#### LCFIPlus update

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- Introduction
- Framework
- Improvements in jet/vertex finding
- Flavor tagging performance

# Introduction

# NIM A 610 573 (2009) LCFIVertex \* vertex finder & flavor tagger for LOI

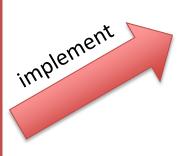
arXiv:1110.5785

 neural net difficult to extend



#### Jet Finding

- need to improve for multijet events
- vertex first, jet second approach

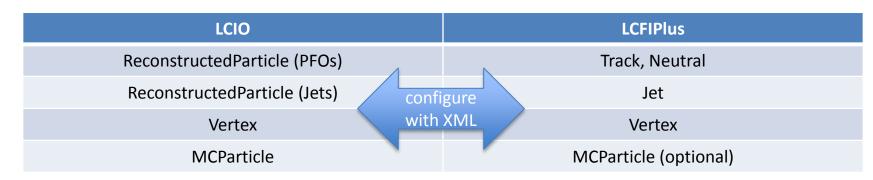


#### LCFIPlus

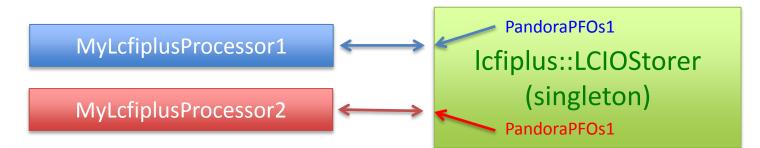
- vertex finding, jet finding, flavor tagger in one package
- \* exploit TMVA
- ★ flexible XML configuration

#### Included in ilcsoft since v01-13

## Data Types & Event Model

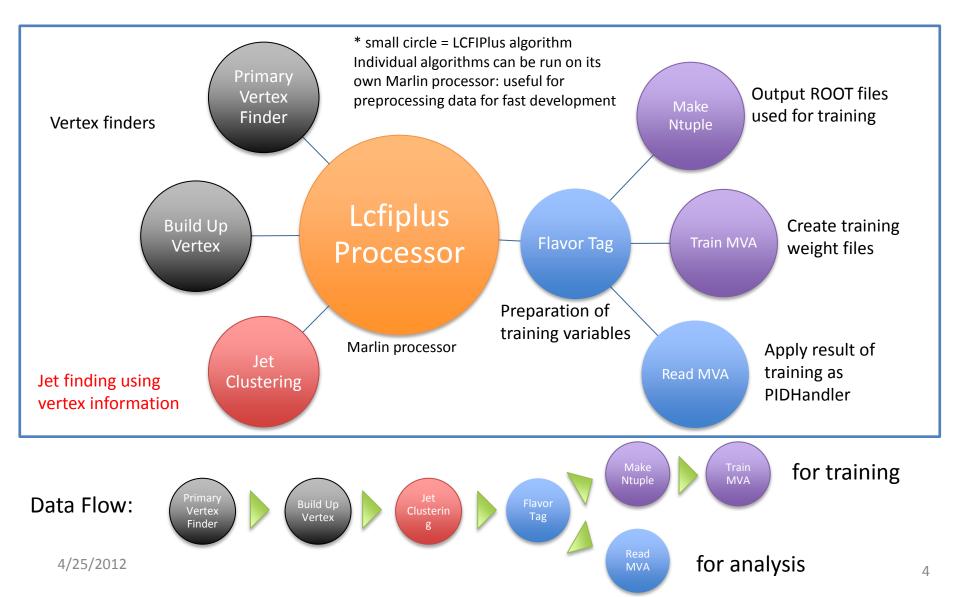


- LCFIPlus has its own event model for the convenience of its algorithms
  - has automatic conversion of data types from/to LCIO: ``LCIOStorer'' class
    - takes advantage of LCIO persistence model for read/write
    - performs intelligent type conversion: pfo vs. jet vs. vertex
    - same collection names are used as in LCIO
- latest changes will be included in the next ilcsoft release (v01-13-06)
  - ability to run multiple instances of LcfiplusProcessor (Marlin processor) with different input lists
  - improvements in vertex finding and flavor tagging variables
  - first version of training weight files for Z->qq / 6f events



