# Multi-core Aware Applications in CMS

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For the Offline and Computing Project of CMS





Why bother?

- Forking: Copy on Write
- Framework design
- Measurements
- Estimating performance of threading
- Conclusion



Why Bother?



### HEP processing is naturally parallelizable

We have billions of events

Each event can be processed independently

#### Memory is becoming a limitation

Historically GB/US\$ increases at the same rate as number of transistors in a CPU <a href="http://www.jcmit.com/memoryprice.htm">http://www.jcmit.com/memoryprice.htm</a>

Funding levels are not guaranteed to stay this high We can afford 2GB/core now but may not in the future

Opportunistic use of grid sites improves if we lower our memory requirements Not all grid sites have 2GB/core

Technical limitations on connecting many cores to shared system memory <u>http://www.intel.com/technology/itj/2007/v11i3/3-bandwidth/7-conclusion.htm</u>

### Multi-core aware applications can improve memory sharing Threading

All threads share the same address space but have to worry about concurrent usage Forking

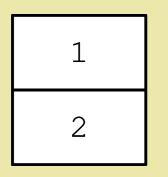
Each child process gets its own address space

Untouched memory setup by the parent is shared between the child processes





Parent





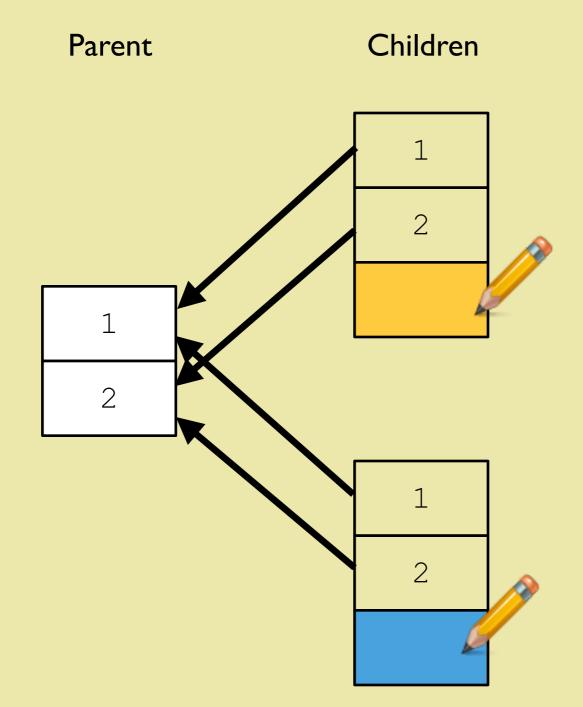


Child processes start by sharing the same memory pages as the parent

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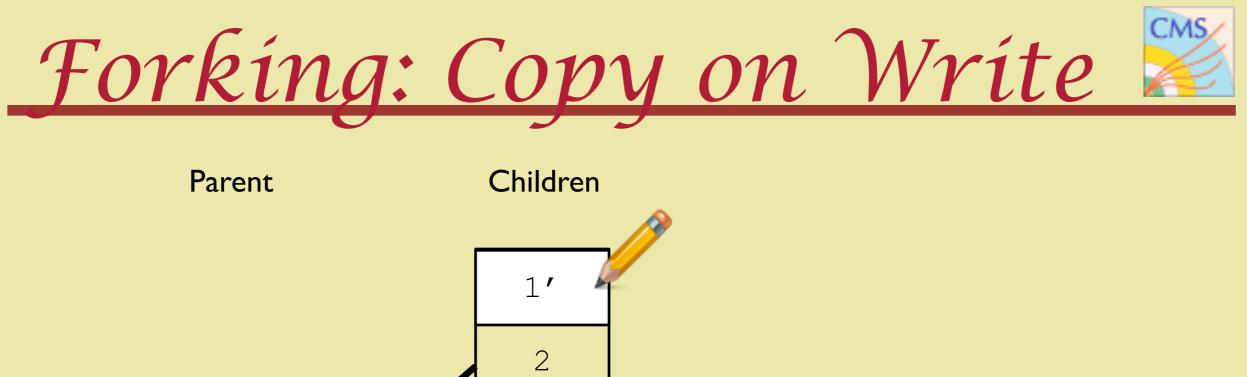
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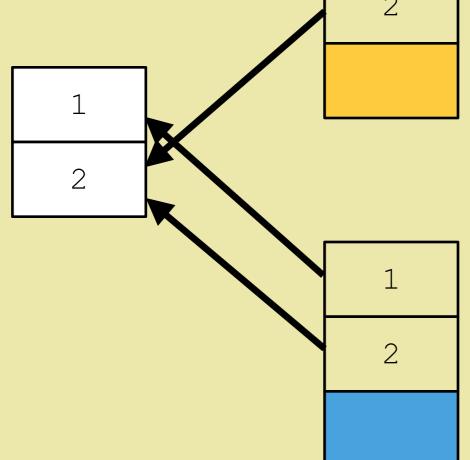




Children get their own pages when asking for new memory







If a child attempts to write to shared memory, it gets its own copy

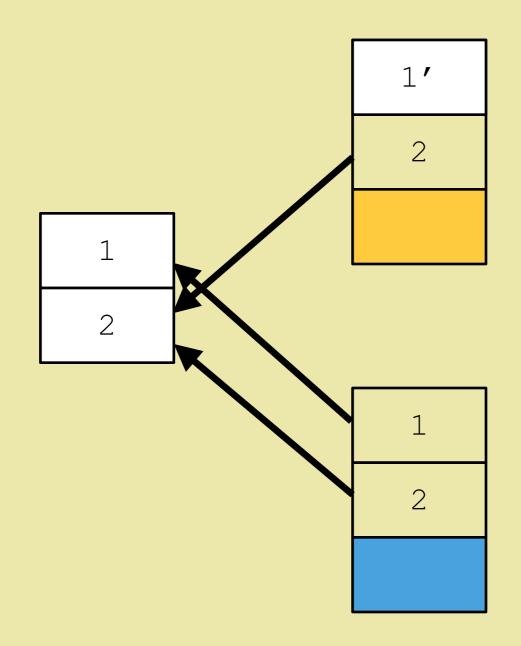
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Parent

Children



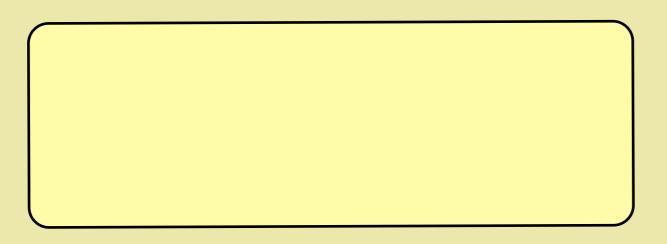
Parent needs to load into memory often used, non-volatile data Conditions, calibrations and geometry





