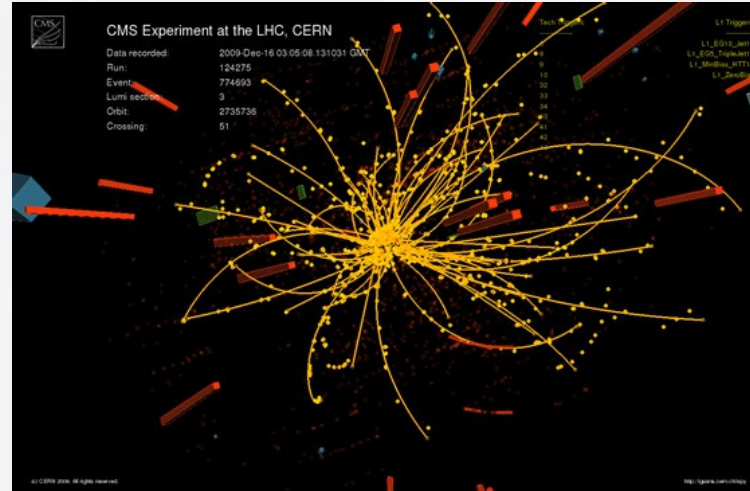


# The Extreme Scale: Data Analytics at LHC (the Large Hadron Collider)

## A view from 10'000 m



**ISC 2012**

**Sverre Jarp, CERN openlab CTO**

**Hamburg, 20 June 2012**

# **Analytics ?**

- **According to Wikipedia:**
  - **“Analytics is the discovery and communication of meaningful patterns in data. It relies on the simultaneous application of Statistics, Computer Programming and Operations Research to approach problems in business and industry. Analytics often favours Data Visualization to communicate insight”**



# About CERN



- **CERN is the European Organization for Nuclear Research in Geneva**
  - Particle accelerators and other infrastructure for high energy physics (HEP) research
  - Worldwide community
    - 20 members states (+ 3 incoming members)
    - Observers: Turkey, Russia, Japan, USA, India
    - About 2300 staff
    - >10'000 users (about 5'000 on-site)
    - Budget (2011) ~1000 MCHF
- **Birthplace of the World Wide Web**





Mont Blanc (4,808m)

Geneva (pop. 190'000)

Lake Geneva (310m deep)

SUISSE  
FRANCE

CMS

LHCb

ATLAS

CERN Meyrin

CERN Prévessin

SPS 7 km

ALICE

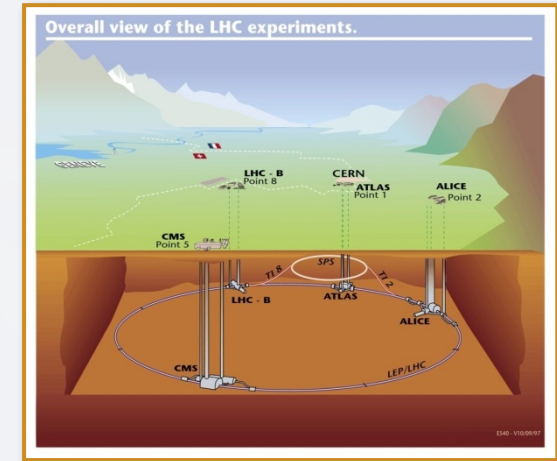
LHC 27 km



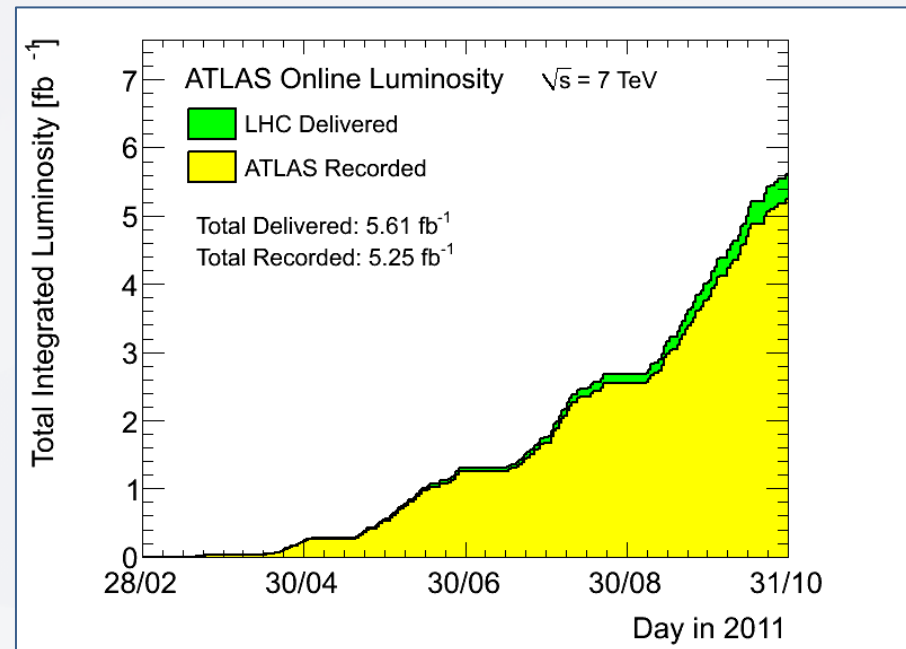


# Large Hadron Collider (LHC)

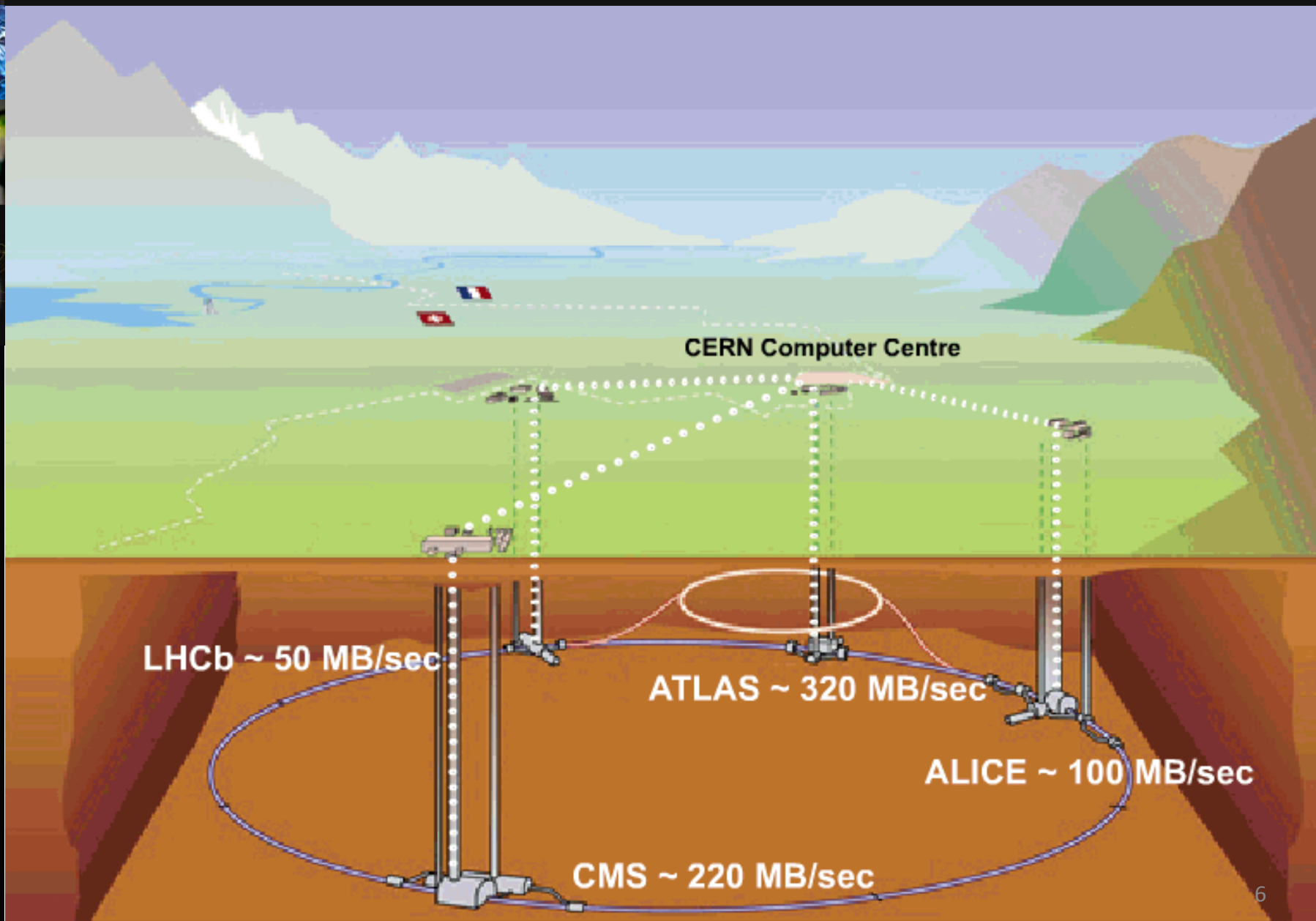
- **The biggest machine ever built**
  - 27 km, 100 meters below ground
- **Activities started in 2009**
  - Highest energy in an accelerator
  - Large data sample of recorded collisions (events) available for high energy physics (HEP) measurements



