



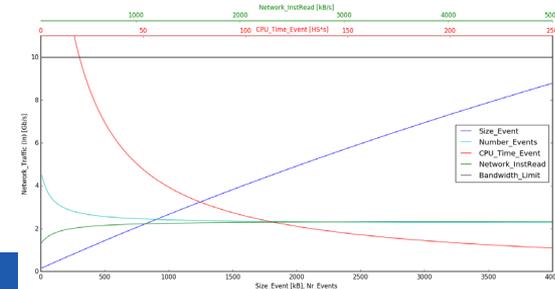
# Workflow Performance

Gerhard Rzehorz

# Optimizing and Modeling

- Adapt infrastructure to workflow? → Cloud
- Trade CPU for RAM, Storage for Network
- Dedicated Clusters for specific workflows?
- Storage-less sites, latency hiding

ATLAS Real Data Reconstruction				
Number of Processes	RAM [GB]	Data location	Overall node throughput [s/event]	Overcommit Improvement [%]
8	32	BNL	4,31	Yes:
2x8	32	BNL	2,45	43
8	16	BNL	4,22	Yes:
2x8	16	BNL	3,51	16
8	32	local	3,02	Yes:
2x8	32	local	2,33	22
8	16	local	3,17	No:
2x8	16	local	3,37	-6



# CERN Cloud Infrastructure Report

**Arne Wiebalck**  
for the CERN Cloud Team

HEPIX Spring Meeting  
DESY, Zeuthen, Germany  
Apr 19, 2016

Numbers

Operations

What's new

WIP

# The “20% overhead” problem

- On our batch full node VMs we noticed that the HS06 rating was **~20% lower** than on the underlying host
  - Full node VMs are needed to the limit of the total number of hosts in LSF
- Smaller VMs behaved much better: ~8%
  - The sum of simultaneous HS06 runs on 4x 8-core VMs on a 32-core host
  - Better, but still pretty high
- IN2P3 reported significant performance penalties for ATLAS MC jobs when EPT\* was switched on
  - 26% vs. 6% in wall clock time for EPT on vs. EPT off compared to bare metal
  - Surprising as EPT is supposed to make things faster

\*EPT: Extended Page Tables is Intel's implementation of a hardware-assisted virtualization technology for page table management (secondary address translation or nested pages). AMD's implementation is called RVI (Rapid Virtualization Indexing).



# Integrating Commercial Clouds into the WLCG

**Cristovao Cordeiro**

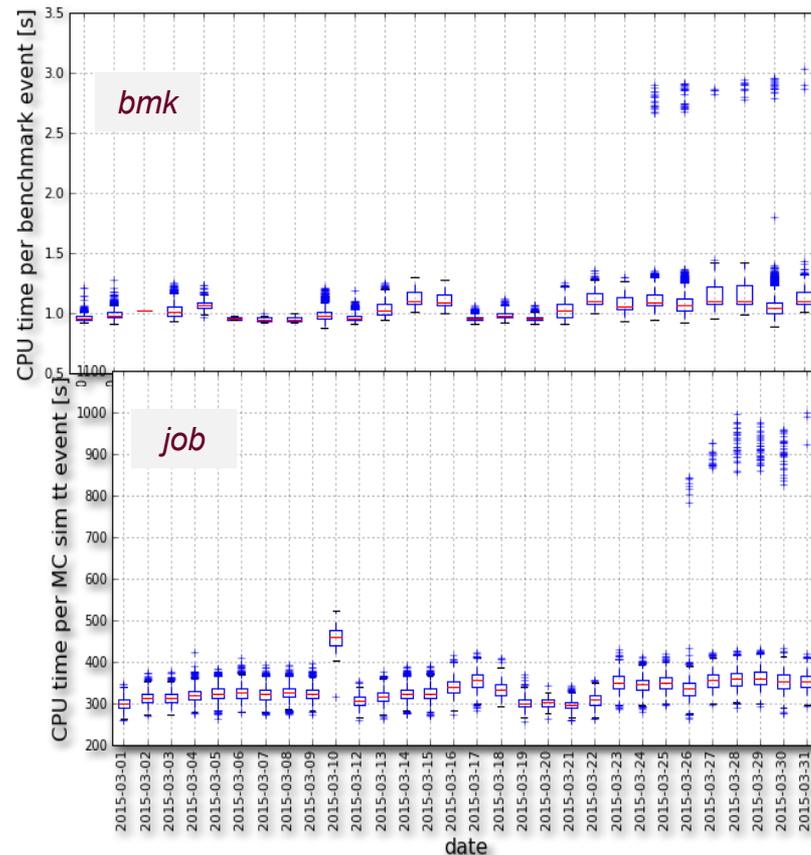
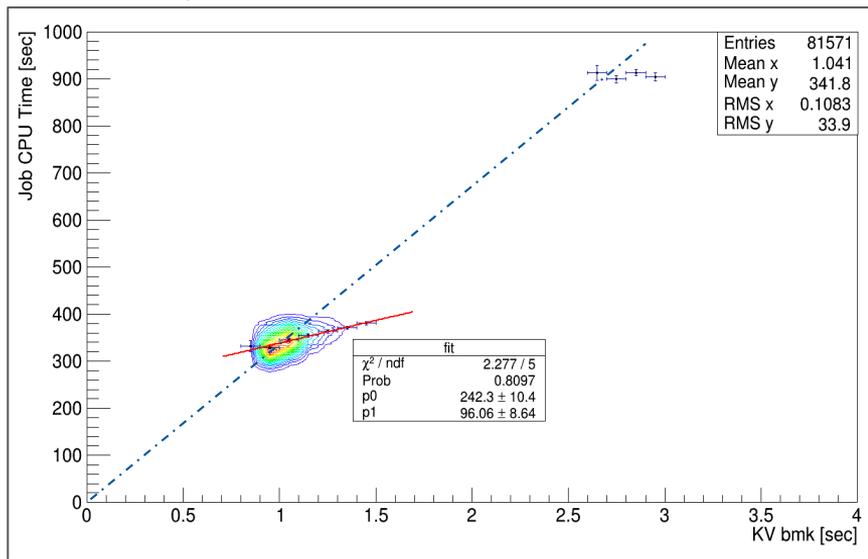
*on behalf of the WLCG Resource Integration team*

