

## Lecture 1: jets

\* in these two lectures we study hadronic final states in terms of so-called jets

 lecturel: we'll discuss jet definitions: the focus will be on the theory and experimental motivations behind certain choices

\* lecture2: basics concepts of jet substructure and our first principle understanding

\* I have only 2 hours, so I had to compromise. Two big topics are missing: energy-correlators and machinelearning approaches. Ask me during recitation if you're interested!



## \* G. Salam: "Towards jetography"

# \* G. Soyez: "Pileup mitigation at the LHC: a theorist's view"

## \* SM, M. Spannowsky, G. Soyez, "Looking inside jets: an introduction to jet substructure and boosted-object phenomenology"

Lecture 1: jets

## inspire by Dave's lectures, let us start from perturbative QCD



\*  $pp \rightarrow Z(\rightarrow f\bar{f}) + X$ 

 key-process at the LHC: SM tests and background (e.g. monojets)

\* Can we characterise X?

## X at lowest order

we can employ perturbation theory: at O(α<sub>s</sub>), X
 is just a quark or a gluon



\* momentum conservation relates the kinematics of X to the Z one

## X beyond LO

real emission (2 partons)

\* at  $O(\alpha_s^2)$ , we have

virtual correction (1 parton)

### \* can we compute the cross section for Z+2 partons?



- \* ISR collinear singularities absorbed by PDFs
- \* FSR singularities should cancel against virtual corrections... but we don't have them!

 similarly, we cannot compute the cross section for Z+1 parton

## Jets come to rescue us

## \* pert. theory gives us a divergent result for Z+fixed number (n) of partons!

## \* we need to be more inclusive: Z+ n "objects"



## \* these objects are called jets



# jets for experimentalists

 high-energy collisions ofter results into collimated sprays of particles





# jets for experimentalists

 high-energy collisions ofter results into collimated sprays of particles

\* why?



gluon emission enhanced in the soft/ collinear limit  $\int \frac{dE}{E} \frac{d\theta}{\theta} \alpha_s \gg 1$ 







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\* how many
jets do you
see?

\* two is
 probably a
 good guess

\* eyeballing not good enough!





#### 2 clear jets



#### 2 clear jets









## \* Weneed a way to define jets in a given event



a jet algorithm + its parameters (e.g. R) + a recombination scheme = a jet definition

\* examples of recombination schemes:

\* E-scheme: sum all the four momenta

\* winner-take-all

# jet clustering algorithm

 an algorithm that maps the momenta of the final state particles into the momenta of a certain number of jets



# \* jet definitions must make sense for both theorists and experimentalists!

# what do theorists want?

- \* Infra-Red and Collinear Safety!
- \* An observable is IRC safe if, in the limit of a collinear splitting, or the emission of an infinitely soft particle, the observable remains unchanged: we need IRC safety if

 $O(X; p_1, \ldots, p_n, p_{n+1} \to 0) \to O(X; p_1, \ldots, p_n)$  we want to compute things bound in  $O(X; p_1, \ldots, p_n || p_{n+1}) \to O(X; p_1, \ldots, p_n + p_{n+1})$ 

## what do experimentalists want?

\* jet algorithms must be usable on real events

\* fast and easy to calibrate

# the Snowmass accord

- \* simple to implement in an experimental analysis;
- \* simple to implement in theoretical calculations;
- \* defined at any order of perturbation theory;
- yields finite cross-sections at any order of perturbation theory;
- \* yields cross-sections and distributions that are relatively insensitive to hadronisation

# types of algorithms

#### \* cone algorithms

- \* top-down approach: find coarse regions of energy flow.
- \* how? Find stable cones (i.e. their axis coincides with sum of momenta of particles in it)
- \* can be programmed to be fairly fast, at the price of being complex and IRC unsafe
- \* Examples: JetClu, MidPoint, ATLAS cone, CMS cone, SISCone ...

#### sequential recombination algorithms

- bottom-up approach: combine particles starting from closest ones
- how? Choose a distance measure, iterate recombination until few objects left, call them jets
- usually trivially made IRC safe, but their algorithmically complex (unless you're clever)
- Examples: Jade, k<sub>t</sub>, Cambridge/ Aachen, anti-k<sub>t</sub> ...