- $10^7$  collisions per second
- Fortunately most collisions are uninteresting !

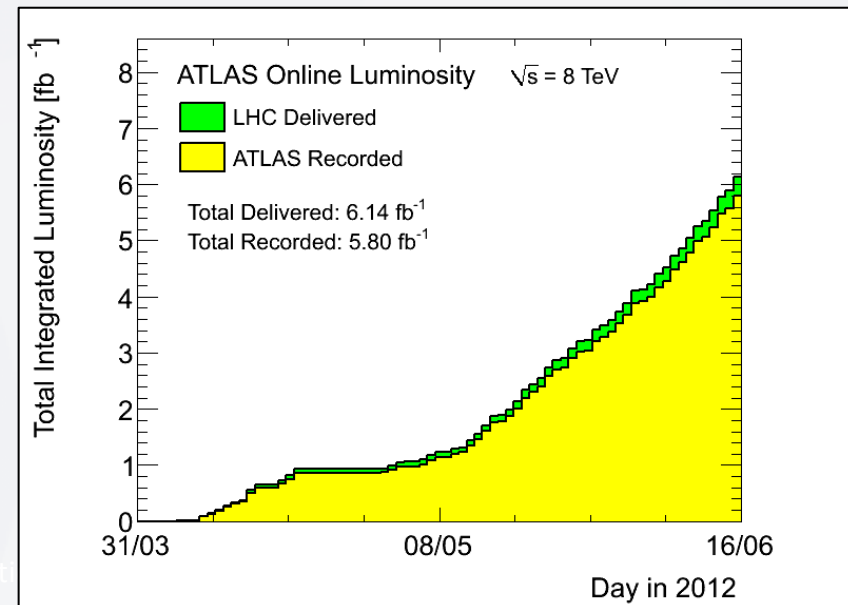
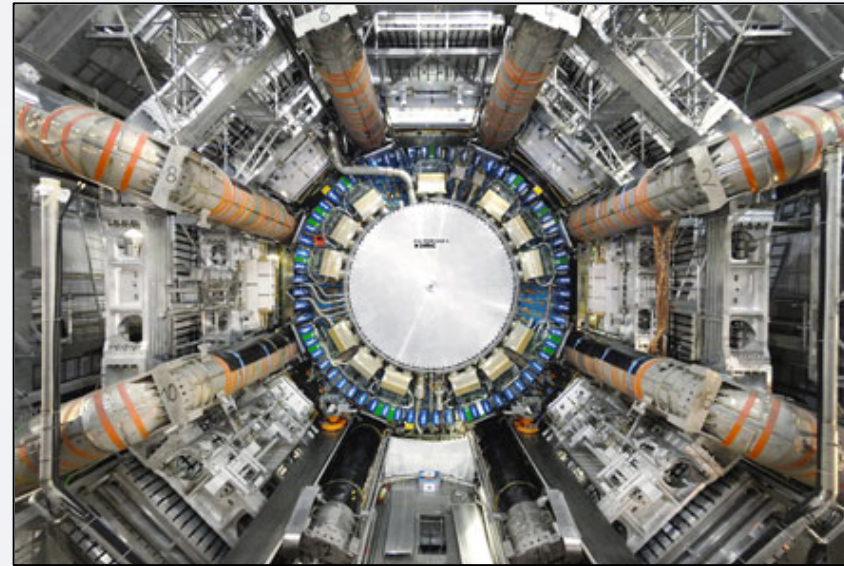


# Data acquisition and storage for LHC @ CERN



# LHC is more productive than ever

- From our home page (13 June 2012):
  - It has already delivered more collisions than in the whole of 2011
  - Last year, [ATLAS](#) and [CMS](#) each recorded a total of around 5.6 inverse femtobarns of data. This measure of accelerator performance is equivalent to about 560 trillion proton-proton collisions. The accelerator today passed last year's totals and is well on its way its goal of delivering 1500 trillion proton-proton collisions in 2012.
  - The LHC is now operating at 1380 proton bunches per beam, the maximum value set for this year, with around  $1.5 \times 10^{11}$  protons in each bunch. The accelerator has also far exceeded the best instantaneous collision rate achieved last year: the maximum peak luminosity in 2011 was  $3.6 \times 10^{33}$  collisions per square centimetre per second; the LHC has now reached  $6.8 \times 10^{33}$  cm<sup>-2</sup> s<sup>-1</sup>.
  - The higher collision energy of 4 TeV per beam this year (compared to 3.5 TeV per beam in 2011) and the resulting higher number of collisions are expected to enhance the machine's discovery potential considerably, opening up new possibilities in the searches for new and heavier particles.



# Data Handling and Computation for Physics Analysis



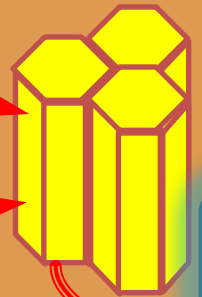
Online trigger and filtering

Selection & reconstruction

Processed Data (Active tapes)

## Offline Reconstruction

100% Raw data



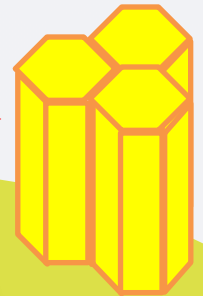
Event reprocessing



Event summary data  
10%

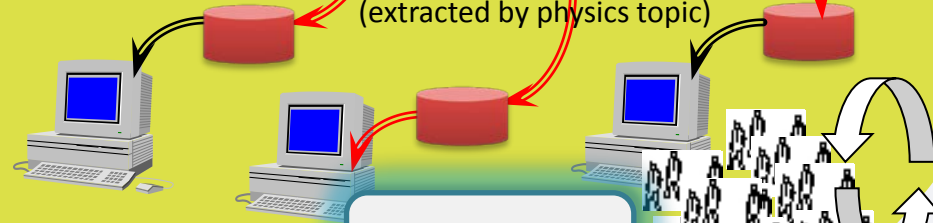
Batch physics analysis

1%



## Offline Analysis w/ROOT

Analysis objects (extracted by physics topic)



