



Evolving Research Software towards Next-Generation High-Energy Physics Experiments

Peter Elmer

Princeton University

17 Jan 2025 - Univ. of Hyderabad



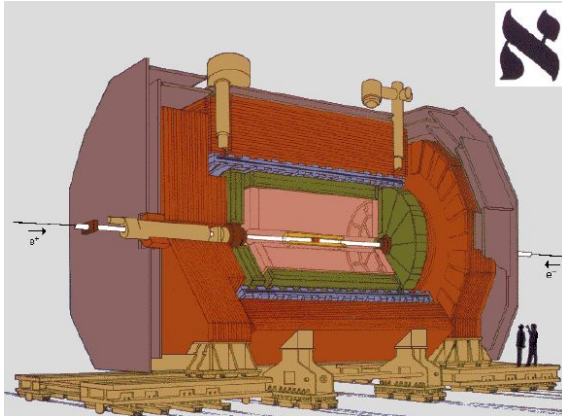
Introductions.... Who am I?

I am an experimental particle physicist (Princeton Physics since 2001, but based in Geneva, Switzerland) focused on computational and data science problems in my field, along with the software/computing systems to solve them.



Researchers in experimental particle physics tend to introduce themselves to each other with reference to the series of experiments with which they have collaborated. So here is my own version of that:

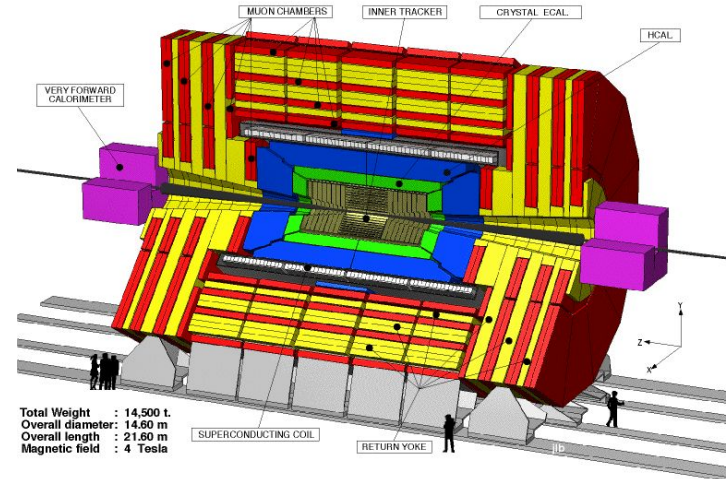
Aleph@CERN



BaBar@SLAC



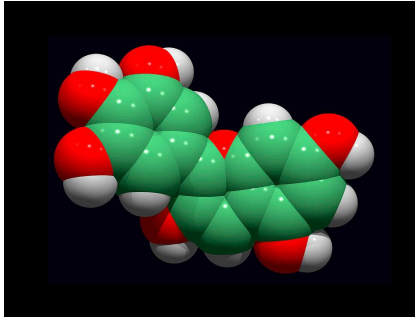
CMS@CERN



Exploring the nature of matter

Molecule

10^{-9} m = 0.000 000 001 m

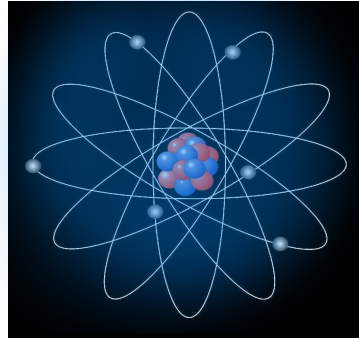


Delphinidin Molecule
(blue pigment of flowers and grapes)



Atoms

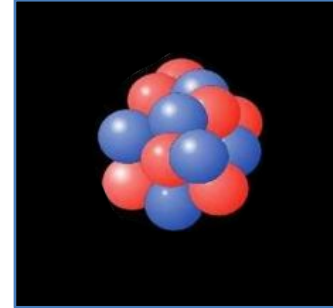
10^{-10} m = 0.000 000 000 1 m



Composed of:
Nucleus and electrons

Nucleus

10^{-14} m = 0.000 000 000 000 01 m



Composed of:
Protons and
neutrons

The modern era of particle physics began with the discoveries of radioactivity by Henri Becquerel in 1896, the electron by J.J. Thomson in 1897 and the atomic nucleus by Ernest Rutherford, Hans Geiger and Ernest Marsden in 1911.

Fundamental Particles of Matter

1937: Discovery of the muon (Anderson and Neddermeyer)

a copy of the electron but with 200 times the mass ($m_{\mu} = 200 \times m_e$)

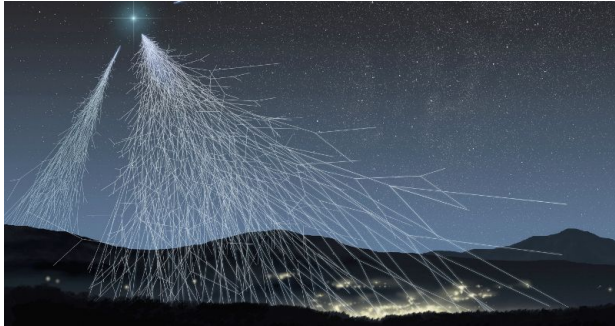
-and- the positron (Anderson) in cosmic rays

1947: Charged pion discovery and Kaon discovery, 1949: neutral pion discovery

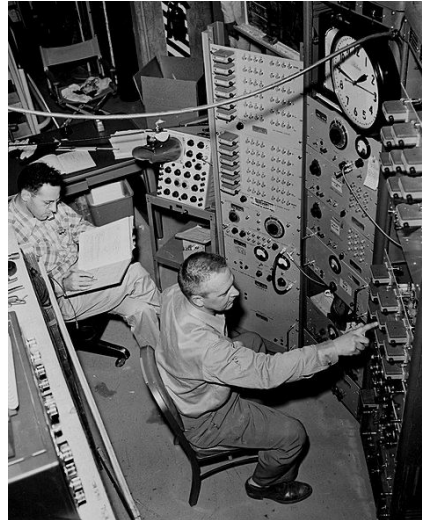
1955: Discovery of the antiproton, at the Bevatron

1956: Discovery of the neutrino (Cowan, Reines, et al), using nuclear reactor

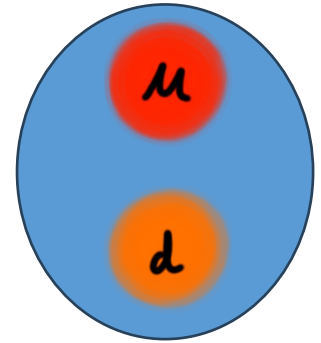
1960s: Quark Model and Deep Inelastic Scattering Experiments (SLAC)



**A first surprise -
Muons “Who ordered
that?”**



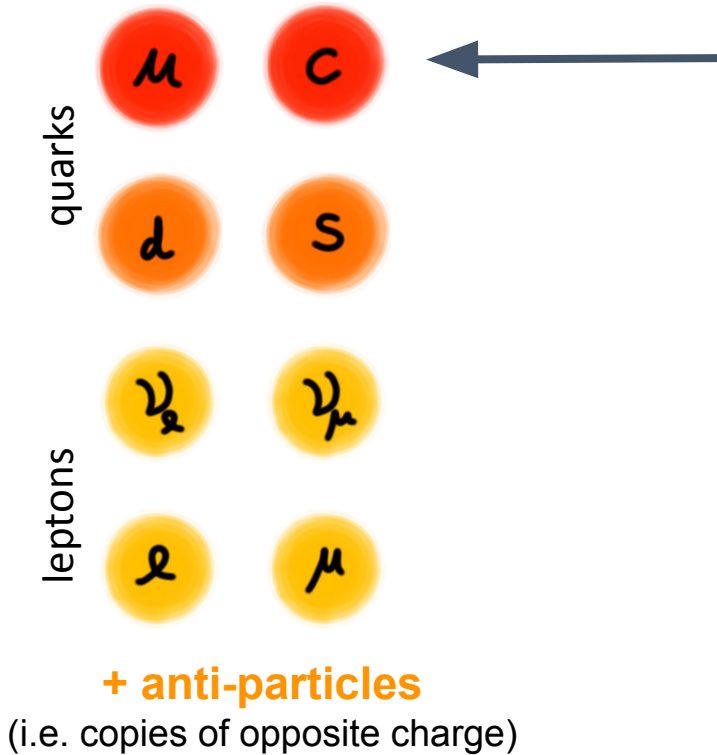
Proton +
neutron



leptons



November “Charm” Revolution: Two families of fermions?















Symposium on the 50th Anniversary of the November Revolution



50 J/ψ

Fast forward....

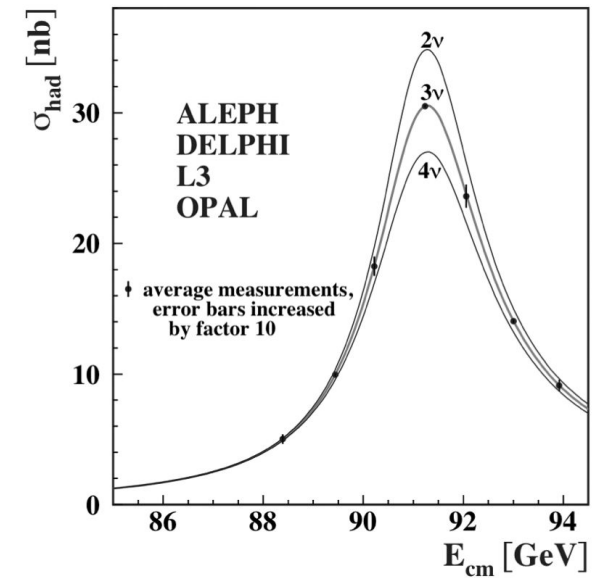
Three complete families of fermions

			Electrical Charge	Spin
			+2/3	1/2
quarks				
				
leptons				
				
				-1
			0	1/2

+ anti-particles

(i.e. copies of opposite charge)

Intrinsic Angular Momentum



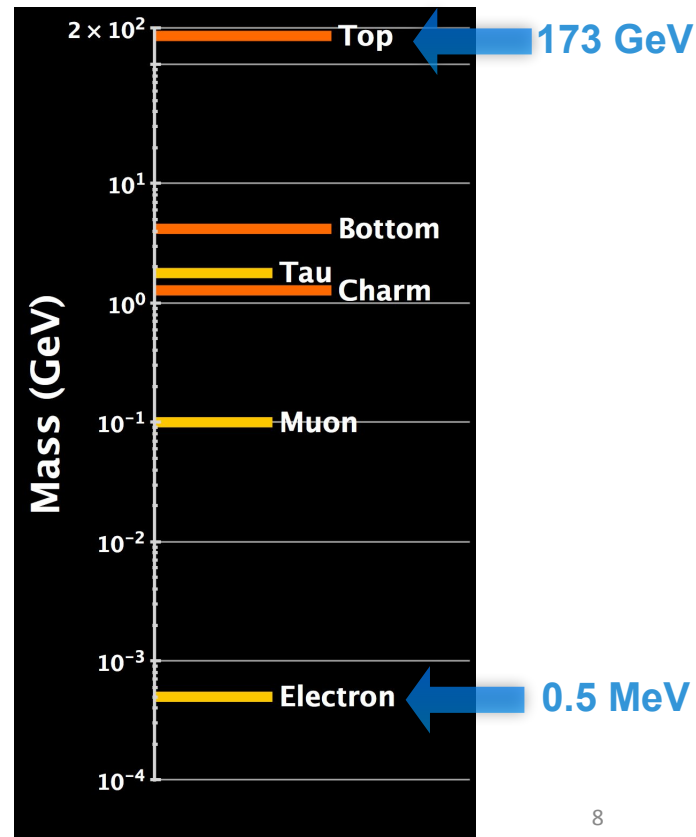
Fundamental Particles of Matter

Three complete families of fermions

				Electrical Charge	Spin
quarks	u	c	t	+2/3	1/2
	d	s	b		
leptons	ν_u	ν_μ	ν_e	0	1/2
	e	μ	τ		

+ anti-particles
(i.e. copies of opposite charge)

Intrinsic Angular Momentum

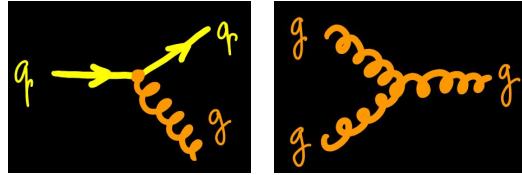


Interactions occur through exchange of bosons



0

1

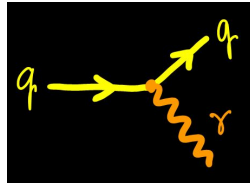


Strong force
(gluons)



0

1

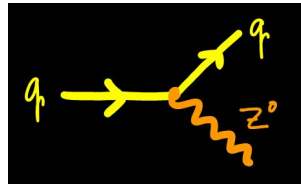


Electromagnetic force
(photon)



0

1

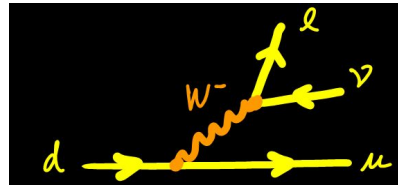


Weak force
(W and Z bosons)



+1 or -1

1



Beta decay:
 $n \rightarrow p e^- \bar{\nu}_e$

The weak nuclear force has a very small range ($10^{-18} m$) so its force carriers (W and Z boson) have to be massive

It is impossible to build a consistent theory for massive bosons like the W and Z without an additional particle.

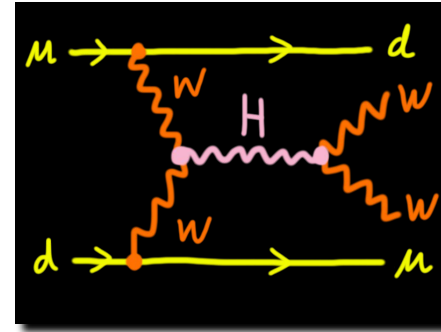
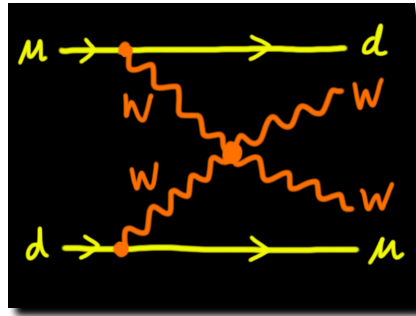
Charge

Spin

The Higgs Boson

Solution proposed by several theorists in 1964

Higgs, Brout, Englert, Hagen, Guralnick and Kibble



A new fundamental particle with spin 0
(the only one in the Standard Model)
could make the theory consistent again!

