

# Jets, and Reconstruction with FastJet

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In collaboration with  
Gavin Salam and Gregory Soyez

La Patria chiama!



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From: Federico Antinori ▾

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To: Matteo Gaccian ▾

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Ciao Matteo,  
allora, mi dai una confermuccia per Frascati?

Ciao, grazie, a presto,

Federico



(S)ave (C)opy

# Goals

Consider **real** jet algorithms

i.e. jets that can be predicted from perturbative QCD

What tools are available?

Subtract **diffuse soft background** from hard jets

UE/pileup/heavy ions background

How do we do it?

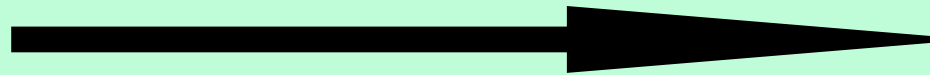
# Jet Definition

jet definition

$$\{P_i\}$$

particles,  
4-momenta,  
calorimeter towers, ....

jet algorithm


$$\{j_k\}$$

jets

+ parameters (usually at least the radius  $R$ )

Reminder: running a jet definition gives a well defined physical observable,  
which we can measure and, hopefully, calculate

# Jet Algorithm requirements

A jet algorithm **must** be

✓ infrared and collinear safe

soft emission shouldn't change jets  
collinear splitting shouldn't change jets

✓ identically defined at parton and hadron level

so that perturbative calculations can be compared to experiments

It is **nice** if a jet algorithm is

✓ not too sensitive to hadronisation, underlying event, pile-up

(because we are not very good at modeling non-perturbative stuff)

✓ realistically applicable at detector level

(e.g. not too slow)

# Jet Algorithms

Two main jet algorithm classes:

**cone algorithms** and **sequential clustering algorithms**



**Cone-type** algorithms (JetClu, ILCA/MidPoint, ....) are mainly used at the Tevatron. They **identify energy flow into cones**. Detailed definition can be messy. Infrared/collinear safety must be carefully studied.



**Sequential clustering** algorithms (kt, Cambridge/Aachen, Jade,...) are based on **pair-wise successive recombinations**. Widely used at LEP and HERA. Simple definition, safely infrared and collinear safe.

# The first cone

Jets are as old as the parton model (yes, even older than QCD...):

S.D. Drell, D.J. Levy and T.M. Yan, Phys. Rev. **187**, 2159 (1969) and **D1**, 1617 (1970)

N. Cabibbo, G. Parisi and M. Testa, Lett. Nuovo Cimento **4**, 35 (1970)

J.D. Bjorken and S. D. Brodsky, Phys. Rev. **D1**, 1416 (1970)

R.P. Feynman, Photon Hadron Interactions, p. 166 (1972)

The first rigorous definition of an **infrared and collinear safe** jet in QCD is due to Serman and Weinberg, Phys. Rev. Lett. **39**, 1436 (1977):

To study jets, we consider the partial cross section

$\sigma(E, \theta, \Omega, \epsilon, \delta)$  for  $e^+e^-$  hadron production events, in which all but

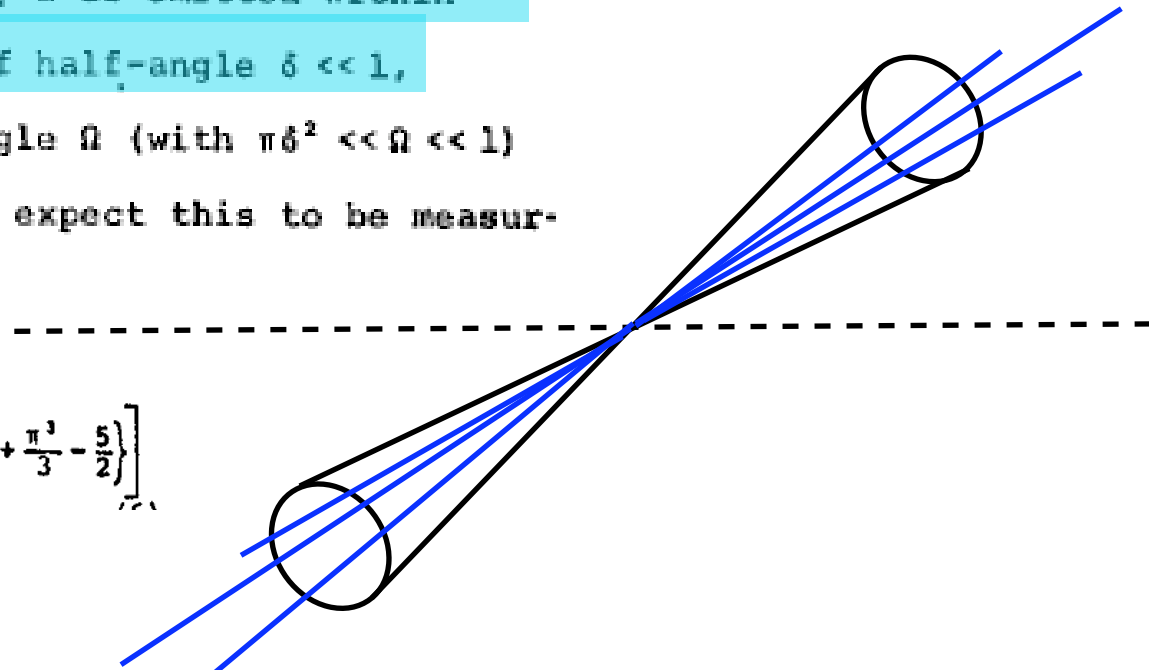
a fraction  $\epsilon \ll 1$  of the total  $e^+e^-$  energy  $E$  is emitted within

some pair of oppositely directed cones of half-angle  $\delta \ll 1$ ,

lying within two fixed cones of solid angle  $\Omega$  (with  $\pi\delta^2 \ll \Omega \ll 1$ )

at an angle  $\theta$  to the  $e^+e^-$  beam line. We expect this to be measur-

$$\sigma(E, \theta, \Omega, \epsilon, \delta) = (d\sigma/d\Omega)_0 \Omega \left[ 1 - (g_E^2/3\pi^2) \left\{ 3 \ln \delta + 4 \ln \delta \ln 2\epsilon + \frac{\pi^3}{3} - \frac{5}{2} \right\} \right]$$



# A modern cone algorithm

## How do I decide where to place the cones?

- 👉 try an initial location
- 👉 sum 4-momenta of particles, find axis of cone
- 👉 use axis as a new trial location, and **iterate**
- 👉 stop when axis is stable
- 👉 merge overlapping cones, or split them into two

## Issues:

💀 Where do I start?

Seedless (i.e. everywhere)?

Some particles above a threshold?

Calorimeter towers?

Very slow

Collinear unsafe

Expt. dependent

💀 How do I split/merge?

Complicated procedure, risky, not necessarily physical



# $k_t$ algorithm

The definition of a sequential clustering algorithm, on the other hand, is extremely simple.

For instance, take **the longitudinally invariant  $k_t$** :

S. Catani, Y. Dokshitzer, M. Seymour and B. Webber,  
Nucl. Phys. B406 (1993) 187  
S.D. Ellis and D.E. Soper, Phys. Rev. D48 (1993) 3160

- Calculate the distances between the particles:  $d_{ij} = \min(k_{ti}^2, k_{tj}^2) \frac{\Delta y^2 + \Delta \phi^2}{R^2}$
- Calculate the beam distances:  $d_{iB} = k_{ti}^2$
- Combine particles with smallest distance or, if  $d_{iB}$  is smallest, call it a jet
- Find again smallest distance and repeat procedure until no particles are left

[In most naive implementation, calculating all distances is an  $N^2$  operation, to be repeated  $N$  times  $\Rightarrow O(N^3)$ ]

# Tools

Until two years ago:

- Cone algorithms: not really safe

Typical cone algorithms (JetClu, MidPoint, etc) are not infrared safe: at some order in perturbation theory they will fail

- $k_t$  algorithm: very slow for large  $N$  ( $\sim N^3$ )

Clustering many particles takes a very long time  
( $\sim$  1 day CPU time for one LHC heavy ion event)

# Tools

## Now:

- $k_t$  and Cam/Aachen algorithms: very fast ( $\sim N \ln N$ )  
MC, G. Salam, hep-ph/0512210
- Cone safe and reasonably fast (SISCone,  $\sim N^2 \ln N$ )  
G. Salam, G. Soyez, arXiv:0704.0292
- Subtraction of background using jet areas  
MC, G. Salam, arXiv:0707.1378
- anti- $k_t$  algorithm (recombination algorithm, but gives perfect cones)  
MC, G. Salam, G. Soyez, in preparation

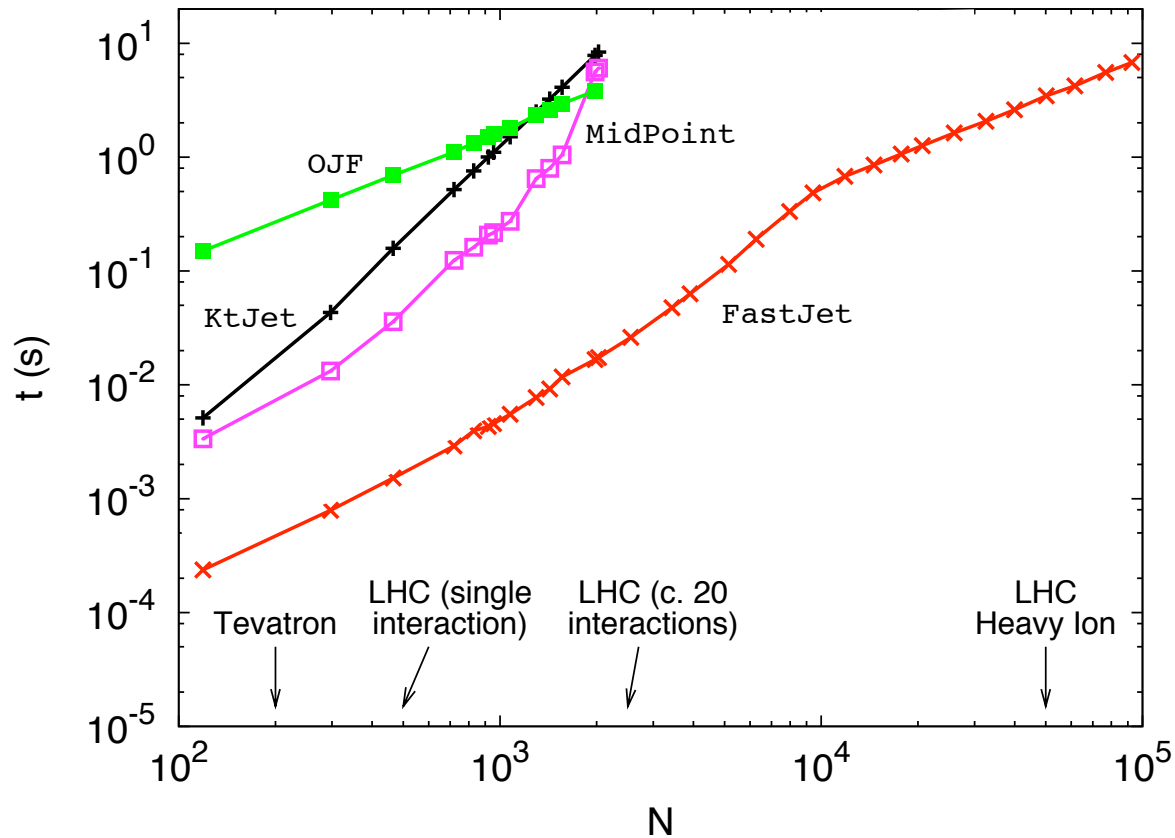
FastJet: <http://www.lpthe.jussieu.fr/~salam/fastjet>

# FastJet performance

**Time** taken to cluster  $N$  particles ( $k_t$  algorithm):

**10 s**

**1 ms**



Almost two orders of magnitude gain at small  $N$  (related  $O(N^2)$  implementation)

Large- $N$  region now reachable ( $O(1$  sec) rather than 1 day for heavy ion collisions)

# What is anti- $k_t$ ?

A new recombination-type algorithm,  
using a distance measure similar to  $k_t$  and Cambridge/Aachen:

$$d_{ij} = \min(k_{ti}^2, k_{tj}^2) \frac{\Delta y^2 + \Delta \phi^2}{R^2}$$

$k_t$

$$d_{ij} = \frac{\Delta y^2 + \Delta \phi^2}{R^2}$$

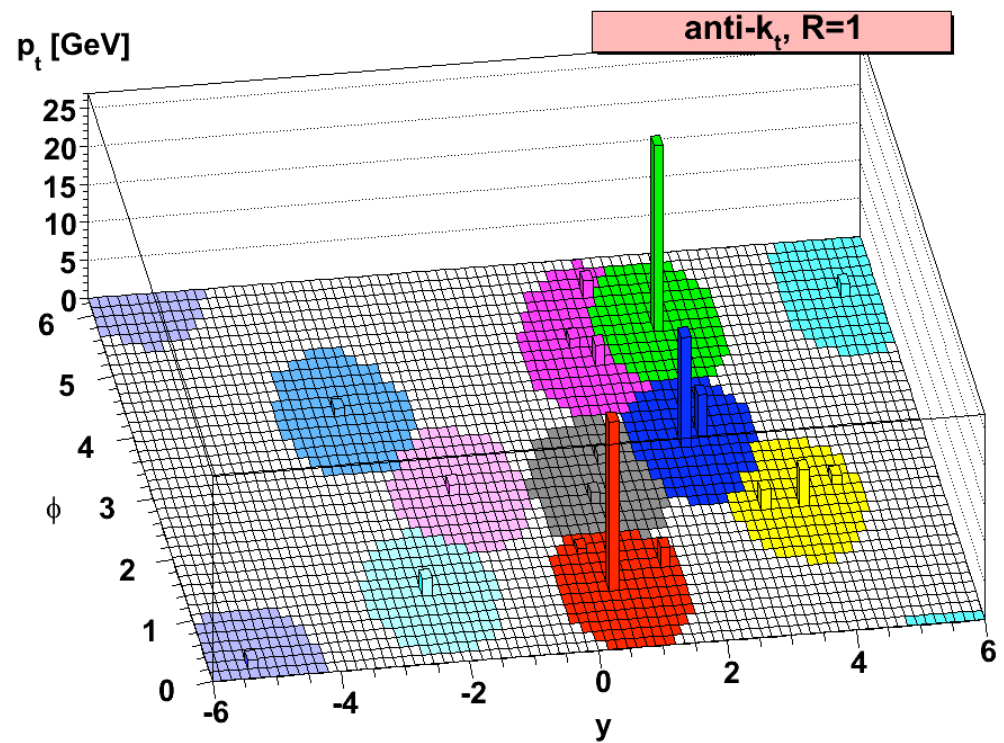
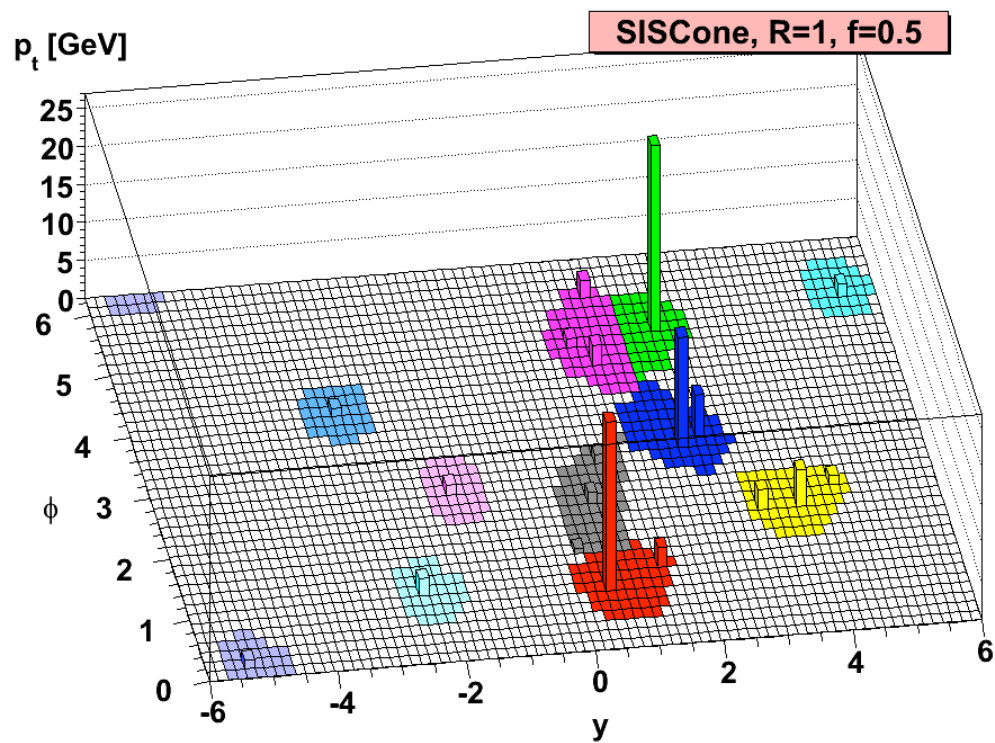
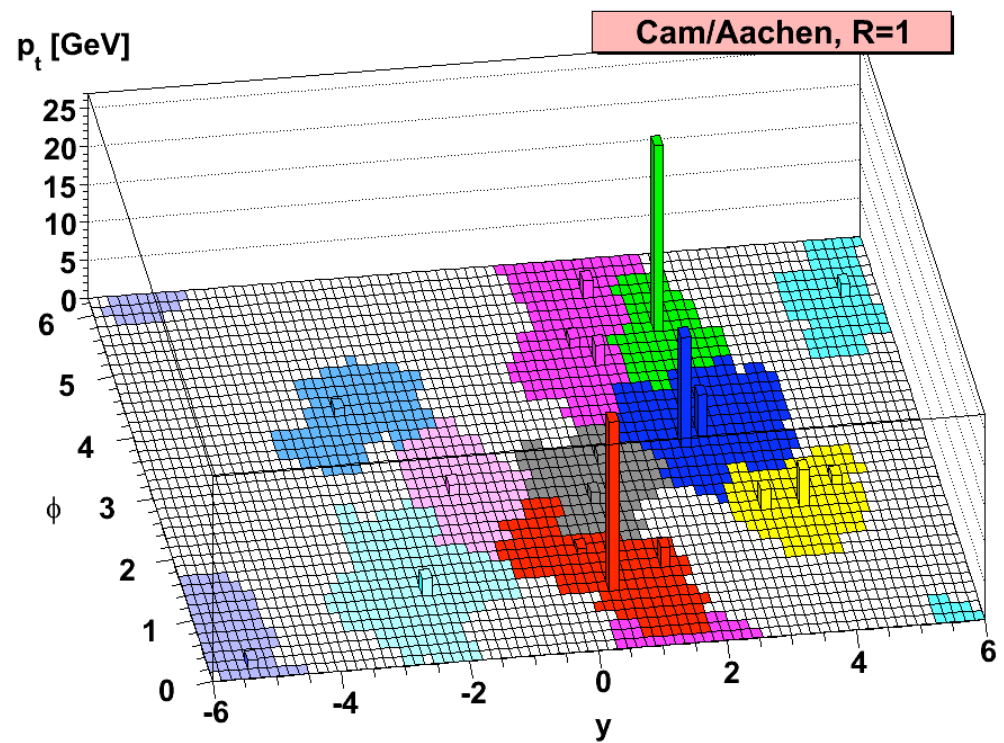
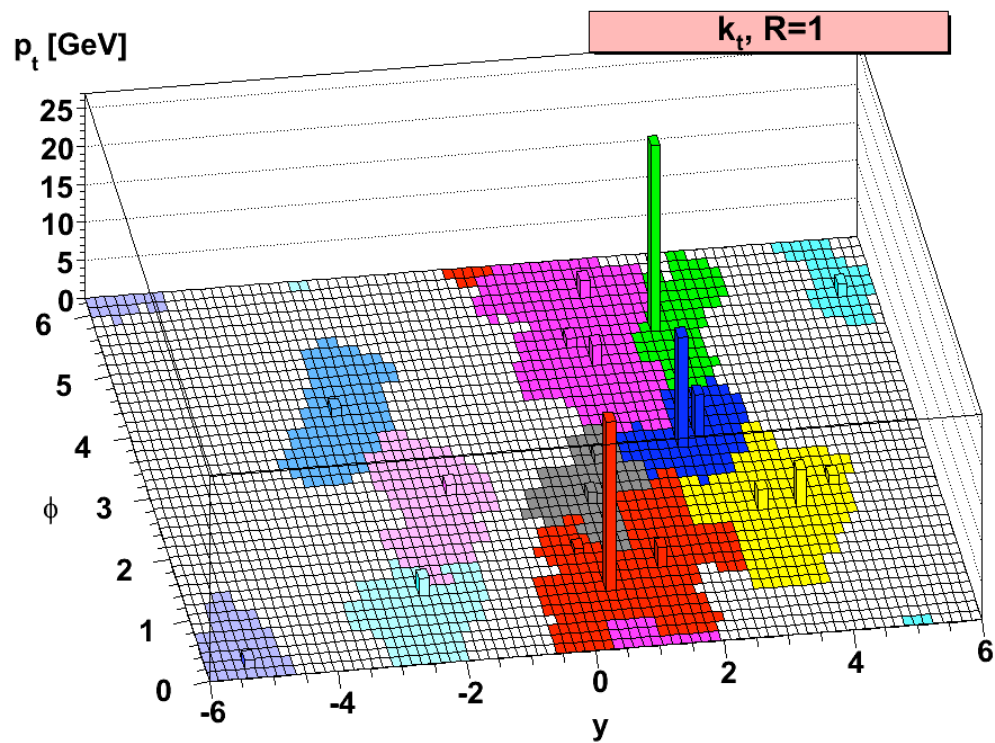
Cambridge/Aachen

$$d_{ij} = \min\left(\frac{1}{k_{ti}^2}, \frac{1}{k_{tj}^2}\right) \frac{\Delta y^2 + \Delta \phi^2}{R^2}$$

anti- $k_t$

Three members of a family of algorithms:

$$d_{ij} = \min(k_{ti}^{2p}, k_{tj}^{2p}) \frac{\Delta y^2 + \Delta \phi^2}{R^2} \quad \begin{cases} p=1 & k_t \\ p=0 & \text{Cam/Aachen} \\ p=-1 & \text{anti-}k_t \end{cases}$$



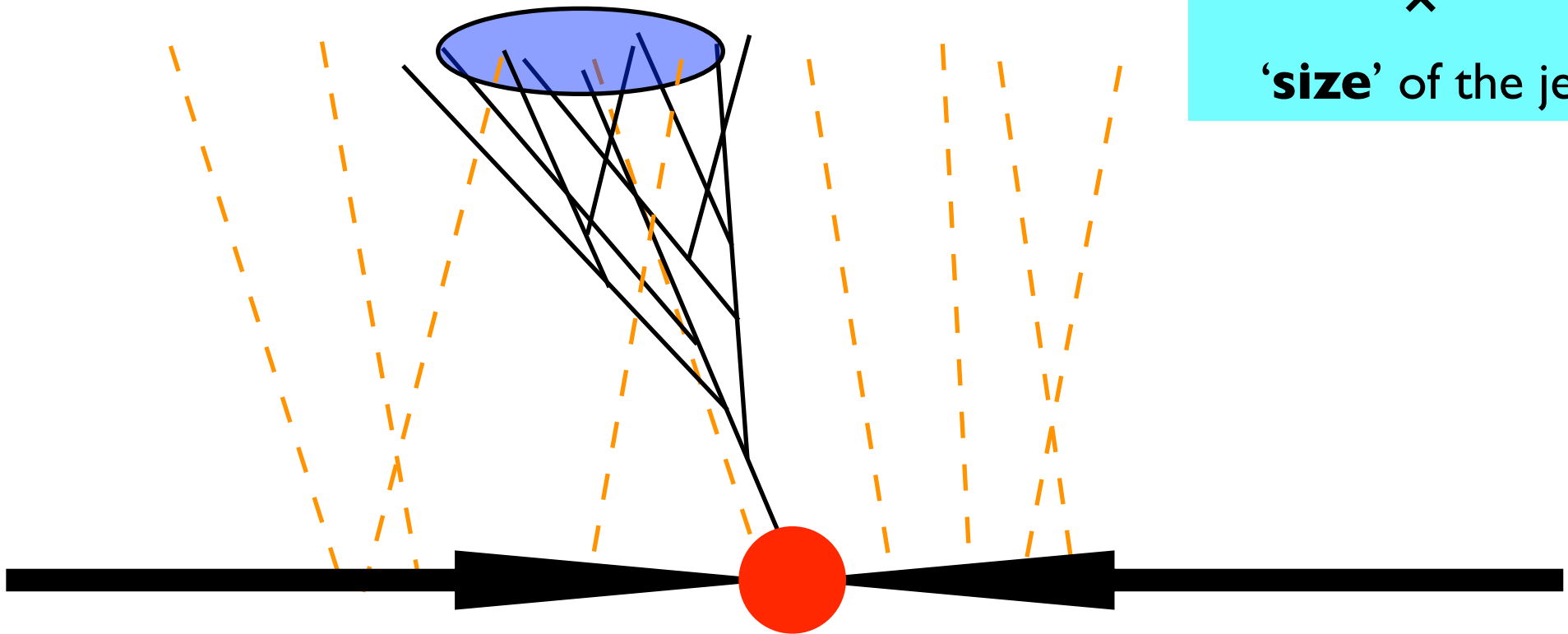
# A crowded event

$$p_T(\text{jet}) \sim p_T(\text{parton}) +$$

Average underlying  
momentum density

×

'size' of the jet



Can we get to know the momentum density of the radiation?  
Can we subtract it from the jet to find the parton momentum?

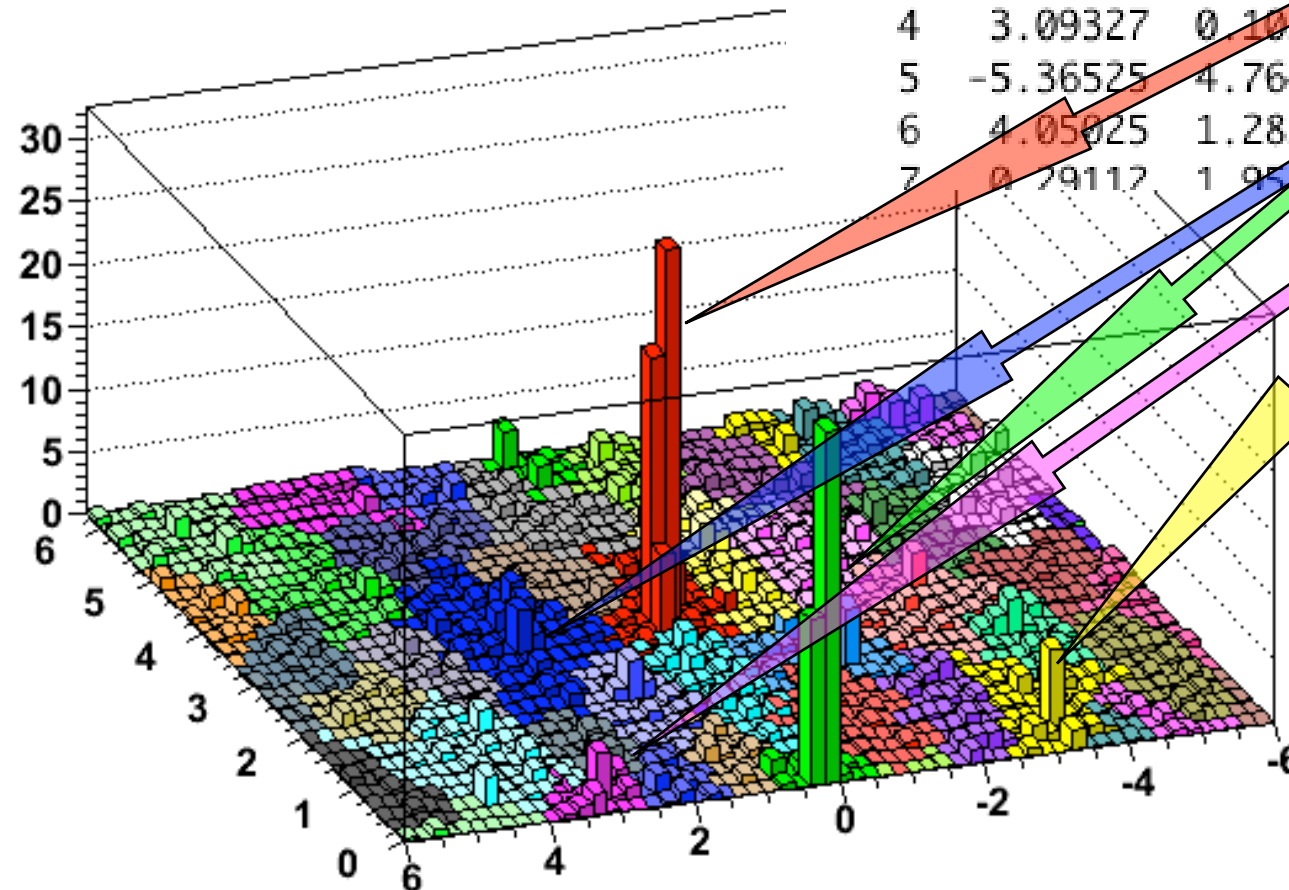
What is the '**size**' of a jet??

