

# Big Data Analytics:

Unlocking the full potential of the CERN's Large Hadron Collider.

Manuel Martín Márquez



# CERN

- CERN - **European Laboratory for Particle Physics**
- Founded in **1954** by **12 Countries** for fundamental physics research in a post-war Europe
  - Major milestone in the post-World War II recovery/reconstruction process



YEARS / ANS CERN



# CERN openlab

- Public-private partnership between CERN and leading ICT companies
- Accelerate cutting-edge solutions to be used by the worldwide LHC community
- Train the next generation of top engineers and scientists.

## Partners



ORACLE

SIEMENS

## Contributors



## Associates

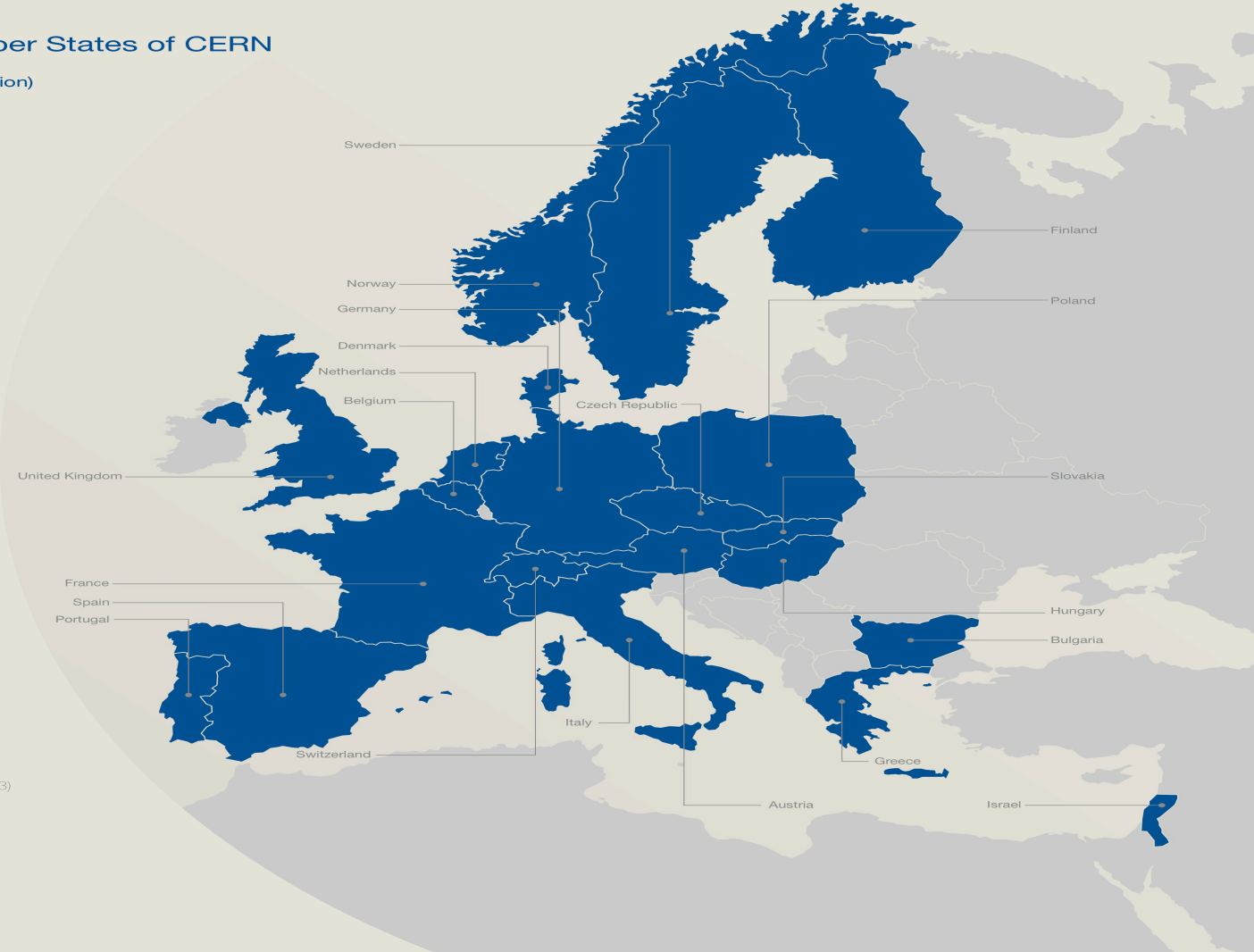
Yandex

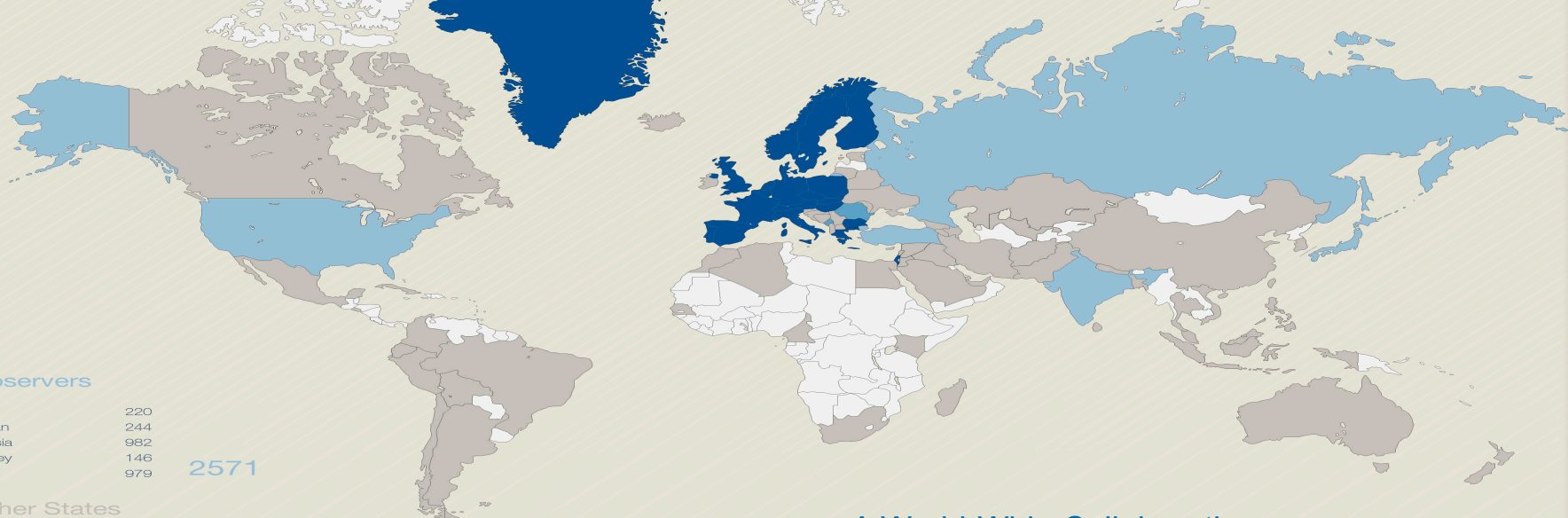


# The twenty one Member States of CERN

## Member States (Dates of accession)

-  Austria (1959)
-  Belgium (1953)
-  Bulgaria (1999)
-  Czech Republic (1993)
-  Denmark (1953)
-  Finland (1991)
-  France (1953)
-  Germany (1953)
-  Greece (1953)
-  Hungary (1992)
-  Israel (2014)
-  Italy (1953)
-  Netherlands (1953)
-  Norway (1953)
-  Poland (1991)
-  Portugal (1986)
-  Slovakia (1993)
-  Spain (1/1961-12/1968-1/1983)
-  Sweden (1953)
-  Switzerland (1953)
-  United Kingdom (1953)





