Jet clustering tools

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Concentrating mostly on FastJet, developped with Matteo Cacciari and Gregory Soyez



A jet definition is a systematic procedure that **projects away the multiparticle dynamics**, so as to leave a simple picture of what happened in an event:



Jets are *as close as we can get to a physical single hard quark or gluon:* with good definitions their properties (multiplicity, energies, [flavour]) are

- finite at any order of perturbation theory
- \blacktriangleright insensitive to the parton \rightarrow hadron transition

NB: finiteness \longleftrightarrow set of jets depends on jet def.



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Les Houches 2007 proceedings, arXiv:0803.0678



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



Jet (definitions) provide central link between expt., "theory" and theory And jets are an input to almost all analyses Jets (p. 4)

QCD jets flowchart



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Public jet codes

In rough order of first public release:

- KTCLUS (Fortran)
- ARCLUS (Fortran)
- PxCone (Fortran)
- ► KTJet (C++)
- Optimal Jet Finder [OJF] (Fortran)
- ► FastJet + plugins (C++)
- ▶ CDF MidPoint and JetClu codes (C++)
- ► SpartyJet (C++)
- ► FFTJet (C++)

Also: jet finders in non-jet tools: simple cone jet finders in Pythia, Isajet, Alpgen, PGS, AcerDet, ...; k_t and seedless/midpoint cones in MCFM, NLOJet++, etc.

FastJet http://fastjet.fr/

Jan 2006 (FJ 1.0):

Fast implementation of pp k_t algorithm N² and N ln N timings for clustering N particles v. N³ with earlier codes N ln N strategy relies on external package CGAL

Oct 2006 (FJ 2.0):

Implementation of Cambridge/Aachen algorithm

including coding of Chan's Closest Pair algorithm

- Introduction of jet areas and background estimation/subtraction
- New interface for long-term stability

Apr 2007 (FJ 2.1):

- Plugin mechanism giving common interface to external jet finders
- Inclusion of plugins that wrap CDF (JetClu, Midpoint) code and PxCone
- Inclusion of SISCone as a plugin



Jan 2008 (FJ 2.3):

Soyez joined development team

- Added the anti-k_t algorithm (fast, native implementation)
- Added "passive" and "Voronoi" areas
- Switched to autotools for compilation/installation
- Better access to information for subjet studies
- Basic Fortran wrapper

April 2009 (FJ 2.4):

- Added plugins for DØRunIICone, ATLAS cone, CMS cone, TrackJet
 DØ and Trackjet code contributed by Sonnenschein ATLAS code taken from SpartyJet
- Added gen- $k_t + e^+e^-$ algorithms (k_t , Cambridge, Jade, e^+e^- anti- k_t)
- Framework for handling user-supplied clustering distances (NNH)



Native implementations:

- Iongitudinally invariant kt
- ► (inclusive) Cambridge/Aachen
- anti-kt
- ► gen-kt
- ▶ e⁺e⁻ kt and gen-kt

Plugins (distributed with FastJet)

- ► SISCone
- ► CDF MidPoint [IR₃₊₁ unsafe]
- ► CDF JetClu [IR₂₊₁ unsafe]
- D0 Run II Cone [IR₃₊₁ unsafe]
- ► ATLAS Cone algorithm [IR2+1 unsafe]
- CMS Cone algorithm [Coll₃₊₁ unsafe]
- ► TrackJet [Coll₃₊₁ unsafe]
- ▶ PxCone (fortran 77) [IR₃₊₁ unsafe]
- ▶ e^+e^- (spherical) SISCone
- ▶ e^+e^- JADE algorithm
- ▶ e^+e^- Cambridge algorithm



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Speeds in 2005







Jets (p. 11)

FastJet

$$k_t: d_{ij} = \min(k_{ti}^2, k_{tj}^2) \Delta R_{ij}^2 \longrightarrow \operatorname{anti-k_t}: d_{ij} = \frac{\Delta R_{ij}^2}{\max(k_{ti}^2, k_{tj}^2)}$$

Hard stuff clusters with nearest neighbour Privilege collinear divergence over soft divergence Cacciari, GPS & Soyez '08

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anti-k_t gives cone-like jets without using stable cones

}

```
#include "fastjet/ClusterSequence.hh"
using namespace fastjet;
using namespace std;
int main () {
 // choose a jet definition
 double R = 0.7:
  JetDefinition jet_def(kt_algorithm, R);
 vector<PseudoJet> particles;
  // build event with 2 particles: px py pz E
 particles.push_back( PseudoJet( 100.0, 0, 0, 100.0) );
 particles.push_back( PseudoJet(-100.0, 0, 0, 100.0) );
```

```
// run the clustering, extract the jets
ClusterSequence cs(particles, jet_def);
vector<PseudoJet> jets = cs.inclusive_jets();
```