*IT Technical Forum, CERN, 22 January 2016*

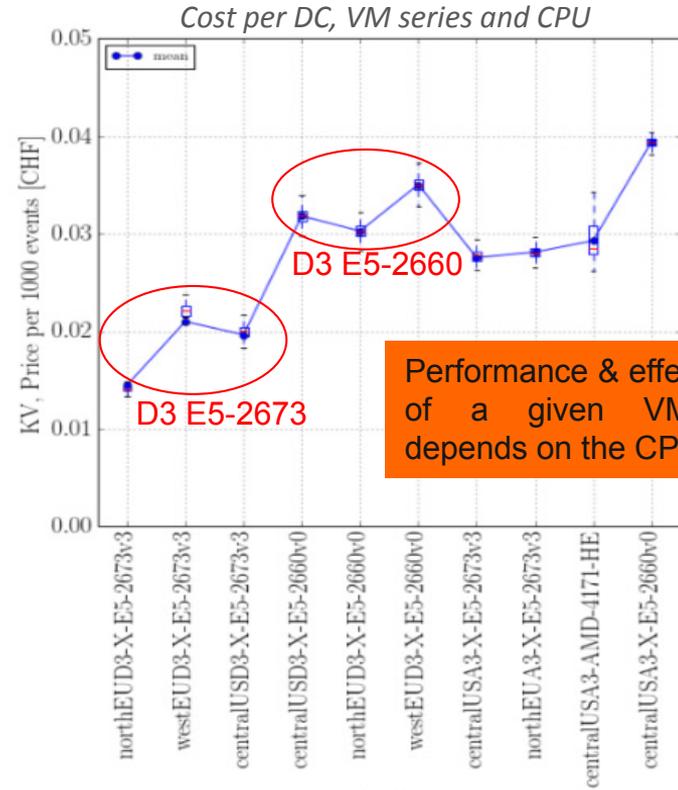
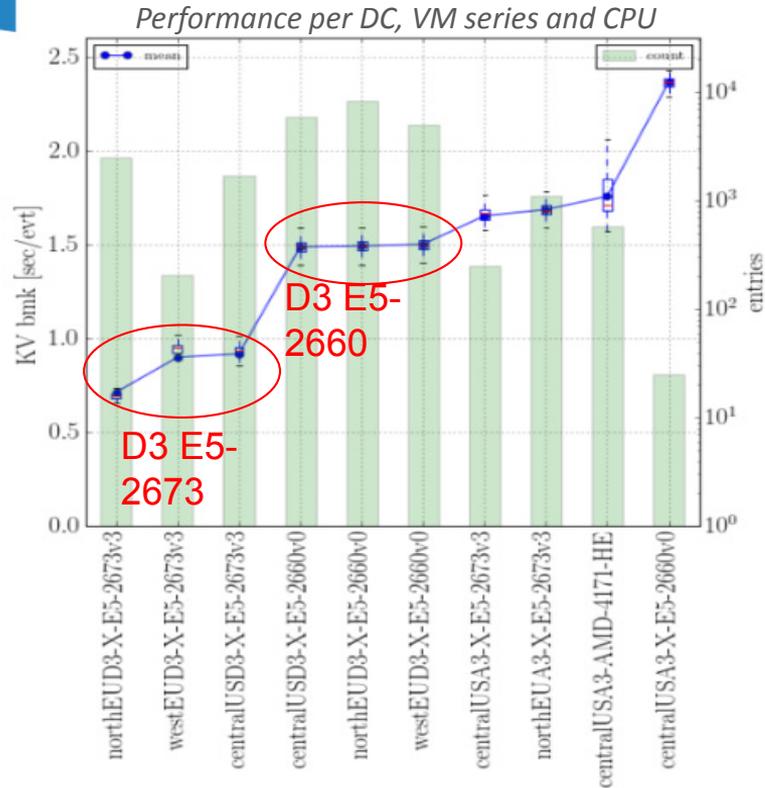
# Deploy & monitor & account & benchmark



- Correlated job CPU performance and benchmark
- Results from ~30k VM benchmarks, simulating 100 Single Muon events each (~2' to run)



# Deploy & monitor & account & benchmark

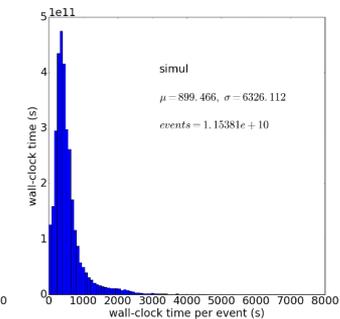
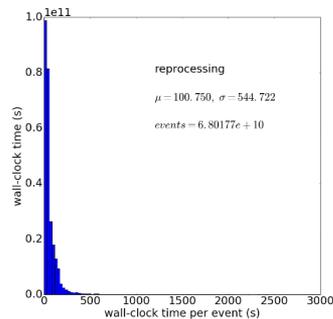
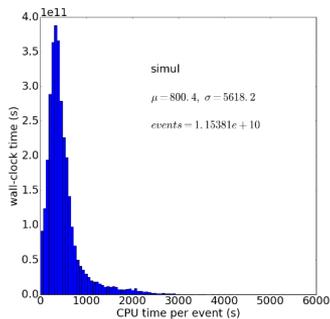
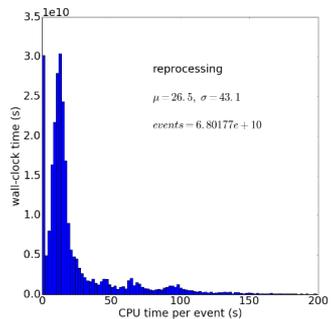
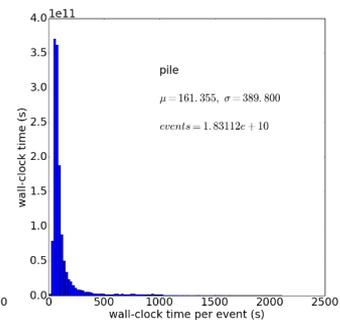
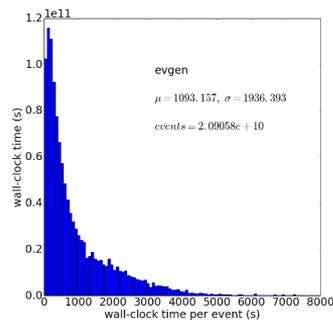
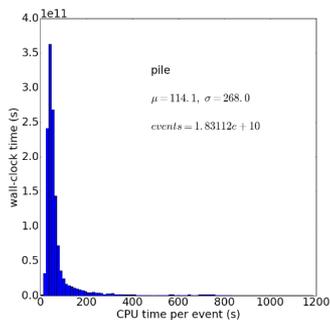
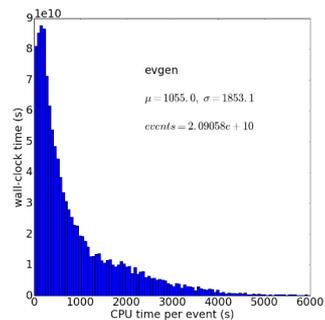


Performance & effective cost of a given VM series depends on the CPU model

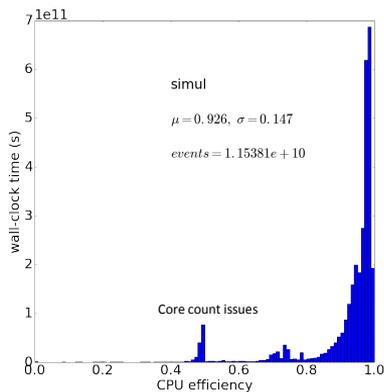
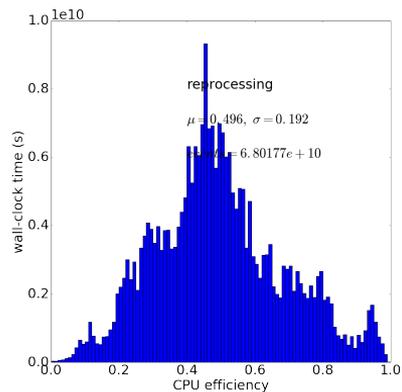
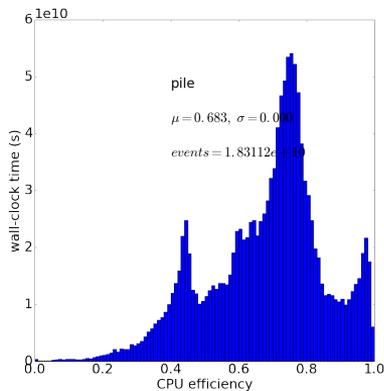
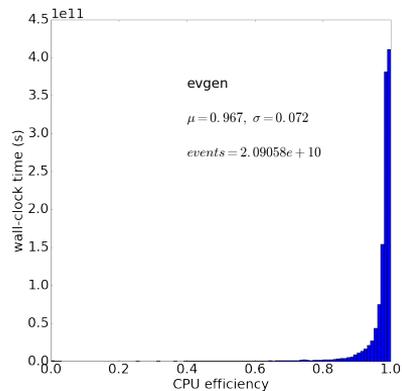
# CPU utilization of production jobs