Interactive analysis

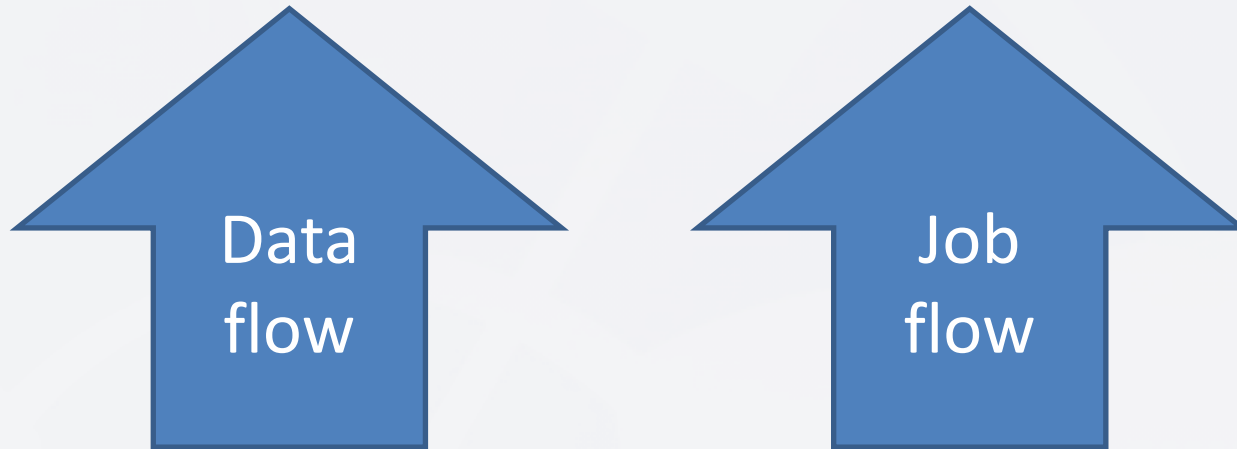
Event simulation

Offline Simulation w/GEANT4



# Overview

Advanced analysis software

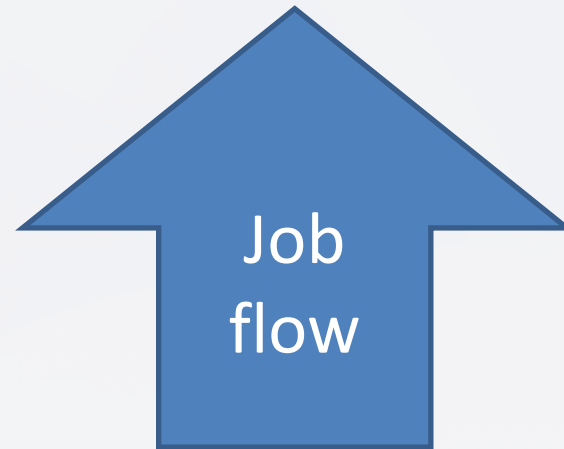
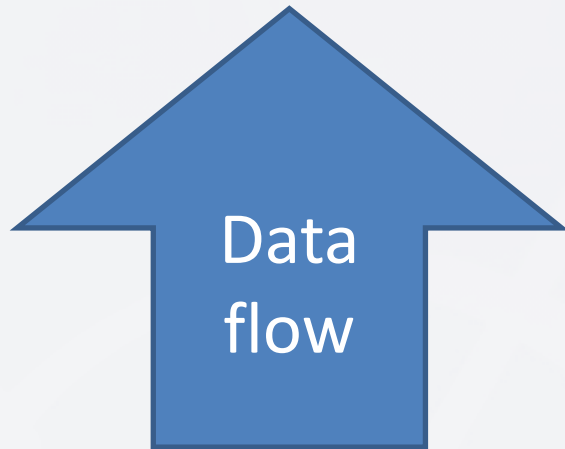