## Observers

India	220
Japan	244
Russia	982
Turkey	146
USA	979

2571

## Other States

Afghanistan	1	El Salvador	1	Pakistan	41
Albania	2	Estonia	16	Palestine (O.T.)	4
Algeria	8	Georgia	36	Peru	8
Argentina	11	Gibraltar	1	Philippines	1
Armenia	25	Hong Kong	1	Saudi Arabia	3
Australia	25	Iceland	4	Senegal	1
Azerbaijan	8	Indonesia	1	Singapore	2
Bangladesh	4	Iran	28	Sint Maarten	2
Belarus	47	Ireland	22	Slovenia	27
Bolivia	3	Jordan	2	South Africa	16
Bosnia & Herzegovina	1	Kenya	1	Sri Lanka	5
Brazil	108	Korea, D.P.R.	1	Syria	2
Cameroon	1	Korea Rep.	117	Thailand	12
Canada	134	Kuwait	1	T.F.Y.R.O.M.	1
Cape Verde	1	Lebanon	12	Tunisia	6
Chile	12	Lithuania	19	Ukraine	55
China	280	Luxembourg	4	Uzbekistan	4
China (Taipei)	45	Madagascar	4	Venezuela	9
Colombia	30	Malaysia	15	Viet Nam	9
Croatia	35	Mauritius	1	Zimbabwe	2
Cuba	7	Mexico	64		
Cyprus	16	Montenegro	3		
Ecuador	3	Morocco	12		
Egypt	19	Nepal	5		
		New Zealand	7		

1415

## A World-Wide Collaboration

### Member States

Austria	99	Greece	152	Slovakia	88
Belgium	106	Hungary	68	Spain	337
Bulgaria	75	Israel	51	Sweden	75
Czech Republic	202	Italy	1686	Switzerland	180
Denmark	53	Netherlands	153	United Kingdom	640
Finland	87	Norway	61		
France	751	Poland	229		
Germany	1150	Portugal	109		

6352

### Candidate for Accession

Romania	118
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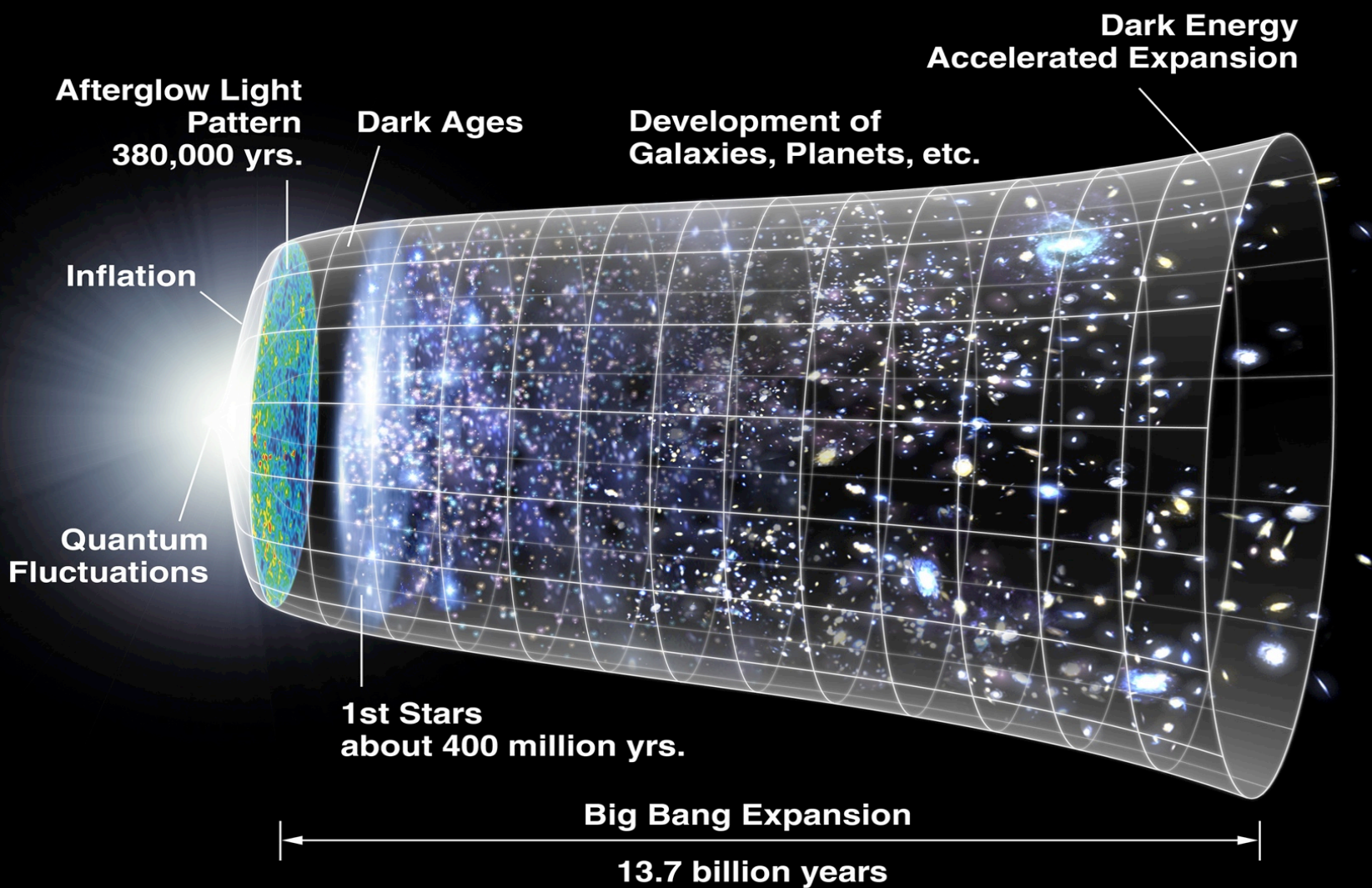
### Associate Members in the Pre-stage to Membership

