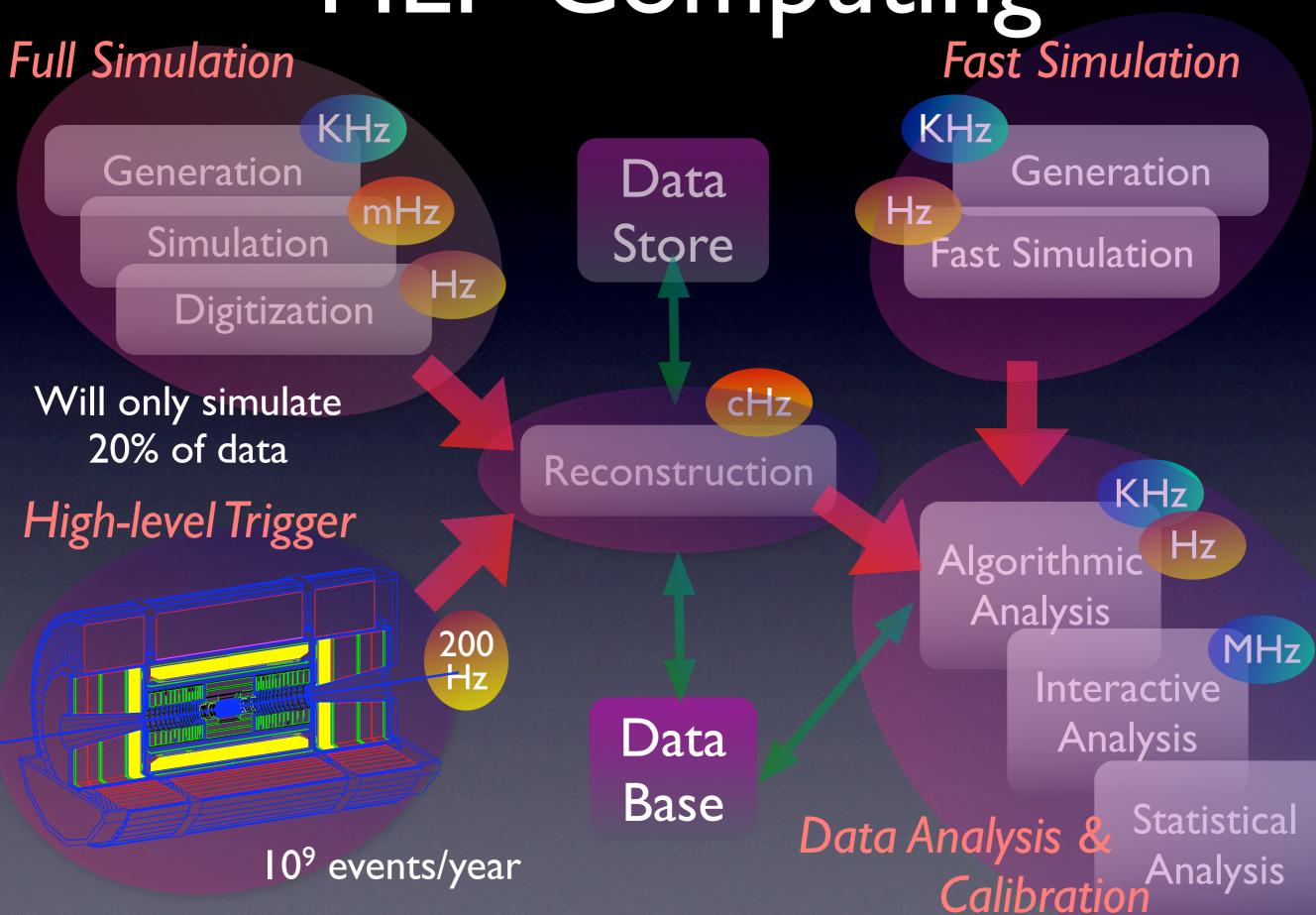
#### ATLAS Analysis Model

Amir Farbin
University of Texas at Arlington

# HEP Computing



#### The Event Data Model

#### Refining the data

Reconstruction Output.
Intended for calibration.
500 KB/event.
Cells,Hits,Tracks,
Clusters,Electrons, Jets, ...

Raw Channels.

1.6 MB/event.

**Event Summary** 

Data

Raw Data
Objects

Intended for Analysis.

100 KB/event.

"Light-weight" Tracks,
Clusters, Electrons,
Jets, Electron Cells,
Muon HitOnTrack,...

