# <sup>1</sup> Multi-threaded software framework development for <sup>2</sup> the ATLAS experiment

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#### Abstract.

ATLAS's current software framework, Gaudi/Athena, has been very successful for the experiment in LHC Runs 1 and 2. However, its single-threaded design has been recognised for some time to be increasingly problematic as CPUs have increased core counts and decreased available memory per core. Even the multi-process version of Athena, AthenaMP, will not scale to the range of architectures we expect to use beyond Run2.

ATLAS examined the requirements on an updated multi-threaded framework and laid out plans for a new framework, including better support for High Level Trigger use cases, in 2014. In this paper we report on our progress in developing the new multi-threaded task parallel extension of Athena, AthenaMT.

Implementing AthenaMT has required many significant code changes. Progress has been made in updating key concepts of the framework, allowing different levels of thread safety in algorithmic code. Substantial advances have also been made in implementing a data flow centric design, as well as on the development of the new 'event views' infrastructure. These event views support partial event processing and are an essential component to support the High Level Trigger's processing of certain regions of interest. A major effort has also been invested to have an early version of AthenaMT that can run simulation on many core architectures, which has augmented the understanding gained from work on earlier ATLAS demonstrators.

#### 34 1. Introduction

Recent developments in microprocessor technology have underlined the trends that have been identified since the mid-2000s: that while the density of transistors on CPUs has continued to rise more or less exponentially (Moore's Law[1]), clock speeds have stalled (Figure 1).

The fundamental limitations of clock speed, which are thermal in origin, underline that the next challenges for computing are almost entirely based around power efficiency. This drives new

40 generations of CPU designs, which are both low power and have low memory per CPU core.

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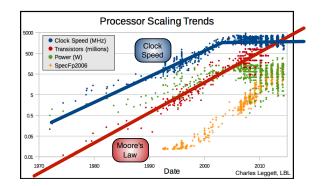


Figure 1. Scaling of key characteristics of microprocessors since 1970 [2].

In addition to the challenges posed by these constraints, increasing application performance
 today means taking advantage of advanced CPU features, such as multi-cores and wide vector
 registers.

In this paper we describe how ATLAS experiment [3] at CERN is adapting to the software challenges from this technological evolution.

# 46 2. The Athena Framework

The ATLAS software framework, Athena[4], which is based on the Gaudi framework[5], was designed in the early 2000s. Thus it predates the stall of single core clock speed and is firmly based on a serial processing model. In spite of that, it has successfully processed billions simulated and collider events and played a key role in the discovery of the Higgs Boson[6] and hundreds of other ATLAS observations made during LHC Run1, from 2009 to 2012.

During LHC Run2, 2015 to 2018, increasingly difficult processing conditions have been 52 overcome with the deployment of a multi-process version of Athena, AthenaMP[7]. This uses a 53 multi-process model, where after initialisation multiple AthenaMP worker processes are forked 54 to run the event loop. This allows the sharing of the memory pages allocated for large static 55 structures, such as detector geometry and magnetic field, between worker processes, taking 56 advantage of the Linux kernel's copy on write feature. However, there are limitations to how 57 much memory can be saved in this fashion – the change of a single bit will result in an entire 58 memory page being unshared, and C++'s memory model does not allow for fine control over 59 which data objects are assigned to which physical pages. In addition, the further evolution 60 of the LHC machine will increase the complexity of the events that ATLAS will observe and 61 the physics goals of ATLAS necessitate in increase in the data taking rate of the experiment. 62 This increase in event complexity and event rate will be a huge challenge for the experiment, in 63 regards to the memory and CPU requirements of reconstructing events. 64

# 65 3. Future Framework Requirements

Aware of these challenges ATLAS launched a study group, the *Future Framework Requirements Requirements Task Force* in 2014. This group's report summarised the main requirements and
recommendations of the software processing framework that ATLAS would deploy for Run3,
2021 to 2023:

The increasingly difficult memory per core environments in the future would require ATLAS
 to develop a *multi-threaded* framework, in order to maximise memory savings.

• That such a framework should endeavour to provide advanced capabilities, such as event processing in partial regions of the detector, so that the ATLAS online and offline frameworks could share code and development effort even more than was possible in Runs1 and 2.

That a continued development of multi-threading in the Athena framework offered the best chance of success, as, for a running experiment, continuity of operations had to be ensured and disruptive breaks in code continuity would be prohibitively expensive in development and validation effort.

• That in order to be able to exploit the largest range of practical memory and processor options the future framework should foresee exploiting parallelism both at the event level (multiple events processed at once) and the sub-event level. The sub-event parallelism is further divided into inter-algorithm parallelism, directly managed by the framework when algorithms can run independently; and intra-algorithm parallelism, where an algorithm itself exploits opportunities for concurrency.

# 86 4. AthenaMT

 $_{\rm 87}~$  In the wake of the future frameworks report, the collaboration launched a development effort

towards its future framework, which has been christened AthenaMT (Athena Multi-Threaded).

<sup>89</sup> Here we report on some of the main design discussions and conclusions that have been reached <sup>90</sup> on the framework, as well as on early performance tests.