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# Algorithms



# **Documentation & Feedback**

- Doxygen class reference
- User feedback + documentation system has been setup @ CERN (J. Strube):
  - Documentation wiki hosted at SLAC (thanks N. Graf)
    - bug tracker (JIRA) also available
  - <u>https://confluence.slac.stanford.edu/display/ilc/LCFIPlus</u>
    - some documentation present, will be described in more detail later
- Early bug reports (Thanks: J. Engels, F. Gaede, J. Strube, A. Sailer)
- Nightly builds and check input variables (J. Strube)
- Feedback and support from LC community has been very helpful. Will continue working with SiD for a smooth transition from LCFIVertex to LCFIPlus.

# Steering

- Typical user experience:
  - obtain DST files
  - reconstruct primary and secondary vertices (if missing)
  - select weight files
  - run analysis with JetClustering + FlavorTag + ReadMVA
- For training:
  - prepare training samples in DST format (with vertices)
  - ntuple preparation step:
    - JetClustering + FlavorTag + MakeNtuple
    - (concatenate the ROOT files with "hadd" if necessary)
  - training step:
    - FlavorTag + TrainMVA

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        <parameter name="PrimaryVertexCollectionName" type="string" value="PrimaryVertex" />+
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#### MakeNtuple

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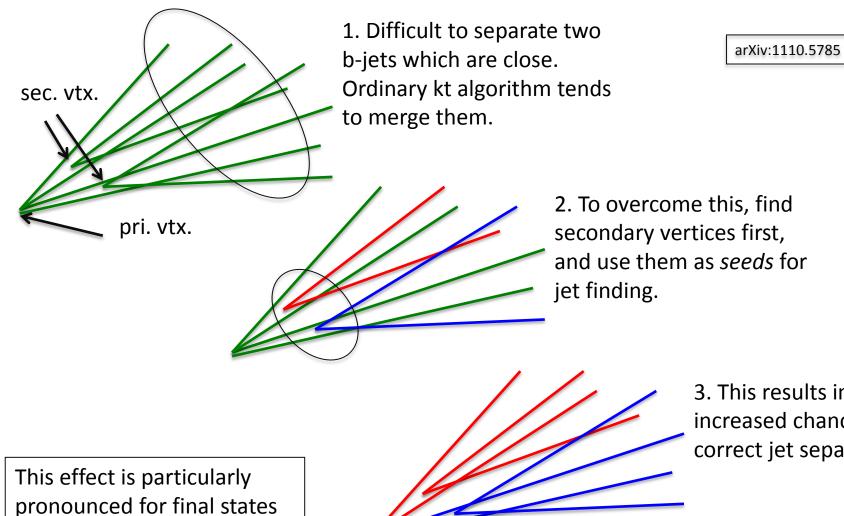
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   11|<parameter_name="SupressCheck"_value="false" /> →
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   14 <parameter name="LCIOInputFiles">input.slcio</parameter>↓
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   18 <parameter name="Algorithms" type="stringVec">JetClustering FlavorTag ReadMVA</parameter>↓
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        <parameter name="FlavorTag.CategoryDefinition2" type="string">nvtx==1</parameter>+
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        <parameter name="FlavorTag.CategoryVariables2" type="stringVec">+
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#### **Vertex-Jet Finding Overview**



