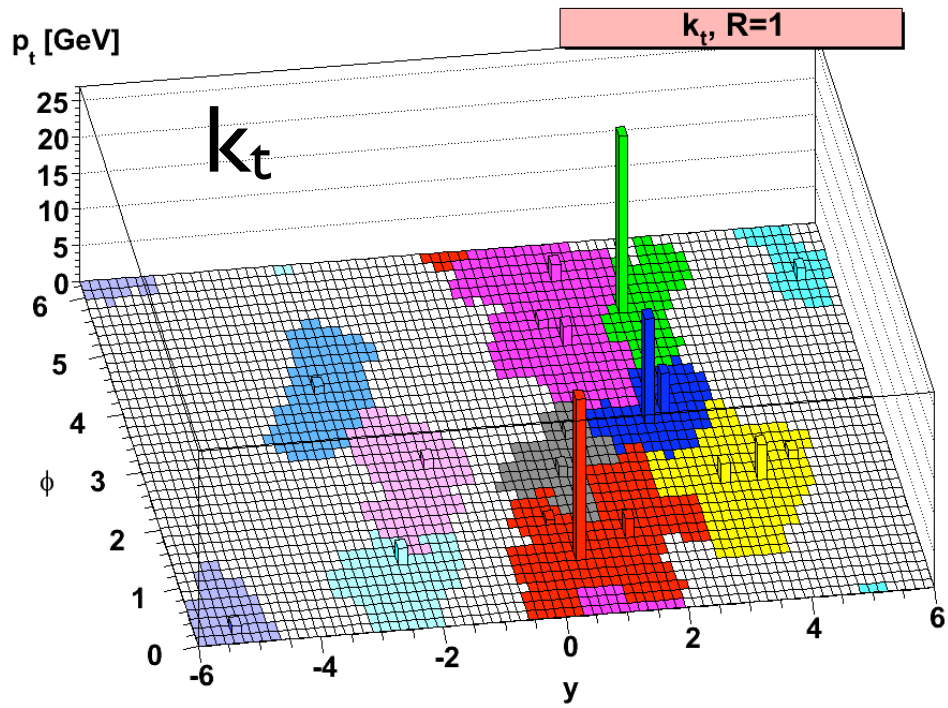
Having many algorithms and techniques at one’s disposal will allow better tuning of procedure with aim

$$\langle \Delta p_t \rangle$$



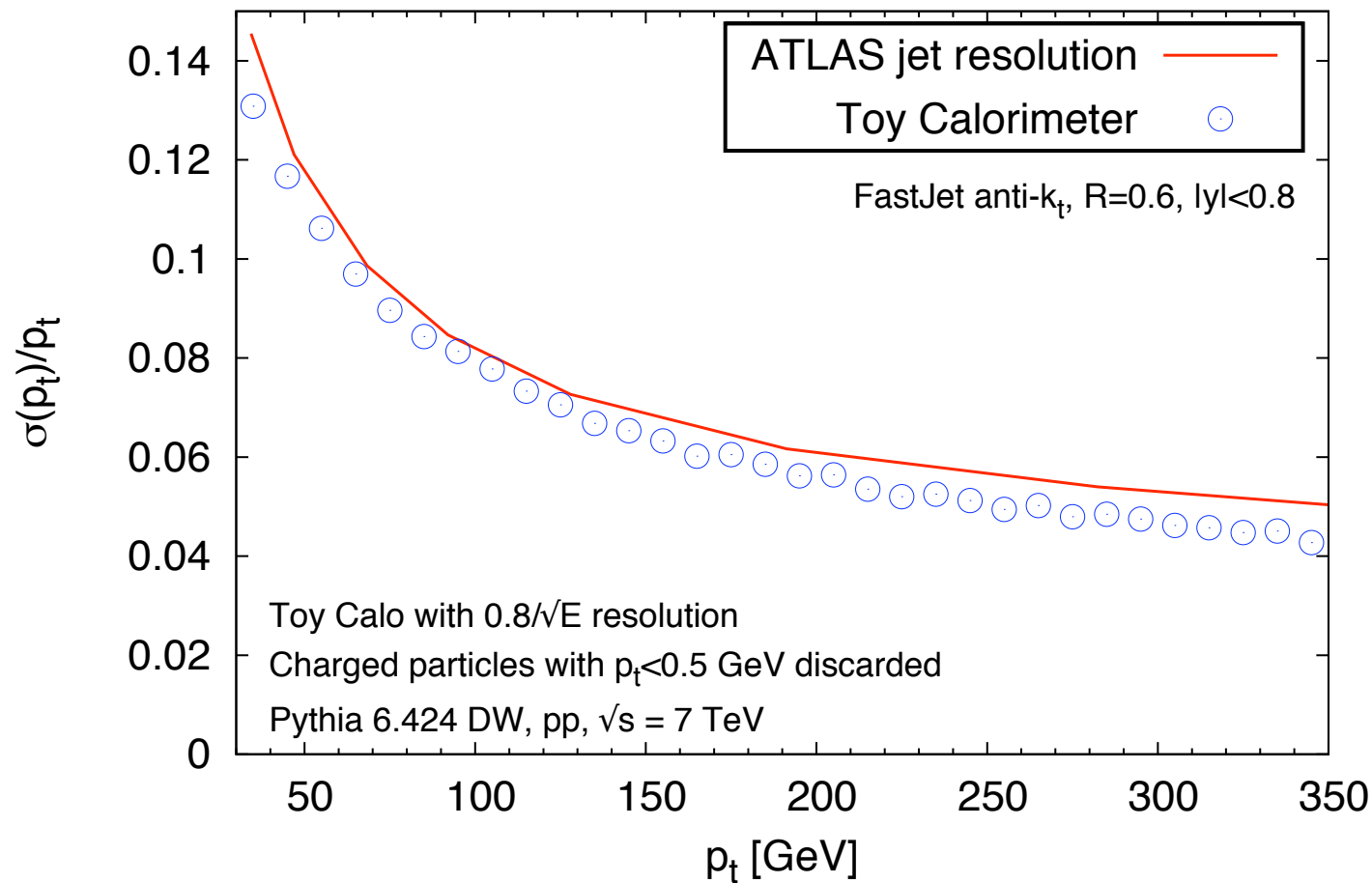
Intrinsic ambiguity mostly of order 1-2 GeV on  $\Delta p_t$