### Parent

Reads configuration and loads modules Configuration says how many children and # events/child Opens input file and reads first run modules are not called Pre-fetches conditions, calibrations and geometry Sends message to all modules that forking is going to happen source closes file Forks



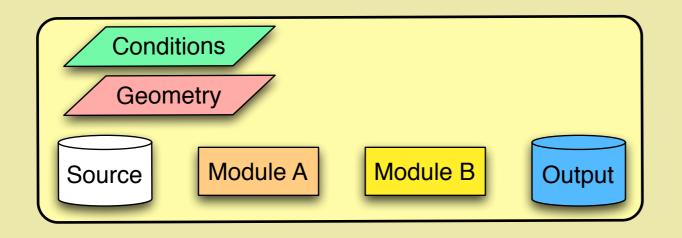




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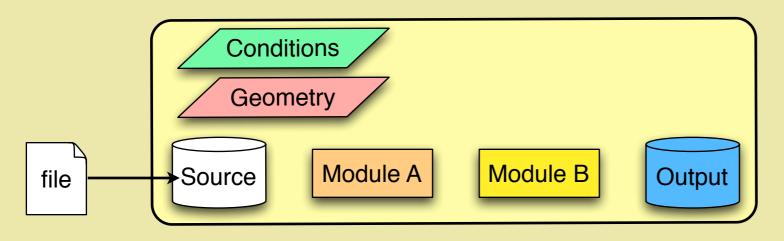
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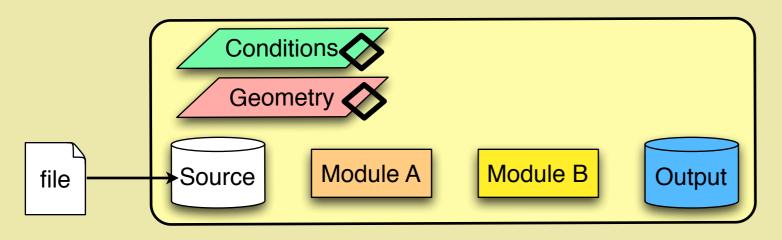
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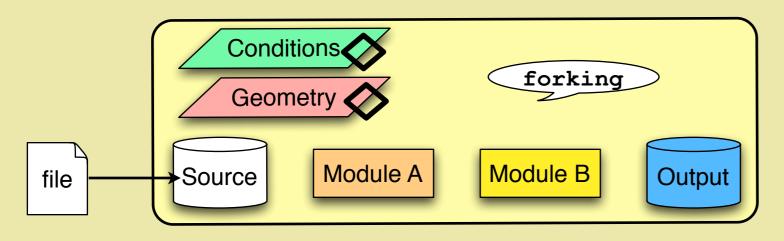






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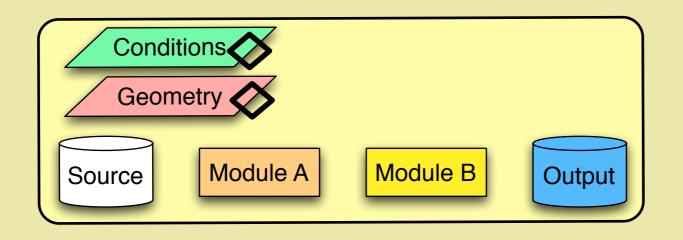






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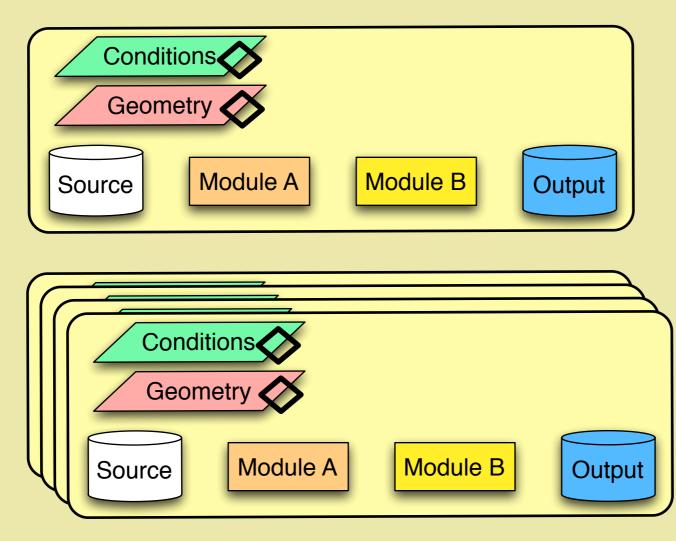




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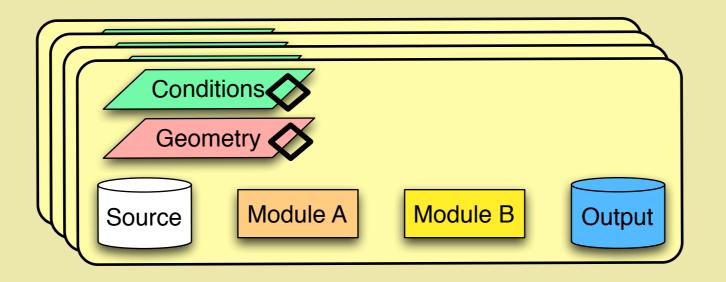
### Children

Redirects stdout and stderr to own files whose names contain parent PID and child #

Send messages to modules saying process is child X Output modules append child # to file names

Sources calculate their event ranges to process (no IP communication) and re-open the file