Summary of Event.
Intended for selection.
I KB/event.
Trigger decision, p<sub>T</sub> of 4
best electrons, jets...

Analysis
Object
Data

Derived
Physics
Data

Intended for "interactive"
Analysis.
~10-20 KB/event.
What-ever is necessary
for a specific analysis/
calibration/study.

# The Computing Model

- Resources Spread Around the GRID
- Reprocessing of full data with improved calibrations 2 months after data taking.
- Managed Tape Access: RAW, ESD
- Disk Access: AOD, fraction of ESD
- Derive 1st pass calibrations within 24 hours.
- Reconstruct rest of the data keeping up with data taking.

AOD

Tier 3

DPD

30 Sites Worldwide

Interactive

Plots, Fits, Toy

MC, Studies, ...

Analysis

Tier 2

Tier 0

RAW

Tier I RAW/

AOD

10 Sites Worldwide

- Production of simulated events.
- User Analysis: 12 CPU/ Analyzer
- Disk Store: AOD

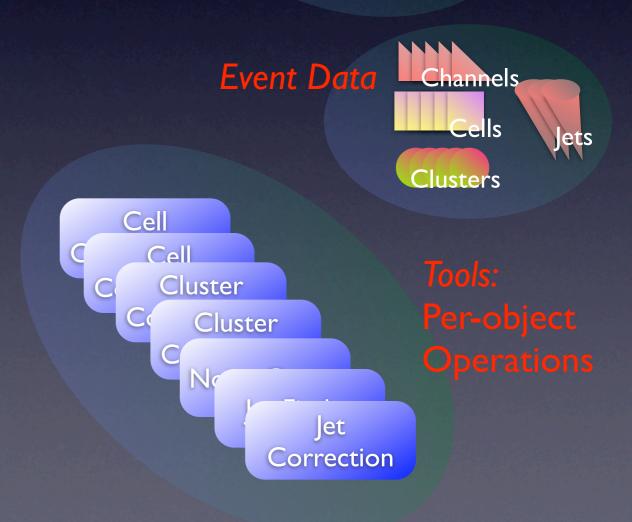
CERN **Analysis Facility** 

- Primary purpose: calibrations
- Small subset of collaboration will have access to full ESD.
- Limited Access to RAW Data.

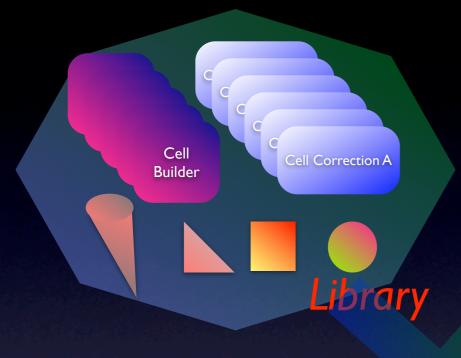
#### Framework Elements

- Athena is an extended version of LHCb's Gaudi framework used for high-level trigger, simulation/ reconstruction, and analysis.
- Elements:
  - Algorithms- one execute per event, managed by framework.
  - Tools- multiple executes per event.
  - Event Data
  - Services
    - StoreGate-Transient Data Store- Mechanism for communication between Algorithms
    - Tool Service- Tool Factory
    - Interval of validity
    - Histogram Service
    - POOL- Persistency





 The reconstruction application is a specific configuration of a library of framework elements.



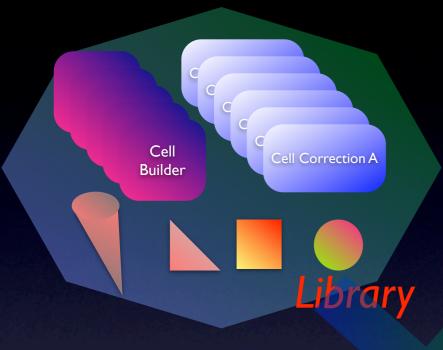
The Framework

```
Algorithms+=CellBuilder
(In="LArgChannels",Out="Cells1")
Algorithms+=CellCalibrator
(In="Cells1",Out="Cells2")
CellCalibrator+=CellCorrectionA()
CellCalibrator+=CellCorrectionB()
Algorithms+=ClusterBuilder
(In="Cells2",Out="Clusters1",MinEne
rgy=10*GeV)
....

A Configuration
```

Input="TheData"

The reconstruction application is a specific configuration of a library of framework elements.