Serbia	41
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Distribution of All CERN Users by Nationality on 14 January 2014



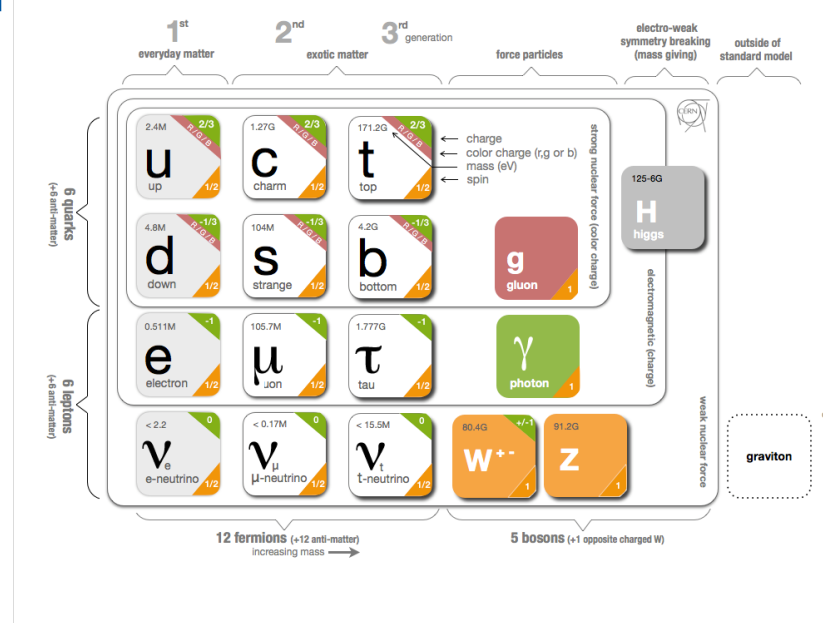
**How the Universe works  
and what is made of...**





# Fundamental Research

- Why do particles have mass?

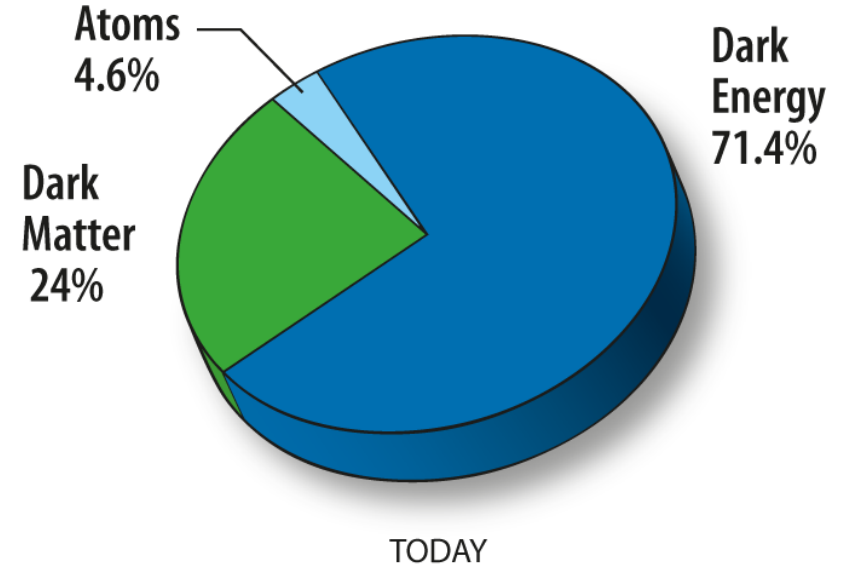
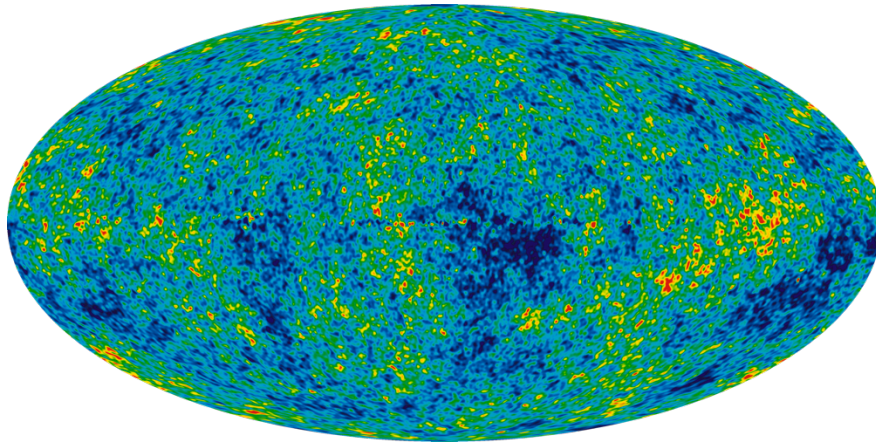