The local ranges perform similarly, the exclusion of hardest jets helps a little, the global range also performs fairly well here thanks to the limited rapidity coverage



# Toy calorimeter

Comparison of the resolution from a toy calorimeter and from the full ATLAS simulation

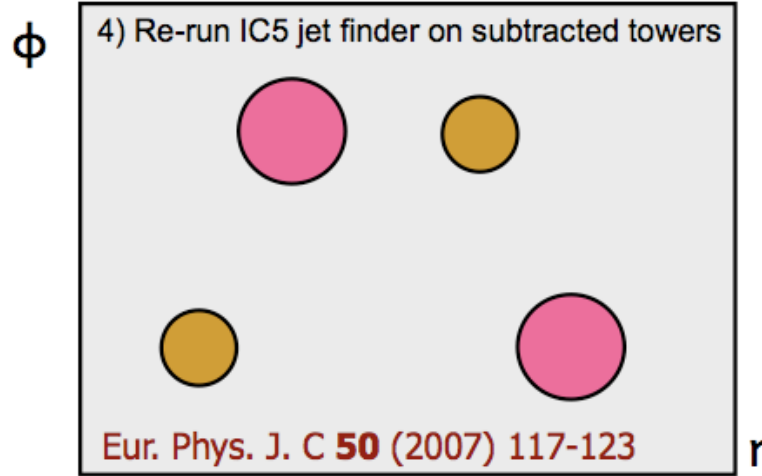
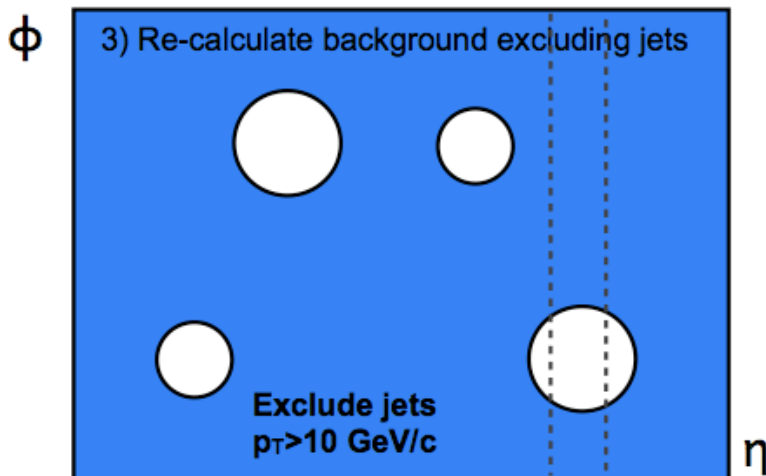
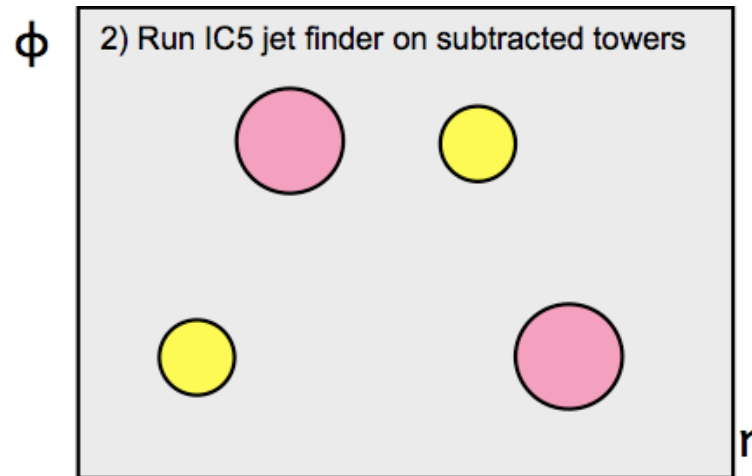
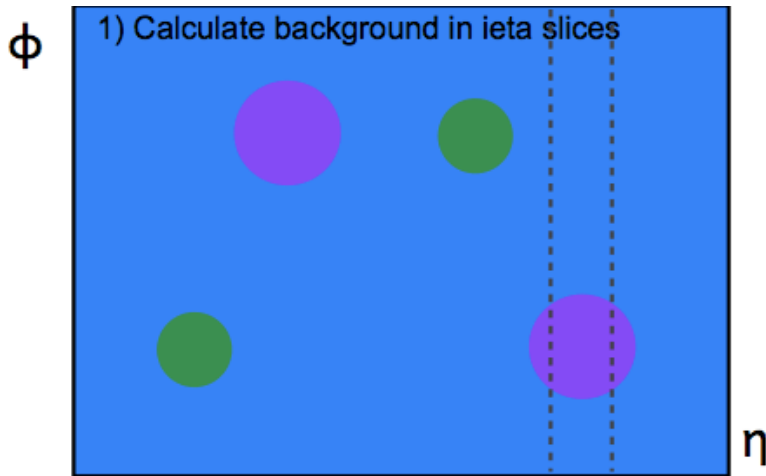