The Framework

```
Input="TheData"
Algorithms+=CellBuilder
(In="LArgChannels", Out="Cells1")
Algorithms+=CellCalibrator
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CellCalibrator+=CellCorrectionB()
Algorithms+=ClusterBuilder
(In="Cells2", Out="Clusters1", MinEne
rgy=10*GeV)
                    A Configuration
```

**EventSelector** Service

Cell Builder

Cell Calibrator

> Cluster Builder

Cluster Correction A Cluster

**Noise Cutter** 

Correction B

Cell

Correction A

Cell

Correction B

Jet Finder

et

Correction

Cluster Calibrator

let Finder

Clusters

Clusters

# Lessons from Other Experiments I

Observations from: BaBar, CDF, D0, H1 ATLAS Analysis Model Workshop (Oct 2006)

- Observation: Speed is the most important factor in the Analysis Model adopted by users... no matter what the management says or sw-developers provide.
- When it is impractical to repeatedly iterate analyses on AOD, users dump large ntuples which mostly copy AOD contents... and perform analysis outside the software framework.
- Solution:
  - Optimize AOD access speed to can close to the ROOT limit (10MB/s).
     (Transient/Persistent Separation)
  - Allow direct access to AOD in ROOT.

# Lessons from Other Experiments II

Observations from: BaBar, CDF, D0, H1 ATLAS Analysis Model Workshop (Oct 2006)

- Observation: Tasks naively thought to be addressed by "ESD"-based analysis or reprocessing (eg: calibration, alignment, track-fit, re-clustering) are routinely performed in the highest level of analysis.
  - → As experiments evolve:
    - "ESD" bloated and too difficult to access ⇒ dropped
    - "AOD" is gradually augmented with some "ESD" quantities (eg: hits in roads/ cells) to provide greater functionality at analysis time.
- Solution:
  - Make sure reconstruction and calibration can be applied to AOD objects.
  - Make it easy to adjust the content of the AOD.
  - Add sufficient information to the AOD permit foreseen analysis tasks. Lots of recent iterations on AOD content in the context of analysis model.

# What is Analysis?

- Re-reconstruction/re-calibration- often necessary.
- Algorithmic Analysis: Data Manipulations ESD→AOD→DPD→DPD
  - Skimming- Keep interesting events
  - Thinning- Keep interesting objects in events
  - Slimming- Keep interesting info in objects
  - Reduction- Build higher-level data which encapsulates results of algorithms
  - Basic principle: Smaller data → more portable & faster read
- Interactive Analysis: Making plots/performing studies on highly reduced data.
- Statistical Analysis: Perform fits, produce toy Monte Carlos, calculate significance.

# Stages in Analysis

- Use TAG to quickly select subset of events which are interesting for analysis.
- Starting from the AOD
  - Stage 0: Re-reconstruction, re-calibration, selection (AOD)
    - Redo some clustering/track fitting, calculate shower shapes, apply corrections, etc...
    - Typical: 250 ms/event, In: 75% AOD, out 50% AOD
  - Stage I: Selection/Overlap removal/complicated analysis (AOD/DPD)
    - Select electrons/photons→find jets on remaining clusters→b-tag→calculate MET
    - Perform observable calculation, combinatorics + kinematic fitting, ...
    - Typical: 20 ms/event, In: 25% AOD, Out: 10% AOD
  - Stage 2: Interactive analysis (AOD/DPD)
    - Final selections, plots, studies.
    - Prototype earlier steps!
    - Typical: 0 ms/event, In: 1% AOD, Out: 0
  - Stage 3: Statistical Analysis

#### Physics Group

#### Analysis Group

## Stages vs Resources

- ATLAS will record 200 Hz of data, regardless of luminosity  $\rightarrow$  109 event/year.
- CM Assumption 700 Analyzers: 12 tier 2 CPU/person for analysis at any give time.
- Not unusual for some analysis to start with 50% of the data.