Andrea Sciaba

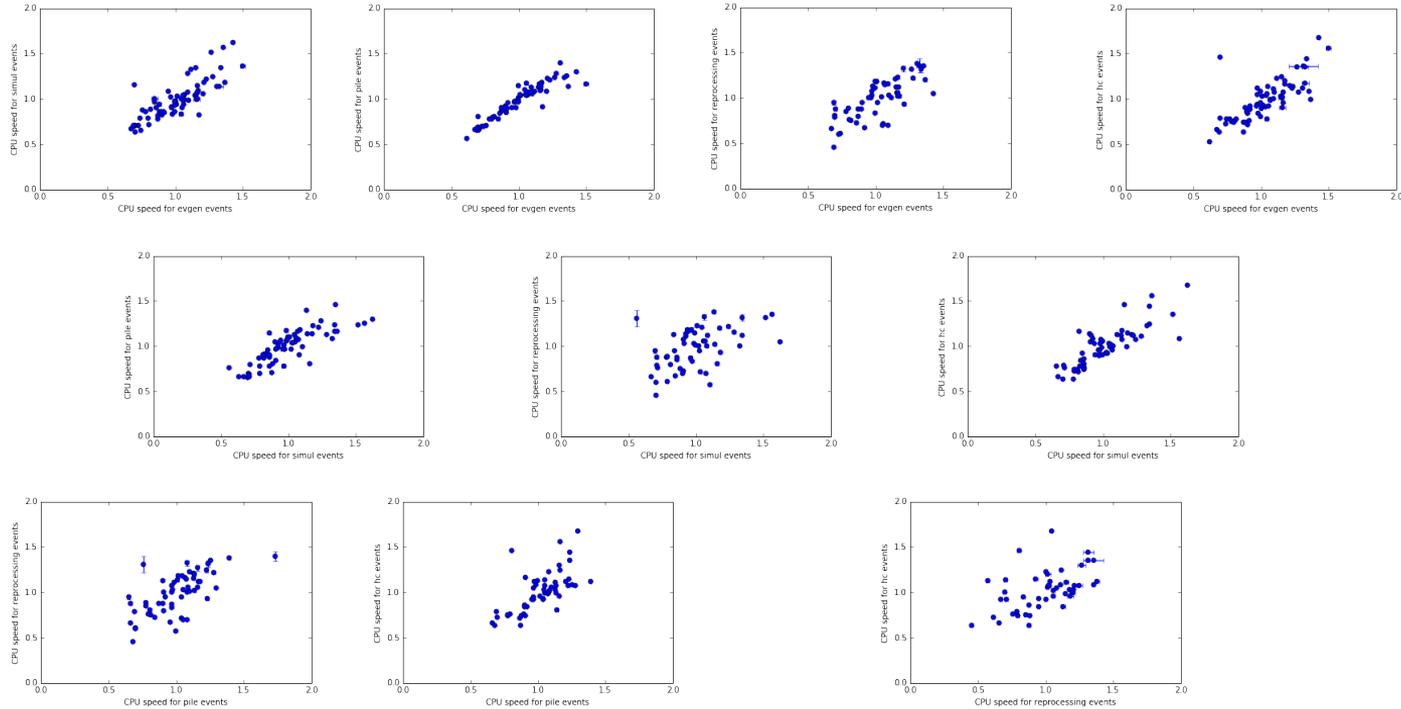
# ATLAS CPU and wall-clock per event averages for tasks



# ATLAS CPU efficiency averages for tasks

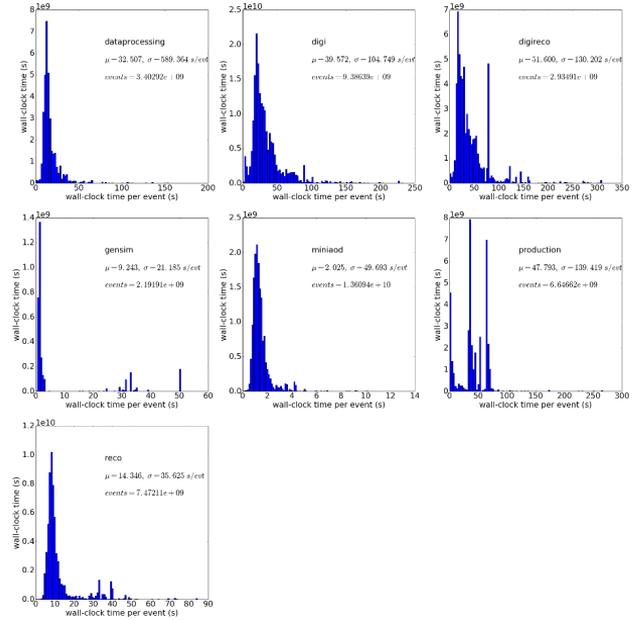
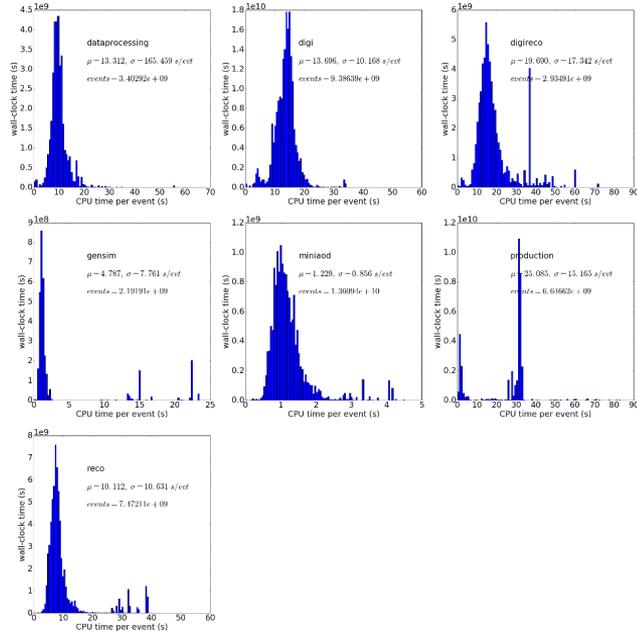


