

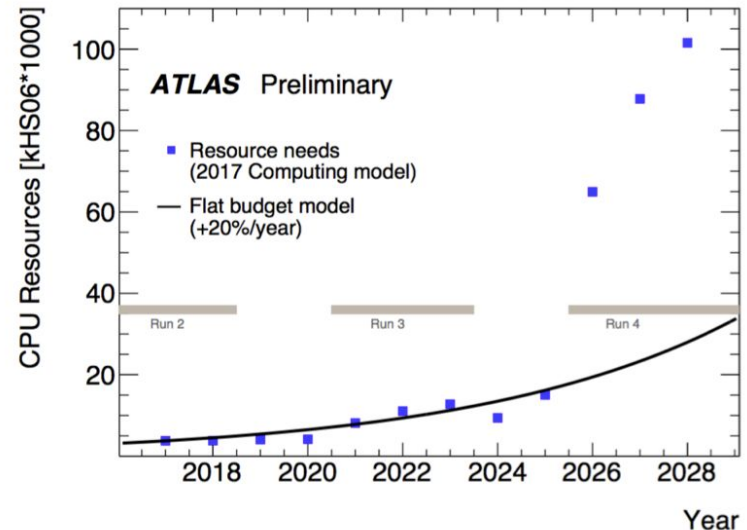
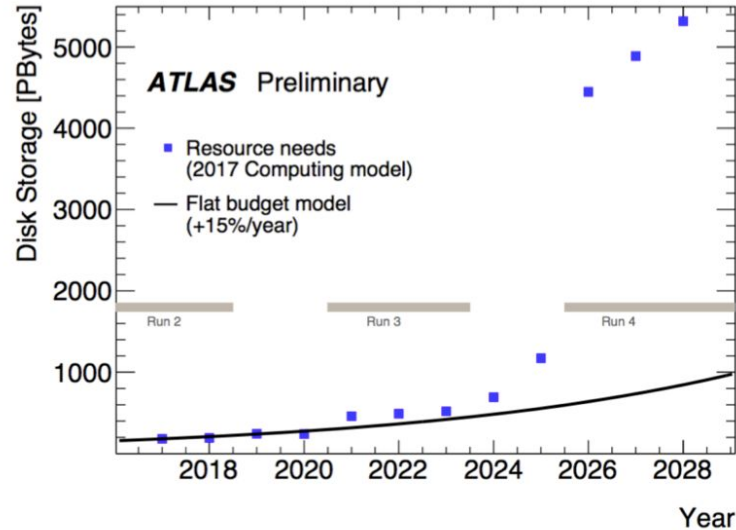
# Getting researchers to the data: Data from the Lake

*Performance metrics and measurements  
in the Data Lake mode*

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Ivan Kadochnikov, Gavin McCance, Jaroslava Schovancová  
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# Motivation

