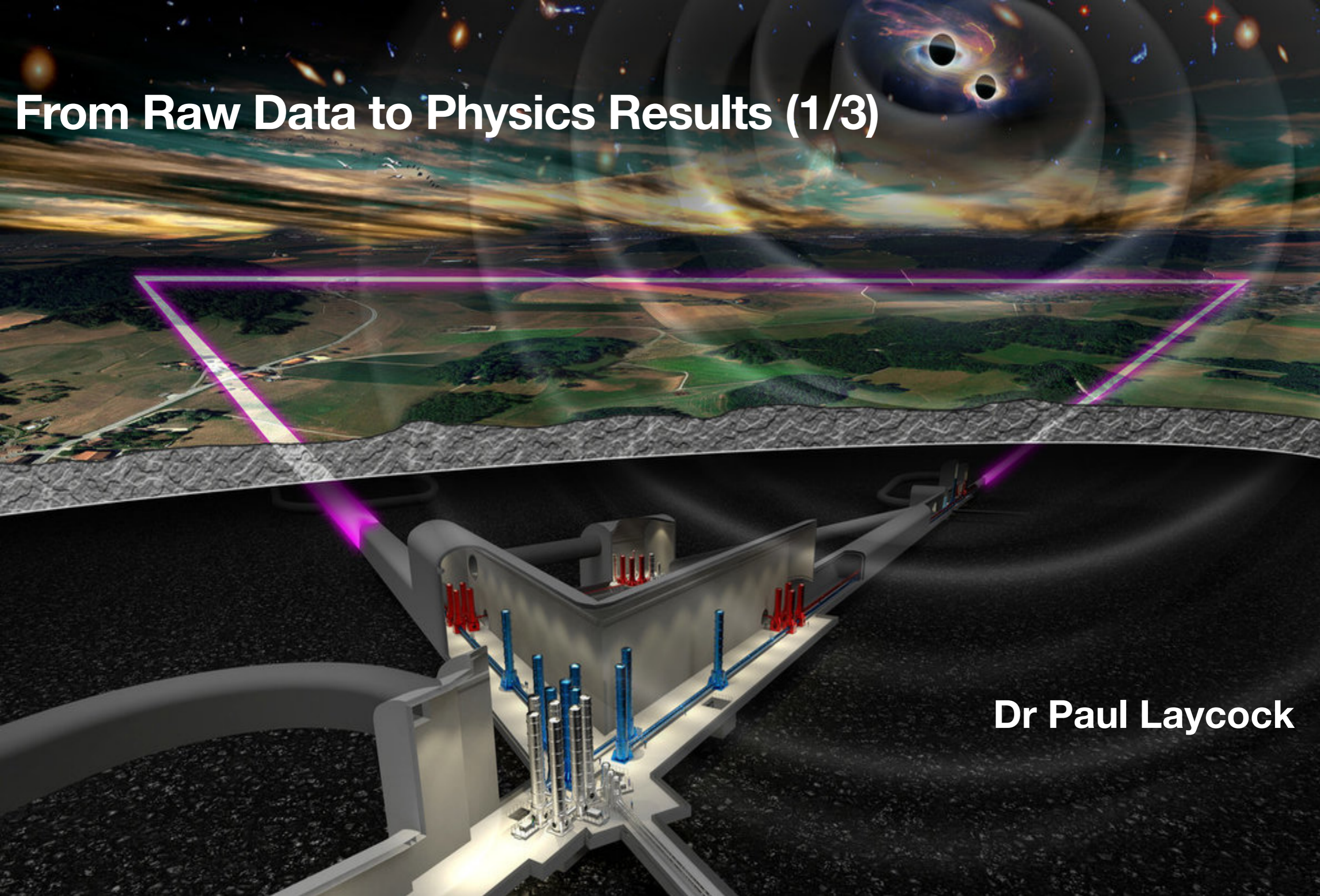
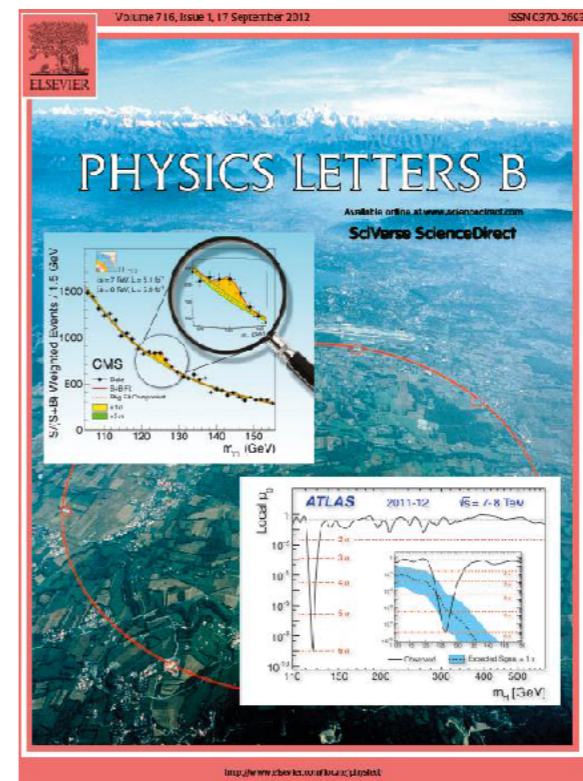
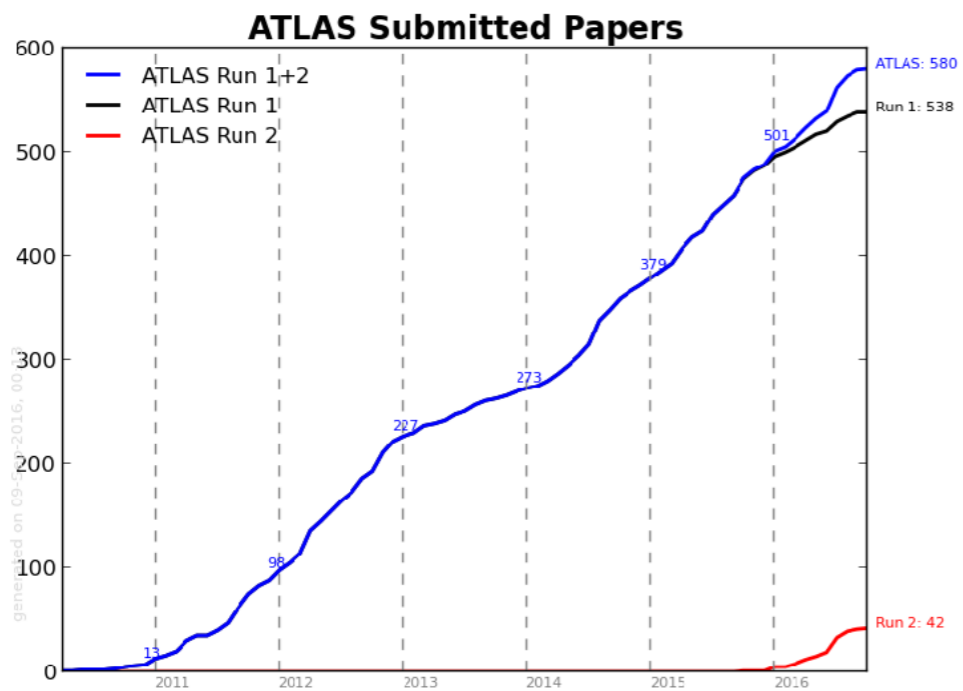
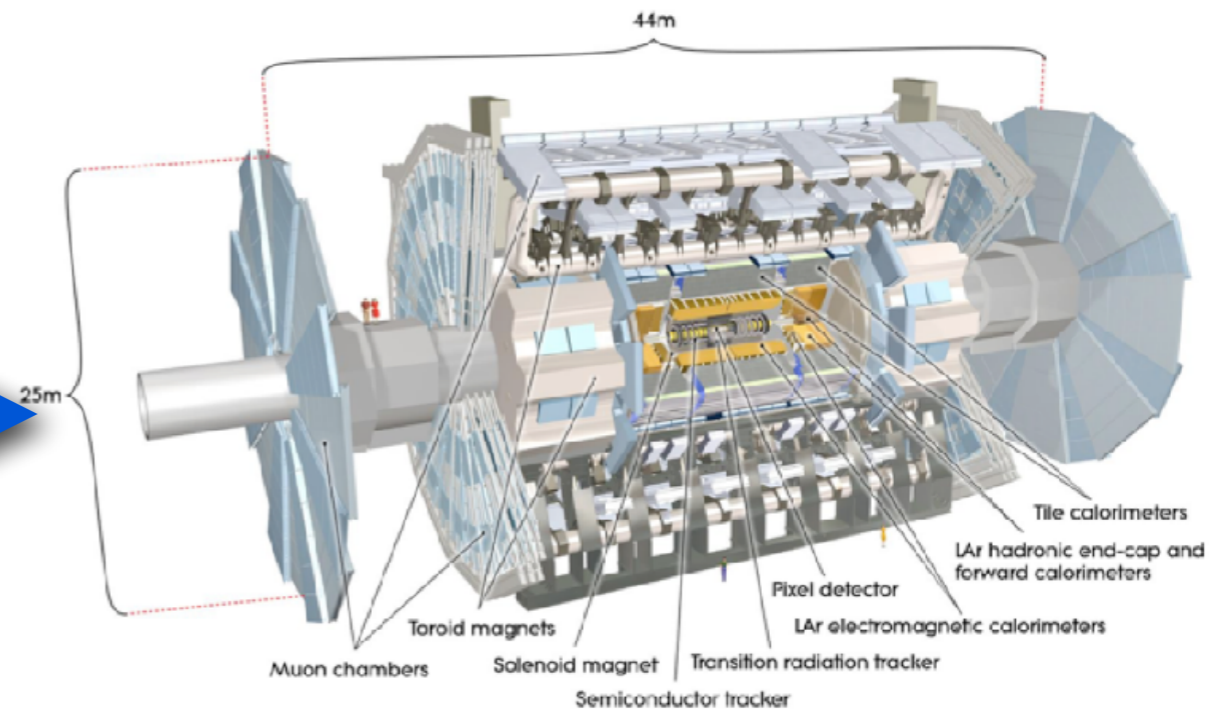
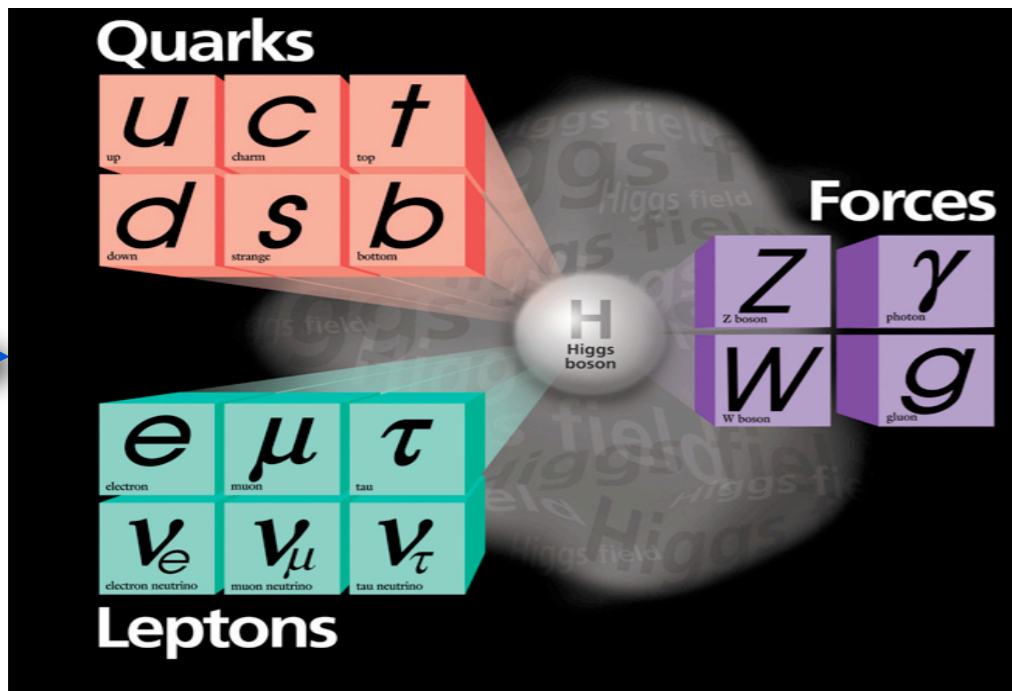


# From Raw Data to Physics Results (1/3)



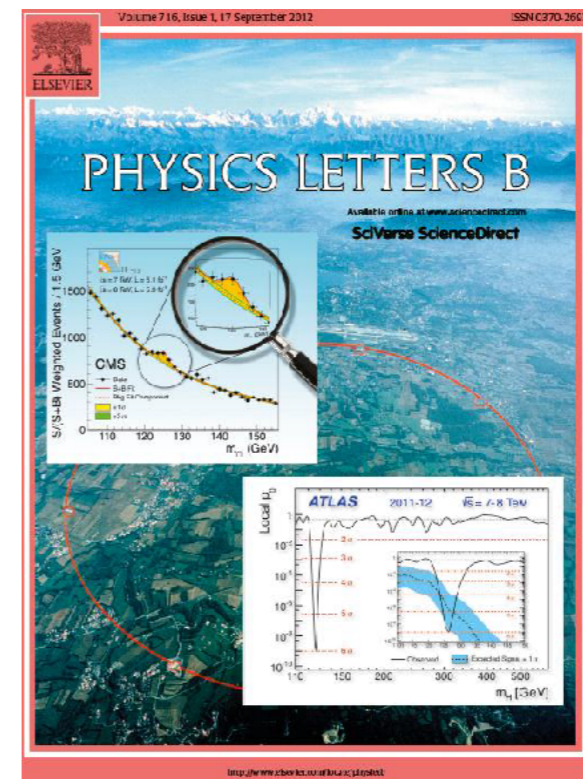
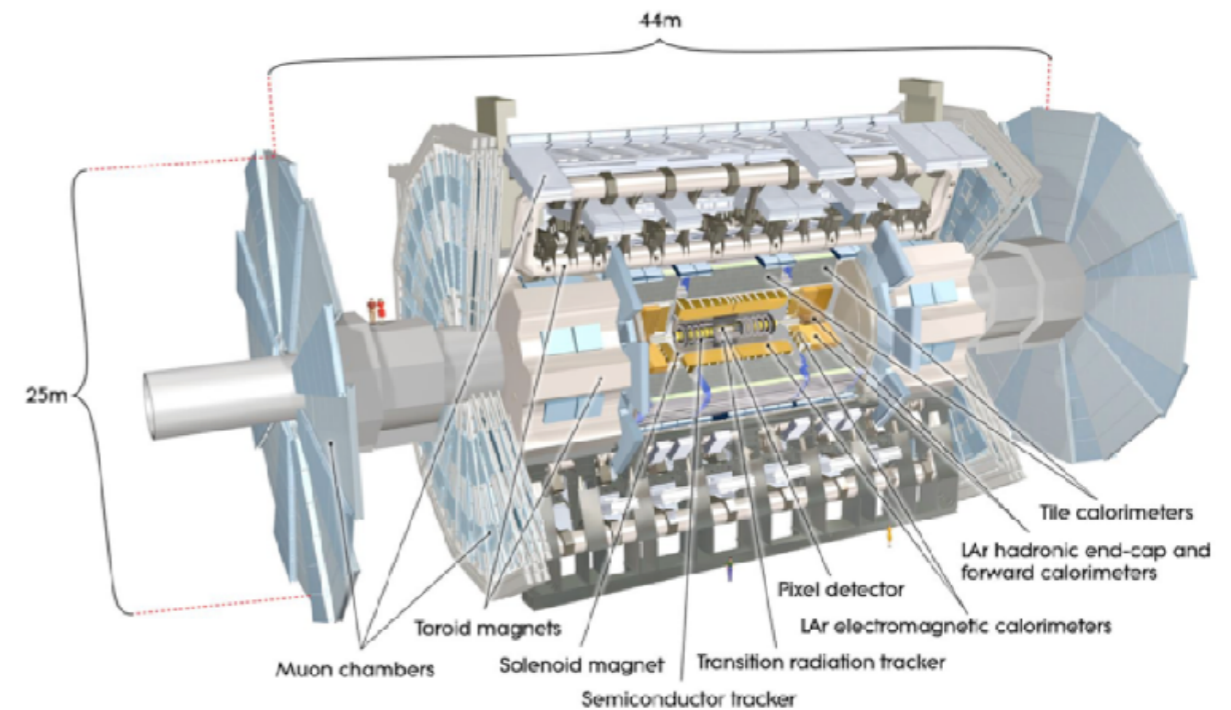
Dr Paul Laycock

# The particle physics cycle



# Experimental physics

- Much of the work of the experimental physicist is running experiments and extracting measurements from them
- **Note** - *Experimental physicists also need to propose, design and build new experiments (see previous slide)*
- These lectures are focused on understanding how we turn raw experimental detector data into physics results that we can publish
  - Results must be **accurate**
  - with well understood **precision**
  - It's important to understand the difference between these two words, we often confuse them



# Accuracy and precision



$$3.1416 \pm 0.0001$$

$$22/7 \pm 1$$

$$3.14159265 \pm 0.1$$

# Course outline

- **Lecture 1**

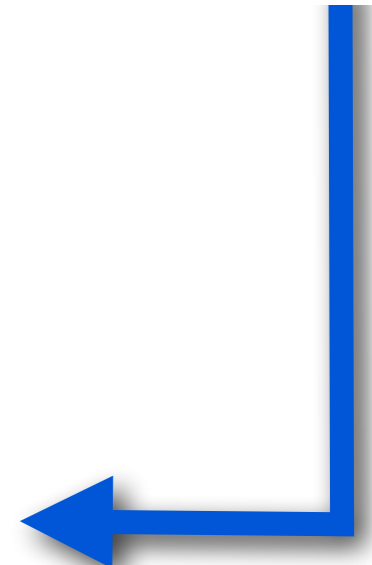
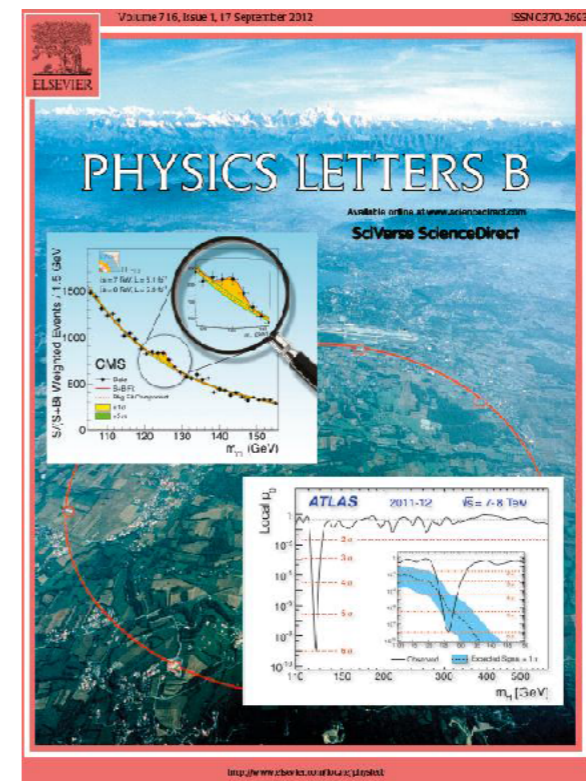
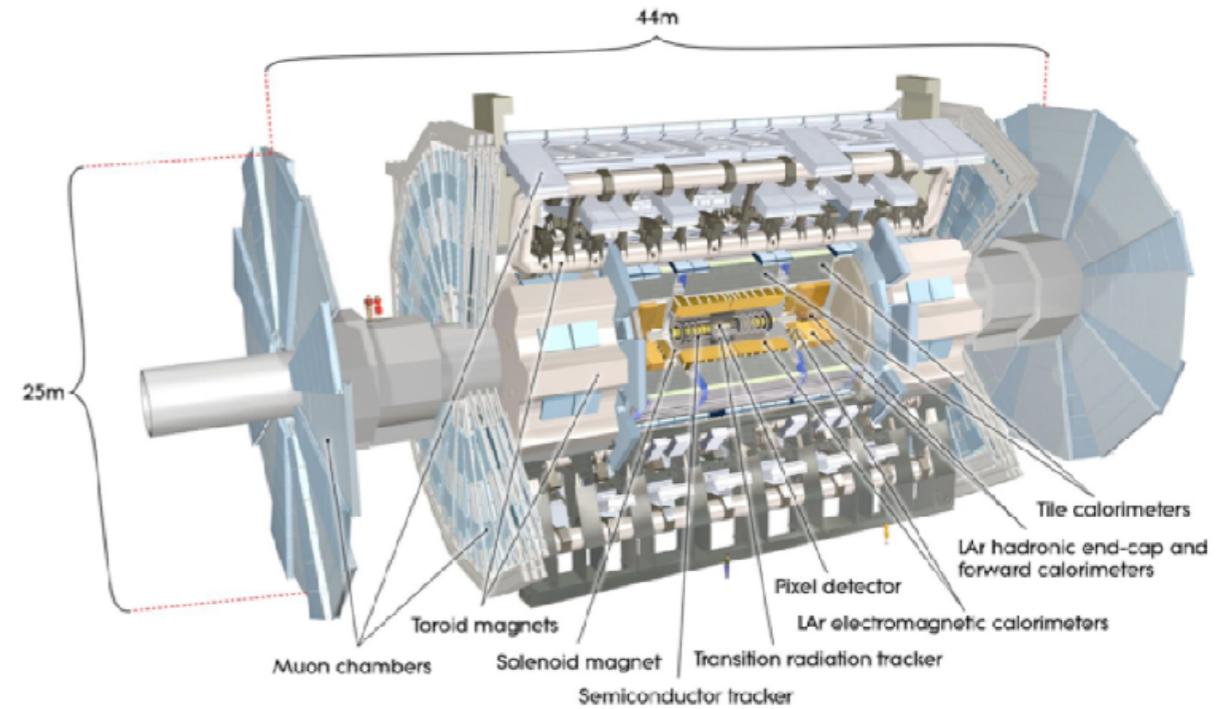
- The journey of raw data from the detector to a publication

- **Lecture 2**

- How we reconstruct fundamental physics processes from raw detector data

- **Lecture 3**

- How we extract our signals from the mountain of data, finding needles in the haystack

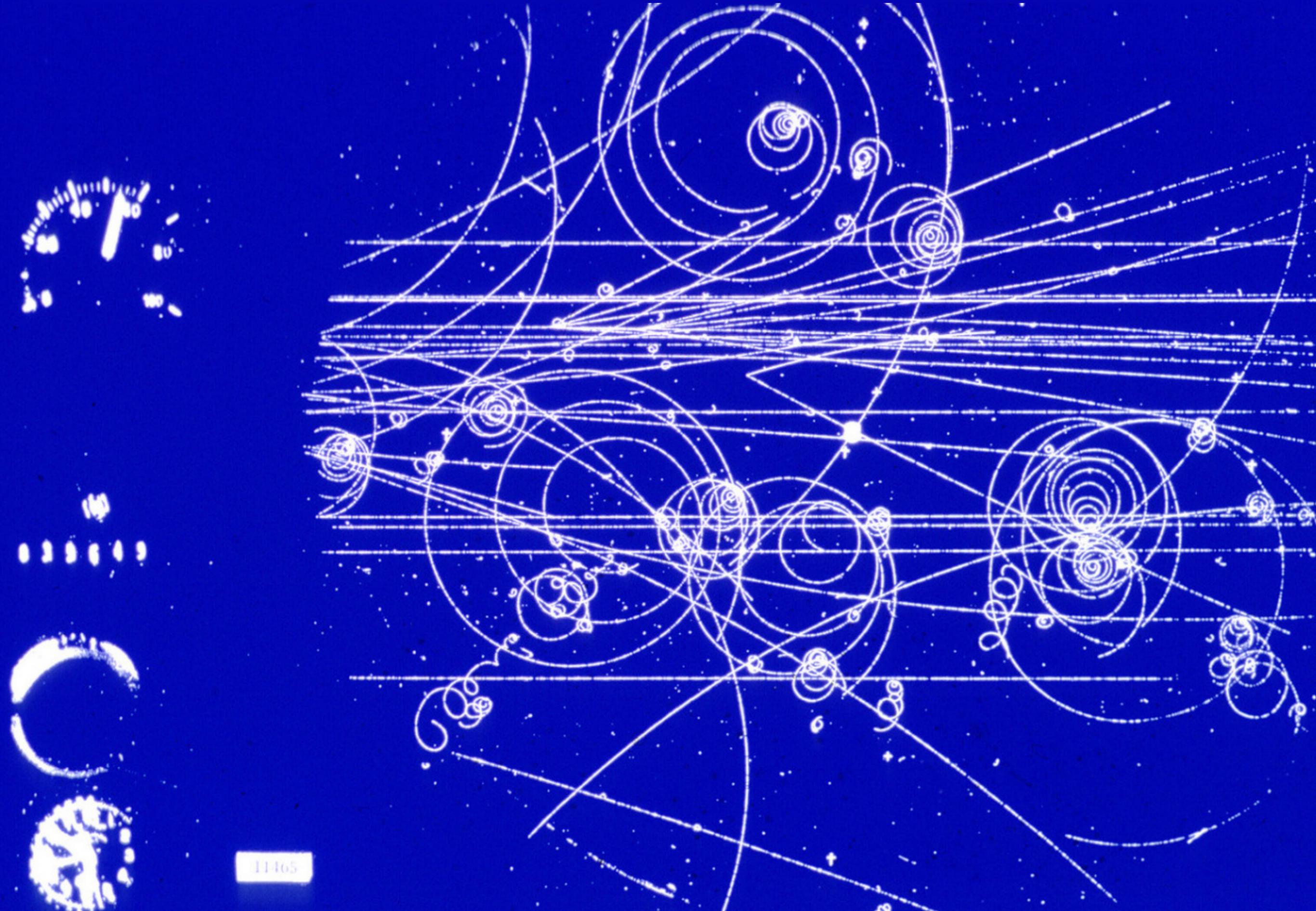


# Experiments at CERN



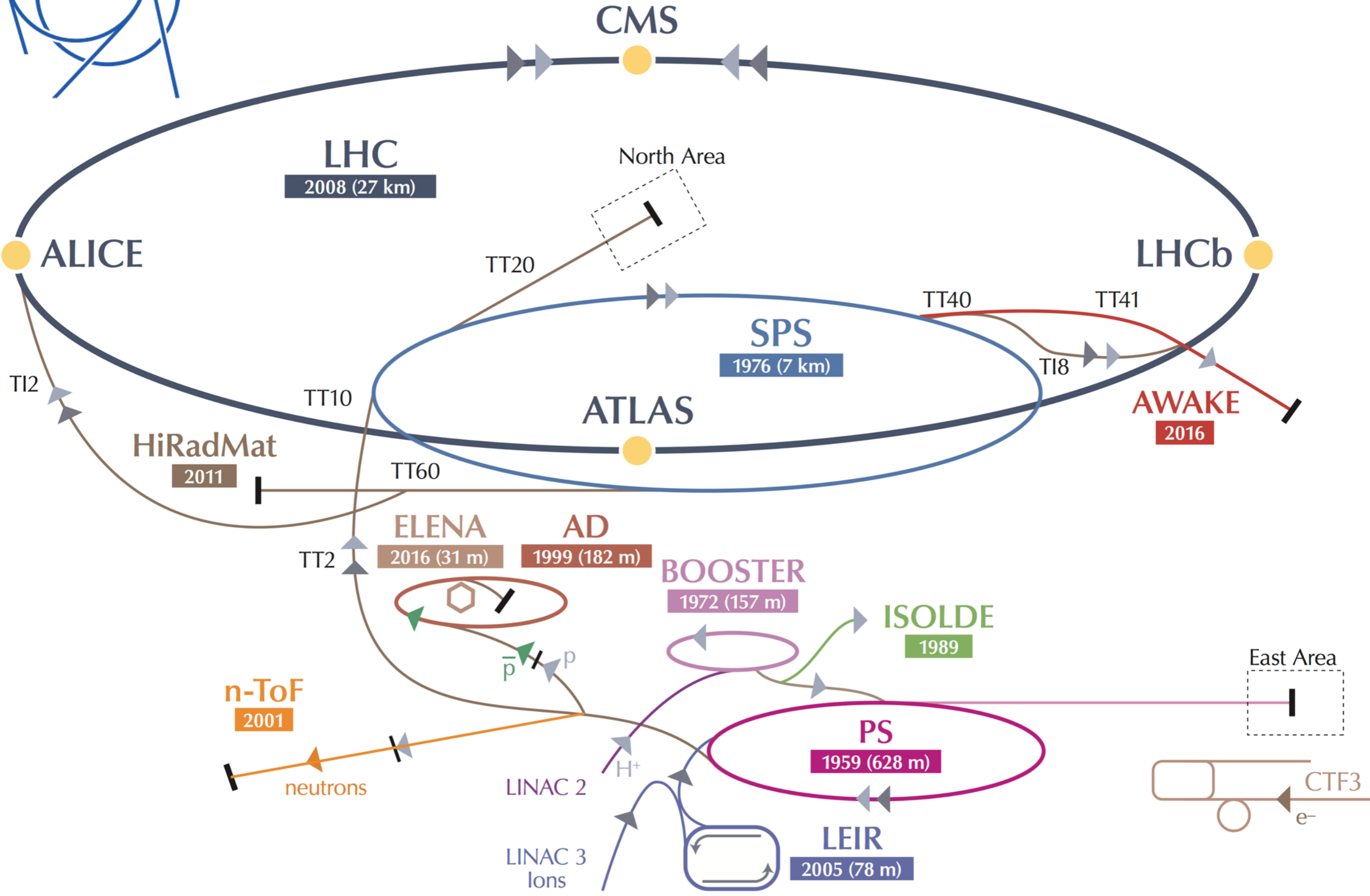
- In the 1960s we used Bubble chambers, the one that you can see in the Microcosm was used...