# Speed correlations

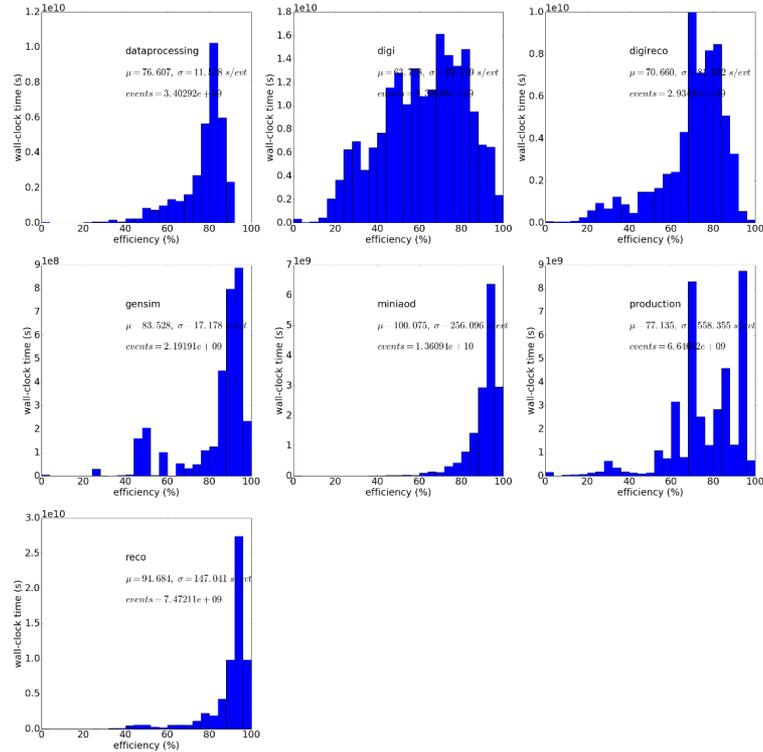


When considering only the three main categories (evgen, simul, pile), the speed factors agree by ~4% on average

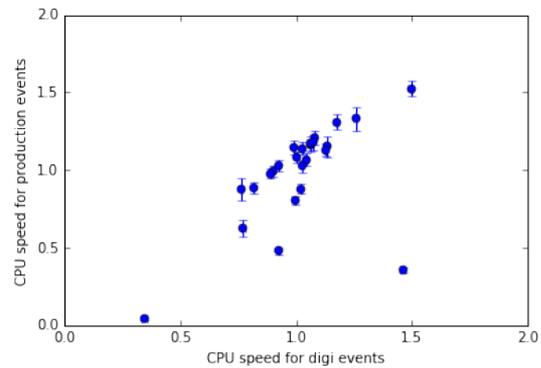
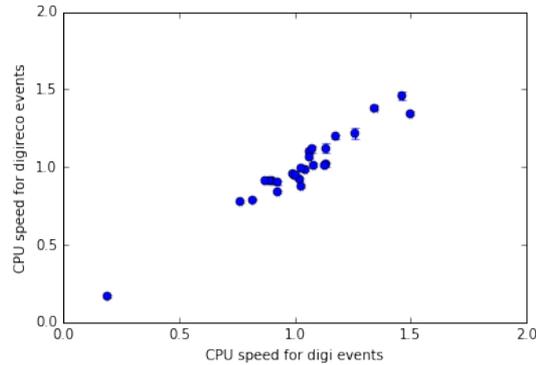
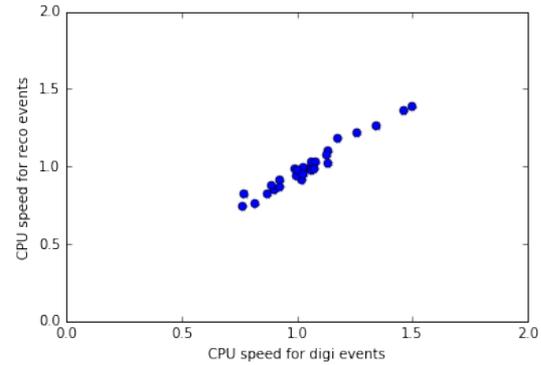
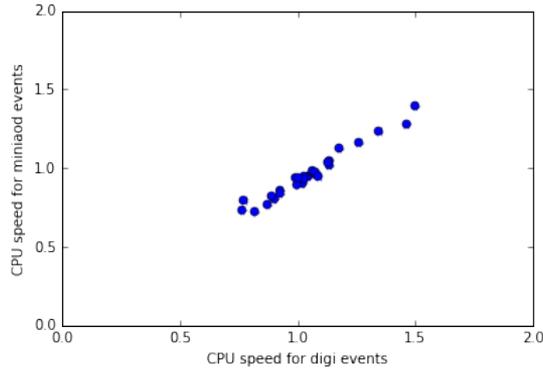
# CMS analysis



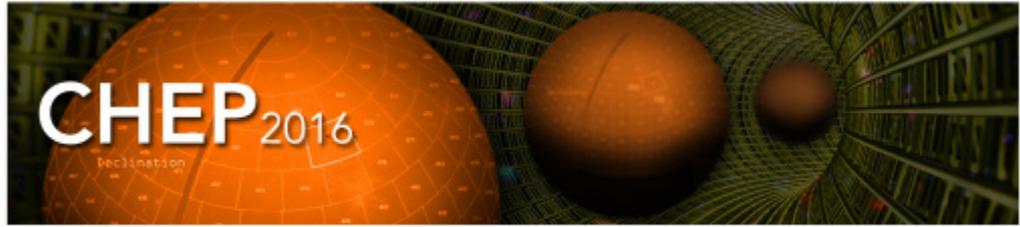
# CMS CPU efficiency



# Speed correlations in CMS



When considering only digi, miniaod, digireco and reco, the speed factors agree by ~4% on average



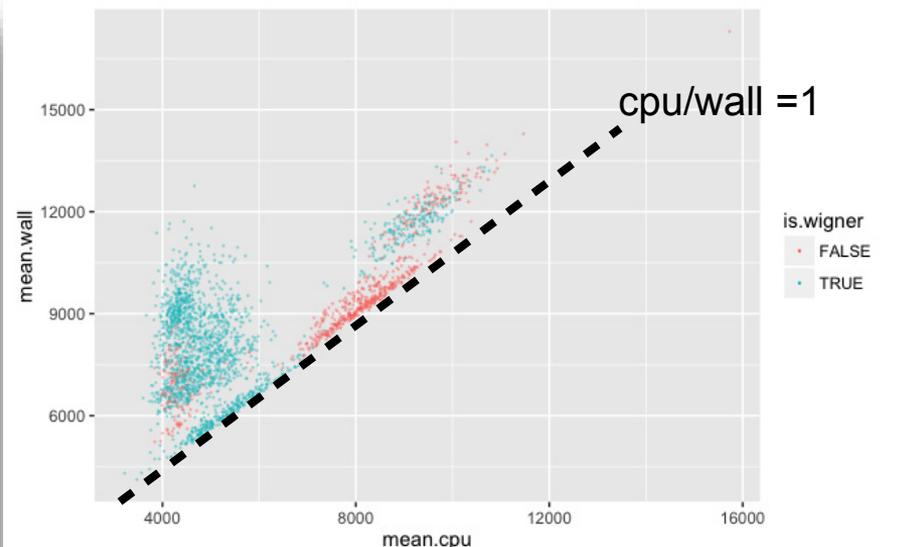
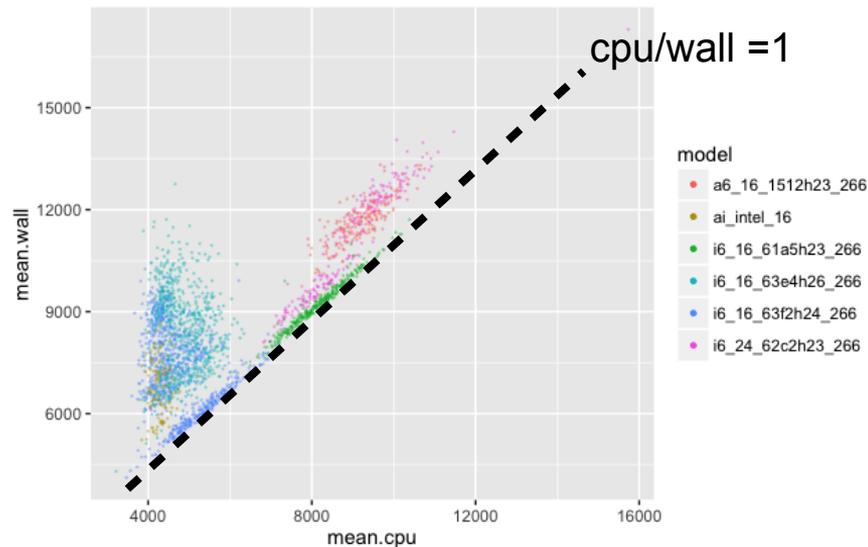
22nd International Conference on Computing in High Energy and Nuclear Physics, Hosted by SLAC and LBNL, Fall 2016