Process events in child's start/end range normally



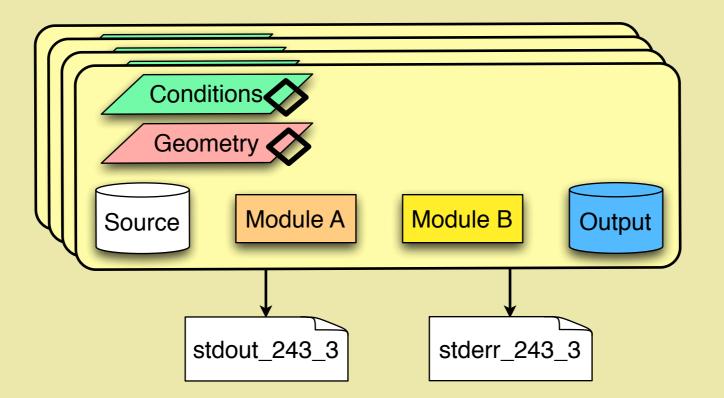




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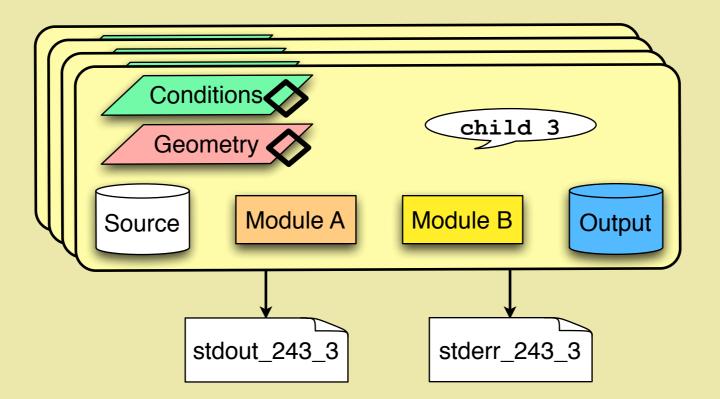




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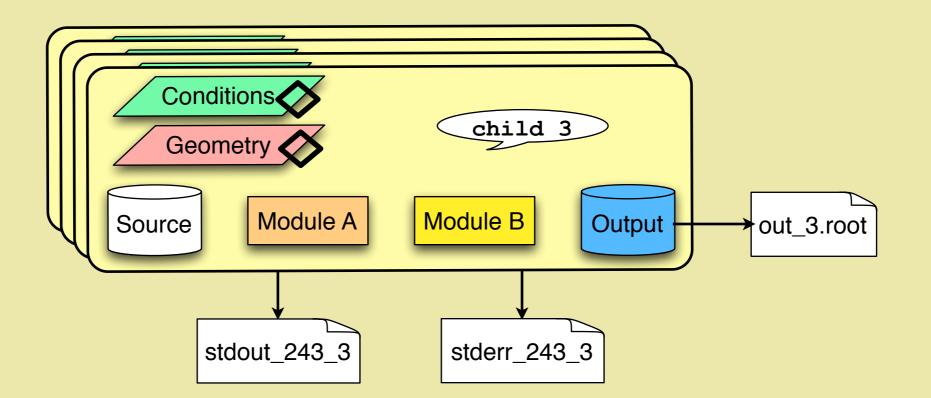




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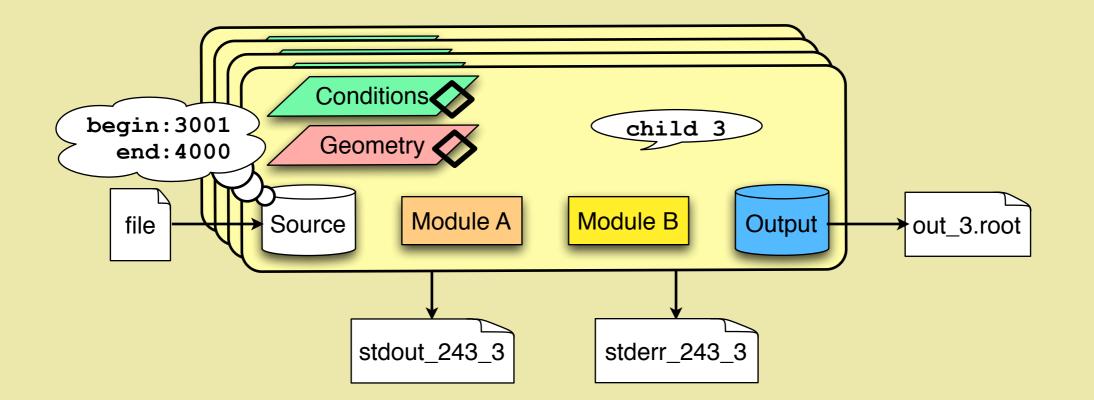


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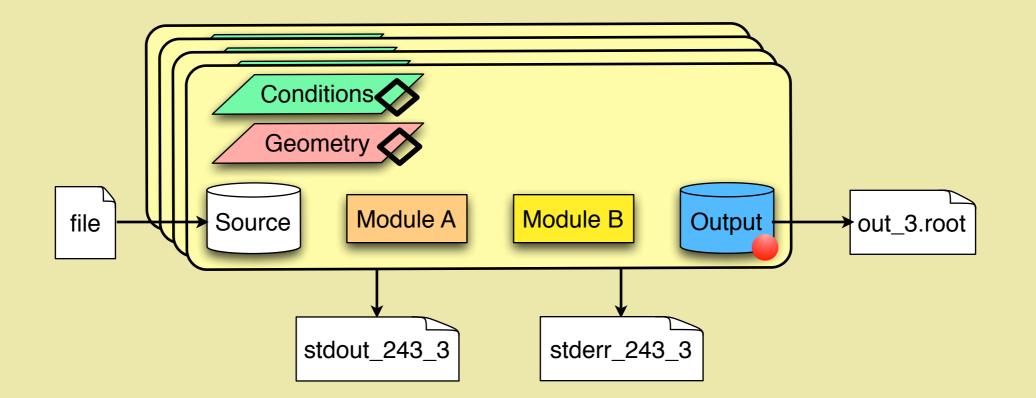


