

1 Analysis of empty ATLAS pilot jobs

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17 **Abstract.** In this analysis we quantify the wallclock time used by short empty pilot jobs on a
18 number of WLCG compute resources. Pilot factory logs and site batch logs are used to provide
19 independent accounts of the usage. Results show a wide variation of wallclock time used by
20 short jobs depending on the site and queue, and changing with time. For a reference dataset of
21 all jobs in August 2016, the fraction of wallclock time used by empty jobs per studied site
22 ranged from 0.1% to 0.8%. Aside from the wall time used by empty pilots, we also looked at
23 how many pilots were empty as a fraction of all pilots sent. Binning the August dataset into
24 days, empty fractions between 2% and 90% were observed. The higher fractions correlate well
25 with periods of few actual payloads being sent to the site.

26 1. Introduction

27 Central to ATLAS [1] distributed computing is the provision of resources on the Worldwide LHC
28 Computing Grid (WLCG) [2]. A pilot model is used to provision resources where a simple job
29 wrapper script is submitted to WLCG Computing Elements which then retrieve a job payload from the
30 ATLAS Workflow Management System (PanDA) [3]. This late-binding pull-model enables PanDA to
31 retain control of execution priority and improves reliability by protecting PanDA from ill-configured
32 compute resources.

33 The application responsible for submitting these pilot jobs is AutoPyFactory (APF) [4] and
34 ATLAS deploys a number of instances to provide the required scale and redundancy for reliable
35 operation of the pilot system. APF is capable of submitting excessive numbers of pilot jobs which
36 results in a job wrapper running on the resource without downloading a job payload. Such jobs are
37 called 'empty pilots' and present unnecessary load on the site infrastructure. Job starts and stops are
38 resource intensive for several core infrastructure services at sites, such as shared file systems,



39 Compute Elements (CEs), and Local Resource Management System (LRMS) head nodes. Large
40 numbers of very short jobs correspond to a high rate of job starts and stops, and can strain such site
41 services beyond their normal capacities.

42 In this paper we quantify the number of empty pilots and summarise the amount of wallclock time
43 used by empty pilots.

44 **2. Pilot submission in ATLAS**

45 ATLAS uses the AutoPyFactory application to submit and manage pilot jobs on the WLCG. About
46 600 resource endpoints are used at 160 sites. These are managed by 12 instances of APF to provide the
47 required redundancy and scalability. The global site resources have a diverse number of job slots
48 ranging from 100-10,000. APF provides a rich plugin system to moderate the number of pilots
49 submitted to each resource and balancing the need to keep sites occupied without over-subscribing the
50 smaller resources.

51 The plugins form a chain of logic taking input from the previous plugin and moderating the number
52 of pilots submitted based of the APF configuration. The plugins currently used are listed in Table 1.
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54 **Table 1.** List of plugins used by pilot factories

Ready	Checks the number of jobs ready to be run in the Workload Management Service (WMS), the number of previously submitted pilot still in idle state, and calculates the difference.
Scale	Multiplies by a factor the decision made by the previous plugin in the chain.
MaxPerCycle	Limit the maximum number of pilots to be submitted each cycle.
MinPerCycle	Limit the minimum number of pilots to be submitted each cycle.
StatusTest	Set number of pilots to submit when the WMS queue is in internal status test.
StatusOffline	Set number of pilots to submit when the WMS queue is in internal status offline.
MaxPending	Limit the number of pilots pending in the resource queue.

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56 The pilot factories actually submit a wrapper script (a shell script) to the compute resources and
57 this wrapper downloads the actual pilot code. The pilot code (written in Python) then contacts PanDA
58 and requests a payload to be run. This payload is a job running one of the many workflows found in
59 the ATLAS software framework.