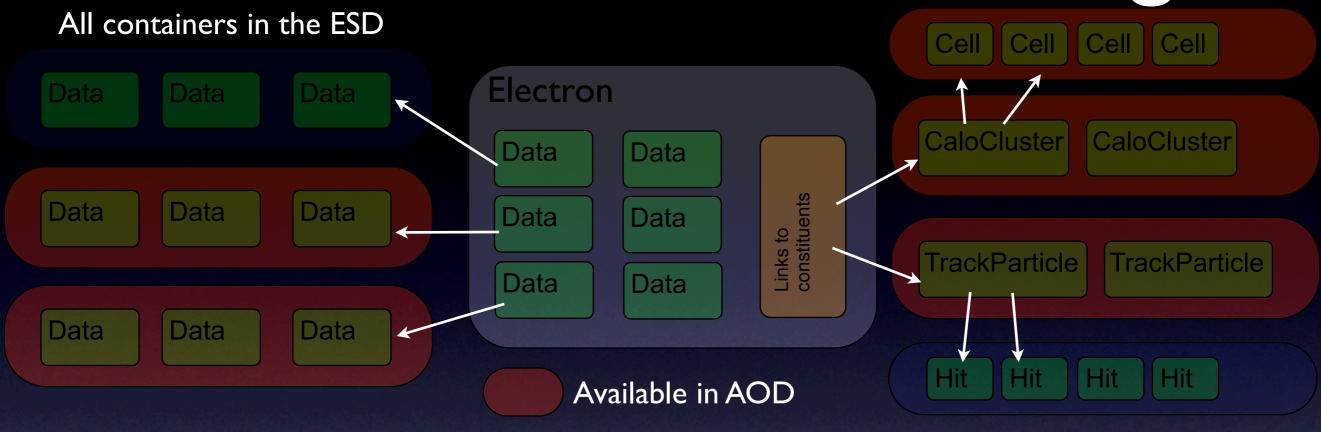
Step 0

Step |

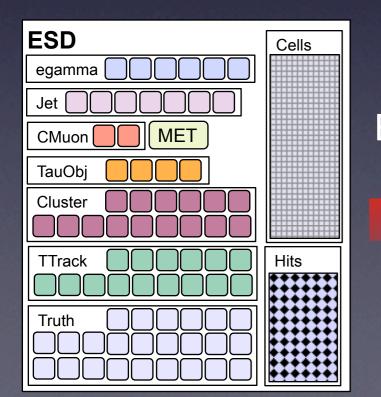
Assuming perfect software/hardware (10 MB/s read in = ROOT limit).

	( - 1 - 1 - 1 - 1 - 1 - 1 - 1 - 1 - 1 -		
Laptop I Cores	Tier 3 25 Cores	Tier 2 10 Persons 100 Cores	Tier 2 100 Persons 1000 Cores
0.0001%	0.0035%	0.0140%	0.1398%
0.0017%	0.0419%	0.1678%	1.6777%
0.0235%	0.5872%	2.3487%	23.4874%
0.1007%	2.5165%	10.0660%	All
0.0016%	0.0400%	0.1600%	1.6000%
0.0192%	0.4800%	1.9200%	19.2000%
0.2688%	6.7200%	26.8800%	All
1.1520%	28.8000%	All	All
0.3600%	9.0000%	36.0000%	All
4.3200%	All	All	All
60.4800%	All	All	All
All	All	All	All
	0.0001% 0.0017% 0.0235% 0.1007%  0.0192% 0.2688% 1.1520%  0.3600% 4.3200% 60.4800%	Laptop I Cores       Tier 3 25 Cores         0.0001%       0.0035%         0.0017%       0.0419%         0.0235%       0.5872%         0.1007%       2.5165%         0.0016%       0.0400%         0.2688%       6.7200%         1.1520%       28.8000%         0.3600%       9.0000%         4.3200%       All         60.4800%       All	Laptop I Cores         Tier 3 25 Cores         Tier 2 10 Persons 100 Cores           0.0001%         0.0035%         0.0140%           0.0017%         0.0419%         0.1678%           0.0235%         0.5872%         2.3487%           0.1007%         2.5165%         10.0660%           0.016%         0.0400%         0.1600%           0.2688%         6.7200%         26.8800%           1.1520%         28.8000%         All           0.3600%         9.0000%         36.0000%           4.3200%         All         All           60.4800%         All         All

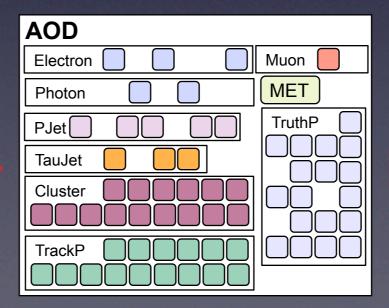
## Event Data Model Design



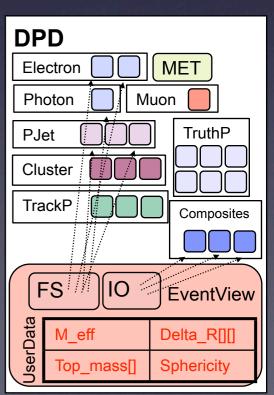
Benefits: I. Move data between AOD/ESD w/o schema change. 2. Read on Demand