Higgs



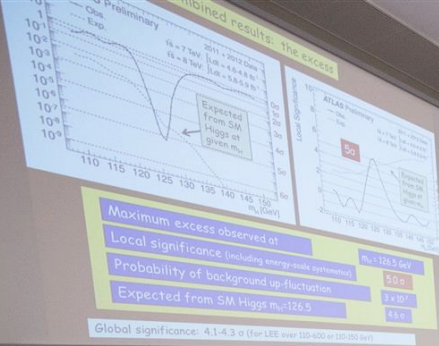
Electrical
Charge
0

Spin
0

The LHC experimental facility was built to test this theory

Higgs Particle Discovery Announcement July 4th, 2012

ICHEP,
Melbourne



CERN, Geneva

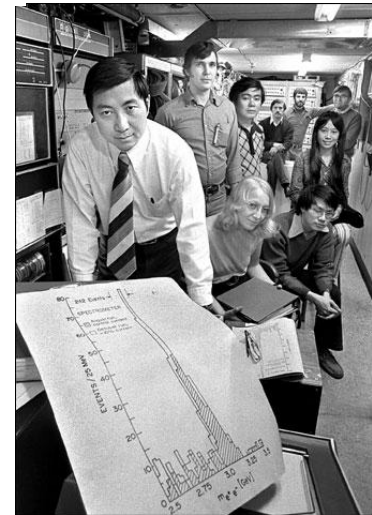
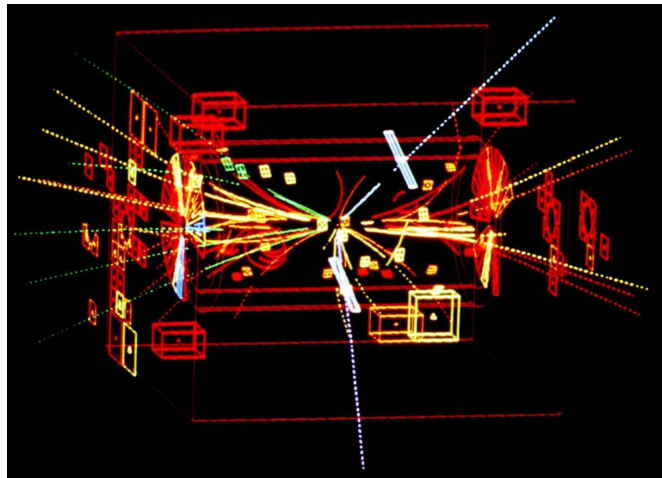
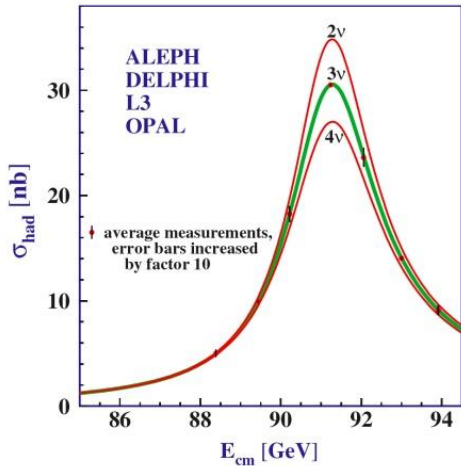
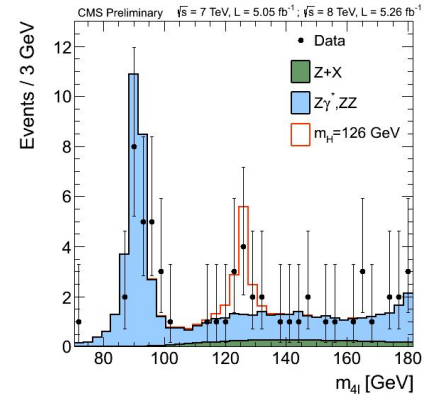
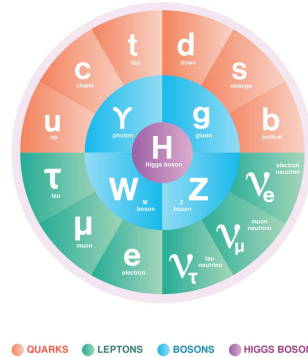
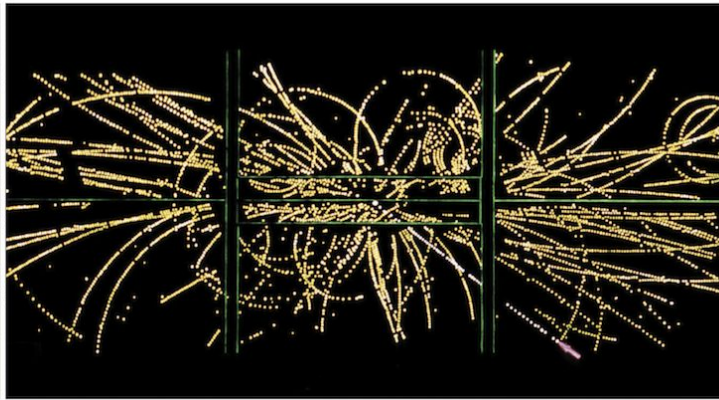
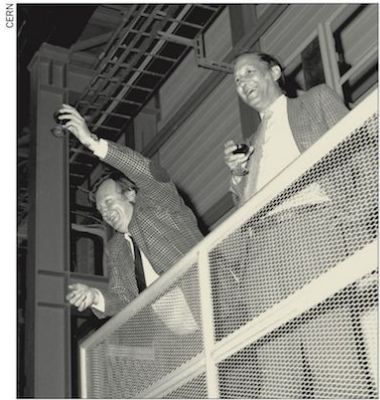


Something that looks like the Standard Model Higgs boson was discovered in 2012, Mass ~ 125 GeV



Nobel prize in physics in 2013

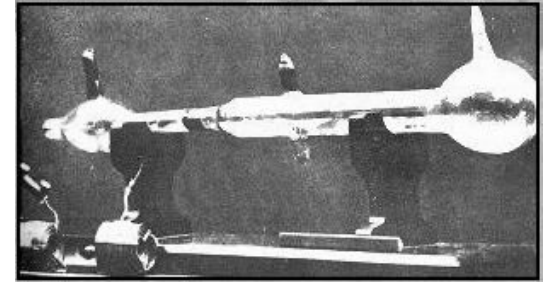
Experimental Development of the Standard Model



**How did we get here?
(As experimentalists)**

Tools \longleftrightarrow Discoveries

1895 - Roentgen discovers x-rays using cathode ray tubes



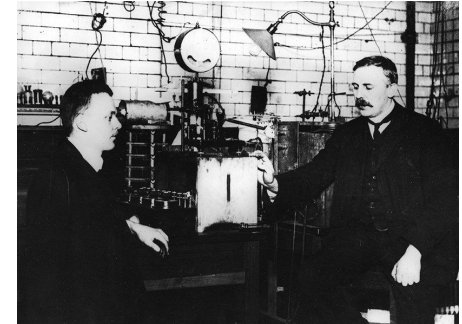
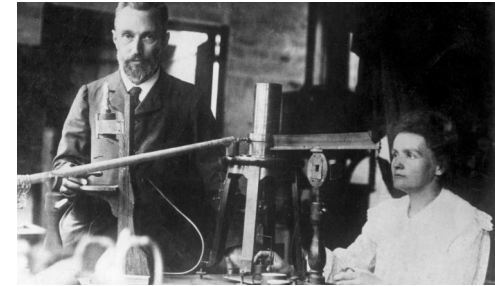
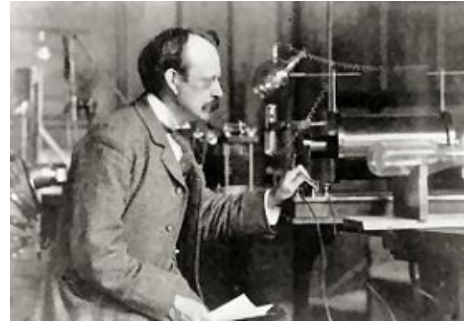
1896 - Becquerel accidentally discovers radioactivity in uranium, trying to explain x-rays



1898+ - Marie and Pierre Curie discover and explore radioactivity in other elements (polonium, thorium, radium)



1911 - Rutherford, Geiger, Marsden use radioactivity to explore atomic structure and discover the nucleus



Side note: Tools \longleftrightarrow Discoveries

Connections



James Burke, the creator and host of *Connections*, explains the [Haber-Bosch Process](#)

[Connections \(BBC TV Series from 1979\)](#) explores this interchange over a wide range of technologies and discoveries. Perhaps a bit of a European/Western bias, but an interesting exploration of how ideas evolve. (Search in youtube, episodes are available there)

[I, Pencil - Leonard Read](#)

Even simple objects have a complicated technology history

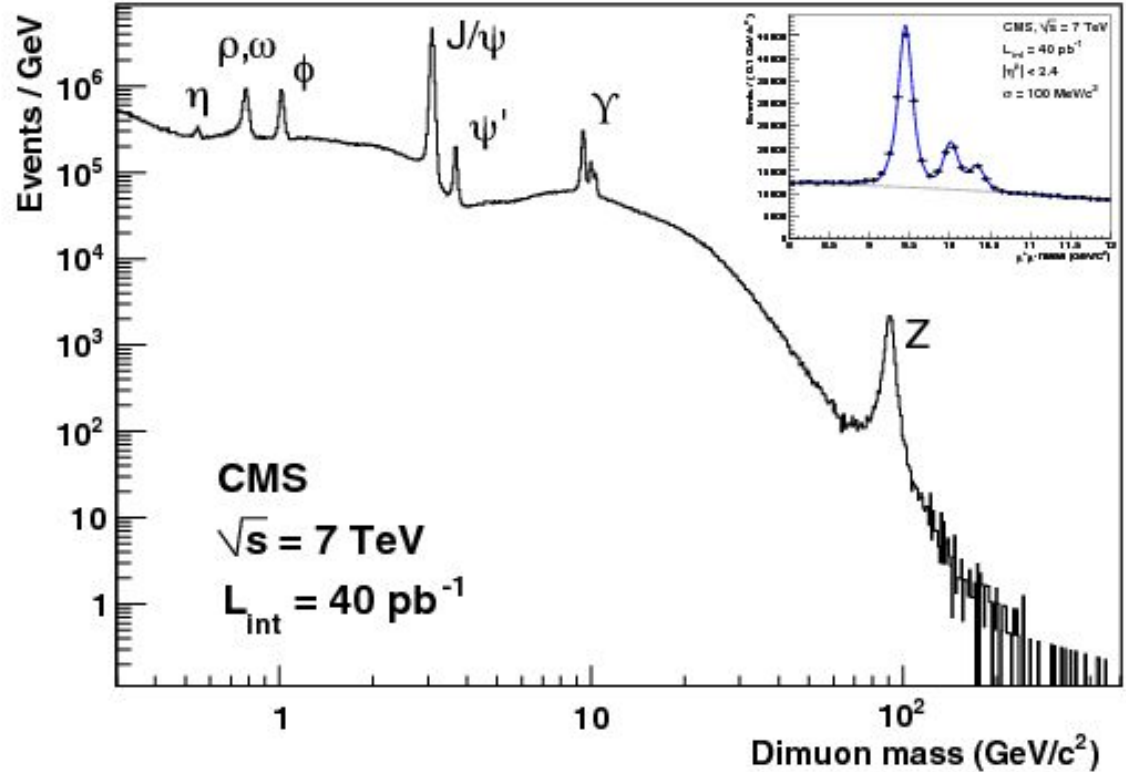


Evolution in particle physics

Discovery of a particle leads to Nobel prize and full exploration of the properties of the particle.

On the subsequent experiments the particle is used for calibration or as a tool itself (e.g. in a beam).

On later experiments the particle becomes a background.



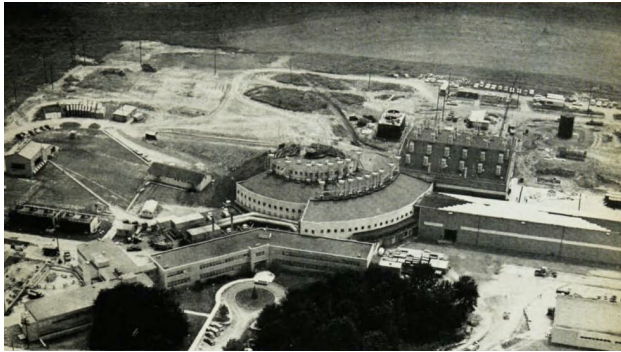
Big Science and Accelerators - larger and larger facilities



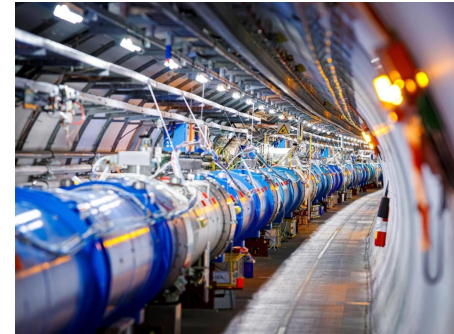
E.O. Lawrence and the cyclotron
at U.C. Berkeley



The birth of the “National Accelerator
Laboratory” in the US (now Fermilab)



The Princeton-Pennsylvania Accelerator,
Milton White 1964 Physics Today 17(8): 27



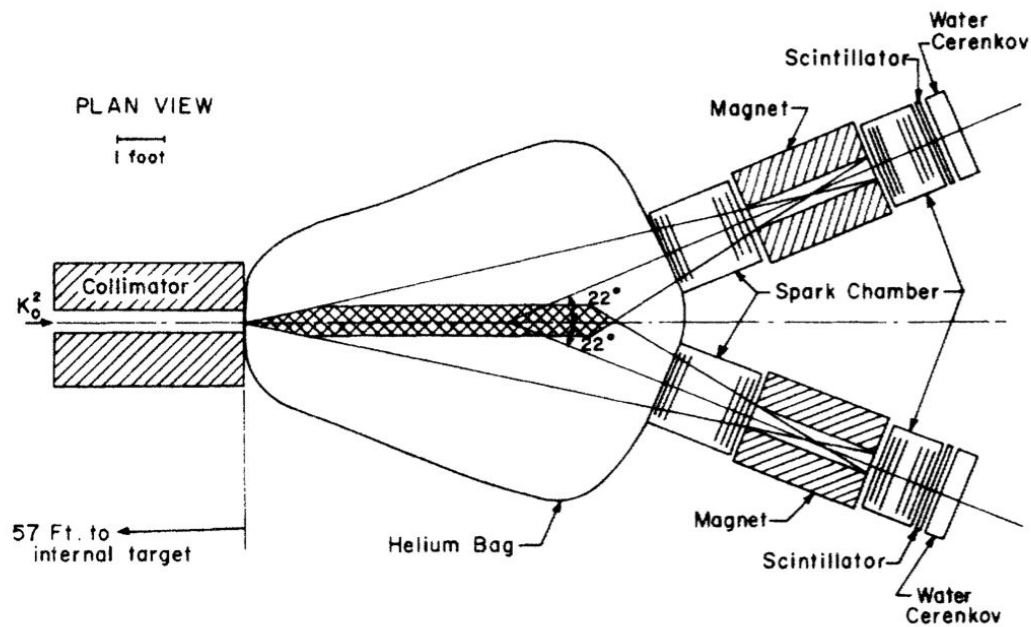
The Large Hadron Collider and
CERN first as a European laboratory
and then as a “world laboratory”

EVIDENCE FOR THE 2π DECAY OF THE K_2^0 MESON*†

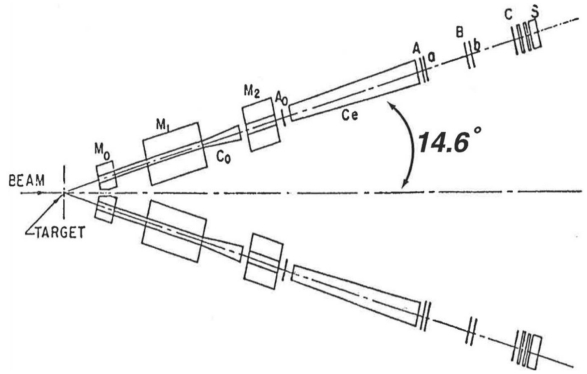
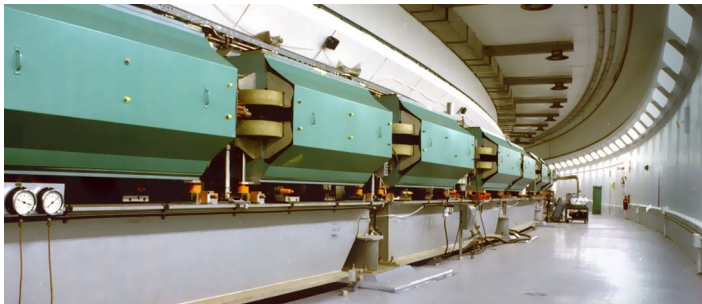
J. H. Christenson, J. W. Cronin,† V. L. Fitch,† and R. Turlay§

Princeton University, Princeton, New Jersey

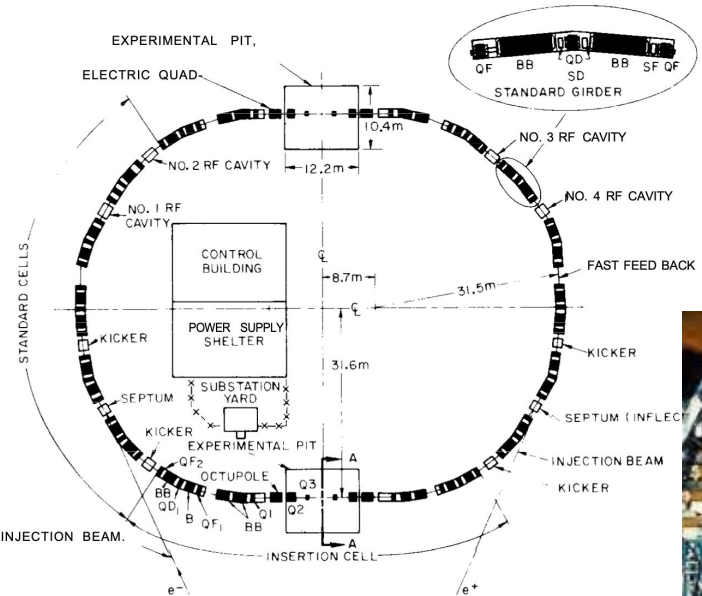
(Received 10 July 1964)



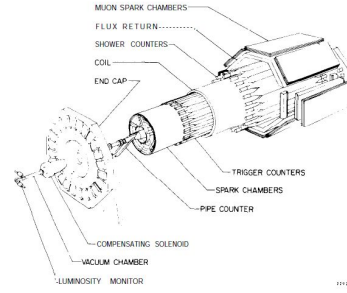
AGS at BNL delivering protons on a fixed target