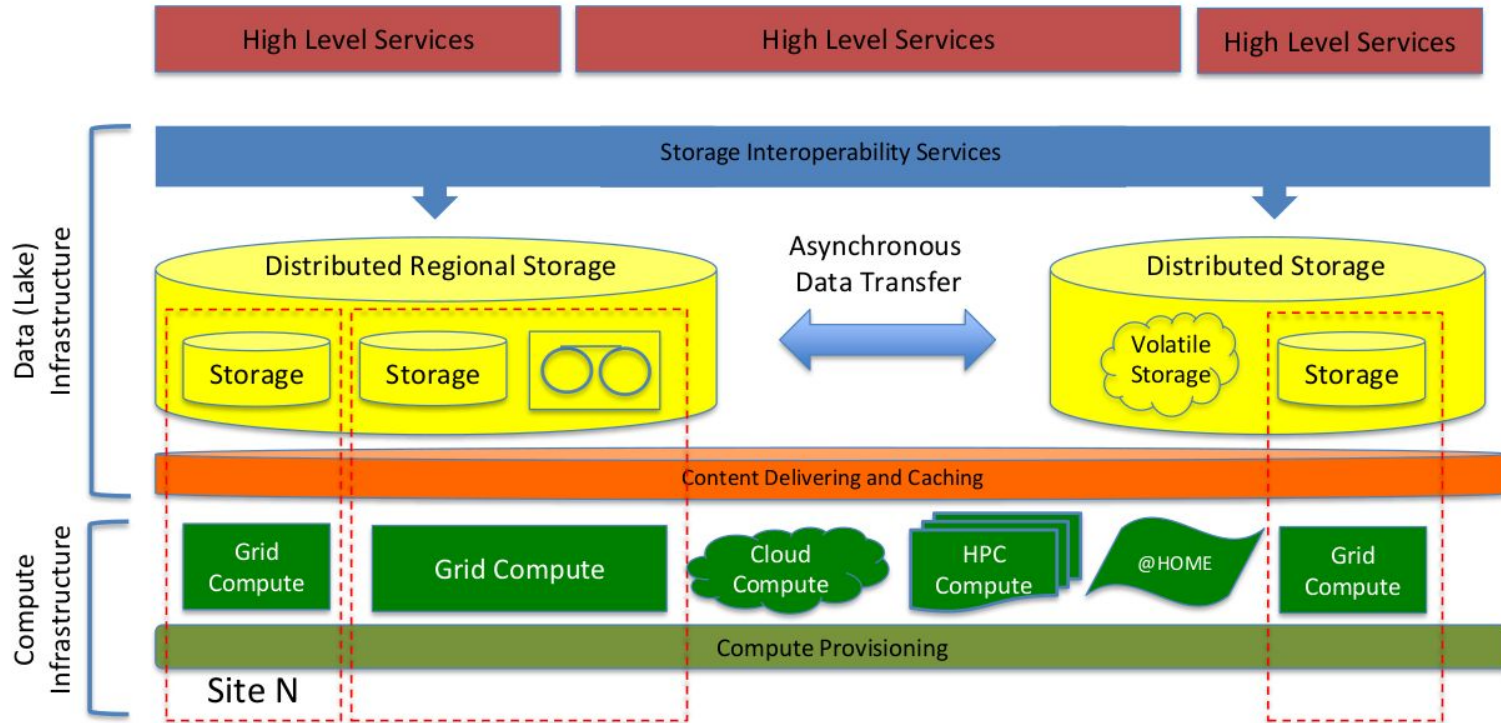
- HL-LHC storage needs are above the expected technology evolution (15%/yr) and funding (flat)
- We need to optimize HW usage and operational cost



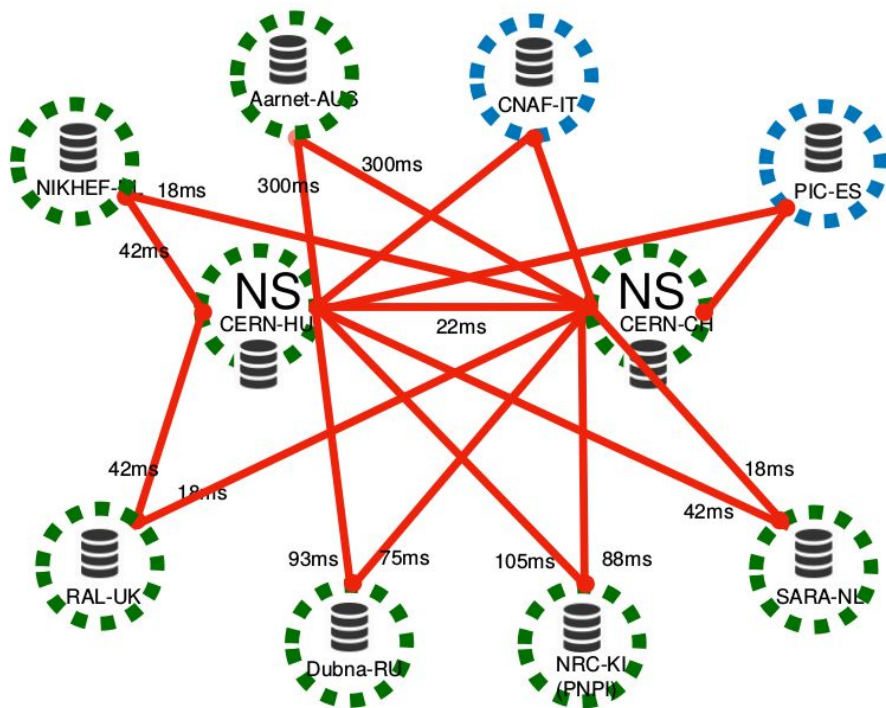
# How to reduce cost???

