Processing Petabytes per Second with the ATLAS Experiment at the Large Hadron Collider in CERN GPU Technology Conference 2010

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University of Edinburgh

22nd September 2010







### Outline

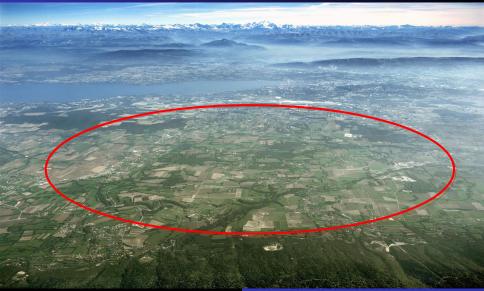
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  - The Higgs Boson
- Areas of study for GPGPU adoption
  - Particle tracking in a magnetic field
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  - The Level 2 Trigger
  - The Z finder algorithm
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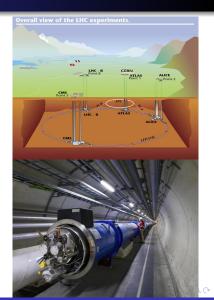
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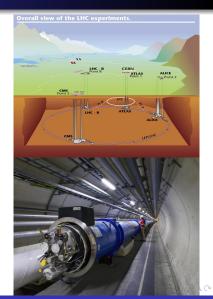




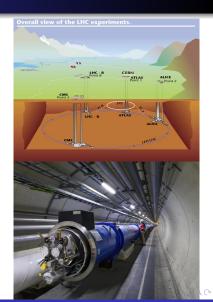
 World's largest collider (27 km circumference)



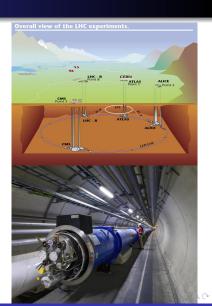
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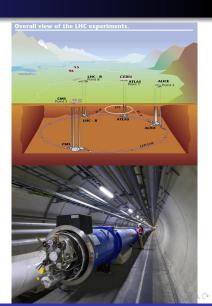
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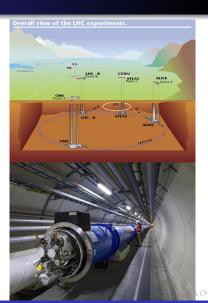
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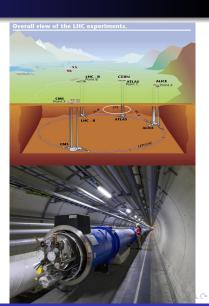
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# Attracted Large Media Interest

Large Hadron Collider will not turn world to goo, promise

Stephen Hawking: Large Hadron Collider vital for humanity -  $_{The}$ Telegraph

scientists - Times Online

Is the world about to go out with a bang? - The Herald

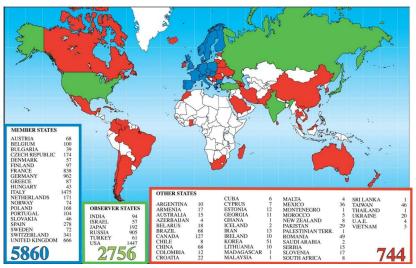
Large Hadron Collider becomes world's most powerful particle accelerator - The

End of the world due in nine

days - The Sun

The ATLAS experiment: up and atom... - Times Online

## Global CERN project (~10,000 scientists & engineers)



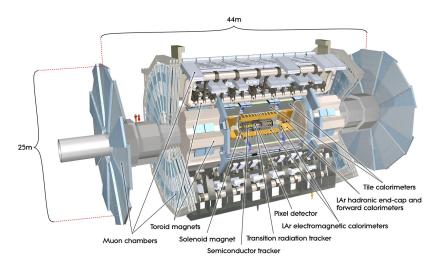
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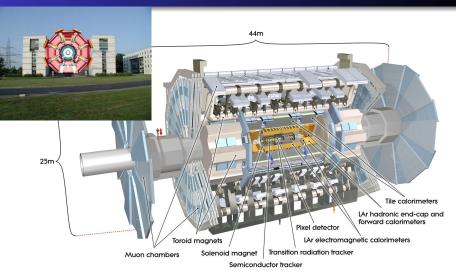
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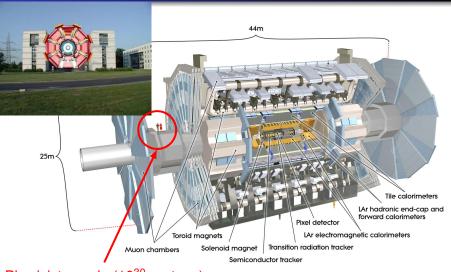