AOD Building



DPD Building



# Stage 1: DPD Building

- The AOD data-set is too big to store locally for interactive access (eg Tier 3/laptop) or to run on with one Core.
- AOD is general purpose, containing more information than necessary for any given analysis...
  - So analysts should skim, thin, slim, & reduce the data to a manageable size for interactive analysis.
- 2 Aspects:
  - Basic framework support for such operations
    - Skimming: Easy... write out subset of what you read in. Gaudi Filters.
    - Slimming: write out subset of input containers. POOL output list.
    - Thinning: write out subset of object inside containers. Thinning service.
    - Reduction: User annotations. Add EventView/UserData. This hasn't been fully worked out.
  - Provide tools which encapsulate the physics decisions behind these operations... eg particle selection.

# Collaborative Analysis

- Problem: how do you get 2000 physicists to
  - perform analysis in consistent ways
  - easily share & compare their work
- Same problem as reconstruction.
  - The reconstruction software is simultaneously developed by 100's of people over many years.
  - A common set of framework elements form the basic language of event processing.
  - Application is created at runtime.
- Solution: Apply the same framework design to analysis → EventView
   Framework (see first poster session)...

#### The EventView

- Holds the "state" of an analysis.
  - Objects in the AOD + Labels.
  - Objects created in the coarse of analysis + Labels.
  - EventView is a generic analysis data object which is meant to represent the state of an analysis analysis... sort of like an advanced ntuple
- Can be written which uses Athena framework elements.
  theorist!)
- Convention: each EventView holds one interpretation of an event... very natural book keeping tool.

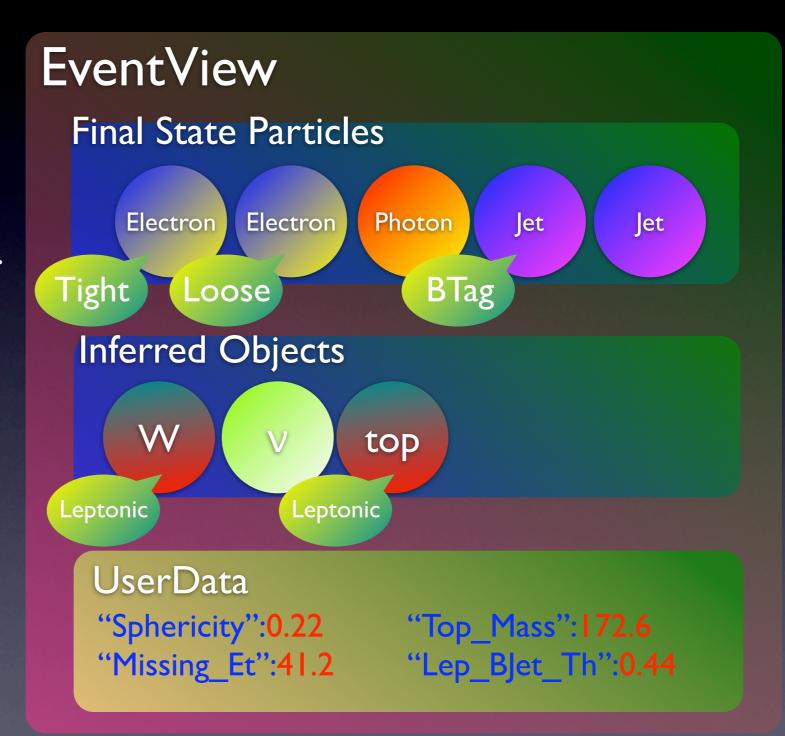
**EventView** 

Final State Particles

Lectron Flectron Photon

#### The EventView

- Holds the "state" of an analysis.
  - Objects in the AOD + Labels.
  - Objects created in the coarse of analysis + Labels.
  - UserData: Anything other data generated during analysis.
- Can be written/read from file and shared (even with a theorist!)
- Convention: each EventView holds one interpretation of an event... very natural book keeping tool.



#### EventView Framework

Analysis is a series of EventView Tools executed in Tau a particular order. Selection **Electron** Combin- Observable let Framework generates Selection Calculation Selection atorics multiple Views of an event Tau EventView Framework allows breaking analysis into modular pieces so different parts can be developed by different Data people... Controls the flow of analysis algorithms EV1 and data Everything consistent within one EventView ⇒ Framework handles bookkeeping.