... data analysis used to involve a person looking at pictures





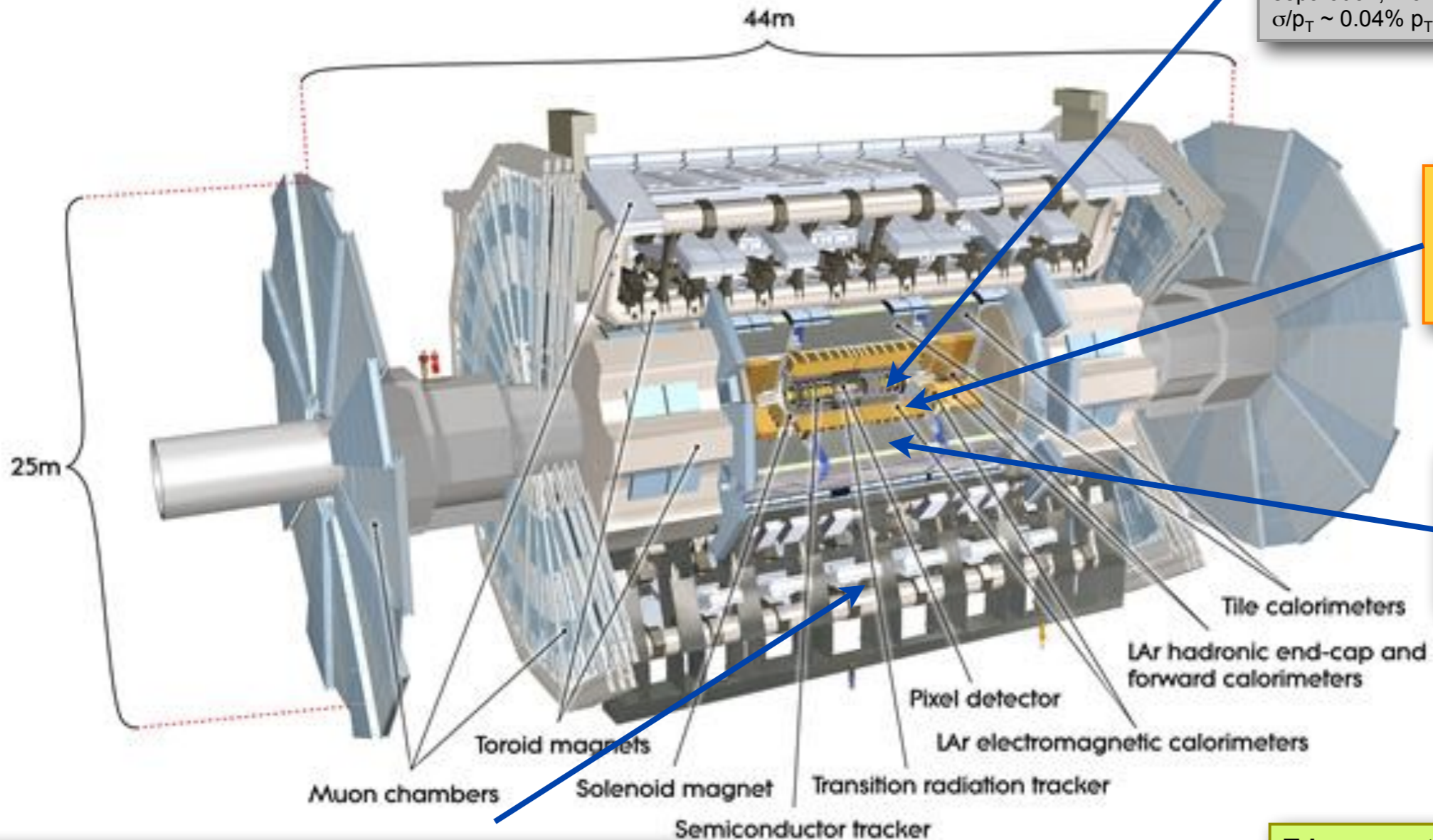
Today @ CERN we have huge rates of collisions so that we can produce very rare events





# The ATLAS Detector @ LHC

L ~ 46 m,  $\varnothing$  ~ 22 m, 7000 tons  
~ $10^8$  electronic channels



**Inner Tracker** ( $|\eta| < 2.5$ ,  $B=2T$ ):  
Si Pixels, Si strips, Trans. Rad. Det.  
Precise tracking and vertexing,  $e/\pi$   
separation, momentum resolution:  
 $\sigma/p_T \sim 0.04\% p_T (\text{GeV}) \oplus 1.5\%$

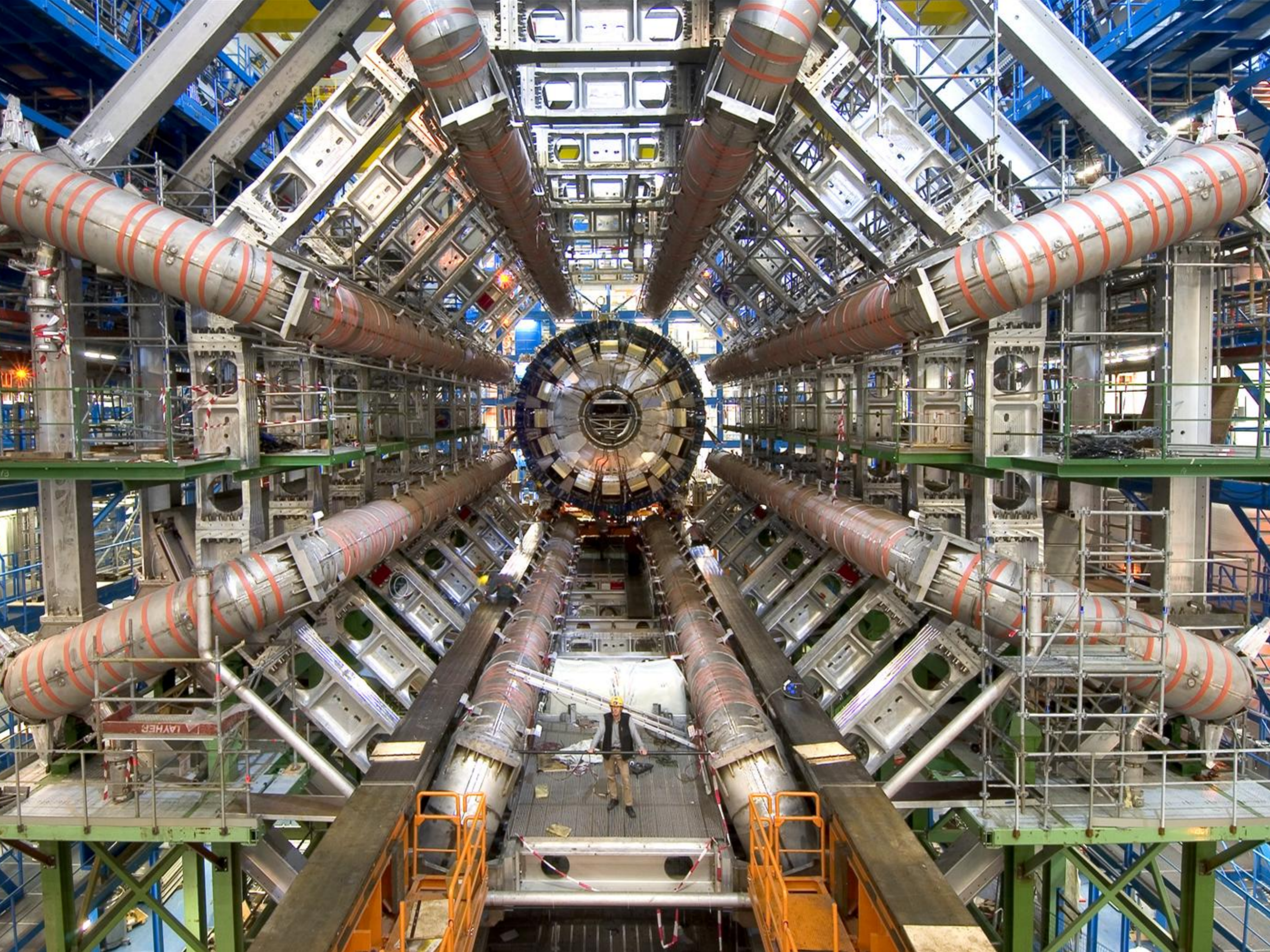
**EM calorimeter:**  
Pb-LAr Accordion,  $e/\gamma$   
trigger, id. and meas.,  
energy res.:  $\sigma/E \sim$   
 $10\%/\sqrt{E} \oplus 0.7\%$

**HAD calorimetry** ( $|\eta| < 5$ ): Fe/  
scintillator Tiles (cen), Cu/W-LAr  
(fwd). trigger and meas. of jets  
and  $E_{T,miss}$ , energy res.:  $\sigma/E \sim$   
 $50\%/\sqrt{E} \oplus 3\%$

**Muon Spectrometer:** air-core toroids with gas-based muon chambers.  
trigger and meas. with momentum resolution  $< 10\%$  up to  $E_\mu \sim 1 \text{ TeV}$

**Trigger system:** 3-levels reducing  
the IA rate from 40 MHz to ~200 Hz

Millions of detector readout channels read out to reconstruct one “event”



Muon Spectrometer

Hadronic Calorimeter

Electromagnetic Calorimeter

Solenoid magnet

Tracking

Transition Radiation Tracker

Pixel/SCT detector

Proton

Muon

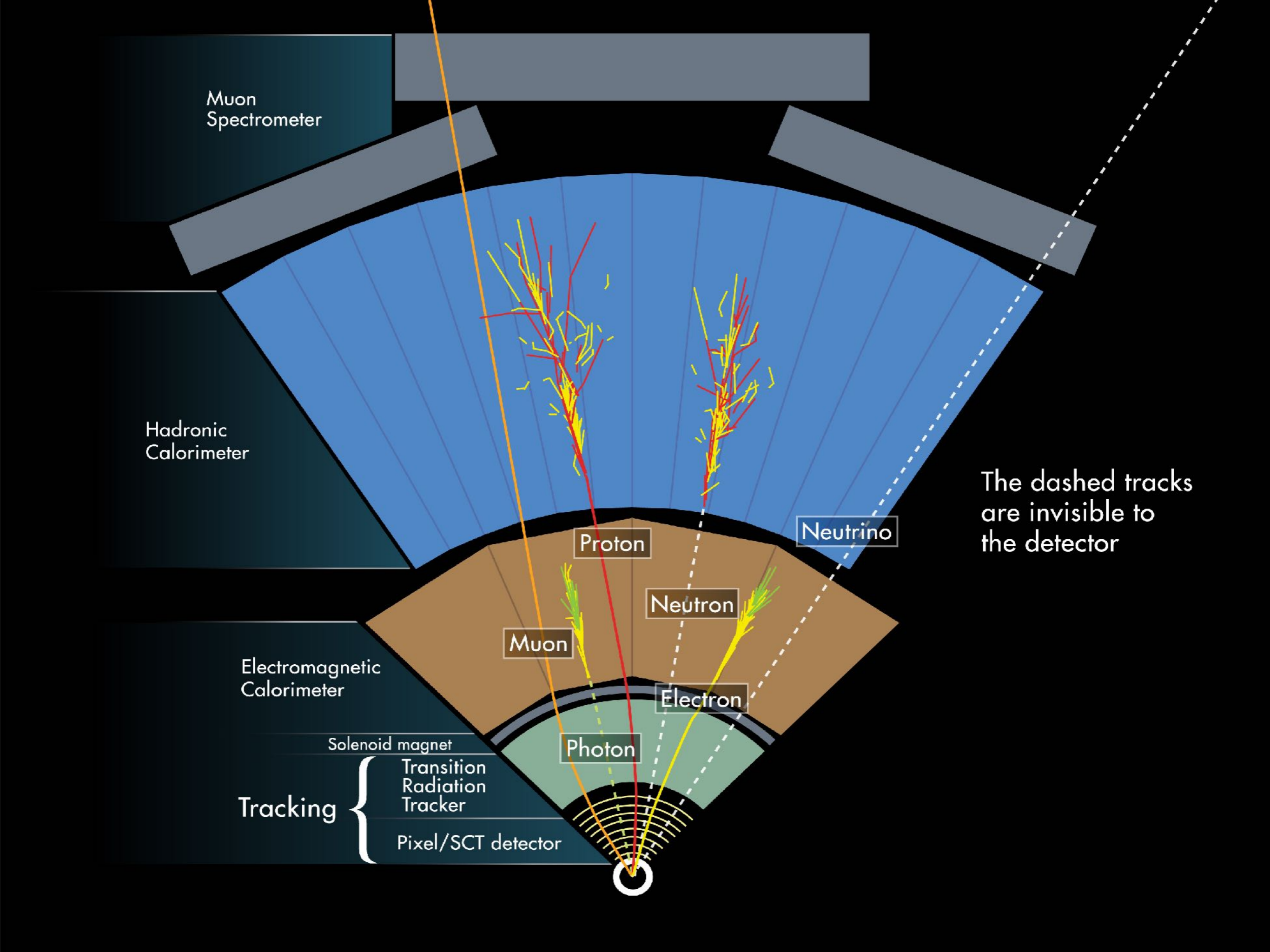
Photon

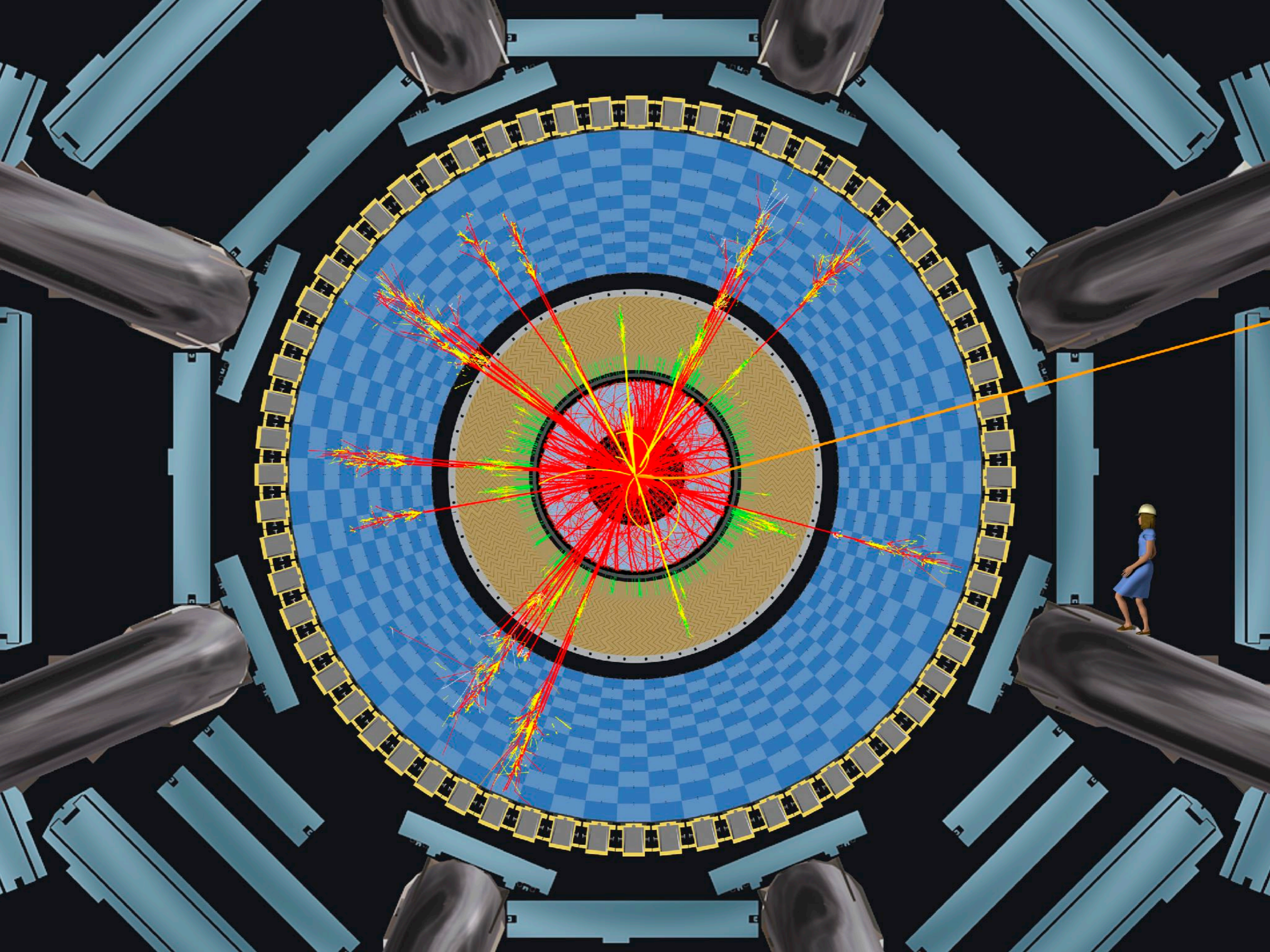
Neutron

Electron

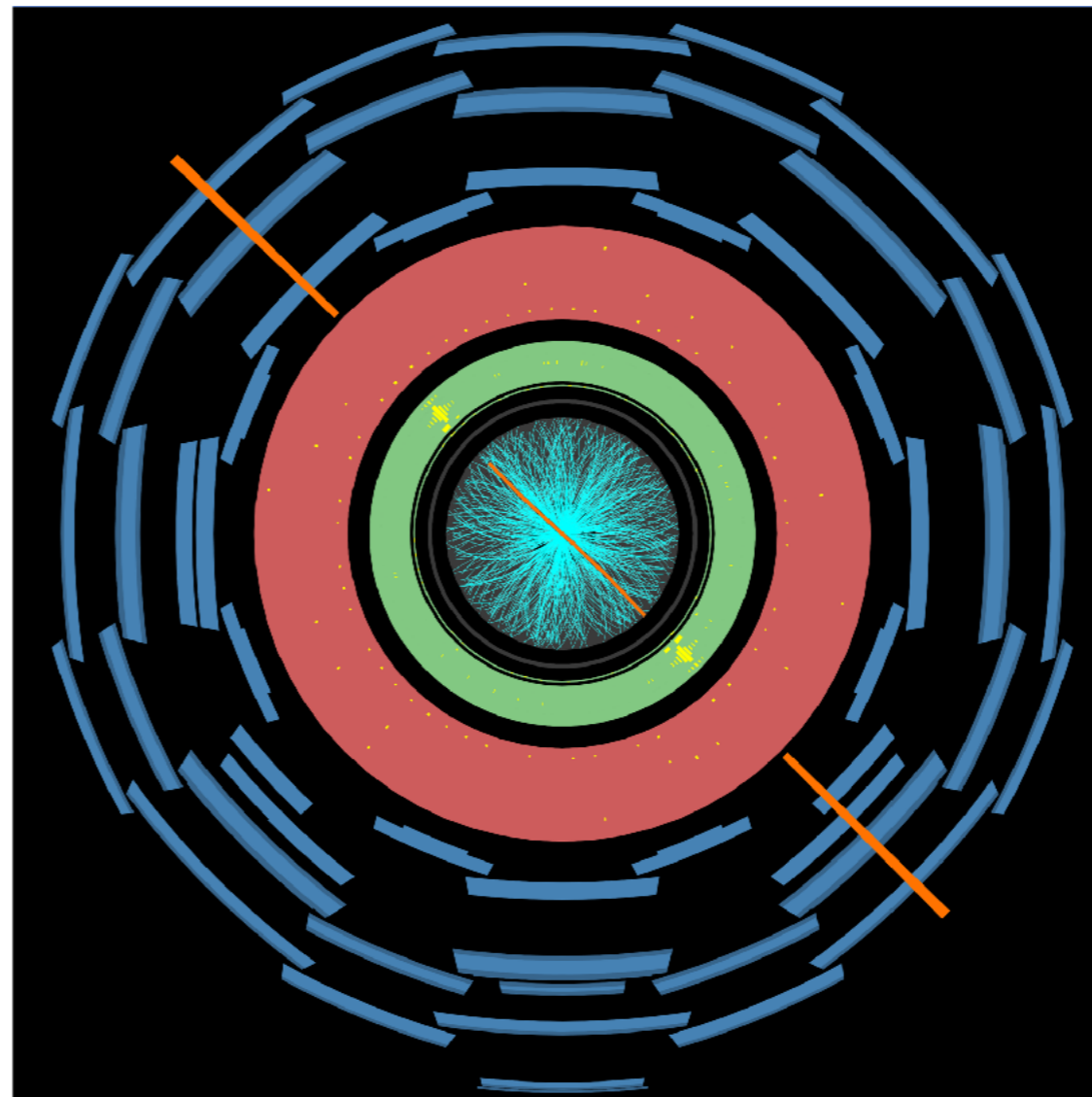
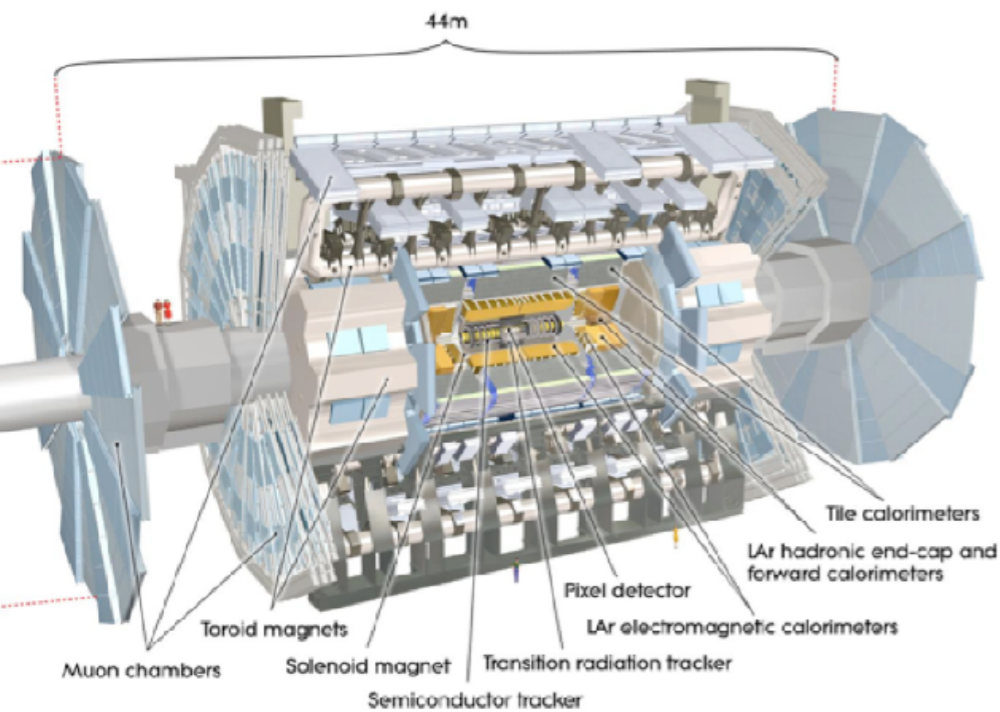
Neutrino