Spear e+e- collider at SLAC and Mark 1 detector

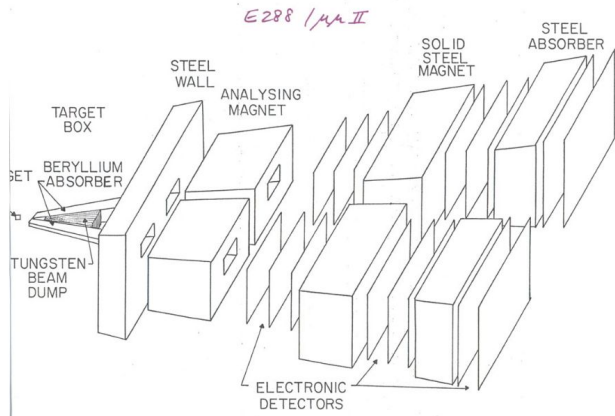


1. Schematic of the SPEAR storage ring.

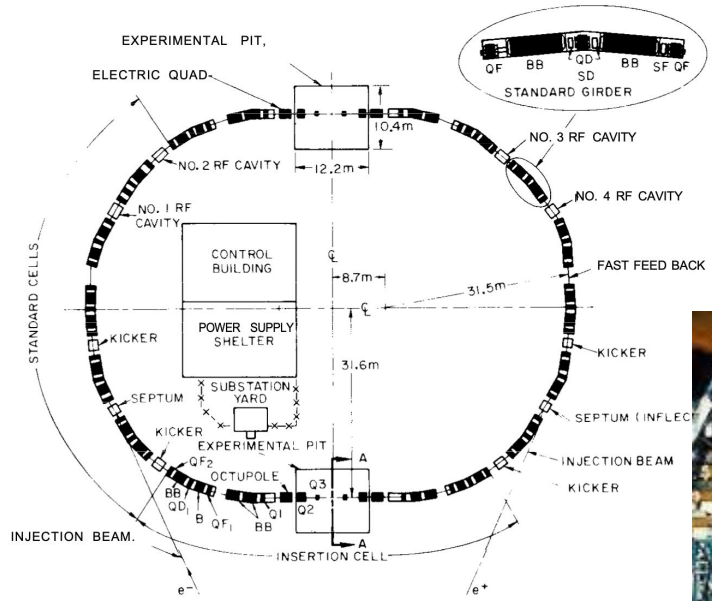


J and Psi discoveries in 1974

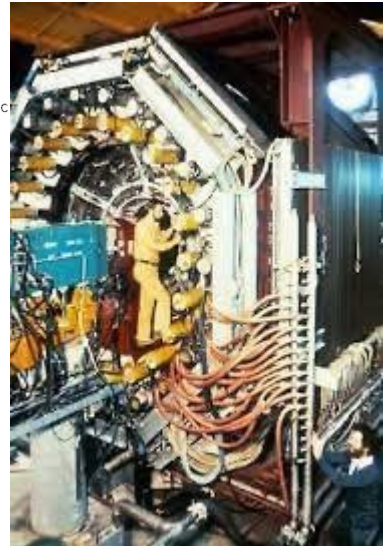
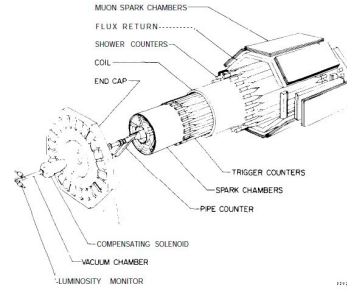
Protons at FNAL on a Uranium fixed target



Spear e+e- collider at SLAC and Mark 1 detector



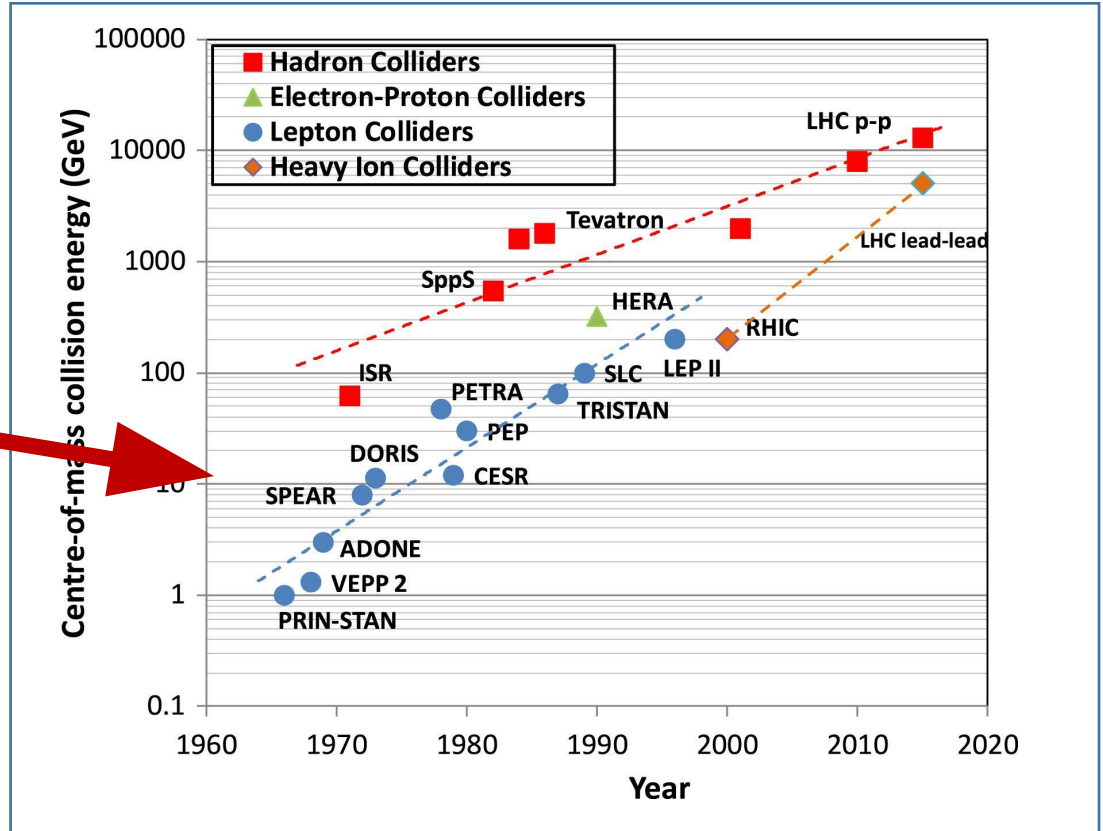
1. Schematic of the SPEAR storage ring.



Bottom and Tau discoveries in 1977 and 1975

High Energy Physics is a facilities driven science

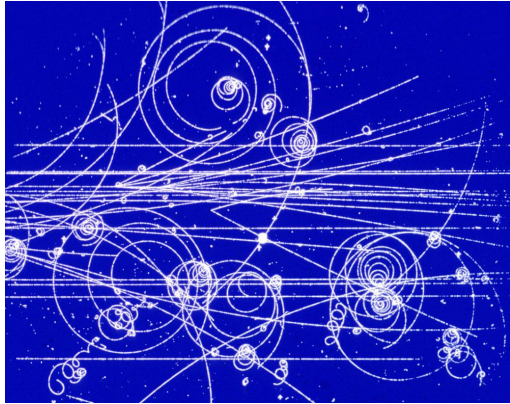
Symposium on the 50th Anniversary
of the November Revolution



Last month:

<https://indico.slac.stanford.edu/event/9040/>

Instrumentation - Detectors (+ Electronics)

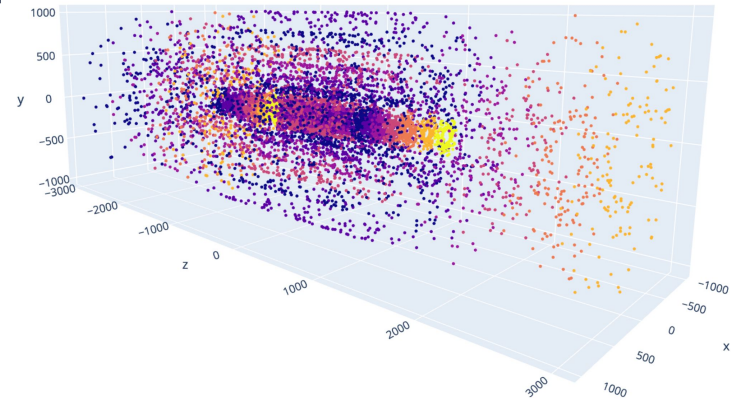
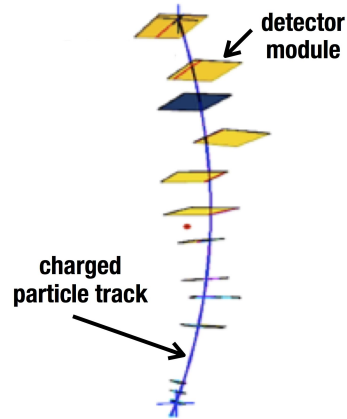
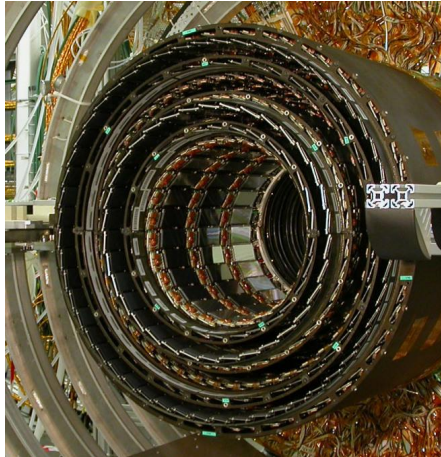


Bubble chamber
photography

By-hand
“scanning” of
the photos



Modern
detectors with
(digital)
electronic
readout



"New directions in science are launched by new tools much more often than by new concepts. The effect of a concept-driven revolution is to explain old things in new ways. The effect of a tool-driven revolution is to discover new things that have to be explained." - *Freeman Dyson*

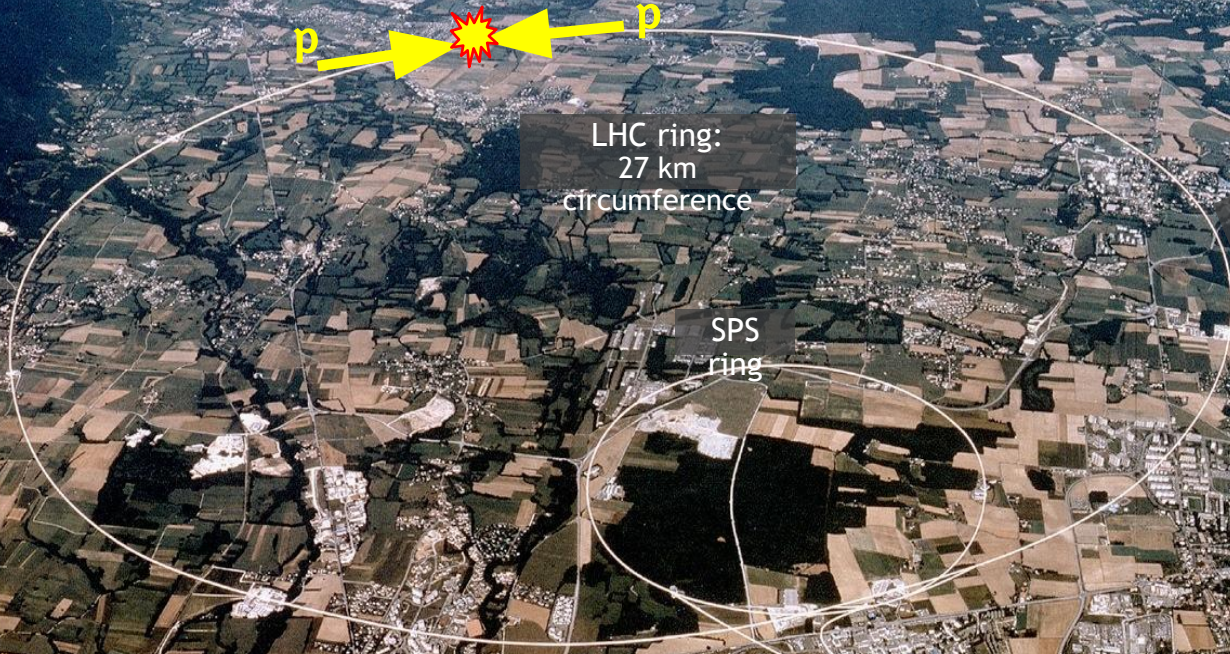


Physics Nobel Prizes → Tools open doors to new research avenues

- **2024** (Hopfield, Hinton) - foundational discoveries and inventions that enable machine learning with artificial neural networks
- **2023** (Agostini, Krausz, L'Huillier) - development of experimental methods that generate attosecond pulses of light for the study of electron dynamics in matter
- **2018** (Ashkin) - invention of optical tweezers and their application to biological systems
- **2018** (Mourou, Strickland) - invention of a method of generating high-intensity ultra-short optical pulses
- **2014** (Isamu, Hiroshi, Nakamura) - invention of efficient blue light-emitting diodes, which has enabled bright and energy-saving white light sources
- **2012** (Haroche, Winelar) - development of methods that enable measuring and manipulation of individual quantum systems
- **2009** (Boyle, Smith) - invention of the CCD sensor, an imaging semiconductor circuit
- **2009** (Kao) - achievements concerning the transmission of light in fibres for optical communication
- **2005** (Glauber) - contributions to the field of optics
- **2005** (Hall, Hänsch) - contributions to the development of laser spectroscopy
- **2000** (Kilby) - development of the integrated circuit (microchip)
- **2000** (Alferov, Kroemer) - development of fast semiconductors for use in microelectronics
- **1997** (Chu, Cohen-Tannoudji, Phillips) - process of trapping atoms with laser cooling
- **1992** (Charpak) - invention of a detector that traces subatomic particles
- **1989** (Dehmelt, Paul) - development of methods to isolate atoms and subatomic particles for study
- **1989** (Ramsey) - development of the atomic clock

Large Hadron Collider
proton-proton collisions
Center of mass energy: 7-8-13-13.6-14
TeV

Lake
Geneva



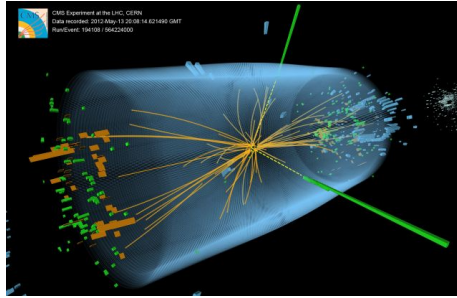
LHC ring:
27 km
circumference

SPS
ring

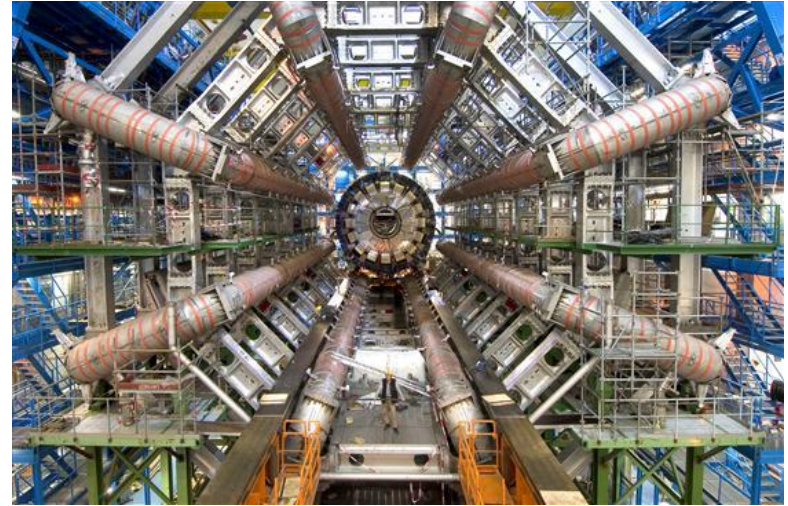
Airport

CERN

Large Hadron Collider Experiments Are Massive Data Generators



Atlas



CMS DETECTOR

Total weight : 14,000 tonnes
 Overall diameter : 15.0 m
 Overall length : 28.7 m
 Magnetic field : 3.8 T

STEEL RETURN YOKE
 12,500 tonnes

SILICON TRACKERS
 Pixel (100x150 μm) -16M² -66M channels
 Microstrips (80x180 μm) -200m² -9.6M channels

SUPERCONDUCTING SOLENOID
 Niobium titanium coil carrying -18,000A

MUON CHAMBERS
 Barrel: 250 Drift Tube, 480 Resistive Plate Chambers
 Endcaps: 468 Cathode Strip, 432 Resistive Plate Chambers

PRESHOWER
 Silicon strips -16m² -137,000 channels

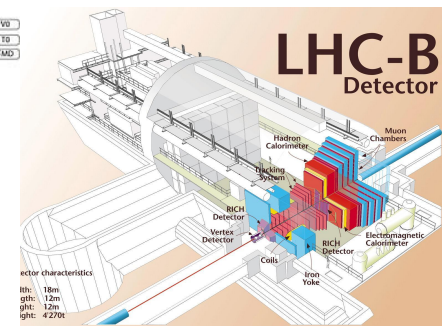
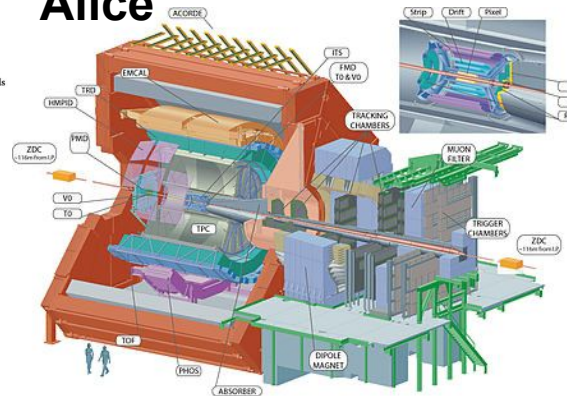
FORWARD CALORIMETER
 Steel + Quartz fibres -2,000 Channels

CMS

CRYSTAL ELECTROMAGNETIC CALORIMETER (ECAL)
 ~76,000 scintillating PbWO₄ crystals

HADRON CALORIMETER (HCAL)
 Brass + Plastic scintillator -7,000 channels

Alice



ector characteristics
 lth: 18m
 gth: 12m
 dth: 12m
 ght: 4-270t

CMS DETECTOR

Total weight : 14,000 tonnes
Overall diameter : 15.0 m
Overall length : 28.7 m
Magnetic field : 3.8 T

