

DPF-PHENO 2024 - University of Pittsburgh / Carnegie Mellon University

Future of Computing

Peter Elmer - Princeton University 15 May 2024





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A story of technologies, collaborations and science driven challenges

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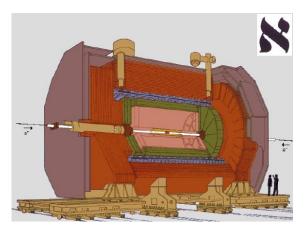


Introductions.... Who am I?

I am an experimental particle physicist focused on computational and data science problems in my field, along with the software/computing systems to solve them. I am a senior research scientist with Princeton, but based at CERN.

I have primarily collaborated on collider experiments, which will likely color some of the perspectives in this talk. These include:

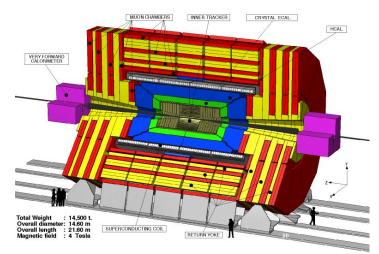
Aleph@CERN



BaBar@SLAC



CMS@CERN





1990s Technology Context

International dialing at reduced rates to participate in meetings with phone cards

Dec 1991 - first web server (later first DB) deployed in the US, at SLAC

Sep 1992 - first public Linux version

Jan 1993 - Mosaic browser released

Aug 1995 - Windows 1995

Yahoo, AltaVista, Google still to come.

Windows NT was the "strategic platform" at CERN in the late 1990s. Browser wars!

Carrying around a laptop really only became a "thing" over the course of the 1990s. Cell phones were starting to arrive on the scene, for calling/messaging. Pagers were a thing...





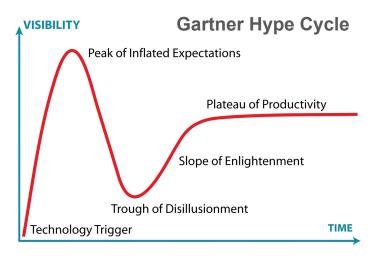
Modem Dial-up Internet (Geneva)

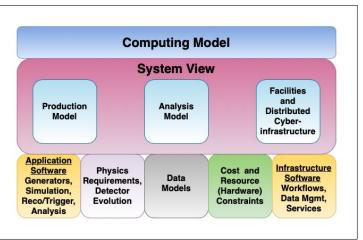
Local phone calls were 4CHF/hr (\$2.65/hr in 1998) during the day, 2CHF/hr in the evening and 1CHF/hr in the night —> CERN Automatic Call Back (ACB) system

Future of Computing?

Technologies suffer from the hype cycle, then often are subsumed into our everyday work, or just disappear.

In addition, we build "systems" that support "computing models", so each technology needs a context...







Ask ChatGPT - Tell me about the future of computing in high energy physics.

You

Tell me about the future of computing in high energy physics

🕼 ChatGPT

The future of computing in high-energy physics holds exciting prospects driven by technological advancements and the evolving needs of scientific research. Here are some trends and areas of development that could shape the future of computing in this field:

- 1. High-Performance Computing (HPC):
- 2. Distributed Computing and Grid Computing: ...
- 3. Machine Learning and Artificial Intelligence: ...
- 4. Quantum Computing: ...
- 5. Data Management and Storage: ...
- 6. Open Science and Collaboration Platforms: ...

Overall, the future of computing in high-energy physics is likely to be characterized by a combination of technological innovation, collaborative research efforts, and a continued focus on addressing the computational challenges posed by large-scale experiments and datasets.

CHEP 2023 Scientific Program

- Track 1 Data and Metadata Organization, Management and Access 🛞
- Track 2 Online Computing
- Track 3 Offline Computing
- Track 4 Distributed Computing)
- Track 5 Sustainable and Collaborative Software Engineering
- Track 6 Physics Analysis Tools
- Track 7 Facilities and Virtualization
- Track 8 Collaboration, Reinterpretation, Outreach and Education
- Track 9 Artificial Intelligence and Machine Learning
- Track 10 Exascale Science)
- Track 11 Heterogeneous Computing and Accelerators
- Track 12 Quantum Computing 🛞



https://www.jlab.org/conference/CHEP2023

CHEP 2019 - Scientific Program

- Track 1 Online and Real-time Computing
- Track 2 Offline Computing
- Track 3 Middleware and Distributed Computing
- Track 4 Data Organisation, Management and
- Access 🖏
- Track 5 Software Development
- Track 6 Physics Analysis
- Track 7 Facilities, Clouds and Containers
- Track 8 Collaboration, Education, Training and
- Outreach 🕼
- Track 9 Exascale Science 🚳



http://chep2019.org/

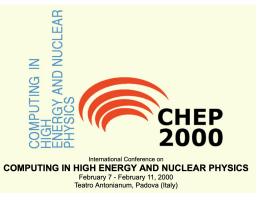
CHEP 2007 Scientific Program

- Track 1 Online Computing
- Track 2 Event Processing
- Track 3 Software components, tools and databases
- Track 4 Computer facilities, production grids and networking
- Track 5 Grid middleware and tools
- Track 6 Distributed data analysis and information management
- Track 7 Collaborative initiatives with other sciences
- Track 8 Collaborative tools