# The Active Jet Area

FastJet allows the calculation of the **areas** of the jets

iev 0 (irepeat 24): number of particles = 1428  
strategy used = NlnN  
number of particles = 9051  
Total area: 76.0265  
Expected area: 76.0265

ijet	eta	phi	Pt	area	+-	err
0	0.15050	3.24498	69.970	2.625	+-	0.020
1	0.18579	0.13150	59.133	1.896	+-	0.020
2	2.33840	3.23960	31.976	4.749	+-	0.028
3	-3.41796	0.52394	26.585	3.084	+-	0.021
4	3.09327	0.10350	20.072	2.688	+-	0.023
5	-5.36525	4.76491	19.588	2.780	+-	0.012
6	4.05025	1.28270	15.361	3.592	+-	0.028
7	0.79117	1.95775	14.566	2.114	+-	0.018



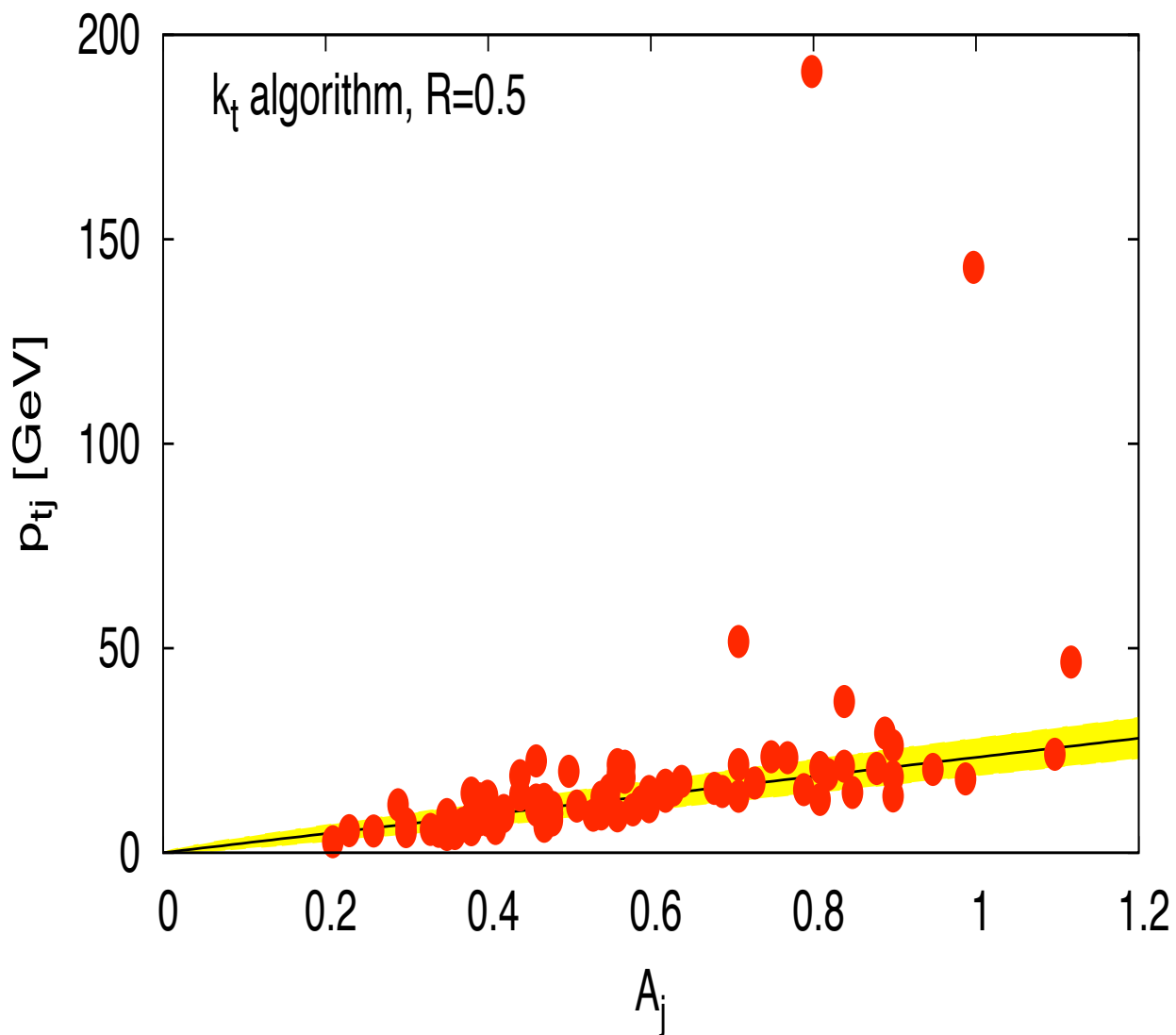
Try to estimate the **active area** of each jet  
Fill event with many very soft particles, count how many are clustered into given jet

[NB. This is a **definition**]



# Area vs. $p_T$

LHC: dijet event + high-lumi pileup



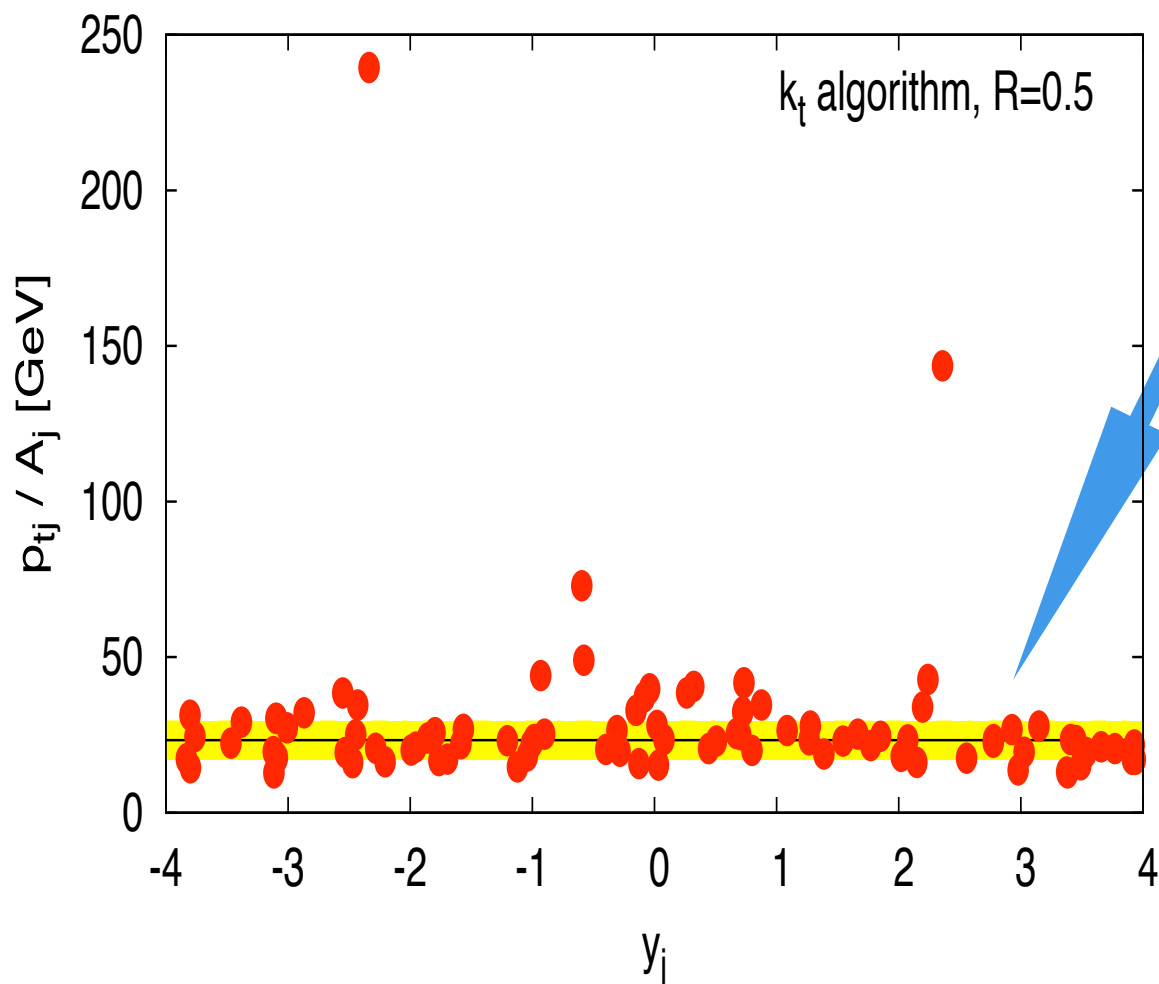
The jets adapt to the surrounding environment



They can have very different areas

# Area vs. $p_T$

$p_T$ /Area is fairly constant, except for the hard jets



The distribution of background jets establishes its own average momentum density

**(NB. this is true on an event-by-event basis)**

## **Dynamical selection**

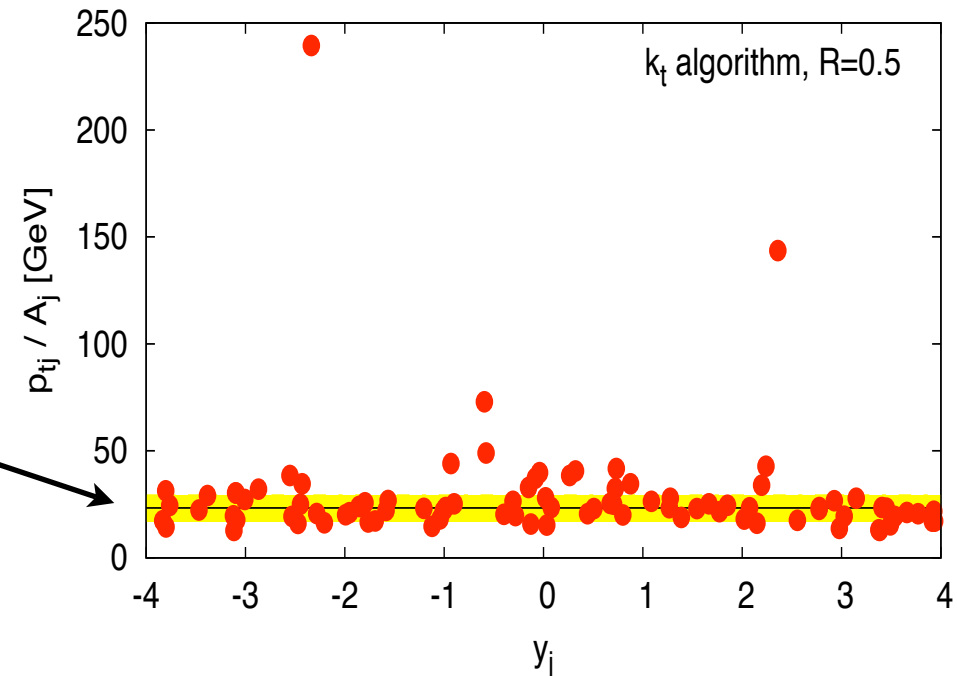
The jets are classified as belonging to the noise on the basis of their **characteristics**

# Extraction of average noise momentum density

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

(Taking the median of the distribution is a nice trick to get rid of the possible bias from the few hard jets)

One can also estimate the fluctuations  
(yellow band)



# Subtraction

- A proper operative definition of **jet area** can be given
- When a hard event is superimposed on a **roughly uniformly distributed background**, study of **transverse momentum/area** of each jet allows one to determine the noise density  $\rho$  (and its fluctuation) on an event-by-event basis
- Once measured, the background density can be used to correct the transverse momentum of the hard jets:

$$p_T^{\text{hard jet, corrected}} = p_T^{\text{hard jet, raw}} - \rho \times \text{Area}_{\text{hard jet}}$$

NB. Procedure fully data driven.  
No Monte Carlo corrections  
needed in principle

# The subtraction: ease of implementation

```
// the input particles' 4-momenta
vector<fastjet::PseudoJet> input_particles;

// choose the jet algorithm
fastjet::JetDefinition jet_def(kt_algorithm,R);

// define the kind of area
fastjet::GhostedAreaSpec ghosted_area_spec(ghost_etamax);
fastjet::AreaDefinition area_def(ghosted_area_spec);

// perform the clustering
fastjet::ClusterSequence cs(input_particles,jet_def,area_def);

// get the jets with pt > 0
vector<fastjet::PseudoJet> jets = cs.inclusive_jets();

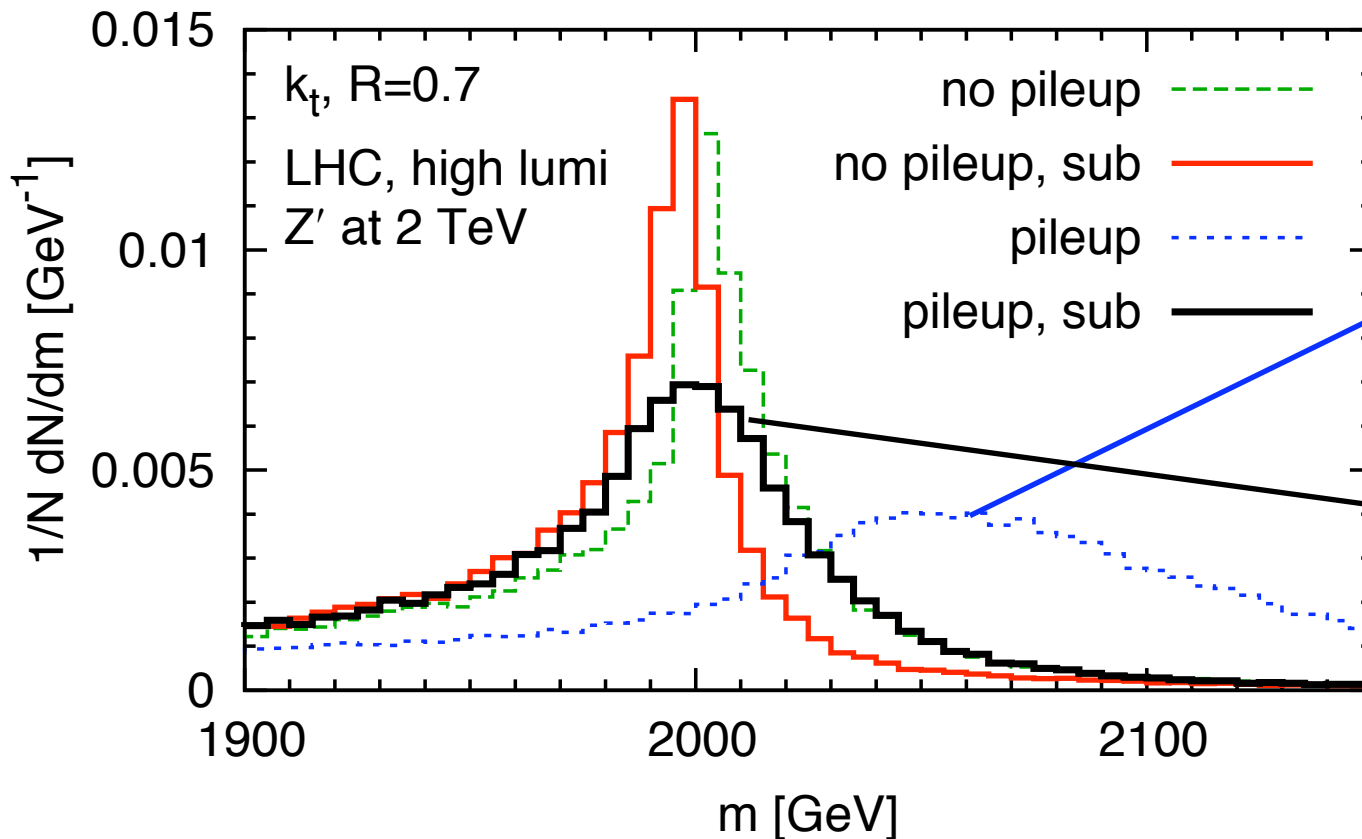
// a jet transverse momentum, area, and area 4-vector
double pt = jets[0].perp();
double area = cs.area(jets[0]);
fastjet::Pseudojet area_4vector = cs.area_4vector(jets[0]);
```

```
// get the median, i.e. rho
double rho = cs.median_pt_per_unit_area(rapmax); // or:
double rho_4v = cs.median_pt_per_unit_area_4vector(rapmax);

// subtract
double pt_sub = pt - rho * area; // or:
fastjet::Pseudojet p_sub = jets[0] - rho_4v * area_4vector;
```