#### EventView Framework

Tau Selection I

Electron Selection
Tau Selection 2

Tau Selection 2

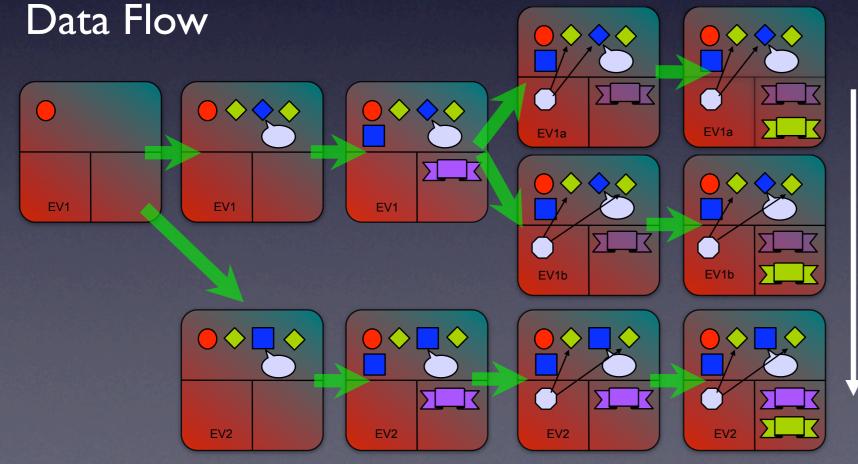
Tau Selection 2

 Analysis is a series of EventView Tools executed in a particular order.

- Framework generates multiple Views of an event representing
  - Different analysis paths
  - Different combinatorics choices
  - Different input (eg: generator, full reconstruction, fast simulation)

Everything consistent within one EventView ⇒ Framework handles bookkeeping.

#### Analysis Flow



Views of one Event

#### EventView Toolkit

- 100's of generalized tools which can be configured to perform specific tasks.
- Tools instantiated/configured at runtime in python... users can perform complicated analyses w/o any C++.

Inserters
Particle
Selection

UserData
Observable
Calculation

- The EventView Community provides a "ass large library of generic tools which perform common analysis tasks.
- Too
- Users build analyses by chaining these
- Complication together and setting parameters during job classes.

  configuration.
- Users only need to implement "the physics".

EventViewBuilder Toolkit

 Users now routinely contribute new tools.

#### EventView Toolkit

- 100's of generalized tools which can be configured to perform specific tasks.
- Tools instantiated/configured at runtime in python... users can perform complicated analyses w/o any C++.
- Provide the language for basic analysis concepts: "inserter", "looper", "associator", "calculator", "combiner", "transformer".
- Tools explicitly designed to be extended by users (when necessary).
  - Complicated Athena stuff in base classes.
  - Users only need to implement "the physics".
  - Users now routinely contribute new tools.

Inserters
Particle
Selection

UserData
Observable
Calculation

<u>Combiners</u> Combinatorics Selections

EventView
Selection

Transformation
Recalibration,
boosting

UserTools
User
contributions

EventViewBuilder Toolkit

## "View" Packages



SUSYView

**TopView** 

- Analysis packages are mostly configurations of standard tools... minimal new C++.
- HighPtView: Generic Analysis package running in production ⇒ Standard:

EventView Performance

Higgs

 Physics community have built various highlevel analysis packages which perform some of the steps of specific analysis.

Several have been adopted as the DPD-

building mechanism for Physics Analysis groups (most successful: Top Working

much faster dev Group).le than re or patches! So the EV team provides/ distribute pacman caches.

And Performance packages:

ElectornPhotonView, JetView, MuonView

Serves as benchmark/starting point for

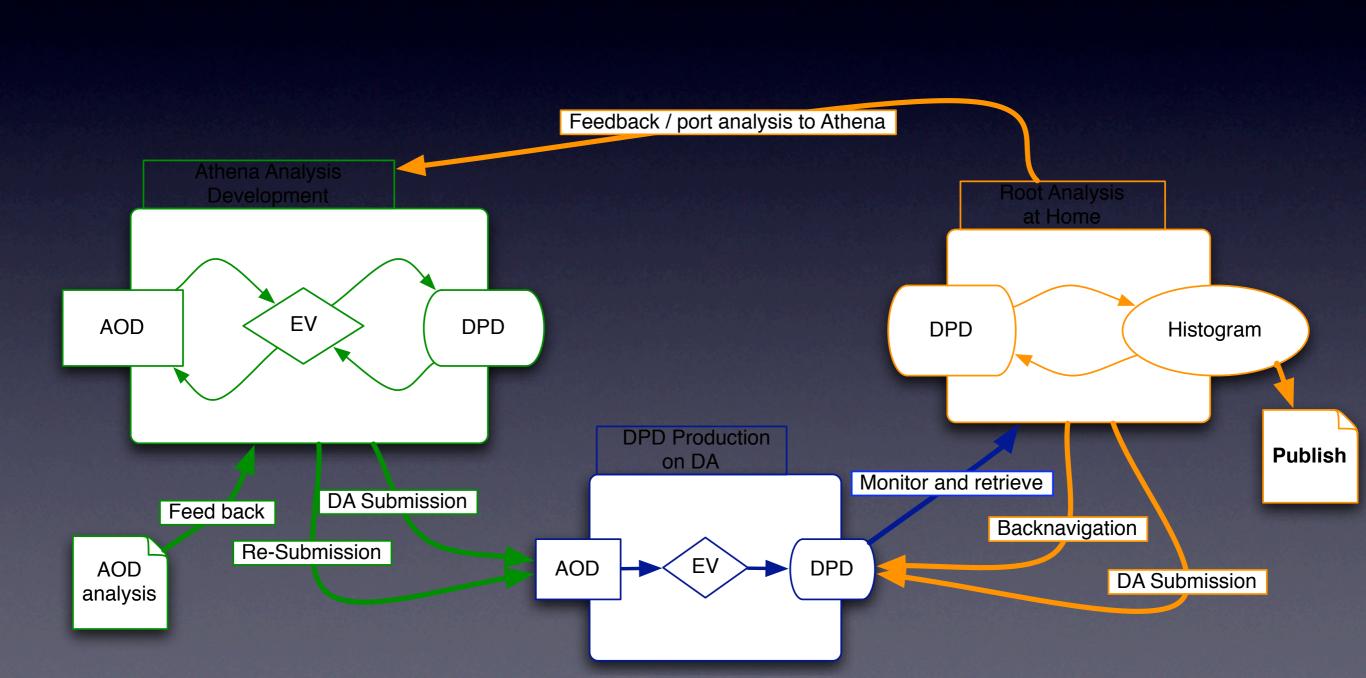
## "View" Packages



- EventView Framework provides standardized mechanisms for building custom DPDs.
- EventView and software packages have a much faster development cycle than releases or patches! So the EV team provides/ distribute pacman caches.

- Analysis packages are mostly configurations of standard tools... minimal new C++.
- HighPtView: Generic Analysis package running in production ⇒ Standard:
  - Particle selections
  - Truth/Trigger Match
  - Output
  - Serves as benchmark/starting point for analyses
  - Many physics groups customizing HighPtView for specific analyses ⇒ SUSYView, TopView, ...
- And Performance packages:
   ElectornPhotonView, JetView, MuonView

# Analysis Work Flow



## Stage 2: Interactive Analysis

- Format of the DPD
  - Use athena convertors to read EDM objects into ROOT... so the DPD format is the same as AOD/ ESD.
  - Allow saving additional non-standard info... eg EventView/UserData.
- Dataset management
  - N datasets (eg data, signal MC, bkg1 MC, bkg2 MC, ...)
  - M<sub>i</sub> files in each... different cross-section, preselection (trigger?) efficiency, ...
- Interactive Plotting (eg TTree::Draw).
  - Limited. Usefulness depends on DPD format. Ex:With EventView DPD you can make efficiency, resolution, scale plots because results of matching is stored in DPD.
  - But inefficient for making lots of plots from the same dataset because each plot requires its own loop over data.
- Batch Analysis (eg TTree::MakeClass → Loop())
  - As sophisticated as your input DPD allows. Compile for speed.
  - Simultaneously generate multiple histograms, ntuples, etc...
- Finalizing plots, making tables, etc

## Interactive Analysis Frameworks

 ROOT/PyRoot frameworks emerge as analyses become more sophisticated than what is manageable in a macro.

```
Data.Compare
(["J4Reco","J5Reco","J6Reco","J7Reco",
"J8Reco"],"Jet_p_T")
```