Collaboration

Central Services

# Overview

Advanced analysis software



Collaboration

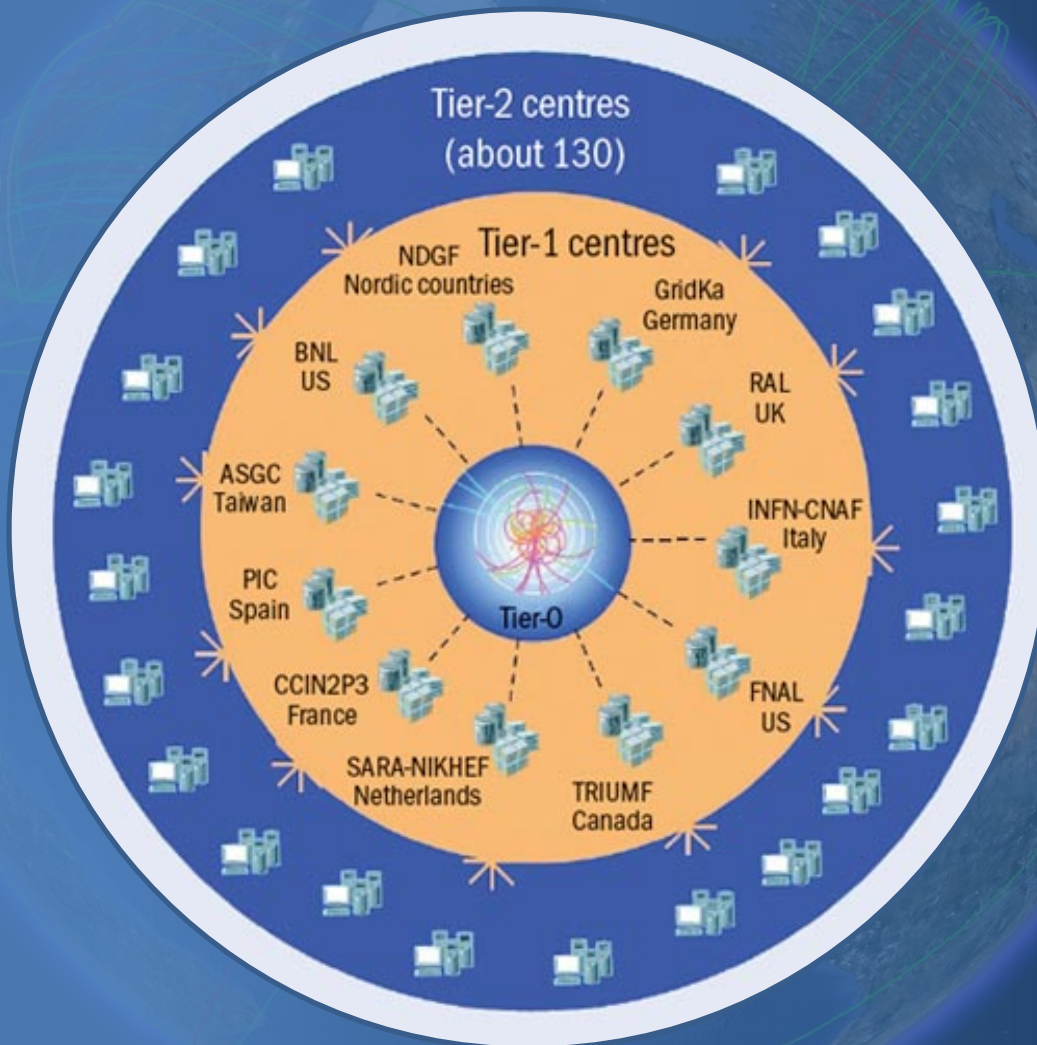
**Central Services**

# The Worldwide LHC Computing Grid

**Tier-0 (CERN):** data recording, reconstruction and distribution

**Tier-1:** permanent storage, re-processing, analysis

**Tier-2:** Simulation, end-user analysis



nearly 160 sites

~250'000 cores

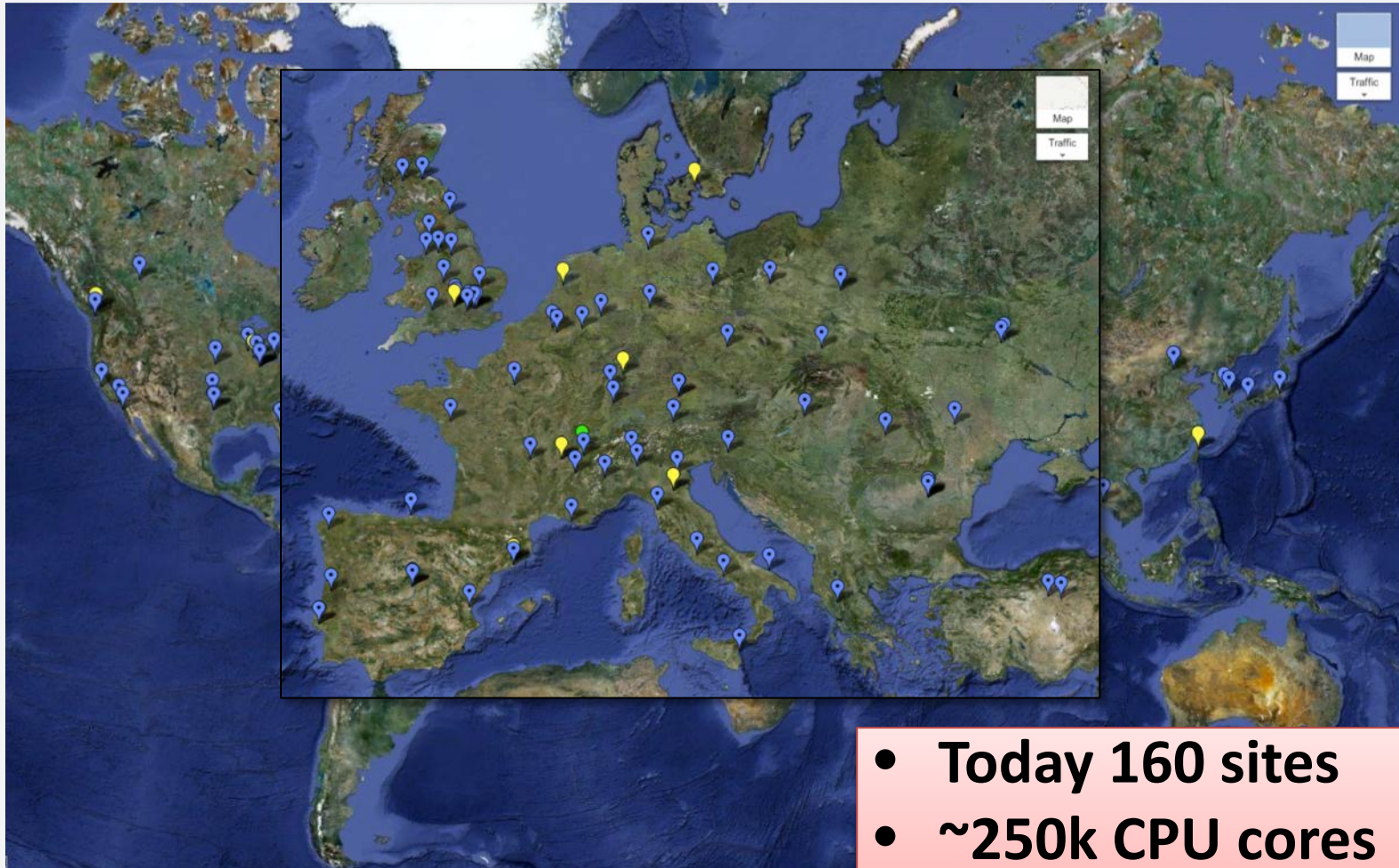
173 PB of storage

> 1 million jobs/day

10 Gb links



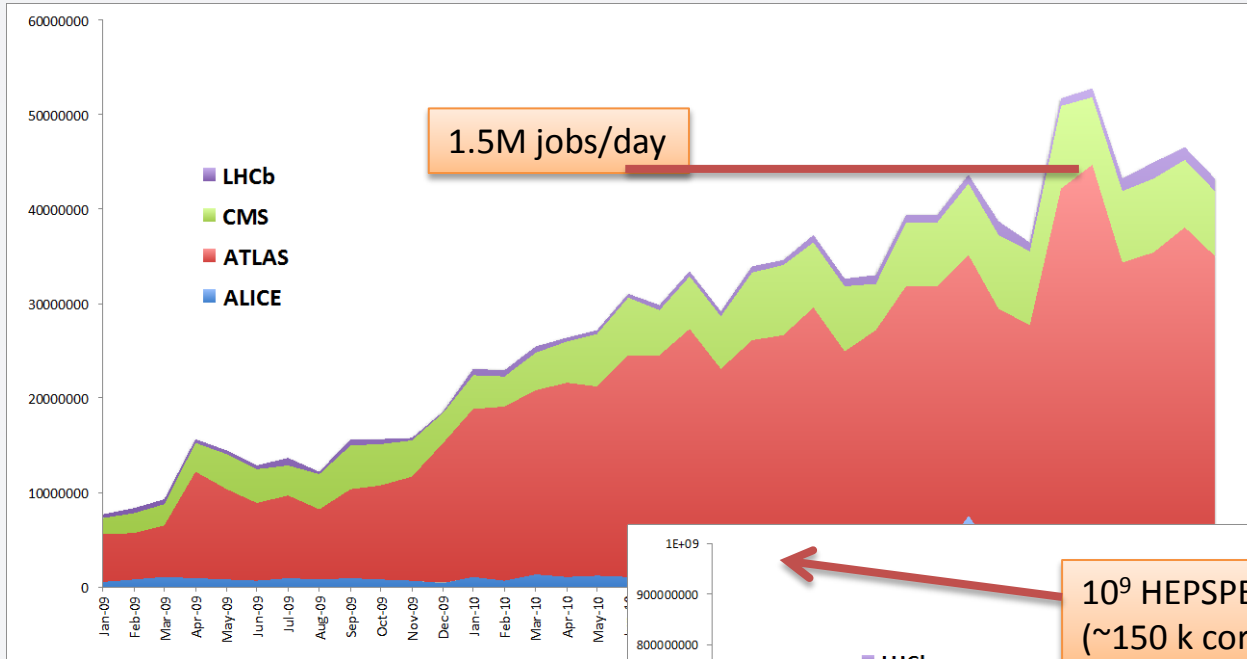
# Larger picture: WLCG Grid Sites



● Tier 0    ● Tier 1    ● Tier 2

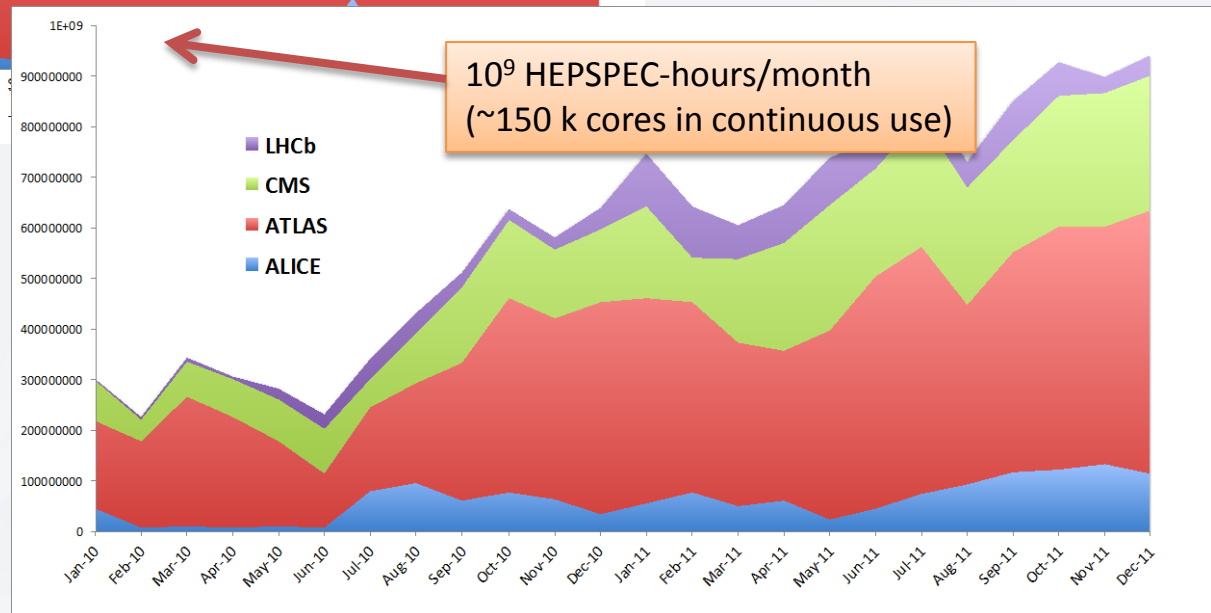
- Today 160 sites
- ~250k CPU cores
- >150 PB disk