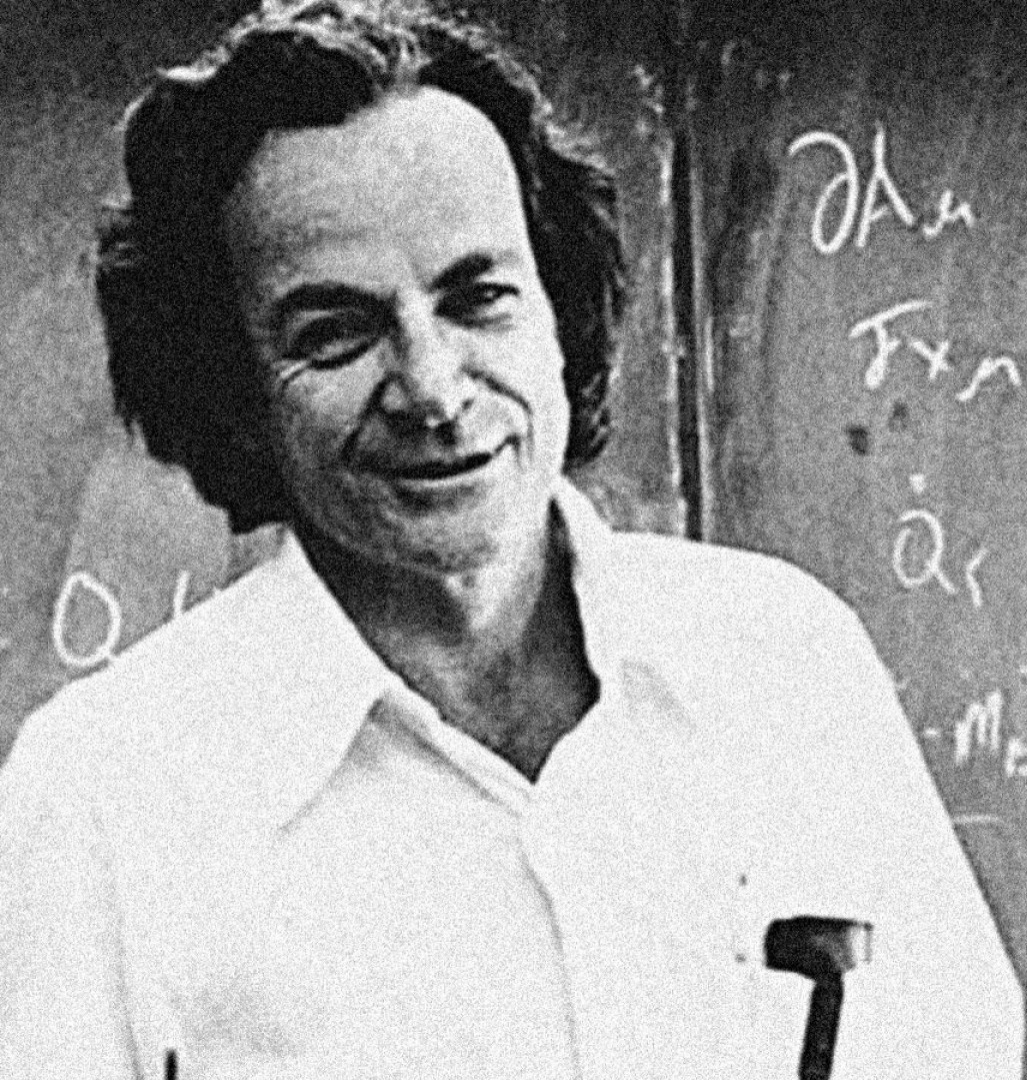
# Fundamental Research

- Why is there no antimatter left in the Universe?
  - Nature should be symmetrical
- What was matter like during the first second of the Universe, right after the "Big Bang"?
  - A journey towards the beginning of the Universe gives us deeper insight.

# Fundamental Research

- What is 95% of the Universe made of?





$$\partial_\mu \phi = m_\pi^2 \phi$$

$$F_{\mu\nu}$$

$$\dot{Q}_i = m_i^2 \int \psi$$

$$-m_D^2 \langle Q_i \rangle = m_D^2 \frac{\Gamma_{AD}}{M_D^2 - M_D^2}$$

Wanted: Mixing Elements  
for ant. & neutrinos

$\frac{1}{2} m_D$   
g

HERNANDEZ  
901-501-0000

$$\frac{\Gamma_{AD}}{M_D^2 - M_D^2}$$

$$M_D^2 - M_D^2$$

# The Large Hadron Collider (LHC)



**Largest machine** in the world

27km, 6000+ superconducting magnets

**Fastest racetrack** on Earth

Protons circulate 11245 times/s (99.9999991% the speed of light)

**Emptiest** place in the solar system

High vacuum inside the magnets

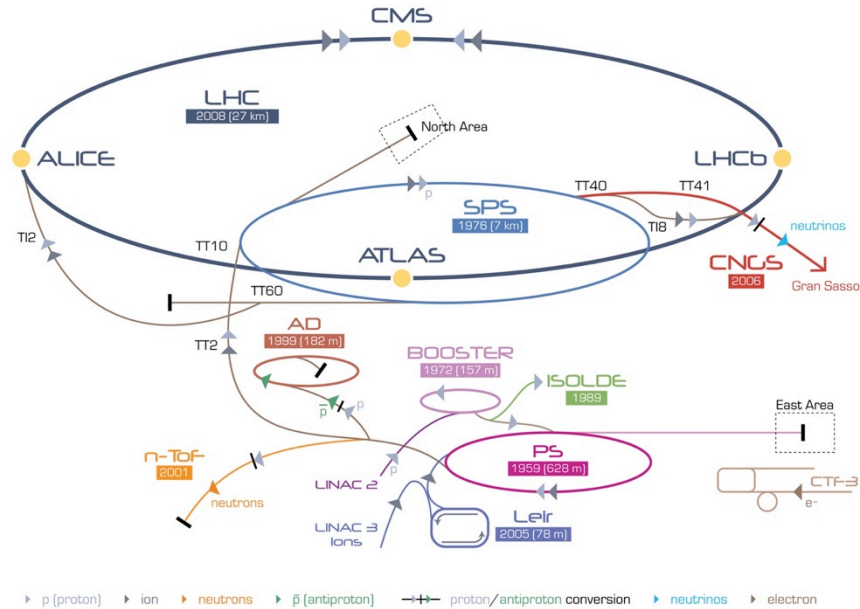
**Hottest spot** in the galaxy

During Lead ion collisions create temperatures 100 000x hotter than the heart of the sun;

# The Large Hadron Collider (LHC)



# CERN's Accelerator Complex



LHC Large Hadron Collider SPS Super Proton Synchrotron PS Proton Synchrotron

AD Antiproton Decelerator CTF-3 Clic Test Facility CNGS Cern Neutrinos to Gran Sasso ISOLDE Isotope Separator OnLine DEvice  
 LeIR Low Energy Ion Ring LINAC LiNear ACcelerator n-Tof Neutrons Time Of Flight



# ATLAS Detector

The image shows the ATLAS detector, a large particle detector used in high-energy physics experiments. It is a complex structure with various components, including cylindrical detectors, pipes, and structural elements. The detector is housed in a large, industrial-looking facility with blue structural beams and scaffolding. The lighting is bright, highlighting the intricate details of the detector's construction.

**150 Million** of sensor  
Control and detection sensors

**Massive 3D camera**  
Capturing 40+ million collisions per second  
Data rate TB per second



# CMS Detector



## Raw Data

Was a detector element hit?  
How much energy?  
What time?