NB1. The “\_4vector” variants also correct jet directions, and are better for large R  
NB2. This is a pp case, but heavy ions is similar

# Reconstructed $Z'$ mass



Pileup shifts peak by  $\sim 50$  GeV, and broadens it

Correct peak position and better resolution after subtraction

	$k_t$		Cam/Aachen		SISCone	
	$m$	$\Delta m$	$m$	$\Delta m$	$m$	$\Delta m$
no pileup	2003	10	2002	10	1998	10
no pileup, sub	1995	13	1995	8	1993	10
pileup	2065	60	2049	48	2030	33
pileup, sub	1998	25	1998	25	1997	20

# Heavy Ion Collisions: PbPb @ LHC

Background much larger than LHC hi-lumi pileup:

$$\left. \frac{dN_{ch}}{dy} \right|_{y=0} = 1600 \quad \Rightarrow \quad \rho_{background} \equiv \frac{dp_T}{dyd\phi} \sim 250 \text{ GeV} \quad \text{HYDJET v1.1}$$

Hence, a jet with  $R = 0.4$  on average gets an additional

$$\Delta p_T \simeq \rho_{background} \pi R^2 \sim 100 \text{ GeV}$$

and yet, not so much the size of this background, but rather its **fluctuations**, are the real obstacle to its subtraction

# Heavy Ion Jet Algorithms

Standard approach: correct **before/during** clustering.

-  $p_t$  cut  $\sim$  1-2 GeV

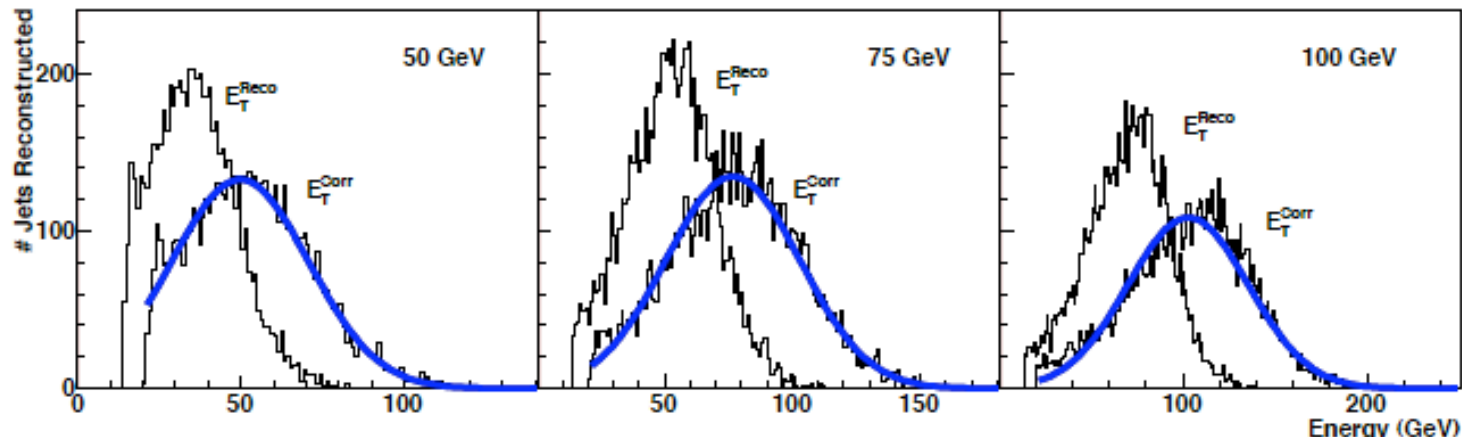
Eliminates most background, but not collinear safe.  
Requires a posteriori correction.  
How does it affect determination of quenching?

- subtract energy from calorimeter cells

Negative energy cells?  
Experiment dependent

**Example:** A Cone Jet-Finding Algorithm for Heavy-Ion Collisions at LHC Energies nucl-ex/0609023

S-L Blyth<sup>1,2</sup>, M J Horner<sup>1,2</sup>, T Awes<sup>3</sup>, T Cormier<sup>4</sup>, H Gray<sup>1,2</sup>, J L Klay<sup>5</sup>, S R Klein<sup>1</sup>, M van Leeuwen<sup>1</sup>, A Morsch<sup>6</sup>, G Odyniec<sup>1</sup> and A Pavlinov<sup>4</sup>



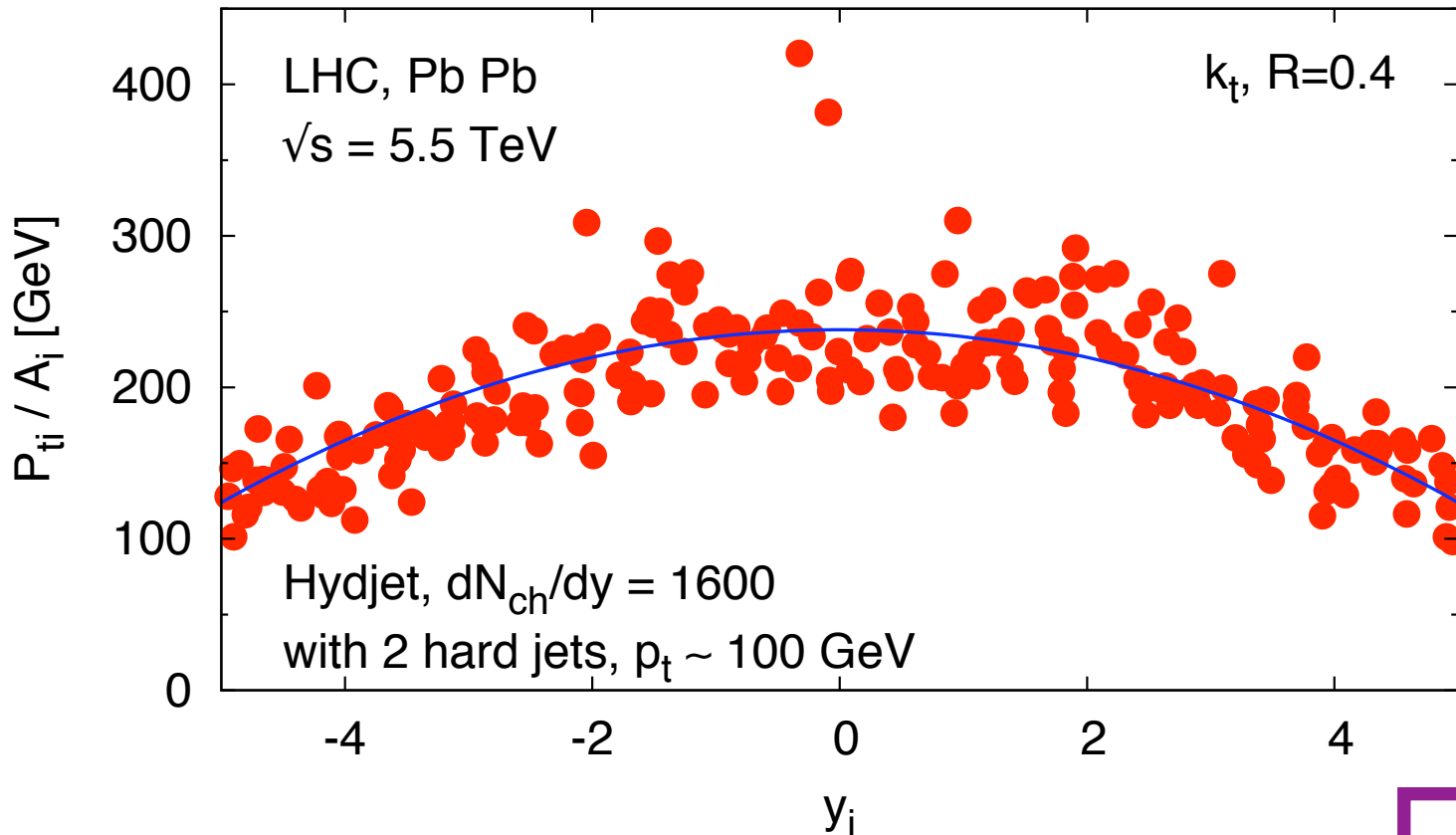
	50 GeV jets	75 GeV jets	100 GeV jets
	+ HIJING	+ HIJING	+ HIJING
$\langle E_T^{Reco} \rangle \pm \sigma$ (GeV)	$34 \pm 14$	$52 \pm 18$	$70 \pm 22$
$\langle E_T^{Corr} \rangle \pm \sigma$ (GeV)	$50 \pm 21$	$77 \pm 26$	$103 \pm 33$



# Proposal for Heavy Ion Collisions

Use the same approach (area-based) proposed for pileup:

- study transverse momentum/area of each jet
- subtract contribution proportional to area of each jet