CHEP 2000 - Scientific Program

- Track 1 Data Analysis: Algorithms and methods
- Track 2 Data Acquisition and Control System
- Track 3 Object Persistency and Data Handling
- Track 4 Network: Applications and Services
- Track 5 Commodity Hardware and Software and Integration in Farm and Large Systems Track 6 - Data Analysis: Technology and Presentation



https://chep2000.pd.infn.it/



st update Aug 25, 1997

Conference Secretariat DESY-Zeuthen

Platanenallee 6

D-15738 Zeuthen

Germany

https://www.zeuthen.desy.de/CHEP97/chep97.htm

Conference Schedule

	Conference	Schedule				
Monday	Thuesday	Wednesday	esday Thursday			
SundayMondayWorkshop: and the Internet 0:00-12:00Opening Remarks at 9:00Plenary Talk: Java and Internet Computing 9:30-10:15		Parallel Talks 9:00-10:30Object Technology and Software Processes Panel: Transition to OO 9:00-11:00Plenary Talk: PC's: Facts, Figures and Software 9:00-10:30Parallel Talks 9:00-10:30Processes 9:00-10:309:00-10:30				
Panel: Collaborative Tools in the Internet 10:45-12:15 Plenary Talk: HPC and Archival Storage Systems 12:15-13:00	<u>Parallel Talks</u> 11:00-12:30	<u>Plenary Talk:</u> <u>A Software Engineering</u> <u>Service Center</u> <u>for Scientific Software</u> <u>Production</u> 11:30-12:15	Plenary Talk: Models of Multiprocessor Computing Plenary Talk: Overview on LQCD Computing 11:00-12:30	Conference Summaries B.D.G: 11:00-12:30		
Parallel Talks 14:30-15:30 <u>Vendor Talks,</u> <u>Parallel Talks A, B</u> 15:30-16:30 17:00-18:00	Panel: Computing at Major HEP Sites 14:00-15:15 Panel: Computing Models of Major HEP	<u>Parallel Talks</u> 13:45-14:45 15:15-16:30 17:00-19:20	Parallel Talks 14:00-15:30 16:00-18:00	Panel: Future of HEP Computing 14:00-15:30		
Video Conference: Tutorial from WWW6	Experiments 15:45-18:00 Poster Session 18:00-20:00	Video Conference: Talks from WWW6 18:45-20:00	Conference Dinner Deutsches Technikmuseum	Closing Remarks 15:30-16:00		
	Opening Remarks at 9:00 Plenary Talk: Java and Internet Computing 9:30-10:15 Panel: Collaborative Tools in the Internet 10:45-12:15 Plenary Talk: HPC and Archival Storage Systems 12:15-13:00 Parallel Talks 14:30-15:30 Vendor Talks, Parallel Talks A, B 15:30-16:30 17:00-18:00 Video Conference: Tutorial from	MondayThuesdayOpening Remarks at 9:00Parallel Talks 9:00-10:30Plenary Talk: Java and Internet Computing 9:30-10:15Parallel Talks 9:00-10:30Panel: Collaborative Tools in the Internet 10:45-12:15Parallel Talks 9:00-10:30Plenary Talk: HPC and Archival Storage Systems 12:15-13:00Parallel Talks 9:00-10:30Plenary Talk: HPC and Archival Storage Systems 12:15-13:00Parallel Talks 9:00-10:30Plenary Talk: HPC and Archival Storage Systems 12:15-13:00Parallel Talks 11:00-12:30Pennery Talk: HPC and Archival Storage Systems 12:15-13:00Parallel Talks 11:00-12:30Pennery Talk: HPC and Archival Storage Systems 12:15-13:00Parallel Talks 11:00-12:30Pennery Talk: HPC and Archival Storage Systems 12:15-13:00Parallel Talks Sites 14:00-15:15Pennery Talk: HPC and Archival Storage Systems 12:15-13:00Panel: Computing at Major HEP Sites 14:00-15:15Parallel Talks Sites 15:30-16:30 17:00-18:00Panel: Computing Models of Major HEP Experiments 15:45-18:00Video Conference: Tutorial from WWW6Poster Session 18:00-20:00	Opening Remarks at 9:00Parallel TalksObject Technology and Software Processes Panel: Transition to OO 9:00-10:30Panel: Collaborative Tools in the Internet 10:45-12:15Parallel Talks Parallel Talks 11:00-12:30Plenary Talk: A Software Engineering Service Center for Scientific Software Production 11:30-12:15Panel: Collaborative Tools in the Internet 10:45-12:15Parallel Talks 11:00-12:30Plenary Talk: A Software Engineering Service Center for Scientific Software Production 11:30-12:15Panallel Talks Yendor Talks, Parallel Talks, 	MondayThuesdayWednesdayThursdayOpening Remarks a 19:00Parallel Talks 9:00-10:30Object Technology and Software Processes Panel: Transition to OO 9:00-11:00Plenary Talk: PC's: Facts. Figures and Forecasts 9:00-10:30Java and Internet Computing 9:30-10:159:00-10:30Summary Session C: 9:00-10:30Panel: Collaborative Tools in the Internet 10:45-12:15Parallel Talks 11:00-12:30Plenary Talk: Models of Multiprocessor Computing Service Center for Scientific Software Production 11:30-12:15Plenary Talk: Models of Multiprocessor Computing Service Center for Scientific Software Production 11:30-12:15Plenary Talk: Models of Multiprocessor Computing 11:00-12:30Parallel Talks 14:30-15:30Panel: Computing a Major HEP Sites 14:00-15:15Parallel Talks 15:15-16:30 17:00-19:20Parallel Talks 14:00-15:30 16:00-18:00Video Conference: Tutorial from WWW6Poster Session 18:00-20:00Video Conference: Talks from WWW6Conference Technikmuseum		