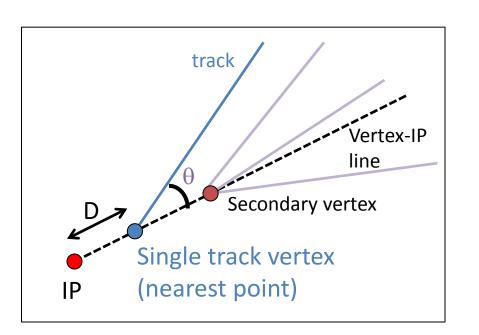
with many b jets, e.g. Zhh

3. This results in an increased chance of correct jet separation.

# Jet/Vertex Refining Strategy

- Selection of single tracks consistent with a secondary vertex. Treat them as pseudo-vertex.
- Lots of tuning work to improve b/c separation
  - V0 reconstruction the right way  $\rightarrow$  reject V0
    - K-short, Lambda0, photon conversions
  - Vertex clustering and refining, to aim
    - #vtx =2 for b-jet (also counting single track pseudo-vertex)
    - #vtx=1 for c-jet
    - #vtx=0 for uds jet
    - as much as possible
  - Unfortunately there is *leakage*, due to jet clustering mistakes → use multivariate analysis (TMVA) to cope with this. Currently multiclass BDT is implemented. Will need to study other options.

# Single Track Selection



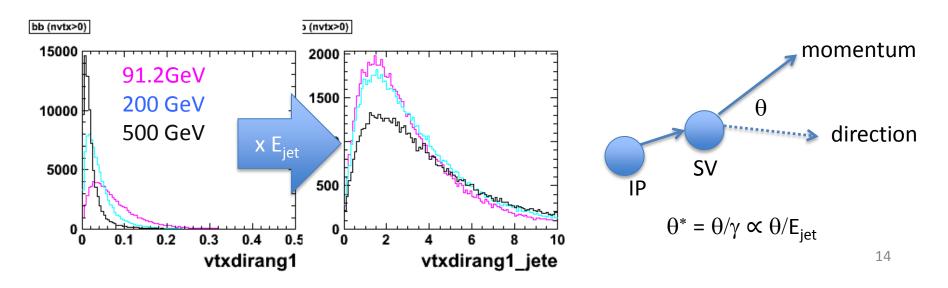
- Normal vertex finder needs > 2 tracks
  - -> loose many vertices
- Single track vertex can be found by using other vertex direction
- Improves b-tagging performance

Event	0 vtx	1 vtx	>= 2 vtx
bb normal	322	1052	426(24%)
bb +single	322	459	1019(57%)
cc normal	1003	779	18(1.0%)
cc +single	1003	715	82(4.6%)

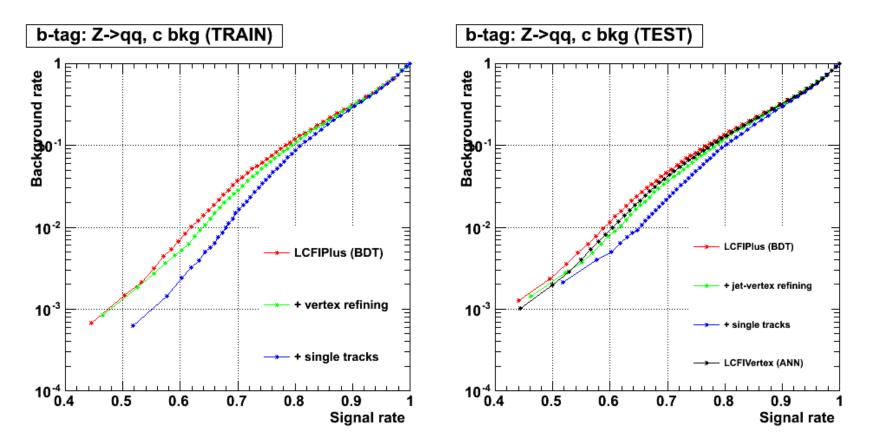
# Flavor Tagging Input Variables

- Previously LCFIPlus used variables which were energy-dependent → degradation in real events with varying energies. Need "boost-invariant" input variables.
  - known procedure in LCFIVertex, reimplemented normalization by jet energy
- Do we need normalization of output?  $\rightarrow$  need to be studied