The dashed tracks are invisible to the detector



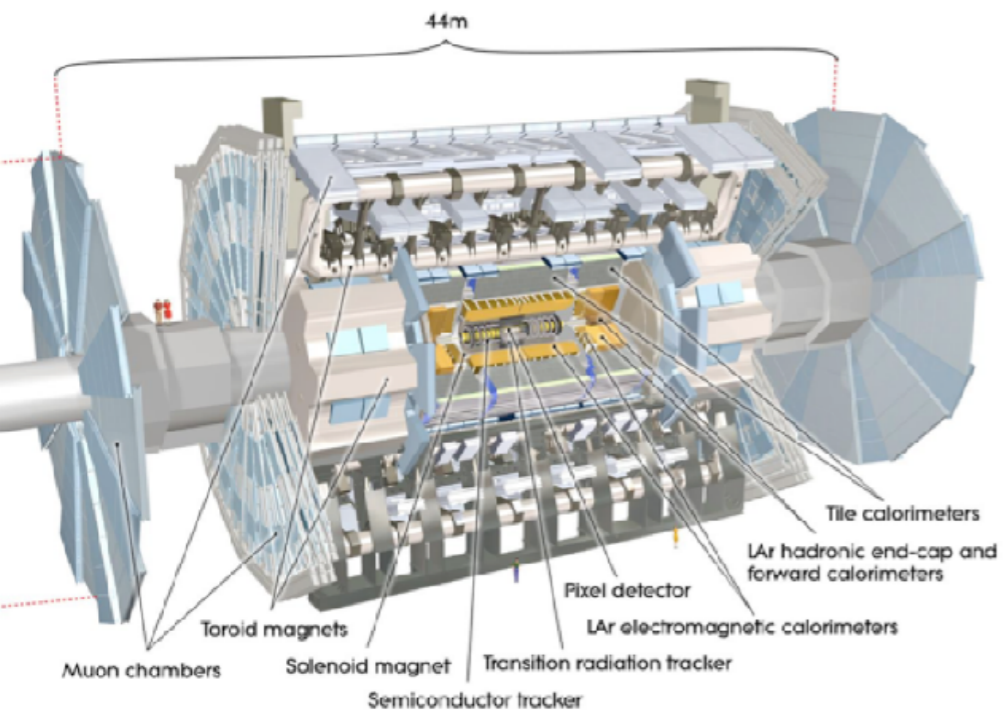


# Event displays

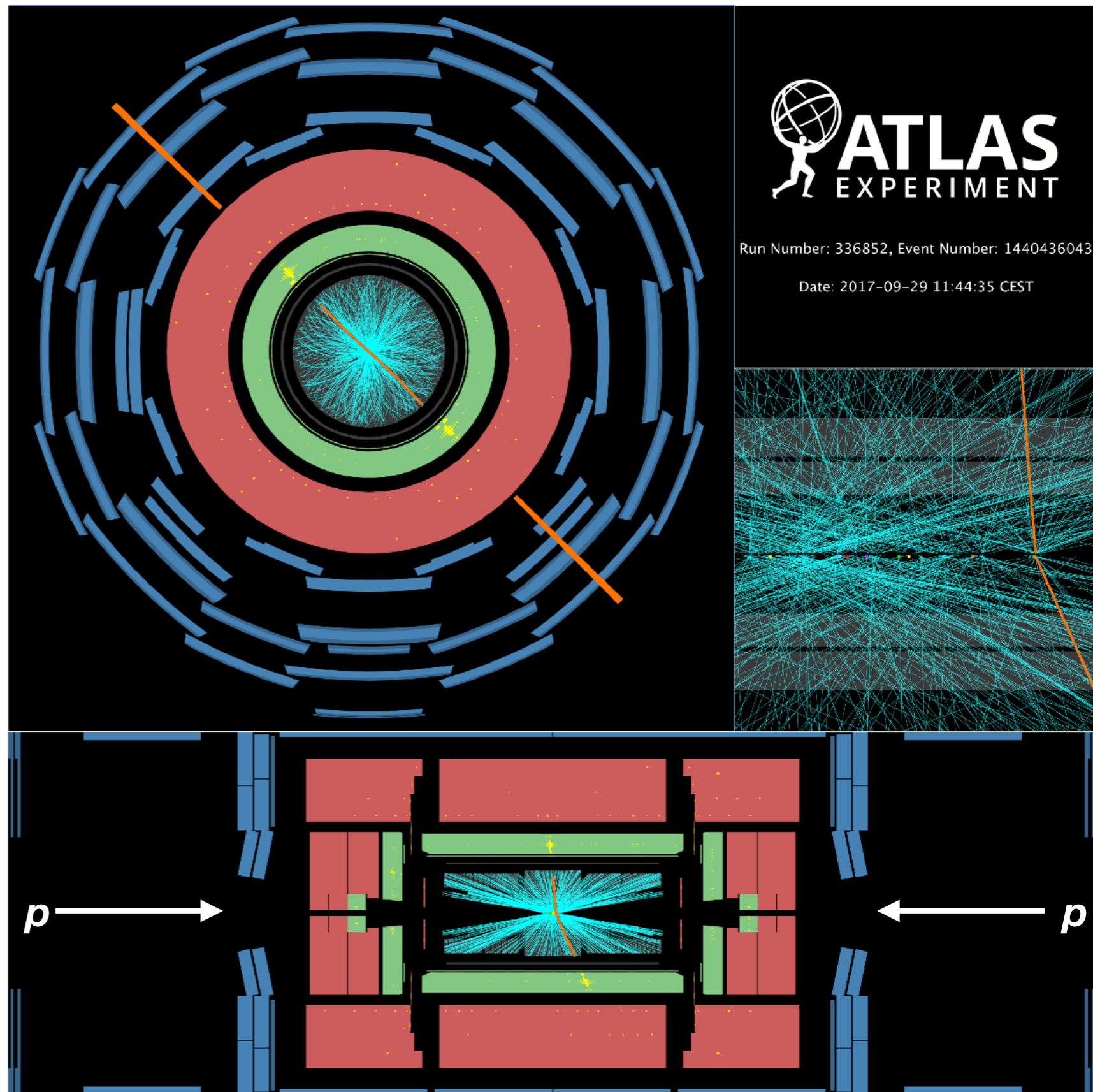


- Event displays are great ways for us to visualise what happened in a particle collision
- In this **ATLAS event display** (*right*) of a real proton collision, we are looking down the beam pipe, so the plane of the display is transverse to the proton beam direction
- **Question:** Can you quantify the momentum in this plane **before** the proton collision
  - What does that tell you about the distribution of momentum **after** the collision?
  - Can you say which fundamental particle(s) is (are) observed in the event?

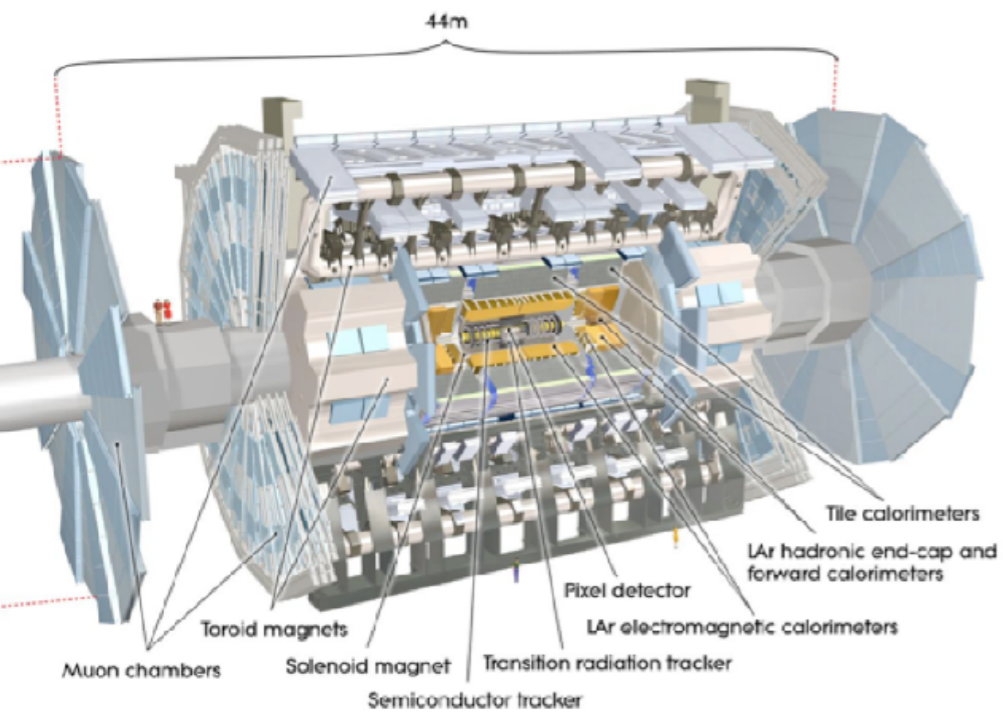
# Event displays



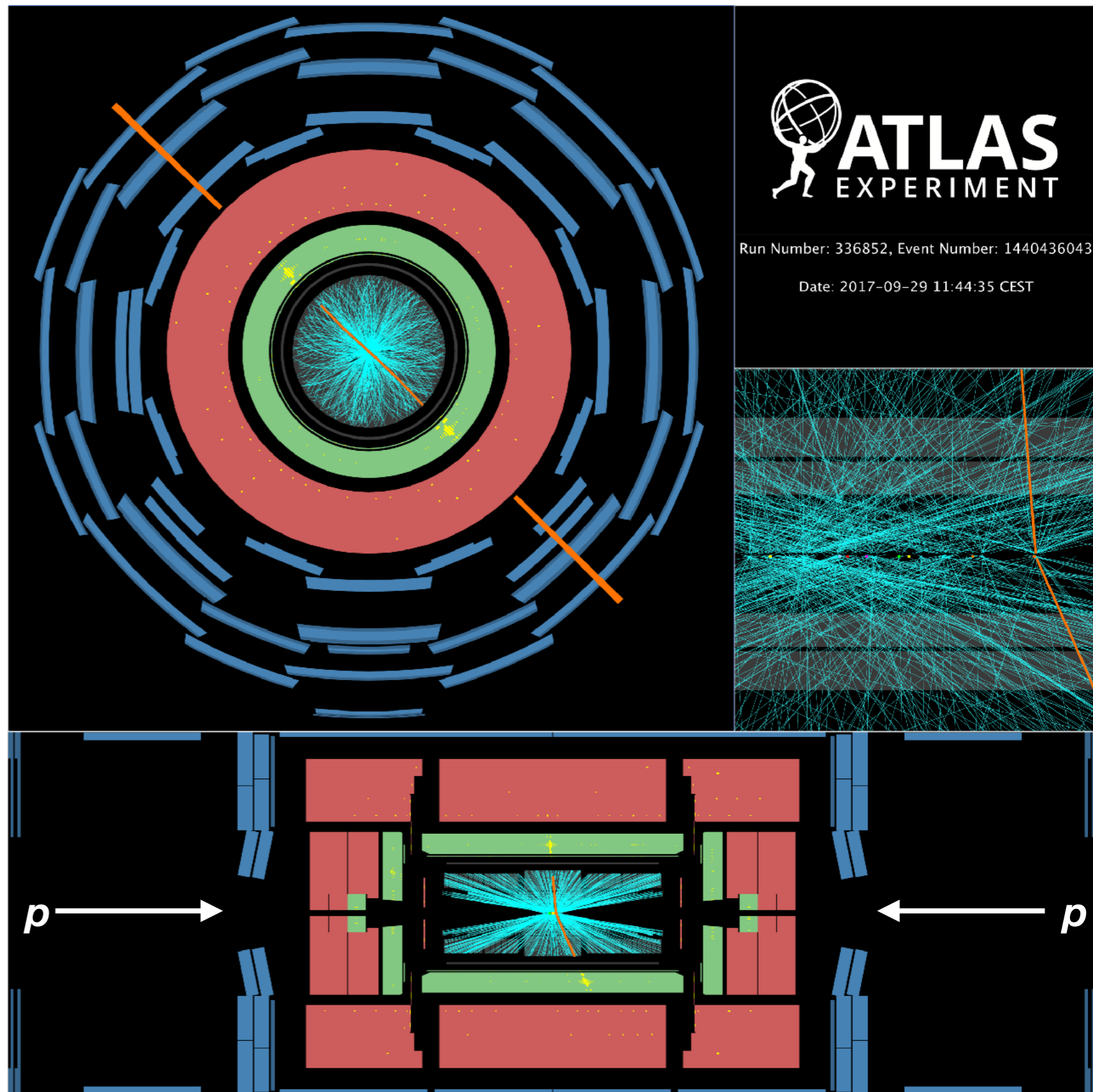
- This view shows the plane in the proton beam direction
- Both **2D** views are often used to provide complementary information



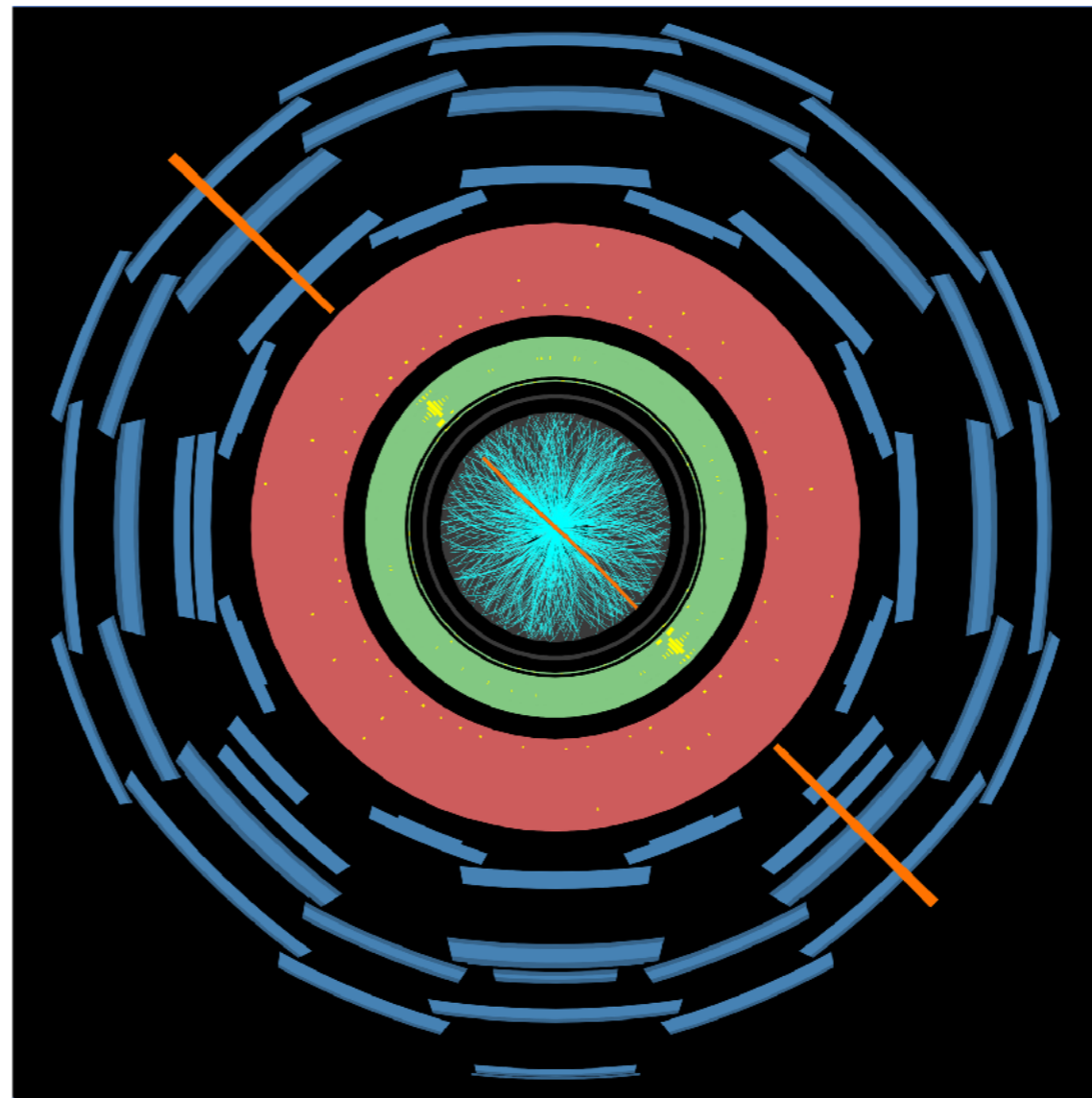
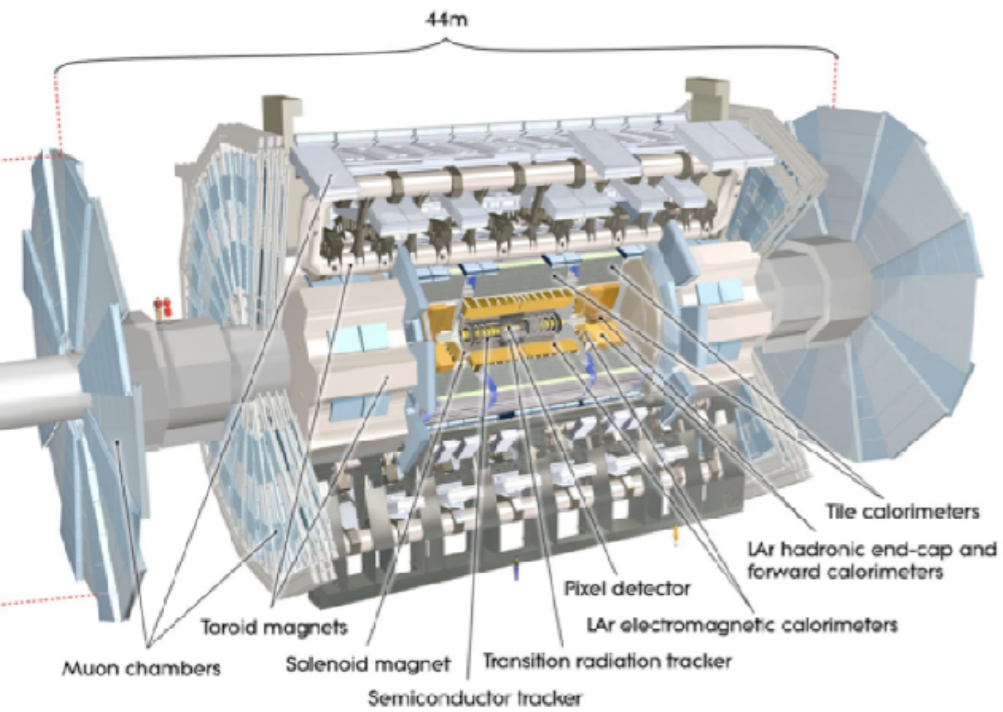
# Event displays



- This view shows the plane in the proton beam direction
- Both **2D** views are often used to provide complementary information
- **Q.** See multiple track “vertices”, points where tracks appear to originate, why?



# Event displays



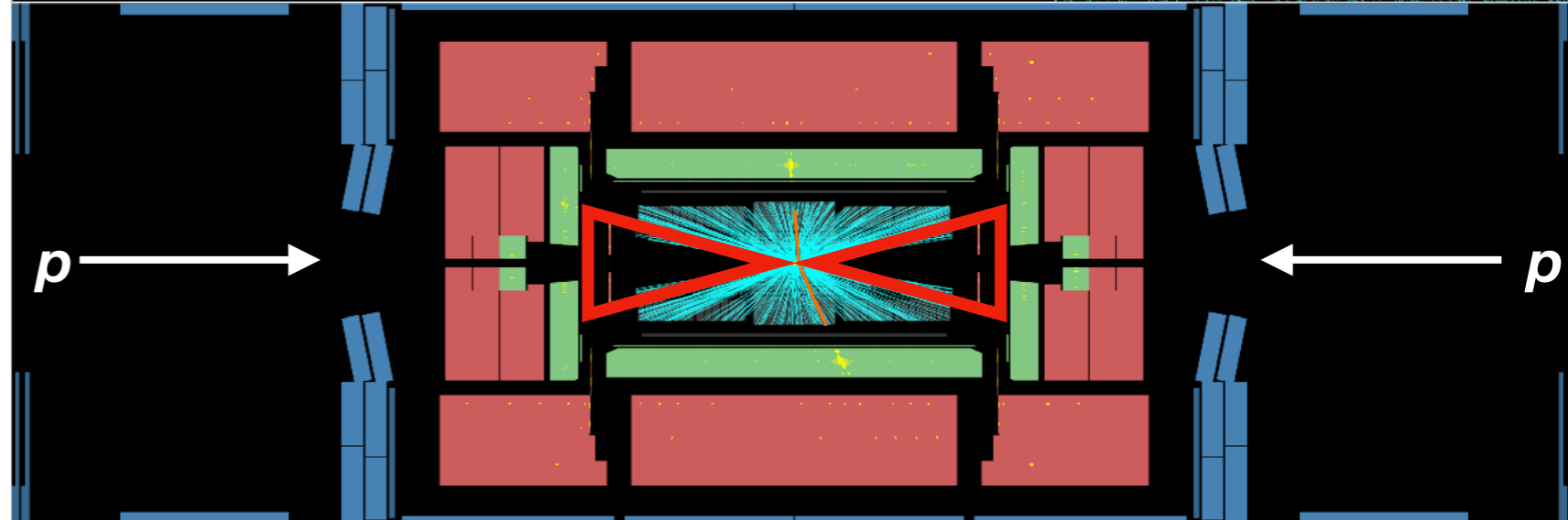
**ATLAS**  
EXPERIMENT

Run Number: 336852, Event Number: 1440436043

Date: 2017-09-29 11:44:35 CEST

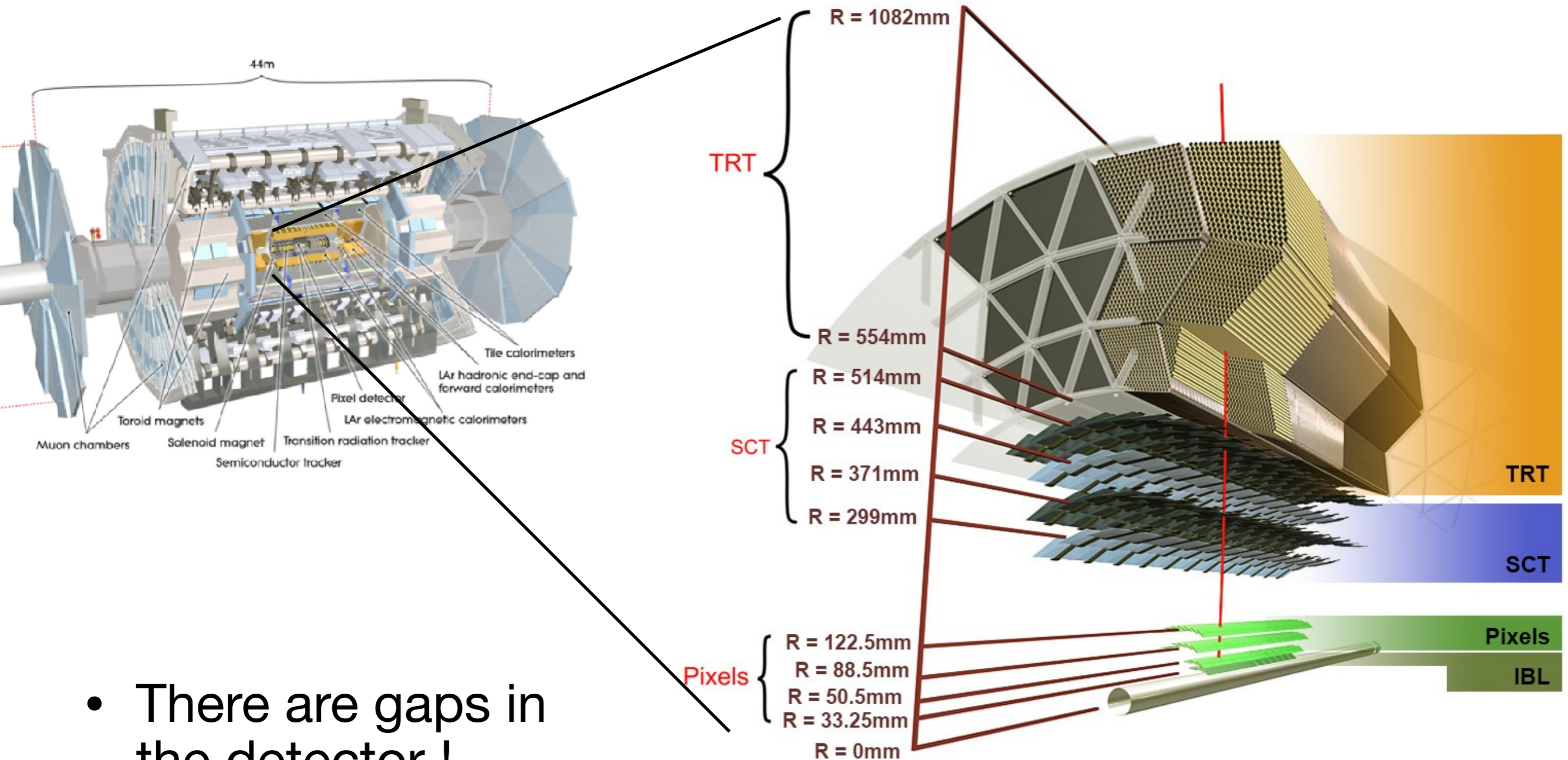
A zoomed-in view of the event display tracks, showing a dense network of cyan lines with a prominent orange line representing a particle path.

- Why are there gaps in the event display?