- Many places where we can reduce cost.  
Here we **focus on storage** which is one of the bigger contributors.
- **Reduce HW cost:** introduce the concept of Quality of Service (QoS)
  - we store more than we think today!
    - EOS: 2 copies
    - CEPH: 3 copies
    - dCache: Raid-N
- **Reduce Ops cost:** deploy fewer (larger) storage services
- **Co-location of data and compute** not guaranteed

# Data and Compute Infrastructures



# Data Lake Prototype



- Goal: testbed to test and demonstrate some of the ideas
- Deployed a Distributed Storage prototype, based on EOS
  - distributed storage
  - network links: latency, bandwidth
  - storage media: disk/cache/tape
  - evolving data access protocols: driven by the changes in networks
- evolving inter-storage communication

# The core metric: event throughput

- the Compute side of things  $\Rightarrow$  all boils down to the **event throughput at the same cost**
  - $\Rightarrow$  *Are we able to support the same or even better event throughput at the same cost with the evolving storage configuration?*
- Easier said than done!
  - Which events? Which SW? How much I/O? How much memory? ...
  - How to measure job performance? Storage performance?
  - How to benchmark?
  - What to take into account for the storage configuration?
  - Topology of resources? its transparency?
  - (Co-)location of data vs. compute resources?
  - Types of storage media vs. access policies?
  - Direct vs. remote access to data?
  - How to evolve tools to support the core mission

# Measurements

- Methodology, how to measure and benchmark
- What to measure: event throughput
  - I/O rate
  - Stage-in / Stage-out time
  - SW init time
  - Time spent in event loop
- Production and Analysis workflows
- Core count preferences: MSCORE (production) vs. SCORE (analysis)
- Local vs. remote data access

# Benchmark

- Resources: standard storage vs. distributed storage
  - can compare these flavors of resources
  - in different configurations of the **distributed storage**
    - hot/warm/cold storage
    - caching
    - local vs. remote access
    - data replication policies/stripping
    - downtime/recovery of subset of storage resources
  - benchmarking per resources, VM

⇒ study and benchmark both

- **job performance**, and
- **distributed storage performance**, at once



# Workflows types - ATLAS

- G4 simulation
  - CPU intensive, not so much RAM demanding, not much I/O intensive
  - ttbar full simul, reference workflow to compare HS06
- Digi+reco
  - some I/O (not that much IOwaits for jobs), RAM-demanding, sensitive to latency
  - Event mixing, digitization, trigger, trigger reconstruction
  - 50 GB in
- Production derivation
  - More I/O intensive
  - Skim, slim, ...
  - 5 GB in
- Analysis - focusing on analysis derivation

# Workflows types - CMS

- Understanding the equivalents
  - G4 simulation: quick
  - Reco takes more time
  - Premixed pile-up
    - CMS pre-mixes min bias  $\Rightarrow$  huge files, less copies. Perhaps lower I/O?
    - ATLAS does not pre-mix min bias  $\Rightarrow$  smaller files, more copies
  - No derivations
  - Analysis
- Production workflows in CMS: leverage the “1-chain” job <https://doi.org/10.1007/s41781-017-0001-9>
  - Generation - Simulation - Digitization - Reconstruction steps in 1 job, to save data stage-out and stage-in among jobs
    - $\Rightarrow$  very small input and 1 output of the full chain