# First results from a combined analysis of CERN computing infrastructure metrics

D. Duellmann - CERN, Switzerland  
C. Nieke - Tech. Univ. Braunschweig, Germany

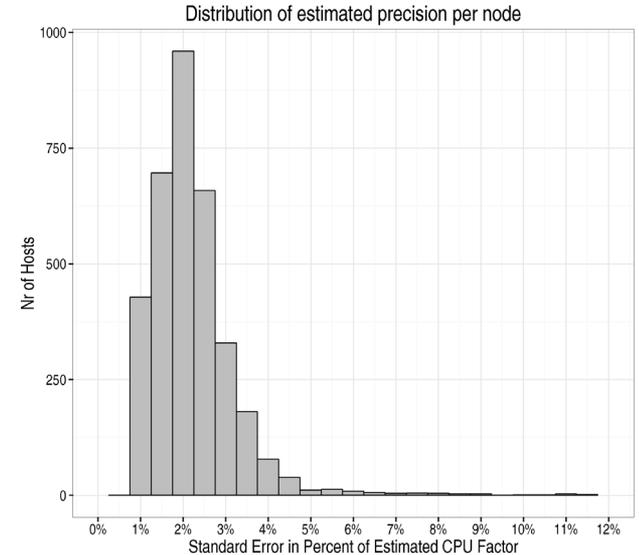
presented by Oliver Keeble

# A few simple examples - machine “efficiency” versus H/W and location

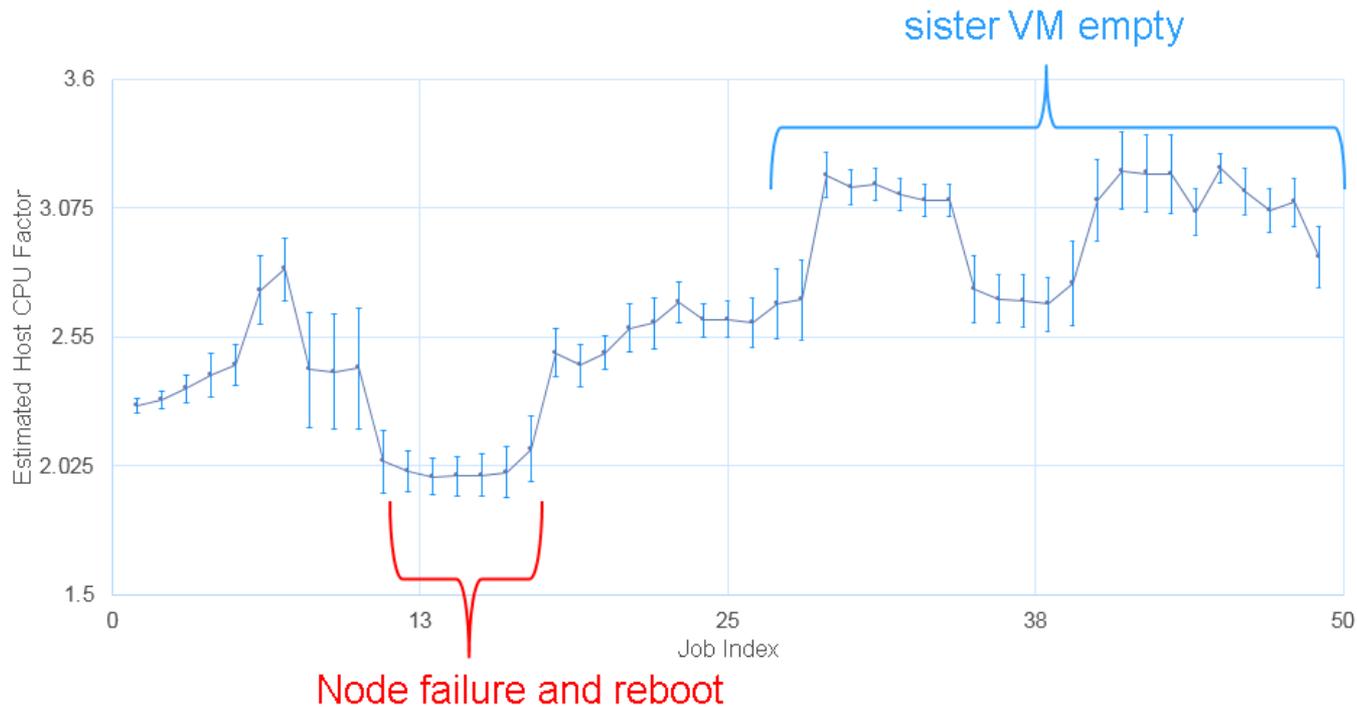


# Passive Benchmark

- **Basic Idea:**
  - Take the workload as set of benchmarks
    - Assume jobs per task are equal, compare runtime
    - Based on existing monitoring logs
- **Advantages:**
  - Zero intrusion, basically no overhead
  - Always representative (the benchmark **is** the workload)
- **Application:**
  - Observe performance during operation
  - Compare configurations by performance on the actual workload
- **Accuracy / Precision**
  - Experiment on LSF dataset: ATLAS and CMS, 3 months
  - Equal or better prediction of performance than HepSPEC06
  - Precision per node is below 5% error for 98% of nodes



# “Live” Performance Monitoring



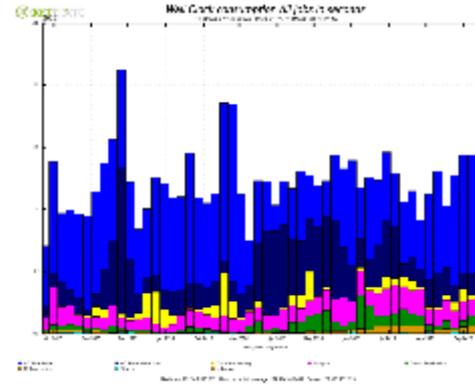
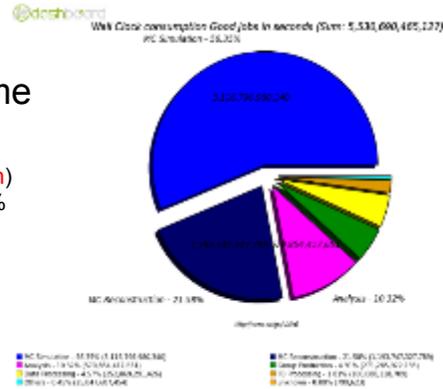
- CPU performance computed on sliding window of 4 tasks