Toy calorimeter slightly better  $\Rightarrow$  no enhancement of fluctuations

# Another subtraction technique

## Iterative Cone Subtraction (used by CMS)

O. Kodolova et al. EPJC 50 (2007) 117



This algorithm contains **noise reduction**: only towers with a positive  $p_t$  after subtracting average background +  $\sigma$  are retained

# Iterative Cone Subtraction bias

Smaller fluctuations:

MC, Salam, Soyez, I I 01.2878

$$\begin{aligned}(\sigma_{\text{jet}}^{\text{noise-suppressed}})^2 &= N_{\text{tower}} [\langle (\delta p_{t,\text{tower}}^{\text{noise}})^2 \rangle - \langle \delta p_{t,\text{tower}}^{\text{noise}} \rangle^2] \\ &= N_{\text{tower}} \left[ \int_{\sigma_{\text{tower}}}^{\infty} dx \frac{(x - \sigma_{\text{tower}})^2}{\sqrt{2\pi}\sigma_{\text{tower}}} e^{-\frac{x^2}{2\sigma_{\text{tower}}^2}} - \langle \delta p_{t,\text{tower}}^{\text{noise}} \rangle^2 \right] \\ &\simeq (0.262 \sigma_{\text{tower}})^2 N_{\text{tower}},\end{aligned}$$

at the price of a potential bias on the jet  $p_t$ :

$$\langle \delta p_{t,\text{jet}}^{\text{overall}} \rangle = \langle \delta p_{t,\text{jet}}^{\text{noise}} \rangle + \langle \delta p_{t,\text{jet}}^{\text{hard}} \rangle \simeq (0.0833 - f) N_{\text{tower}} \sigma_{\text{tower}}$$

$f \approx 0.1$  is the occupancy of a hard perturbative jet  $\Rightarrow$  **large cancellation**

However, what happens to  $f$  in the case of quenching?

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$$\langle \delta p_{t,\text{jet}}^{\text{noise}} \rangle = N_{\text{tower}} \langle \delta p_{t,\text{tower}}^{\text{noise}} \rangle = N_{\text{tower}} \int_{\sigma_{\text{tower}}}^{\infty} dx \frac{(x - \sigma_{\text{tower}})}{\sqrt{2\pi}\sigma_{\text{tower}}} e^{-\frac{x^2}{2\sigma_{\text{tower}}^2}} \simeq 0.0833 \sigma_{\text{tower}} N_{\text{tower}}$$

$$\langle \delta p_{t,\text{jet}}^{\text{hard}} \rangle \simeq -f N_{\text{tower}} \sigma_{\text{tower}}$$