## A

Global Jet Finding Algorithm

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arxiv: I4 I I. 3705 and work in progress

## Outline

- Motivation: physics beyond the Standard Model
- Review of jet finding algorithms
- Introduction of a global definition
- Application to QCD-like jets
- Extension to boosted two-prong jets
- Conclusion


## What is a jet?

An ensemble of particles in detectors can be called a jet


Jet-finding algorithm: how to group particles together?

## Jets in BSM

- Mono-jet plus MET events as the dark matter signature

- Multi-jets plus MET for RPC SUSY or without MET for RPV SUSY



## Fat-jet object

Search for a few TeV resonance decaying into $\mathrm{t}, \mathrm{W}, \mathrm{Z}, \mathrm{h} \ldots$

- Boosted top quark,W/Z, Higgs ......


$$
p_{T}(W) \gg M_{W}
$$

## Jet substructure

A jet may not be just a parton and it could have an internal structure

Many new objects: (incomplete list)

- ...; Butterworth, Cox, Forshaw,WW scattering, hep-ph/020I098
- Butterworth, Davison, Rubin, Salam, boosted Higgs, 0802.2470
- Thaler and Wang, boosted top, 0806.0023
- Kaplan, Rehermann, Schwartz, Tweedie, boosted top, 0806.0848
- Almeida, Lee, Perez, Sterman, Sung, boosted top, 0807.0234;...


## Many new variables or procedures:

- mass drop, N -subjettiness, pull, dipolarity, without trees, ...
- Jet grooming: filtering, trimming, pruning ...


## Jet substructure: an example

Boosted Higgs for measuring the $h \rightarrow b \bar{b}$ decay
Two steps:
(I) start from a jet-finding algorithm (C/A) to cover a wider area
(2) mass-drop: (the QCD quark is massless) some subset of particles inside a Higgs-jet can have a much smaller mass.
Filter: (reduce underlying events) introduce a finer angular scale


## Our motivation

Can we combine this two-step procedure into a single one?

- Hope: keep more hard process information and less underlying event contamination
- Method: define a new jet-finding algorithm suitable for a boosted heavy object

To proceed, let's start with traditional jet-finding algorithms for QCD jets

## A brief review of jet-finding algorithms

$\star$ Cone algorithm

- Started by Sterman and Weinberg in 70's
- CDF SearchCone, Mid point, SISCone ...
- Used at UAI, Tevatron
$\star$ Sequential recombination algorithm
- Started by the JADE collaboration in 80's
- $k_{t}$, Cambridge/Aachen, anti- $k_{t}$
- Extensively used at the LHC


## Cone algorithm

Iterative process:

- choose particle with highest transverse momentum as the seed particle
- draw a cone of radius R around the seed particle
- sum the momenta of all particles in the cone as the jet axis
- if the jet axis does not agree with the original one, continue; otherwise find a stable cone and stop


Colinear safety?

## SISCone

(split-merge)

## Anti- $k_{t}$ algorithm

$$
d_{i j}=\min \left(p_{t i}^{-2}, p_{t j}^{-2}\right) \frac{\Delta R_{i j}^{2}}{R^{2}} \quad d_{i B}=p_{t i}^{-2} \quad \Delta R_{i j}^{2}=\left(y_{i}-y_{j}\right)^{2}+\left(\phi_{i}-\phi_{j}\right)^{2}
$$

Iterative process:

- Find the minimum of the $d_{i j}$ and $d_{i B}$
- If it is a $d_{i j}$, recombine i and j into a single new particle, and repeat
- otherwise, if it is a $d_{i B}$, declare ito be a jet, and remove it from the list of particles
- stop when no particles remain

Infrared and collinear safe!

## Behaviors of different algorithms




Salam, 0906.I833

## Quantify the goodness of algorithms

## Back-reaction: how much adding soft background particles changes the original particles in a jet



## Can one has a more intuitive way to define a jet-finding algorithm?

events with
N particles


a jet with subset particles

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Look for a simple jet definition function

## Start with a QCD jet

$\star$ QCD partons are massless
$\star$ The jet function should

- prefer increasing jet energy
- disfavor increasing jet mass


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\begin{equation*}
J\left(P^{\mu}\right)=E-\beta \frac{m^{2}}{E} \tag{H.Georgi,I408.II6I}
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## Start with a QCD jet

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For N particles and $2^{N}$ possibilities, find the one maximizing this jet function. One does this iteratively to find all jets in one event.