STEEL RETURN YOKE
12,500 tonnes

SILICON TRACKERS
Pixel (100x150 μm) ~16m² ~66M channels
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SUPERCONDUCTING SOLENOID
Niobium titanium coil carrying ~18,000A

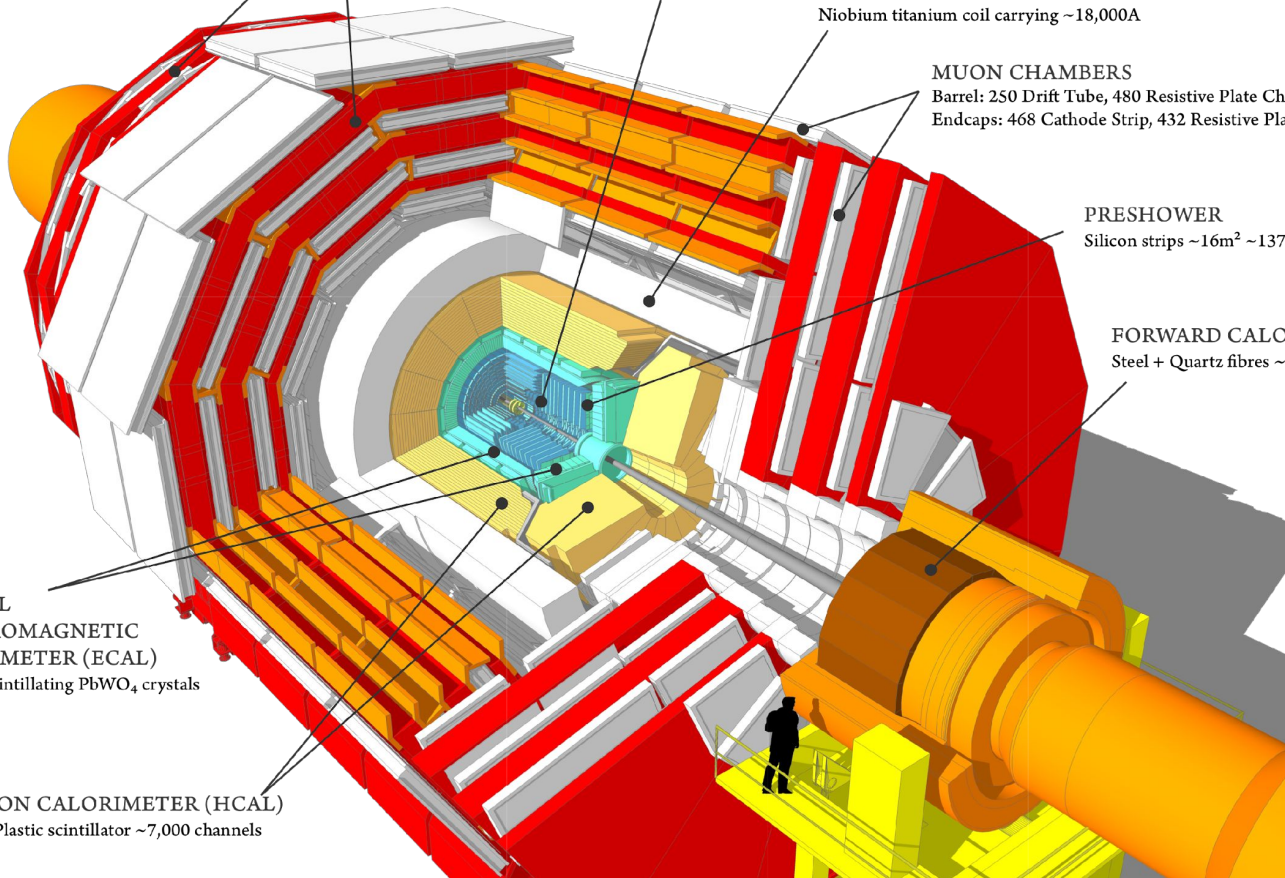
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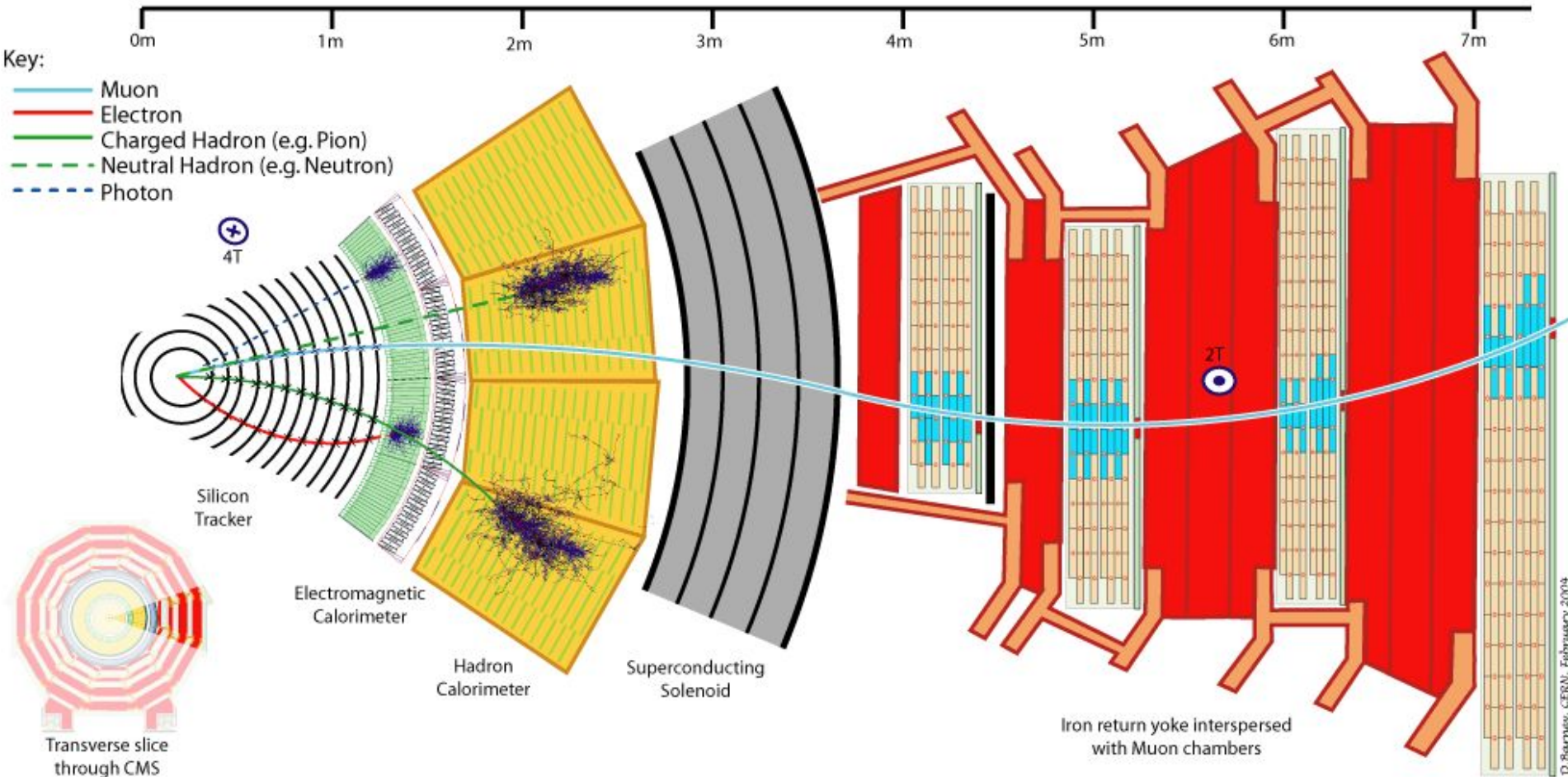
PRESHOWER
Silicon strips ~16m² ~137,000 channels

FORWARD CALORIMETER
Steel + Quartz fibres ~2,000 Channels

CRYSTAL
ELECTROMAGNETIC
CALORIMETER (ECAL)
~76,000 scintillating PbWO₄ crystals

HADRON CALORIMETER (HCAL)
Brass + Plastic scintillator ~7,000 channels





Experimental Observation of a Heavy Particle J^\dagger

J. J. Aubert, U. Becker, P. J. Biggs, J. Burger, M. Chen, G. Everhart, P. Goldhagen,
J. Leong, T. McCorrison, T. G. Rhoades, M. Rohde, Samuel C. C. Ting, and Sau Lan Wu
*Laboratory for Nuclear Science and Department of Physics, Massachusetts Institute of Technology,
Cambridge, Massachusetts 02139*

and

Y. Y. Lee

Brookhaven National Laboratory, Upton, New York 11973

(Received 12 November 1974)

We report the observation of a heavy particle J , with mass $m = 3.1$ GeV and width approximately zero. The observation was made from the reaction $p + \text{Be} \rightarrow e^+ + e^- + x$ by measuring the e^+e^- mass spectrum with a precise pair spectrometer at the Brookhaven National Laboratory's 30-GeV alternating-gradient synchrotron.

Discovery of a Narrow Resonance in $e^+ e^-$ Annihilation*

J.-E. Augustin,† A. M. Boyarski, M. Breidenbach, F. Bulos, J. T. Dakin, G. J. Feldman,
G. E. Fischer, D. Fryberger, G. Hanson, B. Jean-Marie,† R. R. Larsen, V. Lüth,
H. L. Lynch, D. Lyon, C. C. Morehouse, J. M. Paterson, M. L. Perl,
B. Richter, P. Rapidis, R. F. Schwitters, W. M. Tanenbaum,
and F. Vannucci‡

Stanford Linear Accelerator Center, Stanford University, Stanford, California 94305

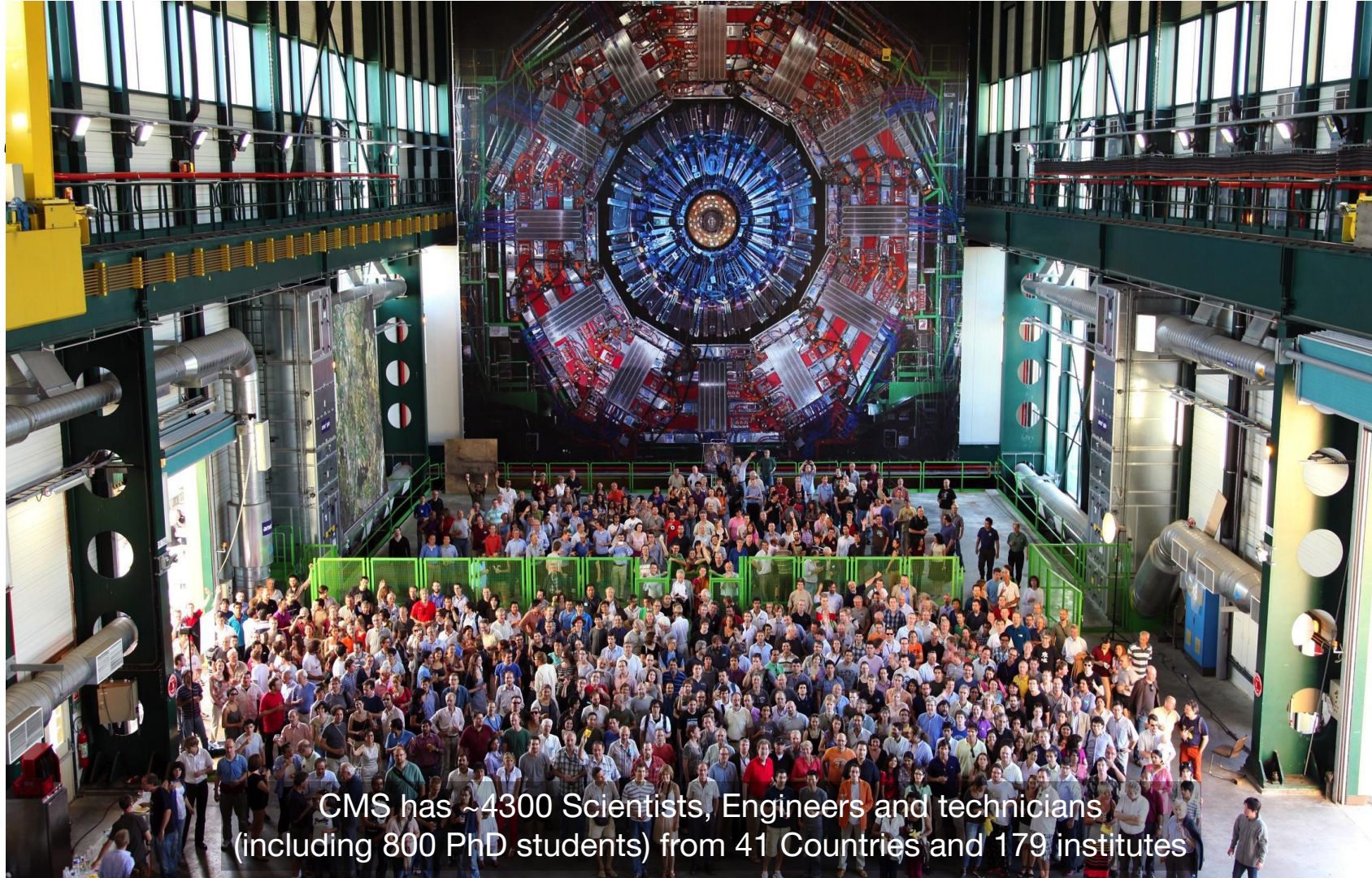
and

G. S. Abrams, D. Briggs, W. Chinowsky, C. E. Friedberg, G. Goldhaber, R. J. Hollebeek,
J. A. Kadyk, B. Lulu, F. Pierre,§ G. H. Trilling, J. S. Whitaker,
J. Wiss, and J. E. Zipse

Lawrence Berkeley Laboratory and Department of Physics, University of California, Berkeley, California 94720

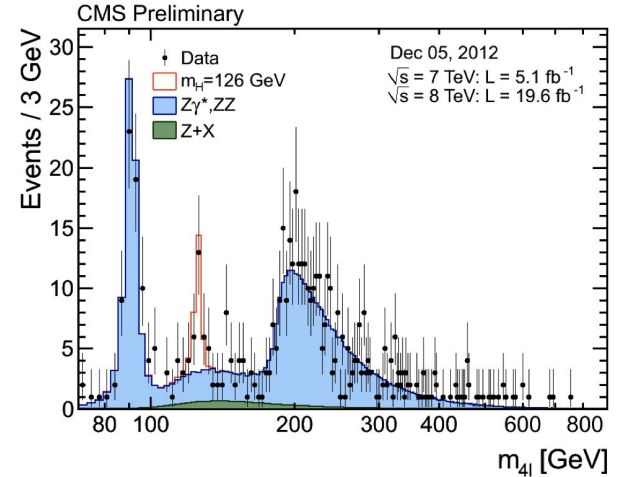
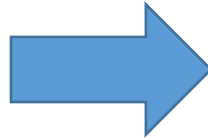
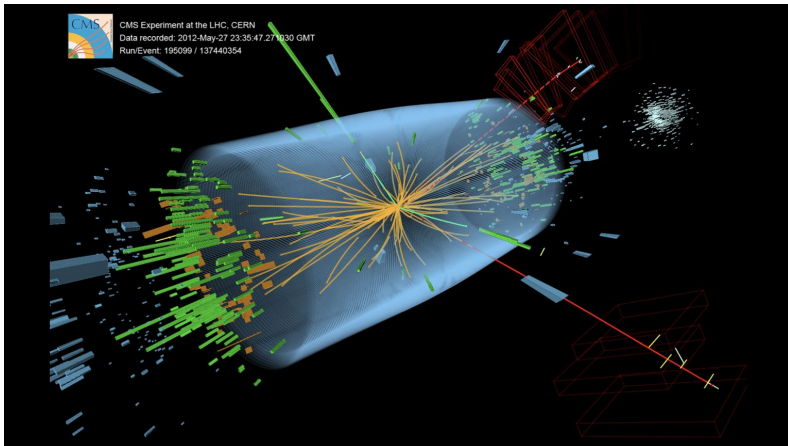
(Received 13 November 1974)

We have observed a very sharp peak in the cross section for $e^+e^- \rightarrow \text{hadrons}$, e^+e^- , and possibly $\mu^+\mu^-$ at a center-of-mass energy of 3.105 ± 0.003 GeV. The upper limit to the full width at half-maximum is 1.3 MeV.



