

# The ATLAS Event Service: A New Approach to Event Processing

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**Abstract.** The ATLAS Event Service (ES) implements a new fine grained approach to HEP event processing, designed to be agile and efficient in exploiting transient, short-lived resources such as HPC hole-filling, spot market commercial clouds, and volunteer computing. Input and output control and data flows, bookkeeping, monitoring, and data storage are all managed at the event level in an implementation capable of supporting ATLAS-scale distributed processing throughputs (about 4M CPU-hours/day). Input data flows utilize remote data repositories with no data locality or pre-staging requirements, minimizing the use of costly storage in favor of strongly leveraging powerful networks. Object stores provide a highly scalable means of remotely storing the quasi-continuous, fine grained outputs that give ES based applications a very light data footprint on a processing resource, and ensure negligible losses should the resource suddenly vanish. We will describe the motivations for the ES system, its unique features and capabilities, its architecture and the highly scalable tools and technologies employed in its implementation, and its applications in ATLAS processing on HPCs, commercial cloud resources, volunteer computing, and grid resources.

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## 1. Introduction

The ATLAS experiment [1] has accumulated to date a globally distributed data volume in excess of 160 Petabytes, processed at a scale of about 4M CPU-hours/day at about 140 computing centers around the world. Even with this massive processing scale the experiment is resource limited. The ATLAS physics program can be substantially enriched by applying more computing resources, particularly to Monte Carlo simulation to enable the deeper exploration of rare



38 physics channels through a better understanding of their backgrounds. In the future, computing  
39 resources will be even more constraining: the LHC and ATLAS upgrade programs over the next  
40 decade will bring an order of magnitude increase in computing requirements. For these reasons  
41 it is essential that the Collaboration makes maximal and efficient use of all available processing  
42 resources.

43 Opportunistic processing resources have a large potential for expanding the ATLAS  
44 processing pool. High performance supercomputers (HPCs), cost-effective clouds such as the  
45 Amazon spot market [2], volunteer computing (ATLAS@Home) [3], and shared grid resources are  
46 all promising sources. It is characteristic of such resources that job slot lifetime is unpredictable,  
47 variable and may be very short (or very long); exploiting them fully and efficiently requires  
48 adapting to this characteristic. HPC workloads should adapt to the scheduling opportunities  
49 that these systems afford, namely the gaps between large parallel jobs; these systems are  
50 nominally full all the time with such jobs but just as a full jar of rocks has room for a lot of  
51 sand, there is room on such systems for fine grained adaptive workloads. On commercial clouds  
52 it is the Amazon spot market model that is most cost-effective, and workloads on these dynamic  
53 market-driven resources must be robust against instantaneous loss of the node. Similarly on  
54 shared grid resources, which often impose preemption, and on volunteer computers which can  
55 disappear at any moment. We describe here a new fine grained approach to event processing  
56 that is largely motivated by these considerations, the ATLAS Event Service.

## 57 **2. The ATLAS Event Service**

58 The ATLAS Event Service (ES) is designed to open opportunistic resources to efficient  
59 utilization, and to improve overall efficiency in the utilization of processing and storage. The ES  
60 implements quasi-continuous event streaming through worker nodes, enabling full and efficient  
61 exploitation through their lifetime whether that is 30 minutes, 30 hours, or 30 seconds from now,  
62 with no advance notice. The ES achieves this by decoupling processing from the chunkiness of  
63 files, streaming events into a worker and streaming the outputs away in a quasi-continuous  
64 manner, with a tunable granularity typically set to 15 minutes or so. While the worker persists,  
65 it will elastically continue to consume events and stream away outputs with no need to tailor  
66 workload execution time to resource lifetime. When the worker terminates for whatever reason,  
67 losses are limited to the last few minutes, corresponding to a single event when the task is  
68 ATLAS Monte Carlo simulation. The approach offers the efficiency and scheduling flexibility of  
69 preemption without the application needing to support or utilize checkpointing.

70 The Event Service also has benefits for conventional processing on clusters and grids.  
71 Processing resources can be reassigned in a quick and agile way, e.g. to transition quickly from  
72 single to multi-core, avoiding inefficiencies from resource draining, because the ES can vacate a  
73 resource at any time with negligible losses. Predicting job duration in order to tailor jobs to a  
74 slot lifetime is a subject of much detailed study, often with imprecise results; the ES makes such  
75 predictions unnecessary. The ES also does away with couplings between input file size, output  
76 file size, and job duration, allowing them to be independently tailored.