## Special cases

$$
\begin{aligned}
& J\left(P^{\mu}\right)=E-\beta \frac{m^{2}}{E} \\
& \cdot \beta=0: J=E \\
& \text { include all particles in one jet }
\end{aligned}
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include all particles in one jet

$$
\text { - } \beta=1: J=|\vec{P}|
$$

hemisphere way for two jets


## General cases

* A group of particles will have a boost factor from its rest frame and has a jet function bigger than a soft particle

$$
\begin{gathered}
J=\frac{\left(E^{2}-\beta m^{2}\right)}{E}=\left(\gamma^{2}-\beta\right) \frac{m^{2}}{E} \geq 0 \\
\gamma \geq \sqrt{\beta}
\end{gathered}
$$

$\star$ Relativistic beaming effect

$\star$ The particles are inside a jet cone
A larger value of $\beta$ means a smaller cone size

## Extension to hadron colliders

$\star$ The center-of-mass frame is likely to be highly boosted in the beam direction
$\star$ The simplest way to extend the jet definition is

$$
J_{E_{T}}\left(P_{J}^{\mu}\right) \equiv E_{T}-\beta \frac{m^{2}}{E_{T}}
$$

$\star$ One could also try other powers

$$
J_{E_{T}}\left(P_{J}^{\mu}\right) \equiv E_{T}^{\alpha}\left(1-\beta \frac{m^{2}}{E_{T}^{2}}\right)
$$

$\star$ Does this new function has a similar cone geometry?

## Try an "easier" function

$\star$ For $\alpha=2$,

$$
J_{E_{T}^{2}}=E_{T}^{2}-\beta m^{2}=E^{2}-P_{z}^{2}-\beta m^{2}
$$

$\star$ Requiring $J_{E_{T}^{2}}\left(P_{J}^{\mu}\right)>J_{E_{T}^{2}}\left(P_{J}^{\mu}-p_{j}^{\mu}\right)$, the boundary satisfies

$$
\frac{1}{|p||P|}\left(P_{x} p_{x}+P_{y} p_{y}+\left(1-\frac{1}{\beta}\right) P_{z} p_{z}\right)=\frac{1}{v}\left(1-\frac{1}{\beta}\right)
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$$

$$
\left\{\begin{array}{l}
p_{x}^{2}+p_{y}^{2}+p_{z}^{2}=C_{1}(P) \\
\left(p_{x}-P_{x}\right)^{2}+\left(p_{y}-P_{y}\right)^{2}+\left(p_{z}-\left(1-\frac{1}{\beta}\right) P_{z}\right)^{2}=C_{2}(P)
\end{array}\right.
$$


$\star$ Can be interpreted as intersection of two spheres

## Still a cone jet

$\star$ For a general $\alpha$, the boundary is

$$
\frac{1}{|p \| P|}\left(P_{x} p_{x}+P_{y} p_{y}+\kappa P_{z} p_{z}\right)=\frac{\kappa}{v} \quad \kappa=1-\frac{\alpha}{2 \beta}+\frac{\alpha-2}{2} \frac{m^{2}}{E_{T}^{2}}
$$

the center is shifted from the jet momentum towards the central region

$$
\vec{P}_{c}=\frac{1}{\sqrt{1-\left(1-\kappa^{2}\right) \hat{P}_{J}^{z}}}\left(\hat{P}_{J}^{\hat{p}}, \hat{P}_{J}^{y}, \kappa \hat{P}_{J}^{z}\right) \quad \kappa<1
$$

particles belong to the jet is within a cone from the center

$$
z_{c} \geq \frac{\kappa}{v_{J} \sqrt{1-\left(1-\kappa^{2}\right) \cos ^{2} \theta_{J}}}
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$\star$ The beam direction always stays away from the jet and does not need any special treatment

## Cone identification



physical boundary

## Cone identification



physical
boundary
one can use three particles to identify a cone

## Alternative boundaries



## Numerical implementation

$\star$ In general, we need to check all $2^{N}$ possible subsets of particles for a general function, which is not possible
$\star$ Knowing the geometrical shape of jets, one only need to check all possible cones and choose the one maximizing the jet function - "global"
$\star$ For each particle, one can also determine its fiducial region such that one only needs to check " $n \ll N$ " nearby particles as a neighbor
$\star$ For each particle, the physically distinct cones is $O\left(n^{3}\right)$ , the total operation time is $O\left(N n^{3}\right)$
https://github.com/LHCJet/JET

## Comparison: shape

$J_{E_{T}} \quad$ with $\beta=1.4$

anti- $k_{T} \quad$ with $R=1.0$


## Comparison: size


match anti-kt results very well for a QCD jet

## Comparison: back-reaction


again, similar to the anti-kt results

## Comparison: dijet Z' mass


again, similar to the anti-kt results

## A naive comparison for $W$-jet


our jet-finding algorithm is designed for QCD jets so far

## Design a W-jet-finding function



- A boosted $W$-jet contains a two-prong structure
- Need to incorporate a jet shape in the function
- The existing part of $J_{E_{T}}$ may be kept


## Design a W-jet-finding function

$$
J_{E_{T}}^{W}\left(P_{J}^{\mu}\right)=E_{T}^{\alpha}\left[1-\beta \frac{m^{2}}{E_{T}^{2}}+\gamma \bar{H}_{2, J}\right]
$$