60 **3. Identifying empty pilots**

61 We defined ‘empty pilots’ as those jobs submitted to WLCG resources which fail to retrieve a
62 payload from PanDA and are short. The definition of short is on the order of minutes but its precise
63 value is to be determined by examining the data. The ATLAS pilot does not persistently store
64 information about whether it receives a job payload or not so we need to combine logs from various
65 sources, as shown in figure 1.
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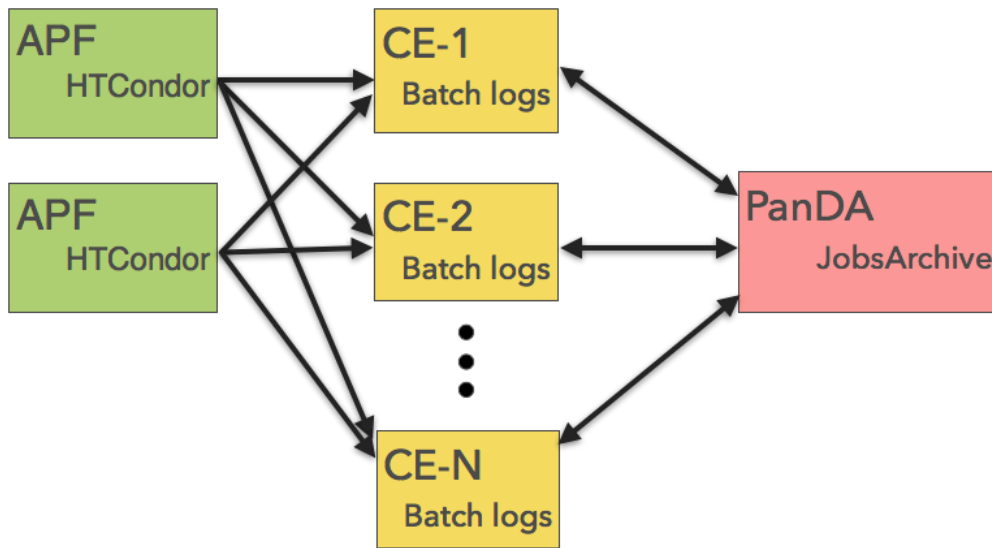


Figure 1 Source of log records from APF, Batch, and PanDA

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The following four methods may be used to identify empty pilots:

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1. Join APF job records with PanDA JobsArchive records
2. Join site batch records with PanDA JobsArchive records
3. Filter batch records using a CPU time and Wallclock time thresholds
4. Filter APF job records using a Wallclock time threshold

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The first method is capable of tagging jobs for all sites without information from the site itself. The second method requires collaboration from the site in order to obtain batch records and also collaboration from ATLAS to provide the JobsArchive records. The third method may be used by the site without collaboration from ATLAS. The fourth method requires no information from the site.

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A single calendar month (August 2016) was used to compare methods and evaluate the results across a number of sites.

86 4. Results

87 4.1. Classification of pilot behaviour

88 Exploring the combined data records we can identify various classes of pilot behaviour listed here:

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1. jobs having short cputime, short walltime, no payload (empty pilot)
2. jobs having short cputime, short walltime, with payload (short healthy job)
3. jobs having short cputime, long walltime, no payload (bad pilot)
4. jobs having long cputime, long walltime, with payload (long healthy job)

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In this study we are only concerned with the first class of job where the wrapper script passes through the compute infrastructure without processing a useful payload.

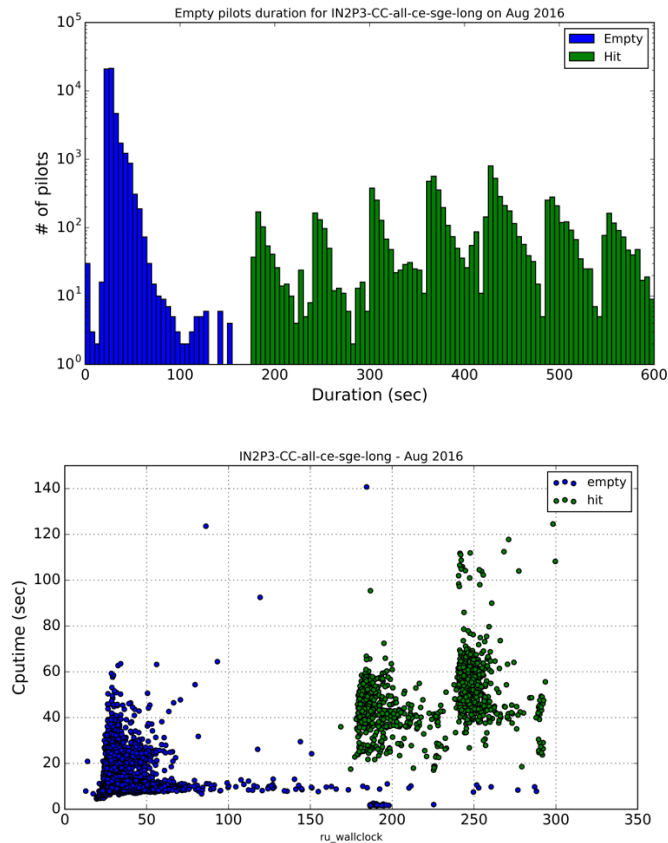
96 4.2. Site comparison with PanDA records for IN2P3-CC

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The batch system records at IN2P3-CC were combined with PanDA job records and each job was tagged 'empty' if the batchid was not found in the PanDA database. Plotting the distribution of job