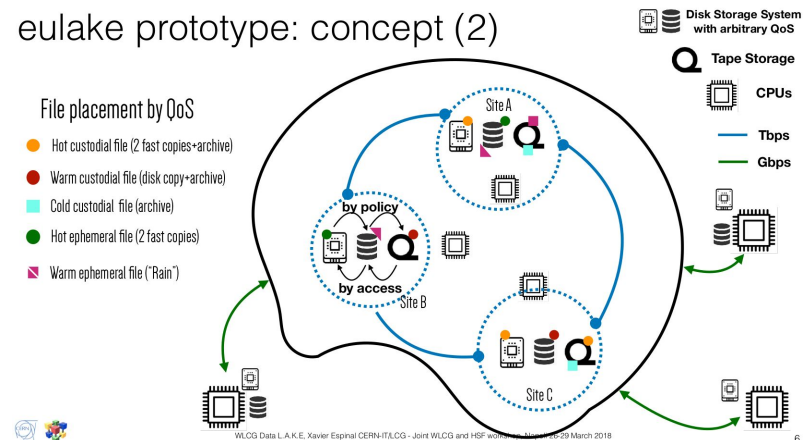
# Data access modes

- ATLAS: copy to scratch vs. directIO from co-located storage vs. read over WAN
- CMS: remote read

## ATLAS

storage vs. compute	Data access mode	Standard storage	eulake
co-located	copy to scratch	✓	✓
	directIO	✓	✓
not co-located	copy to scratch	?	✓
	directIO	?	✓

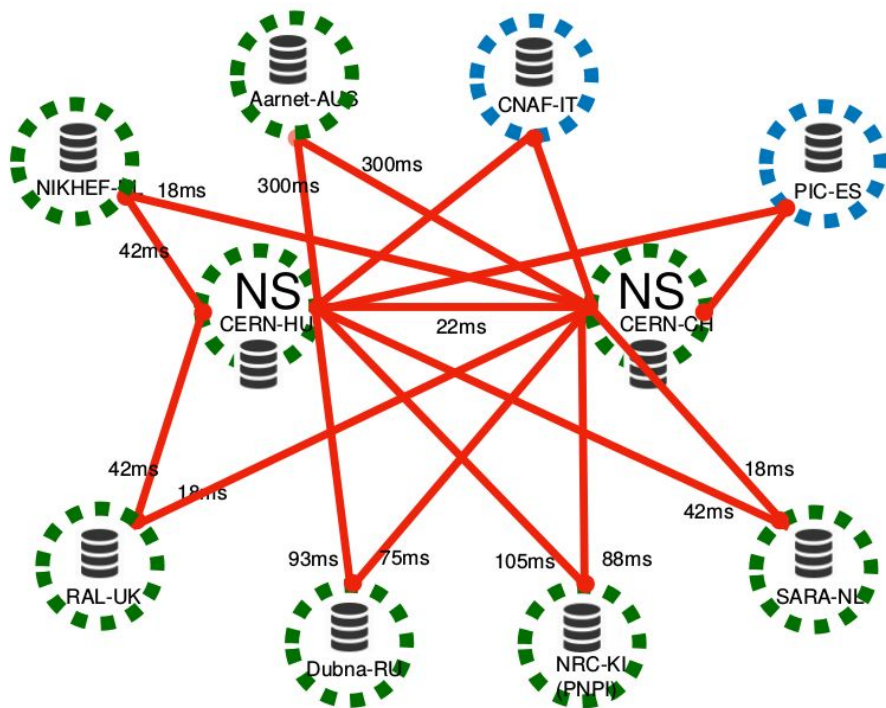
eulake prototype: concept (2)



by Xavier Espinal

**CMS:** investigation of data access modes ongoing

# Data Lake Prototype



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# Data Lake Prototype in use...