#### for a complete review see G. Salam, Towards jetography (2009)

# a bit of history

## \* first calculation done for cone algorithm

## \* two resolution parameters

To study jets, we consider the partial cross section.  $\sigma(E,\theta,\Omega,\varepsilon,\delta)$  for e<sup>+</sup>e<sup>-</sup> hadron production events, in which all but a fraction  $\varepsilon <<1$  of the total e<sup>+</sup>e<sup>-</sup> energy E is emitted within some pair of oppositely directed cones of half-angle  $\delta <<1$ , lying within two fixed cones of solid angle  $\Omega$  (with  $\pi\delta^2 <<\Omega <<1$ ) at an angle  $\theta$  to the e<sup>+</sup>e<sup>-</sup> beam line. We expect this to be measur-

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Sterman and Weinberg, Phys. Rev. Lett. 39, 1436 (1977):



\* let's start with the NLO 2-jet cross-section for a generic algorithm

 $\sigma_{2 \text{ jets}} = \left[ d\Phi_2(k_1, k_2) \mid \mathcal{M}_0 + \mathcal{M}_{1-\text{loop}} \mid^2 J_r(k_1, k_2) \right]$ 

+  $d\Phi_3(k_1, k_2, k_3) | \mathcal{M}_{real} |^2 J_r(k_1, k_2, k_3)$ 

#### \* and separate out the divergent (IRC) from the finite (hard)

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+ 
$$d\Phi_2(k_1, k_2) \left[ 2 \operatorname{Re} \mathcal{M}_0^* \mathcal{M}_{1-\operatorname{loop}}^{\operatorname{IRC}} J_r(k_1, k_2) + d\Phi_1(k_3) | \mathcal{M}_{\operatorname{real}}^{\operatorname{IRC}} |^2 J_r(k_1, k_2, k_3) \right]$$

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IRC safety of Sterman-Weinberg jets \* let's go back to cone jets, at NLO we have  $J_{\varepsilon,\delta}(k_1,k_2) = 1$  $J_{\varepsilon,\delta}(k_1, k_2, k_3) = \Theta\left(\min(\theta_{12}, \theta_{13}, \theta_{23}) < \delta\right)$  $+\Theta\left(\min(\theta_{12},\theta_{13},\theta_{23})>\delta\right)\Theta\left(\min(E_1,E_2,E_3)<\varepsilon\right)$ \* it is straightforward to check that in any soft and/or collinear limit:  $J_{\varepsilon,\delta}(k_1,k_2,k_3) \rightarrow 1$ 

- \* start with a list of particles,
- \* compute all distances dij and dib
- find the minimum of all dij and dib

d<sub>ij</sub> (weighted) distance between i j d<sub>ib</sub> external parameter or distance from the beam ...

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- \* start with a list of particles,
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d<sub>ij</sub> (weighted) distance between i j d<sub>i</sub>b external parameter or distance from the beam ...

 otherwise call i a final-state jet, remove it from the list and iterate

# speeding-up the algorithms

- \* from combinatorics sequential recombination should scale like N<sup>3</sup>
- \* an approach based on geometry (Voronoi diagrams) leads to notable improvements
- Sequential recombination algorithms could be implemented with O(N<sup>2</sup>) or even O(NInN) complexity rather than O(N<sup>3</sup>)
   Cacciari, Salam, 2006
- Cone algorithms could be implemented exactly (and therefore made IRC safe) with O(N<sup>2</sup>InN) rather than O(N 2<sup>N</sup>) complexity Salam, Soyez, 2007

method implemented

in FastJet



# JAPE and kt algorithm

## \* actual choice of dij determines the algorithm

$$d_{ij} = (p_i + p_j)^2 = 2E_i E_j (1 - \cos \theta_{ij})$$
$$d_{iB} = y_{\text{cut}}$$

$$l_{ij} = \min(E_i^2, E_j^2)(1 - \cos\theta_{ij})$$

both algorithms for e+e- collisions
k<sub>t</sub> algorithm theory friendly

 $d_{iB} = y_{\rm cut}$ 

JADE

V



- generic issue: problems when the resolution parameter becomes smaller as real radiation is constrained to a small (Born-like) region of phase space
- singularities still avoided but finite parts can become large (typically large logs of y<sub>cut</sub>)
- All-order calculations in QCD are necessary to resum these large contributions: active area of research, many theses available!
- See A. Larkoski: An unorthodox introduction to QCD



# the kt algorithm the kt distance is the inverse of the QCD splitting probability

 $\frac{dP_{k\to ij}}{dE_i d\theta_{ij}} \sim \frac{\alpha_s}{\min(E_i, E_j)\theta_{ij}}$ 

- \* the algorithm roughly inverts the QCD shower, bringing us back to the hard scattering
- \* the clustering history has physical meaning
- \* jets grow around soft particles, which is a problem in a noisy environment as the LHC

# the generalised kt family

\* actual choice of dij determines the algorithm

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

IKC behaviour

 $\begin{array}{l} \textbf{p} = 1 & k_t \ algorithm \\ \textbf{s. Catani, Y. Dokshitzer, M. Seymour and B. Webber, Nucl. Phys. B406 (1993) 187 \\ \textbf{s. D. Ellis and D.E. Soper, Phys. Rev. D48 (1993) 3160 \\ \textbf{new soft particle (pt $\rightarrow$ 0) means that $d $\rightarrow$ 0 $\Rightarrow$ clustered first, no effect on jets \\ \end{array}$ 

new collinear particle ( $\Delta y^2 + \Delta \Phi^2 \rightarrow 0$ ) means that  $d \rightarrow 0 \Rightarrow$  clustered first, no effect on jets