99 duration with <1 hour wallclock time shows a clear distinction between empty and non-empty jobs
 100 (See figure 2.). The vast majority (99.5%) of empty pilots have a duration less than 60 seconds. The
 101 jobs with payload have cputime greater than 20 seconds for duration between 180-300 seconds.
 102 Therefore, we do not expect to have payload pilots with duration <180 seconds AND cputime <20
 103 seconds. This supports the use of Method 2 as a way to tag empty pilots.
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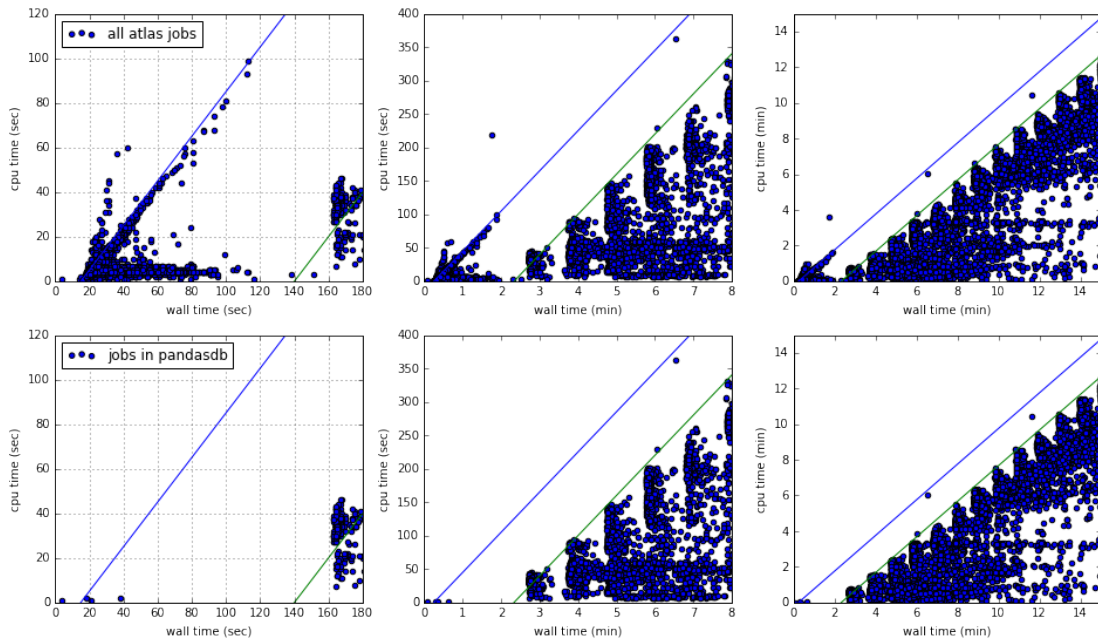
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106 **Figure 2** Distribution of wallclock and cputime for jobs run at IN2P3-CC. Empty jobs are tagged blue
 107 and jobs with payload are tagged green.
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109 *4.3. Site comparison with PanDA records for Nikhef*