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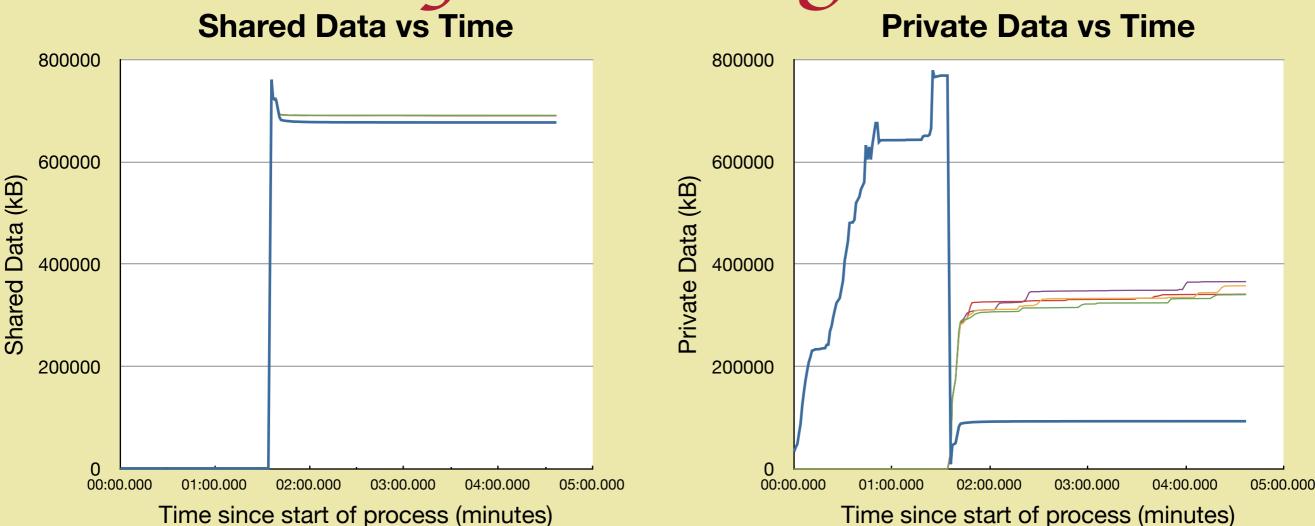
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Measurements done using reconstruction with 64bit software on 4 CPU, 8 core/CPU 2GHz AMD Opteron(tm) Processor 6128 Shared memory per child: ~700MB Private memory per child: ~375MB Total memory used by 32 children: I3GB Total memory used by 32 separate jobs: 34 GB

Saved 62% of memory

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11

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#### **Events/sec vs Number of Cores** 50.0 1.100 Measured Forked Measured Separate Jobs 37.5 0.825 Events/sec/core **Perfect Scaling** ÷ Events/sec 25.0 0.550 Measured Forked Measured Separate Jobs 0.275 12.5 0 0 16 16 32 8 24 32 40 8 24 0 0 40 Number of Cores Used Number of Cores Used

**Events/sec/core vs Number of Cores** 

Measurements done using reconstruction with 64bit software, raw data, reading and writing to local disk

Measure total number events processed divided by the sum of the time taken by all cores Ignores edge effects of startup and shutting down

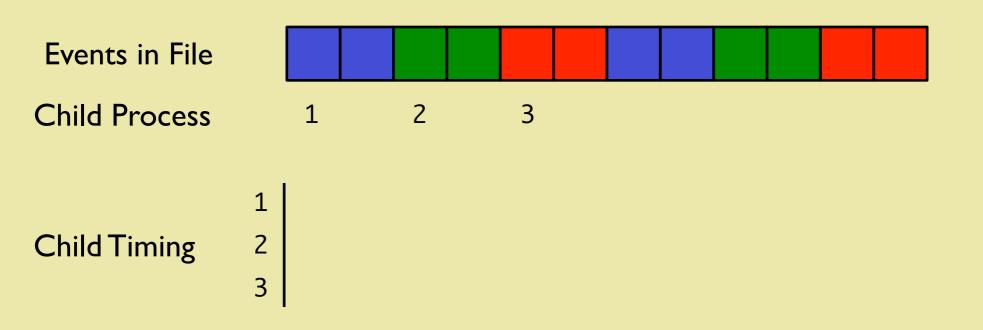






The framework does pre-assigned round-robin event distribution with each child assigned N concurrent events to processes

E.g. with 3 children each told to do 2 concurrent events



The way events are distributed to the children affects how close in time all the children end work, i.e. dispersion