# Backup

# Example: ATLAS jobs in the last year

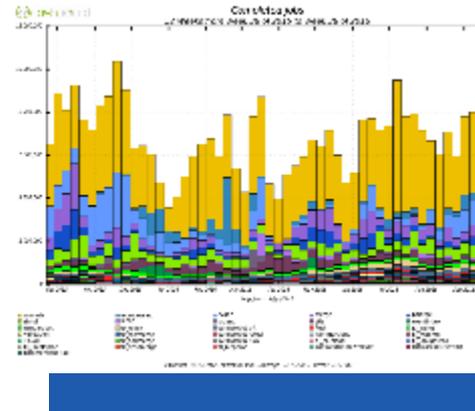
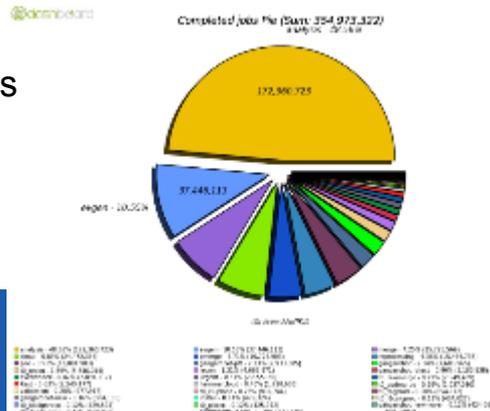
## By wall-clock time

- MC Simulation:  $\approx 60\%$  (of which 2/3 **simul**, 1/3 **evgen**)
- MC Reconstruction:  $\approx 22\%$  (of which 4/5 **pile**)
- Analysis:  $\approx 10\%$
- Data processing:  $\approx 5\%$  (mainly **reprocessing**)
- Group production:  $\approx 5\%$  (mainly merge)



## By number of jobs

- Analysis:  $\approx 50\%$
- Evgen:  $\approx 10\%$
- Merge:  $\approx 7\%$
- Simul:  $\approx 7\%$
- Pmerge:  $\approx 5\%$
- Reprocessing:  $\approx 4\%$
- Pile:  $\approx 4\%$



# General virtualization issue?

- Crosscheck w/ SLC6 VMs on Hyper-V



- 0.8% HS06 loss on 4x 8-core
- 3.3% HS06 loss on 1x 32-core SLC6 VM

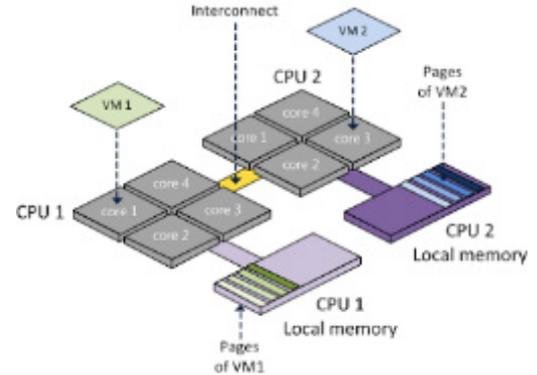
- No general virtualization overhead issue!

- Rather a feature or configuration issue

- What's the difference between the VMs on Hyper-V and the ones on KVM?

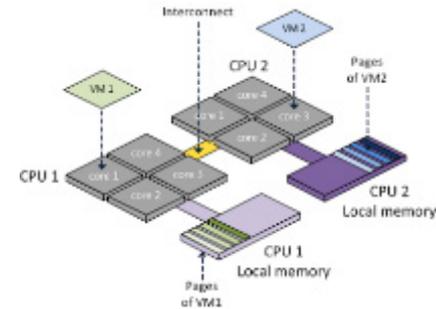
# NUMA

- Hyper-V VMs “see” underlying NUMA architecture
- Hyper-V VMs have vCPUs pinned to physical NUMA nodes
  - Pinned to sets that correspond to physical NUMA nodes
- In OpenStack, wider support for this comes with the release we currently prepare to deploy (Kilo)
  - Juno has some NUMA support as well
  - Consciously not configured, then disabled after ATLAS T0 incident (aka the “50% overhead” problem ...)



# Operations: NUMA/THP Recap (2)

- NUMA-awareness identified as most efficient setting
  - Full node VMs have ~3% overhead in HS06
- “EPT-off” side-effect
  - Small number of hosts, but very visible there
- Use 2MB Huge Pages
  - Keep the “EPT off” performance gain with “EPT on”
- All details in [Arne Wiebalck’s talk at BNL](#)



# Operations: NUMA/THP Roll-out

- Rolled out on ~2'000 batch hypervisors (~6'000 VMs)
  - HP allocation as boot parameter → reboot
  - VM NUMA awareness as flavor metadata → delete/recreate
- Cell-by-cell (~200 hosts):
  - Queue-reshuffle to minimize resource impact
  - Draining & deletion of batch VMs
  - Hypervisor reconfiguration (Puppet) & reboot
  - Recreation of batch VMs
- Whole update took about 8 weeks
  - Organized between batch and cloud teams
  - No performance issue observed since



# Deploy & monitor & account & benchmark

“ Performance is a key criterion in the design, procurement, and use of computer systems [...] to get the highest performance for a given cost. ”<sup>[1]</sup>

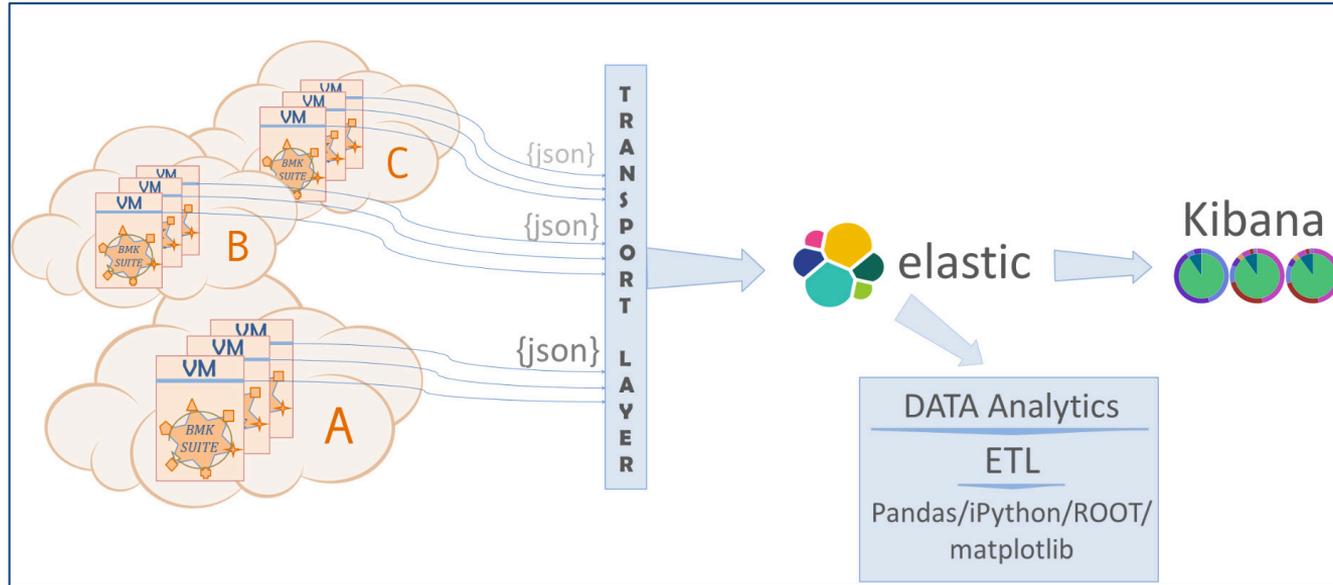
- Together with monitoring and accounting, **Performance Measurement** is also essential
  - Deal with the intrinsic variability and inhomogeneity
  - Compare the presumed and perceived performance
  - Identify performance issues
- Standard procedure during the procurement process
- Built a **Cloud Benchmarking Suite** that runs on every cloud resource and currently includes:
  - ATLAS Kit Validation (KV)
  - LHCb Fast Benchmark (fastBmk)
  - 4 different open-source Phoronix tools