Conference Program Homepage Schedule Plenary Parallel Summary Poster Vendor Computing in High Energy Physics CHEP 97 в ERLIN

- What do you anticipate to be the impact of the changes in the wide world of computing in each of these technological areas on the HEP challenges we have identified?
- What are the problems that HEP computing will need to address by its own efforts (beyond the usual integration of commercially available components) to meet the challenges we have identified?
- What will the data geographical model be?
 - Centralized data vs partially centralized date (Jürgen Knobloch)
 - Impact on network and computing iron/storage requirements
 - What is a regional center?
- Will OO DBs be lightweight enough to be used throughout data cycle?
- Java und C++
 - What will be (should be) the place for each?
 - When) will C++ code become legacy?
 - Will Java always be slower than C++?
 - Grad students should learn both (to be more employable)?
 - o (When) are learning curves worth the pay back?
 - Should physicists learn (computing) analysis skills?
 - Role of computer scientists? Consultants?
 - How do you know you have found a good one?
 - Requirements? When in process?
 - Waterfall vs iterative development?
 - Rapid prototyping?
 - o Reviews and checkpoints: electronic only?

- Process?
 - Let them code first? Will they ever design?
 - Daily, weekly, monthly build?
 - (Why) are we slower than Netscape, Microsoft release cycles?
- Will complex, do-everything programs die, evolve to Component software?
 - Word, GEANT, Experiment analysis packages
 - Chosen, focused functionality
 - What is appropriate level of component granularity?
- Future (appropriate roles) (positions) of NT vs Unix vs (Java + Browser)?
- Integration of HEP computing into HEP
 - $\circ~$ What is trend of % cost for computing in experiments?
 - $\circ~$ Should (can, will) computing be included in TPC (total project cost)?
 - in project work break down structure (WBS)?
 - $\circ~$ What should we be saying about computing issues as leaders in CHEP to leaders in HEP?

CHEP 1997 - "Future of HEP Computing" Panel

https://www.zeuthen.desy.de/CHEP97/slide/p518/p518.htm



CHEP 2023 Scientific Program

Track 1 - Data and Metadata Organization, Management and Access

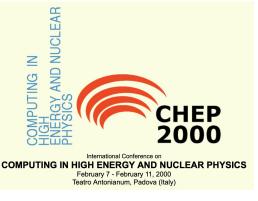
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CHEP 2000 - Scientific Program

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- Track 5 **Commodity Hardware and Software** and Integration in Farm and Large Systems Track 6 - Data Analysis: Technology and Presentation



https://chep2000.pd.infn.it/

Some conclusions from the exploring the CHEP history

General trend is towards higher level "system" concepts, while earlier technology tracks now "subsumed" into the system tracks. Some new "technology" tracks appear (e.g. Al/ML, Quantum Computing). ChatGPT suggested more technology than systems.

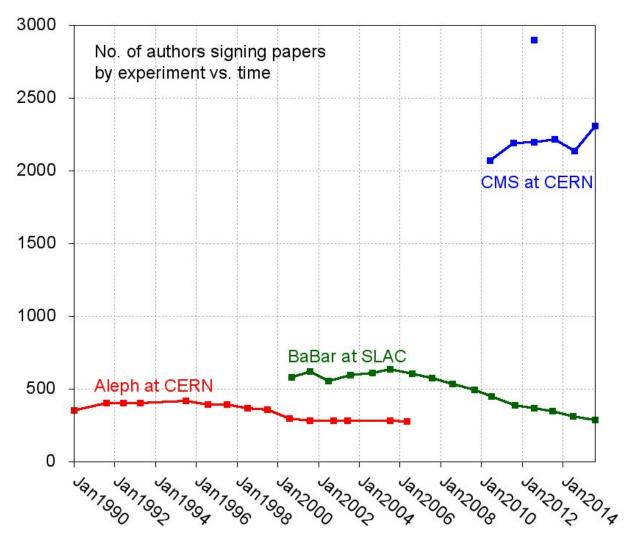
"Conway's Law" effect? - the way an organization communicates and is structured will be directly reflected in the systems and software it creates

One consistently present track is "data analysis" and/or "analysis tools". ChatGPT missed this one.