nvtx=0	trk1d0sig trk2d0sig trk1z0sig trk2z0sig trk1pt_jete trk2pt_jete jprobr jprob
nvtx=1	vtxlen1_jete vtxsig1_jete vtxdirang1_jete vtxmom1_jete vtxmass1 vtxmult1 vtxmasspc vtxprob (+ above)
nvtx>=2	vtxlen2_jete vtxsig2_jete vtxdirang2_jete vtxmom2_jete vtxmass2 vtxmult2 vtxlen12_jete vtxsig12_jete vtxdirang12_jete vtxmom_jete vtxmass vtxmult (+ above)

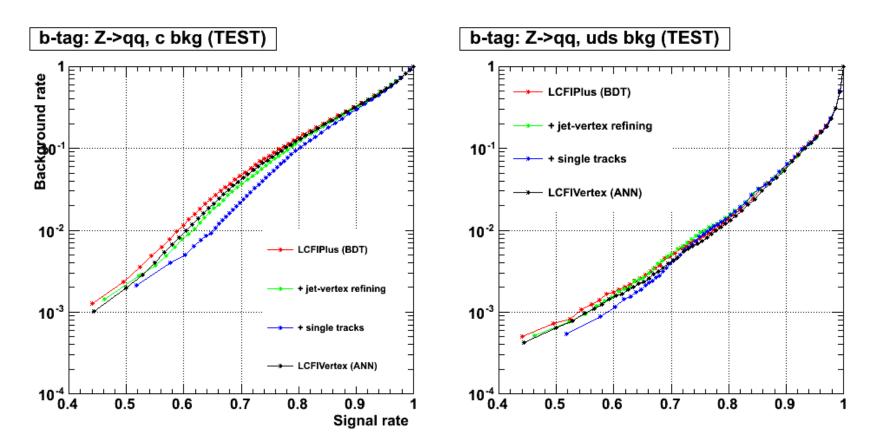


## Training vs. Testing



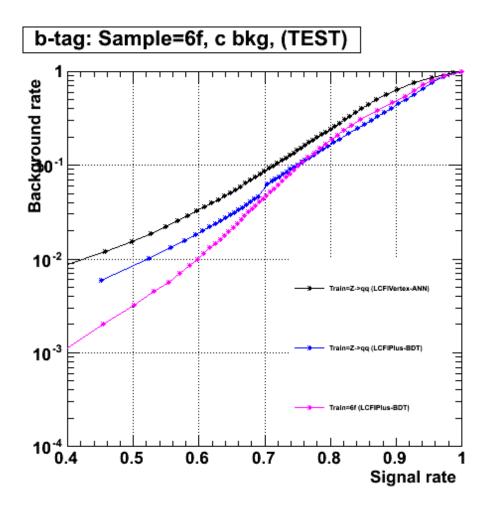
We use independent samples to evaluate the performance of the training.

#### b-tag vs. c-tag



This is for Z->qq sample at Ecm=91.2GeV. A small improvement is seen for b-tag and c-tag. Improvement is highest for b-tagging in the high purity region.

## Performance in 6-jet environment



LCFIVertex

2 jet training on 6 jet sample

LCFIPlus 2 jet training on 6 jet sample

LCFIPlus 6 jet training on 6 jet sample

Training and testing performed using 6f samples with 6b, 6c, and 6q with q=uds.

Improvement over old algorithm seen in all regions because of vertex-assisted jet finding. Performance in high efficiency region still needs to be understood.

# Summary and Outlook

- Software infrastructure now in place for ILD DBD production
   → have complied with technical requests, to be included into
   the next ilcsoft cycle (~few weeks)
- Will continue working with SiD for a smooth transition from LCFIVertex to LCFIPlus
- Physics performance not yet satisfactory. Need a better understanding of physics and TMVA behavior. In particular:
  - additional tuning of vertex/jet finding & input variables
  - alternative multivariate algorithms ?
  - normalization of output classifiers ?