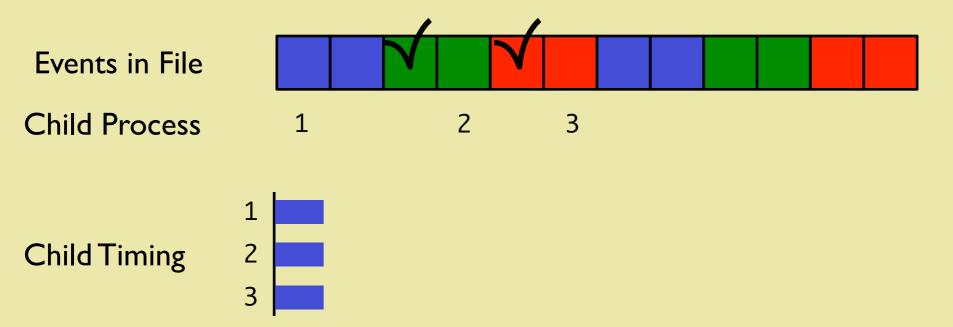
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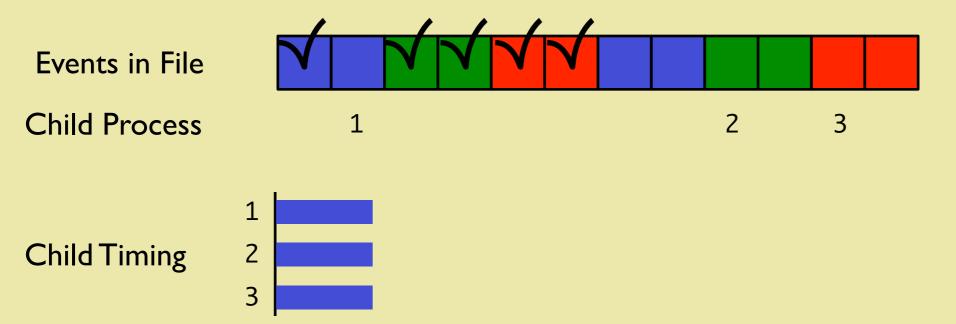
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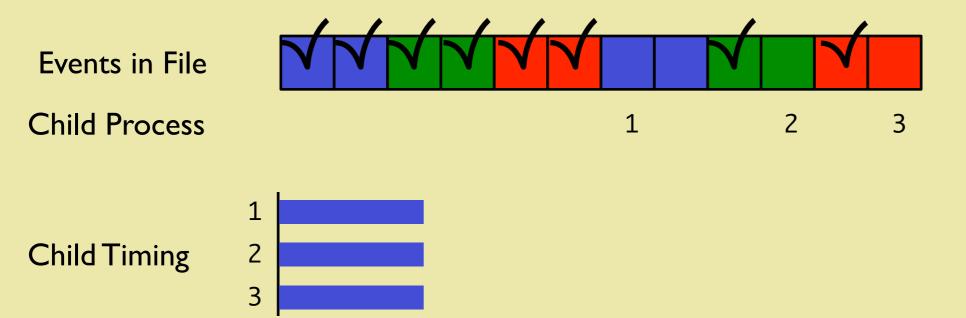
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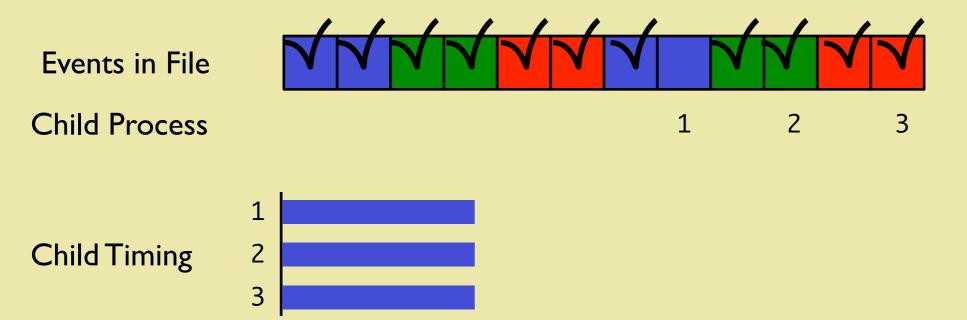
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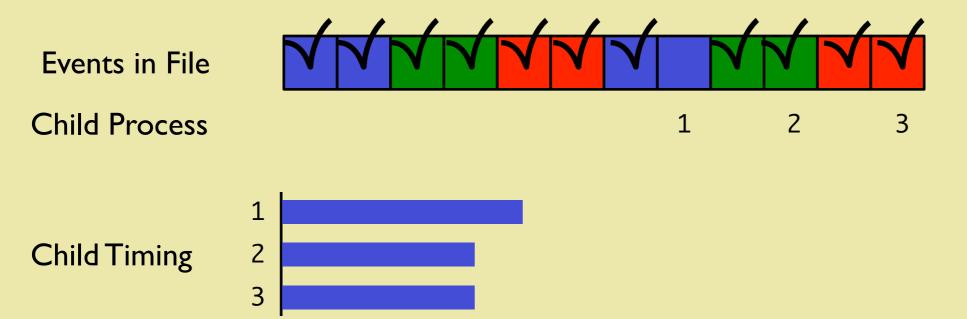
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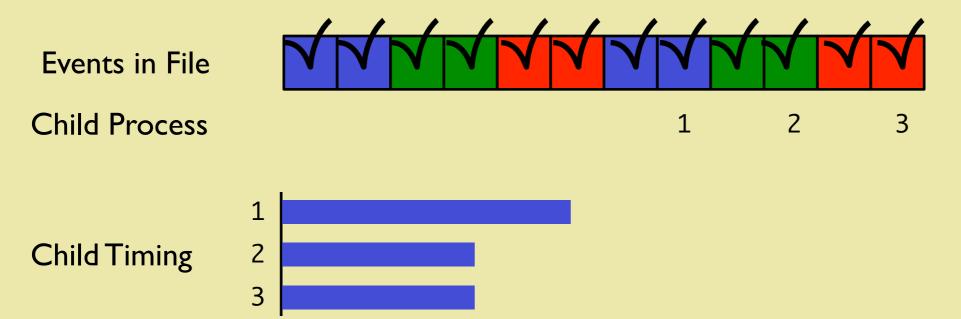
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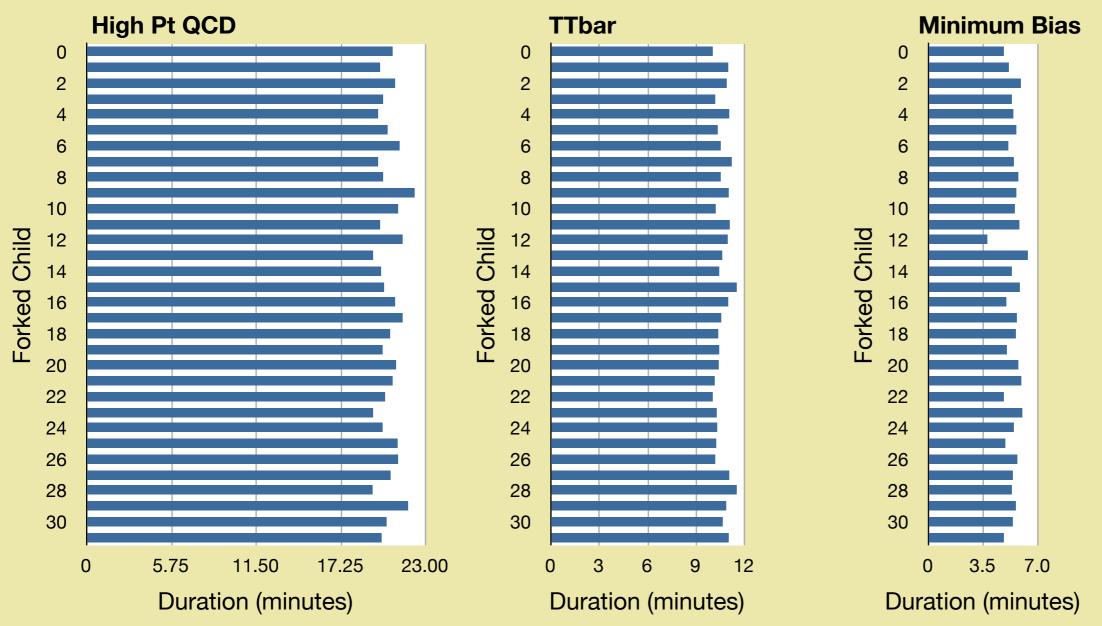
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Time Dispersion MC