77 The Event Service is designed to bring efficiencies in storage utilization as well as processing.  
78 Storage is the largest cost component in ATLAS computing, making continuous improvement in  
79 storage efficiency an essential complement to expanding processing resources. The available disk  
80 storage volume is not going to scale with the processing in coming years, it is too expensive. The  
81 ES improves storage efficiency by driving down the need for data replicas through the efficient  
82 use of wide area network (WAN) data access, thus decoupling processing from data locality  
83 requirements. Data retrieval across the WAN is fully asynchronous to the processing in the  
84 ES design, avoiding inefficiencies from WAN latencies. Data access in the ES is designed to  
85 be mediated by the Event Streaming Service (ESS) capable of providing additional efficiency  
86 measures such as utilizing local cache preferentially over WAN access, and marshaling data sent

87 over the WAN to limit data transferred to what is actually needed by the application. The ESS  
88 is a work in progress, not yet part of the deployed Event Service.

89 Crucial to the ES's agility in vacating resources with negligible losses is the fine grained  
90 streaming of outputs (and bookkeeping metadata) off the resource in near real time. This  
91 results in outputs that are many (one for every 15 or so core-minutes) and small (typically a few  
92 MB or less). They must be sent to a (generally remote) store that is fast, highly scalable and  
93 efficient in handling small objects. Object stores are an ideal technology, and are the basis of ES  
94 output management. The Event Service automatically merges outputs into conventional ATLAS  
95 data files when ES jobs complete. Promptly streaming away outputs has further benefits in  
96 minimizing local storage needs, making outputs quickly available to users, and avoiding outputs  
97 being trapped on storage local to the processing when it becomes temporarily inaccessible, a  
98 common problem on the grid.

### 99 **3. Architecture and Implementation**

100 In its workflow aspects the Event Service builds principally on three ATLAS core software  
101 systems: the PanDA distributed workload manager [4], PanDA's new JEDI extension [5] for  
102 flexible dynamic workflow management (part of the new ATLAS production system Prodsys2  
103 [6]), and the AthenaMP [7] parallel offline framework. PanDA operates by autonomous pilot  
104 jobs [8] harvesting resources by launching in job slots and requesting to a central PanDA service  
105 for the dispatch of work. The PanDA server manages a coherent global queue of ATLAS  
106 production and analysis work to be performed, and allocates work to requesting pilots based on  
107 intelligent brokerage and the characteristics of the resource. The JEDI extension enables PanDA  
108 to dynamically partition and manage workflows down to fine event level granularities, managing  
109 the associated bookkeeping in PanDA's Oracle back end database. PanDA and JEDI manage  
110 the workflows in a fully automatic way, from high level task specifications defined by physicists  
111 through partitioning and executing the work on dynamically selected resources, merging results,  
112 and chaining subsequent downstream processing. The payloads launched by PanDA for the ES  
113 are instances of AthenaMP; its parallel capabilities are used to manage the distribution and  
114 processing of events concurrently among parallel workers. The HPC implementation of the ES  
115 benefits from the BigPanDA project that has extended PanDA's operation to HPCs [9].

116 In its dataflow aspects the Event Service relies on the ATLAS event I/O system's support for  
117 efficient WAN data access [10], the uniform support for xrootd based remote data access across  
118 ATLAS [11], highly scalable object stores for data storage that architecturally match the fine  
119 grained data flows, and the excellent high performance networking fabric on which the success  
120 of LHC computing has long been built.

121 The Event Service architecture is shown schematically in Figure 1, and its present realization  
122 in ATLAS is shown in Figure 2. Event Service processing begins with the dispatch of an ES  
123 job from PanDA to the pilot placing the job request. Receiving the ES job, the pilot goes  
124 into event processing mode, entering an event loop in which new event ranges to process are  
125 requested every few minutes. In the target architecture the event list is passed to a data fetcher  
126 that interacts with an Event Streaming Service (ESS) to acquire the data, from local cache if  
127 available, otherwise over the WAN. The fetch is asynchronous with the execution of the payload,  
128 AthenaMP in the present instance. However, in the initial implementation, the data fetch is  
129 done within AthenaMP itself, via direct read to local or remote files (using a locator token  
130 obtained from an event indexing service), and does not use the still-to-be-implemented ESS.