*Focus on CPU performance metric → CPU time/event*

<sup>[1]</sup> *Art of Computer Systems Performance Analysis Techniques For Experimental Design Measurements Simulation And Modeling*  
by Raj Jain , Wiley Computer Publishing, John Wiley & Sons, Inc

# Deploy & *monitor* & *account* & benchmark

- A scalable architecture whereby each benchmarking suite and respective configurations are deployed independently, on each cloud resource, through the contextualization mechanism



- All results are inserted into Elasticsearch, containing **unique metadata** information on a VM level

# Deploy & monitor & account & benchmark

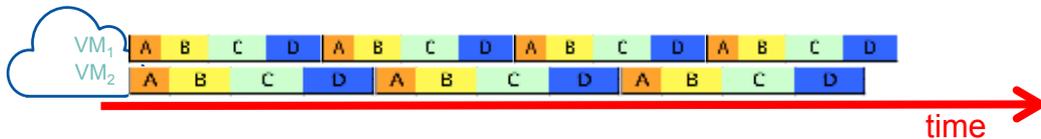
- Run the benchmark in parallel in many threads as the number of vCPUs
- The benchmark suite can be run at any time during the VM lifecycle
  - Only at the *beginning*
  - At *each job cycle* (bmk included in the job wrapper)



PRODUCTION

- Sequentially - all configured benchmarks in a row

STRESS TEST



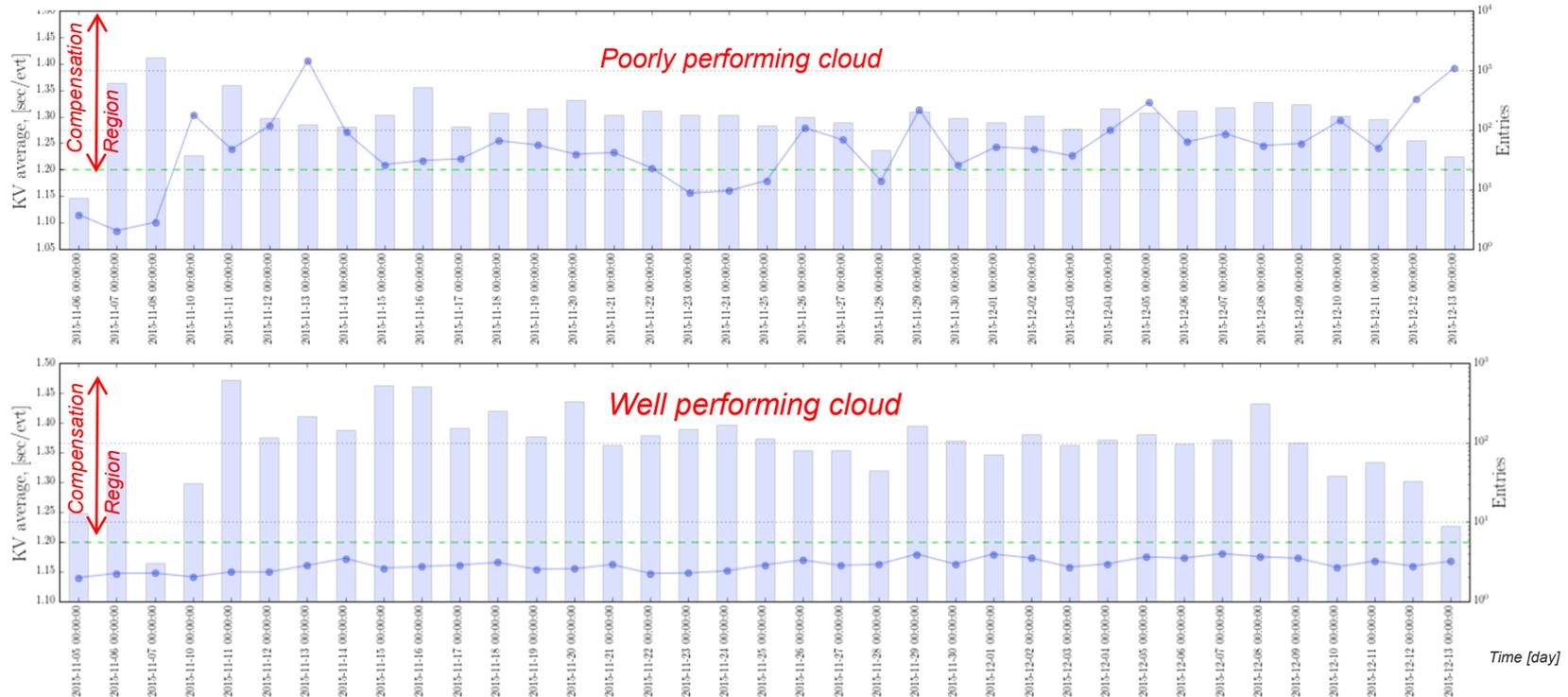
- Synchronized - specific benchmarks at specific points in time



# Deploy & monitor & account & benchmark



DEUTSCHE BÖRSE  
CLOUD EXCHANGE



- Bad performances might trigger contractual reviews and compensation measures

# Motivation

- Understand how experiments use their CPU resources
  - What types of jobs are (primarily) run?
  - How many resources do they require?
  - Are they “efficient” (i.e. do they waste wall-clock time)?
  - How can jobs be modelled in the context of a simulation of the WLCG computing infrastructure?
- Using data analytics techniques, understand the behavior of the infrastructure
  - Can we measure the “speed” of CPUs, or sites, by looking at different types of jobs? Are the results compatible? Can we validate commonly used benchmarks using “real” jobs?