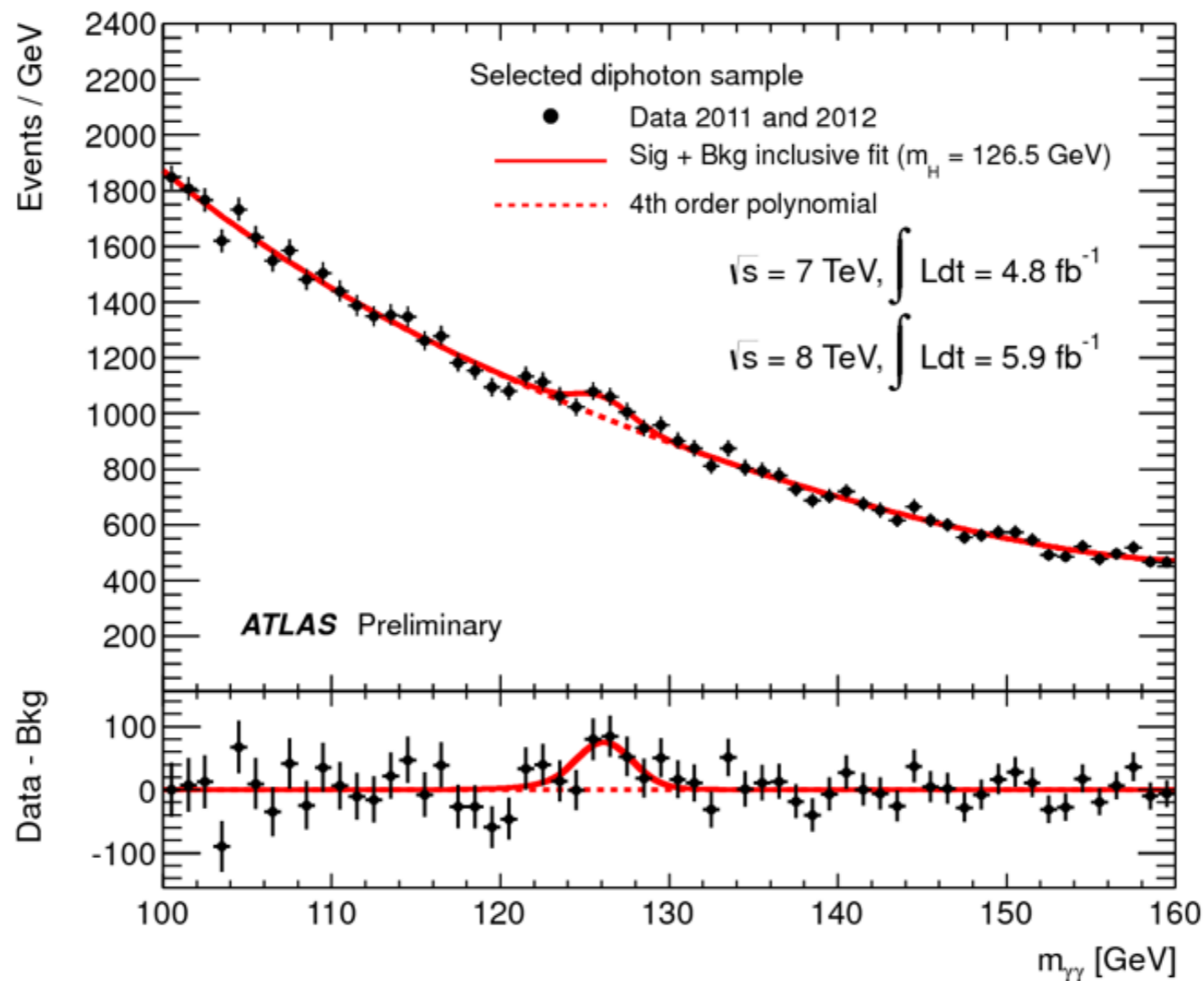
# Detectors are real !



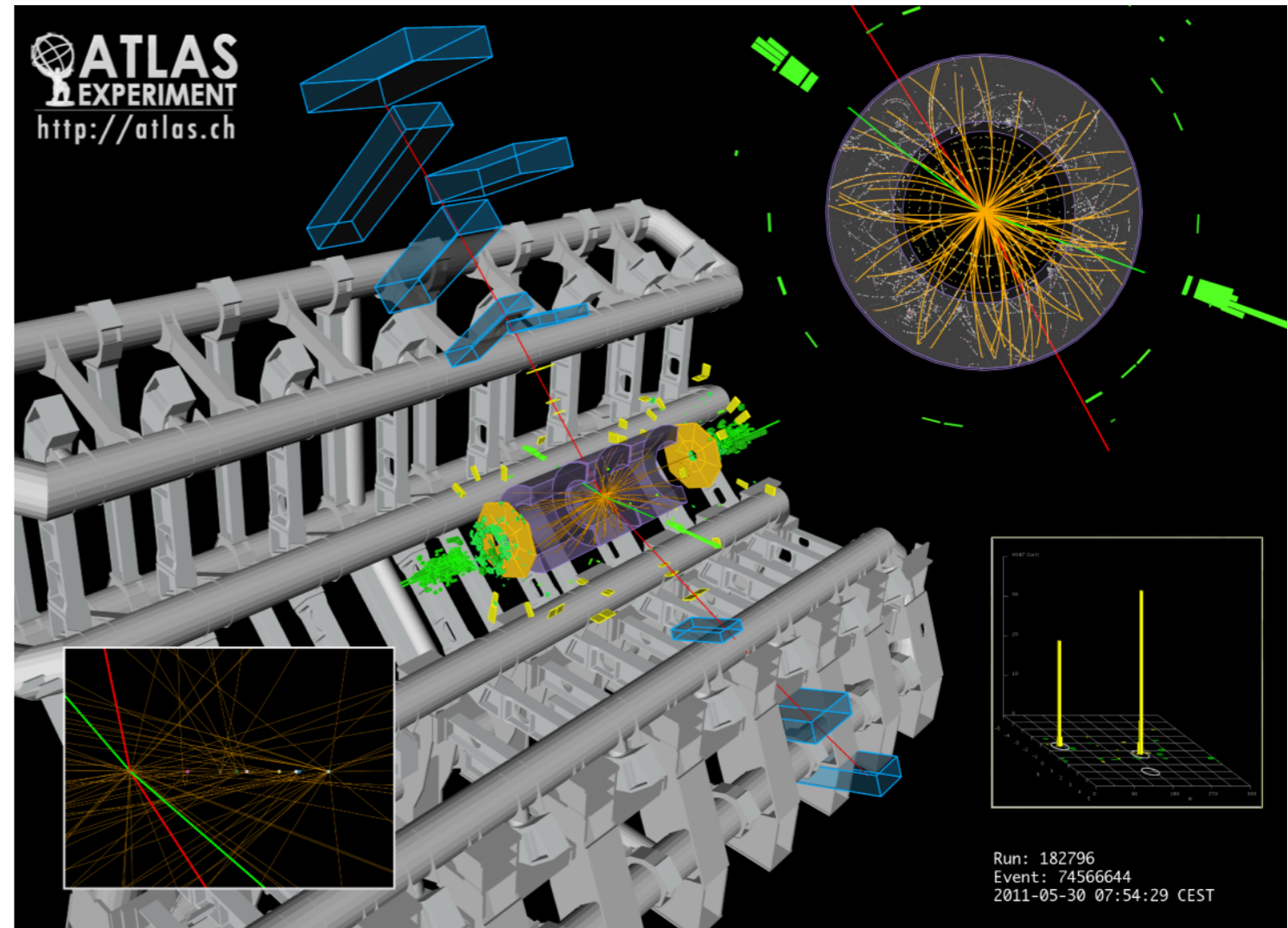
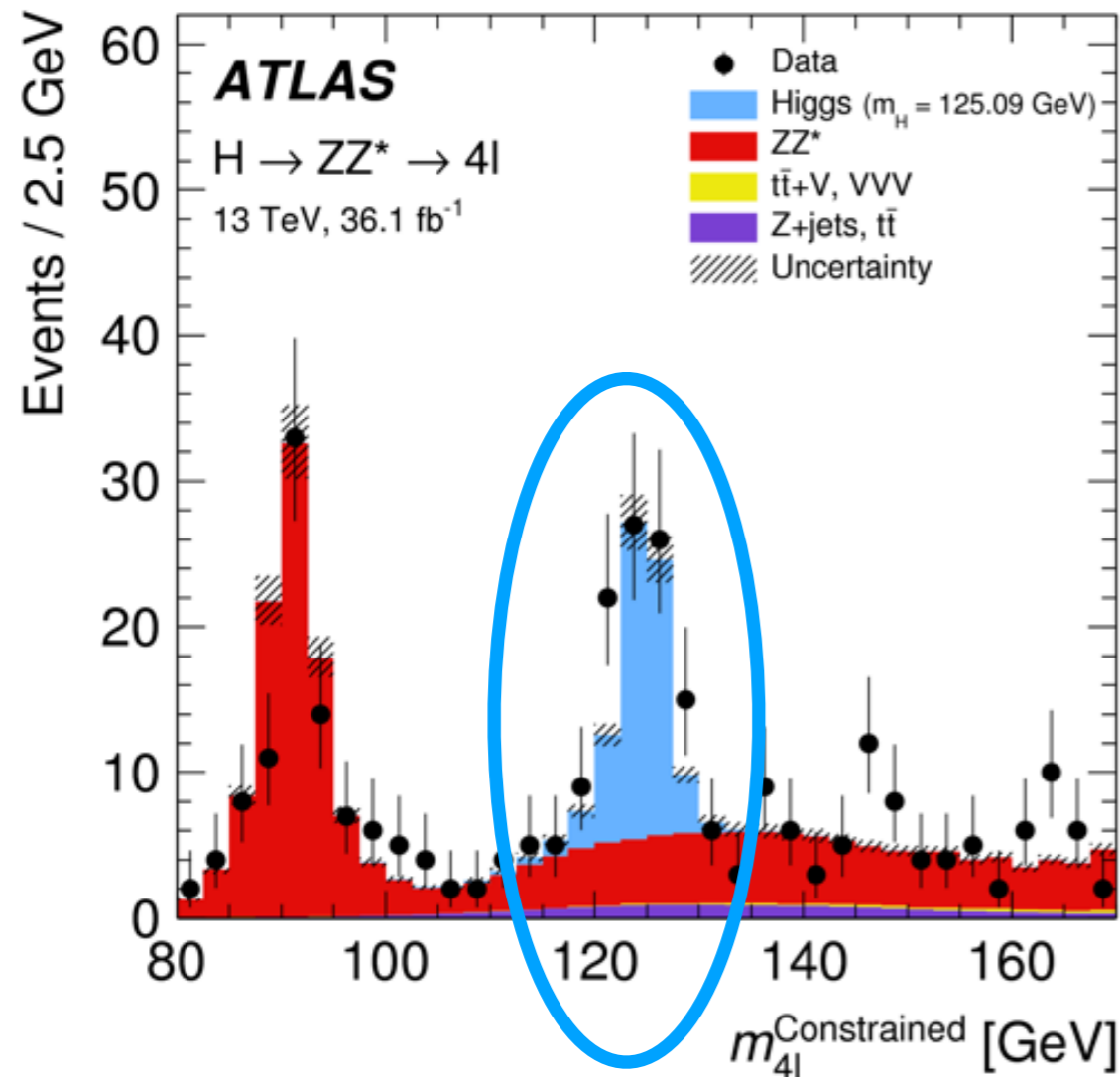
- There are gaps in the detector !

# Discovering the Higgs boson: $H \rightarrow \gamma\gamma$

- There are billions of events and the ones we are really interested in are **very rare**
- Often the interesting events are also **very difficult to distinguish** from background
  - Requires **high precision detectors**, which means **lots of data** for each event
- The data are structured but each event is different - **unique data science challenge**

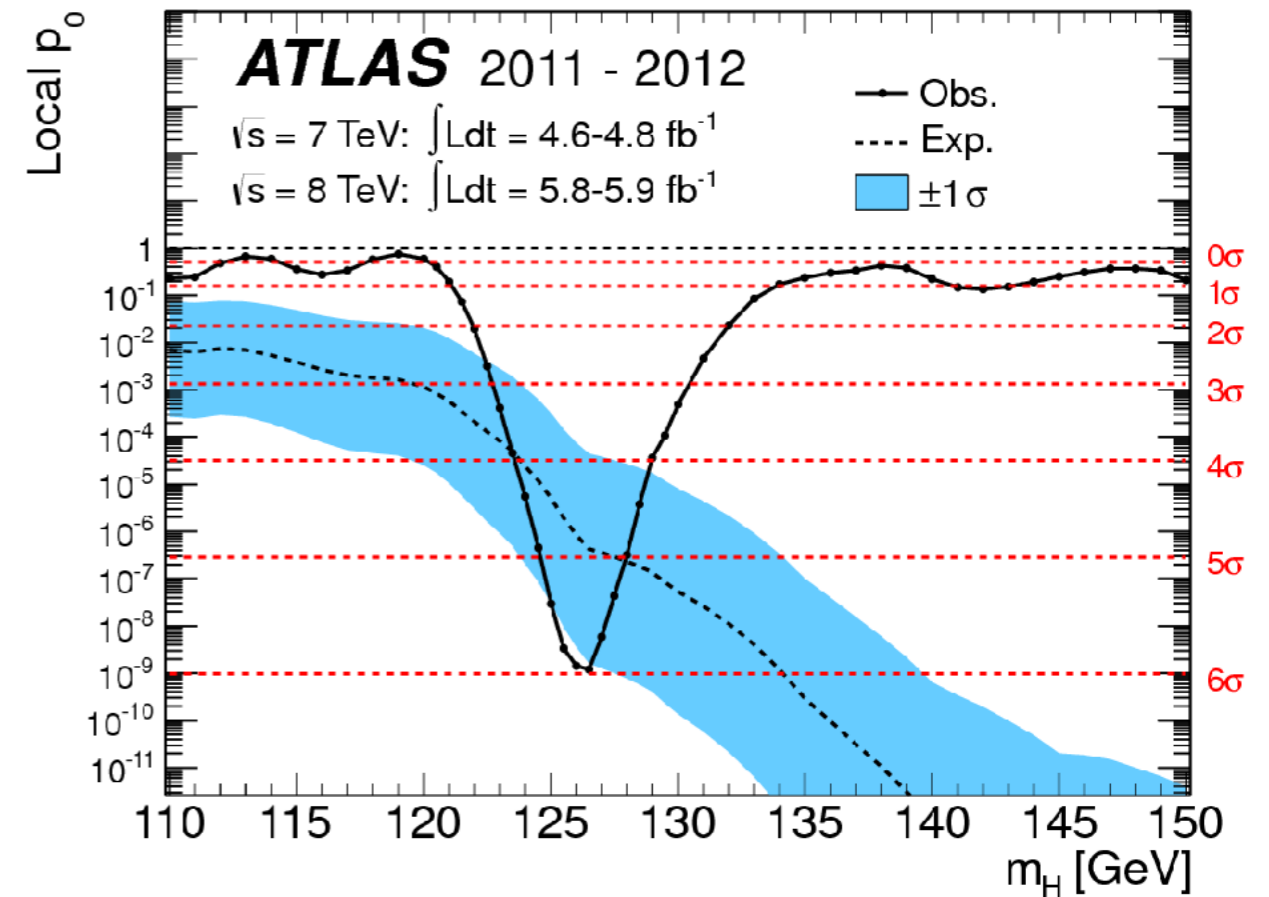


# Discovering the Higgs Boson: $H \rightarrow ZZ \rightarrow 4l$



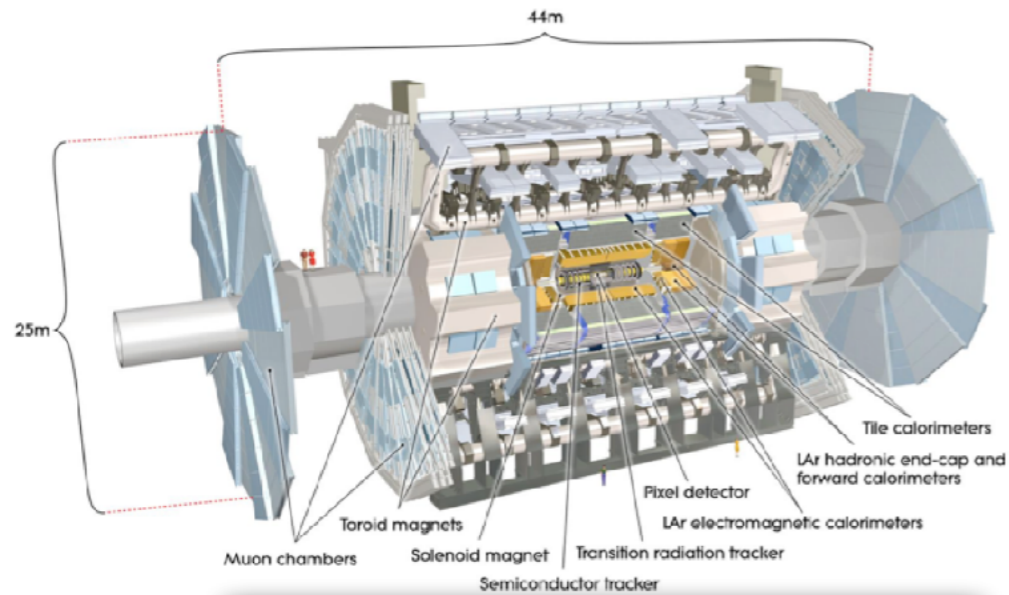
- Here we look for events with **two Z bosons** that have decayed to **four leptons**, and compare to *simulations of different physics processes*
- If the **two Z bosons** were produced by the **decay of a Higgs boson**, when we reconstruct the invariant mass of the system we should see a **peak at the Higgs boson mass**

# Higgs discovery on July 4th 2012



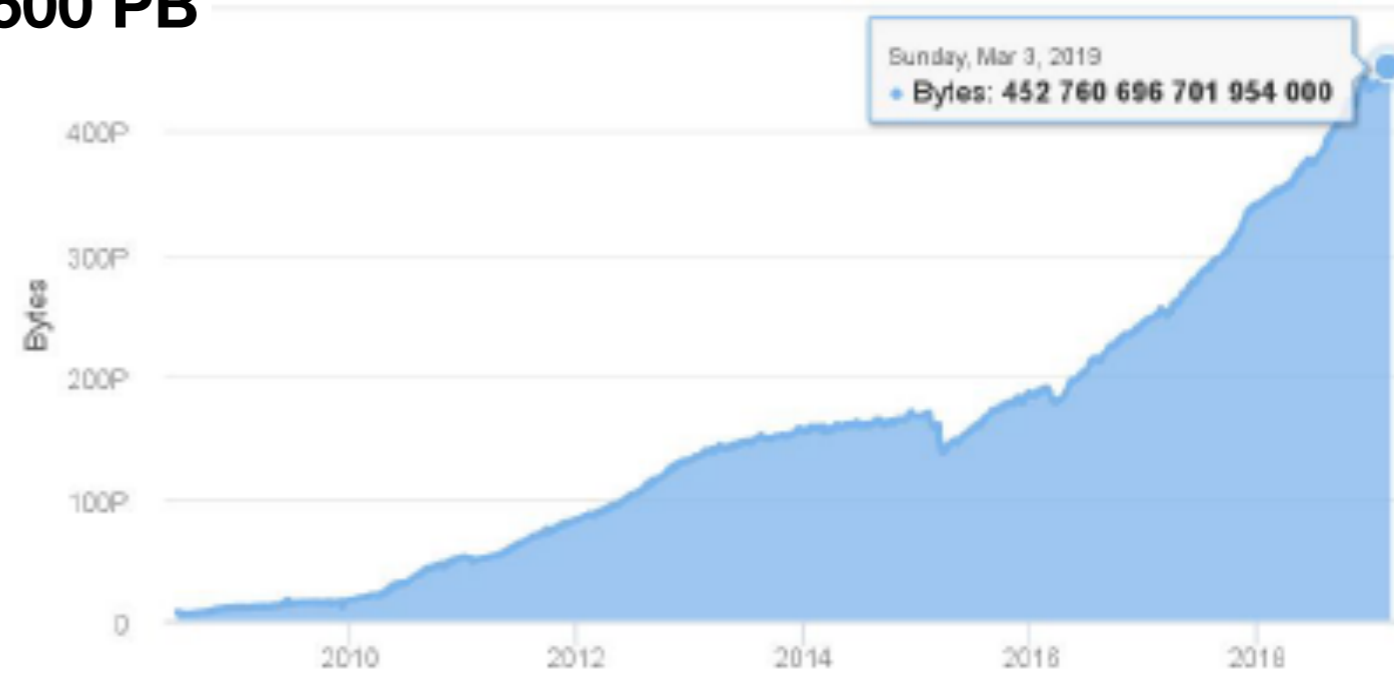
- In 2012 the number of observed events (**6 $\sigma$** ) was consistent with, and in excess of the number of events expected for a standard model Higgs (**5 $\sigma$** )
- **Question** - Imagine we had several more Large Hadron Colliders, with a total of 9 independent measurements possible. Roughly how many measurements would you expect to lie **outside** the  $\pm 1\sigma$  blue band?

# Exabyte-scale physics analysis



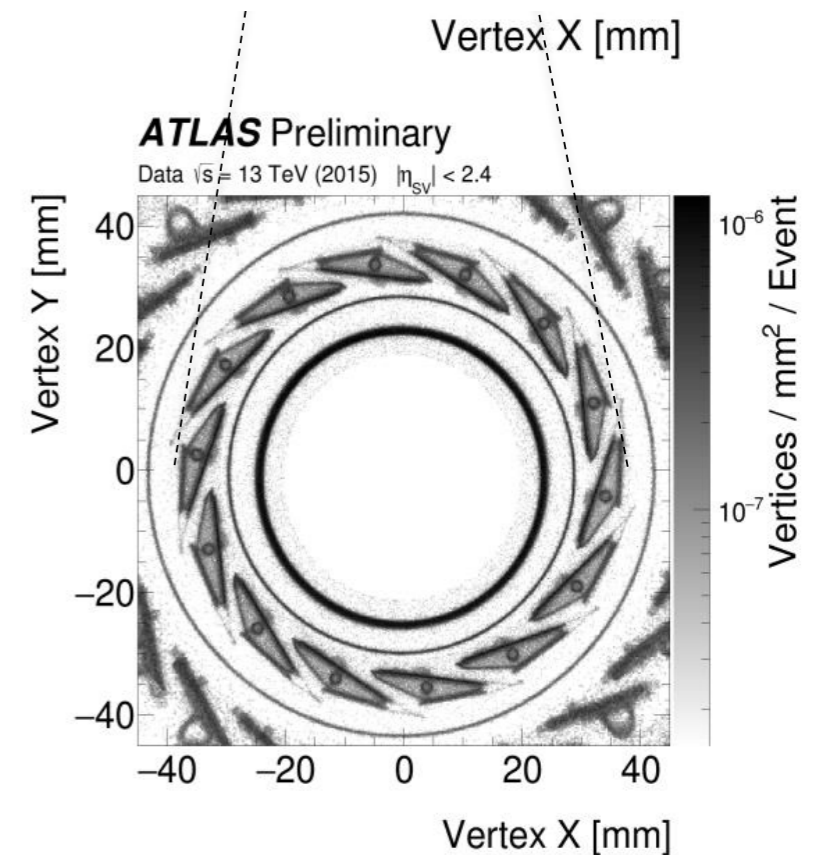
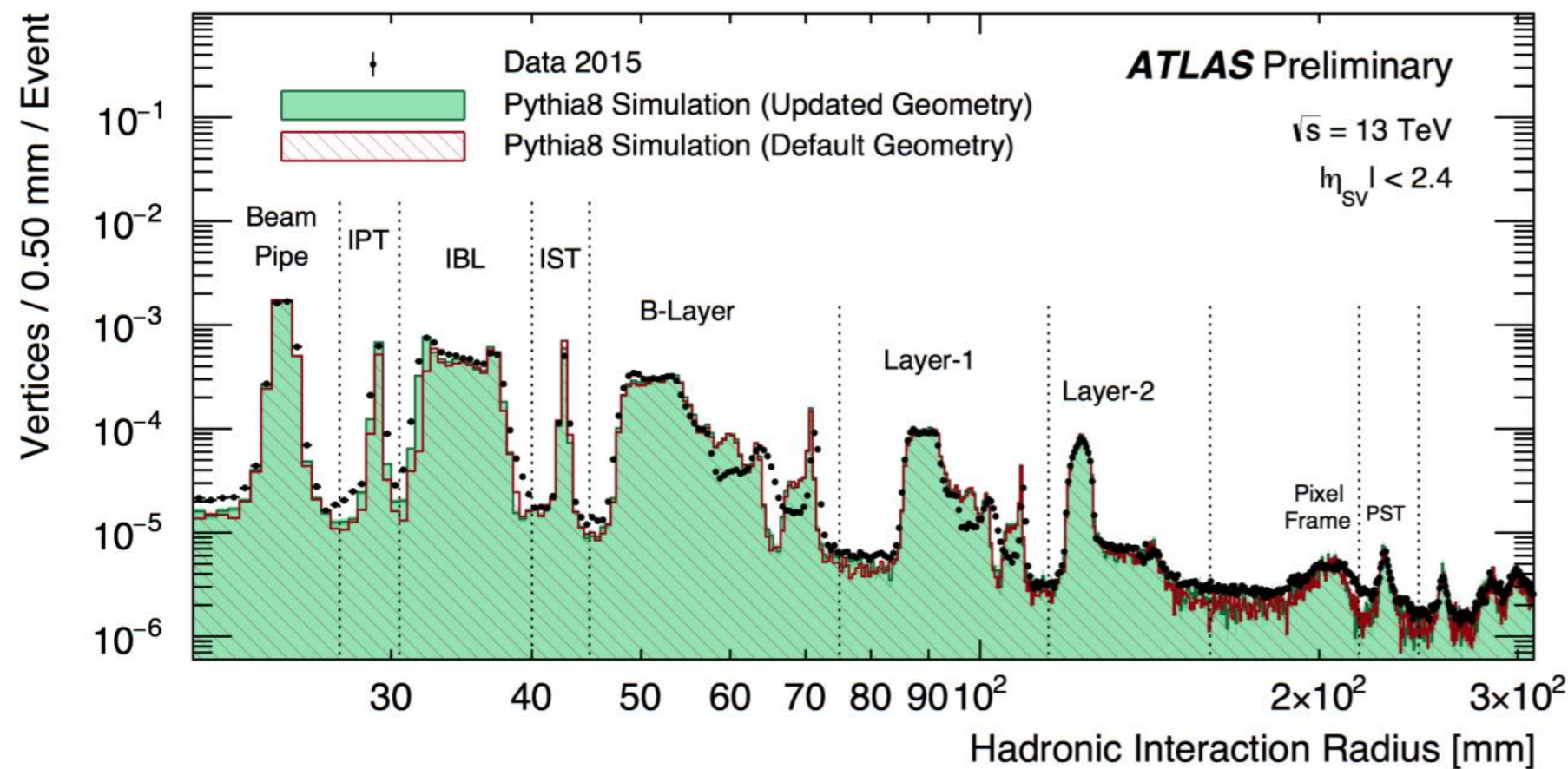
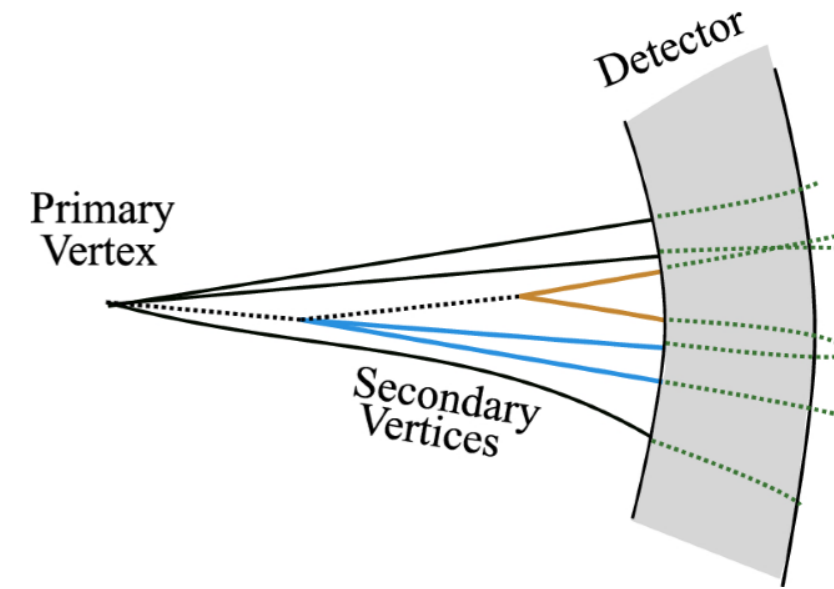
**Exabytes of Data**