ChatGPT: "Overall, the future of computing in high-energy physics is likely to be characterized by a combination of **technological innovation**, **collaborative research efforts**, and a continued focus on addressing the **computational challenges posed by large-scale experiments and datasets**."

Particle Physics Experiments as "collaborative research efforts"

> Project Size Over Time



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 era]



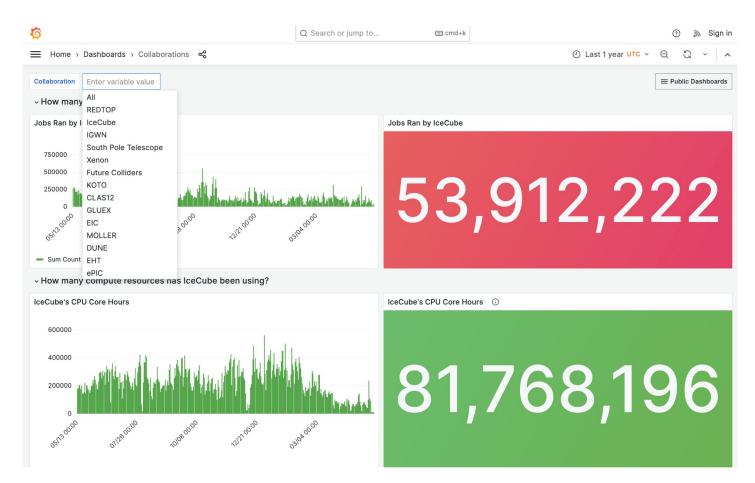
The **HEP Software Foundation** facilitates cooperation and common efforts in High Energy Physics software and computing internationally.

[2010's era]



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

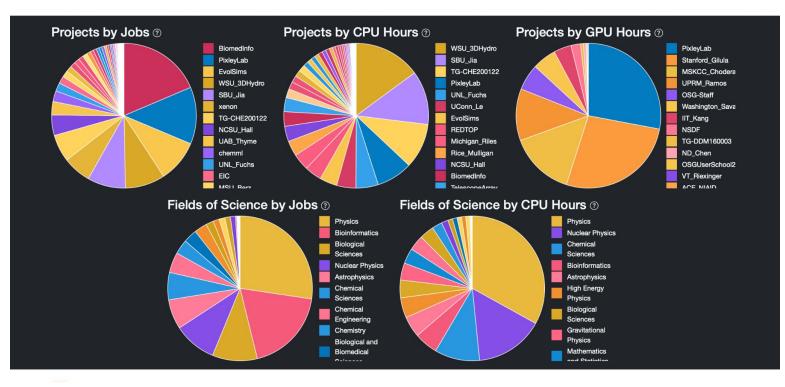
OSG Support for non-LHC experiments



OSPool Active Projects 104

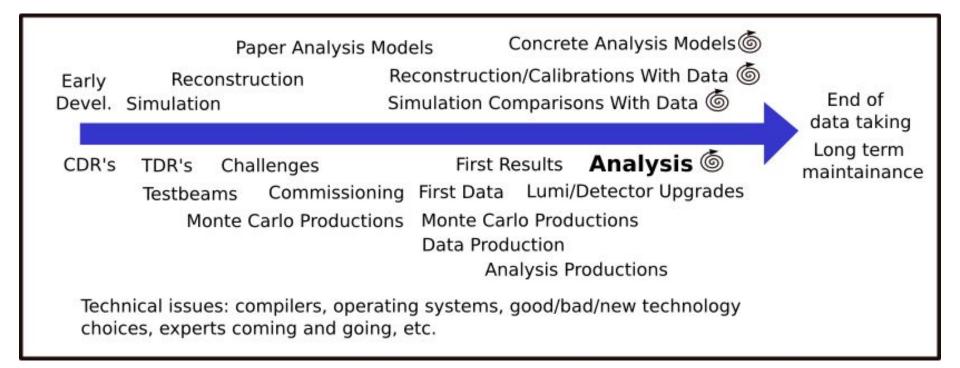
Data updated: 07/03/2024, 19:08:52

The below projects used OSPool resources to advance their research in the past year and ran more than 100 jobs. To run your own research on the OSPool sign up now on the OSG Portal.