# WLCG usage: continues to grow



- **WLCG usage pattern:**
  - = Continuous
  - = Ever increasing load
  - = Some spikes
  - = Mirrored by contributing national Grids

- **Grid middleware handles both job flow and data flow**

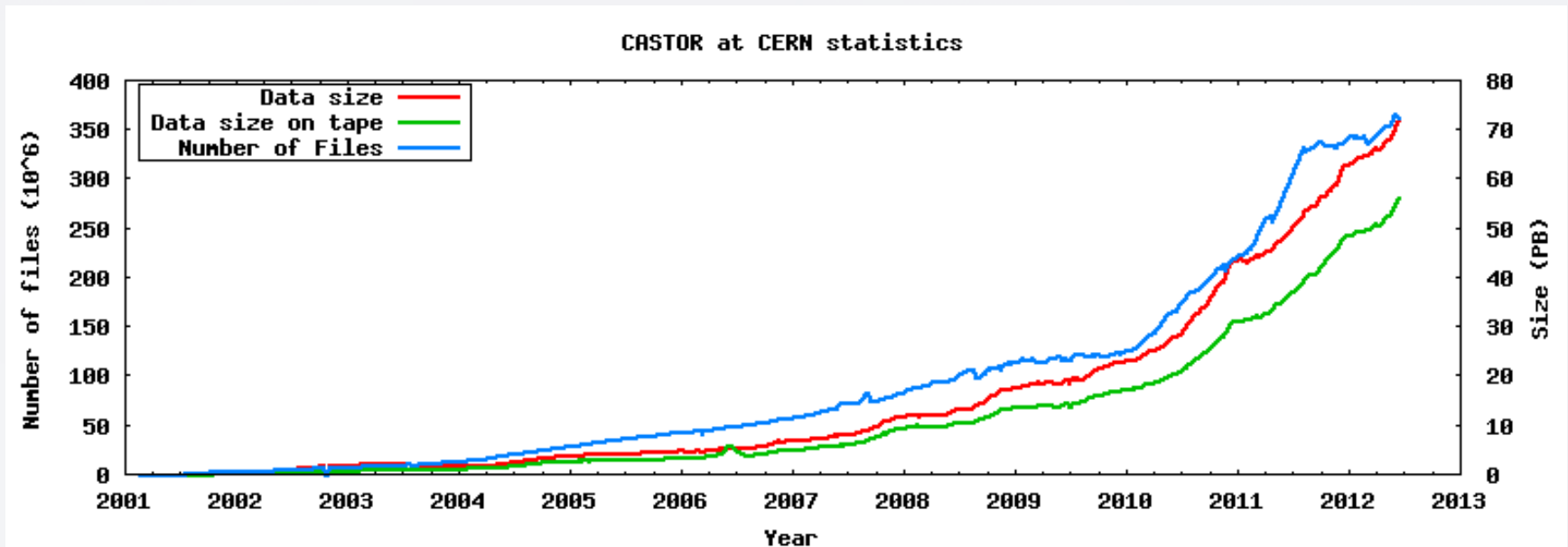


# Tier-0: Central Data Management

- **Hierarchical Storage Management: CASTOR**
  - Rich set of features:
    - Tape pools, disk pools, service classes, instances, file classes, file replication, scheduled transfers (etc.)
  - DB-centric architecture
- **Disk-only storage system: EOS**
  - Easy-to-use, stand-alone, disk-only for user and group data with in-memory namespace
    - Low latency (few ms for read/write open)
    - Focusing on end-user analysis with chaotic access
    - Adopting ideas from other modern file systems (Hadoop, Lustre, etc.)
    - Running on low-cost hardware (JBOD and sw RAID )



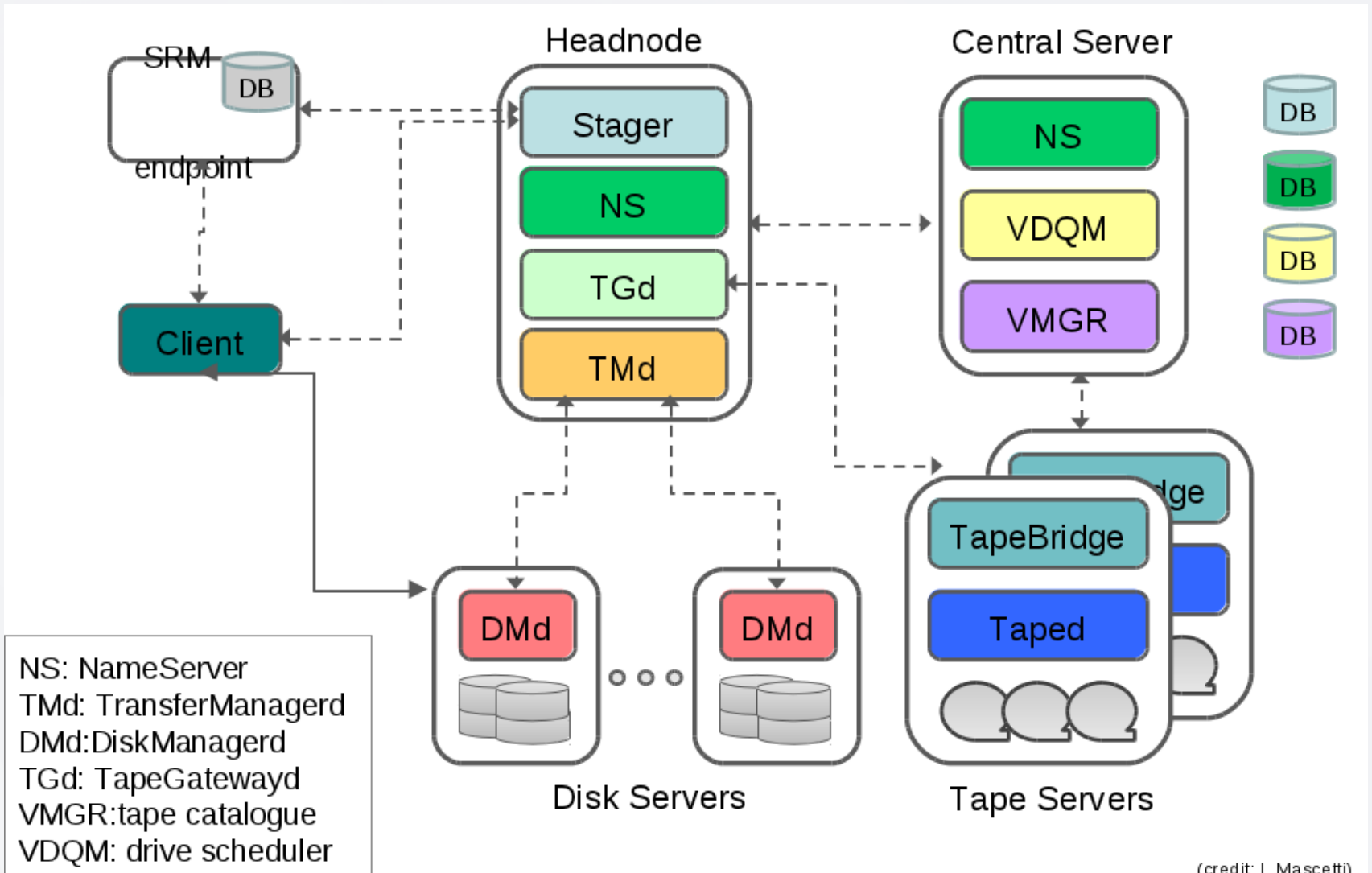
# CASTOR statistics



Current status:

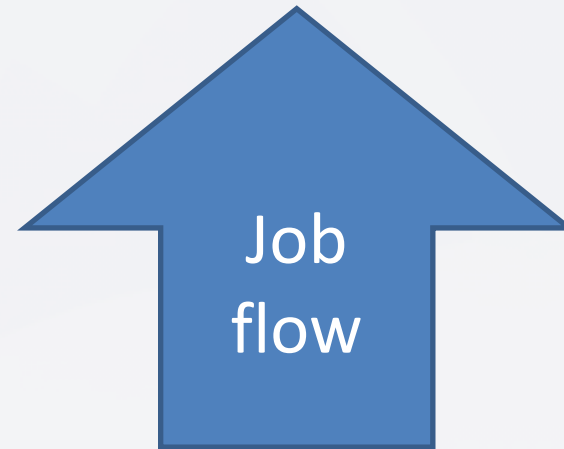
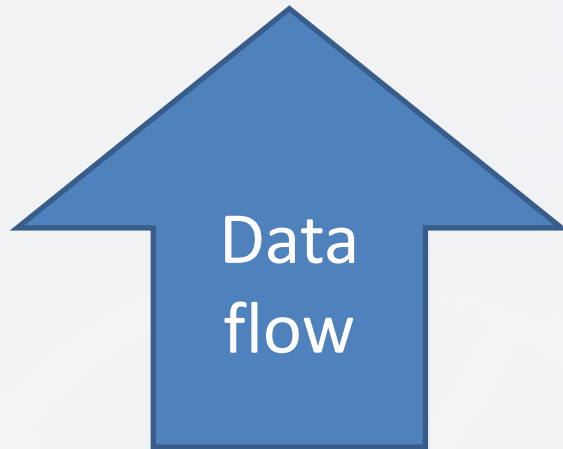
66 petabytes across 362 million files

# CASTOR architecture



# Overview

Advanced analysis software



**Collaboration**

Central Services

ATLAS,  
but same  
issues for  
the others



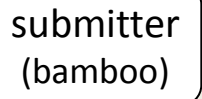
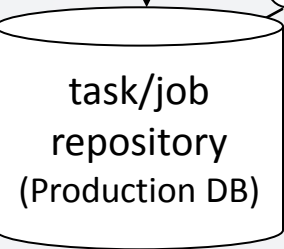
# ATLAS job control

(Production and Distributed Analysis System)

Production managers



define



production job

https

PanDA server

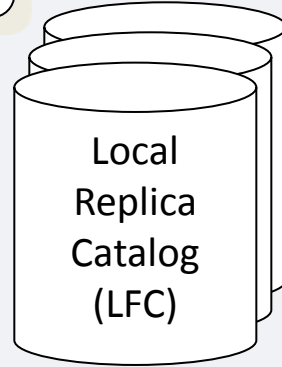


Data Management System (DQ2)

https

Logging System

https



pull

https

job

pilot

analysis job

submit

EGEE/EGI



End-user

https

https

https

OSG

pilot

NDGF

pilot



arc

ARC Interface (aCT)



condor-g

pilot scheduler (autopyfactory)