CMS has ~4300 Scientists, Engineers and technicians
(including 800 PhD students) from 41 Countries and 179 institutes

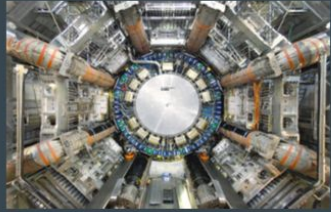
Just as with facilities, HEP scientists rely on large computing infrastructures to do their science



Large scale software
and computing
infrastructures

Our software takes data from collisions to physics results

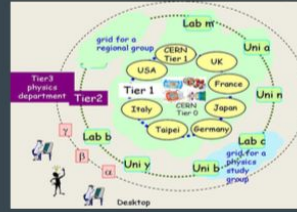
Detector



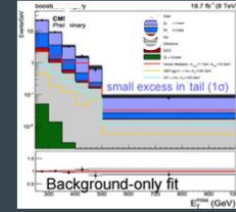
Trigger



Reconstruction



Analysis



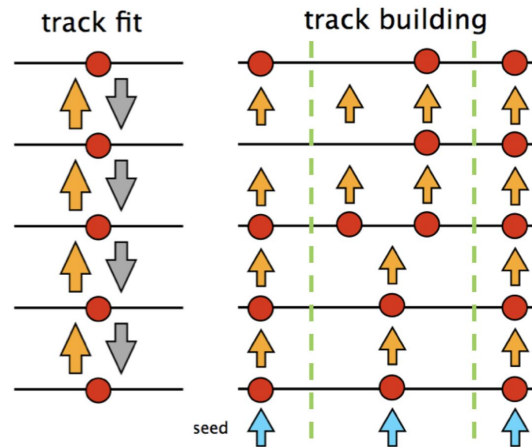
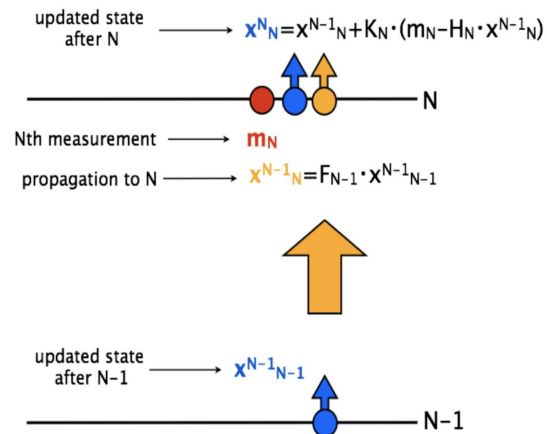
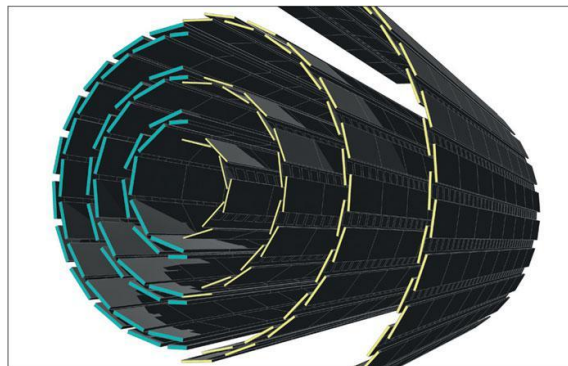
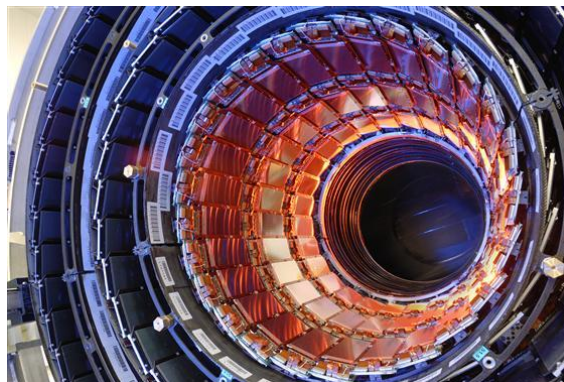
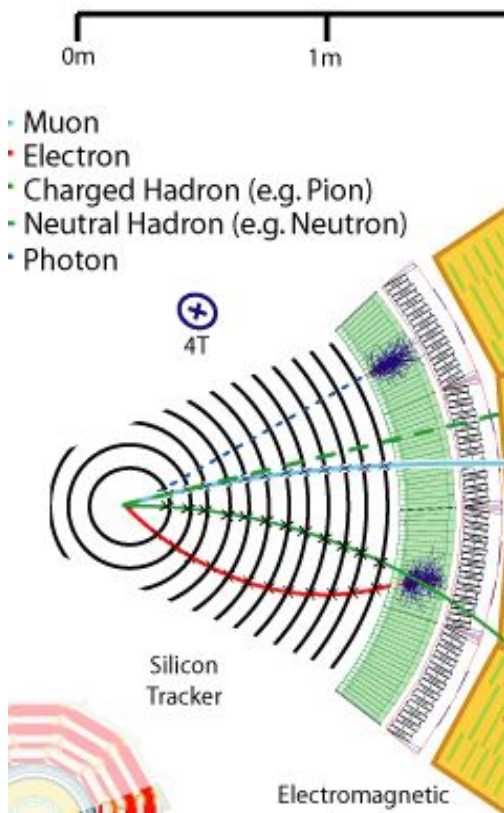
Paper



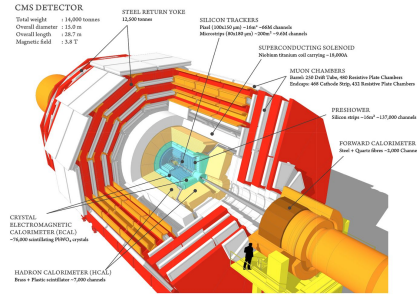
- Detector data collected at the rate of 60 TB/second must be reduced to ~ 5 GB/second in real time
- Pattern recognition algorithms find particle trajectories from the detector data (“reconstruction”)
- In parallel, Monte Carlo methods are used to create simulations of how different physics processes appear in our detector
- Collisions are categorized by examining reconstructed particles for signs of specific physics processes (eg, Higgs decays) (“Analysis”)

Reconstruction applications process

RAW data into “physics objects” for analysis



Tracking particles through CMS

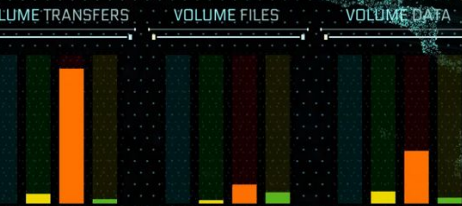


	LHC events per year ($/10^9$)	Tracks per year ($/10^{15}$)	Time for processing (Latency)
L1 Trigger (FPGA-based)	240000	1000	~ 10 us
“High Level” Trigger	6000	40	Seconds
Offline Processing	60	0.5	Days – can be redone if needed
Analysis	60	0.5	Years -- redone many times

LAST DATA UPDATE

9.7 MB Downloaded Wednesday, 11 September 2019 14:05:12
Last transfer was on : Monday, 29 July 2019 08:00:00

LOADING
100 %



The Worldwide LHC Computing Grid (WLCG)

About 1 million processing cores

170 data centres in 42 countries

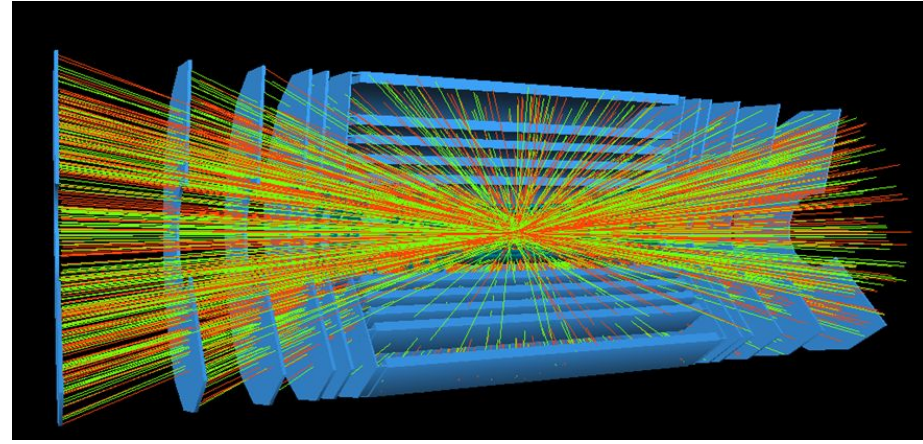
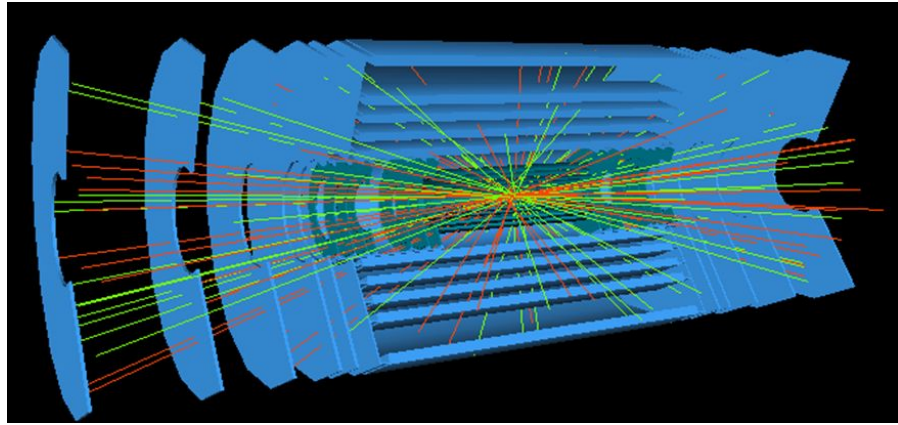
> 1000 Petabytes of CERN data stored worldwide

DATA TRANSFER CONSOLE

425847625 From BFlorida-HEP To UMaineHEP Monday, 29 July 2019 04:04:50
 0 From UCSD072 To INFN-T1 Monday, 29 July 2019 04:05:40
 0 From Venezuela To Indonesia Monday, 29 July 2019 04:06:06
 154672273 From NS3-CC To INFN-BARI Monday, 29 July 2019 04:07:01
 4930015 From FI-HP_T2 To CERN-PRDQ Monday, 29 July 2019 04:08:20
 763851025 From INFN-T1 To GLWV Monday, 29 July 2019 04:08:36
 132292923 05 From INDIA-CMS-TIFR To pc Monday, 29 July 2019 04:08:43
 102078788687 From CERN-PRDQ To BR-UNIC3 Monday, 29 July 2019 04:09:29
 1074048 From MIT_CMS_18 FI-HP_T2 Monday, 29 July 2019 04:09:54
 502059550 From INFN-T1 To CT-CMS_T2 Monday, 29 July 2019 04:10:11
 264320 From CERN-PRDQ To GSI Monday, 29 July 2019 04:10:04
 0 From UK-SOUTHBRID-RALRP To GLWV Monday, 29 July 2019 04:12:05
 166189772 From INFN-T1 To JINR-T1 Monday, 29 July 2019 04:12:10
 320778073 3333 From CERN-LIGO To INFN-AN2 Monday, 29 July 2019 04:12:10
 2905786385 From SPRACE To JINR-T1 Monday, 29 July 2019 04:12:20
 0 From INFN-AN2 To CERN-LEGS Monday, 29 July 2019 04:12:25
 224432295 895956 From IN3P-CC To prague02 Monday, 29 July 2019 04:13:03
 4949398 286856687 From UK-SOUTHBRID-DX-HEP To CERN-PRDQ Monday, 29 July 2019 04:13:11
 0 From BR-UNIC3 To CT-CMS_T2 Monday, 29 July 2019 04:14:30
 0 From Venezuela To USC07V Monday, 29 July 2019 04:14:57
 33855768 375204 From RU-Prskina-HEP To CERN-PRDQ Monday, 29 July 2019 04:15:10
 18464974 From CERN-LIGO To RU-Proton-HEP Monday, 29 July 2019 04:15:45

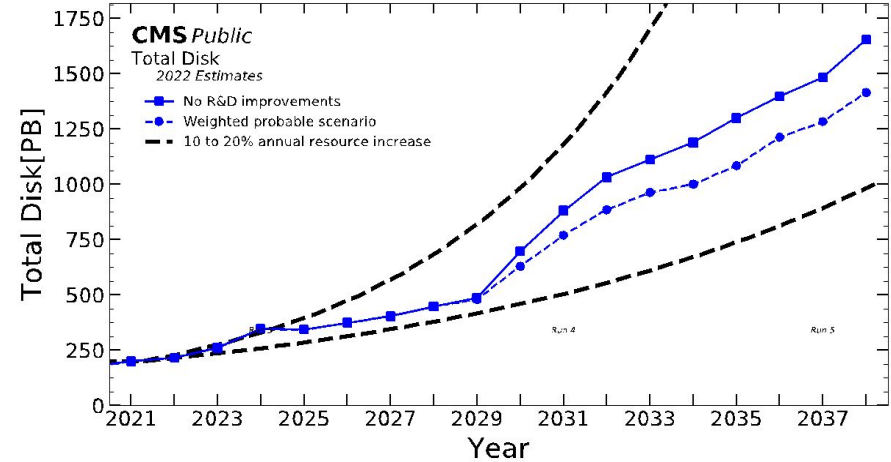
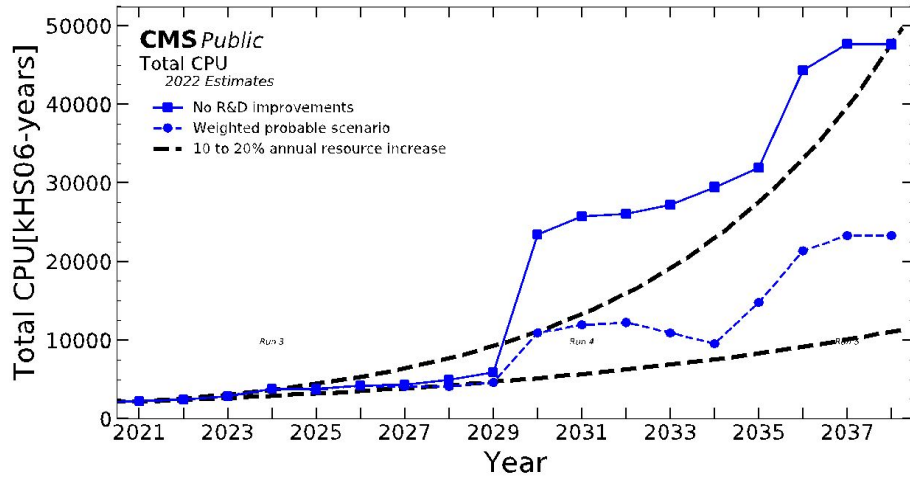
What are the big challenges?

Challenge of next-generation, higher-luminosity or higher-intensity experiments



- HL-LHC expects to deliver 200 simultaneous interactions per bunch crossing. 5x more than today.
- More capable detectors are being built to facilitate finding "needles" in this much bigger "haystack"
- Similarly, the analyst community must develop new and more capable approaches to prepare for much higher event rates, higher event complexity, and more detailed detector information.


Future experiments pose even larger computing challenges



- A naive extrapolation from today's computing model and techniques, even after assuming Moore's Law increases in capabilities, is insufficient to meet the expected resource needs for HL-LHC
 - Technology evolution for processors and storage is an additional challenge
 - New ideas and methods are needed, and software is the key ingredient

Human time is critical: Optimizing analysis is about more than just about pure resources

	<u>LHC (Run 1&2)</u>	<u>HL-LHC (Run 4+)</u>
Analysis Dataset size	10 TB	1,000 TB
Target Scan Turnaround time	Weeks	Hours
Analysis team size (physicists)	5-10	< 5
Primary analysis resource	Laptop	Analysis Facility

Run 3 

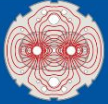
LHC analysis:

- Search & Precision Physics
- Simple ML techniques (BDT)
- Reproducibility in its infancy

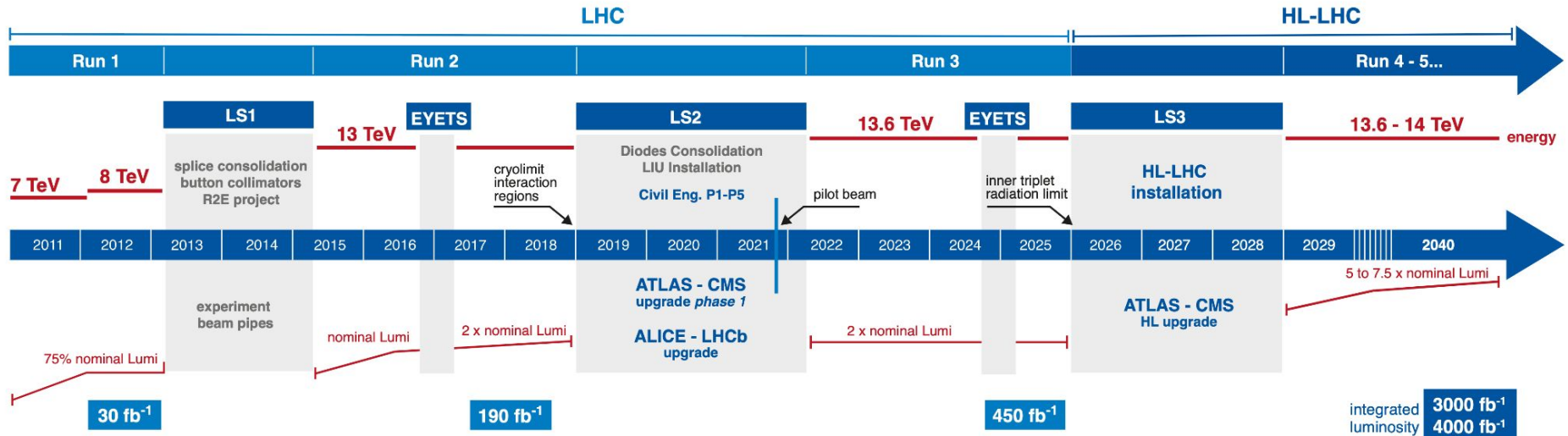
HL-LHC analysis:

- Very High Precision Physics
- Modern ML (Deep Learning)
- Reproducible and Open Data