**500 PB**

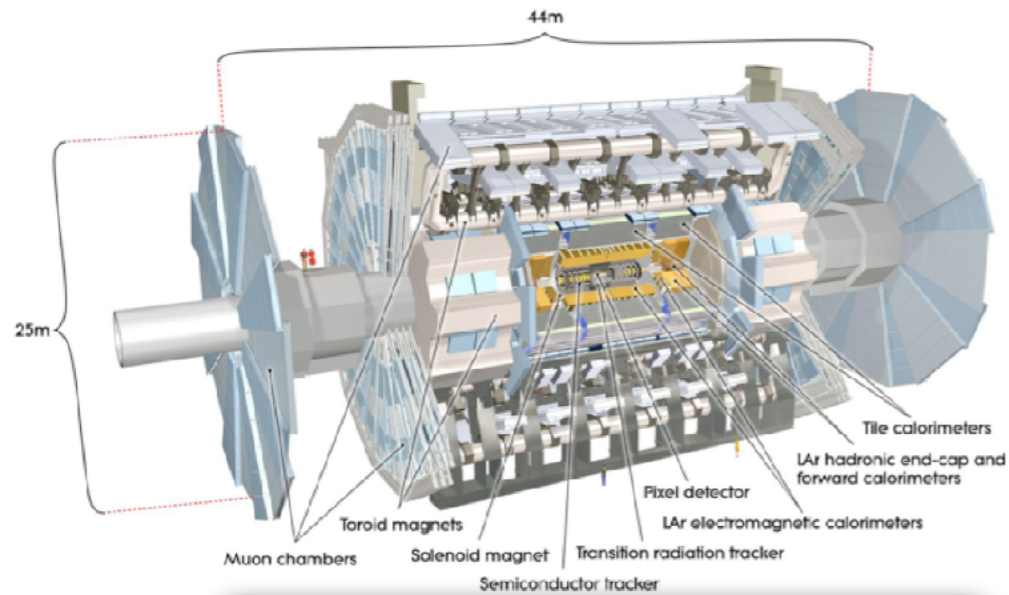


# Simulation and understanding detectors

- We use **simulations** to model the detector as **accurately** and **precisely** as possible
- We **test** that our simulations are accurate **using real data**
- We correct our simulations if necessary
- Once our simulation is an **accurate model** of our detector, we can use it to **correct the data for detector response**

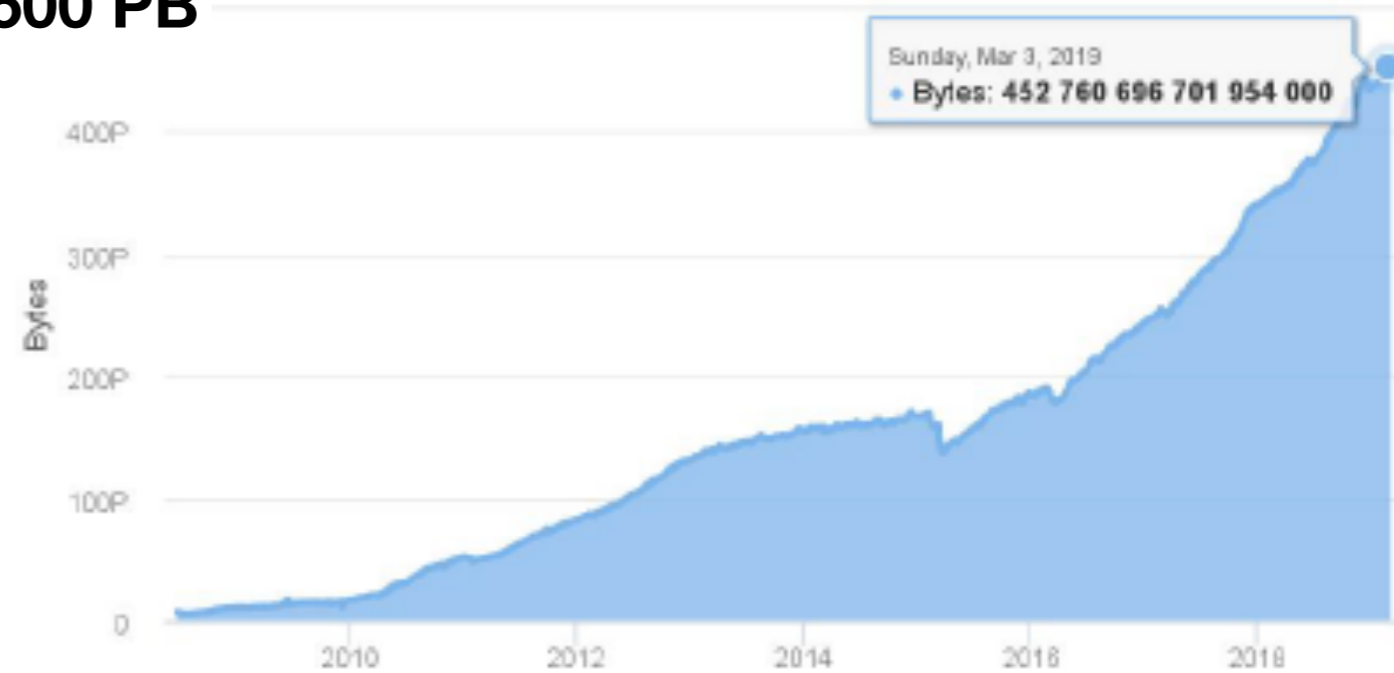


# Exabyte-scale physics analysis

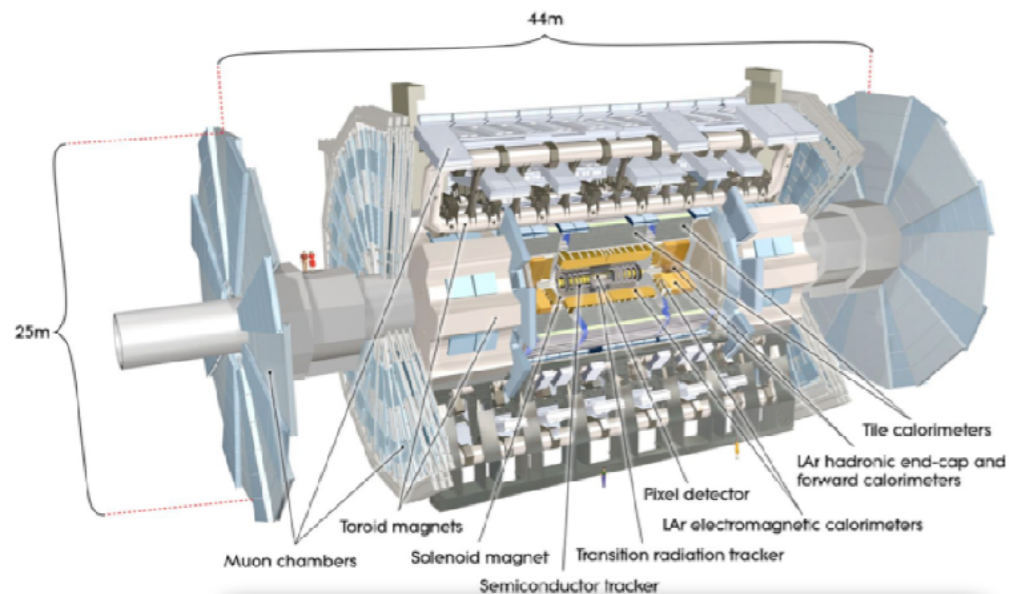


**Exabytes of Data**

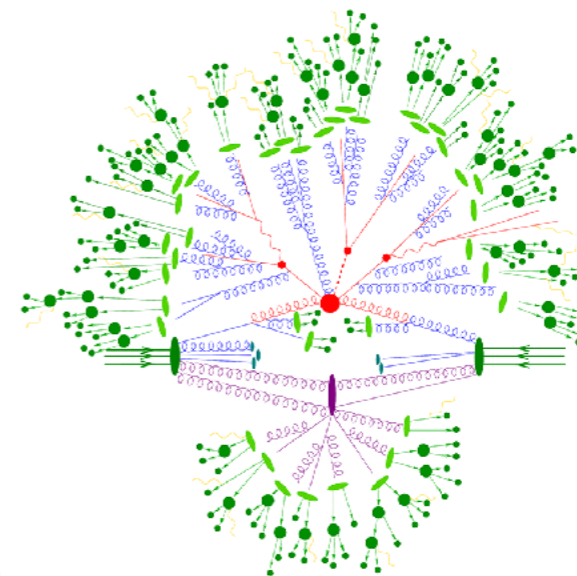
**500 PB**



# Exabyte-scale physics analysis



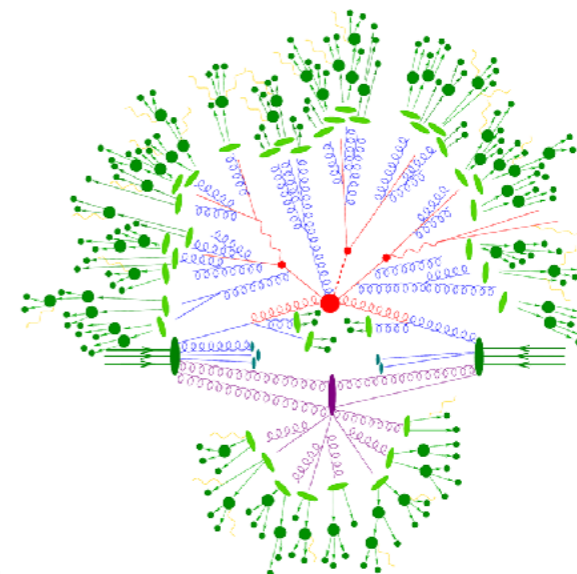
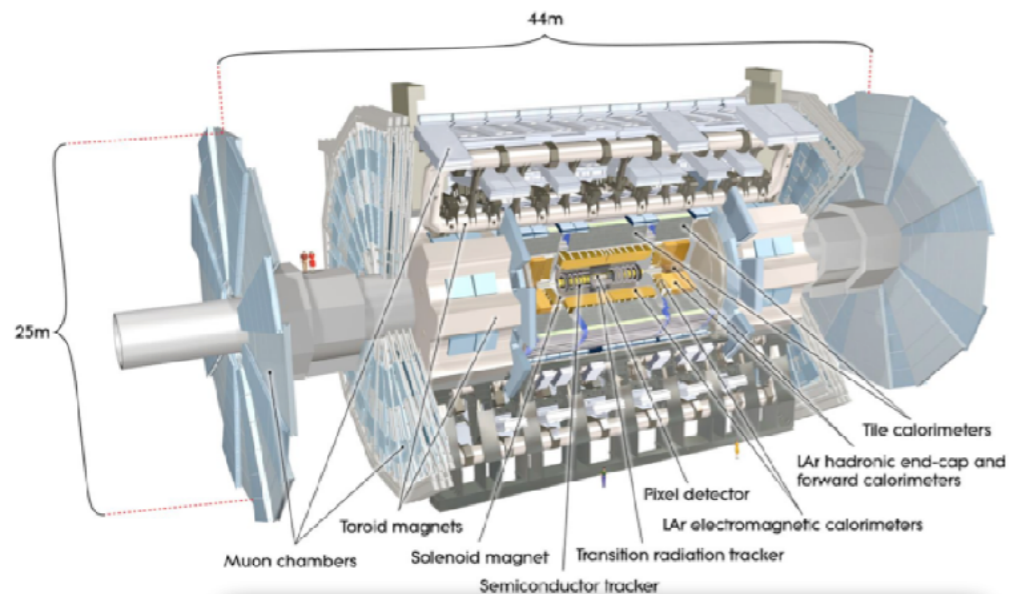
**Exabytes of Data**



**Exabytes of Simulation**

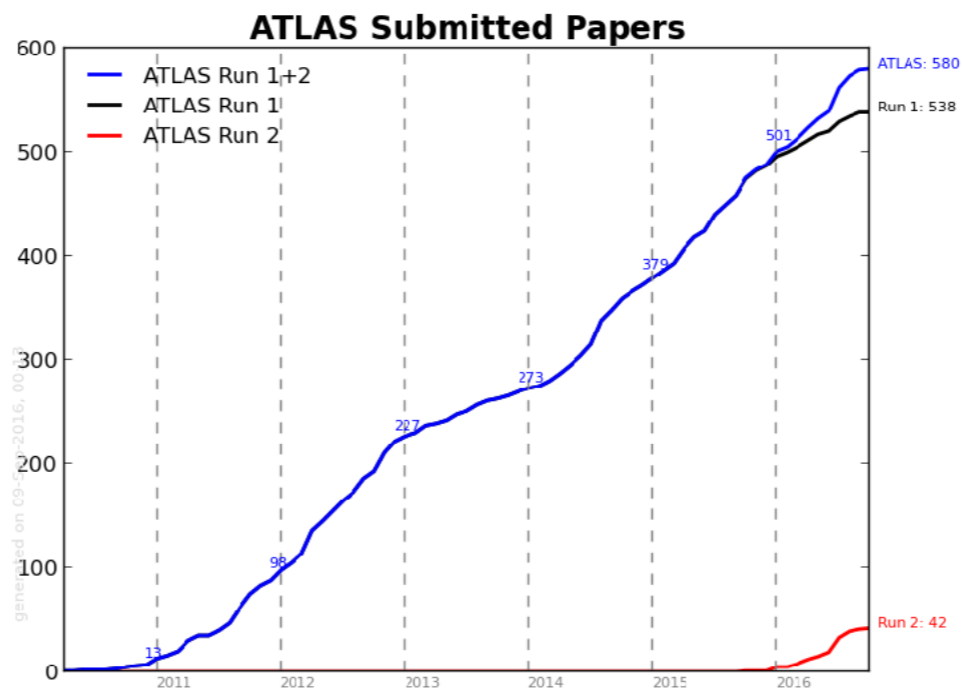
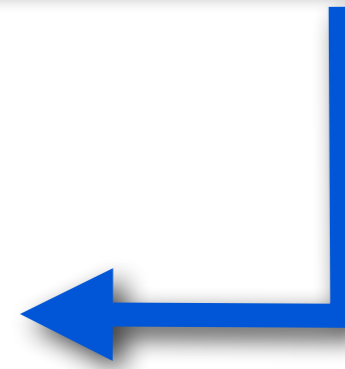
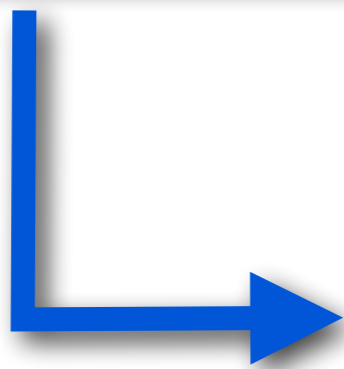


# Exabyte-scale physics analysis



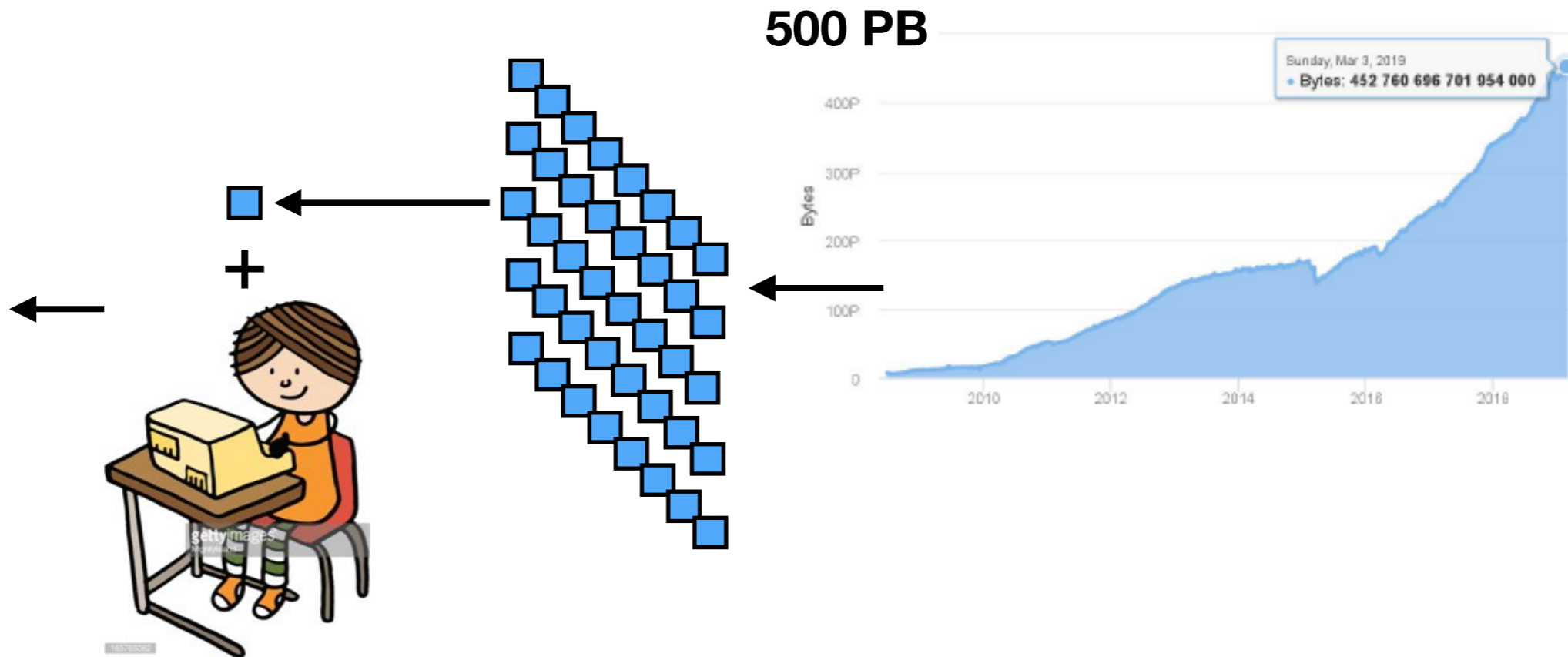
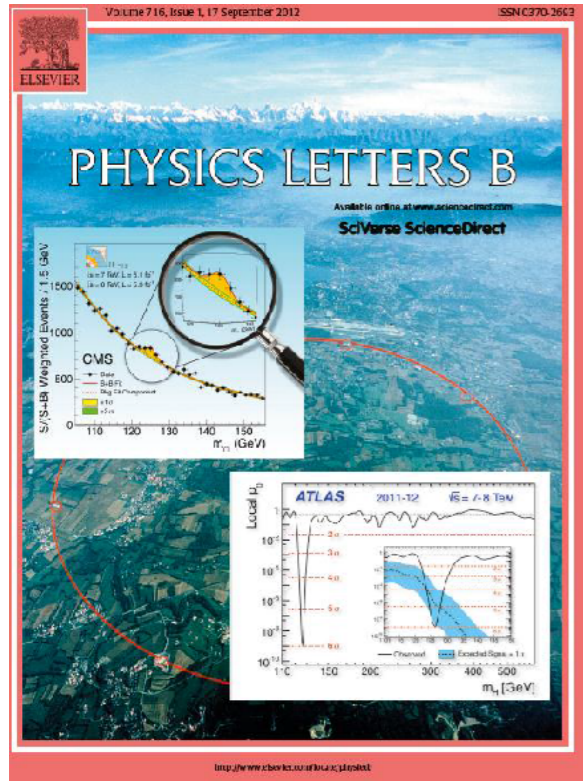
**Exabytes of Data**

**Exabytes of Simulation**



**Publish!**

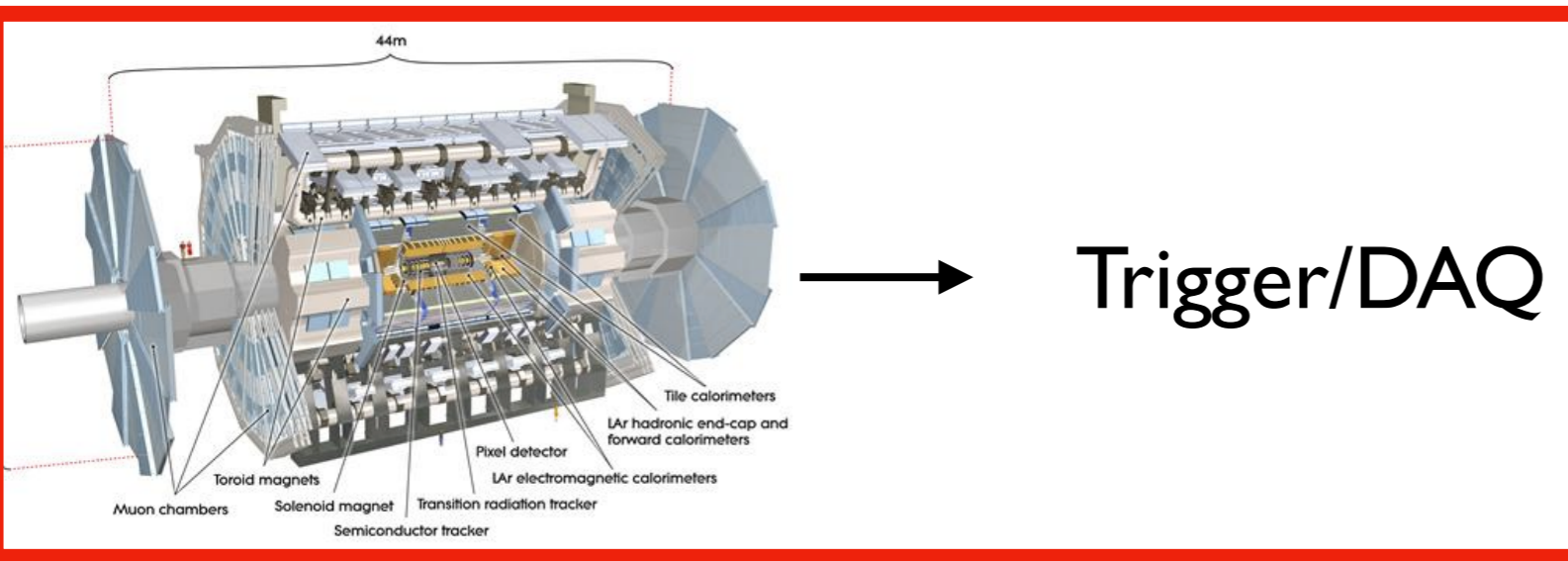
# Data analysis



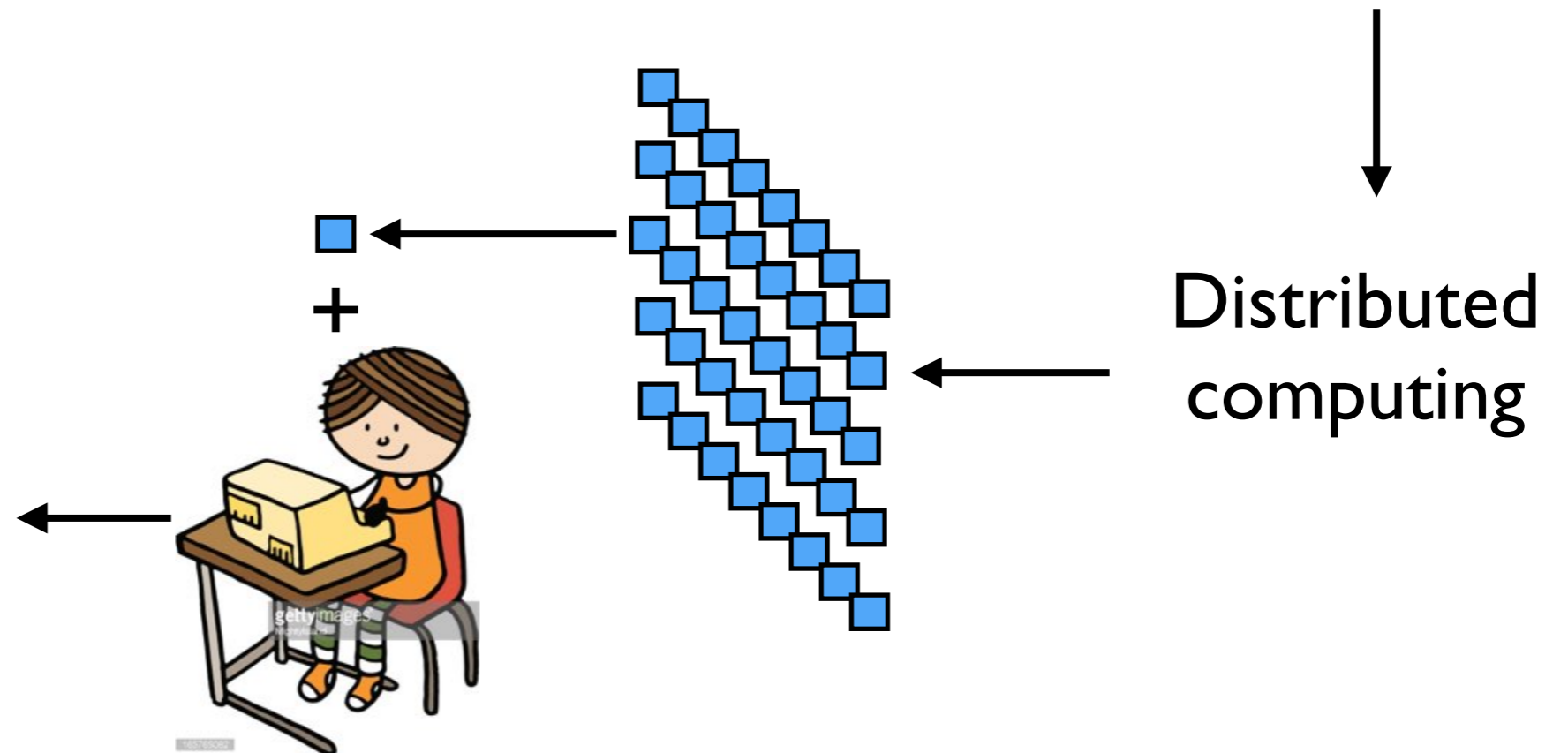
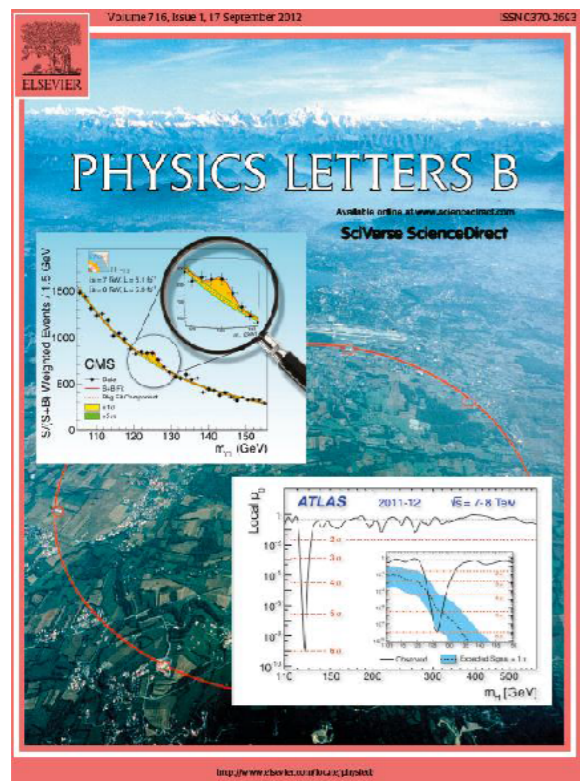
• *Analysis is performed on only a fraction of the data, for example only events with two photons*