131 Parallel workers managed by AthenaMP consume events and produce outputs in an area  
132 monitored by an output stager service. As new outputs appear every few minutes per worker,  
133 the stager uploads them to an object store (presently at BNL [12] or CERN) and informs  
134 PanDA of the completion. PanDA uses JEDI's event level bookkeeping to keep track of the  
135 processing, marking events as finished or failed. Failed or timed out events are reassigned to

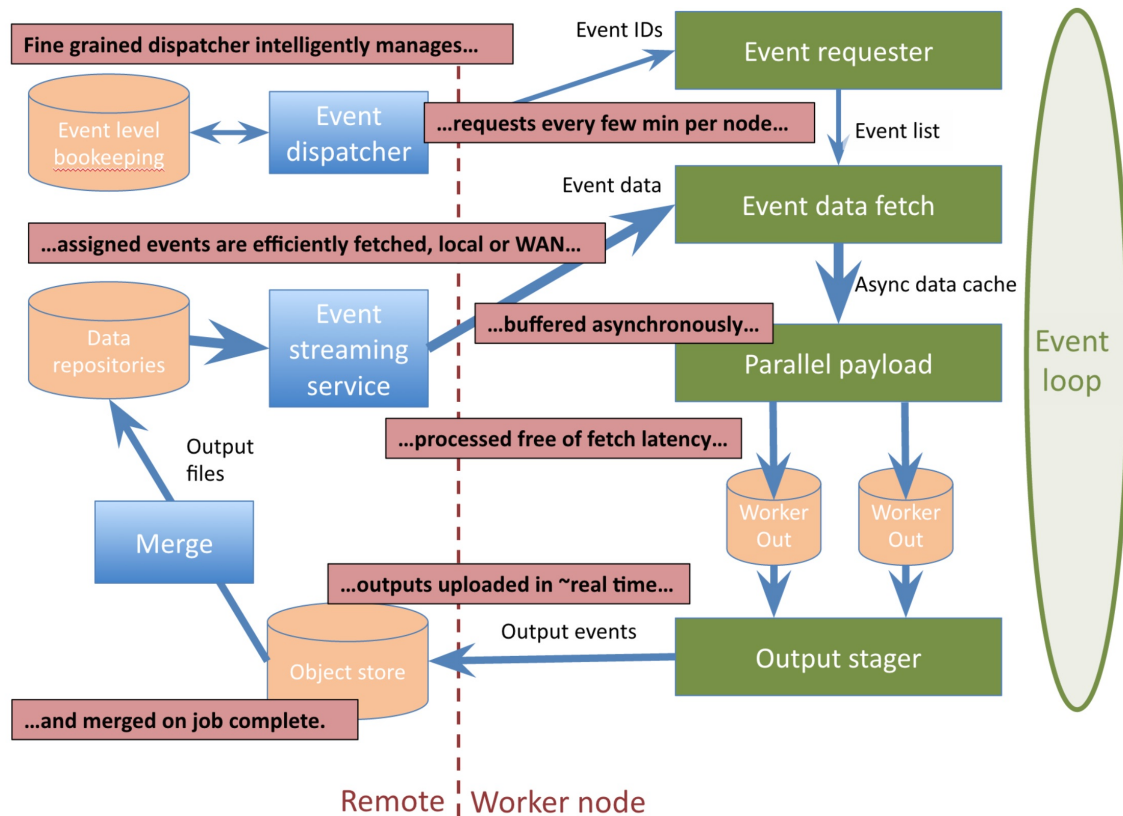


Figure 1. A schematic view of the ATLAS Event Service architecture

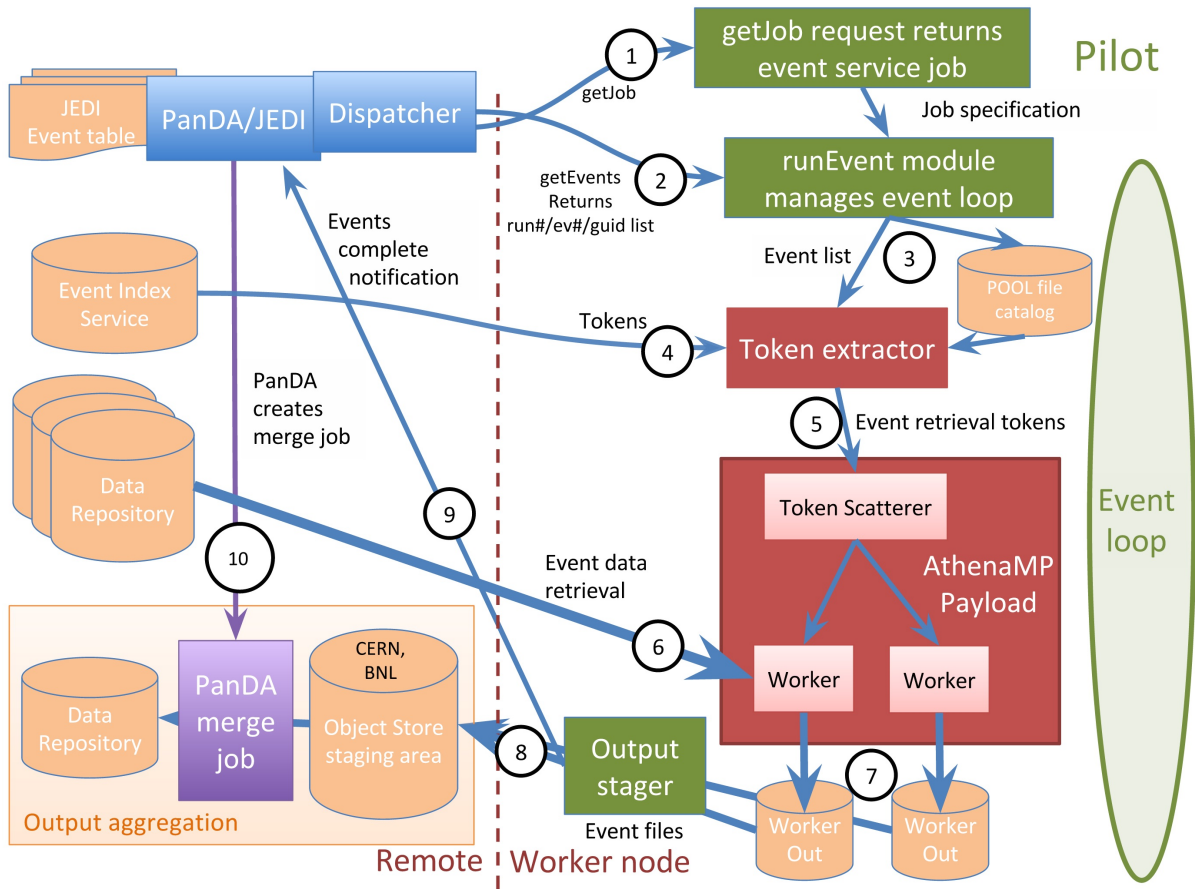
136 other workers. In this way a job advances towards completion, flexibly consuming whatever  
 137 resources are available as expressed through pilots acquiring slots and requesting work. PanDA  
 138 detects when all events for a job are successfully processed, and triggers a merge job that merges  
 139 the small object store resident outputs into conventional ATLAS files, with whatever granularity  
 140 is desired for the final output files.

141 A specialization of the Event Service for HPCs, Yoda [13], was developed to accommodate  
 142 the particular features of HPC architectures, most notably the lack of outbound access from  
 143 worker nodes. Yoda is a miniaturization of the PanDA/JEDI event workflow management to  
 144 operate within the HPC itself, with MPI replacing HTTP communication. Yoda's master/client  
 145 architecture allows tailoring of workloads automatically and dynamically to whatever scheduling  
 146 opportunities the resource presents – the sand filling the jar of rocks.

#### 147 4. Using the Event Service

148 The present and near term use case for the Event Service is in Monte Carlo simulation, the single  
 149 largest consumer of CPU in ATLAS at about 50% of all processing resources. MC is a relatively  
 150 simple, CPU-intensive payload that is amenable to operating on HPCs. Event Service based  
 151 simulation is operating on several opportunistic platforms, and will begin production operation  
 152 in Spring 2015.