The <u>Open Science Data Federation</u> is built on the <u>Pelican Platform</u> (which uses xrootd), part of the NSF-funded National Discovery Cloud for Climate (NDC-C)

Software Lifecycle in High Energy Physics



The Life Cycle of HEP Offline Software, CHEP 2007

HSF HL-LHC "Software Upgrade" - Developing a Global R&D Roadmap

Community charge from the Worldwide LHC Computing Grid to the (then nascent) HEP Software Foundation in July 2016:

- Anticipate a "software upgrade" in preparation for the HL-LHC
- Identify and prioritize the software research and developments investments
 - 1. to achieve improvements in <u>software efficiency</u>, <u>scalability and performance</u> and to make use of the advances in CPU, storage and network technologies
 - 2. to enable new approaches to computing and software that could radically extend the <u>physics reach</u> of the detectors
 - 3. to ensure the long term <u>sustainability</u> of the software through the lifetime of the HL-LHC

19

NSF funded the S2I2-HEP Conceptualization Project (s2i2-hep.org/) in July 2016

2016-2017 - Software Roadmap



January 2017 UCSD



Many workshops, involving a diverse group

- International participants
- Computing Management from the Experiments and Labs
- Individuals interested in the problems
- Members of other compute intensive scientific endeavors
- Members of Industry
- http://s2i2-hep.org/
- <u>https://hepsoftwarefoundation.org/</u>



needs a splittle on the bus page of the proces

<u>Computing and Software for Big</u> <u>Science</u> volume 3, Article 7 (2019)

"The result: a Programme of Work for the field as a whole, a multifaceted approach to addressing growing computing needs on the basis of existing or emerging hardware."

Eckhard Elsen (CERN Director of Research and Computing), editorial published with CWP/Roadmap

Individual Papers on the arXiv:

Careers & Training, Conditions Data, DOMA, Data Analysis & Interpretation, Data and Software Preservation, Detector Simulation, Event/Data Processing Frameworks, Facilities and Distributed Computing, Machine Learning, Physics Generators, Security, Software Development, Deployment, Validation, Software Trigger and Event Reconstruction, Visualization

<u>Community White Paper</u> & the <u>Strategic Plan</u>

arXiv 1712.06982

arXiv 1712.06592

IRIS-HEP

Conceptual motivations behind the HEP Software Foundation

Computer hardware is a consumable. Software is the actual "cyberinfrastructure".

Software is also an *intellectual product* of our research, not just a tool.

We can seed and build collaborations around software in a similar fashion to our experimental collaborations.



Software as a "cyberinfrastructure" - 1990s/early-2000s software

Geant4 (RD44 in 1994, V1.0 in 1998) began 30 years ago and just passed the 25th anniversary of its first release, and **ROOT** (1994) is at or near its 30th anniversary. Both are ubiquitous in particle, nuclear and astroparticle physics. (Geant4 also medical and space physics.)

RooFit (D.Kirkby, W.Verkerke) is now nearly 25(?) years old and played a key role in the Higgs discoveries and LHC (and other) physics.

EvtGen (A.Ryd, D.Lange), originally developed at CLEO and developed in BaBar, lives on in many experiments.

xrootd (A.Hanushevsky, many others) is now around 20 years old. Initially planned to fix issues with the Objectivity AMS, it was repurposed into a next generation file server for BaBar with effort from INFN (A.Dorigo, F.Furano) and (later) CERN.

xrootd has grown into a collaboration of SLAC/CERN/UCSD and others, It is not only widely used by the LHC experiments, but it is a key element of the OSG's "Open Science Data Federation (OSDF)" service broadly supporting science in the US (next slide) that needs high throughput computing. APS DPF and Coordinating Panel for Software and Computing

Snowmass CompF recommendation

We recommend the creation of a standing Coordinating Panel for Software and Computing (CPSC) under DPF, mirroring the panel for advanced detectors (CPAD) established in 2012.

Purpose: Promote, coordinate, and assist the HEP community on Software and Computing, working with scientific collaborations, grassroots organizations, institutes and centers, community leaders, and funding agencies on the evolving HEP Software and Computing needs of experimental, observational, and theoretical aspects of the HEP programs. The scope should include research, development, maintenance, and user support.

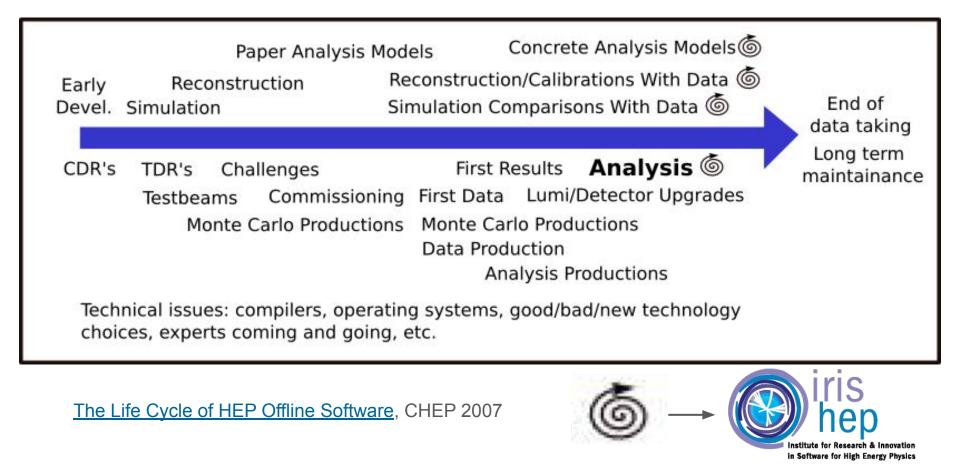
Further details of the community vision for the CPSC can be found in the body of this report.