# Two of the LHC collision points

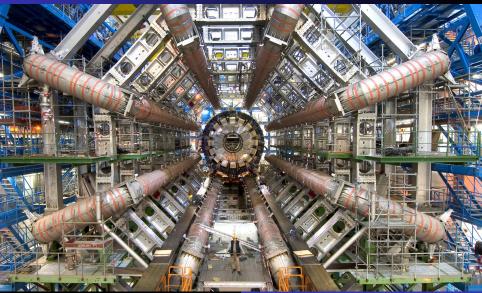


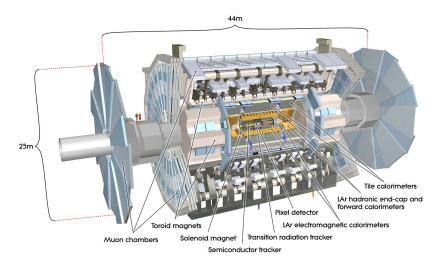


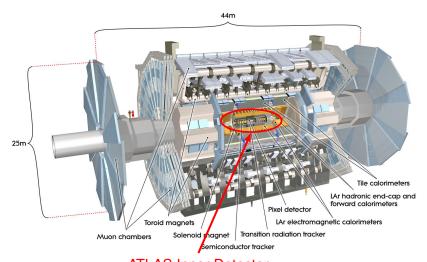




Physicist couple (10<sup>30</sup> protons)

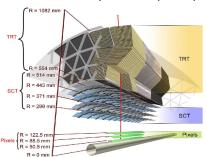






#### The ATLAS Inner Detector

#### Detector hits provide space points, used to track particles



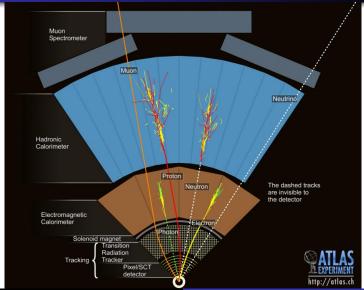
- Pixels pin-point the particle production vertex
- 80 million readout channels!



- SCT provides large area tracking: 61 m<sup>2</sup> silicon
- 6.3 million readout channels



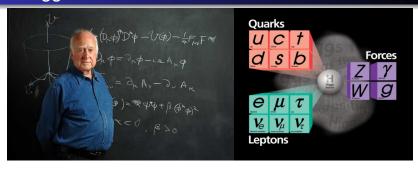
### A slice of the detector



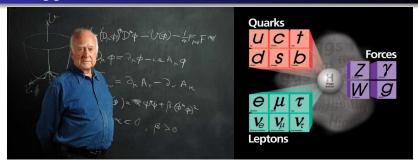
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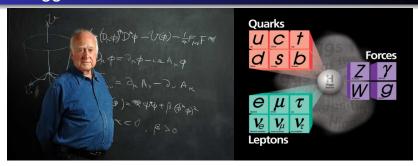




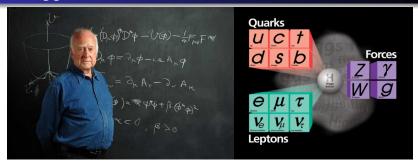
Particle physics (Standard Model): extremely successful



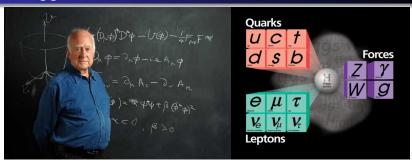
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- Requires a new type of particle to exist: the Higgs boson

The Large Hadron Collider (LHC)
The ATLAS detector
The Higgs Boson

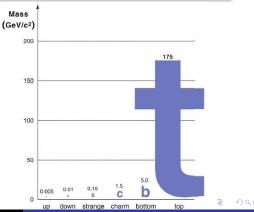
## Hunting for the Higgs boson

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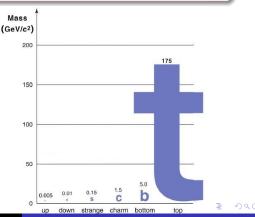


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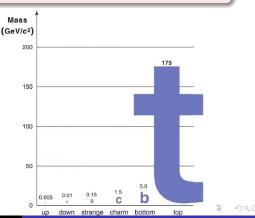