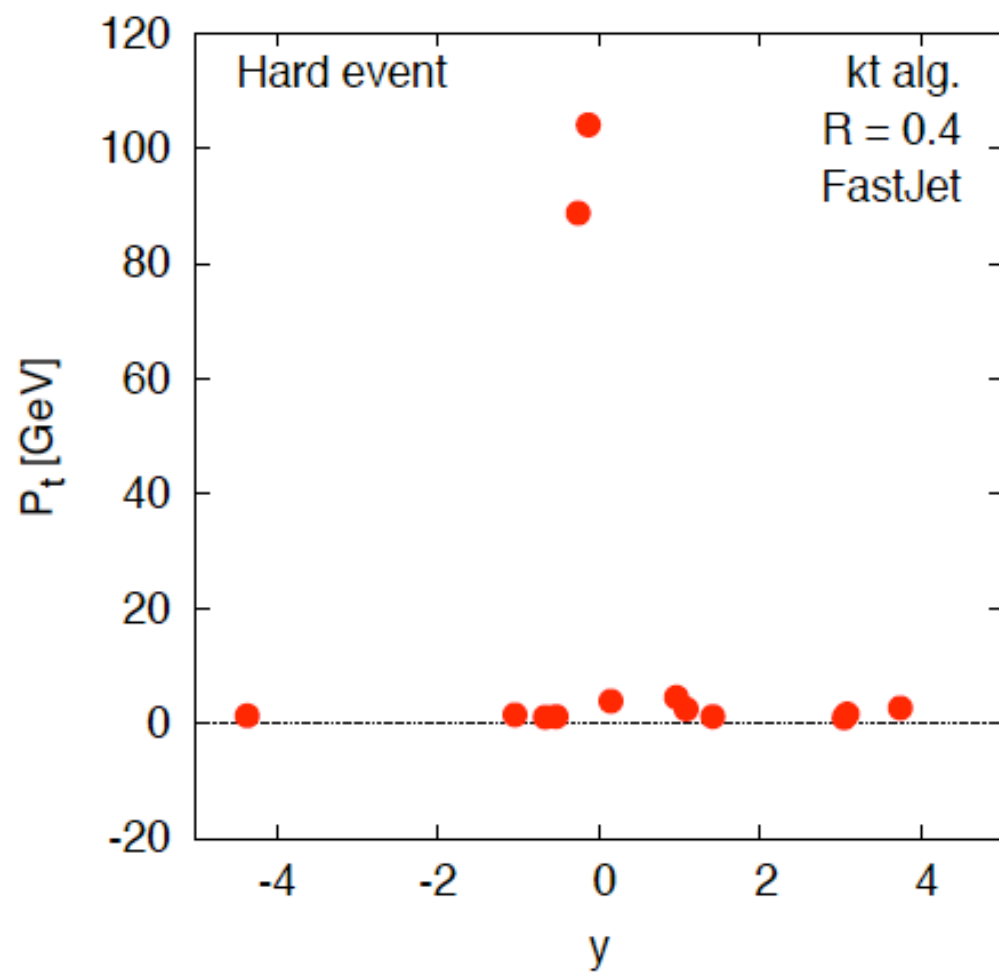


This is what improves the resolution

**NB. No minimum  $p_t$  cut ever used**

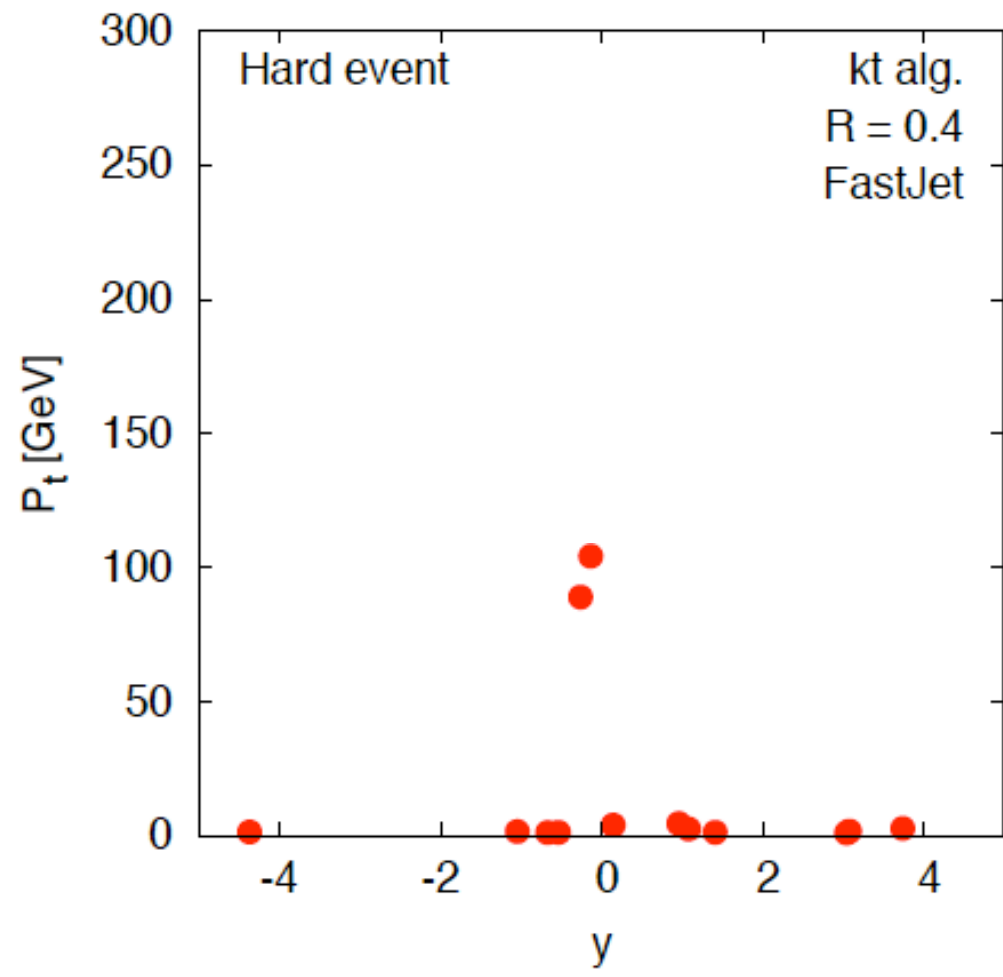
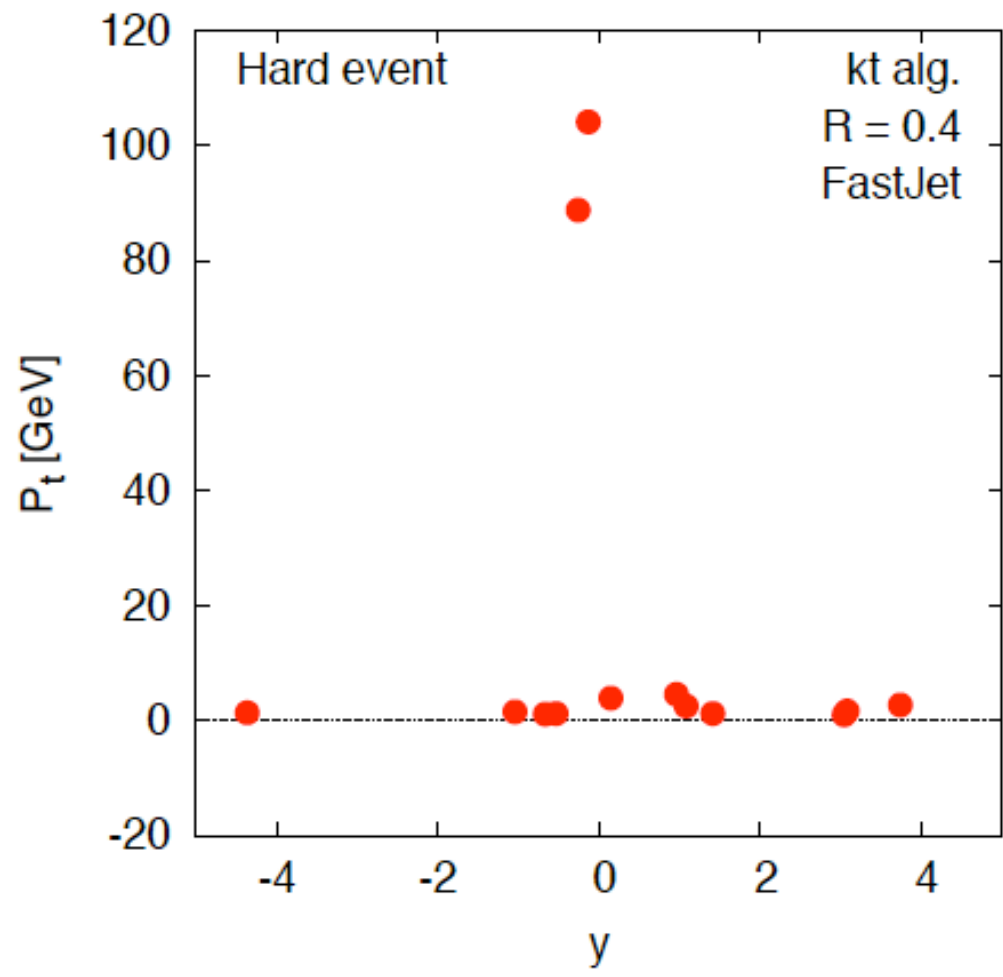
Minor modification: fit a parabola (or any appropriate shape).  
One can also study a subregion and extract the local background level.

## Background subtraction in HI event



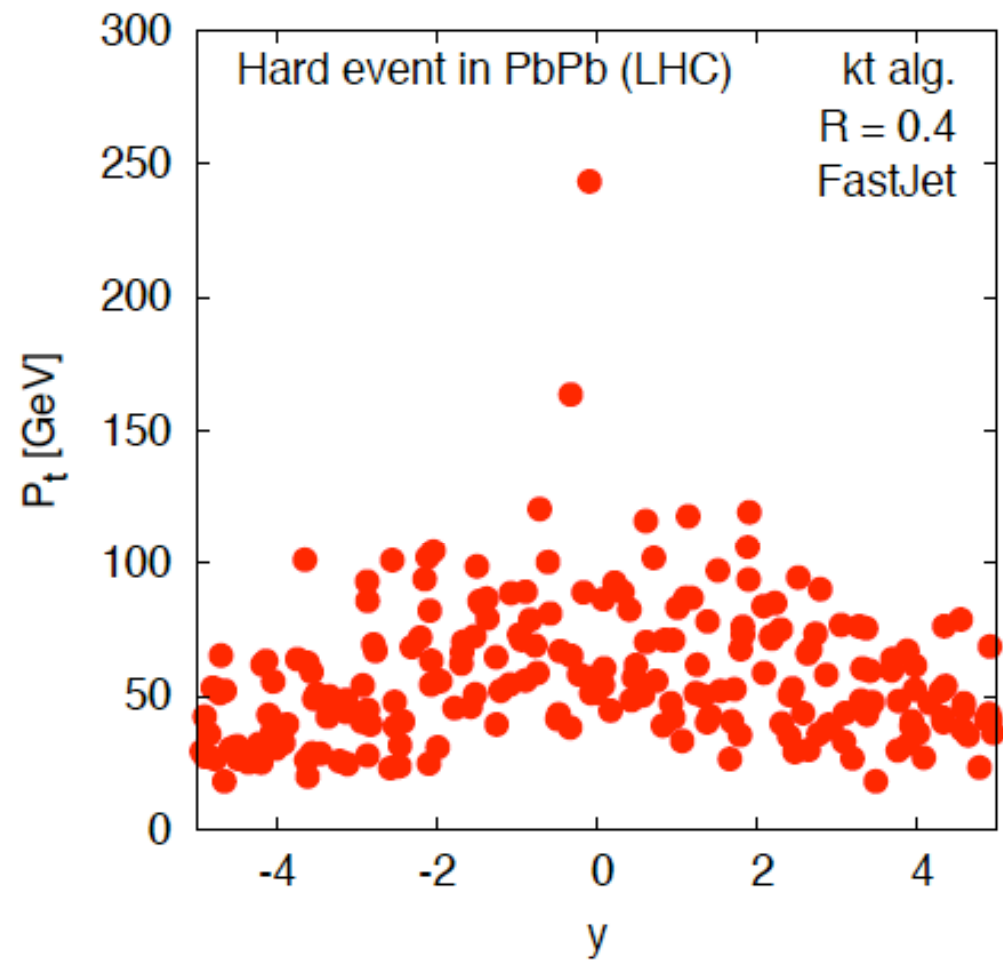
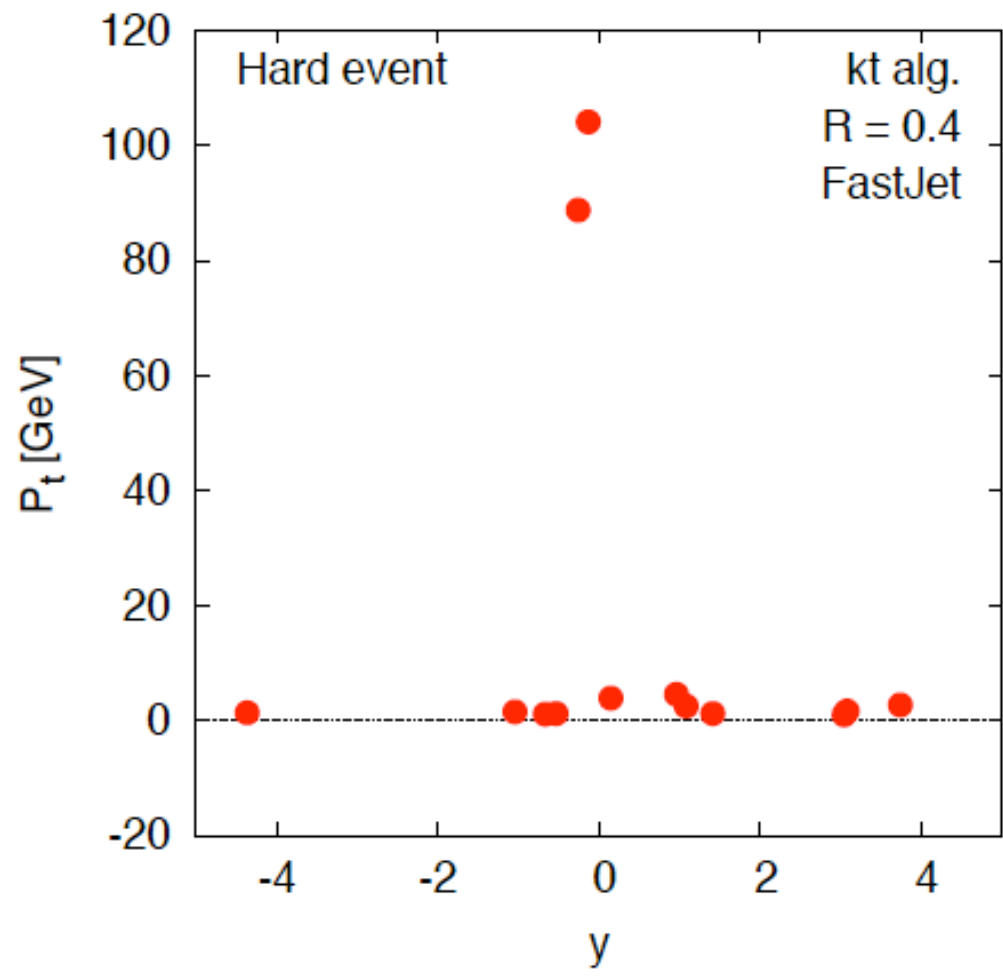
Start with a hard dijet event

# Background subtraction in HI event



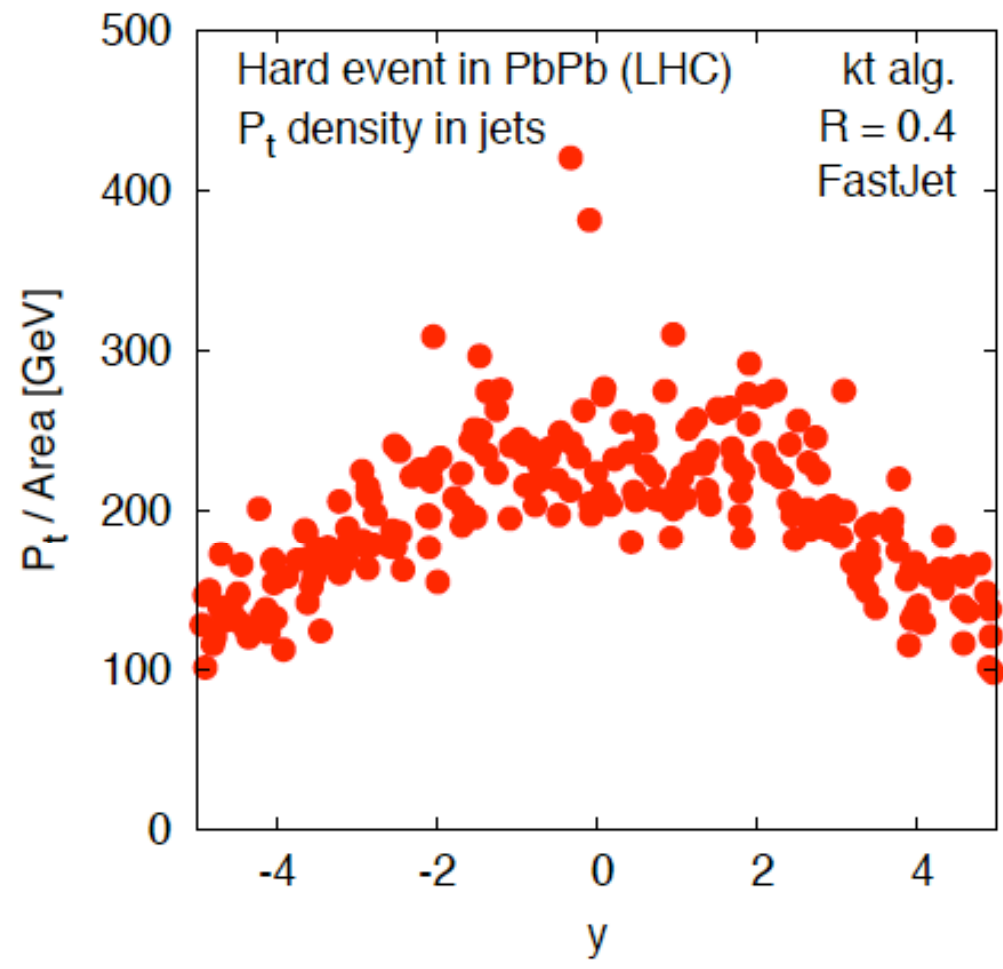
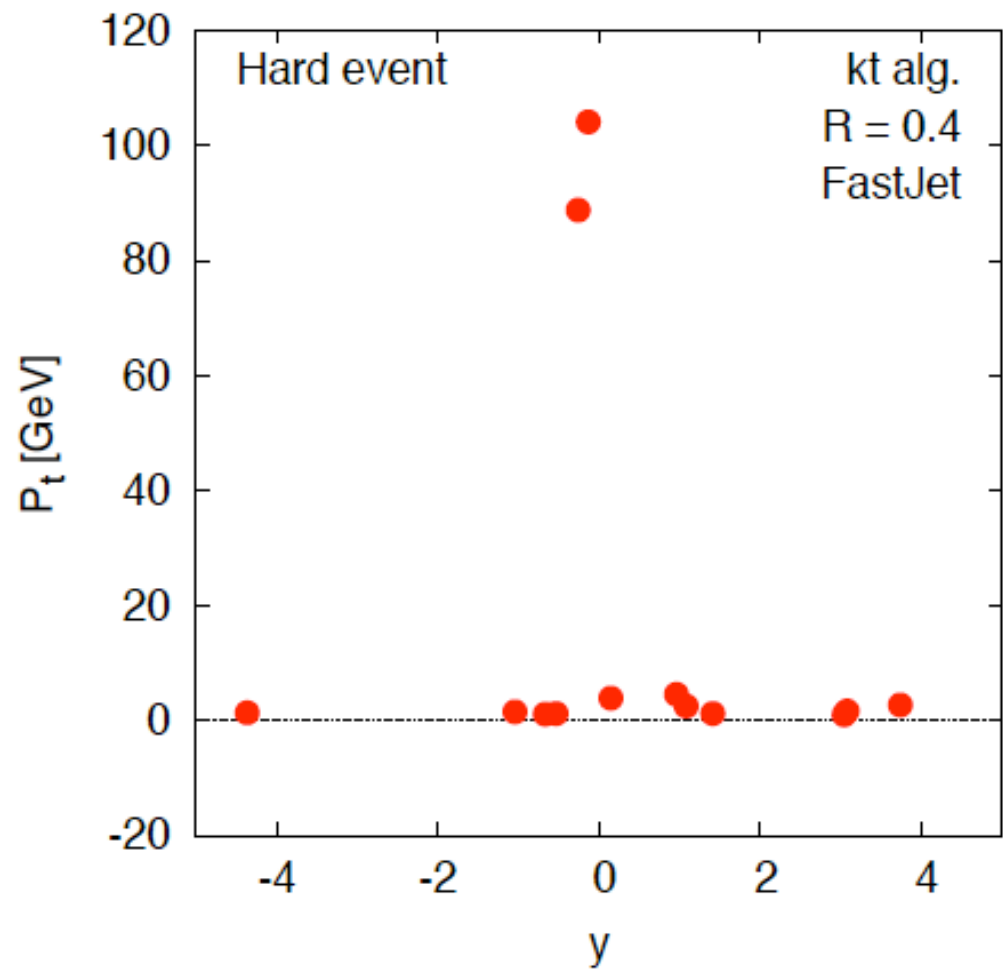
Same event on a different scale