}

```
#include "fastjet/ClusterSequence.hh"
using namespace fastjet;
using namespace std;
int main () {
 // choose a jet definition
 double R = 0.7, f = 0.75;
  JetDefinition jet_def = new SISConePlugin(R, f);
 vector<PseudoJet> particles;
  // build event with 2 particles: px py pz E
 particles.push_back( PseudoJet( 100.0, 0, 0, 100.0) );
 particles.push_back( PseudoJet(-100.0, 0, 0, 100.0) );
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Jets "ecosystem"



<u>Individuals</u>

- Anyone needing simple jet finding
- People playing with new jet ideas
- Theorists who still like Fortran

Community-wide projects

need stable, simple interface need flexible interface

- Rivet One of the drivers for inclusion of "legacy" jet algorithms
- Delphes detector simulation

Experiments

- ► The four main LHC experiments all use FastJet
- ATLAS and CMS have chosen anti- k_t as the first jet alg. to calibrate
- ATLAS uses FastJet in the high-level trigger
 It had better not crash!





External plugins for FastJet:

- ► Variable *R* plugin
- Pruning plugin
- Trimming plugin

(not included in release)

Krohn, Thaler & Wang '09

Ellis, Vermillion & Walsh '09

Krohn, Thaler & Wang '10

Algorithms not naturally "pluggable" into FastJet:

FastJet designed for algorithms for which each particle ends up in at most 1 jet. Not all algorithms fit this picture:

- ARCLUS $(3 \rightarrow 2 \text{ clustering})$
- OJF (a particle has weighted assignment to multiple jets)
- ▶ FFTJet, in its "fuzzy" mode (weighted assignment)



Sparty Jet 🖾

Delsart, Geerlings, Huston & Martin '06-

- Provides root interface to FastJet, including PyRoot access
- Provides visualisation tools
- Also has a number of native implementations of jet algs

FastJet Tools page 🖾

- A range of boosted-particle finders (Higgs, top, etc.)
 Our own, links to other people's, and our implementations of other people's
- ► Background (UE/pileup) estimation and subtraction tools

Already in FJ, more flexible versions in the works

Filtering

cleanup of UE/pileup noise to improve resolution [Butterworth, Davison, Rubin & GPS '08] ["trimming" is closely related]

Physics Roadmap: Questions include

a) Developing (analytical) understanding of different uses of jets

b) Designing better analyses as a result

What follows is an illustration

What R is best for an isolated jet?



 $\langle \Delta p_t^2
angle \simeq \langle \Delta p_t
angle^2$

Jets (p. 19)

Physics Roadman

in small-*R* limit (?!) cf. Dasgupta, Magnea & GPS '07

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cf. Dasgupta, Magnea & GPS '07

Dijet mass: scan over *R* [Pythia 6.4]



Jets (p. 20)

Physics Roadmap



dijet mass [GeV]

jet

Dijet mass: scan over *R* [Pythia 6.4]



Jets (p. 20)

Physics Roadmap



dijet mass [GeV]

jet



dijet mass [GeV]



Dijet mass: scan over R [Pythia 6.4] Physics Roadmap

Jets (p. 20)



Dijet mass: scan over *R* [Pythia 6.4]



Jets (p. 20) Physics Roadmap



dijet mass [GeV]



Dijet mass: scan over *R* [Pythia 6.4]



Jets (p. 20) Physics Roadmap



Jets (p. 20) Physics Roadmap

Dijet mass: scan over R [Pythia 6.4]



After scanning, summarise "quality" v. R. Minimum \equiv BEST picture not so different from crude analytical estimate



 Best R depends strongly on mass of system

Increases with mass, just like crude analytical prediction NB: current analytics too crude

BUT: so far, LHC's plans involve running with fixed smallish *R* values



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e.g. CMS arXiv:0807.4961

NB: 100,000 plots for various jet algorithms, narrow *qq* and *gg* resonances from http://quality.fastjet.fr Cacciari, Rojo, GPS & Soyez '08



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Analytical R_{best}

Medium-term aim: have ability for FastJet to suggest near-optimal parameter choices for different classes of analysis. Can be based on MC study, or analytical calculations:



- Search strategies with jets in complex events
 - Boosted objects [Several groups working]
 - Non-boosted objects
- Further work on noise reduction (UE/pileup removal)
- Further understanding of UE/pileup characterisation
 - e.g. Cacciari, GPS & Sapeta '10 $\,$

Jets in heavy-ion collisions

Software Roadmap

Long-term maintainability Facilitation of "advanced" usage The most frequently used core code (N2Tiled strategy) was written in the space of a couple of days in 2005.

Not quite spaghetti code (C-style macaroni code?) It could do with a cleanup

An important part of maintanability is validation:

 We currently check compilation and clustering results for 1000 MC events for all algorithms every night on several systems.

We would like to switch to 10k events

 Other aspects of FastJet (e.g. jet areas) not yet subject to automatic validation, but that should probably change. We aim to maintain backwards compatibility for extended periods of time (allow 2-3 years from "deprecation" to "removal" of any feature).

Apparently "small" user-interface additions. E.g. from vector<PseudoJet> constituents = cluster_sequence->constituents(jet) to

vector<PseudoJet> constituents = jet.constituents();

Has memory management implications. But can help significantly with advanced usage.

One step on the way to a simple "tools" interface. Goal: easy and centralized access to helpful utilities

Conclusions



Main public jet-clustering package currently is FastJet

- Code is quite stable
- Provides access to a lot more than just native FastJet algorithms

Future evolution

- Physics-driven: how can we make better use of jets?
- Code should provide facilities to make this easy in pracice

User feedback is welcome!

- It has driven inclusion of "legacy" plugins
- It can help shape future evolution of code
- E.g. should there be built-in access from Python, PyRoot?