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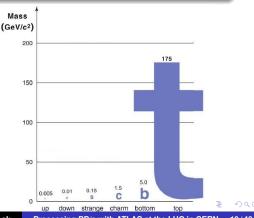


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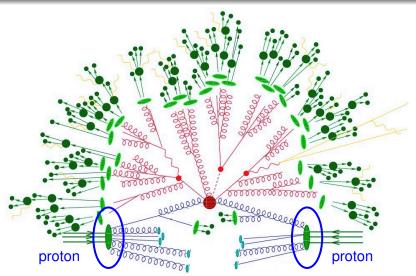
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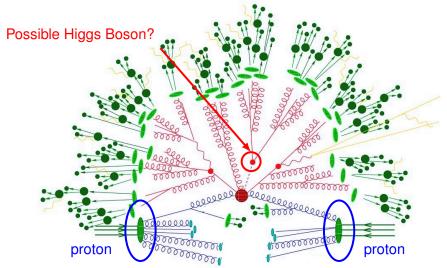
- Physicists have searched for decades, but it has not yet been found.
- The LHC will have sufficient energy to produce it, if it exists.
- Conclusively



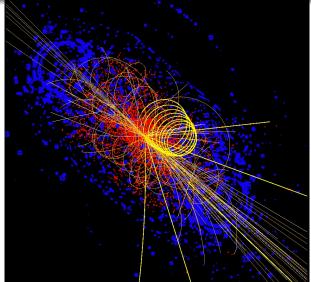
### LHC collision process



# LHC collision process



#### A simulated Higgs boson event



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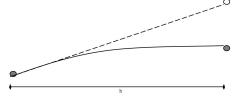
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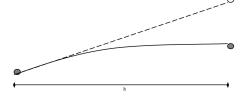


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- Charged particles bend in the magnetic field
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$$\mathbf{F} = m\mathbf{a} = q \cdot (\mathbf{E} + \mathbf{v} \times \mathbf{B})$$

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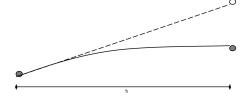
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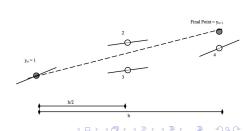
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 Solve the differential equation with 4th order Runga Kutta Integration





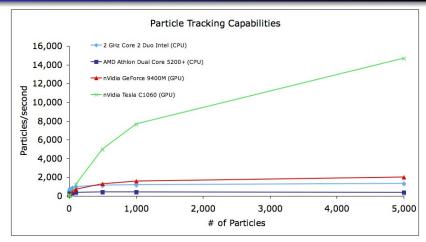
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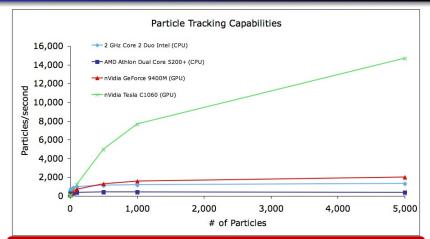
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- Next stage was to do many particle tracks in parallel...

# Magnetic Field Integration results



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#### Preliminary results (Tesla C1060)

Rapidly achieved a factor 32 speedup (more in progress)

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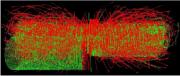


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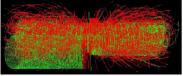
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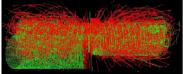


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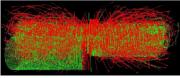


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#### The ATLAS Trigger

The solution is to select (trigger) events of interest

Selection algorithms must be very fast & massively parallel

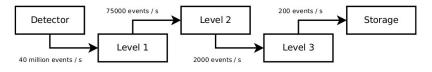
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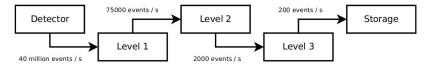
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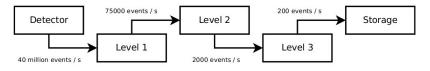
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# The software (high-level) trigger farm

 Level 2 and Level 3 triggers collectively called the high-level trigger (HLT)



Figure: L2 supervisors, event builder, data logger

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- Around 1000 PCs (XPU: Interchangeable processing unit (i.e. Level 2 or Level 3)



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# The software (high-level) trigger farm

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- For our GPGPU studies we decided to study algorithms that are run in the Level 2 (Z finder and Kalman filter)