153 Yoda was successfully demonstrated running ATLAS MC on NERSC's Edison supercomputer  
 154 [14] in a demo at Supercomputing 2014 (DOE booth) [15]. During ramp-downs to make room  
 155 for a large scheduled job or a maintenance shutdown, Yoda expanded into the resources freed  
 156 by the ramp, with negligible losses to the processing when the jobs were terminated by the



**Figure 2.** The present implementation of the ATLAS Event Service

157 scheduler. Yoda has demonstrated good scaling on Edison to 50k concurrent cores. Physics  
 158 validation is completed and production can begin once allocated time becomes available.

159 On the Amazon spot market, a collaboration between BNL, ESnet and Amazon is providing  
 160 the basis for large scale Amazon production, up to about 50k concurrent cores, supported by  
 161 an Amazon grant. The currently seven-fold cheaper cost of spot market machines relative to  
 162 on-demand brings them close to economic parity with owned resources, and the economics are  
 163 ever improving. The BNL ATLAS Tier 1 is able to elastically and transparently expand PanDA  
 164 resources into cloud resources, enabling peak usage to expand transparently into the cloud if  
 165 desired. Physics validation and production commissioning are expected to be completed on  
 166 Amazon in Spring 2015.

167 ATLAS has recently implemented a BOINC based ATLAS@Home volunteer computing  
 168 service [3]. The Event Service is well suited to the volunteer computing environment because it  
 169 is accommodating of machines disappearing suddenly, results are streamed off incrementally and  
 170 so cannot be trapped locally, and there is no need to shape job duration to unpredictable job slot  
 171 lifetimes. Mechanisms to secure PanDA based processing in the ATLAS@Home environment  
 172 have been implemented and the Event Service port is underway, expected to complete in Summer  
 173 2015.

174 Concurrently with these efforts on opportunistic platforms, the ES is also being readied for  
 175 simulation production on the ATLAS high level trigger farm (a cloud based resource where rapid

176 switch-over between online and offline usage is a requirement) and conventional grid resources.  
177 If production experience with the ES is good, it is expected to become the predominant means  
178 of running MC production.

## 179 5. Current and Future Development

180 The one element of the Event Service's design architecture that remains to be implemented is  
181 the Event Streaming Service as the basis for pre-fetching event data asynchronously from the  
182 processing. The ESS will decouple event data retrieval and its associated latency – substantial  
183 for WAN access – from the processing. Implementation of the ESS is in progress with a first  
184 version expected in late 2015. We envision the ESS evolving to become a sophisticated service  
185 on the Content Delivery Network model that intelligently applies knowledge of the data being  
186 requested, the locality and caching status of that data, its popularity and its replication patterns  
187 to marshal the needed data and deliver it to the client in as efficient a manner as possible. Such  
188 a service will be able to cope efficiently with sparsely sampled data and so will open the ES to  
189 analysis applications.

190 Extending the ES beyond Monte Carlo simulation production to reconstruction and analysis  
191 also requires work in the Event Service workflow at the pilot and payload levels, and in the  
192 event I/O to enable fine grained output partitioning for these processing modes. This work will  
193 proceed over the next year or so, with moderate priority because the greatest gains come from  
194 using the ES for Monte Carlo simulation.

195 Work is underway to extend Yoda operation to HPCs beyond NERSC, in particular to  
196 ORNL's Titan [16], where PanDA is being applied to harvest backfill resources opportunistically.

## 197 6. Conclusions

198 The ATLAS Event Service takes a new fine grained approach to event processing in order to  
199 make the most of the many varieties of opportunistic computing available to compute-limited  
200 science. Such resources typically reward agile, flexible workflows that can efficiently occupy  
201 potentially short lived job slots. The ES serves this scenario well, building on key enabling  
202 ATLAS software systems developed in the last two years. The ES is also designed to leverage  
203 WAN data access and high performance networking to economize on storage. The system is close  
204 to entering production on HPC, commercial cloud, grid and volunteer computing platforms.

205 The ES is a system designed for data intensive, network centric, platform agnostic computing,  
206 an increasingly important paradigm in scientific computing. The ES approach to fine grained  
207 processing can have benefit to any application able to partition its processing and data outputs  
208 to an appropriate granularity. The ATLAS ES team welcomes interest from others in prospective  
209 collaboration at any level, from sharing of ideas to trying out the implemented system.

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