# Background subtraction in HI event



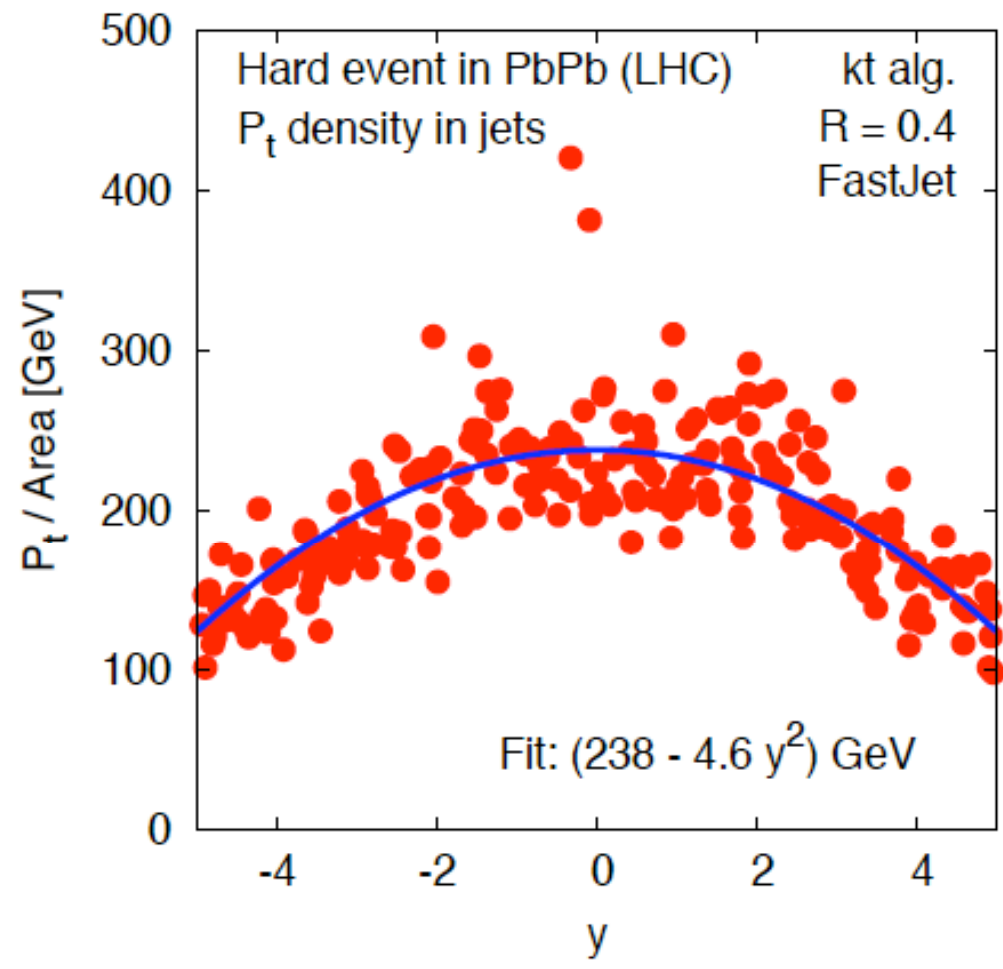
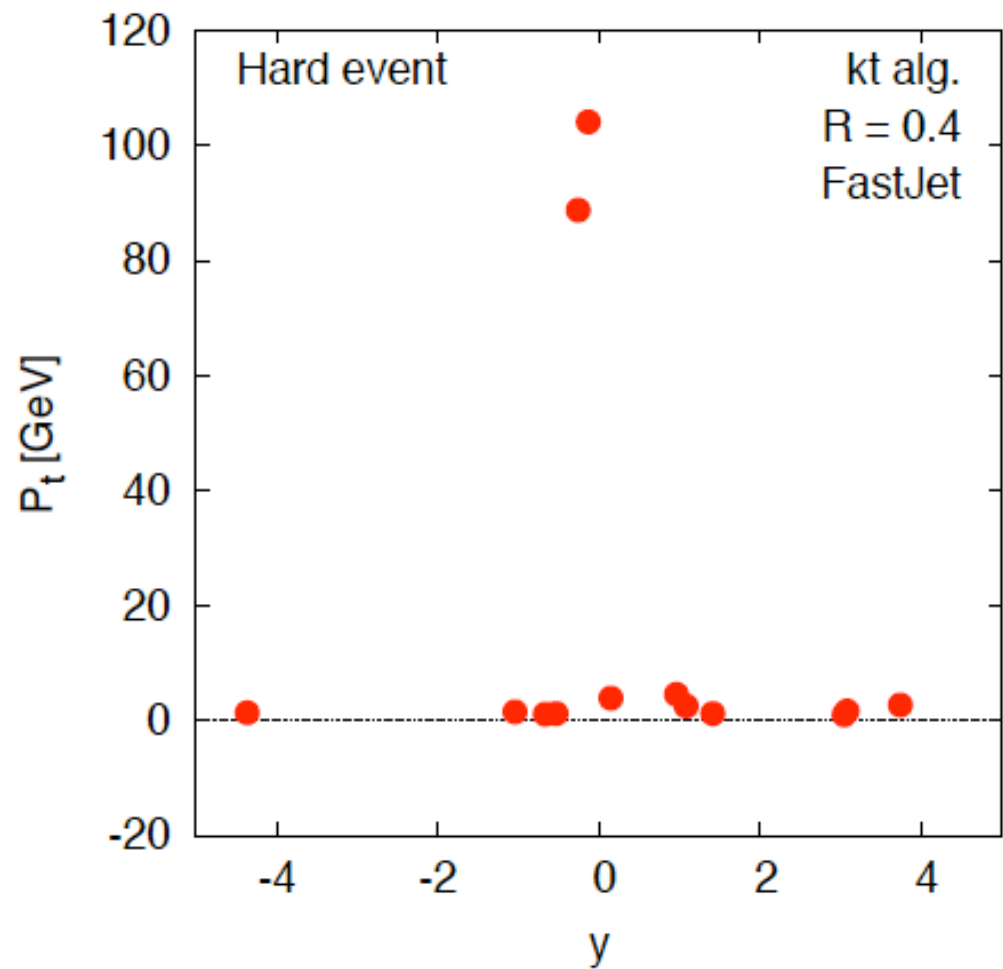
Embed it into a central Hydjet Pb Pb event

# Background subtraction in HI event



Look at  $P_t / \text{Area}$  for each jet

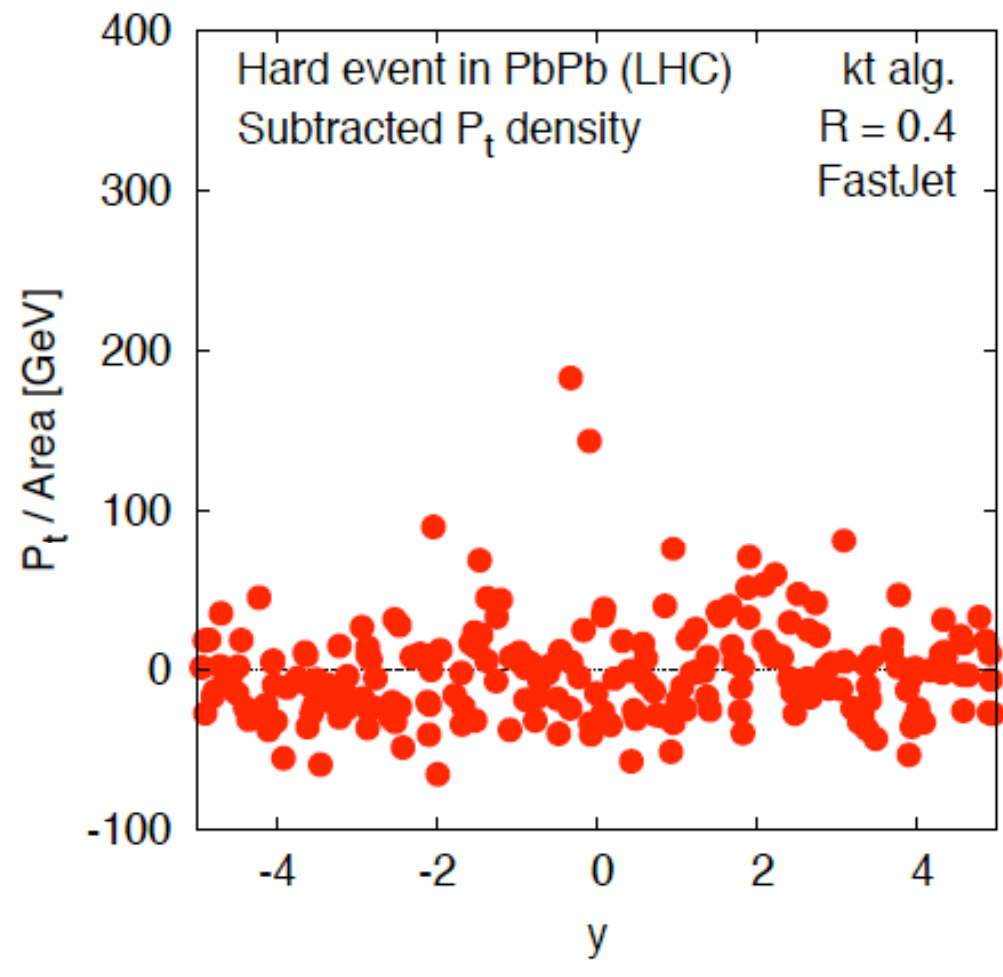
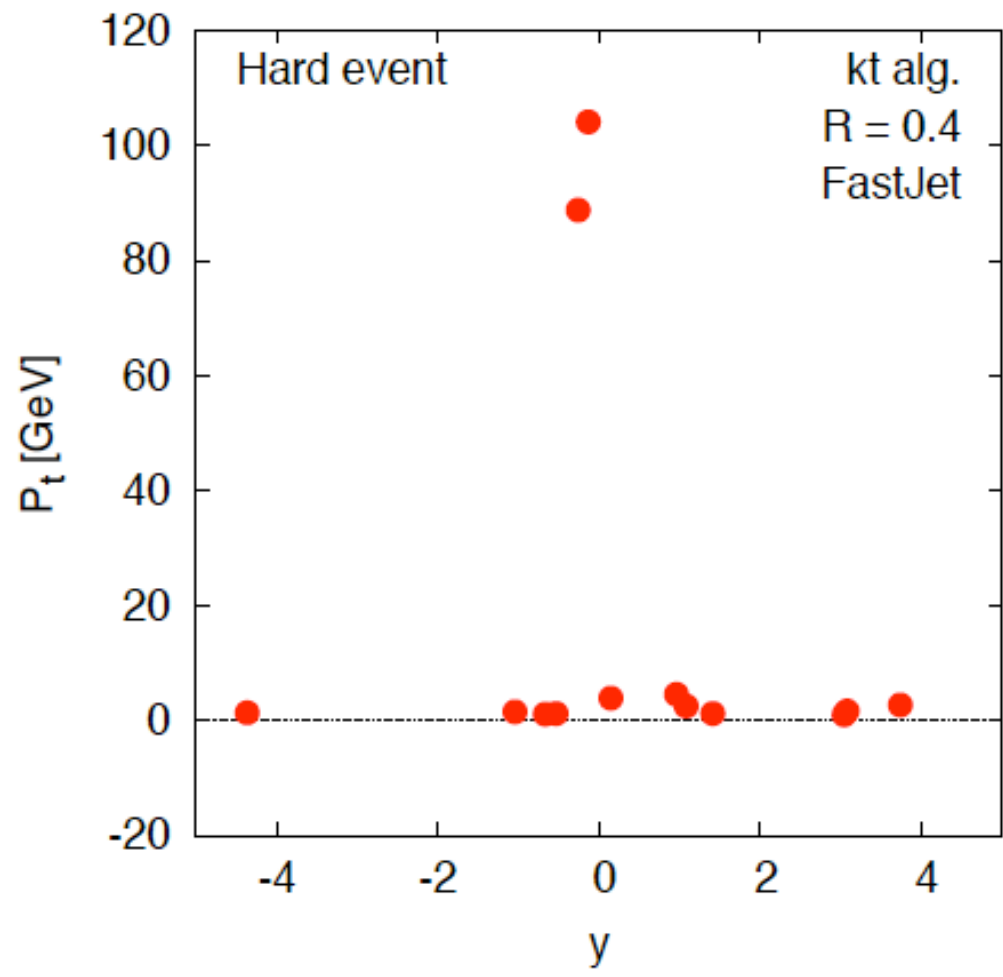
# Background subtraction in HI event