• *How?*

# Data's journey



Data  
Preparation



# The Atlas Trigger and DAQ

Rate of all proton-proton collisions produced by the LHC

Event rates

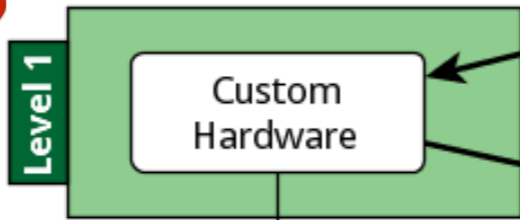
40 MHz

100 kHz

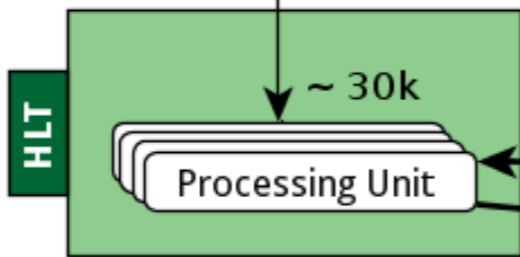
~ 1000 Hz

Rate of all interesting proton-proton collisions produced by the LHC

Trigger



RoIB



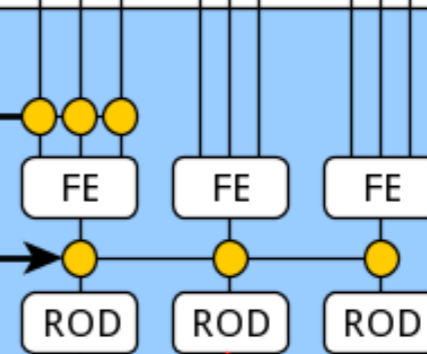
Fragments Full event



Permanent Storage

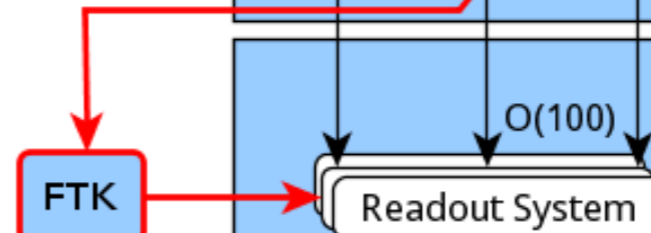
DAQ

Calo/Muon Pixel/SCT Other



Level 1 Accept

Detector Readout



~64 TB / s

~ 160 GB/s

~ 25 GB/s

~ 1500 MB/s

Data Flow

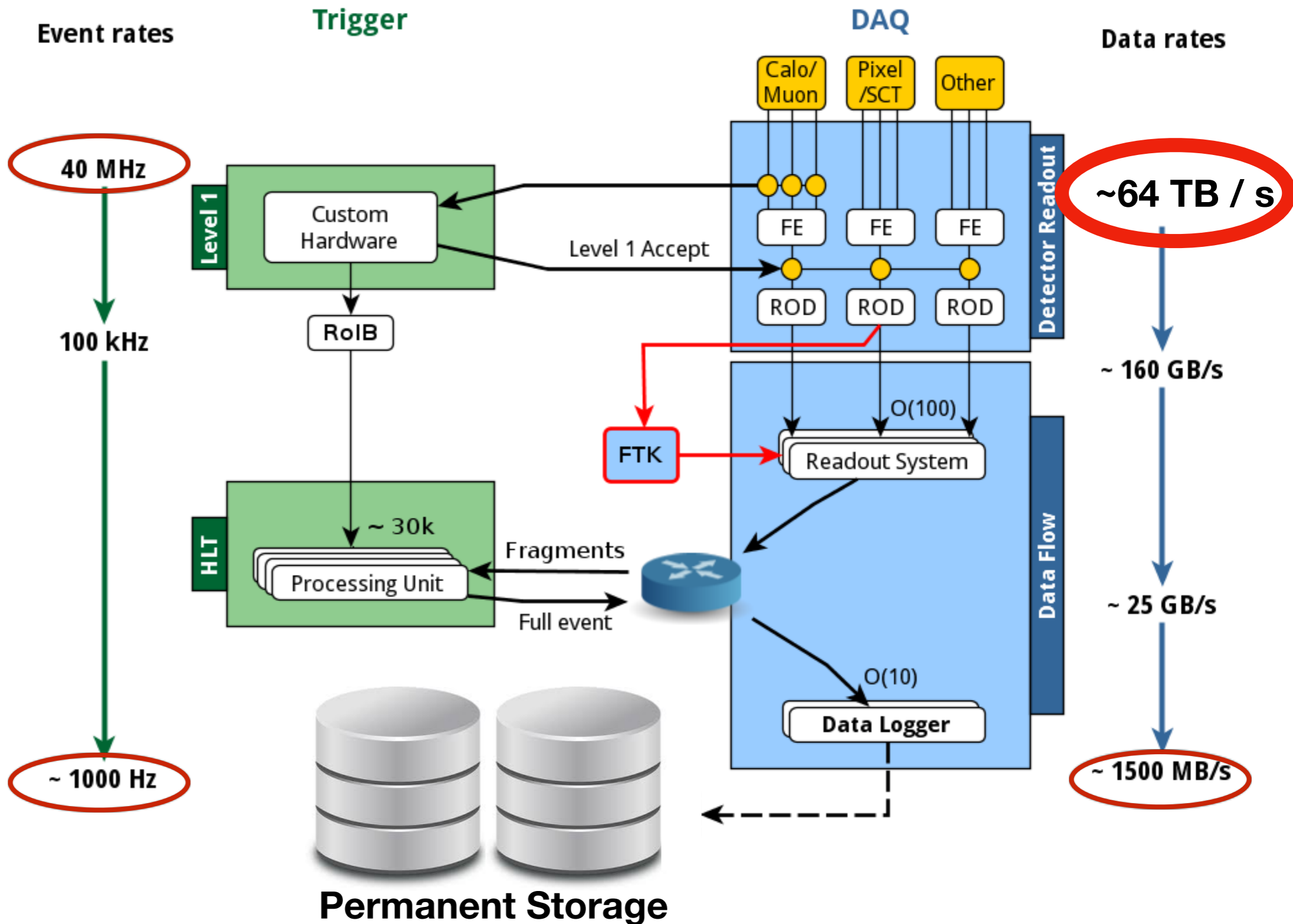
Data Logger O(10)

# The Atlas Trigger and DAQ

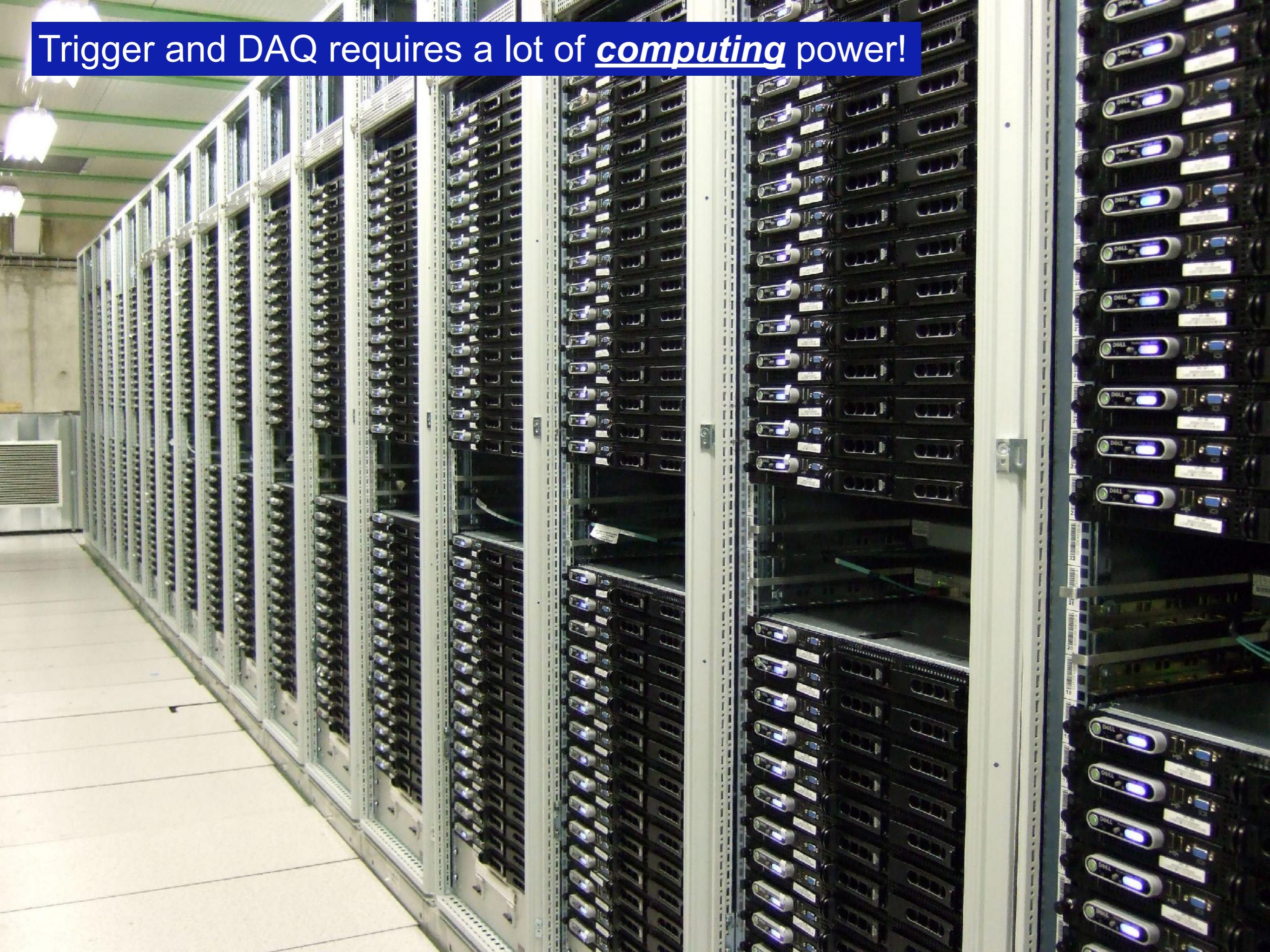
**Q. How long would it take to generate 500PB of data if there were no Trigger?**

Rate of all proton-proton collisions produced by the LHC

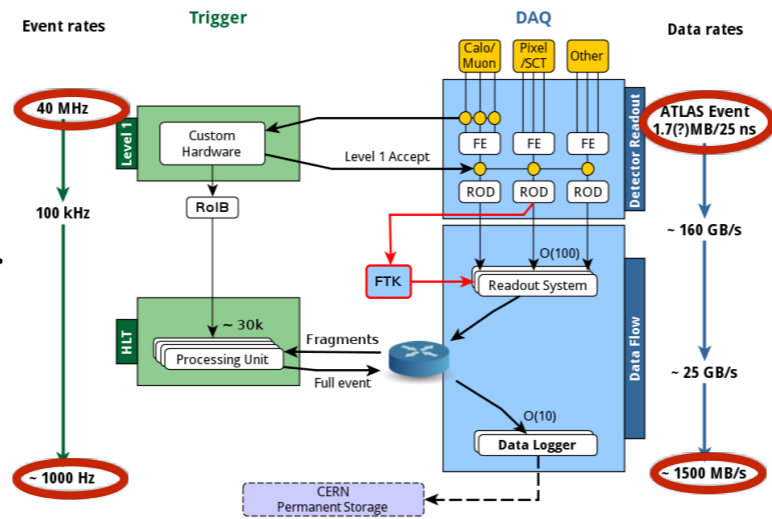
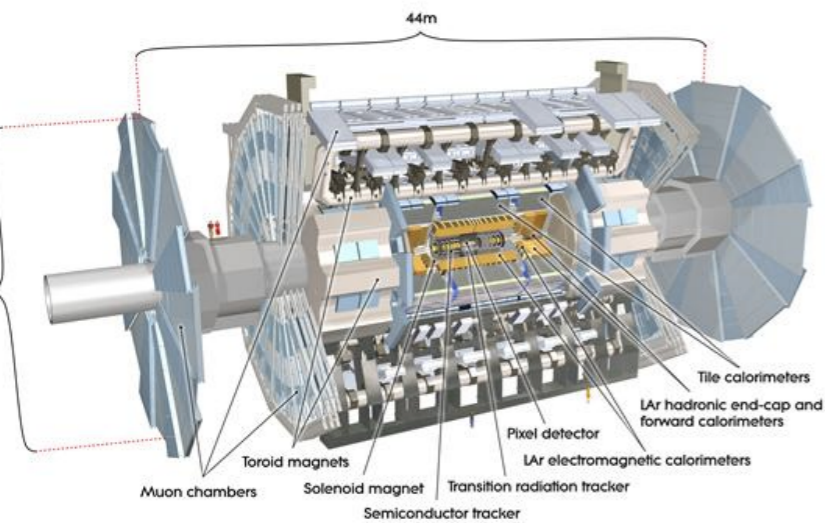
Rate of all *interesting* proton-proton collisions produced by the LHC



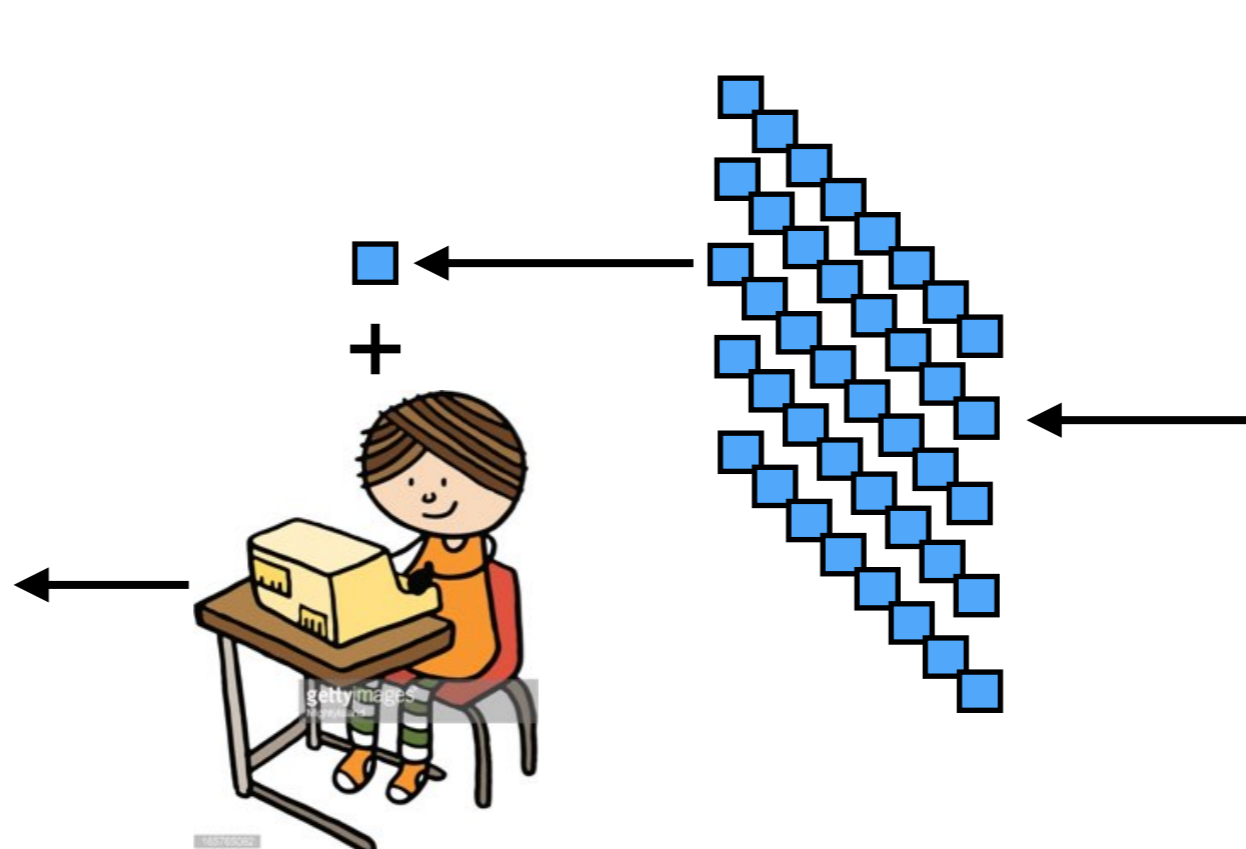
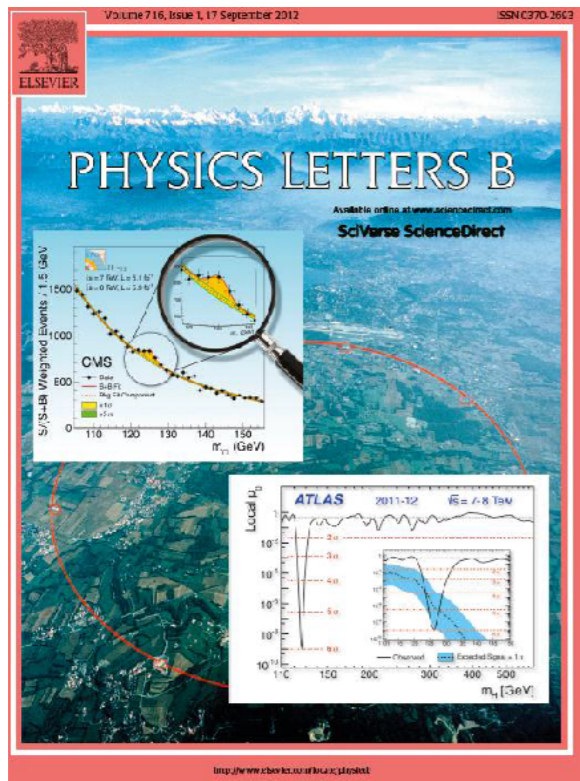
Trigger and DAQ requires a lot of computing power!



# Data's journey



Data Preparation



# Data Preparation

- Three major steps to **prepare data for physics analysis** and achieve
  - reliable, high quality data (yes, we **reject** low quality data)
  - the **best performance** from our detectors
  - readiness for **physics analysis**

## 1. Reconstruct physics signals from the data

- Produce information like how many muons does the event have?