- The new function need to prefer two-prong


## Design a W-jet-finding function

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- The new function need to prefer two-prong
- try the jet energy correlation functions:

$$
\sum_{i \neq k} \frac{\left|\vec{p}_{i}\right|\left|\vec{p}_{k}\right|}{E_{J}^{2}}\left|\sin \varphi_{i k}\right|^{a}\left(1-\left|\cos \varphi_{i k}\right|\right)^{1-a}
$$

$$
\operatorname{ECF}(N, \beta)=\sum_{i_{1}<i_{2}<\ldots<i_{N} \in J}\left(\prod_{a=1}^{N} p_{T i_{a}}\right)\left(\prod_{b=1}^{N-1} \prod_{c=b+1}^{N} R_{i_{b} i_{c}}\right)^{\beta} \quad \text { Larkoski, Salam, Thaler, }
$$

## A working function

$$
\bar{H}_{2, J} \equiv \frac{H_{2, J}}{E_{T}^{2}}=\frac{1}{E_{T}^{2}} \sum_{i, k} \frac{\left[m_{J}^{2} p_{i} \cdot p_{k}-\left(P_{J} \cdot p_{i}\right)\left(P_{J} \cdot p_{k}\right)\right]^{2}}{m_{J}^{2}\left(P_{J} \cdot p_{i}\right)\left(P_{J} \cdot p_{k}\right)}
$$

- It is Lorentz invariant except the overall factor
- It becomes transparent in the jet rest frame

$$
\bar{H}_{2, J}=\left(\sum_{i, k} \frac{\left|\vec{p}_{i}\right|\left|\vec{p}_{k}\right|}{E_{T}^{2}} \cos ^{2} \varphi_{i k}\right)_{\text {rest }}=\left(\sum_{i, k} \frac{\left(\vec{p}_{p} \cdot \vec{p}_{k}\right)^{2}}{E_{T}^{2}\left|\overrightarrow{p_{i}}\right|\left|\vec{p}_{k}\right|}\right)_{\text {rest }}
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- One can easily show that this function reaches its maximum for a two-prong structure


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$$

- One can easily show that this function reaches its maximum for a two-prong structure
- The function in rest frame is the Fox-Wolfram moment, introduced as an event shape at lepton colliders


## Double-cone shape

$$
J_{E_{T}}^{W}\left(P_{J}^{\mu}\right)=E_{T}^{\alpha}\left[1-\beta \frac{m^{2}}{E_{T}^{2}}+\gamma \bar{H}_{2, J}\right]
$$

in the rest frame

in the lab frame


- a double-cone structure with the subjet size determined dynamically


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in the rest frame

in the lab frame


- a double-cone structure with the subjet size determined dynamically
- $1 / \sqrt{\beta}$ controls the subjet size and $1 /(\beta-\gamma)$ controls the fat jet size


## $J_{E_{T}^{2}}^{W}$ results


pruning jet: S. Ellis, Vermilion,Walsh; 09|2.0033
no pile-up included yet

## Variables used in CMS



CMS; I4I0.4227

N-subjettiness:Thaler and Tilburg; IO | I. 2268
Q-jets: Ellis, Hornig, Roy, Krohn, Schwartz; I201.I914

## Performance w. Jet-sub. Variables



A better jet-finding algorithm makes some improvement

## Byproduct: A New Event Shape Variable



## Conclusions

* A global jet-finding algorithm for maximizing a jet function works for a QCD jet
* Our preliminary results show that our W-jet function can tag a $W$-jet very well
$\star$ We are finalizing the numerical code with a trade-off between finding a global maximum and running speed
$\star$ Other jet functions to tag top quark, black-hole multijets and new conformal gauge sector signatures are also interesting to explore


## Thanks

## Real proof for a cone jet

$\star$ Check the angular distance of a soft particle from the jet momentum

$$
z=\cos \theta=\frac{p_{x} P_{x}+p_{y} P_{y}+p_{z} P_{z}}{|p||P|}
$$

$\star$ For a soft particle $j$ belongs to the jet:

$$
\begin{aligned}
& J(P)>J\left(P-p_{j}\right) \\
& 1-\beta\left(1-v_{\alpha}^{2}\right)>1-r_{j}-\beta \frac{1-v_{\alpha}^{2}-2 r_{j}\left(1-z v_{\alpha}\right)}{1-r_{j}} \\
& z>\frac{\beta\left(1+v_{\alpha}^{2}\right)-\left(1-r_{j}\right)}{2 \beta v_{\alpha}}>\frac{\beta\left(1+v_{\alpha}^{2}\right)-1}{2 \beta v_{\alpha}}=\frac{1}{v_{\alpha}}\left(1-\frac{1}{2 \beta}\left(1+\beta \frac{m^{2}}{E^{2}}\right)\right)
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$$

$\star$ For a soft particle $k$ not belongs to the jet:

$$
z<\frac{\beta\left(1+v_{\alpha}^{2}\right)-\left(1+r_{k}\right)}{2 \beta v_{\alpha}}<\frac{\beta\left(1+v_{\alpha}^{2}\right)-1}{2 \beta v_{\alpha}}=\frac{1}{v_{\alpha}}\left(1-\frac{1}{2 \beta}\left(1+\beta \frac{m^{2}}{E^{2}}\right)\right)
$$

$\star$ So, a cone-like boundary for individual jets
$\star$ Soft particles are on the boundary; very IR safe