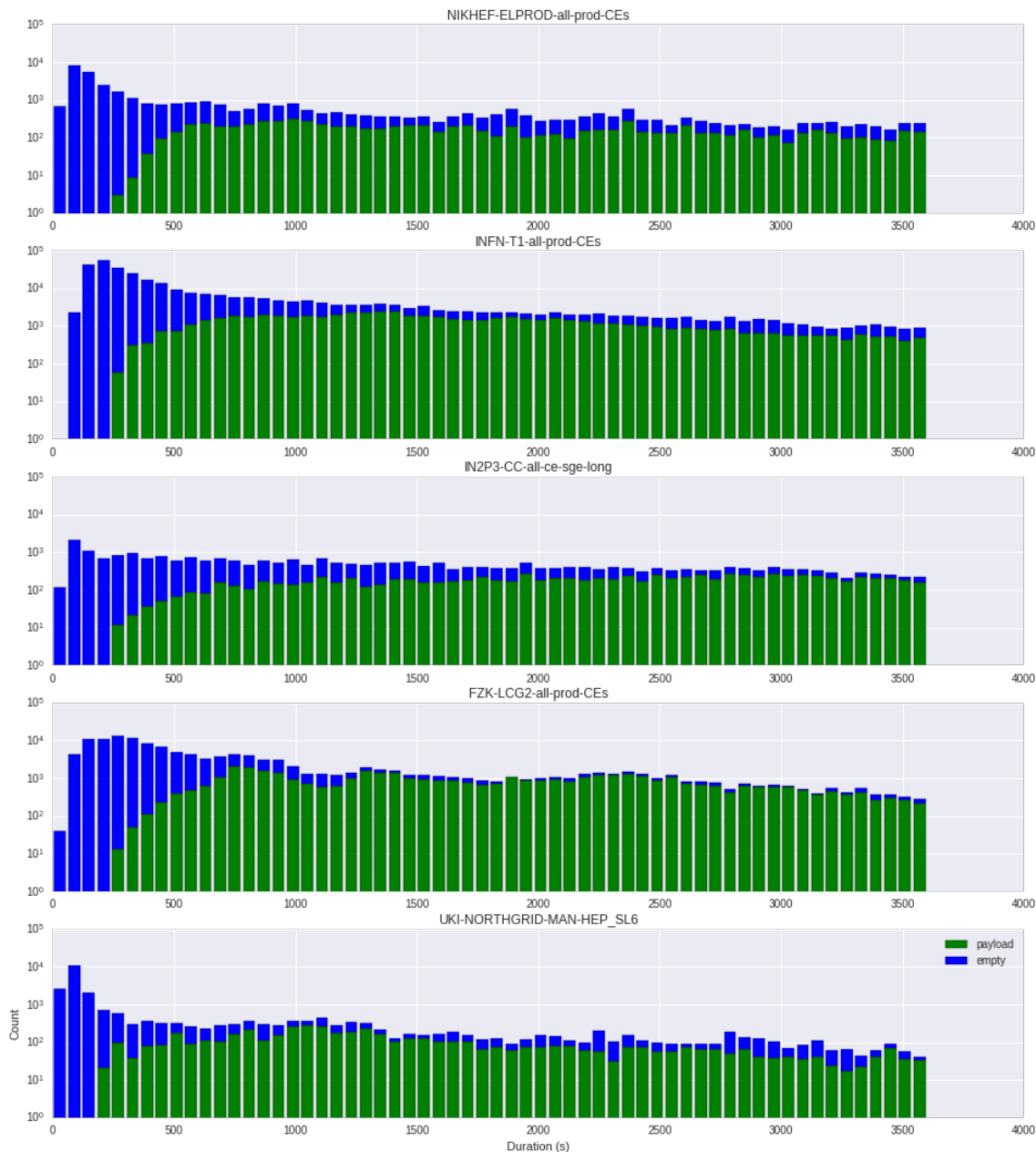
110 In a similar way to IN2P3-CC the batch system records from Nikhef were combined with PanDA
 111 records in order to identify jobs without payloads. In this case the CPU time and Wallclock time were
 112 correlated and clearly show the distinction between jobs with and without a payload. This result allows
 113 the CPU time threshold to be refined and supports the use of Method 3 as a way to tag empty pilots,
 114 but suggests that a cut on cpu time is not necessary (see figure 3).
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 117 **Figure 3** Correlations of cpu vs wall times for the August 2016 ATLAS dataset at Nikhef. The top
 118 panels from left to right show the dataset of all ATLAS jobs recorded in the Nikhef batch system at
 119 various time scales. The bottom panels show the same correlation, but only for those jobs found in the
 120 records of both the Nikhef batch system and PanDA. The blue and green lines follow prominent
 121 trends in the upper pane, and are replotted identically in the lower pane to aid comparison. The
 122 Nikhef+Panda (lower pane) plots are essentially empty for wall time < 160 seconds and essentially
 123 identical for wall time > 160 seconds, pointing towards "walltime < 160 sec" as a clean "empty pilot"
 124 tagging method.

125 *4.4. Comparison of sites using APF job records*

126 Figure 4 shows a comparison of five WLCG sites (NIKHEF-ELPROD, INFN-T1, IN2P3-CC, FZK-
 127 LCG2, MAN-HEP_SL6) where the distribution of job duration is shown for empty and payload jobs.
 128 The blue bars are empty jobs and the green bars are jobs with a payload as identified by PanDA
 129 records. The distributions have different features which illustrate the diverse behaviour at each site. In
 130 absolute terms NIKHEF and INFN-T1 have many more records tagged as empty pilots. The variation
 131 in empty job distributions between sites is expected due to the difference in available slots at each site
 132 and also the difference in workload for each ATLAS queue. The existence of empty (blue) jobs with
 133 duration >300 sec indicate this method is not clean when tagging empty jobs.
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 137 **Figure 4** Job duration distribution for five WLCG sites with empty jobs tagged by Method 1 where
 138 jobs with payload are tagged if they are found in the PanDA records.