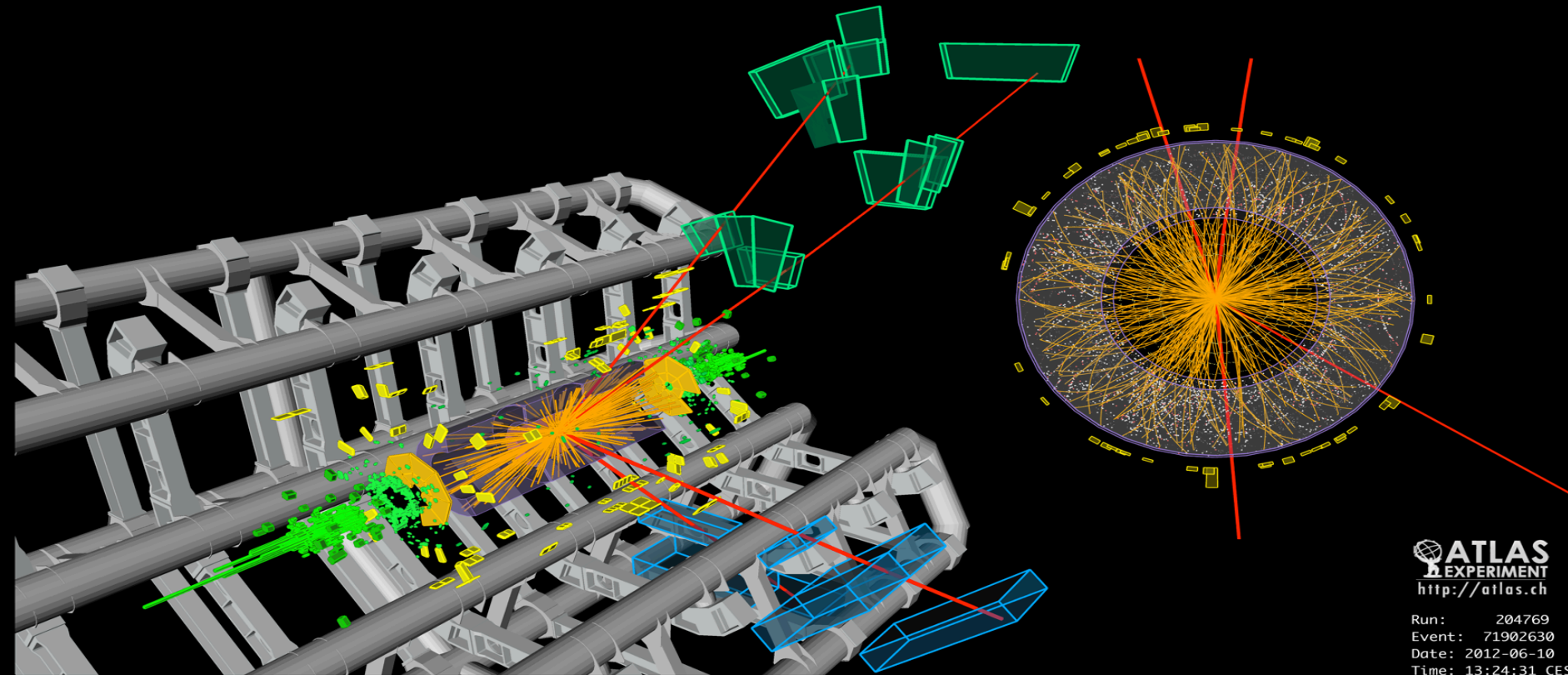
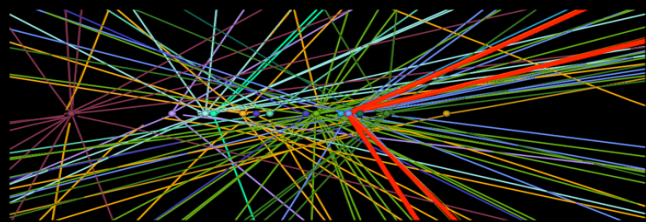
## Reconstructed Data

Particle Type  
Origin  
Momentum of tracks (4 vectors)  
Energy in cluster (jets)  
Calibration Information

# Higgs Boson Discovery

## 2012

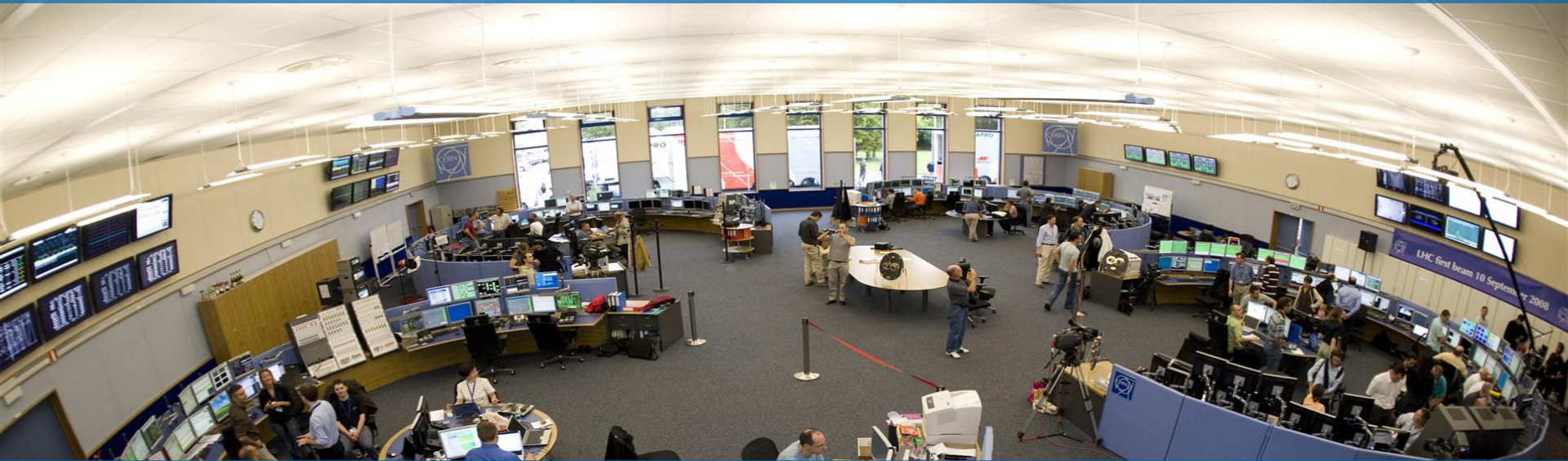
Higgs to  $4\mu$  candidate event



**ATLAS**  
EXPERIMENT  
<http://atlas.ch>

Run: 204769  
Event: 71902630  
Date: 2012-06-10  
Time: 13:24:31 CEST

# CERN Control Centre



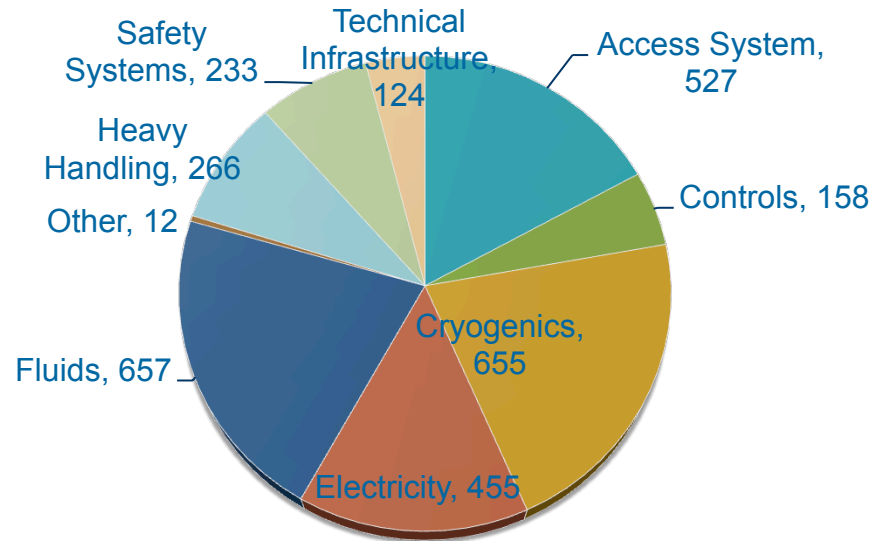
**CERN Accelerator Complex** is unique installation  
Therefore, we have to face unique challenges

## **Control and Operations**

Million of sensors, large number of control devices, front-end equipment, etc.  
Many critical systems: Cryogenics, Vacuums, Machine Protection, etc.