- First, **integrate** it with the Experiment's Distributed Data Management and Workload Management Systems
  - ATLAS
    - ✓ DLP exposed as a storage endpoint to ATLAS DDM (Rucio)
    - ✓ Data can be transferred from any ATLAS site into the DLP end.
    - ✓ Integrated with ATLAS WMS (PanDA)
  - CMS
    - ✓ DPL exposed as a storage endpoint to CMS DDM
    - ✓ Integrated with CMS CRAB3

# Data Lake and HammerCloud

- ✓ We integrated the Data Lake Prototype with HammerCloud
  - We can test real workflows and data access patterns of ATLAS and CMS

## Initial focus on ATLAS

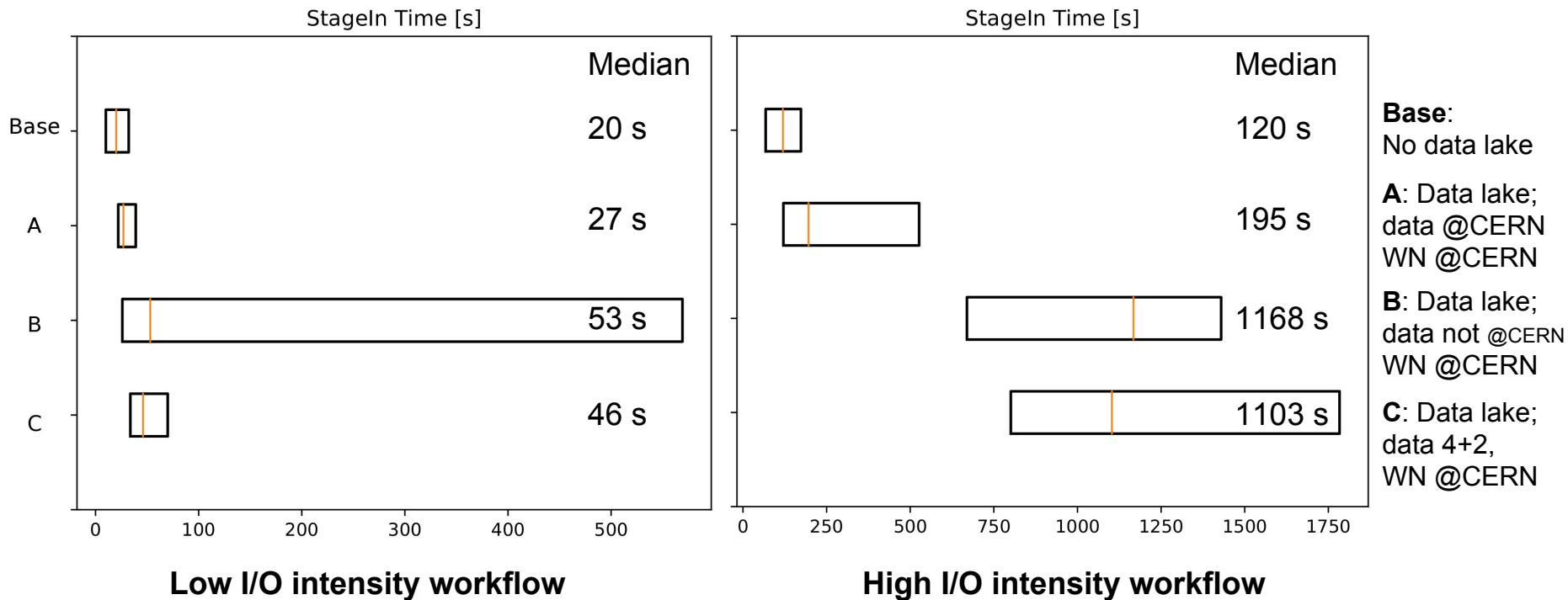
(Data is copied from storage to WN)