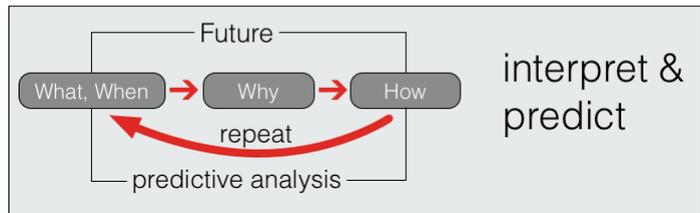
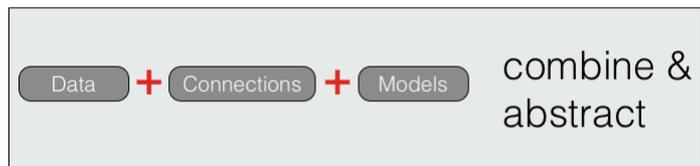
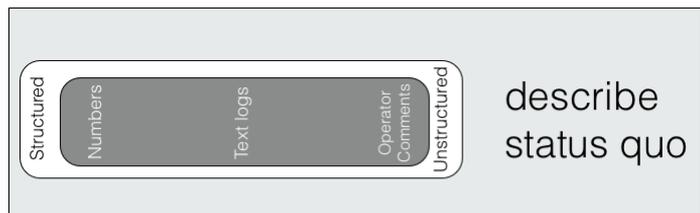
# Fitting CPU speeds

- Based on the assumption that the CPU speed and the average CPU time / event are inversely proportional
- Exploiting the fact that jobs in a task are comparable, relative speeds of CPUs they run on can be measured
- Global least-squares fit produces separate CPU speed measurements for different types of jobs
  - Tried on ATLAS jobs for evgen, simul, pile, reprocessing and selected HammerCloud jobs

# Analysis Working Group Motivation

- Goal: **quantitative** understanding of computing infrastructure
  - measure service usage and their evolution
  - To optimise science throughput / CHF
- End-to-end: using metrics from user and across layered services
  - Eg within large (many jobs), well-identified physics tasks
    - optimise aggregate events/s delivered to experiments

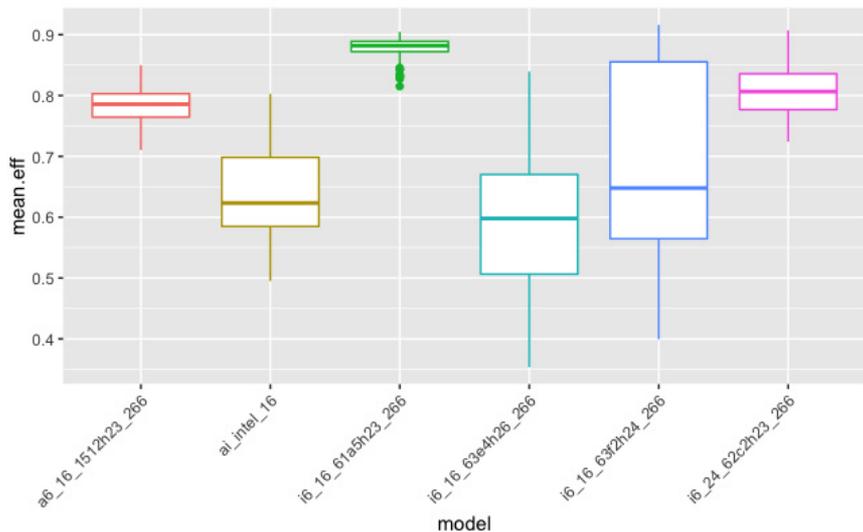
# Three Main Phases



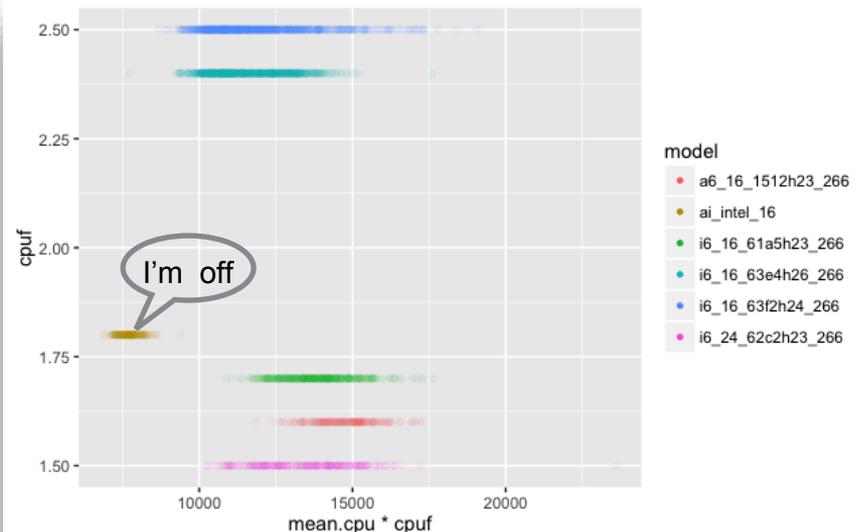
- Tools
  - statistical analysis {machine learning}
- Follow rational flow
  - extract relevant statistics from raw metrics and logs
  - connect trusted data into models
  - check model prediction and improve

# A few simple examples

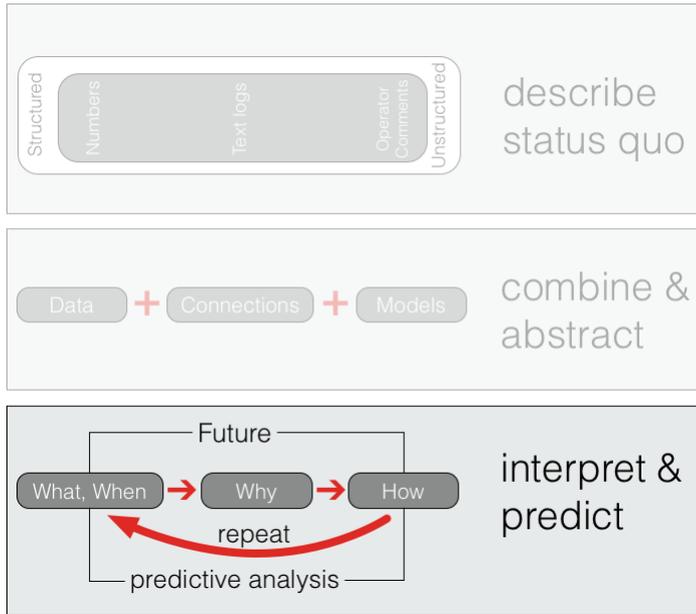
"Efficiency" versus H/W types



CPU Performance Calibration check



# Model Predictions



- Evaluate (simple) predictive models: Can we construct a more performant system for the same price?
- Simplest case: CPU bound
  - **CPU benchmarks** + memory optimisation => MC throughput
- Not CPU-bound case - balance between
  - CPU, WN storage, LAN storage, WAN storage, network

# CPU Benchmarking Motivations

- Compare hardware performance
  - Before purchasing hardware
- Optimizing software / configuration
  - Maximize performance for a given workflow mix
- Monitor performance
  - Observe shifts over time
  - Detect outliers / failures / bottlenecks
  - Measure current performance of volatile resources
    - (e.g. cloud VMs)

# Current Benchmarking Practice

- Long benchmarks (HepSPEC06)
  - High precision (reproducible per machine)
  - Expensive (~8 hours runtime)
  - Intrusive (Node has to be taken out of production)
  - Suited for initial hardware tests
- Short benchmarks
  - Run before each job (e.g. DIRAC, KV, fastBmk etc. )
  - Lower intrusion (10-15 min benchmark vs. ~hours jobs)
  - Suited for hardware monitoring
- But do they represent the actual workflows?
  - HepSPEC designed to represent a mix of HEP workflows
    - But does it?
  - Short benchmarks even more questionable
    - Typically cover only specific areas (e.g. only Monte Carlo)

# Summary

- Statistical analysis activity of CERN infrastructure performance has started
  - IT Analysis Working Group [\[meetings\]](#) and [\[twiki\]](#)
- Input metrics and analysis environment are now in place and allowed first quantitative studies
  - close collaboration with IT monitoring project and Hadoop service
- Promising new approach to determine CPU performance directly from the workflow
  - sufficient resolution to spot time dependent efficiency changes
- Growing interest from experiments and other sites in statistical and ML optimisation