139 *4.5. Summary of empty pilots at WLCG sites*

140 A summary of empty pilots at five WLCG sites is shown in table 2. Site batch records were used and
 141 empty pilots were selected using Method 3 with a threshold of $cputime < 60s$ & $wallclock < 60s$ for the
 142 month of August 2016. There are wide variations between sites as expected by the different workloads
 143 assigned to the site queues. On the whole when looking at daily figures, wallclock time used by empty
 144 pilots is on the order of $\sim 0.5\%$; however, the *fraction* of jobs can range from a few percent up to $\sim 90\%$
 145 in number. This number is of concern to site operators because it places a load on the middleware
 146 components and in some cases can occupy job slots which would otherwise be allocated to real jobs.

147 This degradation in the cluster utilization is caused by the fact that it takes some time until the
 148 batch system will start the next job reusing an idle job slot. This will happen not before its next

149 scheduling cycle (aka: scheduling run, negotiation cycle). This dead-time is not being accounted by
 150 the batch system. However, the average dead-time between a short job and the next job reusing the
 151 slot can be estimated as the difference between the average scheduling cycle time and the average
 152 wallclock time. For instance, FZK-LCG2 has estimated an average dead-time of around 1.5 minutes
 153 per short job, and a huge fraction of short jobs does indeed affect the cluster utilization.

154 A measurement of the average dead-time has also been performed at INFN-T1, where a self
 155 limiting mechanism has been implemented to reduce negative impact from short job bursts. The dead-
 156 time is estimated to be around 24 ± 26 seconds [5].

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Table 2 Summary statistics for daily empty-pilot fractions during August 2016

Site (August 2016 daily data)	Fraction of wallclock for short jobs (mean \pm stddev)	Fraction of short jobs (mean \pm stddev)
CC-IN2P3	$(0.08 \pm 0.11)\%$	$(25 \pm 14)\%$
FZK-LCG2	$(0.22 \pm 0.69)\%$	$(40 \pm 24)\%$
INFN-T1	$(0.01 \pm 0.01)\%$	$(2 \pm 3)\%$
MANC-HEP	$(0.14 \pm 0.13)\%$	$(28 \pm 17)\%$
NIKHEF-ELPROD	$(0.84 \pm 1.72)\%$	$(41 \pm 30)\%$

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162 *4.6. Reduction of empty pilots when workload is high*

163 When there is no (or few) assigned job then the pilot factories will throttle job submission (via 'Ready'
 164 plugin), but for reasons not completely understood, a site can still experience a large number of empty
 165 pilots during such periods. An obvious candidate explanation is the difference between "pilot
 166 submission" and "pilot execution"; payload retrieval is only attempted when the pilot starts to
 167 execute. The delay between submission and execution can be many hours in some cases, so that jobs
 168 submitted during periods of high payload availability might be executed during a period of no
 169 available payload.

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171 **5. Conclusions**

172 Results show a wide variation of wallclock time used by short jobs depending on the site and queue,
 173 and changing with time. The mean fraction of wallclock time used by short jobs over a single month
 174 can range from 0.1% to 0.8% depending on the site, plus the time of the idle gaps between every short
 175 job and the next one reusing the job slot, which are being measured by the site accounting. The
 176 variation in wallclock usage may be explained by different workloads for each resource with a greater
 177 fraction when the workload is low, but this requires further study. Aside from the wall time used by
 178 empty pilots, we also looked at how many pilots were empty as a fraction of all pilots sent. This
 179 fraction ranged from 2-40% and the large number is correlated to periods where few payloads have
 180 been assigned to the site.

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182 **References**

183 [1] The ATLAS Collaboration 2008 The ATLAS Experiment at the CERN Large Hadron Collider
 184 JINST 3 S08003 (doi:10.1088/1748-0221/3/08/S08003)
 185 [2] Bird, I et al 2014 Update of the Computing Models of the WLCG and the LHC Experiments
 186 Tech. Rep. CERN-LHCC-2014-014. LCG-TDR-002 CERN Geneva URL
 187 <https://cds.cern.ch/record/1695401>
 188 [3] Maeno T et al. 2012 Evolution of the ATLAS PanDA production and distributed analysis
 189 system *J. Phys.: Conf. Ser.* **396** 032071

- 190 [4] Caballero J et al on behalf of the ATLAS Collaboration 2012 AutoPyFactory: A Scalable
191 Flexible Pilot Factory Implementation *J. Phys.: Conf. Ser.* 396 032016 (doi:10.1088/1742-
192 6596/396/3/032016)
- 193 [5] Stefano Dal Pra (2016) Adjusting the fairshare policy to prevent computing power loss.
194 Proceedings of the CHEP2016 conference *J. Phys.: Conf. Ser.*