Muon Spectrometer

Hadronic Calorimeter

Electromagnetic Calorimeter

Tracking

Solenoid magnet

Transition Radiation Tracker

Pixel/SCT detector

Muon

Proton

Neutron

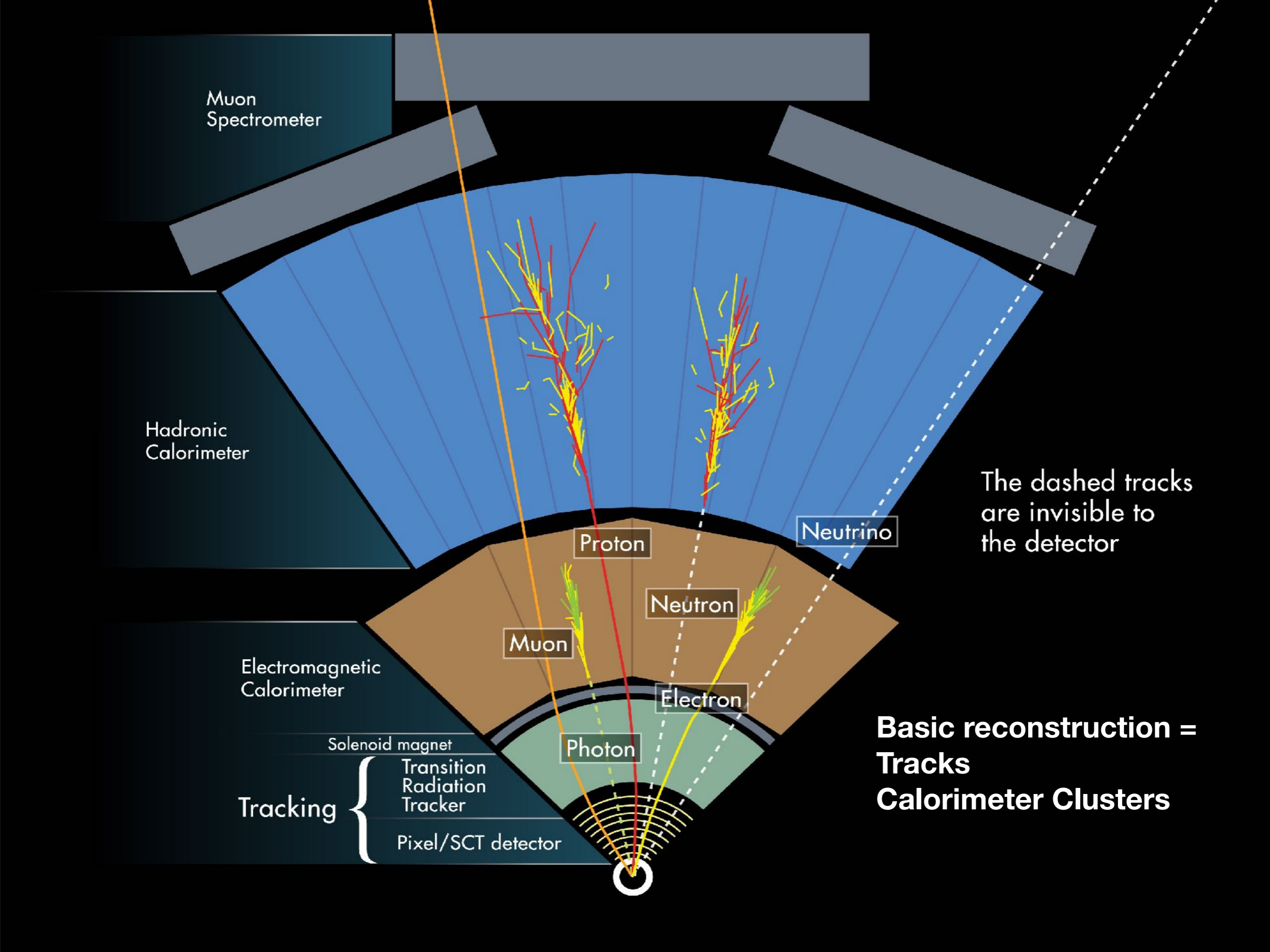
Electron

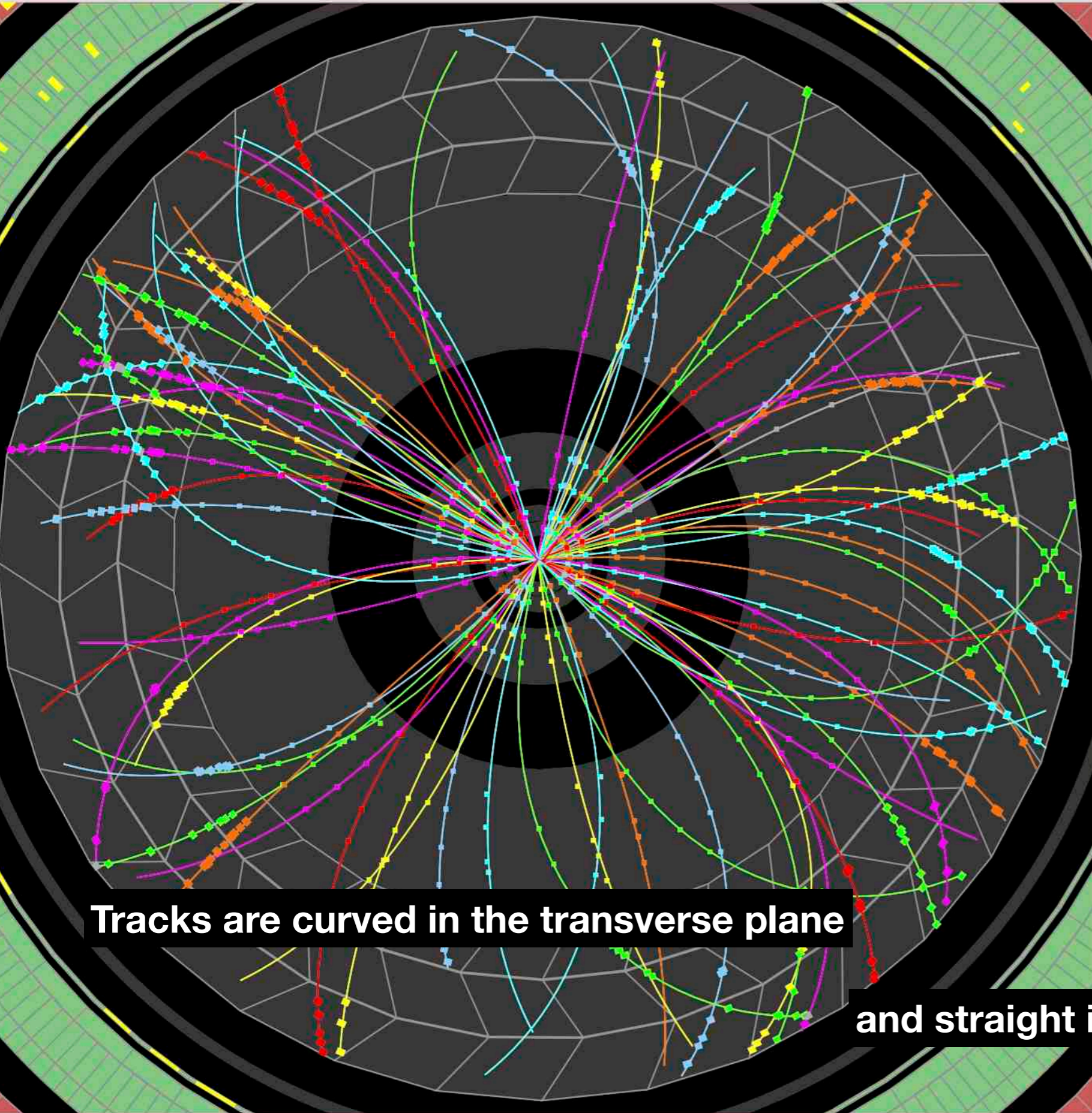
Photon

Neutrino

The dashed tracks are invisible to the detector

**Basic reconstruction =  
Tracks  
Calorimeter Clusters**





**Tracks are curved in the transverse plane**

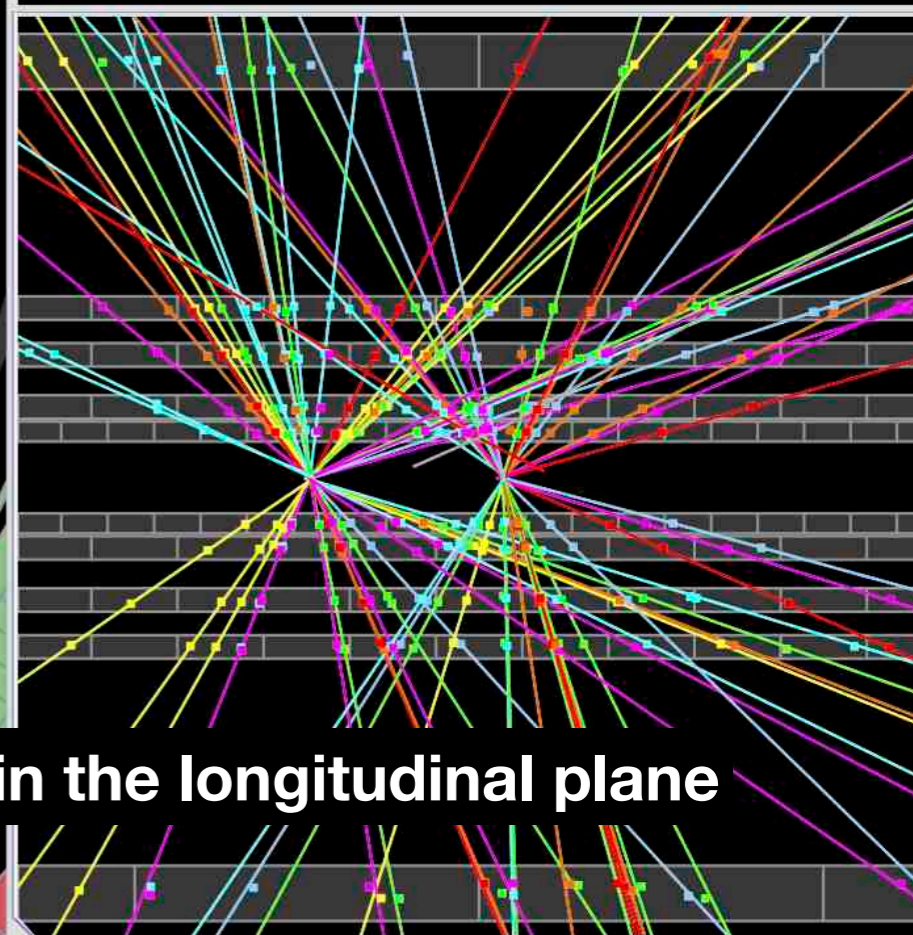


# ATLAS

## EXPERIMENT

Run Number: 265545, Event Number: 5720351

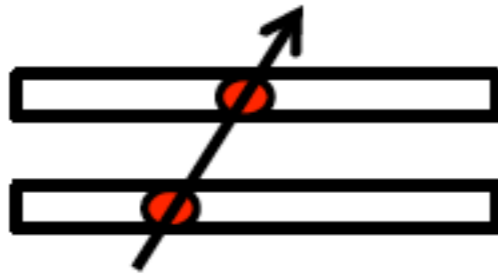
Date: 2015-05-21 10:39:54 CEST



**and straight in the longitudinal plane**

# Track fitting

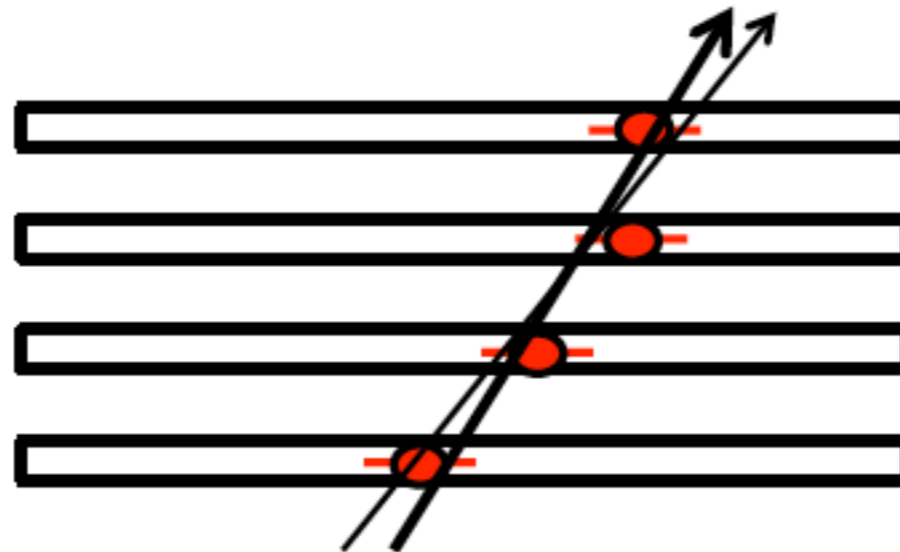
⊙ Perfect measurement – ideal



⊙ Imperfect measurement – reality



⊙ Small errors and more points help to constrain the possibilities



⊙ Quantitatively:

- ⊙ Parameterize the track;
- ⊙ Find parameters by Least-Squares-Minimization;
- ⊙ Obtain also uncertainties on the track parameters.

# Data Preparation

- Three major steps to **prepare data for physics analysis** and achieve
  - reliable, high quality data (yes, we **reject** low quality data)
  - the **best performance** from our detectors
  - readiness for **physics analysis**

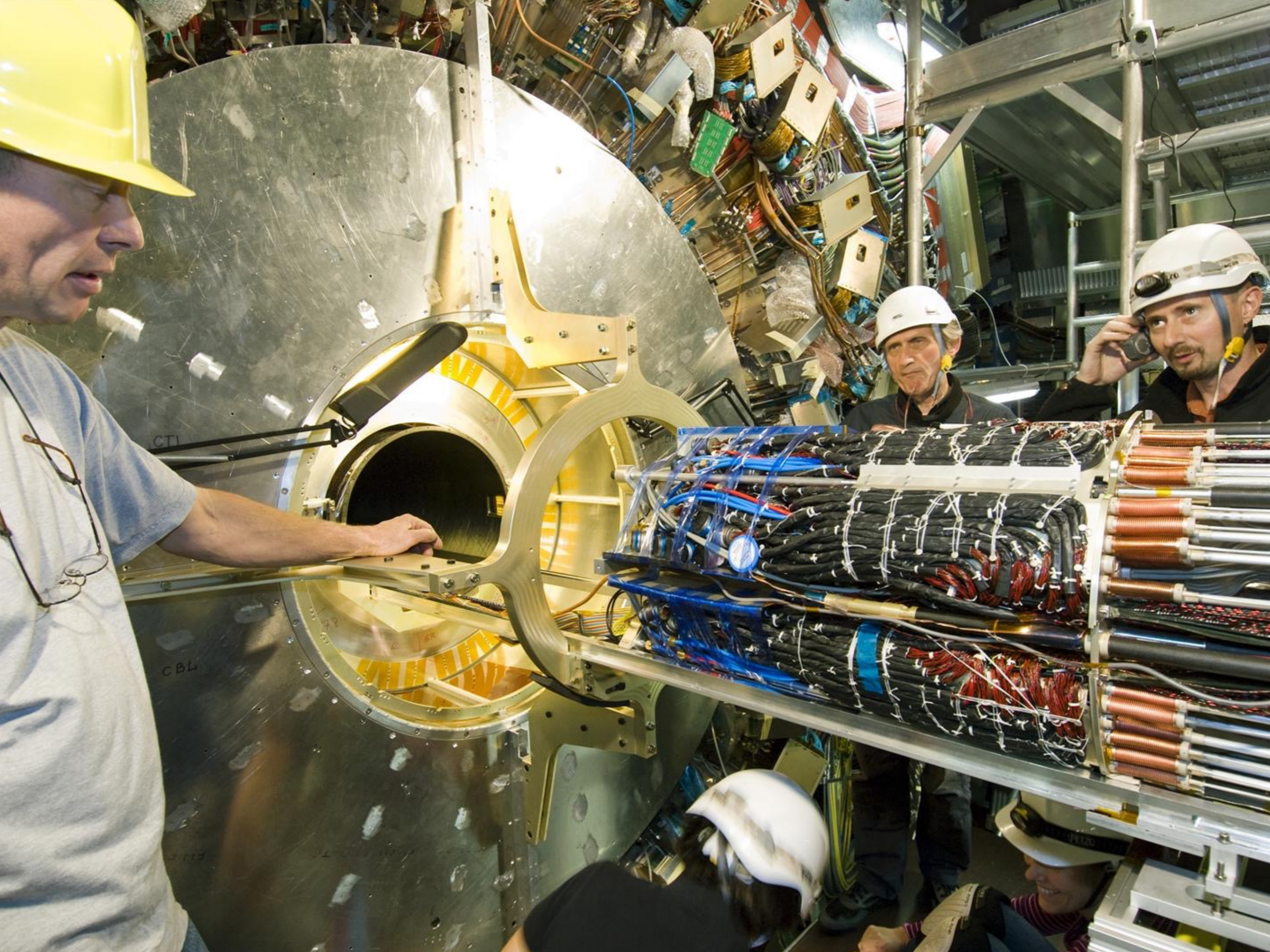
## 1. Reconstruct physics signals from the data

- Produce information like how many muons does the event have?



## 2. Calibrate the detectors

- Correct imperfections, account for changes over time...



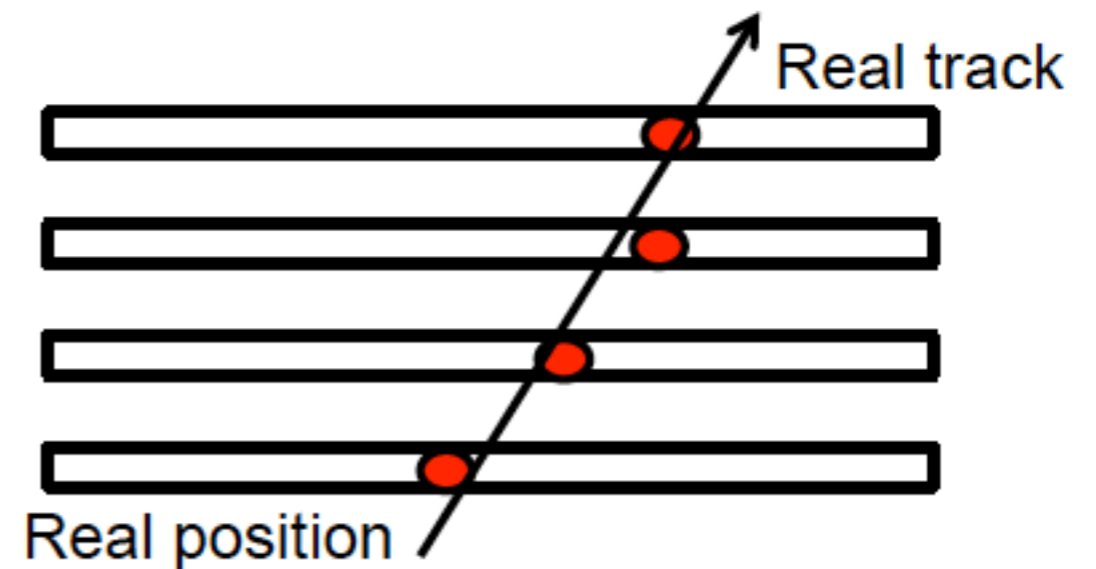
# Real detector effects

## ⊙ Presence of Material

- ⊙ Coulomb scattering off the core of atoms
- ⊙ Energy loss due to ionization
- ⊙ Bremsstrahlung
- ⊙ Hadronic interaction

## ⊙ Misalignment

- ⊙ Detector elements not positioned in space with perfect accuracy.
- ⊙ Alignment corrections derived from data and applied in track reconstruction.



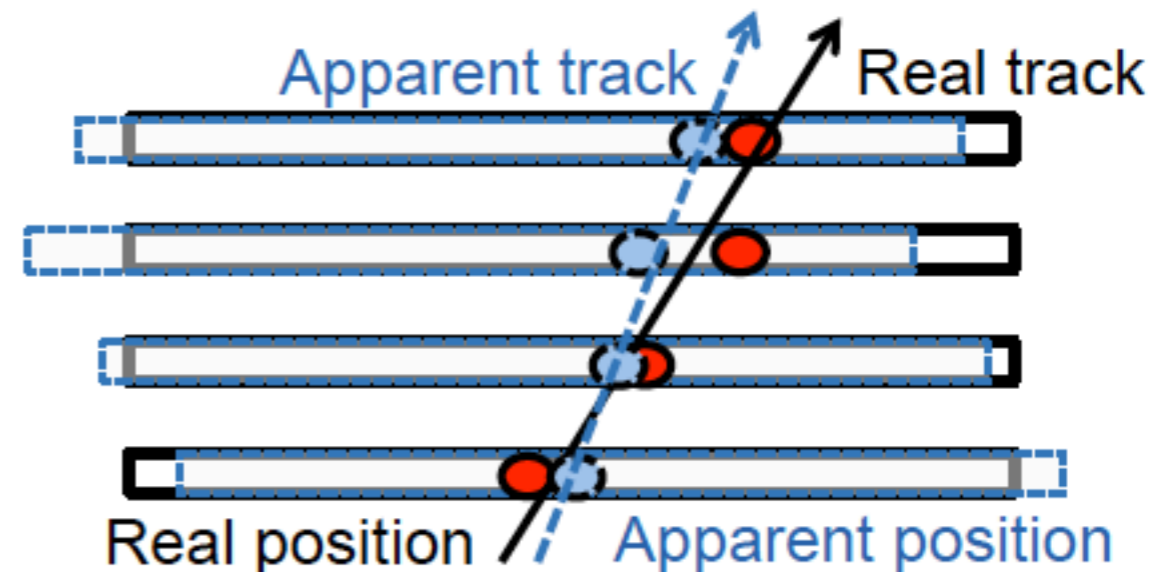
# Correcting detector effects - calibration

## ⊙ Presence of Material

- ⊙ Coulomb scattering off the core of atoms
- ⊙ Energy loss due to ionization
- ⊙ Bremsstrahlung
- ⊙ Hadronic interaction

## ⊙ Misalignment

- ⊙ Detector elements not positioned in space with perfect accuracy.
- ⊙ Alignment corrections derived from data and applied in track reconstruction.



# Data Preparation

- Three major steps to **prepare data for physics analysis** and achieve
  - reliable, high quality data (yes, we **reject** low quality data)
  - the **best performance** from our detectors
  - readiness for **physics analysis**

## 1. Reconstruct physics signals from the data

- Produce information like how many muons does the event have?



## 2. Calibrate the detectors

- Correct imperfections, account for changes over time...