## 4 test scenarios, stage-in from

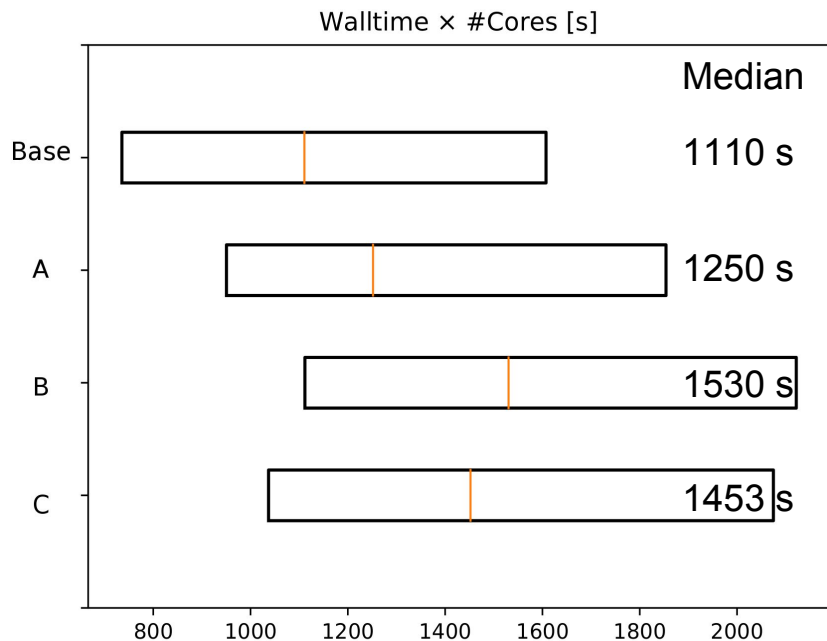
1. Base: Local access (no data lake)
2. A: DLP, data @CERN, WN @CERN
3. B: DLP, data NOT @CERN, WN @CERN
4. C: DLP, 4+2 stripes, WN @CERN

Running Tests backed by the WLCG Data Lake													
State	Id	Host	Template	Start (Europe/Zurich)	End (Europe/Zurich)	Sites	subm jobs	run jobs	comp jobs	fail jobs	tot jobs		
running	20126028	hammercloud-ai-12	1005: PF.T. mc16 Sim_tf 21.0.16 - WLCG Data Lakes - local data clone.989 EULAKE folder CERN	13/Sep, 11:42	14/Sep, 11:03	CERN-PROD_DATALAKES, CERN-PROD_DATALAKES_MCORE, CERN-PROD_DATALAKES_TESTA, 3 more...	2	3	84	16	15	107	
running	20126030	hammercloud-ai-12	1006: benchmark derivation AthDerivation/21.2.8.0 1k events - WLCG Data Lakes - local data clone.977 EULAKE folder CERN	13/Sep, 12:08	14/Sep, 12:11	CERN-PROD_DATALAKES, CERN-PROD_DATALAKES_MCORE, CERN-PROD_DATALAKES_TESTA, 3 more...	1	4	43	6	11	55	
running	20126032	hammercloud-ai-12	1012: A.F.T. AtlasDerivation 20.7.6.4 clone.808 clone.845 EULAKE folder CERN	13/Sep, 12:36	14/Sep, 13:51	ANALY_CERN-PROD_DATALAKES, ANALY_CERN-PROD_DATALAKES_TESTA, 2 more...	5	0	0	0	0	5	
running	20126035	hammercloud-ai-12	1007: benchmark digi+reco derivation Athena/21.0.53 5 events - WLCG Data Lakes - local data clone.987 EULAKE folder CERN	13/Sep, 14:30	14/Sep, 13:11	CERN-PROD_DATALAKES, CERN-PROD_DATALAKES_MCORE, CERN-PROD_DATALAKES_TESTA, 3 more...	1	4	23	15	34	44	
Running Tests backed by the standard storages, copy-to-scratch													
State	Id	Host	Template	Start (Europe/Zurich)	End (Europe/Zurich)	Sites	subm jobs	run jobs	comp jobs	fail jobs	tot jobs		
running	20126021	hammercloud-ai-73	845: AFT AtlasDerivation 20.7.6.4 clone.808	12/Sep, 20:42	13/Sep, 21:19	ANALY_ARNES, ANALY_ARNES_DIRECT, ANALY_AUSTRALIA, 142 more...	263	231	11967	1848	13	14338	
running	20126036	hammercloud-ai-12	977: benchmark derivation AthDerivation/21.2.8.0 1k events - WLCG Data Lakes - local data	13/Sep, 14:46	14/Sep, 13:32	NIKHEF-ELPROD, SARA-MATRIX, BNL_PROD, 5 more...	2	7	36	0	0	45	
running	20126040	hammercloud-ai-12	989: PF.T. mc16 Sim_tf 21.0.16 - WLCG Data Lakes - local data	13/Sep, 15:40	14/Sep, 14:57	NIKHEF-ELPROD, SARA-MATRIX, BNL_PROD, 5 more...	3	4	32	1	3	40	
running	20126046	hammercloud-ai-12	987: benchmark digi+reco derivation Athena/21.0.53 5 events - WLCG Data Lakes - local data	13/Sep, 19:12	14/Sep, 18:10	NIKHEF-ELPROD, SARA-MATRIX, BNL_PROD, 5 more...	1	4	9	2	13	16	
running	65532	hammercloud-ai-34	195: functional T3_CH_CERN_DOMA	12/Sep, 10:16	14/Sep, 8:15	CERN Tier-0	T3_CH_CERN_DOMA	24	3	415	0	0	442