# Data Analytics Challenges

LHC Corrective Intervention: 3087 / year



# Data Analytics Challenges

- A look into the near Future
  - LHC run 2 (2015)

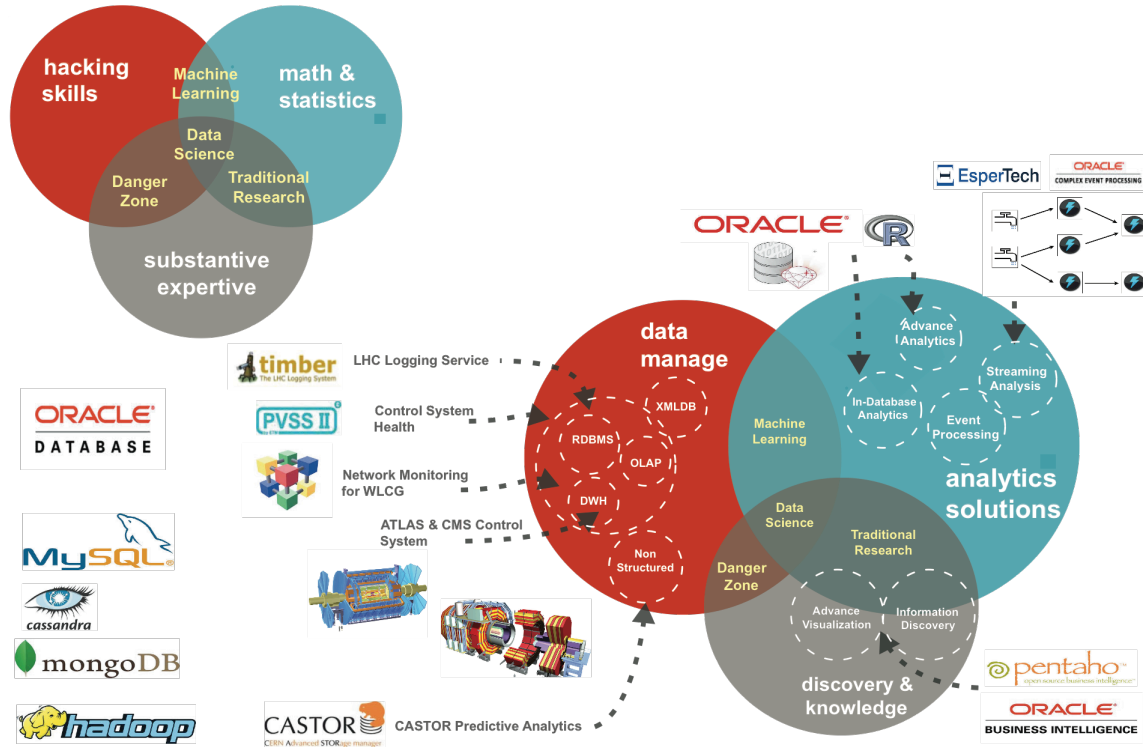
Parameter	2015			
	2010	2011	2012	design value
Beam energy	3.5	3.5	4	7
$\beta^*$ in IP 1 and 5 (m)	2.0/3.5	1.5/1.0	0.6	0.55
Bunch spacing (ns)	150	75/50	50	25
Max. number of bunches	368	1380	1380	2808
Max. bunch intensity (protons per bunch)	$1.2 \times 10^{11}$	$1.45 \times 10^{11}$	$1.7 \times 10^{11}$	$1.15 \times 10^{11}$
Normalized emittance at start of fill (mm mrad)	$\approx 2.0$	$\approx 2.4$	$\approx 2.5$	3.75
Peak luminosity ( $\text{cm}^{-2}\text{s}^{-1}$ )	$2.1 \times 10^{32}$	$3.7 \times 10^{33}$	$7.7 \times 10^{33}$	$1 \times 10^{34}$
Max. mean number of events per bunch crossing	4	17	37	19
Stored beam energy (MJ)	$\approx 28$	$\approx 110$	$\approx 140$	362

# Data Analytics Challenges

- Profit from our data investment
  - Extracting knowledge.
- Optimize our systems is mandatory
  - Reducing and predicting faults and corrective interventions
  - Increase the availability and operations efficiency
- Control and Monitoring Systems
  - Proactive
  - Predictive
  - Intelligent