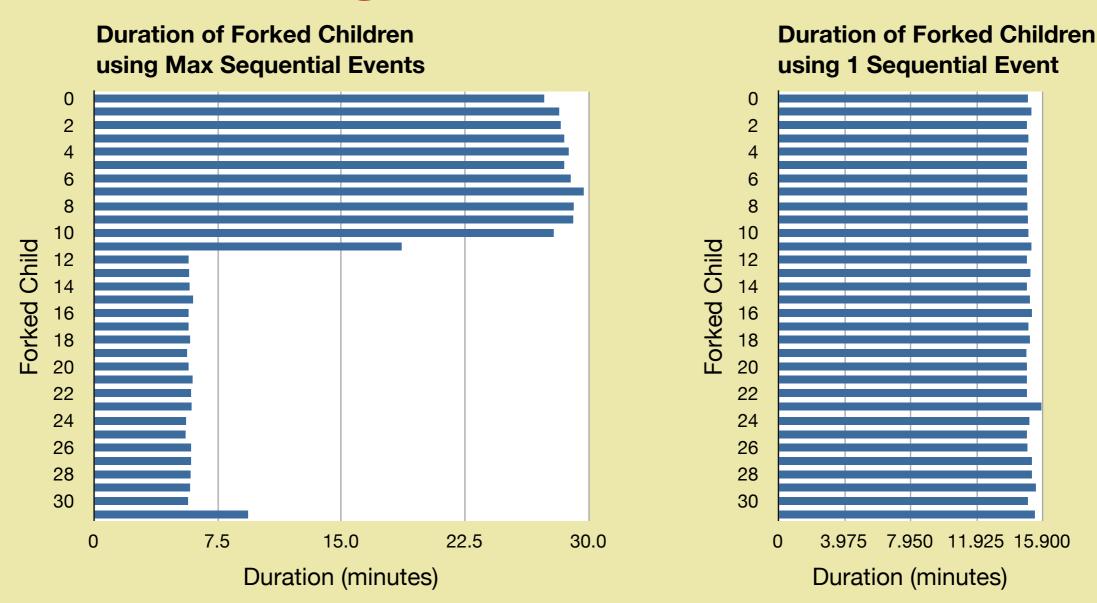
**Duration of Forked Children For Reconstruction** 



Reco MC works reasonably well with max sequential # events High Pt QCD utilization: 0.92 TTbar utilization: 0.92 Minimum bias utilization: 0.85 Multi-core Aware Applications in CMS 14

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Some RAW files have 'bigger' events at beginning of file The output files from the fast children are half the size of the files from the slow children Utilization of max sequential events: 0.38 Utilization of 1 sequential event: 0.95 Multi-core Aware Applications in CMS 15 CHEP 2010

### Event Distribution



Large N (concurrent events) helps with input efficiency ROOT has a read-ahead cache so large N means more cache hits Measurement with N = max with 32 children Average total read operations/sec after startup: 6.2 ops/s Average read size after startup: 600kB Measurement with N = I with 32 children Average total read operations/sec after startup: 156 ops/s Average read size after startup: 25kB Minimum N should probably be around (cache size)/(average event size in the file)

Max size N (#events/#cores) aids in merging of result file Can merge output files in order and get back event ordering of original input file

Large N can lead to large dispersion if event characteristics change over the length of the input file (i.e. with time)

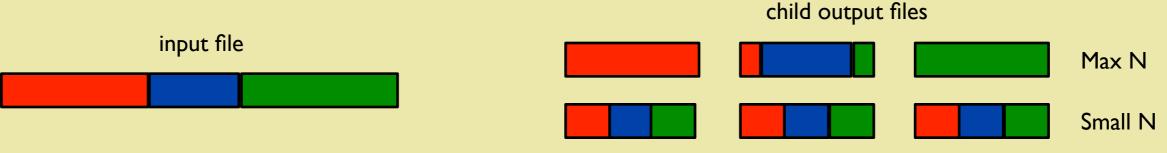
## Read Performance



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How reco file is merged affects input performance of analysis Merge step always takes the same amount of time regardless of event ordering Output files are just concatenated together

Reason: framework always 'plays' events from same luminosity section contiguously Luminosity section is created every 23 seconds during data taking If events from same lumi are scattered through a file, file reads will be 'random' RECO with max consecutive events read-via-cache: 5900 MB RECO with 1 consecutive event read-via-cache: 750 MB



NOTE: color denotes luminosity section

Optimum is to keep events from same Lumi together Order of events in Lumi does not matter

#### Planned solution:

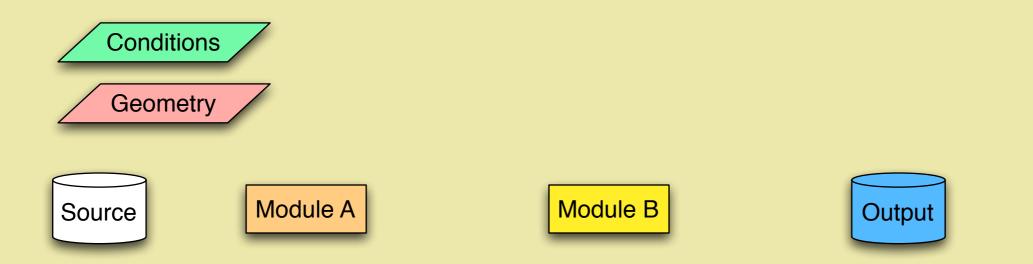
Each child writes one temporary file per lumi section Merge job reads the temporary files in lumi section order





Threading an application should allow greater event throughput with nearly the same memory footprint

Simplest change would be to run modules in parallel Assumes Module A not dependent on results from Module B



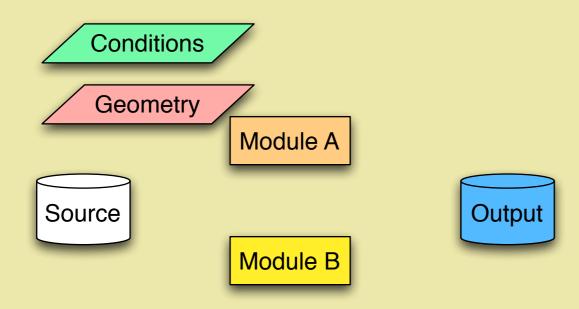






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Average time each module takes to process an event What modules create data used by another module Already recorded by framework

#### Calculation

Sort module's by start time end time of last to stop dependent module Last module's end time is estimated parallel processing time for 1 event Gives # of concurrently running modules per time period





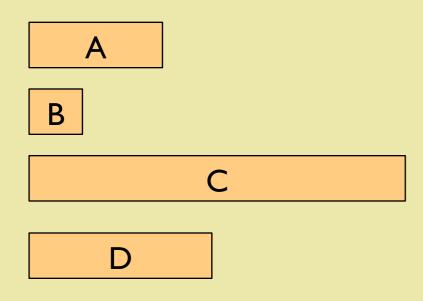


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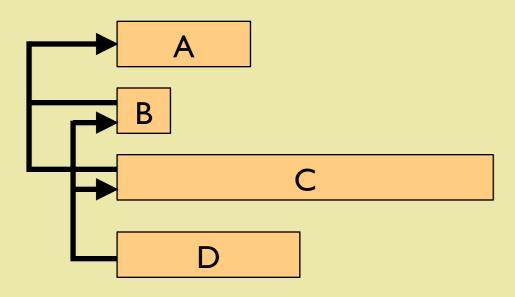