Worker Nodes



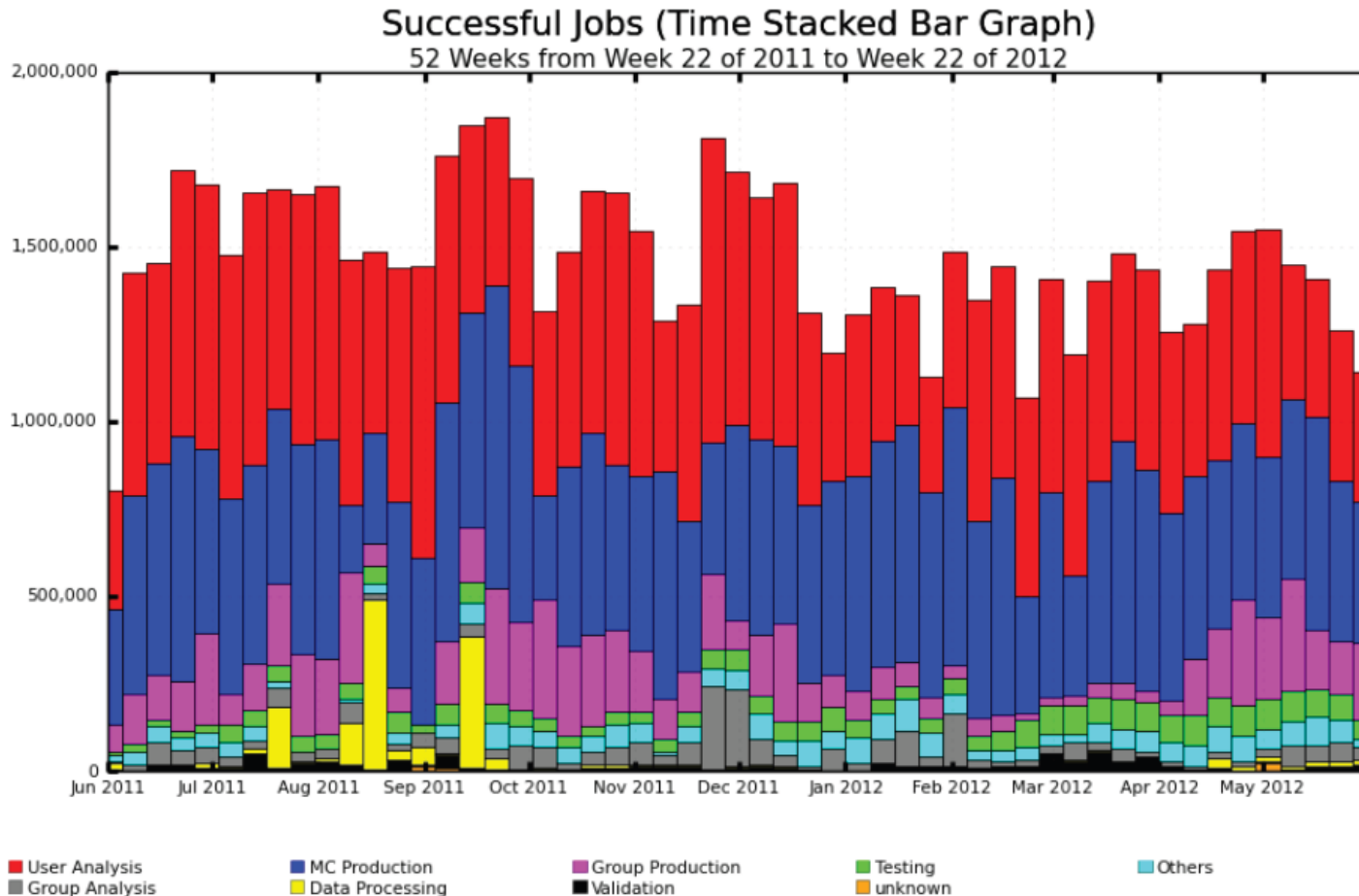
20/06/2012

Credit: T.Maeno

ISC12 Data Analytics

3

# ATLAS User Analysis



4

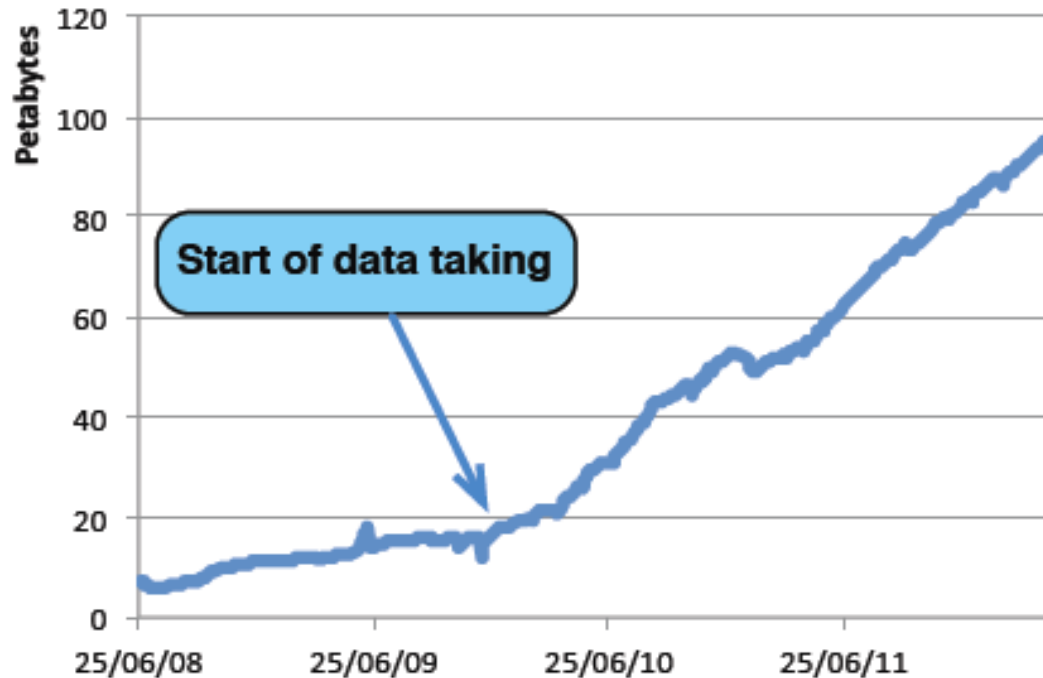
# **ATLAS Distributed Data Management System (DQ2)**

- **The ATLAS Distributed Data Management project is charged with managing ATLAS data on the grid**
- **All for the purpose of helping the collaboration store, manage and process LHC data in a heterogeneous distributed environment**
- 
- **Requirements:**
  - **Catalog data**
  - **Transfer data to/from sites**
  - **Delete data from sites**
  - **Ensure data consistency at sites**
  - **Enforce ATLAS computing model requirements**



# ATLAS DQ2 statistics

## Total Grid Space Usage



## Scale

- 95 PB and 300 million files managed
- 800 users
- 130 sites with 700 storage endpoints

## Grid File Accesses

- 5M/day
- Linear increase (factor 2/year)

## Central Services

- 12M read queries/day
- 0.6M write requests/day

# Overview

Advanced analysis software

Data  
flow

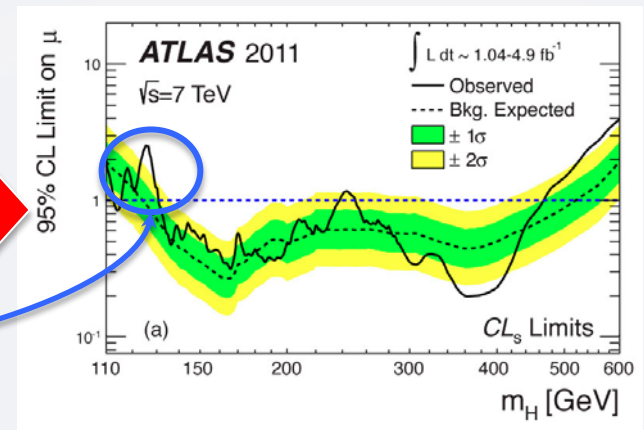
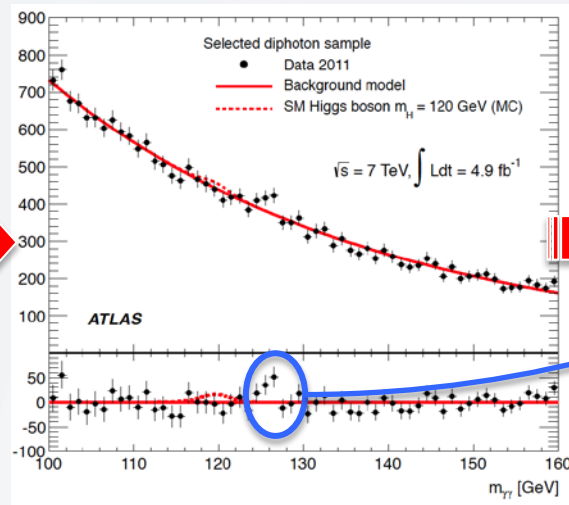
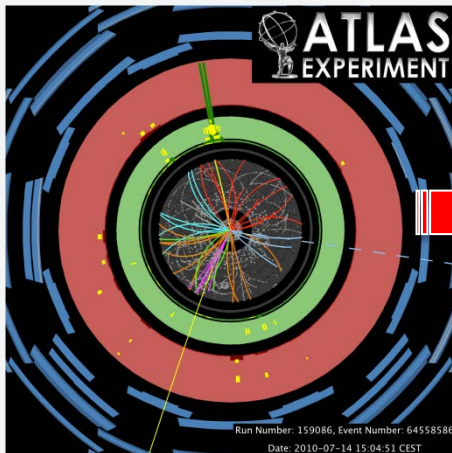
Job  
flow

Collaboration

Central Services

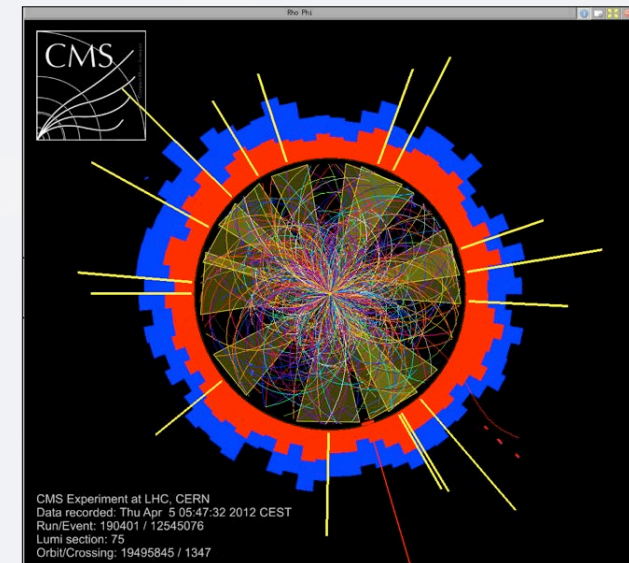
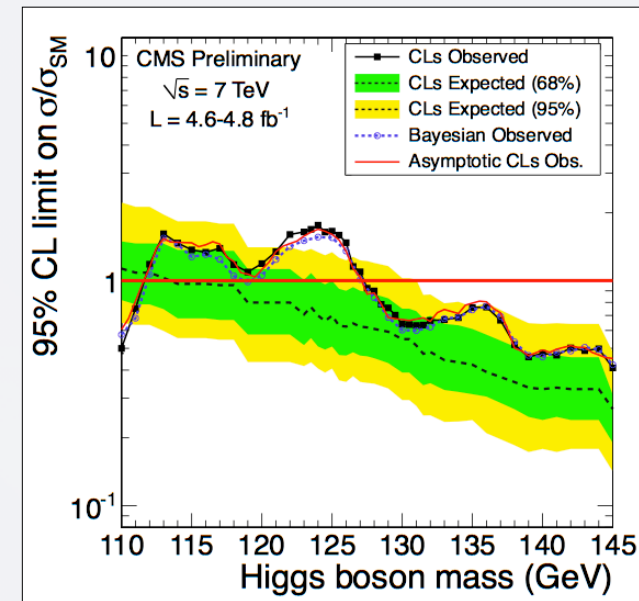
# Data Analysis

- **Huge quantity of data collected, but most of events are simply reflecting well-know physics processes**
  - New physics effects expected in a tiny fraction of the total events: few tens
- **Crucial to have a good discrimination between interesting events and the rest, i.e. different species**
  - Data analysis techniques play a crucial role in this “fight”