A "Formation Task Force" has been appointed as an ad-hoc committee by the DPF EC, with the goal of producing a document similar in purpose to the one that defines CPAD's charge, governance, internal organizational structure, and some initial activities, including some awards programs and community meetings.

See status report on the FTF by Ian Fisk yesterday



Software Lifecycle in High Energy Physics





Upcoming Events:

IRIS-HEP / AGC Demo Day #5

USCMS/IRIS-HEP Software

Scientific Computing with Python

CERN

Princeton University

Tacoma, Washington

University of Washington

Princeton Universit

Aachen, Germany

University of Washington

May 24, 2024

Jun 20-21.

Training

(SciPy) 2024

Jul 8-14.

Jul 18-19.

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

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



IRIS-HEP Institute Retreat

Sep 23-25. Valencia (Spain 2024 Fourth MODE Workshop on Differentiable Programming for Experiment Design

View all past events

http://iris-hep.org



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 I HCb

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

HL-LHC Software and Computing Gaps

The four software and computing gaps are:

- G1. Raw resource gaps: The HL-LHC dataset will be enormous. Event complexity and count will each go up by about an order of magnitude. If no improvements to algorithms or resource management techniques are made, the HL-LHC experiments will simply be unable to process and store the data necessary for the science program.
- G2. Scalability of the distributed computing cyberinfrastructure: It is insufficient to buy cores and disk alone the cyberinfrastructure used by the experiments must also scale to support the volume of hardware. This challenge is especially acute when it comes to data transfers: both the software must be ready and the shared networking resources (e.g., ESNet in the US) must be appropriately managed.
- G3. Analysis at scale: Analysis at the HL-LHC will be markedly different for two reasons: (a) the scale of the datasets involved and (b) the use of next-generation techniques (such as the latest machine learning techniques) to increase the scientific reach of each result. The former will require users to heavily utilize dedicated 'analysis facilities', optimized for high data rate I/O and the latter will require new services and data management techniques to be developed.
- G4. Sustainability: HEP is a facilities-driven science the cyberinfrastructure assembled for an experiment must last or evolve on the decadal scale. This limits some strategies to cyberinfrastructure for example, it is impossible for LHC to "do it yourself" and own the entire software stack. Specific sustainability strategies must be implemented even at the R&D phase to ensure that the cyberinfrastructure put in place at the beginning of the experiment is one the community can afford.

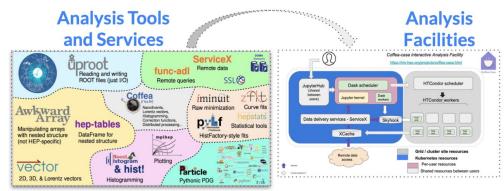
IRIS-HEP Strategic Plan for the Next Phase of Software Upgrades for HL-LHC Physics (arXiv:2302.01317)

Analysis Grand Challenge

The <u>Analysis Grand Challenge (AGC)</u> is about performing the last steps in an analysis pipeline at scale to test workflows envisioned for the HL-LHC. This includes

- columnar data extraction from large datasets,
- processing of that data (event filtering, construction of observables, evaluation of systematic uncertainties) into histograms,
- statistical model construction and statistical inference,
- relevant visualizations for these steps,

all done in a reproducible & preservable way that can scale to HL-LHC requirements. Begun as an integration exercise for IRIS-HEP, but has evolved as a community project and benchmark reference bringing together different groups and experiments.

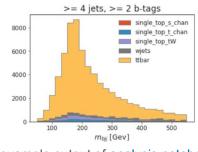


Execution of AGC analysis benchmark

Timeline	Fraction of HL-LHC dataset processed in 1h
Year 2	20% (40 TB)
Year 3	50% (100 TB)
Year 4	75 % (150 TB)
Year 5	100% (200 TB)

See also <u>"Demonstrator Analysis 200</u> <u>Gb/s" (B.Bockelman)</u> at WLCG/HSF