Fit the background  $\rho(y)$

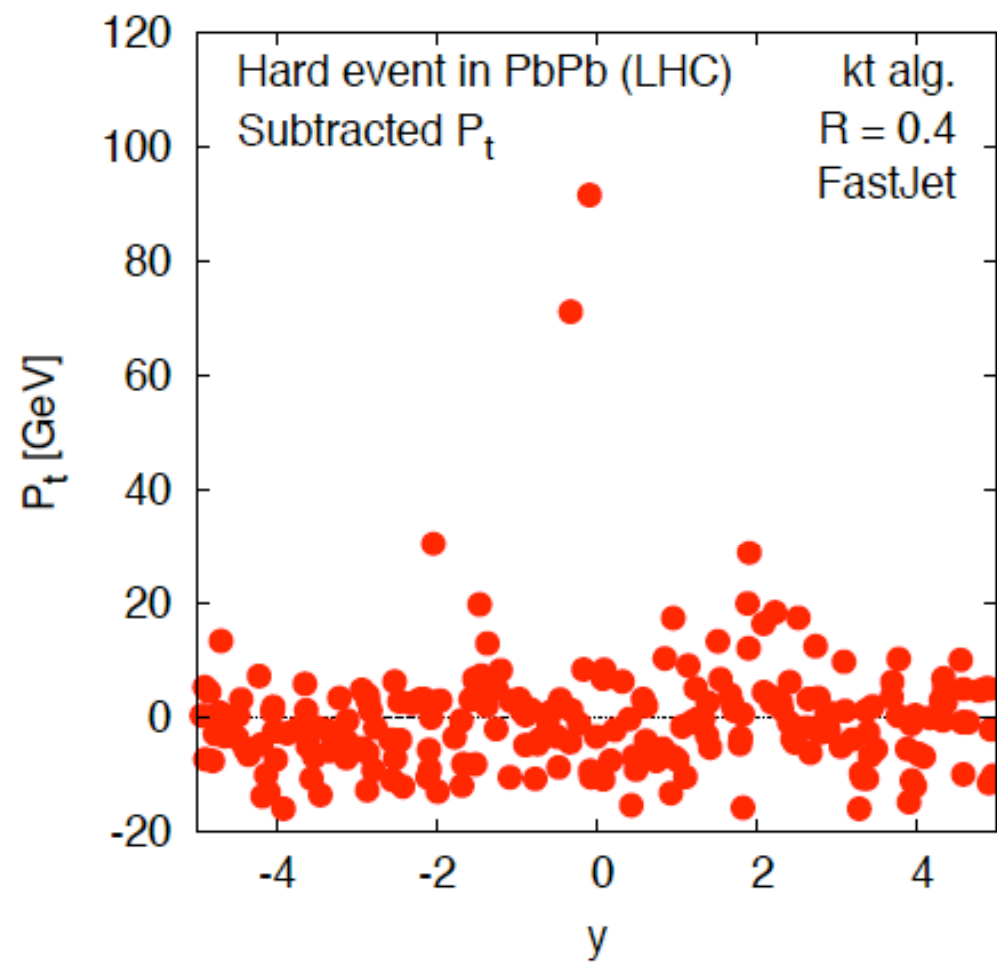
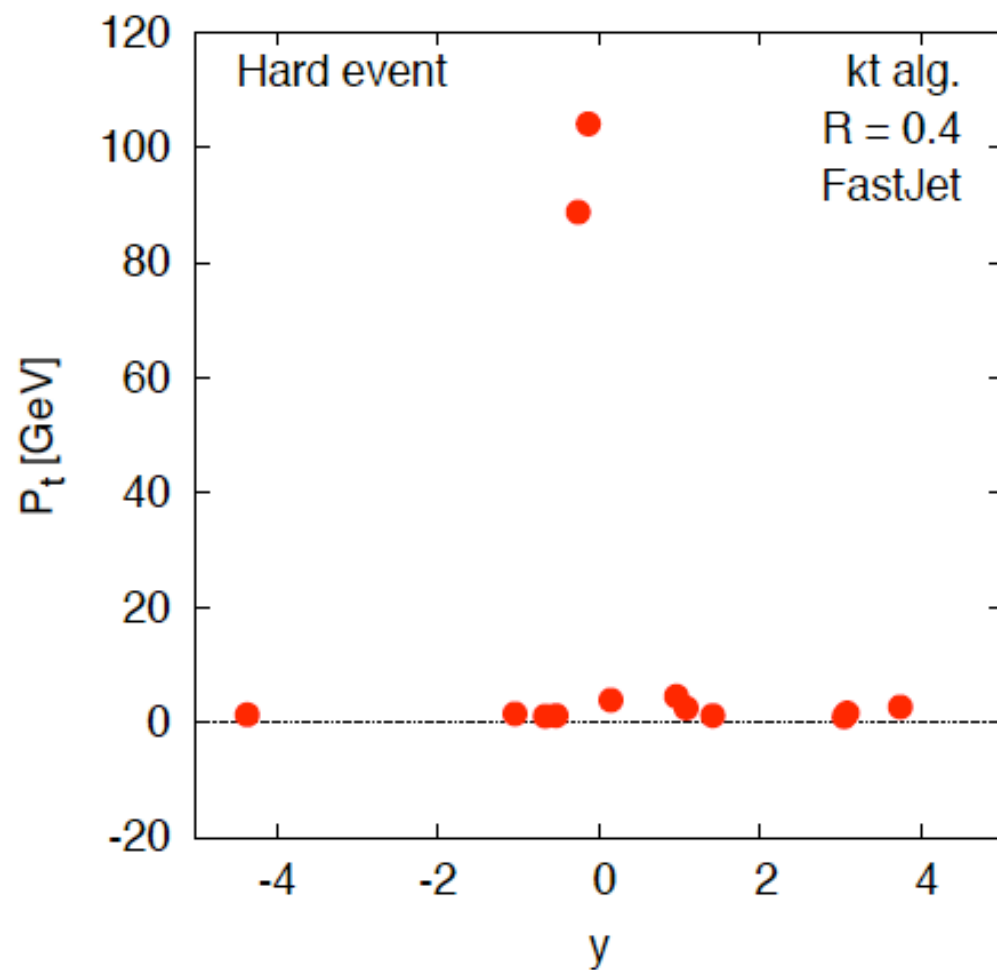
[NB: more general functional form needs investigating]

# Background subtraction in HI event



Subtract  $\rho(y)$  from  $P_t / \text{Area}$  for each jet

## Background subtraction in HI event

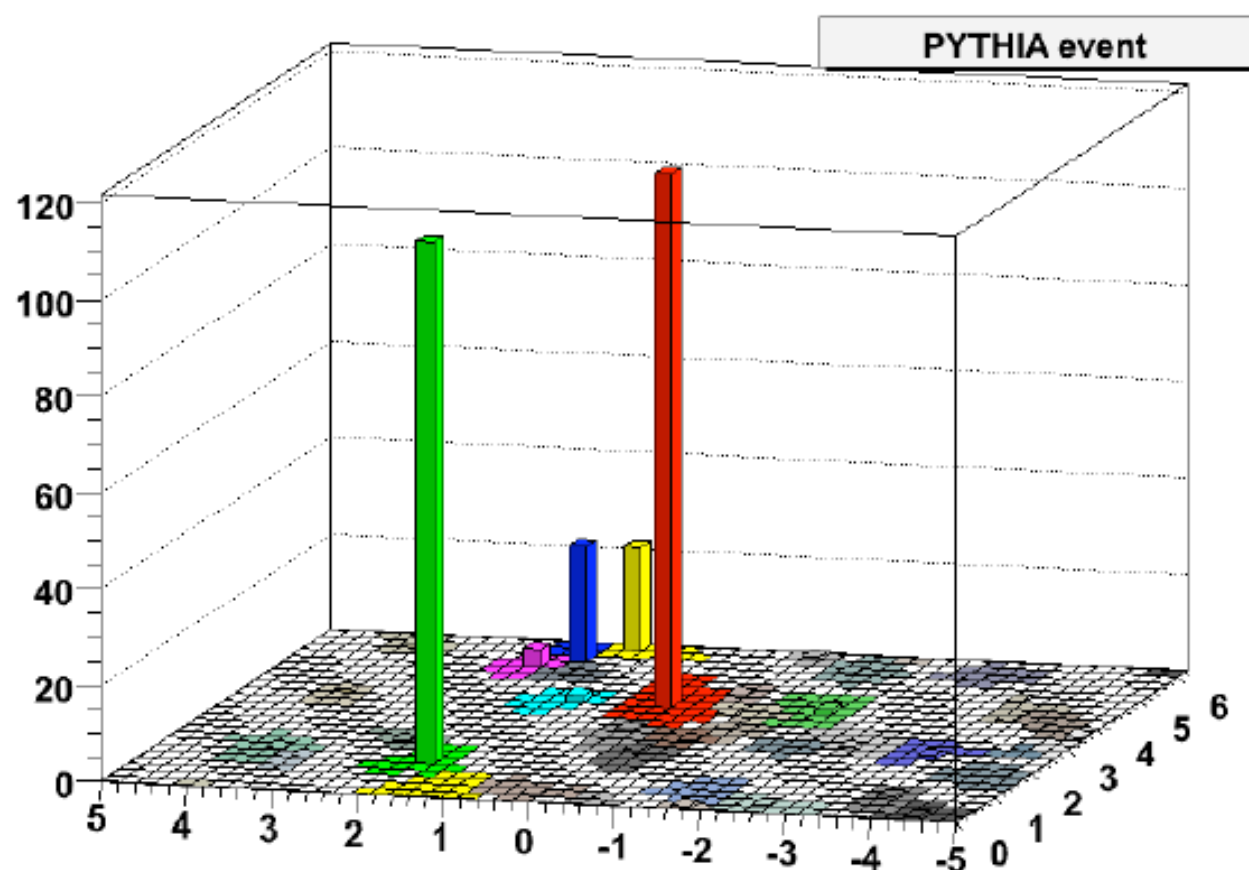


Look at resulting corrected  $P_t = P_{t,orig} - \rho(y) \times Area$

Hard jets with roughly correct  $P_t$  and  $y$  emerge clearly!

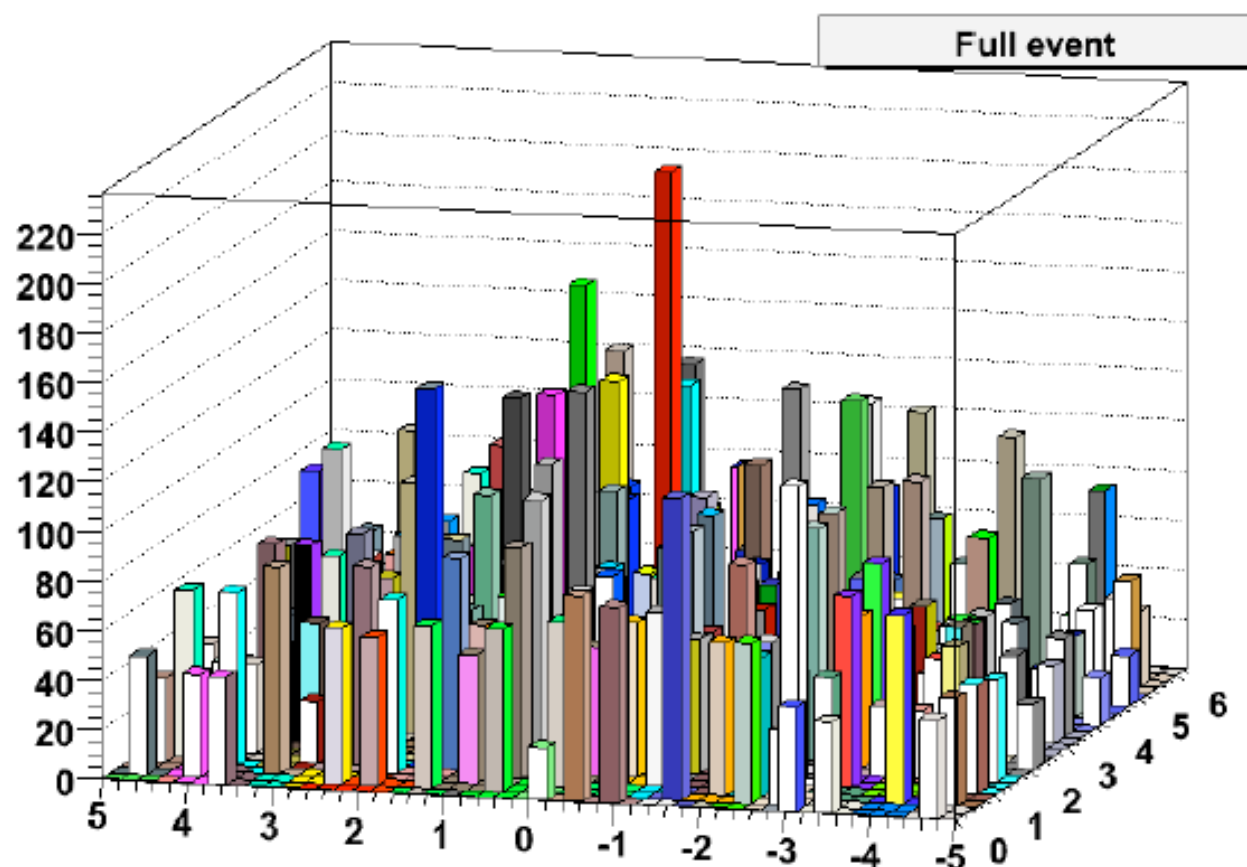


A **100 GeV** dijet PYTHIA event embedded in a HYDJET Pb-Pb one at the LHC



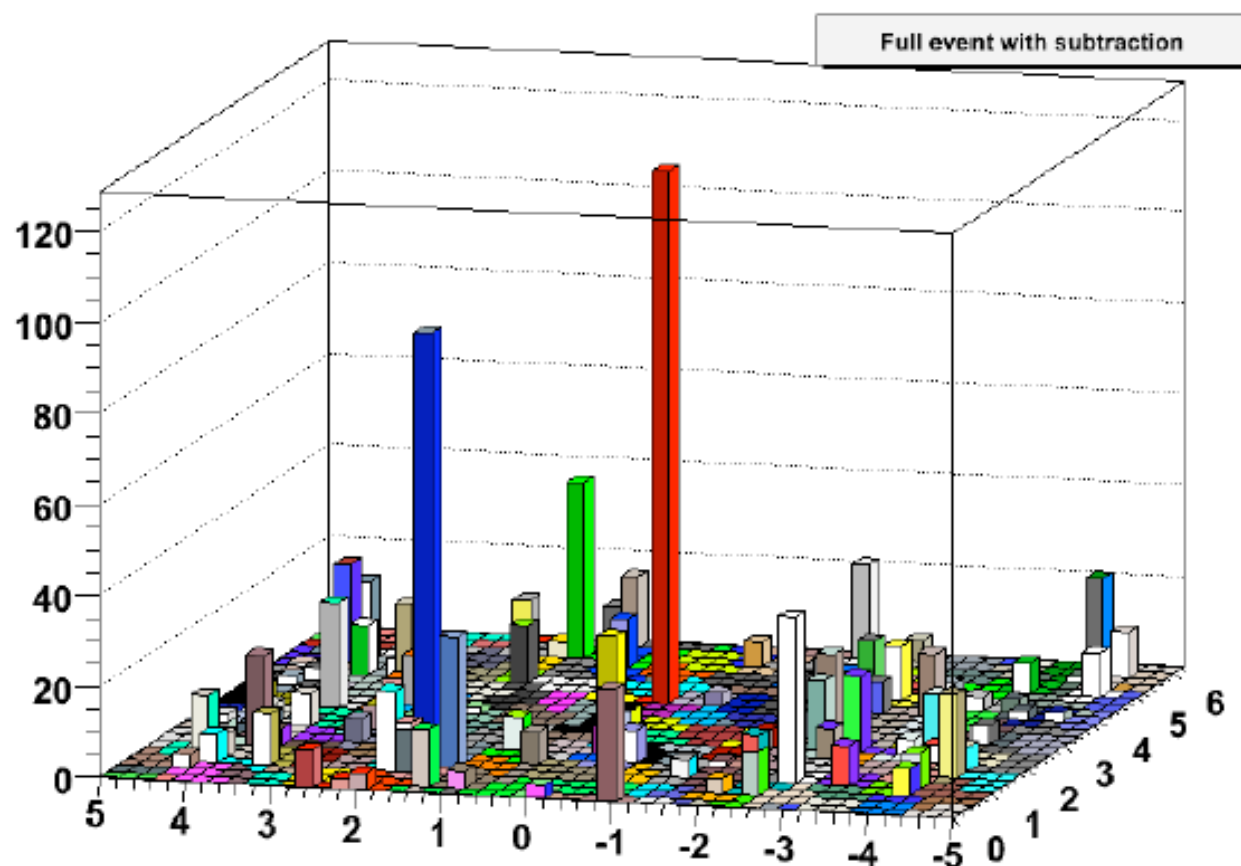
1. The  $pp$  hard event generated by PYTHIA only
2. The same event embedded in the whole Pb-Pb collisions
3. The result of the subtraction of the background