Figure: L2 supervisors, event builder, data logger

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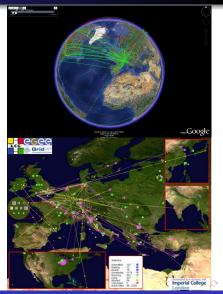
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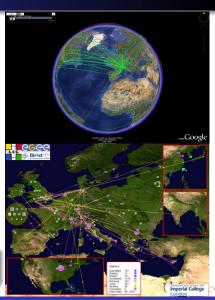
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Up to eight million events simulated daily

Failure rate is less than  $10^{-6}$ 

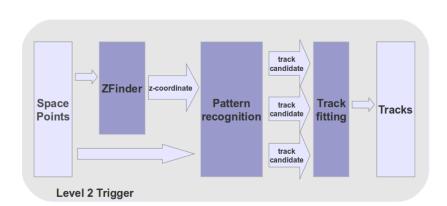


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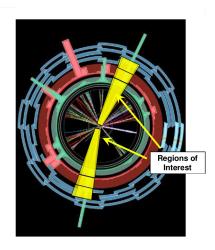
# Level 2 Trigger Routines



# The Level 2 regions of interest (ROIs)



- We take a cross-section view of the detector
- Break it up into regions of interest (ROIs)
  - i.e. "phi slices" ( $\phi$  coordinate)
- Candidate for parallelisation using GPUs



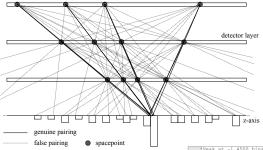
Cross section view of the ATLAS detector

### Outline

- Introduction to the LHC and ATLAS
  - The Large Hadron Collider (LHC)
  - The ATLAS detector
  - The Higgs Boson
- Areas of study for GPGPU adoption
  - Particle tracking in a magnetic field
  - The ATLAS trigger and data acquisition
  - The worldwide LHC computing grid
- Using GPUs in the high level trigger
  - The Level 2 Trigger
  - The Z finder algorithm
  - The Kalman Filter

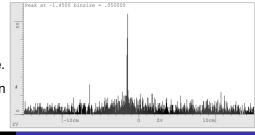


# The Z Finder Algorithm



 Process each combination of detector hits ("spacepoints") and extrapolate back to the beam line.

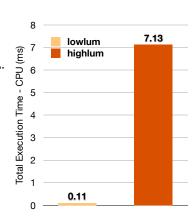
 The histogram peak is the chosen interaction point.



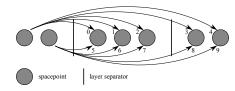
# Z Finder Algorithm Test Case

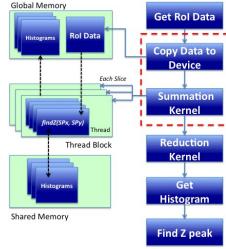
- Z Finder code extracted from ATLAS framework for feasibility studies with CUDA.
- Timing performance measured using two samples of simulated events (low and high luminosity).
- Comparison of Tesla and Fermi architectures for each code iteration.

	lowlum	highlum
Spacepoints	333	8104

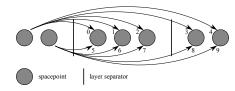


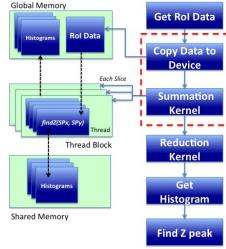
- Single thread per  $\phi$  slice.
- Thread block per  $\phi$  slice
- Histogram per thread block in shared memory.
- Improve spacepoint pair allocation method.



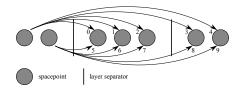


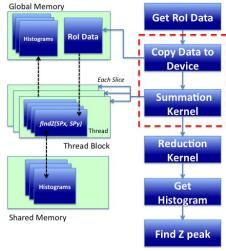
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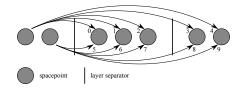


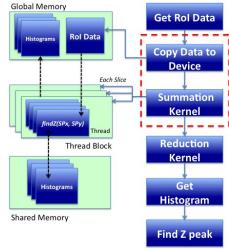
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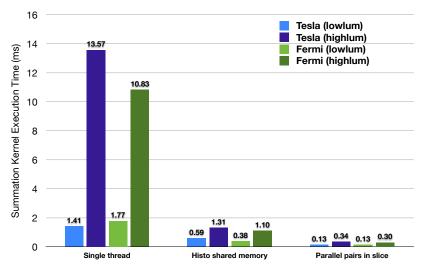


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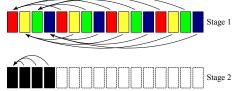


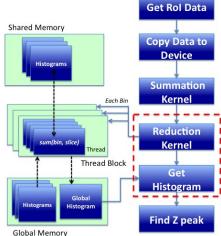
# **ZFinder Kernel: Histogram Summation Results**



# **ZFinder Kernel: Histogram Combination**

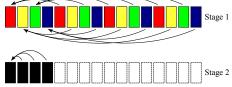
- Combine histograms on the GPU ⇒ reduce data transfer by ~500x
- Reduce the data to a single histogram in multiple steps.