# ROOT Object-Oriented toolkit

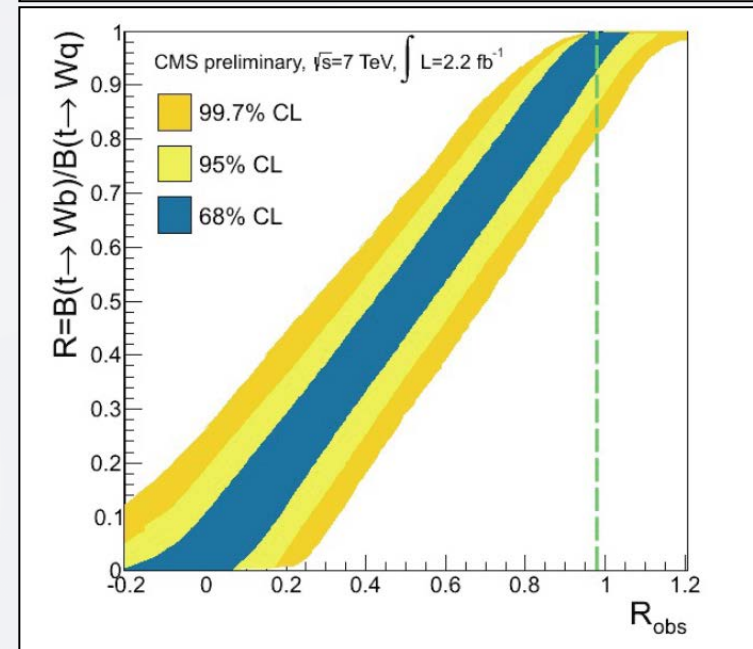
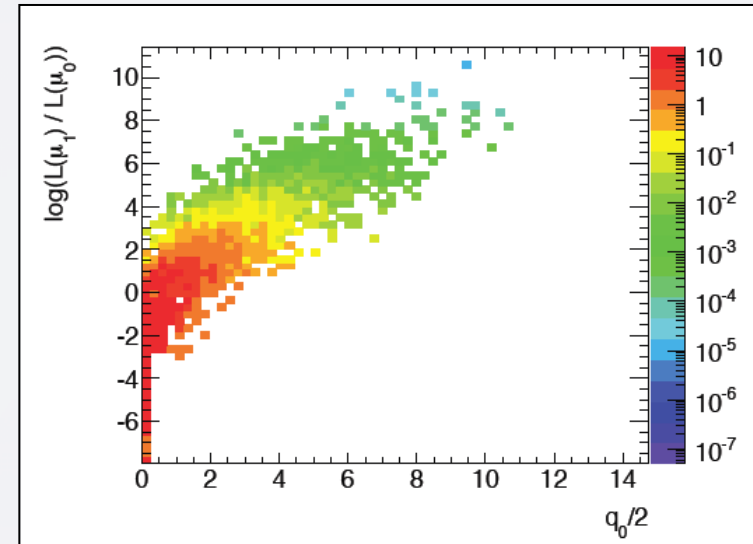
- **Data Analysis toolkit**
  - Written in C++ (millions of lines)
  - Open source
  - Integrated interpreter
  - File formats
  - I/O handling, graphics, plotting, math, histogram binning, event display, geometric navigation
  - Powerful fitting (RooFit) and statistical (RooStats) packages on top
  - In use by all HEP experiments





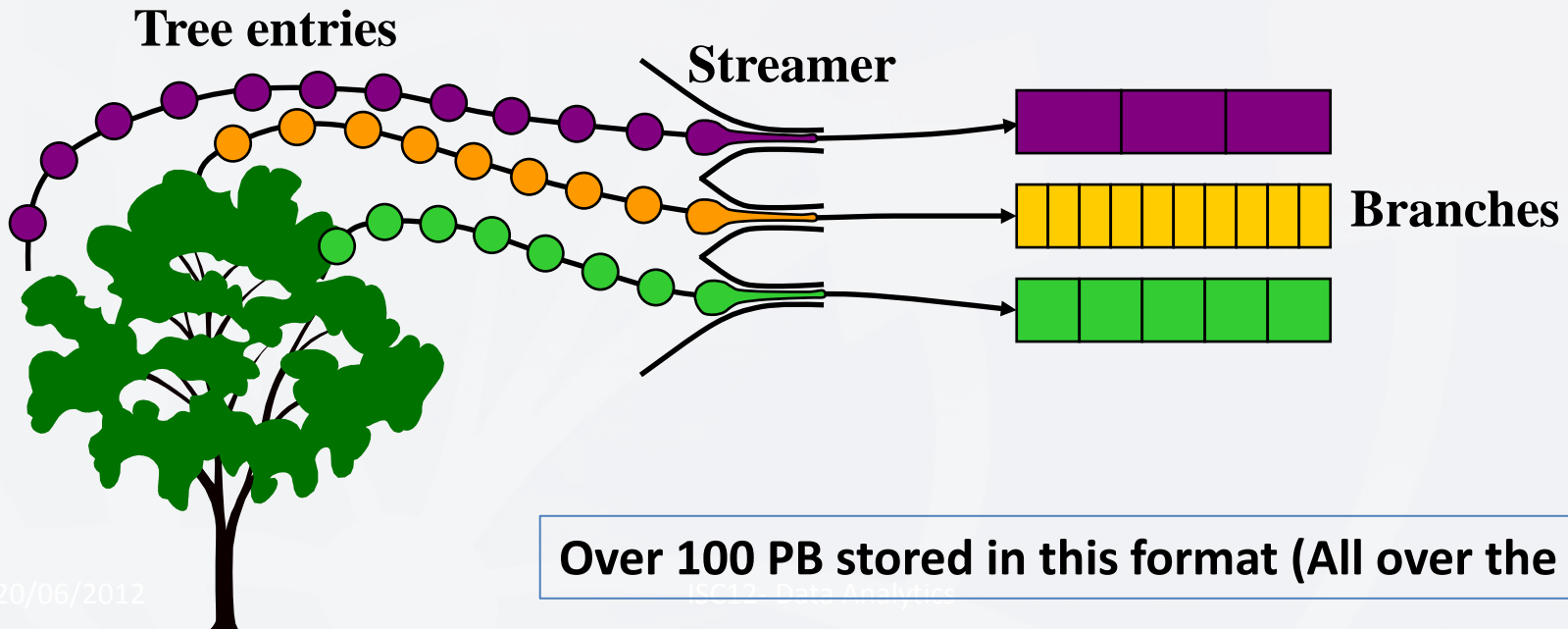
# RooFit/RooStats

- Standard tool for producing physics results at LHC
  - Parameter estimation (fitting)
  - Interval estimation (e.g limit results for new particle searches)
  - Discovery significance (quantifying excess of events)
- Implementation of several statistical methods (Bayesian, Frequentist, Asymptotic)
- New tools for model creation and combinations
  - Histfactory: make RooFit models (RooWorkspace) from input histograms



# ROOT files

- **Default format for all HEP data**
- **Organised as Trees with Branches**
  - Sophisticated formatting for optimal analysis of data
    - Parallelism, prefetching and caching
    - Compression, splitting and merging



Over 100 PB stored in this format (All over the world)

# Conclusions

- **Big Data Analytics requires a solid organisational structure at all levels**
- **Must avoid “Big Headaches”**
  - Enormous files sizes and/or enormous file counts
  - Data movement, placement, access pattern, life cycle
  - Replicas, Backup copies, etc.
- **Big Data also implies Big Transactions/Transaction rates**
- **The LHC community started preparing more than a decade before real physics data arrived**
  - Now, the situation is well under control
  - But, data rates will continue to increase (dramatically) for years to come

**There is no time to rest!**

# THANK YOU

## Q & A



**CERN**  
openlab



# References

- <http://www.cern.ch/>
- <http://wlcg.web.cern.ch/>
- <http://root.cern.ch/>
- <http://eos.cern.ch/>
- <http://castor.cern.ch/>
- <http://panda.cern.ch/>
- <http://www.atlas.ch/>

# Backup