A **100 GeV** dijet PYTHIA event embedded in a HYDJET Pb-Pb one at the LHC



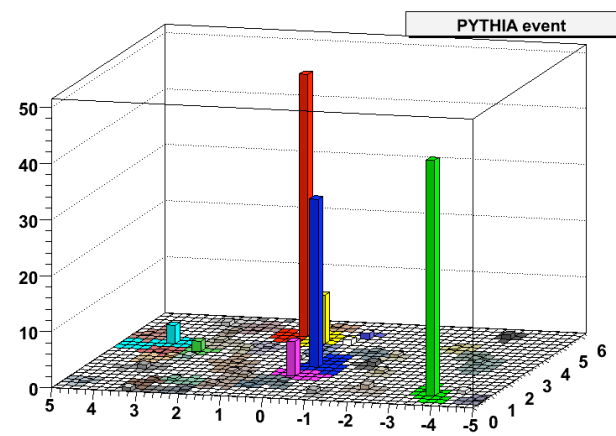
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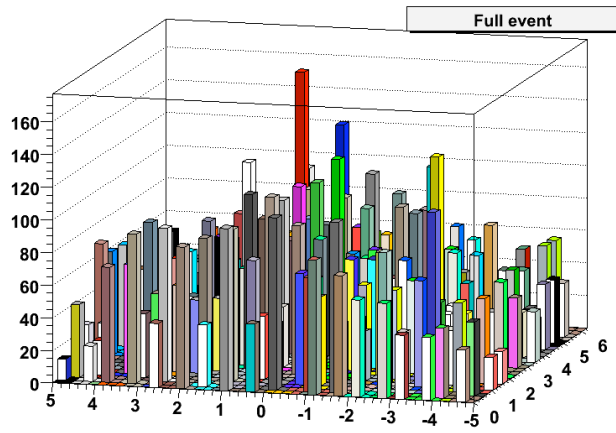
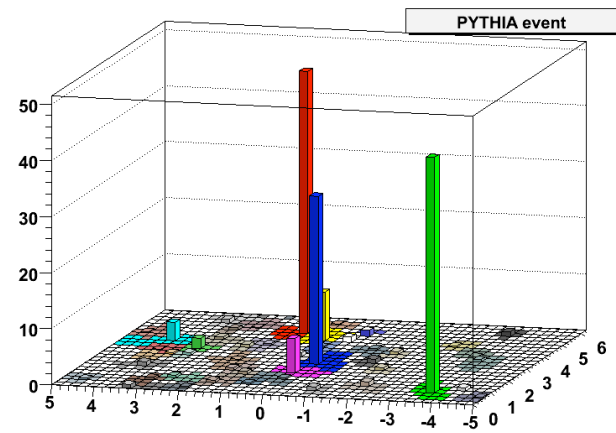
# 40 GeV jets



```
## hard event
# ijet rap phi Pt area
0 1.138 4.990 46.696 0.807
1 -3.693 0.982 41.947 0.813
2 -0.166 2.638 29.912 1.143
3 0.599 4.654 8.716 0.934
4 0.054 1.967 6.157 0.553
5 3.880 3.941 3.238 1.073
6 3.001 3.589 1.840 0.622
7 -0.256 5.169 1.126 0.413
```

```
## full event subtraction
```

# 40 GeV jets



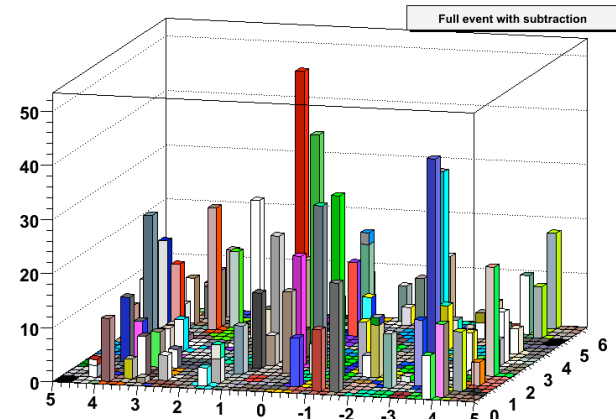
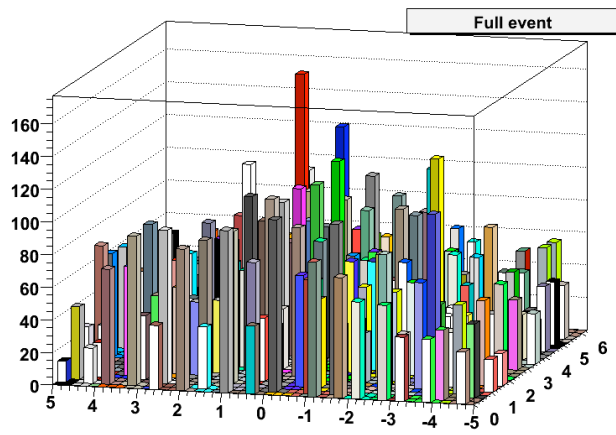
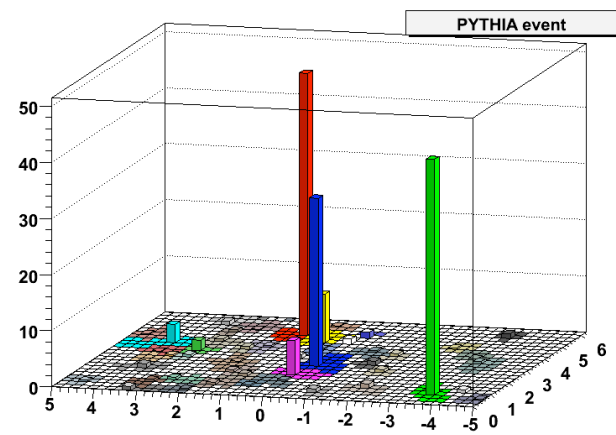
```
## hard event
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```

ijet	rap	phi	Pt	area
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7	-0.256	5.169	1.126	0.413

```
## full event subtraction
# ijet rap phi Pt area
```

ijet	rap	phi	Pt	area
0	1.094	4.945	160.668	0.521
1	-1.179	1.530	134.888	0.470
2	0.259	5.016	127.540	0.635
3	-2.602	3.506	123.007	0.635
4	0.081	2.138	111.034	0.406
5	-2.250	4.253	110.653	0.406
6	-0.156	2.741	109.869	0.305
7	-3.620	0.856	109.479	0.457
8	2.107	4.399	107.934	0.419
9	0.588	1.614	107.771	0.470
10	1.082	1.989	106.716	0.432
11	-0.165	0.441	105.569	0.495
12	-1.498	0.482	104.687	0.406
13	-0.489	4.917	100.438	0.406
14	0.949	0.054	99.661	0.445
15	0.649	2.721	98.143	0.343
16	1.406	5.541	95.984	0.457
17	2.521	0.778	93.890	0.483

# 40 GeV jets



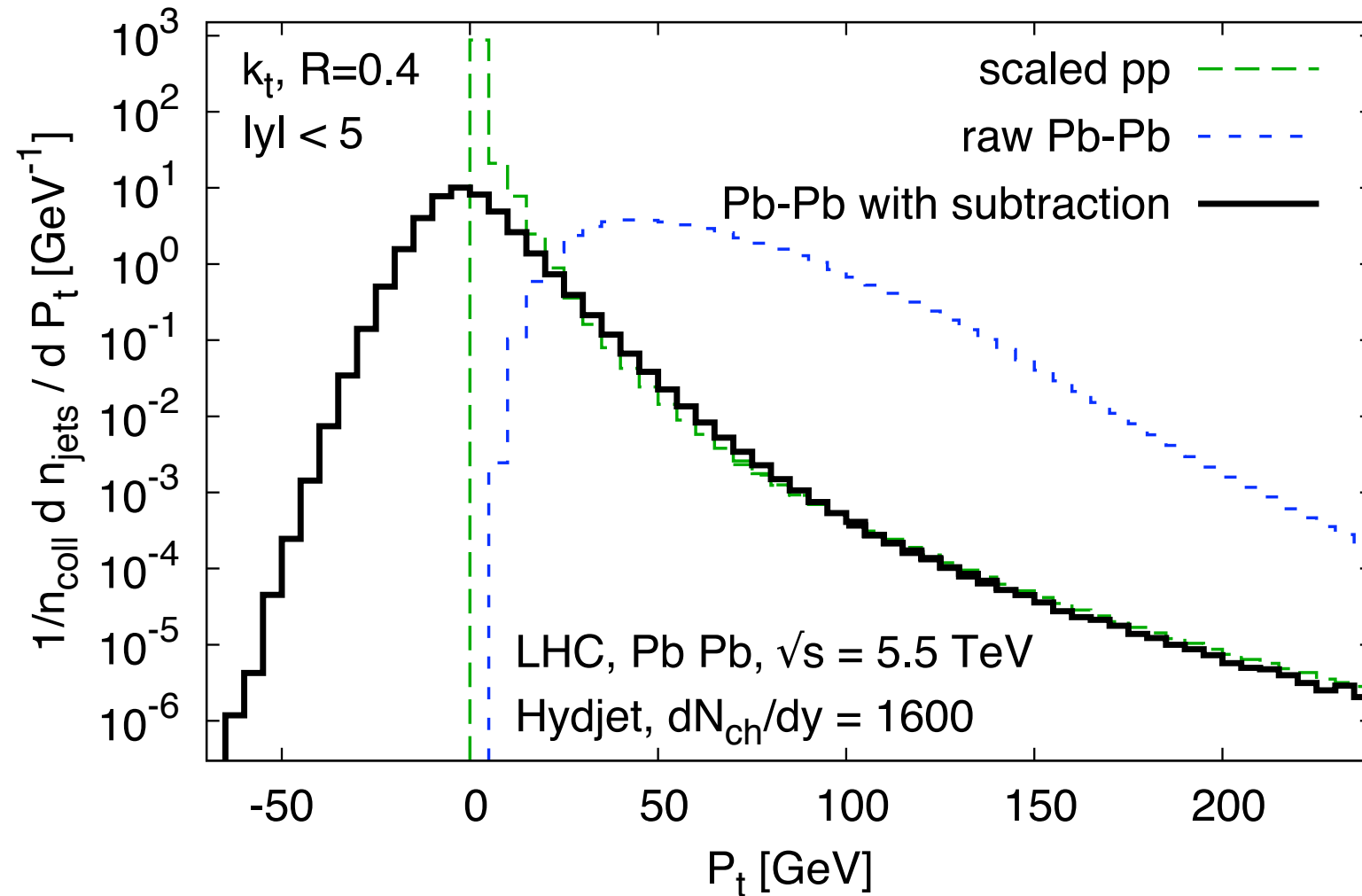
```

## hard event
# ijet rap phi Pt area
0 1.138 4.990 46.696 0.807
1 -3.693 0.982 41.947 0.813
2 -0.166 2.638 29.912 1.143
3 0.599 4.654 8.716 0.934
4 0.054 1.967 6.157 0.553
5 3.880 3.941 3.238 1.073
6 3.001 3.589 1.840 0.622
7 -0.256 5.169 1.126 0.413

## full event subtraction
# ijet rap phi Pt area Pt corr (rap corr phi corr Pt corr)ex
0 1.094 4.945 160.668 0.521 46.500 1.073 4.937 48.411
1 -1.179 1.530 134.888 0.470 32.942 -1.203 1.539 33.736
2 0.259 5.016 127.540 0.635 -35.530 100000.000 0.000 0.000
3 -2.602 3.506 123.007 0.635 4.407 -2.546 3.974 8.290
4 0.081 2.138 111.034 0.406 15.305 0.109 2.211 20.413
5 -2.250 4.253 110.653 0.406 35.719 -2.308 4.313 32.292
6 -0.156 2.741 109.869 0.305 41.579 -0.143 2.696 41.763
7 -3.620 0.856 109.479 0.457 41.551 -3.689 0.987 42.644
8 2.107 4.399 107.934 0.419 35.936 2.074 4.369 25.428
9 0.588 1.614 107.771 0.470 2.004 0.773 2.281 5.529
10 1.082 1.989 106.716 0.432 11.573 1.023 2.011 13.914
11 -0.165 0.441 105.569 0.495 -5.775 100000.000 0.000 0.000
12 -1.498 0.482 104.687 0.406 17.880 -1.463 0.427 20.104
13 -0.489 4.917 100.438 0.406 8.573 -0.276 5.166 10.850
14 0.949 0.054 99.661 0.445 1.044 0.685 5.813 4.184
15 0.649 2.721 98.143 0.343 23.174 0.664 2.617 23.367
16 1.406 5.541 95.984 0.457 -2.503 1.290 0.769 4.452
17 2.521 0.778 93.890 0.483 2.700 2.503 0.641 4.706
    
```

NB. Second and third hardest jets are down in 6th and 7th position in full event but they are recovered after subtraction

# Inclusive jets in PbPb at LHC



The scaled pp cross section is recovered after subtraction

**NB. No minimum pt cut**  
**No a posteriori Monte Carlo correction**

# Conclusions

- 'Proper' jet algorithms can (and probably should) be used in heavy ion collisions
- Given a proper jet algorithm, jet areas can be defined
- They can be used to **estimate** the level of a uniformly distributed soft background
- They can be used to **subtract** the background contribution from the hard jets