Reconstructed observables



example output of analysis notebook

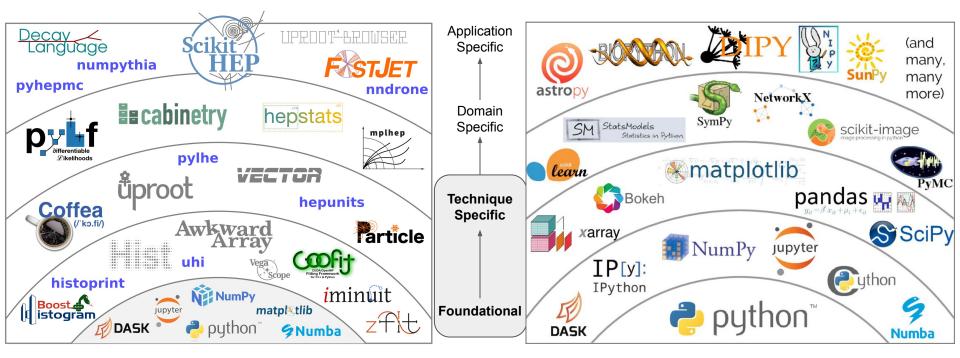
PyHEP Ecosystem (Scikit-HEP)

PyHEP.dev 2023 workshop 40 participants



Our scientific Python development vision/ecosystem

Scientific Python / PyData vision/ecosystem



Jake Vanderplas 2017 keynote-style Python ecosystem, but with layer labeling a la "Array programming with NumPy", Nature, 585, 357-362 (2020)

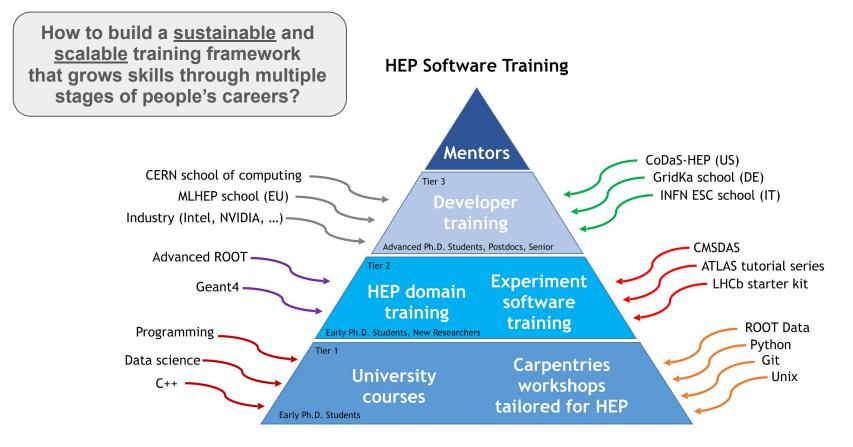
The "Future of Computing" is of course people to do it: software training!





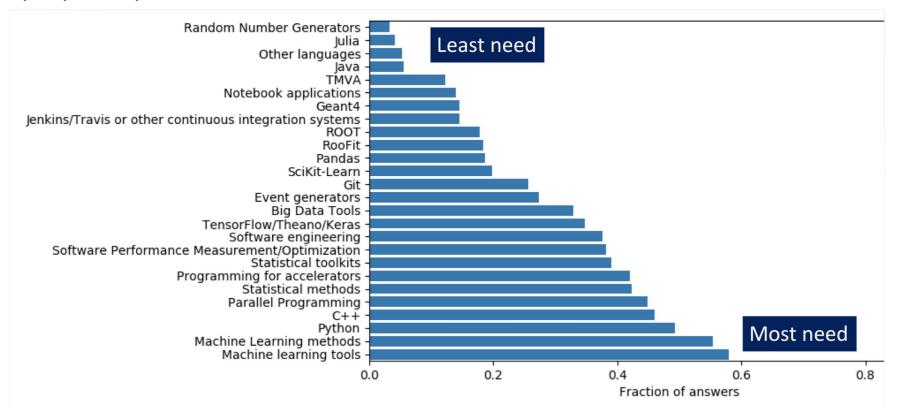


Training and Education Model



Training Survey

In early 2019, we did a survey of training needs (<u>link for results summary</u>), 334 people responded!



Multiple software, computing, data science and AI/ML programs aiming at different career stages

- Undergraduate summer programs: <u>US-CMS PURSUE</u> program, <u>US-ATLAS</u>
 <u>SUPER</u> program, <u>IRIS-HEP Fellows program</u> (6)
- <u>HSF/IRIS-HEP Training activities</u> (materials and events) 1600 students and 50 educators in the past few years
- <u>A3D3 PostBac program</u>
- Summer schools: <u>IAIFI</u>, <u>CoDaS-HEP</u>
- DOE CompHEP Traineeship projects: <u>TAC-HEP</u>, <u>WATCHEP</u>, <u>C2-The-P2</u>
- International: Fellows/mentoring in NSF-funded <u>HSF-India</u> project, <u>HSF Google</u> <u>summer of code</u>, CERN summer students, etc.

HSF Software Training Center

Idea

Training in software and computing are essential ingredients for the success of any HEP experiment. As most experiments have similar basic prerequisites (Unix shell, Python, C++, ...) we want to join our efforts and create one introductory software training curriculum that serves HEP newcomers the software skills needed as they enter the field, and in parallel, instill best practices for writing software.