#### **p=0** Cambridge/Aachen algorithm Y. Dokshitzer, G. Leder, S. Moretti and B. Webber, JHEP 08 (1997) 001 M. Wobisch and T. Wengler, hep-ph/9907280

new soft particle ( $p_t \rightarrow 0$ ) can be new jet of zero momentum  $\Rightarrow$  no effect on hard jets new collinear particle ( $\Delta y^{2} + \Delta \Phi^{2} \rightarrow 0$ ) means that  $d \rightarrow 0 \Rightarrow$  clustered first, no effect on jets

#### p = -1 anti- $k_t$ algorithm

M. Cacciari, G. Salam and G. Soyez, arXiv:0802.1189

new soft particle ( $p_t \rightarrow 0$ ) means d  $\rightarrow \infty \Rightarrow$  clustered last or new zero-jet, no effect on hard jets

new collinear particle ( $\Delta y^2 + \Delta \Phi^2 \rightarrow 0$ ) means that  $d \rightarrow 0 \Rightarrow$  clustered first, no effect on jets

# the anti-k+ algorithm

- \* with this measure soft particles are always far away
- \* jets grow around hard cores
- if no other hard particles are around the algorithm provides (ironically) perfect cones
- however, the clustering history carries little physics (re-clustering)

# comparing them all





# a useful cartoon

jet



## a useful cartoon

jet

underlying event. (multiple parton interactions) hadronisation

pert. radiation (parton branching)

# a useful cartoon

jet

underlying event (multiple parton interactions)

### hadronisation

pert. radiation (parton branching)

### pile-up (multiple proton interactions)

# estimating pr shifts

\* we can use soft emission kinematics to estimate the changes in pt from the hard parton to the measured quantities

\* assume a finite coupling in the IR

#### **PT** radiation:

$$q: \langle \Delta p_t \rangle \simeq \frac{\alpha_s C_F}{\pi} p_t \ln R$$

## **<u>Hadronisation</u>**: $q: \langle \Delta p_t \rangle \simeq -\frac{C_F}{R} \cdot 0.4 \text{ GeV}$

# $\frac{\text{Underlying event:}}{q,g: \langle \Delta p_t \rangle \simeq \frac{R^2}{2} \cdot 2.5 - 15 \text{ Ge} /$

Pasgupta, Magnea, Salam (2007)

# pile-up

- pile-up can deposit several tens of GeV (or even hundreds, in a heavy ion collision) into a mediumsized jet
- \* it's a direct consequence of the desired high luminosity
- it hampers how ability of extracting useful information about the hard scatters



a 78-vertices event from CMS

# hard jets and pile-up

- susceptibility measures how much background is picked up (jet area)
- resiliency measures how much the original jet is modified (backreaction)



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# hard jets and pile-up

 susceptibility measures how much background is picked up (jet area)

 resiliency measures how much the original jet is modified (backreaction)

 $\Delta p_t = \rho A \pm \left(\sigma \sqrt{A} + \sigma_\rho A + \rho \sqrt{\langle A^2 \rangle - \langle A \rangle^2}\right) + \Delta p_t^{BR}$ 

background momentum density (per unit area)

background 'susceptibility' backreaction 'resiliency'

# resiliency



- anti-k<sub>t</sub> jets are much more resilient to changes from background immersion
- \* their regular shape makes them easier to correct for detector effects

### \* default choice for LHC collaborations

# mitigating pile-up

#### \* Jet-based

- \* Cluster the full event, determine the event-specific (p) and jet-specific (A) quantities, and subtract the relevant contamination from a given observable
- \* Pros: largely unbiased subtraction
- \* Cons: slow, potentially large(er) residual uncertainty
- \* Examples: `jet area/median' in FastJet, GenericSubtractor for jet shapes, JetFFMoments for fragmentation functions, ....

#### \* Particle-based

- Produce a reduced event, by dropping some of the particles. Cluster this reduced event, and calculate from it the observables
- \* Pros: fast, often small(er) residual uncertainty
- \* Cons: not natively unbiased, can depend on choice of parameters
- \* Examples: ConstituentSubtractor, SoftKiller, PUPPI, ....

for a complete review see G. Soyez, "Pile-up mitigation at the LHC: a theorist's view (2018)

# summary of lecture 1

## \* jets to rescue perturbation theory

## \* jet definitions

## \* resilience against non-perturbative effects

# homework 1

\* which of the following observables are IRC safe (assuming the jet has been selected in an IRC safe fashion)?

\* the jet invariant mass

\* the invariant mass of tracks in a jet

\* generalised angularities (assume κ, β>0)

 $\lambda_{\kappa,\beta} = \sum_{i \in iet} \left(\frac{p_{Ti}}{p_T}\right)^{\kappa} \theta_i^{\beta}$ 



- show that for an event made up of two particles all gen. k<sub>t</sub> algorithms recombine them is their azimuth-rapidity distance is less than R
- \* things dramatically changes with many particles!