Experimental timescales span decades

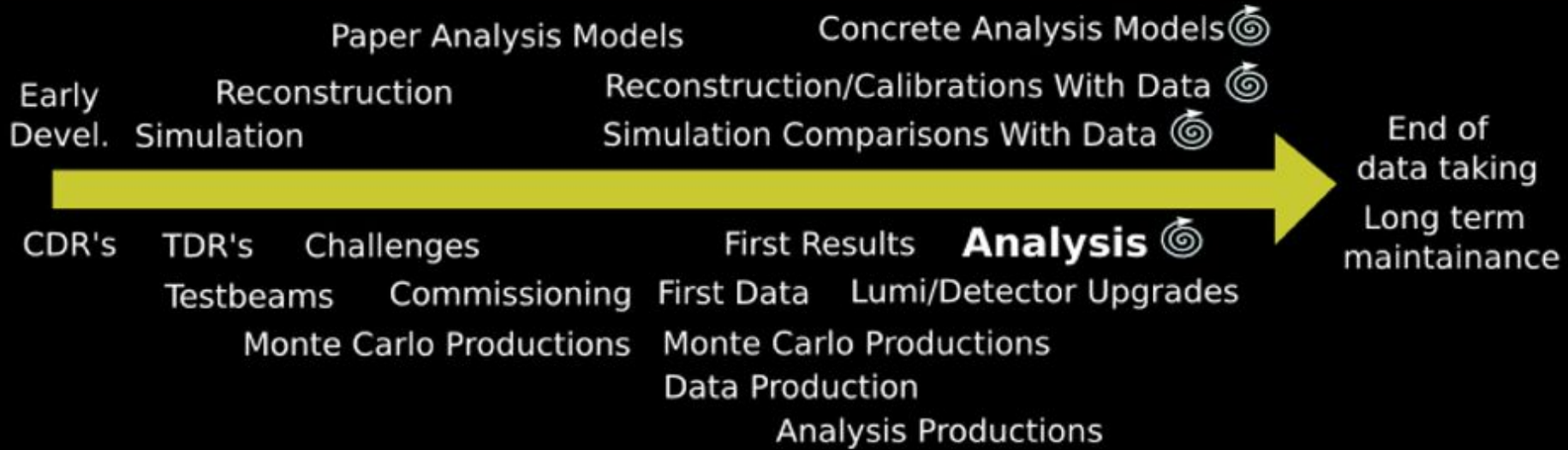


LHC / HL-LHC Plan



Experiment designs start far before data taking. CMS was formed in 1992 (more than 30 years ago!), expects to run through 2040 and do data analysis for years after that

HEP software lifecycle



Technical issues: compilers, operating systems, good/bad/new technology choices, experts coming and going, etc.

Cyberinfrastructure?



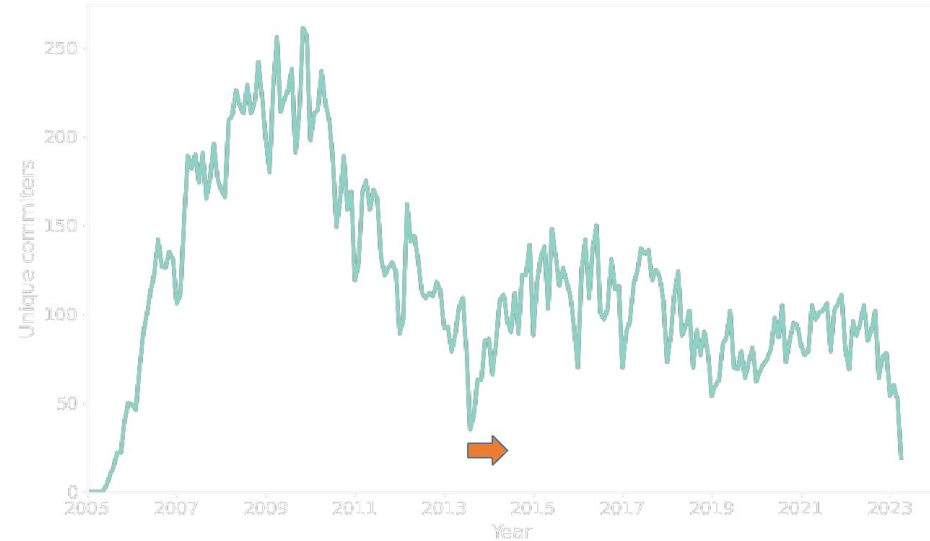
Conceptual motivations behind the HEP Software Foundation

Computer hardware is a consumable. Software is the actual "cyberinfrastructure" in the long run.

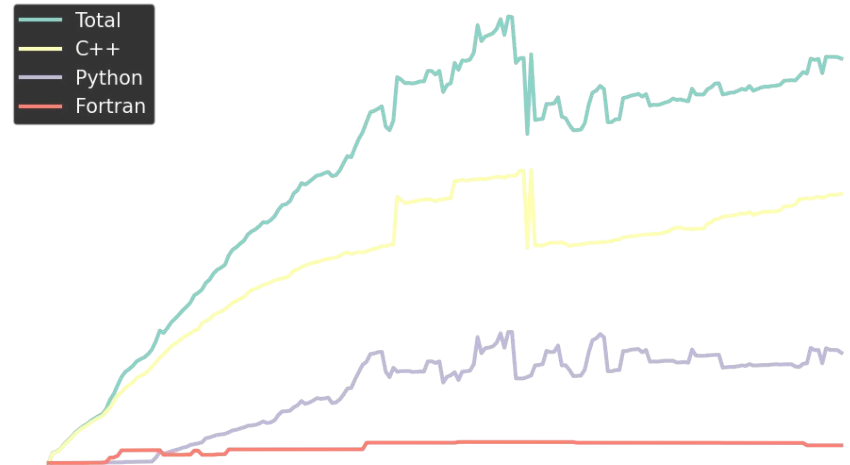
More importantly software is also an *intellectual product* of our research, not just a tool.



Large scale collaborative software development in HEP



Many developers, typically a handful of true experts



Millions of lines of code for CMS - And this excludes most data analysis code, event generators, detector simulation codes, and others...

Community Structures Reflect Our Community Evolution/Needs



The **Worldwide LHC Computing Grid (WLCG)** project is a global collaboration of around 170 computing centres in more than 40 countries, linking up national and international grid infrastructures. The mission of the WLCG project is to provide global computing resources ... **[2000's and 2010's era]**



The **HEP Software Foundation** facilitates cooperation and common efforts in High Energy Physics software and computing internationally. **[2010's and 2020's era]**

A wide banner for the WLCG/HSF Workshop 2024. The background is a blurred image of a city street with buildings and a church spire. On the left, there are logos for HSF and WLCG. The text 'WLCG/HSF Workshop 2024' is prominently displayed in the center. Below the banner, there is a dark teal bar containing the dates '13-17 May 2024', the location 'DESY', and the time zone 'Europe/Zurich timezone'. On the right side of this bar, there is a search input field with the placeholder text 'Enter your search term' and a magnifying glass icon.

WLCG/HSF 2024 (13-17 May) - <https://indico.cern.ch/event/1369601/>

Institute for Research and Innovation in Software for High Energy Physics (IRIS-HEP)



<http://iris-hep.org>

Computational and data science research to enable discoveries in fundamental physics

IRIS-HEP is a software institute funded by the National Science Foundation. It aims to develop the state-of-the-art software cyberinfrastructure required for the challenges of data intensive scientific research at the High Luminosity Large Hadron Collider (HL-LHC) at CERN, and other planned HEP experiments of the 2020's. These facilities are discovery machines which aim to understand the fundamental building blocks of nature and their interactions. [Full Overview](#)

News and Featured Stories:



IRIS-HEP Receives \$25M Funding for Another Five Years of Research

"IRIS-HEP received funding from the Office of Advanced Cyberinfrastructure and the Physics Division at the National Science Foundation for five years."

[Read more](#)



Out of harm's way: Physics research program supports Ukrainian students displaced by war

"Ukrainia students escape the war and pursue research at the Large Hadron Collider (LHC), under supervision from Princeton University faculty."

[Read more](#)

Upcoming Events:

May 24, 2024	CERN
IRIS-HEP / AGC Demo Day #5	
Jun 20-21, 2024	Princeton University
USCMS/IRIS-HEP Software Training	
Jul 8-14, 2024	Tacoma, Washington
Scientific Computing with Python (SciPy) 2024	
Jul 18-19, 2024	University of Washington
USATLAS/IRIS-HEP Software Training	
Jul 22-26, 2024	Princeton University
CoDaS-HEP 2024 - Computational and Data Science Training for High Energy Physics	
Aug 26-30, 2024	Aachen, Germany
PyHEP.dev 2024 - "Python in HEP" Developer's Workshop	
Sep 4-6, 2024	University of Washington
IRIS-HEP Institute Retreat	
Sep 23-25, 2024	Valencia (Spain)
Fourth MODE Workshop on Differentiable Programming for Experiment Design	

[View all past events](#)

Conceived as a “**software upgrade**” project and guided initially by the “Community White Paper” roadmap developed in 2016-2017: it involves 21 universities, spanning ATLAS, CMS and LHCb.

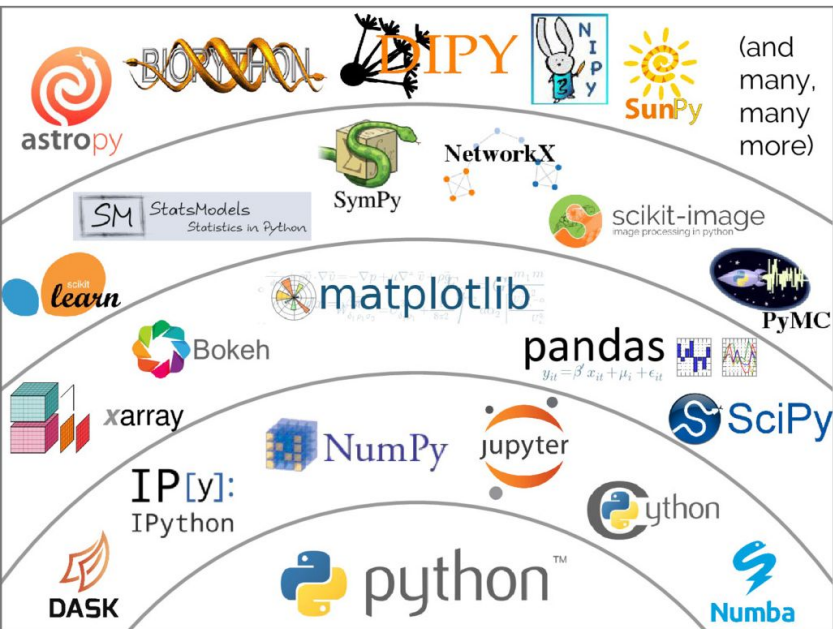
IRIS-HEP is supported by the U.S. National Science Foundation through the **Office of Advanced CyberInfrastructure** in the Directorate for Computer and Information Science and Engineering and the **Division of Physics** in the Directorate for Mathematical and Physical Sciences.

10-year project: Originally funded in 2018 as OAC-1836650 and renewed in 2023 through 2028 as PHY-2323298.

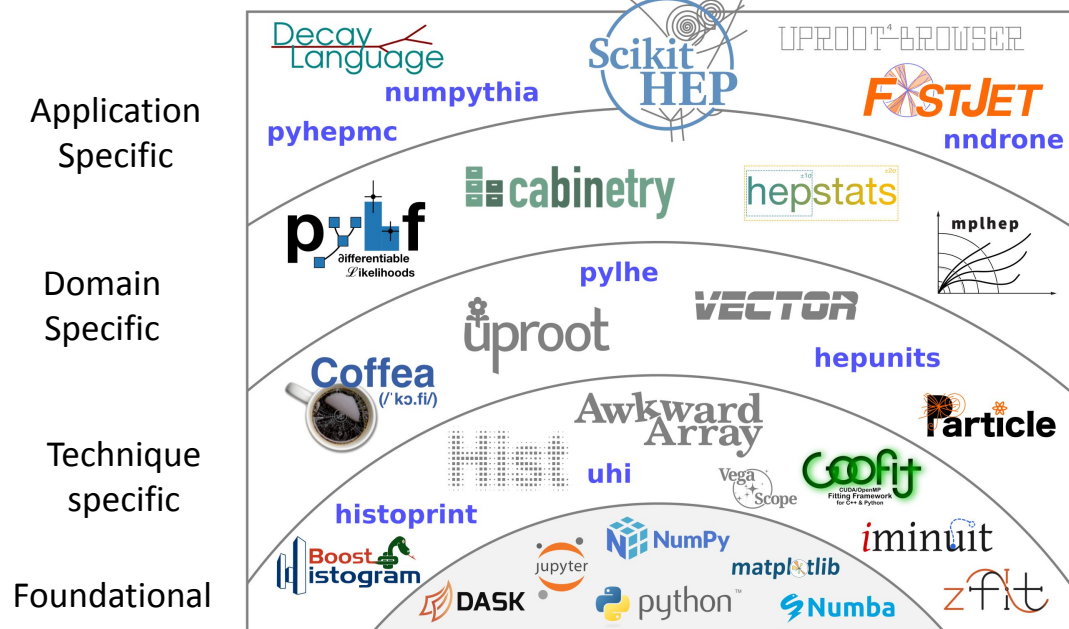
Example outcomes

Leveraging data science for HEP analysis

Scientific Python / PyData vision/ecosystem



Developing HEP data analysis ecosystem



Awkward Array – numpy for HEP data

```
array = ak.Array([\n    [{"x": 1.1, "y": [1]}, {"x": 2.2, "y": [1, 2]}, {"x": 3.3, "y": [1, 2, 3]}],\n    [],\n    [{"x": 4.4, "y": [1, 2, 3, 4]}, {"x": 5.5, "y": [1, 2, 3, 4, 5]}]\n])
```

```
output = []\nfor sublist in python_objects:\n    tmp1 = []\n    for record in sublist:\n        tmp2 = []\n        for number in record["y"][1:]:\n            tmp2.append(np.square(number))\n        tmp1.append(tmp2)\n    output.append(tmp1)
```

2.3 minutes to run (22 GB footprint)

```
output = np.square(array["y", ..., 1:])
```

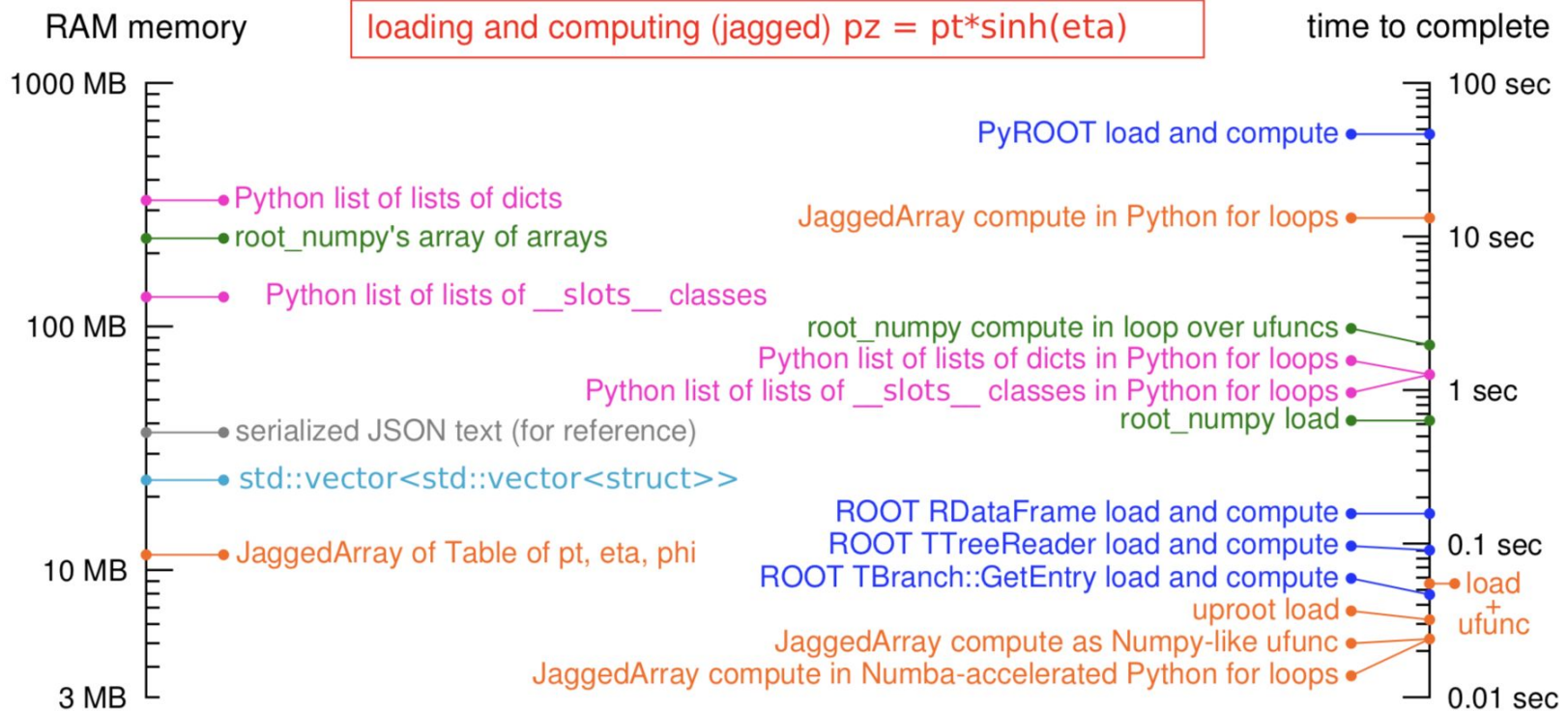
```
[\n    [ [], [4], [4, 9] ],\n    [ ],\n    [ [4, 9, 16], [4, 9, 16, 25] ]\n]
```