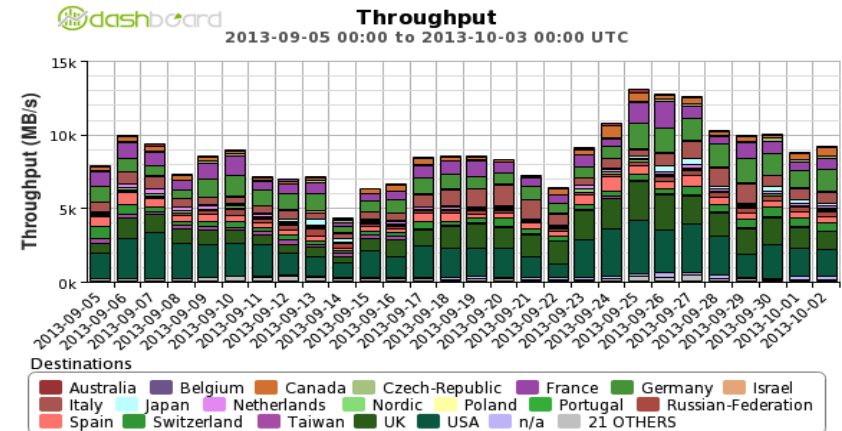


# Data & Analytics Environment



# CERN's Data Analytics Use Cases

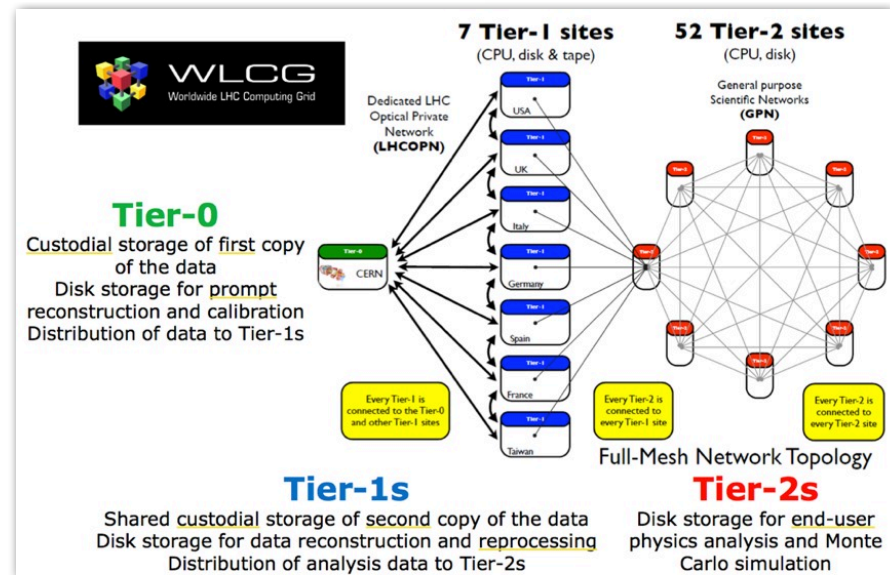
- WLCG relies heavily on the underlying networks
- Network Monitoring WLCG
  - Correlation in time and topology
  - Real-Time Analytics
    - Root Cause Analysis
    - Early warning systems





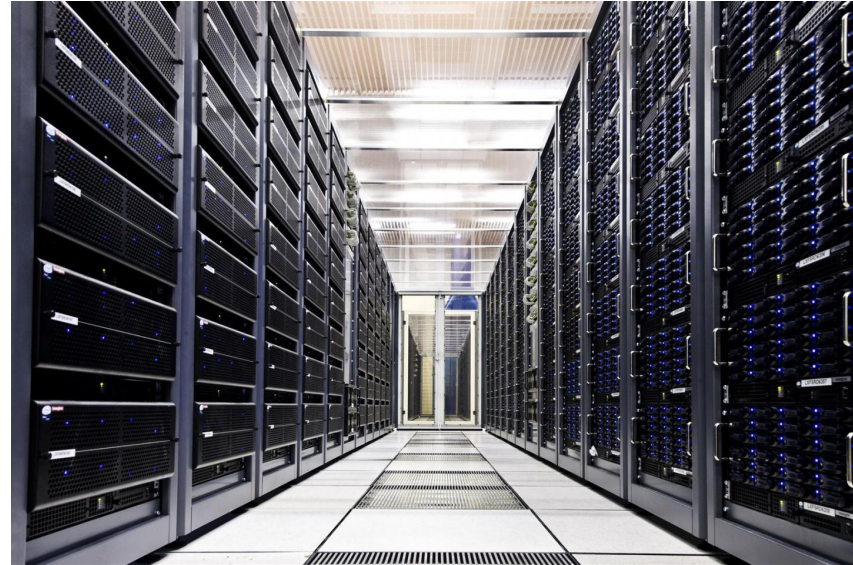
# CERN's Data Analytics Use Cases

- Intelligent Data Placement for CMS
- Resources optimization
  - Minimize number of replicas
  - Remove Obsolete
  - Job time in data access
  - Job time in data analysis
- Resources Prediction



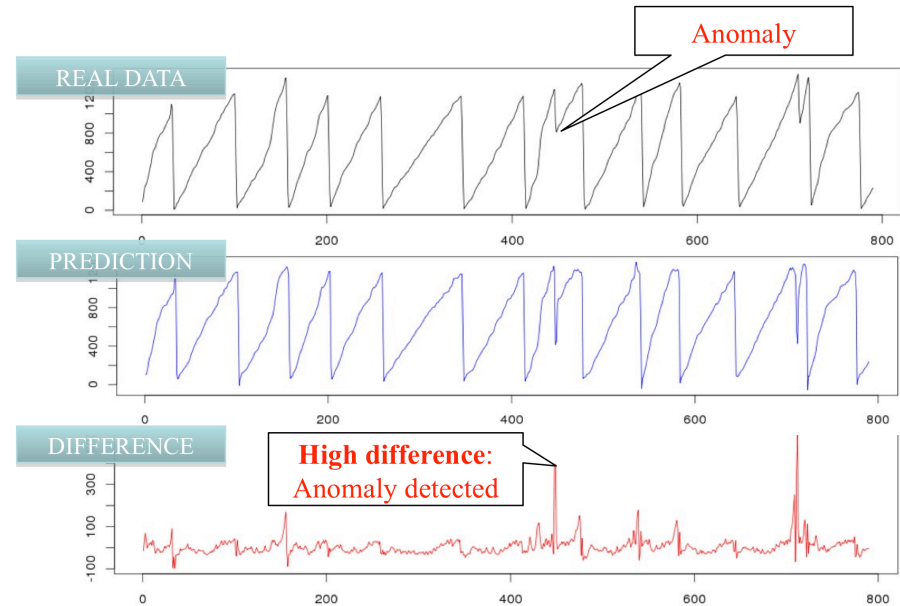
# CERN's Data Analytics Use Cases

- **CASTOR - CERN Advance Storage Manager**
  - CERN Mass Storage Solution
    - Disk + Tapes
    - 12k disks, 30k tapes
- **Expert system**
  - Spot ongoing incidents
- **Predictive analysis**
  - Predict problem occurrences



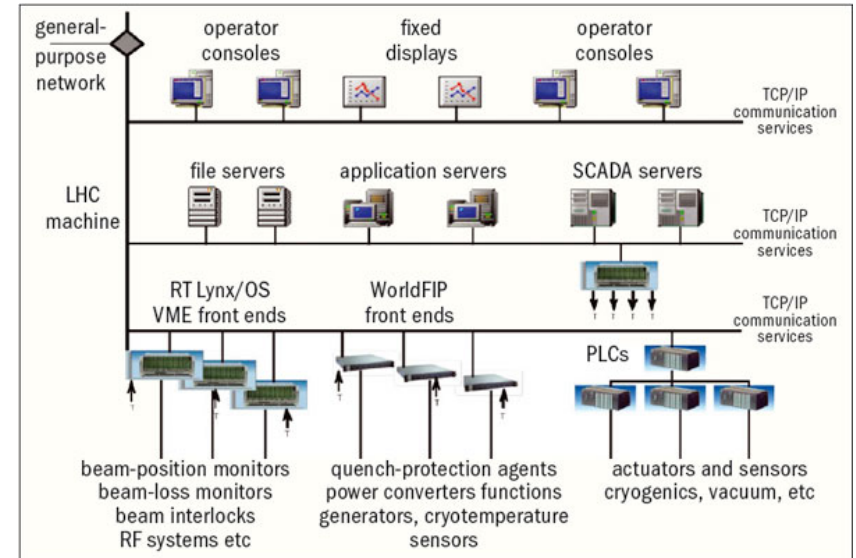
# CERN's Data Analytics Use Cases

- CASTOR – Anomaly Detection
  - Data to be transferred
    - Queue data
  - Prediction Model
    - Real - Prediction