# 91 4.1. Underlying Components

As AthenaMT envisages exploiting parallelism at many levels, including triggered by an 92 algorithm itself, it is important that threading is therefore coordinated across the execution 93 of a program. If each component started its own thread pool the machine's resources would 94 easily become over-contended, affecting memory footprint and throughput. Such a problem is 95 far better suited to a task-based library model than one where thread control is delegated to 96 components. It is also more suited to task queues than loop based parallelism, as much of the 97 available parallelism is from unrelated tasks executing on different events or parts of an event. 98 For the moment the choice has been made to base our threading on the Intel Threaded Building 99 Block library[8]. 100

# 101 4.2. Framework Components

Gaudi's original component model and state engine included a number of features that were 102 used heavily in ATLAS software, but prove to be problematic in a multi-threaded environment. 103 One of these was the concept of a *public tool*, which was a single Tool instance shared by multiple 104 algorithms. Such tools in ATLAS were frequently used to store data locally, which would be 105 passed between algorithms, which worked fine when the algorithm execution order was fixed 106 and events were processed sequentially. However, in the multi-threaded case, when algorithms 107 may be processing different events, such a design pattern breaks down. In addition a data 108 dependency between these algorithms has been hidden from the scheduler, which may execute 109 algorithms in the wrong order. 110

In order to overcome this problem, public tools will be removed from the framework. All tools will be *private* to algorithms and communication between algorithms must go via the event store *service*. It is worth pointing out that services in multi-threaded Gaudi will be event context aware, where as algorithms and tools will be only aware of the event that they are currently processing. Then, developers will be required to migrate public tools to private tools or to services, which ever is more appropriate.

A model of how AthenaMT components process within a single event is shown in Figure 2.

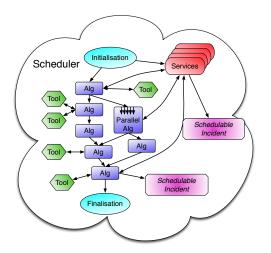
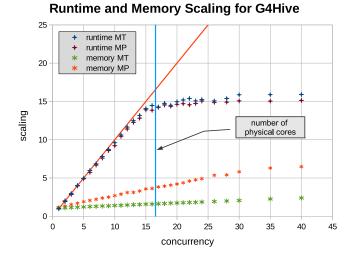


Figure 2. Framework elements involved in the processing of a single event in AthenaMT.



**Figure 3.** Event throughput and memory scaling comparing AthenaMP (multi-process) and AthenaMT (multi-threaded) approaches for ATLAS simulation.

### 118 4.3. Cloneable and Re-entrant Algorithms

- For algorithms themselves we now envisage three classes, expressing different levels of thread safety:
- Legacy A legacy algorithm can only have one instance and can only process one event at a time; if more than one event wishes to use a legacy algorithm the scheduler is forced to pause them.
- Cloneable A cloneable algorithm can have multiple instances, each one of which can be used
   to process a different event; however, as each clone is a separate instance, memory usage is
   increased for cloneable algorithms.

Re-entrant A re-entrant algorithm has a single instance, but can be used to process multiple
 events simultaneously; such algorithms are ideal for both lowering memory consumption
 and for increasing throughput, but are the most difficult to program as their execution has
 to be thread safe.

Re-entrant algorithms also put design requirements onto the data handle implementation (data handles declare data dependencies and provide access to event store data), as the algorithm's execute method has to be const.

#### 134 4.4. Event Views

In order to support the requirement of the ATLAS High Level Trigger, which selects events in 135 the online system, it is necessary to process only certain regions of interest, which have been 136 flagged by the ATLAS level 1 trigger. To do this, AthenaMT will support *Event Views*, which 137 encapsulate only part of the event data. Development of these views is ongoing, but early 138 prototypes supported the idea of the views themselves being objects within the main event 139 store. Further, the prototype views interface has been made the same as any other ATLAS data 140 proxy, thus algorithms can be made to use a view without any special coding required. Thus the 141 goal, to share algorithmic code between online and offline systems is well on the way to being 142 accomplished. Proper integration with the scheduler is underway. 143

## 144 4.5. Time Varying Data

Time varying data, such as detector conditions, currently relies heavily on Gaudi *incidents*, 145 which trigger the retrieval of data when the algorithm or tool that requires some conditions 146 data finds it is processing an event which is out of the current *interval of validity* (IOV). This 147 blocks a thread while such data is retrieved and does not work well when events being processed 148 may themselves cross IOV boundaries. In AthenaMT, conditions data will be considered as a 149 normal data input to an algorithm, albeit using a different store, supporting multiple IOVs at 150 once. Then conditions data will always be present before an algorithm that needs it is allowed 151 to execute. 152

### 153 5. AtlasG4 Multi-Threaded

Although many pieces of AthenaMT are still under design and development, many simpler test cases and prototypes have been evaluated in order to validate the approach that has been adopted. This started with GaudiHive[9] prototypes, which demonstrated good scaling with limited LHCb reconstruction. An ongoing ATLAS prototype aims at developing a multithreaded version of ATLAS simulation, suitable for running on Intel's Xeon Phi architecture, where memory is severely constrained. Results from these tests, shown in Figure 3, demonstrate both excellent throughput and memory scaling.

#### <sup>161</sup> 6. Summary and Conclusions

To face the challenges of future computing, with severe power and memory limitations, ATLAS 162 has started to develop a new multi-threaded processing framework, AthenaMT. As well as 163 supporting multi-threading, partial event processing in regions of interest will support HLT use 164 cases better. Prototypes of this framework have already demonstrated excellent throughput and 165 memory scaling. Many other aspects of the framework are being prototyped and implemented 166 now. However, a huge migration effort will be required to port ATLAS's 3 million lines of C++ 167 code to the new framework in time for Run3, and for this a substantial training effort and design 168 review will also be required. 169

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