4.6 seconds to run (2.1 GB footprint)

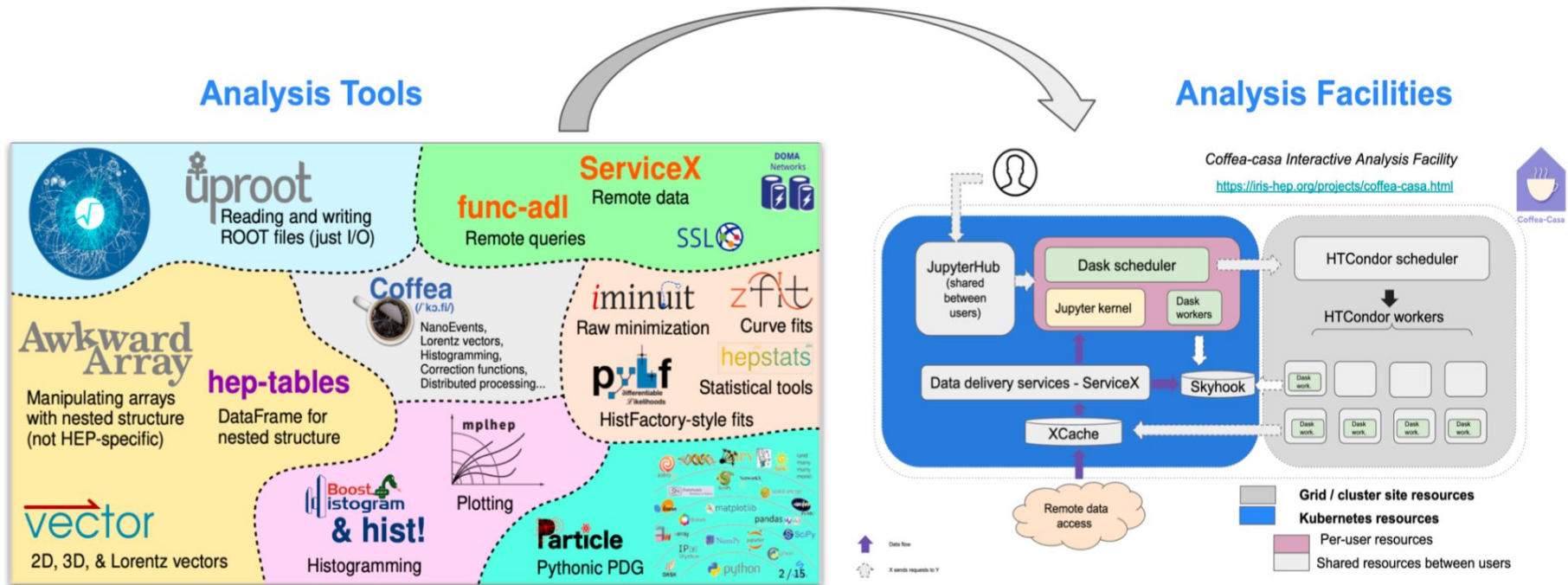
(single-threaded on a 2.2 GHz processor with a dataset 10 million times larger than the one shown)

- General tool for manipulating JSON-like structures in a NumPy-like way
- Motivated by problems in HEP which commonly include irregular, “jagged” data

Exciting results are possible: Orders of magnitude speed ups



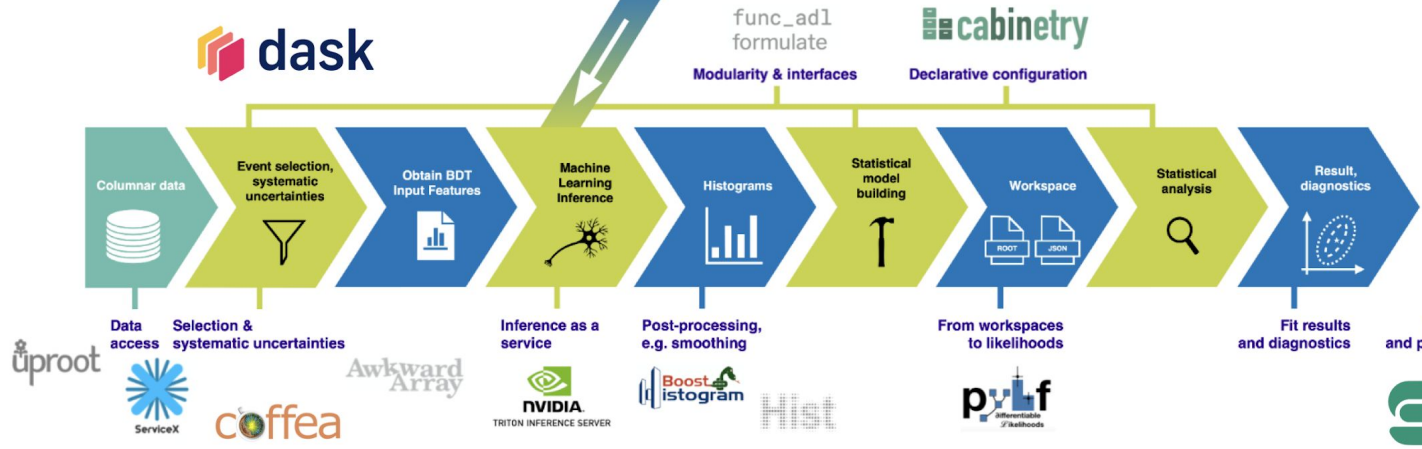
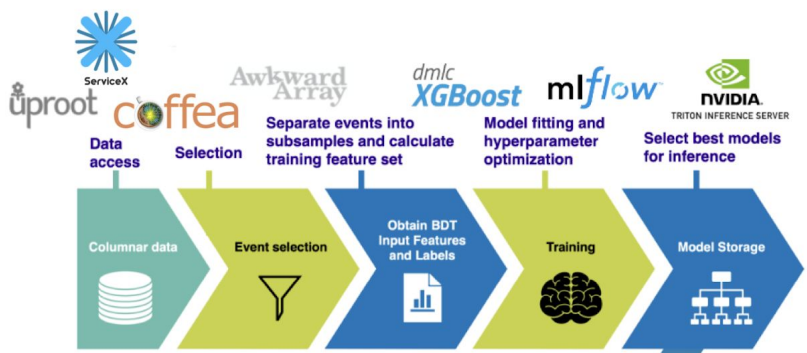
What comes next? Analysis tool chains and facilities rather than just tools



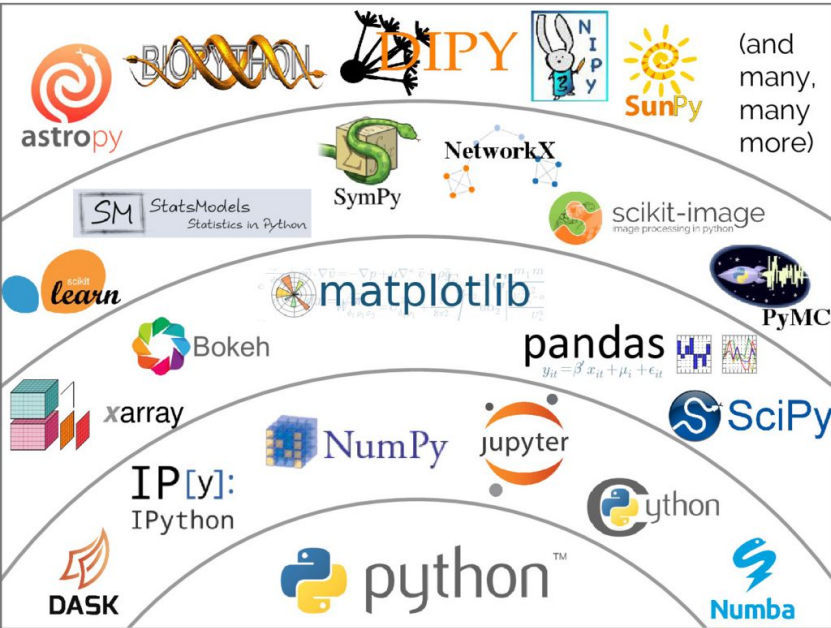


The **IRIS-HEP reference implementation** employs the **Scikit-HEP/ PyHEP ecosystem** and serves as **ideal environment** to test our **latest R&D**.

find it all on [GitHub](#) and <https://agc.readthedocs.io/>



Leveraging data science for HEP analysis

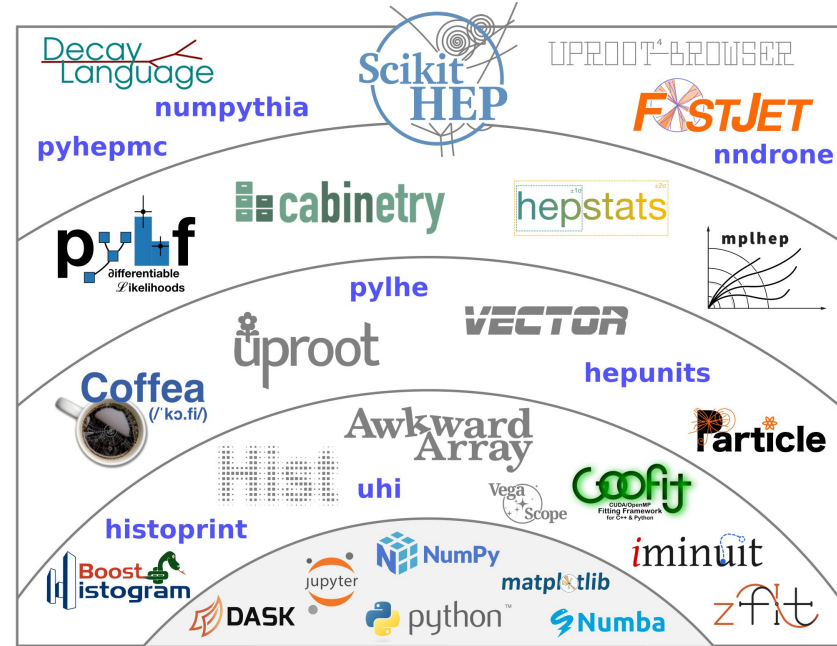


Application Specific

Domain Specific

Technique specific

Foundational



PyHEP development

PyHEP - Python in HEP

The PyHEP working group brings together a community of developers and users of Python in Particle Physics, with the aim of improving the sharing of knowledge and expertise. It embraces the broad community, from HEP to the Astroparticle and Intensity Frontier communities.

Conveners

- Eduardo Rodrigues (LHCb, University of Liverpool)
- Jim Pivarski (CMS and IRIS-HEP, Princeton)
- Matthew Feickert (ATLAS and IRIS-HEP, University of Wisconsin-Madison)
- Nikolai Hartmann (Belle II, LMU Munich)

All coordinators can be reached at hsf-pyhep-organisation@googlegroups.com.

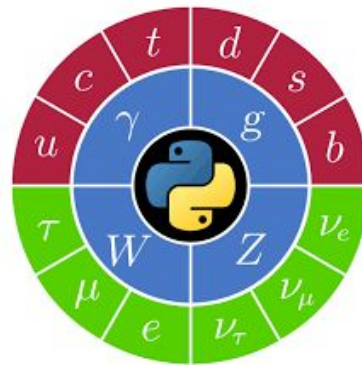
Getting Involved

Everyone is welcome to join the community and participate, contribute, to the organised meetings and by means of the following communication channels:

- [Gitter channel PyHEP](#) for any informal exchanges.
- [GitHub repository of resources](#), e.g., Python libraries of interest to Particle Physics.
- PyHEP Workshop Twitter handle: [@PyHEPConf](#)

Extra Gitter channels have been created by and for the benefit of the community:

- [PyHEP-newcomers](#) for newcomers support (very low entry threshold).

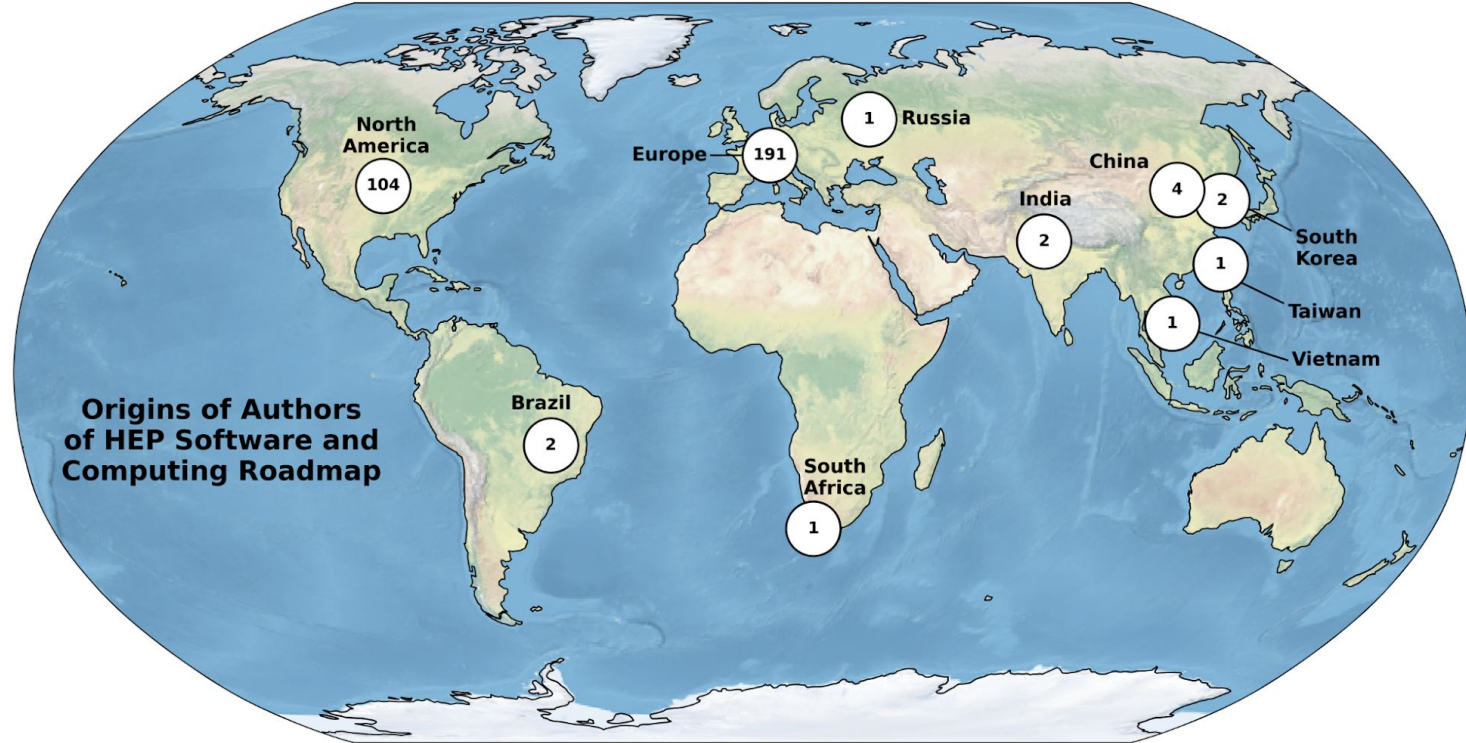




The HSF-India Project

<http://research-software-collaborations.org/>

However, nearly all authors of the HSF Community Roadmap were from institutions in Europe and the US



Facilitating international research software: The “HSF-India” project

- Given the growing complexity of our scientific data and collaborations, building and fostering collaborations are increasingly important to raise the collective productivity of our research community.
- HSF-India project aims to build international research software collaborations between US, European, and India based researchers to reach the science goals of experimental particle, nuclear and astroparticle research.