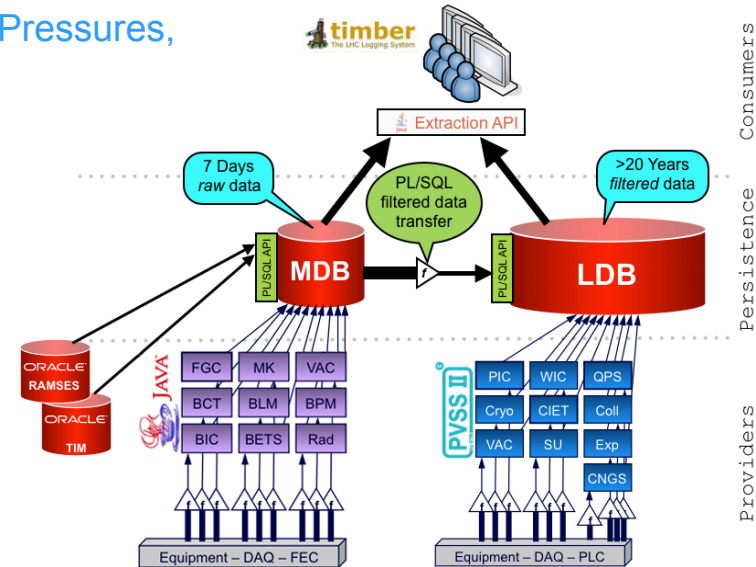
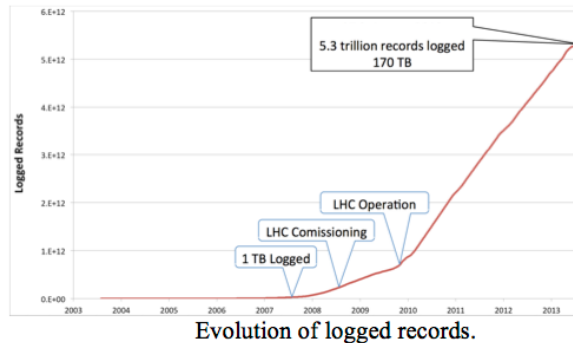
# CERN's Data Analytics Use Cases

- Control Systems
  - Control system Health
    - Gas Breakdown
    - Predictive maintenance
      - Cryogenics
      - Vacuum
      - Machine Protection
  - Quench Detection



# CERN Accelerators Control System

- Close to 1 million pre-defined signals
  - Cryogenics temperatures,
  - Magnetic field strengths, Power dissipation, Vacuum Pressures,
  - Beam intensities and positions...etc...
- About 5 million daily/average data requests
- Throughput over 100TB/Year, 300TB in 2015



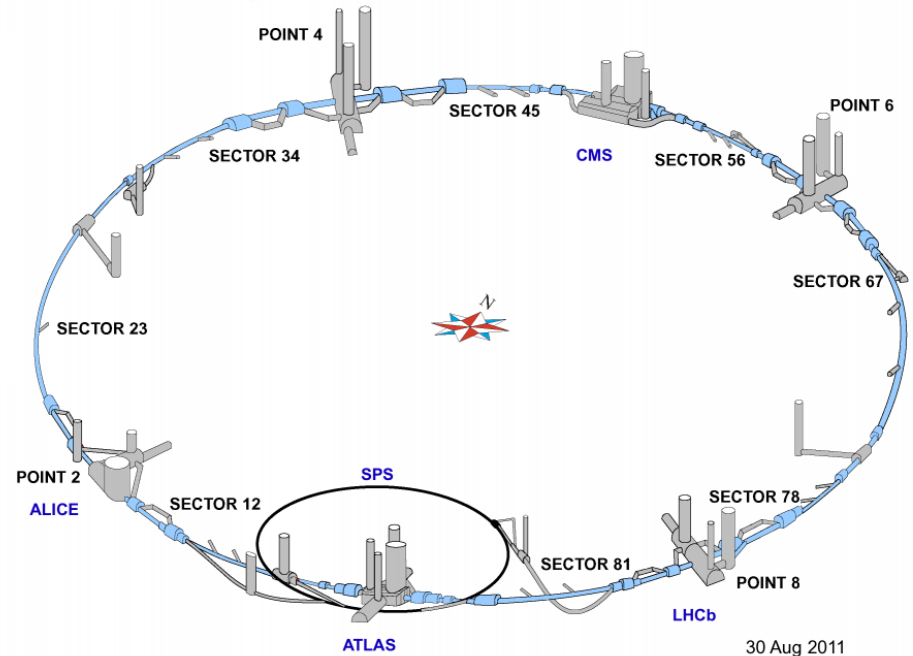
Consumers  
Persistence  
Providers



# Largest Cryogenics Installation



Instruments	Range	Total
TT (temperature)	1.6- 300K	9500
PT (pressure)	0-20 bar	2200
LT (level)	Various	540
EH (heaters)	Various	2500
CV (Control Valves)	0 - 100 %	3800
PV/QV (On Off Valves)	--	2000



# Largest Cryogenics Installation

- Study based on sectors
  - L4, R4, L8 and R8.
- Sensor Outputs
  - aperture order (%)
  - aperture measured (%)
- Three different status:
  - Faulty,
  - Not faulty
  - Unknown

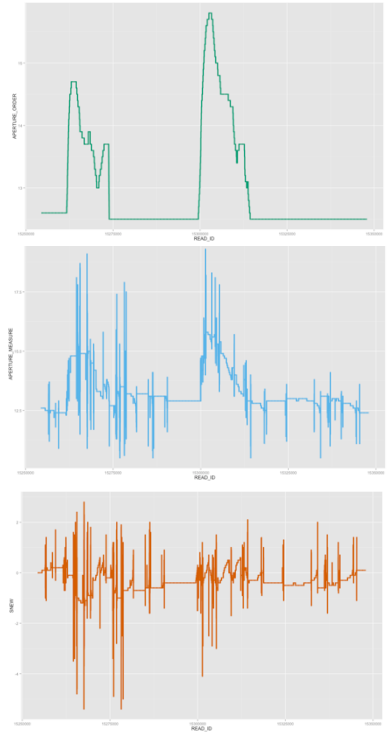


# Largest Cryogenics Installation

- Signals used:
  - **S** = aperture order - aperture measured
- Features extractions based on **S**
  - Variance
  - Percentile 99.9
  - Rope distance – R(S)
  - Noise Band – B(S)

$$R(S) = \frac{1}{N} \sum_{i=2}^N |S(i) - S(i-1)|$$
$$B(S) = \frac{\left| \sum_{k=1}^{N_{fft}/2} P_{xx}(k) \right|^2}{\sum_{k=1}^{N_{fft}/2} P_{xx}(k)}$$

- **Automatic Faulty Valves Detection System**
  - SVM - Support Vector Machine







[www.cern.ch](http://www.cern.ch)