The curriculum is comprised of a set of standardized modules, so that students can focus on what is most relevant to them.

The modules

Basics

The UNIX Shell	Version controlling with git	Pro
A guide through the basics of the file systems and the shell.	Track code changes, undo mistakes, collaborate. This module is a must.	Get starte programm
Start learning now!	Start learning now!	1
≁ Contribute!	✗ Contribute!	
SSH	Machine learning	
Introduction to the Secure Shell (SSH)	Get behind the buzzword and teach machines to work for you intelligently! Start learning now! Watch the videos! Contribute!	Make scien plots!
R00T The most famous data analysis		



ogramming with python ed with an incredibly popular ning language. Start learning now!

Contribute!

Matplotlib for HEP

ence prettier with beautiful

* Status: Beta testing Start learning now! Contribute!

Central repository of training materials + instructor community - modeled on The Carpentries

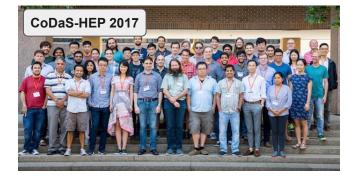
Software Development and Deployment

Version controlling with git	Advanced git	CI/CD (gitlab)				
Track code changes, undo mistakes, collaborate. This module is a must.	Learn to work with branches and more with this interactive webpage.	Continuous integration and deployment with gitlab.				
Start learning now!	Start learning now!	Start learning now!				
✗ Contribute!	Contribute!	✗ Contribute!				
CI/CD (github)	Docker	Singularity				
Continuous integration and deployment with github actions.	Introduction to the docker container image system.	Introduction to containerization with Singularity/Apptainer. * Status: Beta testing Start learning now! Watch the videos! * Contribute!				
Start learning now!	Start learning now!					
✗ Contribute!	✗ Contribute!					
Unit testing	Level up your python					
Unit testing in python. * Status: Beta testing	Advanced bits of python (testing, debugging, logging, and more)					
Start learning now!	Start learning now!	Dhua mara				
✗ Contribute!	✗ Contribute!	Plus more				
C++ corner		And growing				
HEP C++ Course	Build systems: cmake					

A full introduction to C++ based on a series of slides and exercises.

Building code is hard. CMake makes it easier.

1500 students/50 instructors to date.







Computational and Data Science (CoDaS-HEP) Summer School

http://codas-hep.org

In-person summer school with Lectures & hands-on exercises:

- Parallel Programming
- Data Science Tools and Techniques
- Machine Learning Technology and Methods
- Practical skills: performance evaluation, use of git for version control





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IRIS-HEP Fellows

Connects undergraduates in physics and computer science with HEP mentors active in developing HEP research software.

They work mostly in remote with their mentors on cutting-edge software-centric summer research projects



DOE Traineeships in Computational HEP

New from 2023: 2 year traineeships for graduate students: coursework/training activities in software/computing plus dedicated software/computing R&D projects in collaboration with DOE lab staff, with an aim to develop the next generation of computational scientists and engineers.

4 funded projects: <u>TAC-HEP</u>, <u>WATCHEP</u> and <u>C2-THE-P2</u> and <u>LGT4HEP</u> (see individual websites for universities and labs involved).

R&D topics span the experimental frontiers (energy, cosmic, intensity) plus lattice gauge theory.

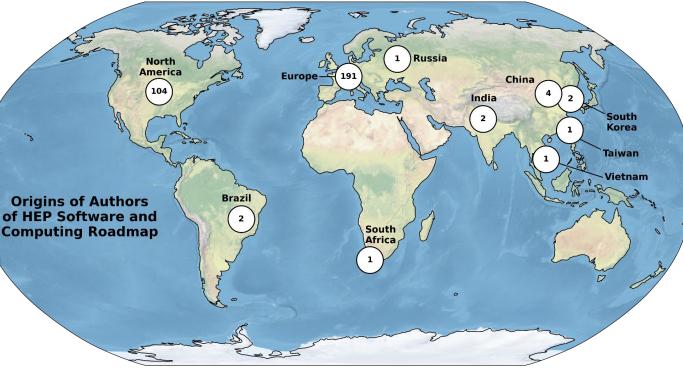
Beginnings of a cohort experience: Computational HEP Traineeship Summer School (<u>Princeton 2023</u>, <u>FNAL 2024</u>)



Princeton school, 2023

Building global collaborations around common software

Although participation in experiment software is international, much of the core software development comes primarily from the US and Europe.



HSF-India project: 5-year project: software training, researcher visits and seeding of software collaborations



http://research-software-collaborations.org/ (OISE-2201990)

And the "Future of Computing"?



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 era]

The **HEP Software Foundation** facilitates cooperation and common efforts in High Energy Physics software and computing internationally.

[2010's era]



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