Intended as a long-term investment in international team science with a broad research scope

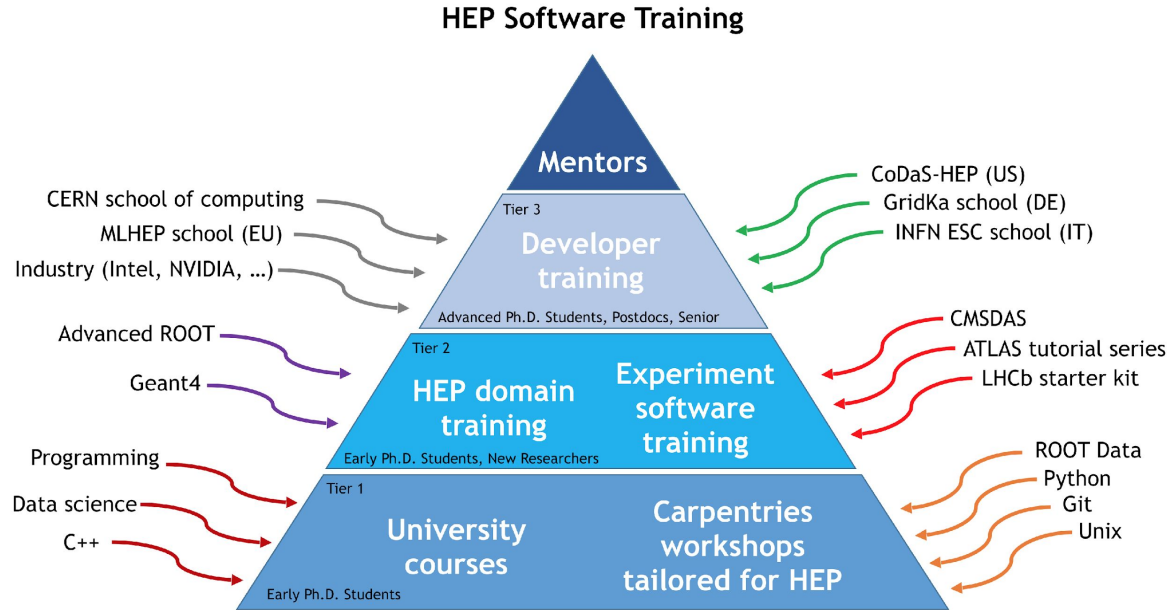


Rather than directly fund a specific research activities, much of our funding is to facilitate research collaborations

- Training in research software skills
- Bidirectional research exchanges
- Student programs



Bootstrap collaboration through software training



- A vision for training in HEP: researchers progress (vertically) from basic skills training, through user training in existing software to training in skills needed to develop new research software.

We have run software workshops in Mumbai (TIFR), Bhubaneswar (NISER), Delhi (University of Delhi), Kolkata (VECC) and now U.Hyderabad

- Regionally organized, primarily targeting MS/PhD level students.
- Mix of lectures and hands-on exercises
- Mix of local and US instructors
- Jupyter notebook based materials derived from/patterned after HSF training courses



We want to organize these events regionally to make it easier for interested students to attend

Current and upcoming events



HSF-INDIA HEP SOFTWARE WORKSHOP

January 13th to 17th, 2025
Centre for Advanced Studies in
Electronics Science and Engineering
School of Physics
University of Hyderabad, Hyderabad, India

Topics
Scientific Python
Parallel Programming & GPUs
Basics of Machine Learning
Real-time triggering software

The workshop primarily targets
masters & early stage PhD students

Registration
<https://indico.cern.ch/event/1394564/>
Deadline: November 1, 2024



Chief Patron
Prof. B. J. Rao
Hon. Vice Chancellor
University of Hyderabad

Special Invitee
Prof. M. Ghanashyam Krishna
IOE Director
University of Hyderabad

Organizing Committee
Prof. M. Ghanashyam Krishna, UoH
Prof. James Raju, UoH
Prof. Samrat Sabat, UoH
Prof. Nageswara Rao, UoH
Prof. Rukmani Mohanta, UoH
Prof. Soma Sanyal, UoH
Dr. Bhawna Gumber, UoH
Dr. Pratap Kollu, UoH
Dr. Anjali Priya, UoH
Dr. David Lange, Princeton University, USA
Dr. Peter Elmer, Princeton University, USA
Prof. Rafael Coelho Lopes de Sa, UMass-Amherst, USA
Prof. Verena Martinez Outschoorn, UMass-Amherst, USA

HSF
HEP Software Foundation

The HSF-India project aims to promote the development of international research software collaborations. This is the fifth in a series of workshops for software and data analysis skills essential for doing research software in physics.

Conveners
Dr. Bhawna Gumber
(bhawna.gumber@cern.ch)
Dr. David Lange
(David.lange@cern.ch)

Sponsored by IOE, University of Hyderabad and HSF-India (NSF/USA)

NSF OISE-2201990

INSTITUTION OF Eminence
उच्च शिक्षा, विश्वविद्यालय
उच्च शिक्षा, विश्वविद्यालय
उच्च शिक्षा, विश्वविद्यालय
उच्च शिक्षा, विश्वविद्यालय

<https://indico.cern.ch/event/1394564/>

HSF-India workshop in IISC
Bangalore - 16-22 June 2025
(Indico link forthcoming)

CMSDAS IIT Hyderabad - 23-27
June 2025 (perhaps a
collaboration with HSF-India)

We are exploring additional
possibilities for “hackathon”
events to further build skills, as
well as Physics/CS collaborations.










3-6 month project Fellows Program

- **Project focused** aiming to bring students into contact with “mentors” to work on a specific, pre-defined project, allowing them to grow their software skills and experience working in large projects
- These short term projects that build **longer term collaborations** in research software and foster **scientific career progression**
- Our program is open for applications for either full time (eg, during semester breaks) or part time expressions of interest

HSF-India Research

















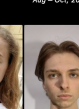
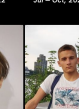

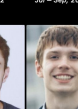
















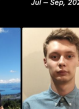
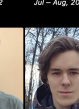


Software Trainees

Current and Former Trainees

 Vigal Carappa Ramiah University of Applied Sciences Sep. 2024 – Feb. 2025	 Sanjeev Kumar TIFR, Mumbai Mar – Jul, 2024	 Prayag Yadav University of Hyderabad Jun – Jun, 2024	 Podem Sal Krishna IIT Hyderabad May – Aug, 2024	 Juhi Peddar Tara Institute of Fundamental Research Feb, 2024 – Feb, 2025
 Durbal Chakrabarty National Institute of Technology Durgapur Jul – Nov, 2023	 Chitrakhaee Yede Savitribai Phule Pune University Jun – Jul, 2023	 Ananya Gupta Indira Gandhi Delhi Technical University for Women Jun – Sep, 2023	 Adam Zacharia Indian Institute of Science Education and Research, Thiruvananthapuram Jul – Dec, 2023	

Also IRIS-HEP Fellows:

<https://iris-hep.org/fellows.html>

 Sophia Korte Florida State University Jun – Sep, 2022	 Anni Li University of California, San Diego Jun – Sep, 2022	 Haoran Sun University of Washington Jun – Sep, 2022	 Zhe Wang University of Wisconsin-Madison Jun – Sep, 2022	 Jake Li University of Illinois at Urbana-Champaign Jun – Aug, 2022	 Volodymyr Svitozelskyi Taras Shevchenko National University of Kyiv Jun – Sep, 2022 Dec. 2022 – Feb. 2023	 Ernest Sorochuk Taras Shevchenko National University of Kyiv Aug – Oct, 2022	 Volodymyr Shabanov V. N. Karazin Kharkiv National University Jul – Oct, 2022	 Boris Orlifov Bogomoletz Institute of Physiology of NAS of Ukraine Jul – Sep, 2022	 Bohdan Tyshchenko Taras Shevchenko National University of Kyiv Jul – Sep, 2022
 Amaya Thete BITS, Pilani - K. K. Birla Goa Campus Jun – Aug, 2022	 Saranah Chigra Cluster Innovation Centre, University of Delhi Jun – Aug, 2022	 Scott Demarest Florida Institute of Technology Jun – Aug, 2022	 Jay Gohil School of Technology PDEU Jun – Sep, 2022	 Phillip Templeman University of Notre Dame May – Aug, 2022	 Tatiana Yushkevych Odessa Polytechnic National University Jul – Sep, 2022	 Ivan Prilko Kyiv Academic University Aug – Oct, 2022	 Dmytro Hryshchuk Kyiv Academic University Jul – Sep, 2022	 Dimitri Brovnyk National Technical University "Kharkiv Polytechnic Institute" (NTU) "Kharkiv" Jul – Sep, 2022	 Dimitri Riva Igor Sikorsky Kyiv Polytechnic Institute Jul – Sep, 2022
 Ziyang Ye University of Wisconsin-Madison May – Aug, 2022	 Max Zhao University of California, Berkeley May – Aug, 2022	 Aryan Roy Manjari Institute of Technology Apr – Aug, 2021 May – Jul, 2022	 Natalie Bruhlwer University of California, Berkeley May – Aug, 2022	 Surya Srinivasayala University of Wisconsin-Madison May – Aug, 2022	 Kateryna Skuratshva Kyiv Academic University Jul – Sep, 2022	 Kyrylo Melushko Taras Shevchenko National University of Kyiv Jul – Sep, 2022	 Maxym Naumchyk Igor Sikorsky Kyiv Polytechnical Institute Jul – Aug, 2022	 Andrii Falko Taras Shevchenko National University of Ukraine Jun – Sep, 2022	 Artem Havryliuk National Technical University of Ukraine (Igor Sikorsky Kyiv Polytechnical Institute) Jun – Sep, 2022
 Maya Wallach Michigan State University May – Jul, 2022	 Zoi Bilodeau Skidmore College May – Aug, 2022	 Katie Edwards Iowa State University May – Aug, 2022	 Elliott Kauffman Duke University May – Aug, 2022	 Ben Kuchma University of Massachusetts - Amherst May – Aug, 2022	 Andrii Koval Taras Shevchenko National University of Kyiv Jun – Sep, 2022	 Vladiaslav Shevchenko Kyiv Academic University (KAU) Jun – Aug, 2022	 Andrii Len Taras Shevchenko National University of Kyiv Jun – Sep, 2022	 Jerry Ling Harvard University Jun – Sep, 2022	 Attili-Yehor Krasnosposki Taras Shevchenko National University of Kyiv Jun – Sep, 2022

Bidirectional Research Exchange Program

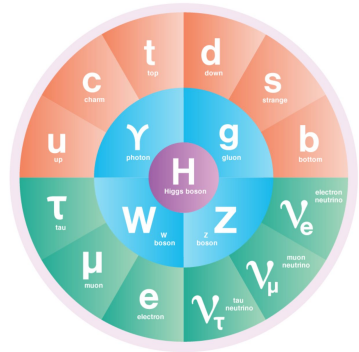
We also have funding for “research exchanges” that support travel costs for 1-3 months. These are meant for very senior PhD students and more senior researchers that have already

Who can we support?

- Researchers affiliated to a US university/lab exchange based in India
- Researchers affiliated to an university/lab in India exchange based in US or CERN to work with a US affiliated group

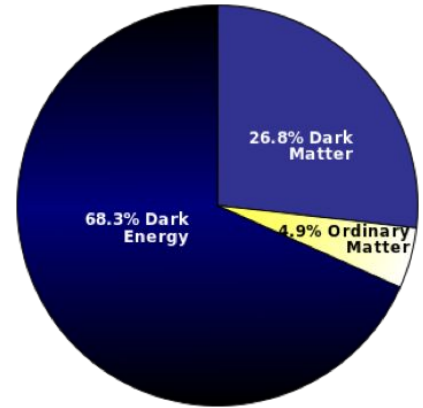
We are looking for either project/host ideas or those interested in doing an exchange. If you have ideas for projects that interest you, we can help identify matches with US researchers

Science Drivers - Beyond the Standard Model of Particle Physics



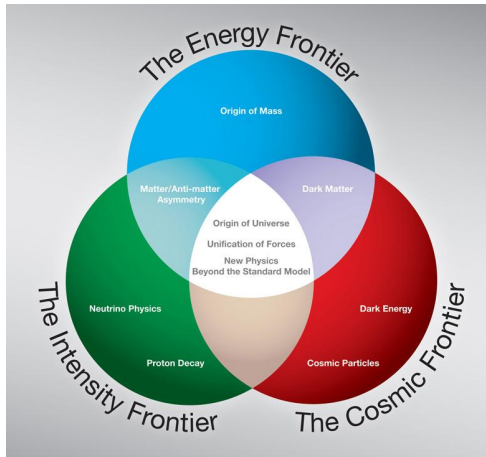
● QUARKS ● LEPTONS ● BOSONS ● HIGGS BOSON

While the Standard Model of Particle Physics describes, often with incredible precision, the vast majority of experimental observations, it is known to be incomplete. It does not (for example) include gravity, and it does not explain neutrino masses, the matter-antimatter asymmetry or dark matter/energy.



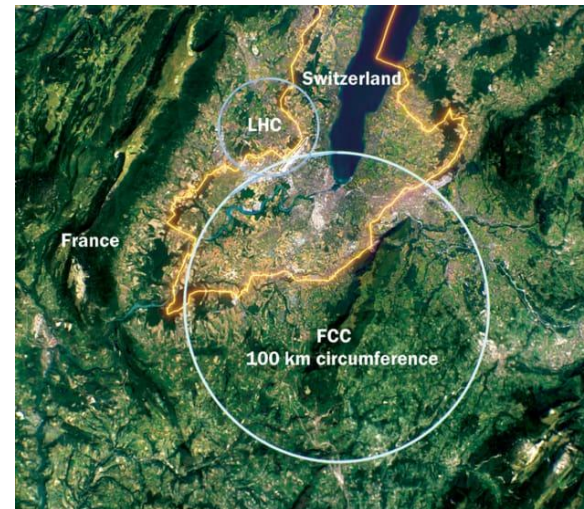
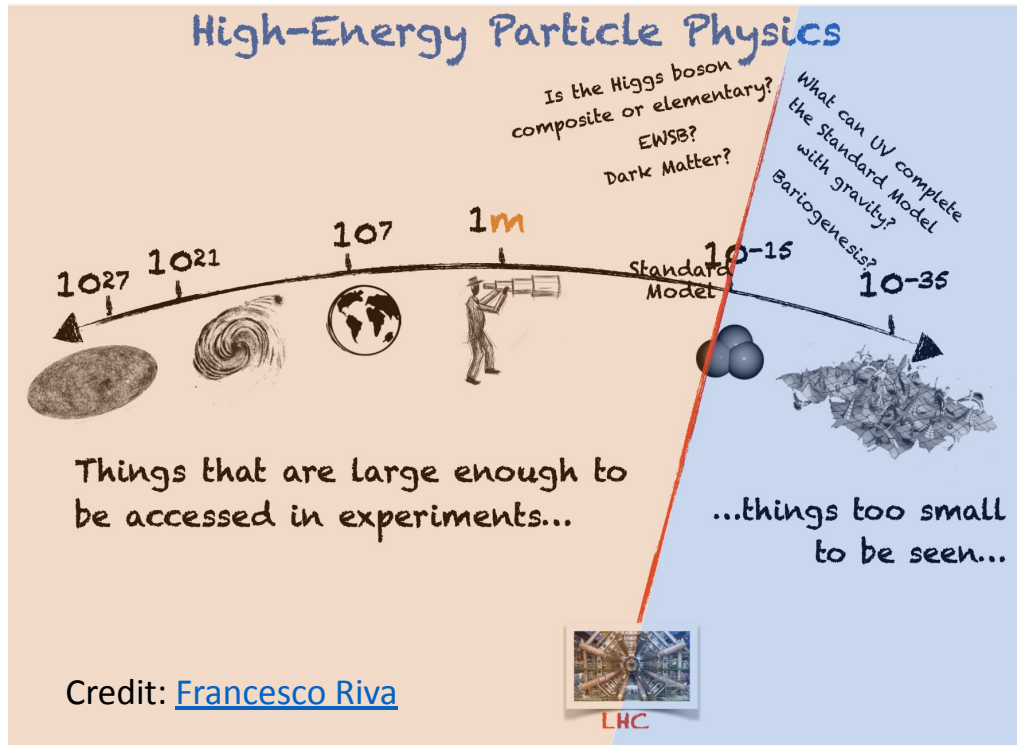
From “Building for Discovery - Strategic Plan for U.S. Particle Physics in the Global Context” - Report of the Particle Physics Project Prioritization Panel (P5):

- 1) Use the Higgs boson as a new tool for discovery
- 2) Pursue the physics associated with neutrino mass
- 3) Identify the new physics of dark matter
- 4) Understand cosmic acceleration: dark energy and inflation
- 5) Explore the unknown: new particles, interactions, and physical principles



We know that physics beyond our current model exists. However, we do not yet know the energy scale to probe.

Next-generation colliders will bring precision science with Higgs



CERN feasibility study of next generation e+e- and hadron collider

Conclusion and Opportunities

- Experimental science is enabled by tools innovation, which become facilities enabling further science. Our science has been driven by accelerator and detector innovation.
- As facilities get larger, scientific collaborations are created to build and exploit those facilities. These large international collaborations of scientists allow experimental endeavors to exploit regional strengths.
- Just as with other aspects of our science, software teams that are inherently international are most likely to develop performant, highly usable, and sustainable **research software ecosystems**, which are a new kind of “facility” and an *intellectual product* of our research.
- HSF-India is a project which aims to further catalyze global collaboration in research software in Physics.
 - <http://research-software-collaborations.org>



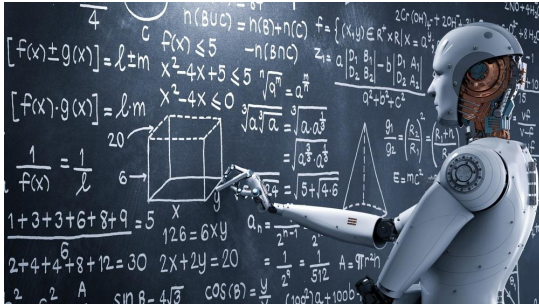
And the Future for HEP?



The **Worldwide LHC Computing Grid (WLCG)** project is a global collaboration of around 170 computing centres in more than 40 countries, linking up national and international grid infrastructures. The mission of the WLCG project is to provide global computing resources ... **[2000's and 2010's era]**



The **HEP Software Foundation** facilitates cooperation and **common efforts** **[2010's and 2020's era]** in High Energy Physics software and computing internationally.



What collaborative research efforts will the rest of the 2020's and the 2030's produce for the future "facilities" for the HEP community?