## 3. Make sure that the **data quality** is excellent, also in real time

- Maximise the amount of useful data



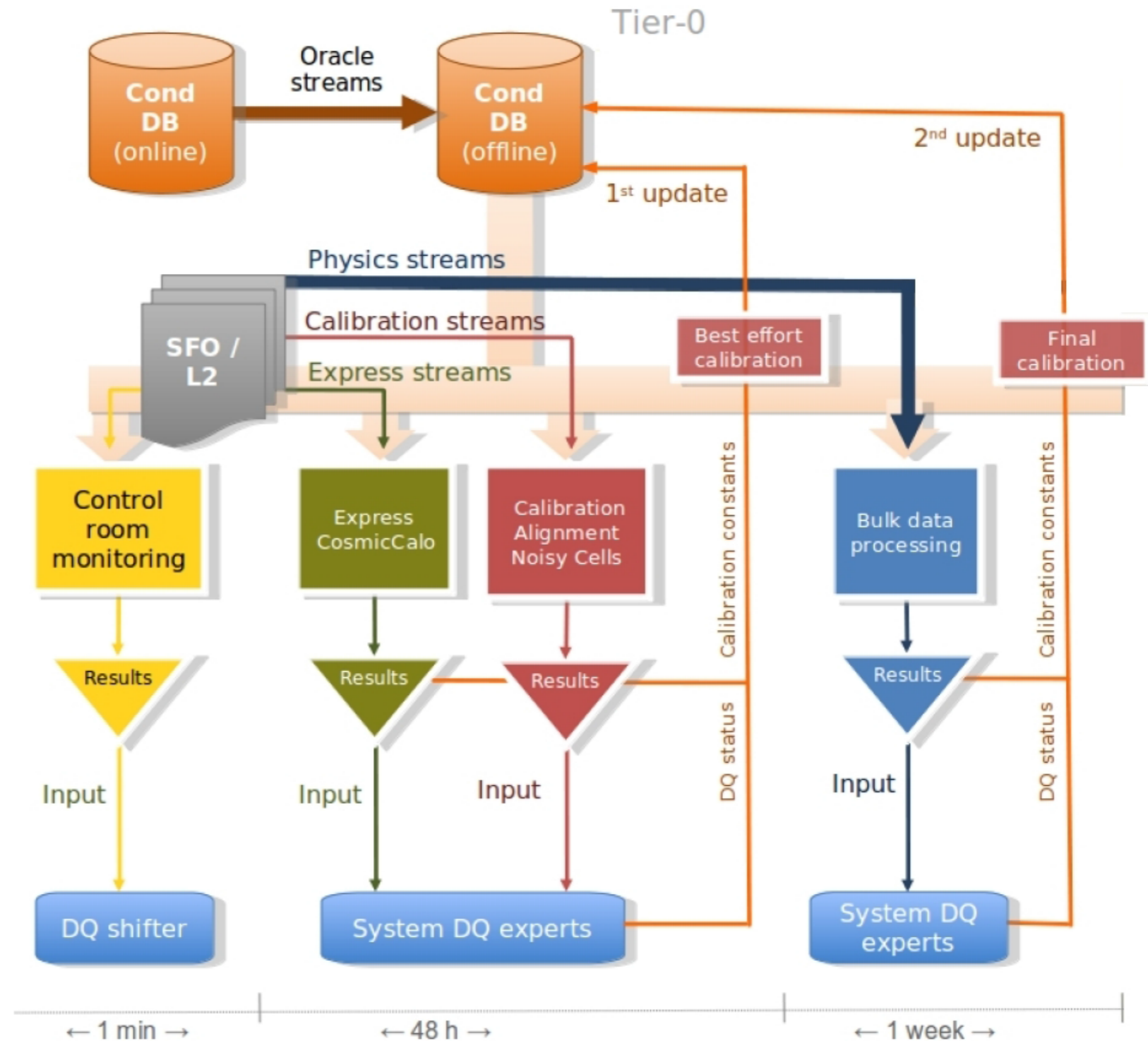
# Data Quality

Check during data taking

Check a fraction of the data with a quick calibration

Check all of the data with the best calibration

**- Publish this data !!**



# Data Quality

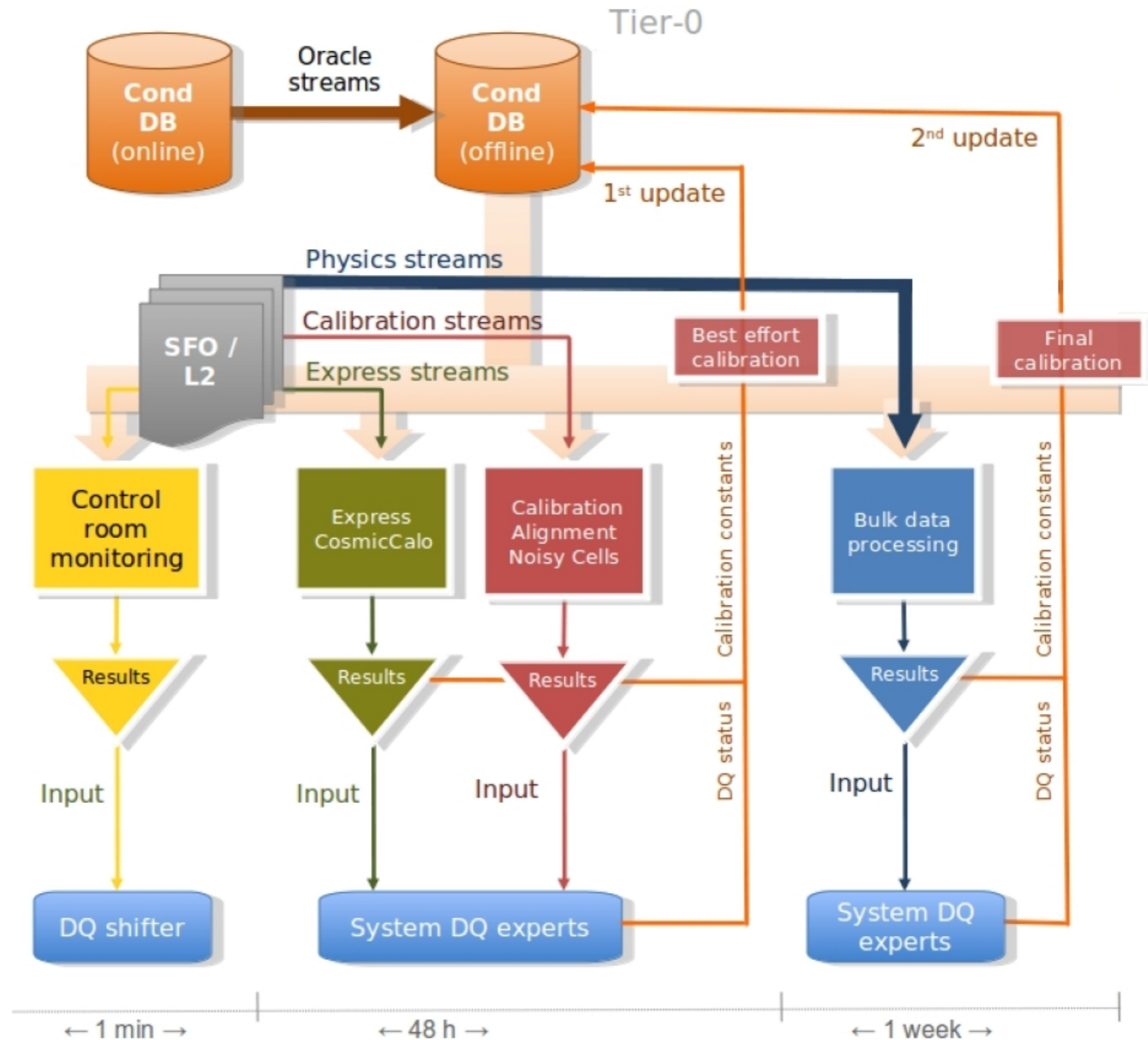
Check during data taking

Check a fraction of the data with a quick calibration

Check all of the data with the best calibration

*- Publish this data !!*

**Q. If we can calibrate the data, why do we need to have Data Quality checks in the control room?**



# Data Preparation

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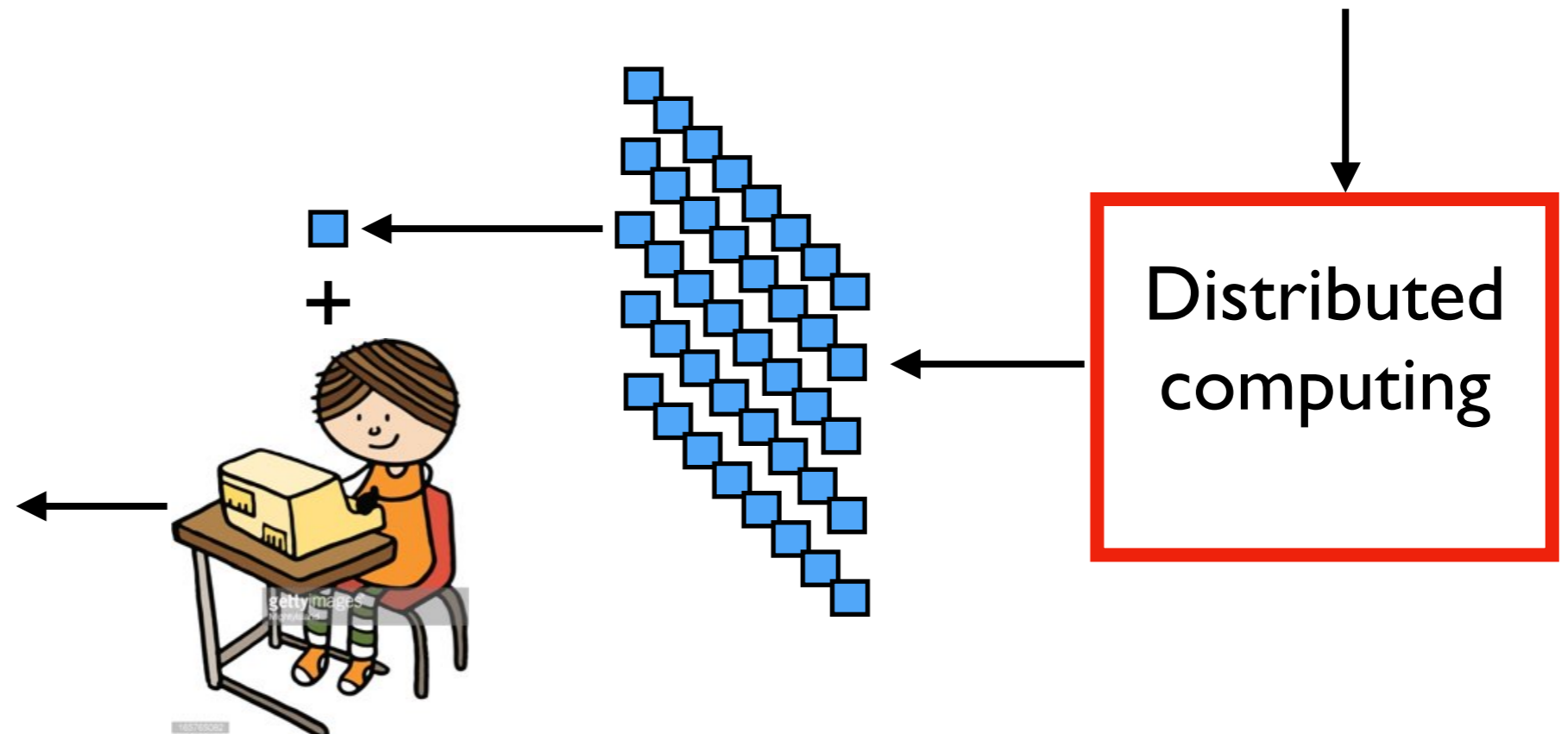
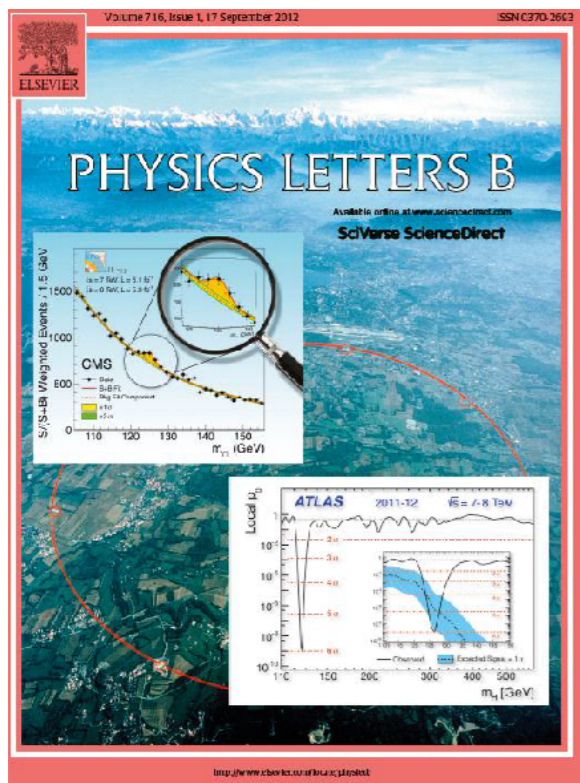
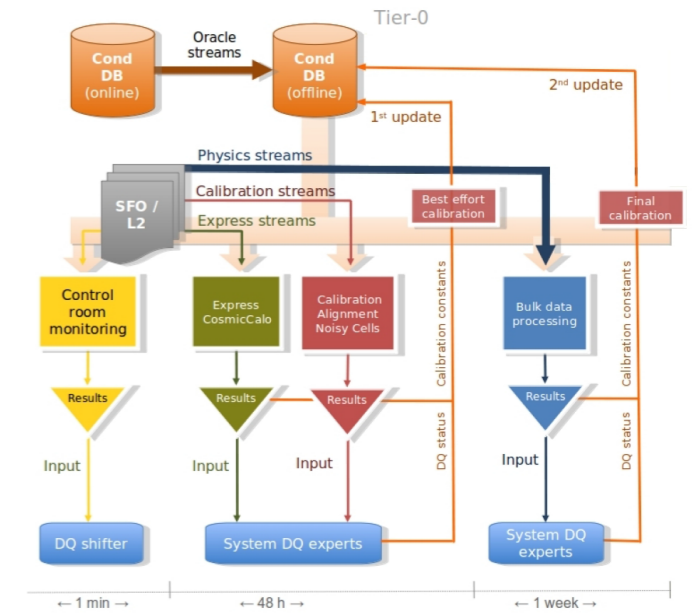
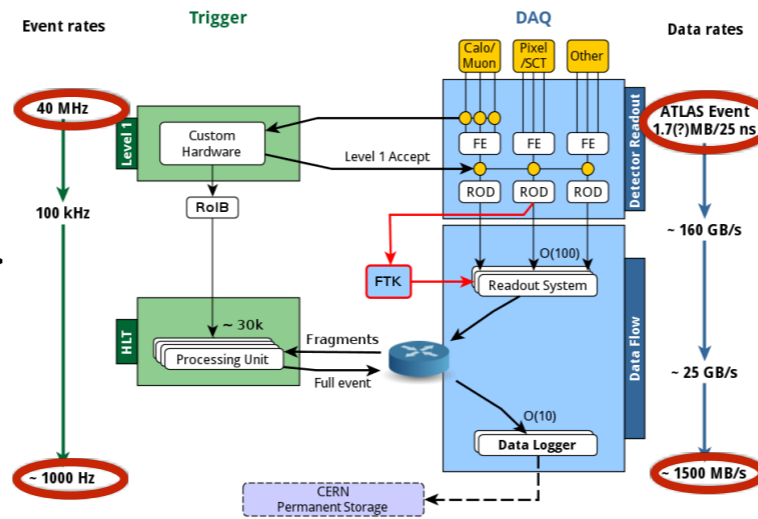
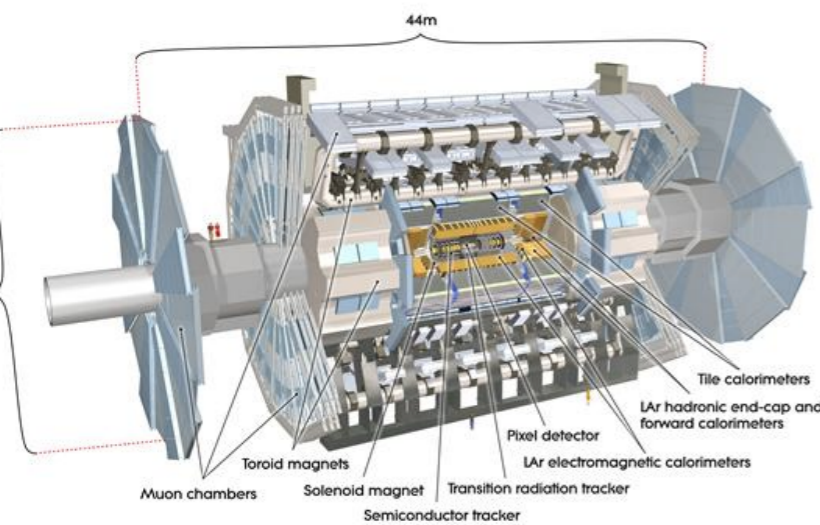


## 3. Make sure that the **data quality** is excellent, also in real time

- Maximise the amount of useful data

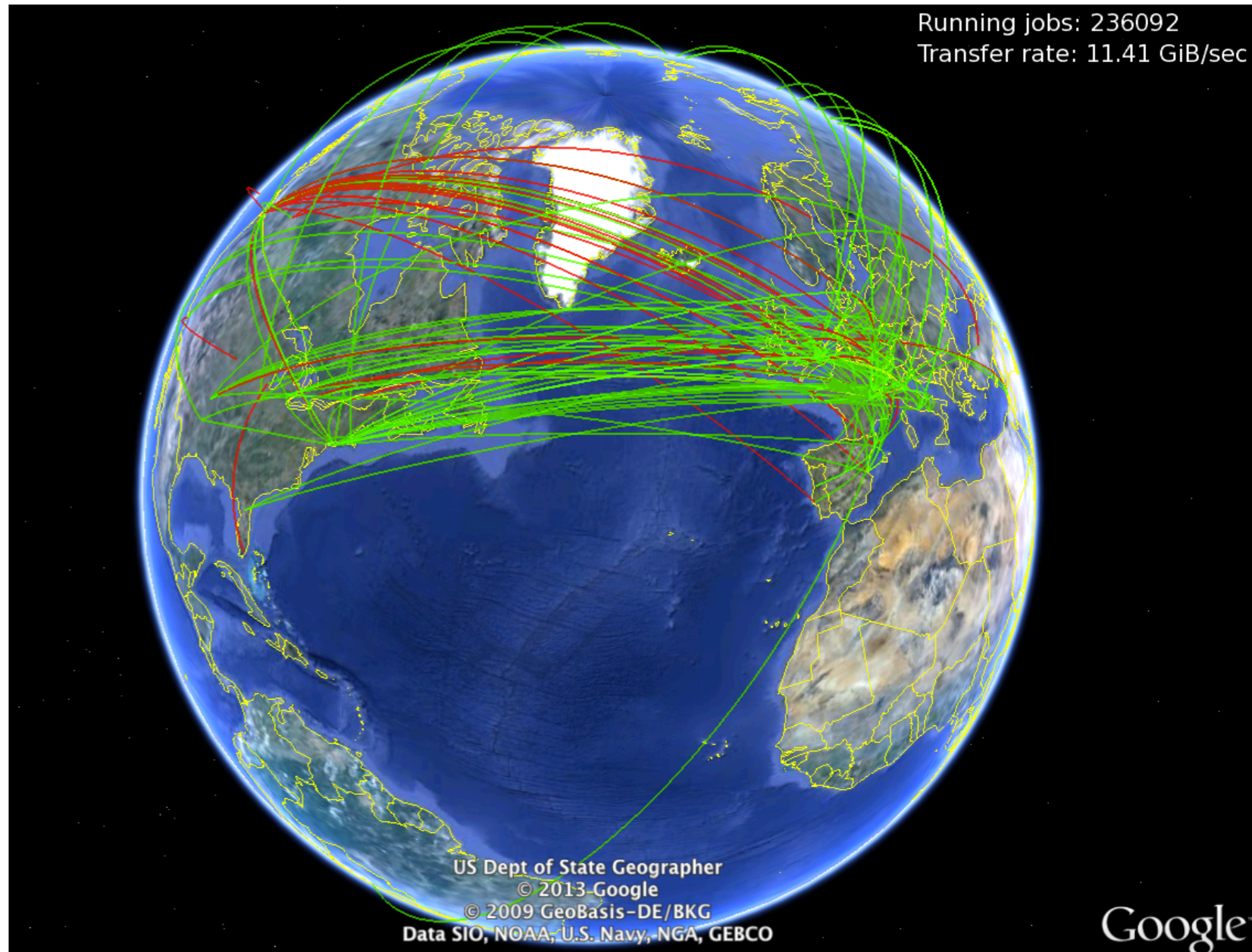


# Data's journey

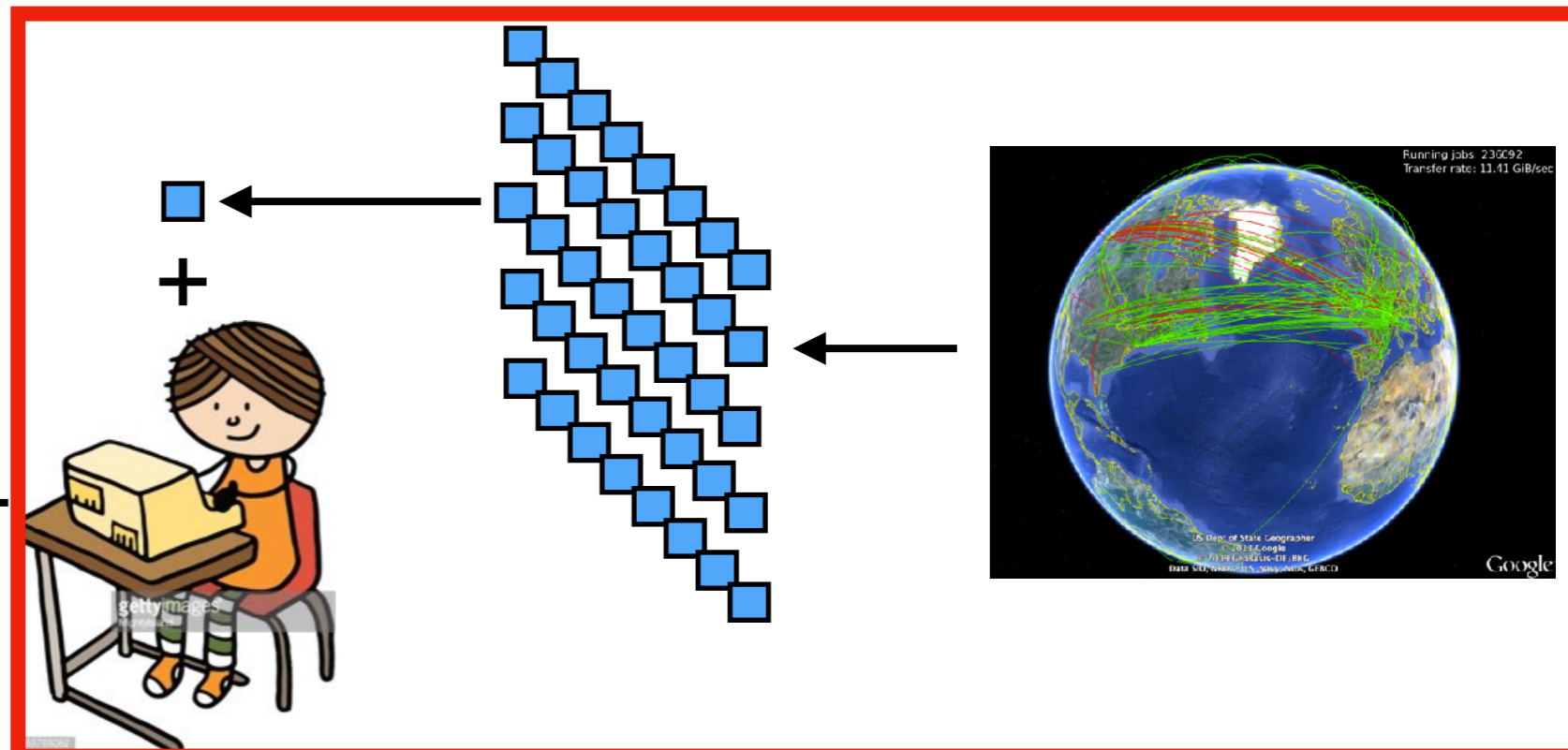
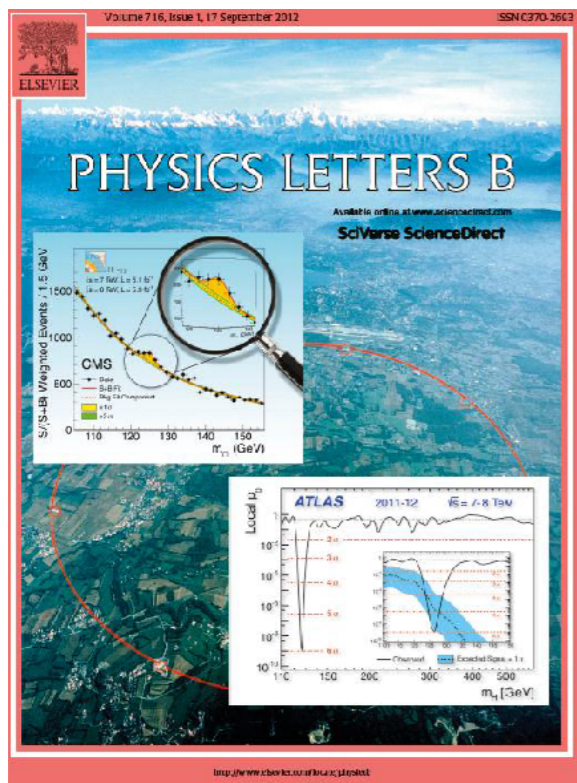
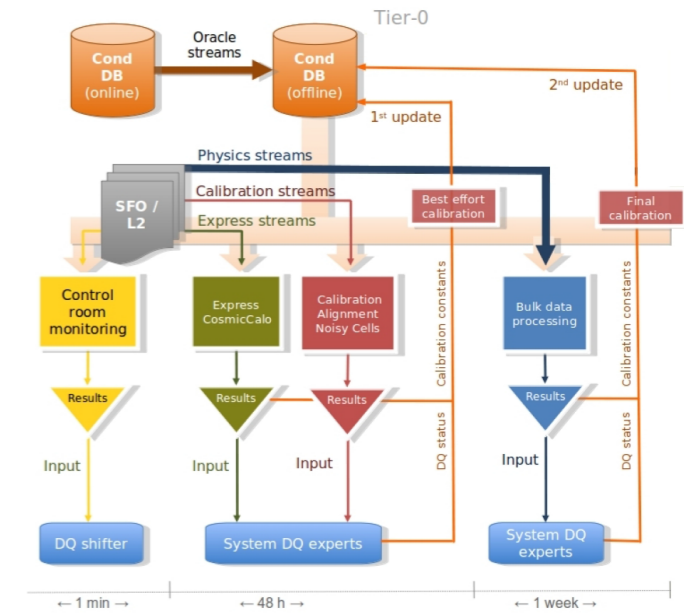
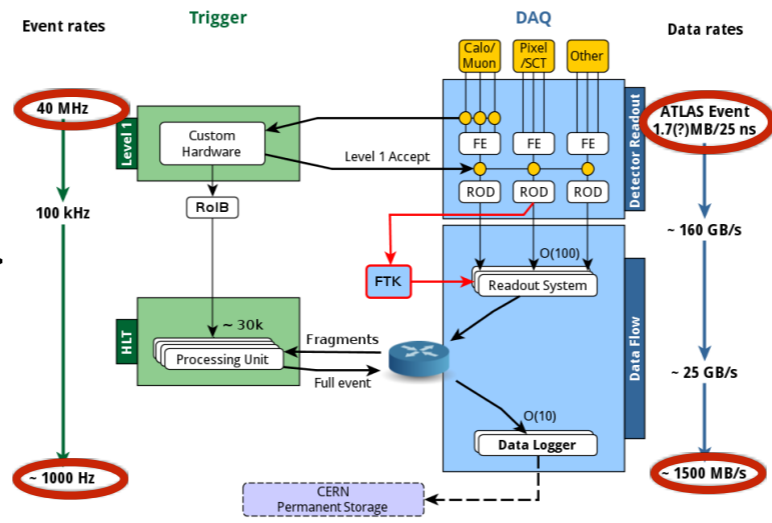
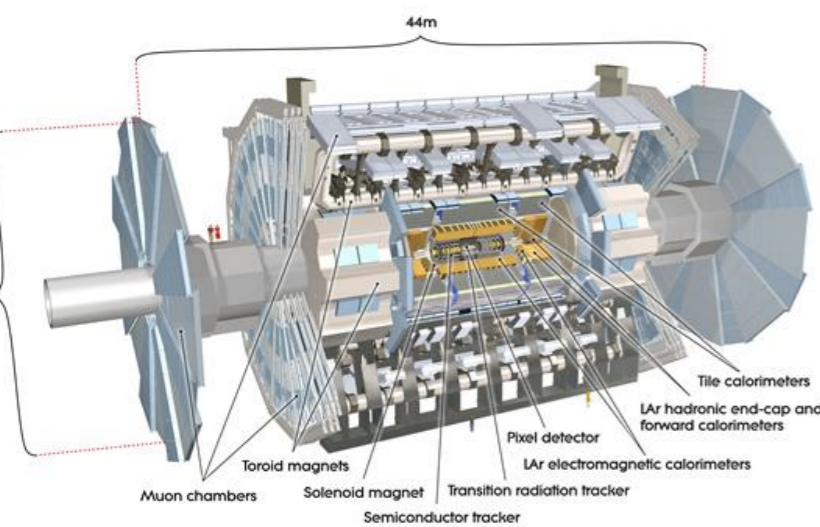


# The Worldwide LHC Computing Grid

- Now the data has been ***prepared for physics analysis***, it's time to extract our favourite physics signal!
- Many experiments, particularly those at the **LHC**, use computing sites all over the world via **the grid** to
  - harness all of that ***computing power***
  - enable collaborators ***worldwide*** to access the data



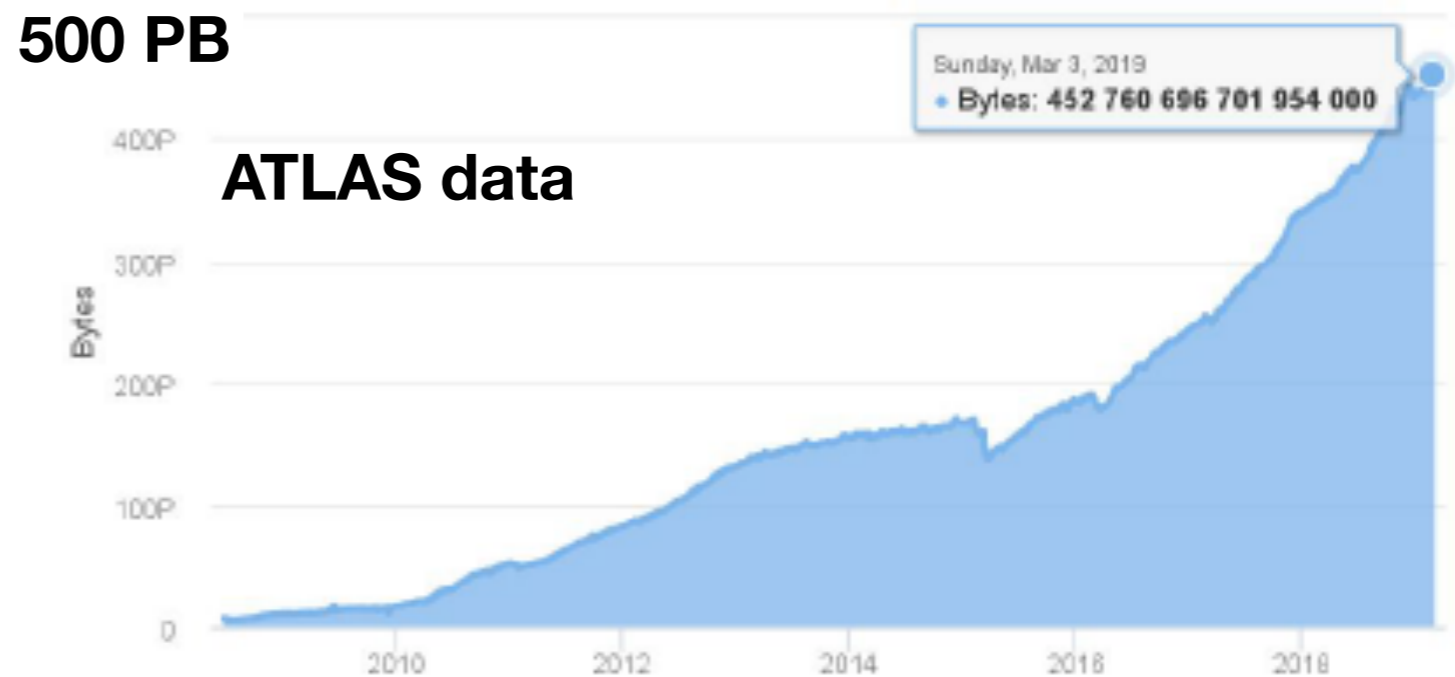
# Data's journey



# We did it !

- Our data is calibrated and with good data quality
- and we've reconstructed the physics objects in the data
  - **The data is reliable, accurate, and ready for physics analysis**
- **More detail on these topics in Lecture 2**
- **Then we can extract our measurements in Lecture 3**

- **Question:** How long would it take to read **500 PB** of ATLAS data?  
(Assume for simplicity you have off-the-shelf SSDs with read speed  $\sim 500\text{MB/s}$ )



# Contact details

- I am usually based at Geneva Observatory in Versoix, but will be here at CERN Wednesday 3rd through Friday 5th July
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