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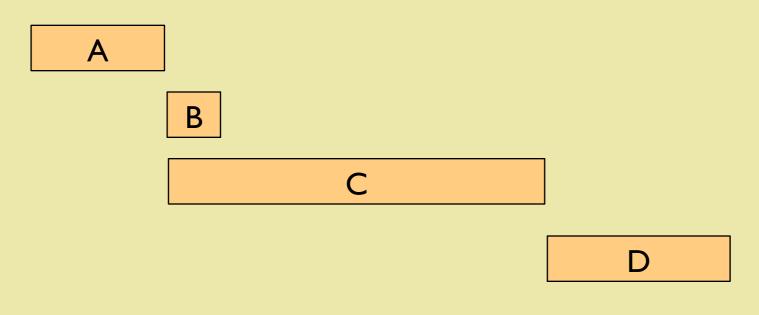
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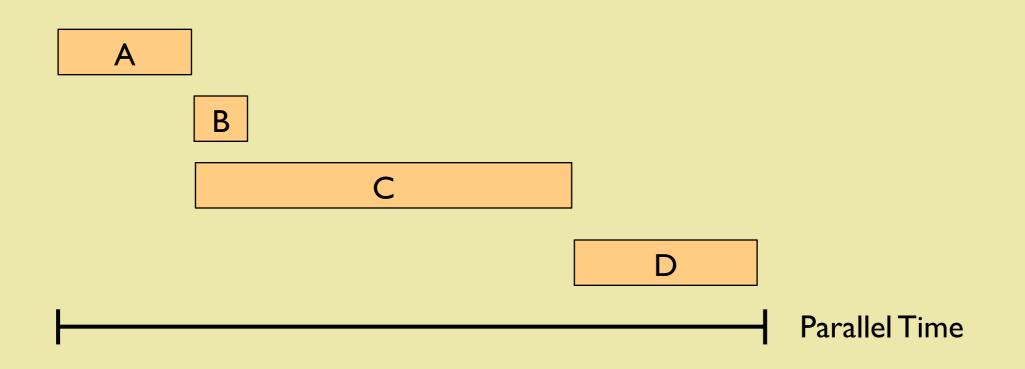
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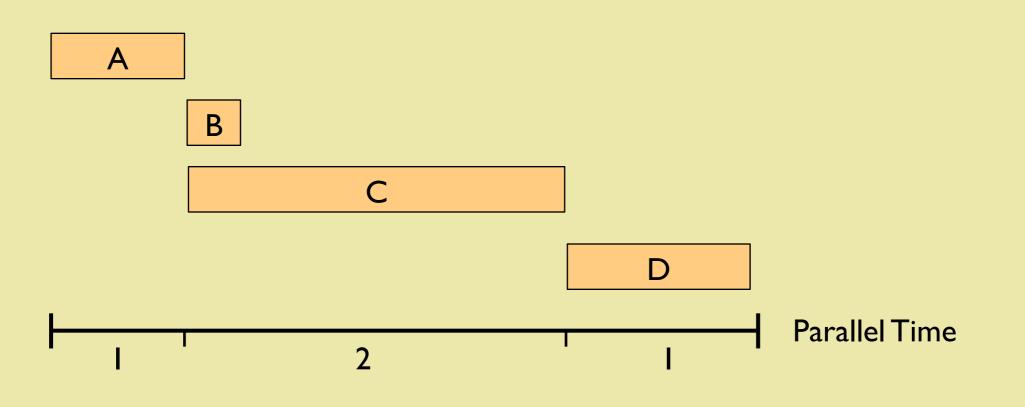
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Reco Samples Used



Minimum Bias Quickest to processes and most prevalent

T Tbar Middle of the road complexity

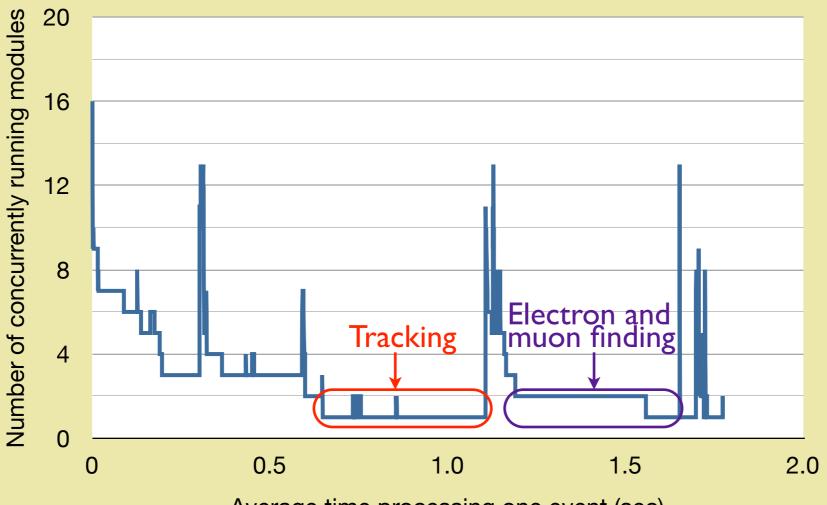
High Pt (3.0 - 3.5TeV) QCD Most complex and slowest to process







#### Number of Running Modules vs Time for TTBar RECO



Average time processing one event (sec)

Short periods of high parallelism Extended periods of only 1 or 2 modules running

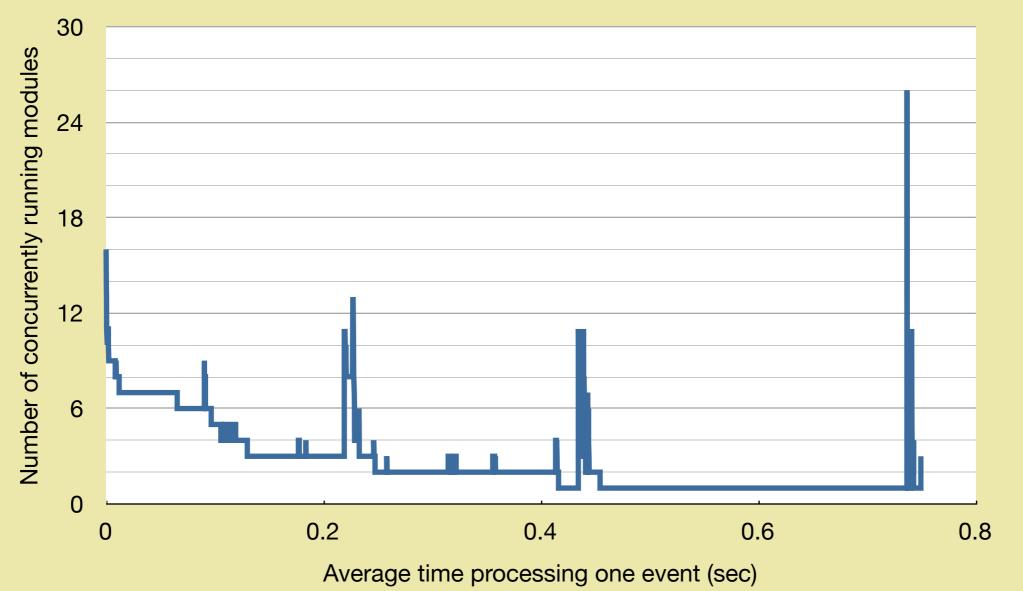
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#### Number of Running Modules vs Time for Minbias RECO