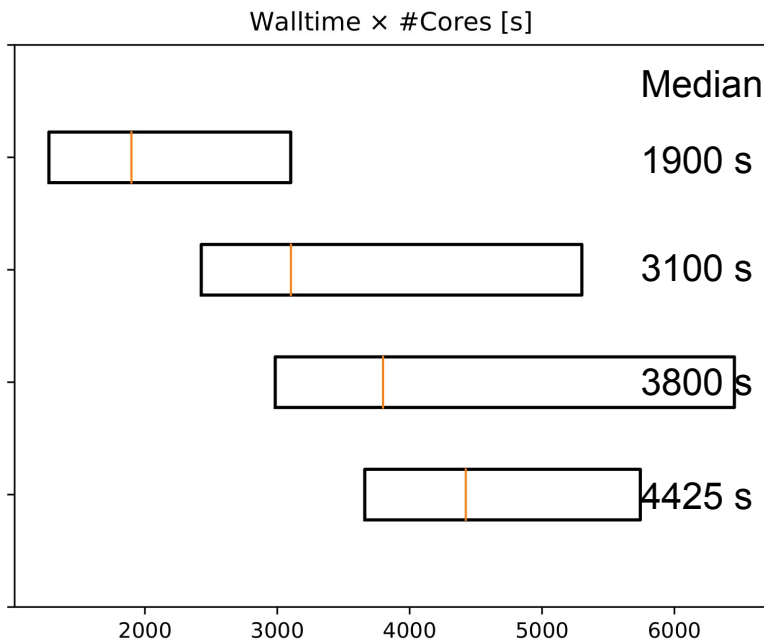
# Data Lake, Stage-in Time



# Data Lake, WallTime x cores



Low I/O intensity workflow



High I/O intensity workflow

**Base:**  
No data lake

**A:** Data lake;  
data @CERN  
WN @CERN

**B:** Data lake;  
data not @CERN  
WN @CERN

**C:** Data lake;  
data 4+2,  
WN @CERN



# WLCG Data Organization Management Access Activities

- Third Party Copy
  - investigate, commission & deploy alternative TPC protocols to gridFTP; prototype token-based auth in TPC
- Content Delivery and Caching
  - data access performance, content delivery and caching
- QoS
  - at the storage level: define, implement & expose different classes based on performance/reliability need and affordability; integrate the notion of the storage classes up
- DOMA and Related Network activities
  - network R&Ds; focus on data transfer: DTNs, low level transfer protocols, bandwidth on demand, P2P channels, SDNs, ...
- DOMA and AAI
  - prototyping an architecture; x509 free, based on Jason Web Tokens
- N.B.: HEP Community White Paper Roadmap [arXiv:1712.06982](https://arxiv.org/abs/1712.06982)

# Performance metrics and measurements in the Data Lake mode



- Trying to understand if distributed storage saves cost
- With any distributed storage, we can study, measure, and benchmark
  - jobs and distributed storage performance
  - with different workflows
  - w.r.t. different data access modes

⇒ *Can we hide latency and average out bandwidth so that the data location becomes irrelevant?*

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