- Jet\_p\_T

  108

  J4Reco

  J5Reco

  J6Reco

  J7Reco

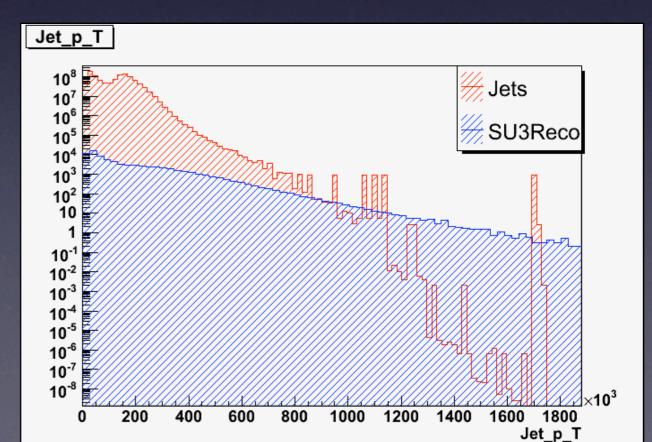
  J8Reco

  104

  103

  0 200 400 600 800 1000 1200 1400 1600 1800

  Jet\_p\_T
- Data.AddCombinedSample('Jets', Data,
   ['J4Reco','J5Reco','J6Reco','J7Reco','J8R
   eco'])
- Data.Compare
   (['Jets','SU3Reco'],'Jet\_p\_T')



# Batch Analysis

```
TheAnalysis=TTreeAlgorithmLooper("TestAnalysis")
```

TheAnalysis.AddAlgorithm(VarHistAlgorithm("JetN\_hist","JetN\_hist","JetN\_hist","T.jetN", 20,0,20,["jetN"]))

TheAnalysis.AddAlgorithm(SimpleVarCutAlgorithm("4JetsCut","T.jetN>3",["jetN"]))

#### The Analysis. Add Algorithm (Var Hist Algorithm

```
("MET_hist","MET_hist","MET_hist","T.MissingEt",100,0,1000000,["MissingEt"]))
```

TheAnalysis.AddAlgorithm(SimpleVarCutAlgorithm("METCut","T.MissingEt>100000.", ["MissingEt"]))

TheAnalysis.AddAlgorithm(TransverseMassAlg("M\_T"))

TheAnalysis.AddAlgorithm(WriterAlgorithm(["M\_T","Jet\_N", ...])

#### import RunHandler

RH=RunHandler.RunHandler(["SU4Reco","J1Reco"], TheAnalysis, "myRH") RH.Loop()

import pickleResults

pickleResults.save(RH.Results, "myAnalysis\_")

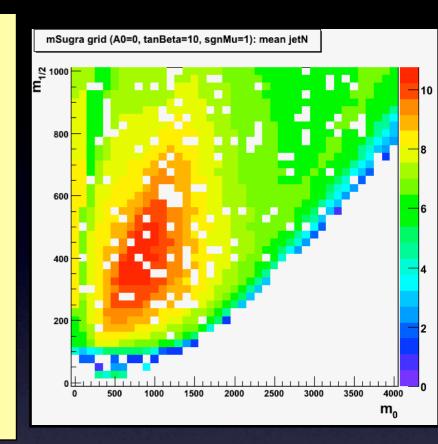
res.GetCutTable(Samples=["SU3Reco"], Lumi=1000.0)

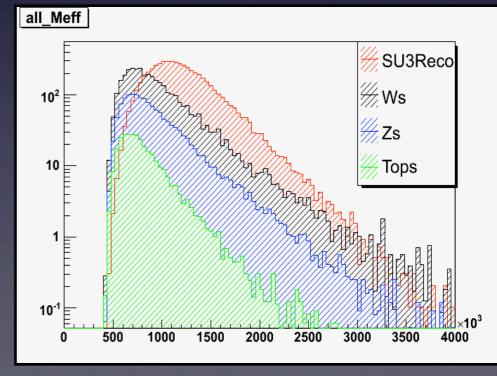
Sample: SU3Reco

Cut: 4JetsCut -> Eff: 0.69 err: 0.001 Cut: METCut -> Eff: 0.88 err: 0.0009 Cut: JetCutAlgo -> Eff: 0.47 err: 0.001

Final Cut Effc: 0.29 err: 0.001

exp. evts. (after cuts): 5654.1 err: 5.9





# Summary

- ATLAS Analysis Model focuses on ensuring framework, event data model, analysis tools, and persistency technologies allow analyzers to:
  - Re-reconstruct and re-calibrate objects on AOD while still remaining within the space budget.
    - Unify reconstruction and analysis objects.
    - Carefully tune AOD contents.
  - Build custom Derived Physics Data.
    - Identify basic operations: skimming, thinning, slimming, reducing
    - Provide framework support for these operations.
    - Provide a high-level framework for collaborative development of analysis packages based on common tools.
  - Efficiently analyze DPDs on local resources.
    - Make framework objects directly readable in ROOT.