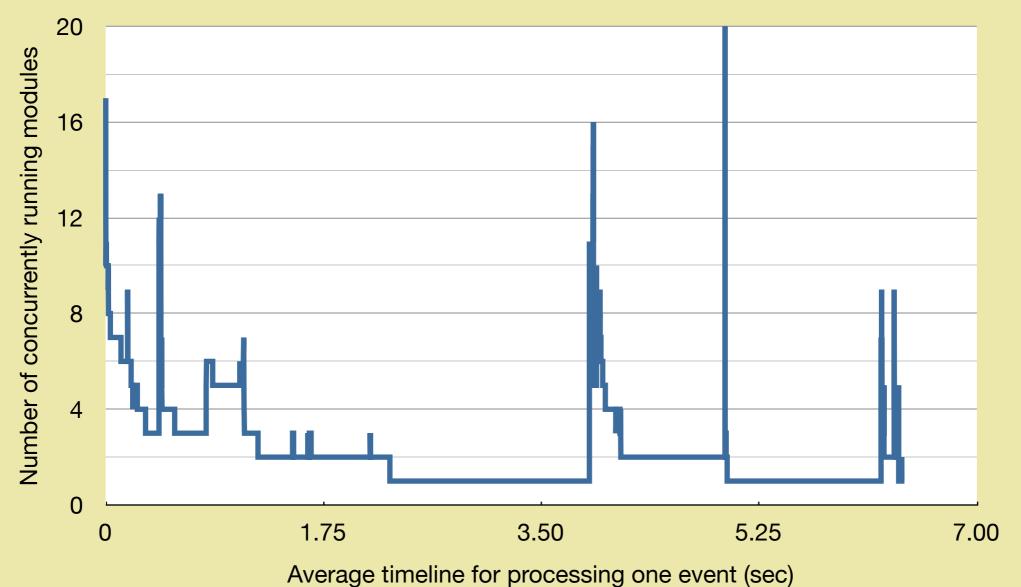








Number of Running Modules vs Time for High Pt QCD RECO







Event Type	Max number of threads	Average number of threads
Minimum bias	26	2.64
T Tbar	16	2.62
High Pt QCD	20	2.19

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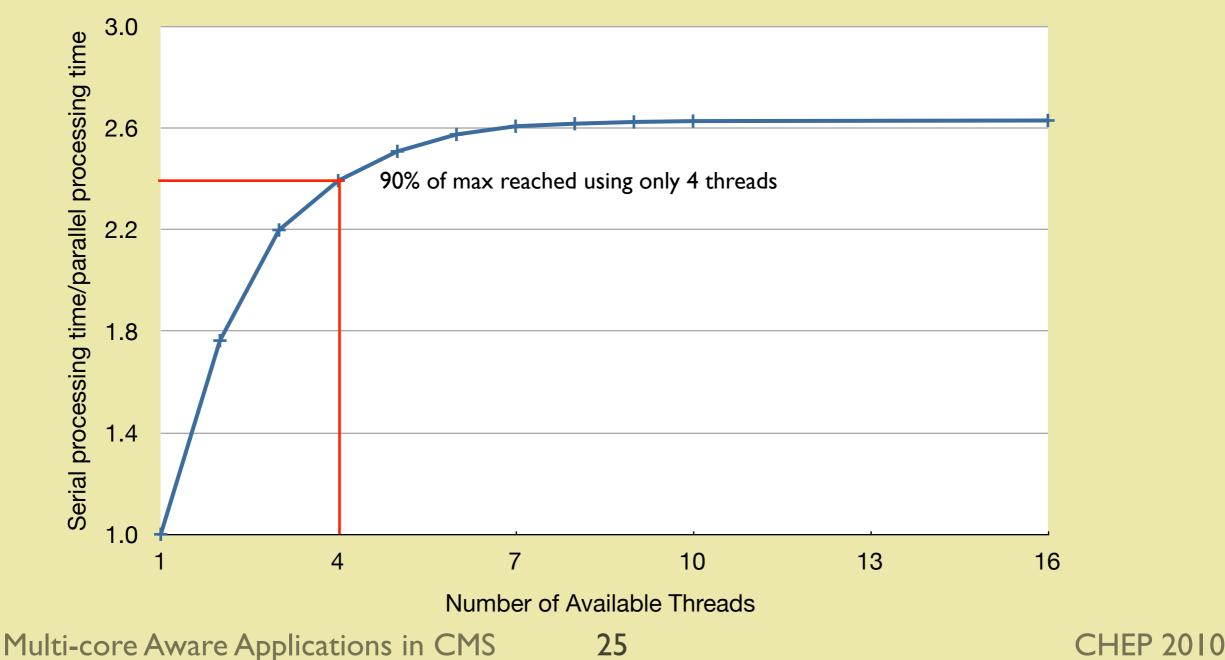
CMS





Previous estimates assumed infinite number of available threads

Assume module processing time scales with #modules/#threads



**TTbar Speedup vs Number of Cores** 

# Conclusion

## CMS

#### Forking

 Provides good memory sharing Saving 21 GB when running 32 children
The simplest event splitting per children is fine for MC but inefficient for data Need more analysis to determine what event splitting to use for children to get good I/O
Event order in merged file must be controlled to guarantee good analysis read performance Splitting reco output on luminosity section boundary should be sufficient

## Threading

Future may require using cores to speed up the processing of a single event Present decomposition of algorithms not conducive to high parallelization Work needed to make present code thread safe is beyond the potential gains

## For now and the near future, forking provides the best benefits