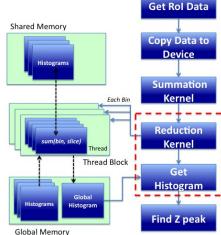




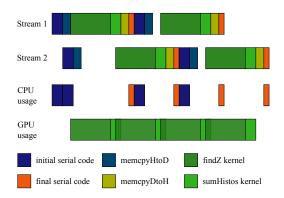
# **ZFinder Kernel: Histogram Combination**

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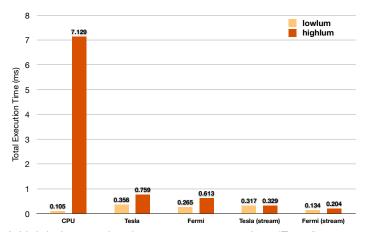
# Z Finder Kernel: Streaming



- Each Rol calculation independent ⇒ use CUDA streams.
- Successful in disguising any host to device transfer latency.



## Z Finder Kernel Results



- Initial timing results show up to 35x speed up (Fermi).
- Performance studies continuing with triplets of spacepoints.

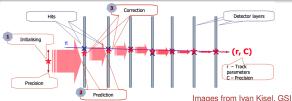


### Outline

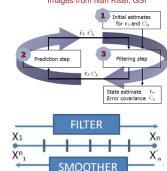
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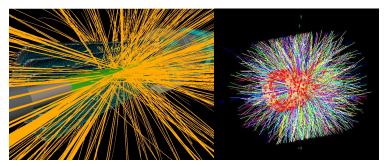
### The Kalman Filter



- Particle tracks reconstructed using the Kalman filter method.
- The trajectory of a track is predicted using detector hits as input.
- A backward smoothing filter is applied after the final Kalman Filter estimation.



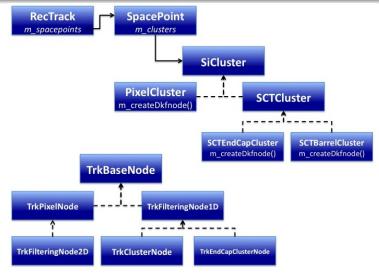
## **GPU Motivation for Track Reconstruction**



ATLAS simulations of high luminosity events

- Potentially thousands of tracks to process for every event.
- Significant acceleration possible by reconstructing one track per GPU thread.

## ATLAS Kalman Filter Framework



### **Initial Complications**

- Class inheritance structure captures filter specialism for each sub-detector.
- Dynamic creation of objects in the main routing
- Track state retained at each filtering step
- Main routine has over 2000+ lines of code with multiple branches.

- Standalone version successfully ported to C
- Pre-allocated memory needed for track objects
- Promising results ⇒ need to reduce memory usage.



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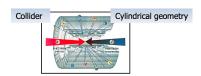


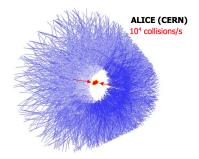
### Kalman Filter Potential

 Our present Kalman Filter could be modified.

#### GPU benefits at other experiments

- Kalman Filter port to CUDA (GSI Scientific Report 2008, FAIR-EXPERIMENTS-38)
- ALICE TPC HLT code GPU based / Future PANDA TPC code
- GPUs to be used for STS (Silicon Tracking System) within CBM (Compressed Baryonic Matter) experiment at FAIR/GSI.





## Summary

- The ATLAS trigger, particle tracking & simulation algorithms are key places where GPUs can be used to improve performance.
- Preliminary results show substantial performance.
  - Initial 32x speed-up for parallel RK4 integration.
  - With optimisation up to 35x speed up for Level2 Z Finder.
  - Initial port of OO based Kalman Filter algorithm.

#### Further information



SIMT design of the High Level Trigger Kalman Fitter



Porting the Z-finder algorithm to GPU ATLAS Edinburgh GPU Computing



LHC and ATLAS papers 2008 JINST 3 S08003

Thanks to Peter Jenni, Iain Longstaff for material.

Thanks to NVIDIA for their support

